

# Mechanisms of the Heterogeneously Catalyzed Reaction of CO<sub>2</sub> Hydrogenation on Transition Metal Surfaces

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## **Abstract**

Renewable energy supply and energy storage in a closed materials cycle are the urgent global challenges of the 21<sup>st</sup> century. Carbon dioxide (CO<sub>2</sub>) hydrogenation over catalysts is a method to produce synthetic fuels from renewable energy in a CO<sub>2</sub> neutral cycle. Numerous catalysts from pristine to novel materials have been investigated to achieve high CO<sub>2</sub> conversion and selective hydrocarbon. Ahead of developing innovatively active catalyst with a high selectivity, it is crucial to understand the active sites and the related reaction mechanisms. Despite the fact that CO<sub>2</sub> + H<sub>2</sub> is a rather simple chemical equation, many reaction paths on a solid catalyst are possible. However, the proposed mechanisms from literatures have been controversial due to two main difficulties in 1) evidently identifying the reaction species, especially some vital transient species on the pathway of carbon hydrogenation and C-C coupling, and 2) proving the relation between surface structure of the catalysts and the reactivities. To address these difficulties, we built a new instrumental setup and developed an analysis program in order to investigate the catalyst surface and analyze the reaction mechanism in operando.

We built up a diffuse reflectance infrared Fourier transform spectroscopy-mass spectroscopy-gas chromatography (DRIFTS-MS-GC) instrument for an operando study of the surface, gas, and liquid products using DRIFTS, MS, GC, and ex situ NMR. A bilevel evolutionary Gaussian fitting (BEGF) program was developed for dataset treatment including peak deconvolution and kinetic plot. Standard chemicals like carbonates, bicarbonates, formic acid, acetic acid, methanol, and ethanol, and isotopic spectra using  ${}^{13}CO_2$  and  $D_2$  in the reactions were employed for supporting peak assignments. Based on these infrastructures, CO<sub>2</sub> adsorption and hydrogenation reactions on pristine metals (Fe, Co, Ni, and Cu), metal hydride alloy (LaNi<sub>4</sub>Cu), and metal-oxide (Co-CoO) were studied. We found out pure Fe, Co, Ni, Cu and LaNi<sub>4</sub>Cu metals are not efficient for CO<sub>2</sub> hydrogenation, and have no detectable adsorption species on the surface. High conversion (> 90%) of CO<sub>2</sub> on Co-CoO surface emphasized the importance of oxide for CO<sub>2</sub> chemisorption and for the observations of the surface species. The following investigation on oxide supported metal catalyst Ru/Al<sub>2</sub>O<sub>3</sub> via an in situ control of the individual formation and hydrogenation of each adsorption species demonstrates that the oxide assists CO<sub>2</sub> initial activation. CO<sub>2</sub> methanation starts at the interface of the metal and the oxide and passes through the steps of  $CO_2 \rightarrow HCO_3^{-*}$  (and/or  $HCOO^{-*}$  in  $CO_2 + H_2$  co-adsorption condition)  $\rightarrow$  $CO^* \rightarrow CH_4$ . We further explored the relationship between metal/(metal+oxide) ratio and their reactivities. We synthesized Co/(Co+CoO) catalysts in the DRIFTS-MS-GC instrument, and

investigated the CO<sub>2</sub> hydrogenation reaction on site. The results reveal that high concentration of the oxide in the catalyst boosts CO<sub>2</sub> methanation, because the CO<sub>2</sub> binding is moderate and the adsorption is enhanced when the oxide concentration increased.

In short, we established equipment for an operando study of CO<sub>2</sub> hydrogenation on catalyst surfaces, unraveled the surface reaction mechanisms and the active sites, developed a highly active catalyst, as well as initiated an efficient data analysis program.

# Keywords

CO<sub>2</sub> hydrogenation, heterogeneous catalysis, methanation, reaction mechanism, surface adsorption, adsorbates, catalyst, metal oxide, IR spectra, data analysis, in situ, operando, DRIFTS-MS-GC

## Résumé

L'approvisionnement en énergie renouvelable et le stockage de l'énergie dans un cycle de matériaux clos sont les défis mondiaux urgents du 21ème siècle. L'hydrogénation du dioxyde de carbone (CO<sub>2</sub>) sur des catalyseurs est une méthode de production de carburants synthétiques à partir d'énergies renouvelables dans un cycle neutre en CO<sub>2</sub>. De nombreux catalyseurs allant des matériaux vierges aux matériaux nouveaux ont été étudiés pour obtenir une conversion élevée en CO<sub>2</sub> et des hydrocarbures sélectifs. Avant de développer un catalyseur innovant et actif avec une sélectivité élevée, il est essentiel de comprendre les sites actifs et les mécanismes de réaction associés. Malgré le fait que CO<sub>2</sub> + H<sub>2</sub> est une équation chimique assez simple, de nombreuses voies de réaction sur un catalyseur solide sont possibles. Cependant, les mécanismes proposés dans les littératures ont été controversés en raison de deux difficultés principales: 1) identifier clairement les espèces réactionnelles, en particulier certaines espèces transitoires vitales sur la voie de l'hydrogénation du carbone et du couplage C-C, et 2) prouver le lien entre la structure de surface des catalyseurs et des réactivités. Pour résoudre ces difficultés, nous avons planifié la recherche de cette thèse en partant de la construction du programme de configuration instrumentale + analyse, puis de la conception du catalyseur + du méthanisme de la réaction.

Nous avons d'abord construit un instrument DRIFTS-MS-GC pour une étude opératoire de la catalyse hétérogène. Les produits de surface, gazeux et liquides ont été analysés par DRIFTS, MS, GC et ex situ NMR, respectivement. Un programme de bilevel evolutionary Gaussian fitting (BEGF) a été mis au point pour le traitement des ensembles de données, notamment la déconvolution des pics et le tracé cinétique. Des produits chimiques standard tels que les carbonates, les bicarbonates, l'acide formique, l'acide acétique, le méthanol et l'ethnol, ainsi que les spectres isotopiques utilisant le <sup>13</sup>CO<sub>2</sub> et le D<sub>2</sub> dans les réactions ont été utilisés pour soutenir les assignations de pointe. Sur la base de ces infrastructures, des réactions d'adsorption et d'hydrogénation de CO<sub>2</sub> sur des métaux purs (Fe, Co, Ni et Cu), un alliage hydrure métallique (LaNi<sub>4</sub>Cu) et un oxyde métallique (Co-CoO) ont été étudiées. Nous avons découvert que les métaux purs Fe, Co, Ni, Cu et LaNi<sub>4</sub>Cu ne sont pas efficaces pour l'hydrogénation du CO<sub>2</sub> et n'ont aucune espèce d'adsorption détectable à la surface. En outre, l'hydrure de métal LaNi<sub>4</sub>Cu réduit le CO<sub>2</sub> à une température beaucoup plus élevée que celle des métaux Co et Ni purs et de la désorption de H<sub>2</sub>, ce qui indique que l'adsorption de H<sub>2</sub> ne pourrait pas être le facteur clé de la réduction de la barrière énergétique de l'hydrogénation du CO<sub>2</sub>. La conversion élevée (> 90%) de CO<sub>2</sub> sur la surface de Co-CoO a mis en évidence l'importance de l'oxyde pour la chimisorption du CO<sub>2</sub> et l'obversement des étapes réactionnelles. Les recherches suivantes sur le catalyseur métallique Ru/Al<sub>2</sub>O<sub>3</sub> supporté sur un oxyde via un contrôle in situ de la formation individuelle et une hydrogénation de chaque espèce d'adsorption démontrent que l'oxyde contribue à l'activation initiale du CO<sub>2</sub>. La méthanisation du CO<sub>2</sub> commence à l'interface du métal et de l'oxyde et passe par les étapes  $CO_2 \rightarrow HCO_3^{-*}$  (et / ou  $HCOO^{-*}$  dans les conditions de co-adsorption  $CO_2 + H_2$ )  $\rightarrow CO^* \rightarrow CH_4$ . Nous avons exploré la relation entre le rapport métal / (métal + oxyde) (Co / (Co + CoO)) et leurs réactivités dans la réaction d'hydrogénation du  $CO_2$  révèle qu'une concentration élevée d'oxyde dans le catalyseur stimule la méthanation du  $CO_2$ , car la liaison au  $CO_2$  est modérée et l'adsorption est améliorée sur le site d'oxyde.

En bref, nous avons mis en place des équipements pour une étude opérationnelle de l'hydrogénation du CO<sub>2</sub> sur les surfaces des catalyseurs, démêlé les mécanismes de réaction de surface et les sites actifs, développé un catalyseur très actif et lancé un programme efficace d'analyse des données.

## **Mots-clés**

Hydrogénation du CO<sub>2</sub>, catalyse hétérogène, méthanisation, mécanisme de réaction, adsorption de surface, adsorbats, catalyseur, oxyde métallique, spectres IR, analyse de données, in situ, operando, DRIFTS-MS-GC

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Note: tables from supporting information or supplementary data are not listed here

# **Chapter 1 Introduction**

#### 1.1 World Energy Requirement

The annual world energy supply from primary sources such as oil, coal, natural gas, renewables, etc. increased from 11.6 terawatt (TW) in 1990 to 18.5 TW in 2017 (Figure 1.1(a)-(b)). This equals to 58% increase in total. Simultaneously, the CO<sub>2</sub> emission increased from 20.5 gigatons (Gt) in 1990 to 32.8 Gt in 2017 with 43% increasing in total. The atmospheric CO<sub>2</sub> concentration increased from approximately 280 ppm in the early 1800s to 407 ppm now (Figure 1.1(c)-(d)). The increase of CO<sub>2</sub> emission contributes to the global climate change. However, the energy consumption and climate change is driven by economic and population growth. As shown in Figure 1.2, the world GDP growth links directly to the energy consumption and CO<sub>2</sub> emission. It is predicted that the fossil fuels such as coal, petroleum, and natural gas will continue to supply more than three-fourths of world energy demand in 2040, and the atmospheric CO<sub>2</sub> concentration will reach nearly 600 ppm in 2100. 1-4.6

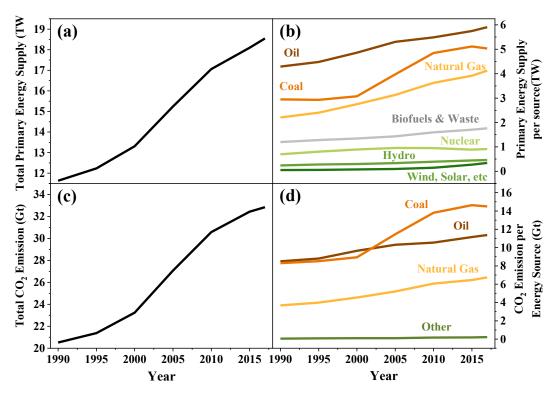


Figure 1.1. (a) Total world energy consumption by primary energy source. (b) Each primary energy source contributing in the world energy consumption. (c) Majority of world CO<sub>2</sub> emission by the primary energy source. (d) Total world CO<sub>2</sub> emission contributed by energy source. Reproduced from references.<sup>1,2</sup>

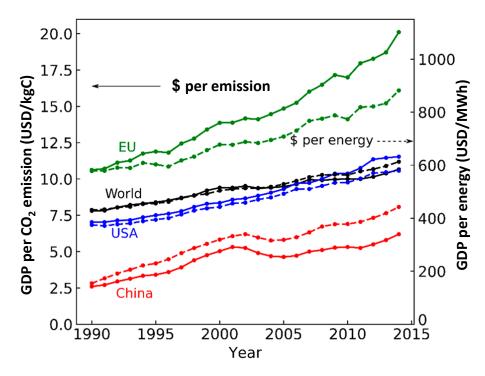


Figure 1.2. World GDP (purchasing power parity, 2011 dollars) is growing relative to energy consumption and  $CO_2$  emissions. Reproduced from references.<sup>4</sup>

The continuously increasing consumption of the unsustainable fossil fuels motivates the society to search sustainable and clean energy supplies. Hydropower, wind, solar, geothermal, and biomass are exploited and promising to replace the majority of role of fossil fuels. According to the 30-year statistics of these renewable energies development, they are predicted to contribute roughly the same quantity as natural gas and coal in global net electricity generation until 2040.<sup>7,8</sup> Nevertheless, the renewables face a problem of time- and location-dependent energy fluxes, restricting their energy supply. Energy storage is thus required in order to balance the short term (day/night) fluctuations and seasonal variations. Therefore, an energy carrier has to be produced from heat or electricity. The energy density is crucial for transport and mobile applications. Hydrogen, which can be produced from electricity and heat by means of electrolysis of water, offers the highest gravimetric energy density of all combustibles with 39 kWh/kg. Current hydrogen storage density reaches max. 20 mass% in borohydrides. Without taking into account the stability and cyclability problems of this material, an energy density of 7.8 kWh/kg could be achieved. However, this is 60% of the energy density of hydrocarbon fuels, e.g. diesel (12.8 kWh/kg). In order to overcome the limitation of the energy density of hydrides, hydrogen can be utilized to reduce CO<sub>2</sub> to hydrocarbons, i.e. a synthetic fuel as shown in Figure 1.3.

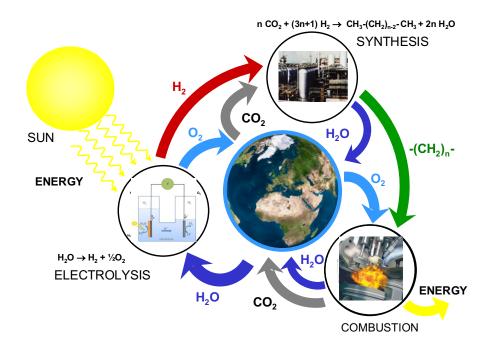


Figure 1.3. Schematic representation of the closed carbon and synthetic fuel cycle. Hydrogen is obtained from water splitting by renewable energy. CO<sub>2</sub> captured from air is reduced by hydrogen to hydrocarbons. Reproduced from reference.<sup>9</sup>

## 1.2 Synthetic Hydrocarbons from CO<sub>2</sub> Conversion

Converting  $CO_2$  to synthetic hydrocarbons using  $H_2$  and catalyst can close carbon cycle and meet the energy demand. Therefore, investigation of reaction mechanism of  $CO_2$  hydrogenation over gas/solid interface is the subject of this thesis.

#### 1.2.1 CO<sub>2</sub> properties

 $CO_2$  is a stable molecule ( $\Delta G_f^0$  = -394.4 kJ mol<sup>-1</sup>, Eq.1.1). However, it can be activated via catalytic reaction. The reaction of  $CO_2$  with  $H_2$  to hydrocarbons is exothermic (Eq.1.2, Figure 1.4). The thermal catalysis for this process is either based on indirect routes: Sabatier reaction (Eq.1.3), or the reverse water gas shift (RWGS) reaction (Eq.1.4) combined with the Fischer-Tropsch (FT) reaction (Eq.1.5) at high temperature and under high pressure, or methanol production (Eq.1.6) at the first stage and olefin productions from  $CH_3OH$  at a separated stage over transition metal based catalysts.  $^{10-13}$ 

$$C + O_2 \rightarrow CO_2$$
,  $\Delta H_f^0 = -393.51 \ kJ \ mol^{-1}$ ,  $\Delta S_f^0 = 2.86 \ J \ K^{-1} \ mol^{-1}$ ,  $\Delta G_f^0 = -394.36 \ kJ \ mol^{-1}$ . Eq. 1.1   
  $nCO_2 + (3n+1)H_2 \rightarrow C_nH_{n+2} + 2nH_2O$ .

CO<sub>2</sub> + 4H<sub>2</sub> 
$$\rightarrow$$
 CH<sub>4</sub> + 2H<sub>2</sub>O,  $\Delta H_f^0 = -165 \, kJ \, mol^{-1}$ ,  $\Delta S^0 = -172.6 \, JK^{-1} mol^{-1}$ ,  $\Delta G_f^0(300 \, K) = -113.2 \, kJ \, mol^{-1}$ . Eq. 1.3  
(CO<sub>2</sub> + H<sub>2</sub>  $\rightarrow$  CO + H<sub>2</sub>O,  $\Delta H_f^0 = 41.17 \, kJ \, mol^{-1}$ ,  $\Delta S^0 = 42.26 \, JK^{-1} mol^{-1}$ ,  $\Delta G_f^0(298 \, K) = 28.58 \, kJ \, mol^{-1}$ ). Eq. 1.4  
nCO + (2n+1)H<sub>2</sub>  $\rightarrow$  C<sub>n</sub>H<sub>2n+2</sub> + nH<sub>2</sub>O. Eq. 1.5  
CO<sub>2</sub> + 3H<sub>2</sub>  $\rightarrow$  CH<sub>3</sub>OH + H<sub>2</sub>O,  $\Delta H_f^0 = -130.7 \, kJ \, mol^{-1}$ ,  $\Delta S^0 = -408.7 \, JK^{-1} mol^{-1}$ ,  $\Delta G_f^0(300 \, K) = -8.1 \, kJ \, mol^{-1}$ .

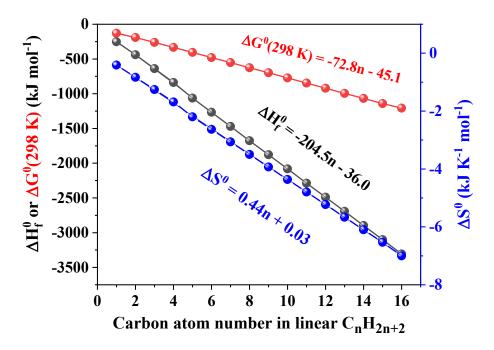


Figure 1.4. Standard formation enthalpy  $(\Delta H_f^0)$ , entropy  $(\Delta S^0)$ , and free energy  $(\Delta G^0)$  of linear alkanes (n-alkanes) at 300 K as a function of the number of carbon atoms from CO<sub>2</sub> reduction by H<sub>2</sub>. The phases of C<sub>5+</sub> are considered as liquid.

Although the overall Gibbs energy of the CO<sub>2</sub> hydrogenation reaction is negative at room temperature, the reactions do not take place at room temperature due to high energy barrier. Generally, heating enables faster interactions between the molecules. However, the high temperature is not favorable to the exothermic reaction. Therefore, metal-based catalysts are used to lower down the activation energy of the CO<sub>2</sub> hydrogenation reaction.

#### 1.2.2 CO<sub>2</sub> interaction with solid surface

#### 1.2.2.1 CO<sub>2</sub> activation

CO<sub>2</sub> reduction processes initiate from CO<sub>2</sub> chemisorption and activation. Chemisorbed species normally sit on defect sites, such as step, kink, and unsaturated coordinate sites, where induce the electron transfer between CO<sub>2</sub> and catalyst surface. <sup>14,15</sup> The specific adsorption orientations remain enigmatic. The three possible coordinative structures have been reported as (a) bridge on without confirmation of the bond angle, (b) side on with one carbon and one oxygen atoms, and (c) end on with the carbon atom or one oxygen atom (Figure 1.5). <sup>16,17</sup> The different adsorption structures could not only lead to different reaction intermediates, e.g. \*HCOO or \*CO, but also to different explanations for the electron-transfer mechanisms, i.e. outer-sphere, inter-sphere, proton-coupled electron transfer (PCET), and decoupled proton-electron transfer. <sup>18</sup> Comparing the bond strength of metal-C and metal-O bonds, the metal-O bond is much stronger than its metal-C bond (refer to metal-CH<sub>3</sub> bonds, Table 1). <sup>19</sup> This indicates that CO<sub>2</sub> adsorbed on the surface with metal-O form would be stronger than that with the metal-C form. Besides, the metal-O bonds become stronger from Cu to Fe in the first row of transition metals in the periodic table, while the metal-CH<sub>3</sub> bond follows the opposite trend, implying that Fe is more easily oxidized by oxygen than the heavier transition metals on the same period, while CH<sub>3</sub> is more strongly fixed on Cu than that on Fe, Co or Ni.

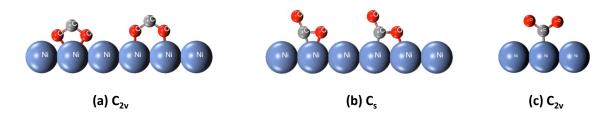


Figure 1.5. Three possible structures of bent CO<sub>2</sub> on Ni surface. <sup>16</sup>

Freund found in some early work that  $CO_2$  adsorbed on Ni(110) surface forms  $CO_2^-$  anion by observing work function change.  $^{16}CO_2^-$  anion has bond order of 1.5 and elongated and bent bond length of 1.25 Å. For comparison, the C=O bond of gaseous  $CO_2$  has bond order of 2 and bond length of 1.17 Å. The formation of  $CO_2^-$  anion is an energetically favored process  $(CO_2^- \rightarrow CO_2 + e^-, E_a = 0.4 \text{ eV})$  at  $80\sim130 \text{ K}$ .  $CO_2^-$  anion is relatively stable with the lifetime of  $60\sim90 \text{ }\mu\text{s}$ . This bent  $CO_2^-$  shows IR peak of O-C-O asymmetric stretching at around 1600 cm<sup>-1</sup>, and is a precursor of dissociated CO +  $O_2^-$  Dissociation of  $CO_2^-$  occurs in the temperature range of  $220\sim470 \text{ K}.^{21,22}$ 

Table 1.1. Bond strength<sup>21</sup>

Bond strength (kJ/mol)	C	Н	0	Fe	Co	Ni	Си
C	348	439 (CH <sub>4</sub> )	804 (O <sub>2</sub> )	364 (Fe-CH <sub>2</sub> )	331 (Co-CH <sub>2</sub> )	208 (Ni-CH <sub>3</sub> )	25 (Cu-CO)
C			1072 (CO)	135 (Fe-CH <sub>3</sub> )	178 (Co-CH <sub>3</sub> )		223 (Cu-CH <sub>3</sub> )
Н		436	430	148	245	240	255
o			498	407	397	366	293
Fe				118			
Со					< 127		
Ni						204	
Си							182

 $CO_2$  adsorbed on oxide surface forms carbonate species, and its co-adsorption with H produces formate. Surface alkali atoms and adsorbed  $H_2O$  molecules promote  $CO_2$  chemisorption. He produces formate. Surface alkali atoms and adsorbed  $H_2O$  molecules promote  $CO_2$  chemisorption. Compared that on all alkali promoted and hydrogen deficient surfaces,  $CO_2$  forms oxalate anion  $C_2O_4^{2-2}$ . The  $C_2O_4^{2-2}$  is stable from cryogenic temperature to room temperature. A low coordinated  $C_2O_4^{2-2}$  can be found at 2310 and 1710 cm<sup>-1</sup>, and a high coordinated  $C_2O_4^{2-2}$  can be detected at 1650~1700 cm<sup>-1</sup>. Decomposition of this species gives either  $CO_3^{2-2} + CO$  or  $C_1^{2-2} + CO$  molecule can stabilize chemisorbed  $CO_2^{2-2}$  at room temperature. For instance, on  $CO_1^{2-2} + CO_1^{2-2}$  interacts with  $CO_2^{2-2} + CO_1^{2-2}$  and the neighbor adsorbed  $CO_1^{2-2} + CO_1^{2-2}$  interacts with  $CO_2^{2-2} + CO_1^{2-2}$  is not stable. However,  $CO_1^{2-2} + CO_1^{2-2}$  reacts strongly with surface oxygen to form a carbonic acid structure (Figure 1.6(c)). This species can connect one to four adsorbed  $CO_1^{2-2} + CO_1^{2-2}$  and hydrogen bonding. Bent  $CO_2^{2-2} + CO_1^{2-2}$  and the neighbor adsorbed  $CO_1^{2-2} + CO_1^{2-2}$  are connect one to four adsorbed  $CO_1^{2-2} + CO_1^{2-2}$  and the neighbor adsorbed  $CO_1^{2-2} + CO_1^{2-2}$  and the neighbor

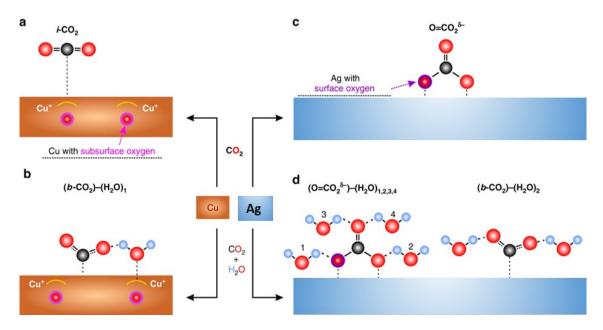


Figure 1.6.  $CO_2$  adsorption at 298 K on (a) Cu(111) with subsurface oxygen, (b) Cu(111) with subsurface oxygen and  $H_2O$ , (c) Ag(111) surface with surface oxygen, and (d) Ag(111) surface with surface oxygen and  $H_2O$ . Reproduced from reference.<sup>30</sup>

#### 1.2.2.2 Hydrogenation

 $CO_2$  conversion to fuels has drawn enormous attention in the recent three decades for its potential to reduce atmospheric greenhouse effect and to store large quantities of renewable energy. Apart from the indirect methods as mentioned in Section 1.1, it is also possible to have direct  $CO_2$  hydrogenation through various heterogeneously catalytic approaches such as thermal, electrochemical and photocatalysis. However, the direct  $CO_2$  hydrogenation gives rise to only gaseous products, i.e.,  $C_1$ –  $C_4$ .  $^{30}$ 

 $C_1$  products such as  $CH_4$  and CO are usually the most common products under atmospheric pressure through Sabatier and RWGS reactions, respectively.  $CH_3OH$  as another valuable product is obtained under high pressure and on Cu-based catalysts, e.g.  $Cu/ZnO/Al_2O_3$ ,  $Cu/ZrO_2$ ,  $CeO_x/Cu$  *etc.*  $^{31-33}$  According to the reaction equilibrium, CO production starts from high temperature compared to the hydrocarbons products (Figure 1.7). Increasing temperature augments the CO yield.  $CH_4$  has high yield in wide temperature range of 200 - 800 °C.  $CH_3OH$  can be produced at lower temperature between 100 - 300 °C, but generally this happens at pressure of more than 20 bar.

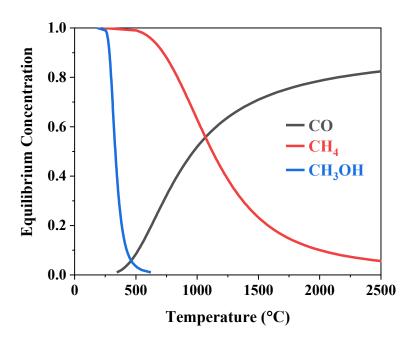


Figure 1.7. Equilibrium concentration of CO, CH<sub>4</sub>, CH<sub>3</sub>OH production from CO<sub>2</sub> hydrogenation as function of temperature.

 $C_{2+}$  products from direct  $CO_2$  hydrogenation are limited in the range of  $C_2$ - $C_4$  on a tandem or bifunctional catalyst. <sup>34,35</sup> To produce  $C_{2+}$  hydrocarbons involved the C-C bond coupling mechanisms, which is strongly limited probably by the transfer kinetics of massive electrons and atoms. The current speculations of carbon chain growth in thermal catalysis are mostly based on FT reaction with the carbide or CO insertion mechanisms. <sup>36,37</sup> Hensen's group found that the formation of  $\sigma$  bonds such as C-H bond is structure-insensitive, hence taking place likely on planar sites. <sup>38</sup> In contrast, carbon chain growth on stepped sites via  $CH_x$  monomer, hence requires a certain particle size. <sup>39,40</sup> For the same size of the cobalt particle, higher CO pressure gives less active sites, therefore lowers the CO consumption rate and enhances the chain growth; lower CO pressure gives more active sites, therefore accelerates the CO consumption rate and lessens the chain growth. <sup>39</sup>

Tremendous assembling and modifications, including size minimizing, depositing on supports, bifunctionalizing and alloying of the metal catalysts have been made to improve the activity and/or selectivity based on the transition metals. In order to understand the relationships between materials and CO<sub>2</sub> hydrogenation in the heterogeneous catalysis, the following two sections have been distributed to the novel catalyst design and active site studies.

## 1.3 Heterogeneous Catalysts for CO<sub>2</sub> hydrogenation

Based on the compositions of the catalysts, we will introduce the materials from the simplest pristine transition metals to novel optimized materials.

#### 1.3.1 Pristine metals

A summarized and systematic research has been represented by Mutschler, *et al* recently about CO<sub>2</sub> hydrogenation in a flow gas feed condition under ambient pressure on unsupported pristine Fe, Co, Ni, and Cu metal powders with particle size of around 1 μm.<sup>41</sup> A commercial 0.5wt%Ru/Al<sub>2</sub>O<sub>3</sub> was studied simultaneously for reference. A comparison of reactivity of those metals showed Co, Ni and Ru/Al<sub>2</sub>O<sub>3</sub> are principally active in Sabatier reaction to produce CH<sub>4</sub> with similar activation energies of 77, 74 and 73 kJ/mol, respectively. The maximal CH<sub>4</sub> yields found on Co, Ni and Ru/Al<sub>2</sub>O<sub>3</sub> were 70.2% at 661 K 43.8% at 786 K and 73.4% at 652 K, respectively. At higher temperature, the endothermic RWGS reaction dominates to produce CO, leading to a maximum CO yield of 6.9% at 817 K on CO, 18.2% at 829 K on Ni, and 26.2% at 813 K on Ru/Al<sub>2</sub>O<sub>3</sub>. Fe is favorable for RWGS reaction to produce CO with activation energy of 50 kJ/mol and with a maximum CO yield of 22.4% at 813 K. In all these four catalysts, C<sub>2+</sub> production is less than 1%. Cu is inactive toward CO<sub>2</sub> conversion. These results are consistent with the old report by Bartholomew, *et al.* in the 1980s about the silica-supported metals for CO<sub>2</sub> hydrogenation.<sup>42</sup>

#### 1.3.2 Supported metals

Supported metals have been widely studied as the supports are used to stabilize the active metal nanoparticles. The systematical studies could be dated back to 1980s by Bartholomew *et al.*<sup>42–45</sup> Bartholomew *et al.* studied CO<sub>2</sub> and CO hydrogenation on supported nickel systematically in terms of various kinetic factors including gas hourly space velocity and partial pressure of the feed gases, as well as the effects of the supports. CO<sub>2</sub> turnover number increases with increasing space velocity from 5000 to 50000 h<sup>-1</sup>, but the selectivity to CH<sub>4</sub> is on the opposite. When the partial pressures of CO<sub>2</sub> (< 2%) and H<sub>2</sub> are low (< 10%), the reaction rate is moderately dependent on CO<sub>2</sub> and H<sub>2</sub> concentrations; while at higher partial pressure, CH<sub>4</sub> turnover number tends to be independent of the reactant concentrations. When the total pressure increases, CO<sub>2</sub> conversion is invariant, whereas CH<sub>4</sub> turnover number and yield increase, simultaneously CO production rate and yield decrease. When comparing CO<sub>2</sub> and CO hydrogenation, CO<sub>2</sub> conversion shows nearly same rate as CO hydrogenation between 500-575 K, but slower above 575 K. The activation energy of CO<sub>2</sub> hydrogenation (80

kJ/mol) is lower than that of CO (96 kJ/mol). When adding CO into  $CO_2$  and  $H_2$ ,  $CO_2$  conversion and  $CH_4$  production are inhibited at CO concentration exceeding 0.012% 525 K. The inhibition effect of CO becomes less strong when increasing the temperature, e.g., this inhibition occurs when CO concentration exceeds 0.12% at 600 K. As for the support effect, the activity and  $CH_4$  selectivity shows a trend of  $Ni/SiO_2$  < unsupported  $Ni < Ni/Al_2O_3 < Ni/TiO_2$  due to the increasing degree of metal-support interaction which leads to increasing  $CO_2/H$  and CO/H adsorption ratios.

In addition, Bartholomew, *et al.* had a benchmark investigation of the specific activities and selectivity of  $CO_2$  hydrogenation on silica-supported group VIII metals (Fe, Co, Ni, Ru).<sup>42–45</sup> In the condition of 450-650 K, 140-1030 kPa, and space velocities of 4000-50000 h<sup>-1</sup>, the specific activity of  $CO_2$  hydrogenation showed the order of  $Co/SiO_2 > Ru/SiO_2 > Ni/SiO_2 > Fe/SiO_2$ ; the selectivity toward  $CH_4$  production showed the order of  $Ru/SiO_2 > Ni/SiO_2 > Co/SiO_2 > Fe/SiO_2$ . CO is produced significantly on  $Ni/SiO_2$  and  $Co/SiO_2$ , and is the primary product on  $Fe/SiO_2$ . Visible amounts, low compared to  $CH_4$ , of  $C_2$ - $C_5$  hydrocarbons are produced on  $Fe/SiO_2$  and  $Co/SiO_2$ , with an active order of  $Fe/SiO_2 > Co/SiO_2 > Ru/SiO_2$ .

#### 1.3.3 Bimetals

The main advantage of alloys is to provide multiple binding sites for the reactants and intermediates. When integrating the quantum confinement and alloy effect for the nanosized metals, the d-band reconstructs through charge transfer between different metals. 46,47 Therefore, alloy could exhibit altered reactivity comparing to the single metals. Ni<sub>3</sub>Fe alloy supported on Al<sub>2</sub>O<sub>3</sub> shows improved CO<sub>2</sub> conversion and CH<sub>4</sub> selectivity with regard to commercial Ni/Al<sub>2</sub>O<sub>3</sub>. 48 Ni-Co nanoalloy enhances the higher alcohol synthesis by increasing the amount of the non-dissociated CO on the catalyst surface for CO insertion.<sup>49</sup> When unpromoted Fe-based catalyst exhibits low selectivity of C<sub>2</sub>-C<sub>4</sub><sup>=</sup> olefins and C<sub>5+</sub>, Cu doped Fe-based nanoparticles shows a decreased selectivity of C<sub>2</sub>-C<sub>4</sub><sup>=</sup> olefins but increased selectivity toward C<sub>5+</sub>, because of the strong interaction between Cu and Fe.<sup>50</sup> For Pd-Cu bimetal, DFT calculations show that Pd-Cu bimetal enhances methanol formation by exposing unsaturated Pd atoms on top of stepped PdCu(111). A complementary experimental result confirms that SiO<sub>2</sub>-supported PdCu alloy has higher selectivity to CH<sub>3</sub>OH than PdCu<sub>3</sub>. <sup>51</sup> Another alloy, Pt<sub>3</sub>Co, shows octapod shape. This particular shape presents "sharp-tip" effect and combines with alloy effect to accumulate negative charges to activate CO<sub>2</sub> and accordingly enhanced the catalytic activity towards CO<sub>2</sub> hydrogenation to methanol. Pt<sub>3</sub>Co octapods display superior catalytic activity with TOF of 758 h<sup>-1</sup>, and is 2.2, 6.1, and 6.6 times higher than those of Pt3Co nanocubes, Pt octapods, and Pt nanocubes, respectively. <sup>47</sup> In addition, during the hydrogenation of  $CO_2$  into methanol, the catalytic activity of  $Rh_{75}W_{25}$  nanosheets was 5.9, 4.0, and 1.7 times as high as that of Rh nanoparticles, Rh nanosheets, and  $Rh_{73}W_{27}$  nanoparticles, respectively. Mechanistic studies reveal that the remarkable activity of  $Rh_{75}W_{25}$  nanosheets is owing to the integration of quantum confinement and alloy effect. <sup>52</sup>

#### 1.3.4 Single atom

Single-atom catalysts are similar to the concept of doping material where a foreign atom substitutes the crystal atom. Notwithstanding, single atom is more homogenous on the up surface of 2D sheets than the general doping. The methods for synthesizing single-atom catalysts include physical deposition, metal leaching, wet chemistry, *etc*. The details of the preparation methods have been summarized in the references. <sup>53,54</sup> Single-atom catalysts are stable owing to strong metal-support interaction. What is more, they possess significant efficiency per active center due to the unsaturated coordination of metal atoms. <sup>55</sup> In fact, when the nanoparticle size (>2nm) reduces to nanoclusters (~1nm), the continuous energy bands become discrete levels like molecular orbitals; when the size further reduces to single atom level, the quantum size effects occur that confined electron states are formed around the Fermi level (Figure 1.8). Single atom will fill the additional electrons in the valence shell. <sup>54</sup> However, the high active electrons could be stabilized through the charge transfer between the metal and the support to reach equilibrium. <sup>56</sup> Therefore, the particular electronic structures enable single-atom catalyst to deliver high activity and selectivity in the reactions.

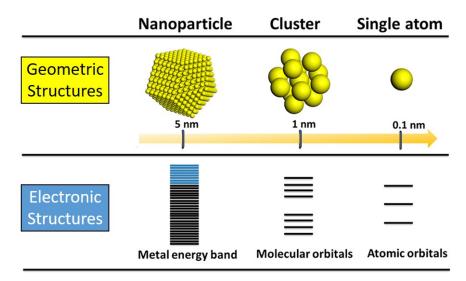


Figure 1.8. The distinct geometric and electronic structures of nanoparticles bulk, nanoclusters and single atom. Reproduced from reference.<sup>56</sup>

Bell and Head-Gordon have investigated twenty-eight single-atom doping the host metal surface to form "single-atom bimetallic" alloys for CO<sub>2</sub> electrochemical reduction by DFT simulation.<sup>57</sup> They conduct the CO<sub>2</sub> hydrogenation by two steps: 1) CO<sub>2</sub> conversion to CO and 2) CO to CH<sub>4</sub> or CH<sub>3</sub>OH. They selected useful single-atom alloys such as Cu, Ni, Pd, Pt, Co, Rh and Ir substituting the host surface Au or Ag. They found CO<sub>2</sub> reduction to CO takes place on the host Au or Ag via proton reduction, while the further reduction of CO occurs on the substitution atoms because those substitution atoms bind \*CO selectively. Different host, Au or Ag, alters the elementary pathways of CO<sub>2</sub> to CH<sub>4</sub>. In detail, on Rh@Au(100), \*CO is hydrogenated through H adding on carbon atom step where \*CH<sub>x</sub> is the intermediates, whereas on Rh@Ag(100), CO\* is hydrogenated by keeping the C-O bond so that methoxyl group \*OCH<sub>3</sub> is the intermediates.

#### 1.3.5 Bifunctional

The so-called bifunctional catalysts are normally composed by mixing two different materials. These two materials provide different activities for subsequent steps of CO<sub>2</sub> conversion, for instance, convert CO<sub>2</sub> to CO on one surface, then convert the obtained CO to hydrocarbons. Recent articles were reported a Na-Fe<sub>3</sub>O<sub>4</sub>/HZSM-5 and In<sub>2</sub>O<sub>3</sub>/HZSM-5 nano catalyst converted CO<sub>2</sub> to gasoline (C<sub>5</sub>-C<sub>11</sub>) with a robust selectivity as high as 78% through the indirect pathways of passing CO and CH<sub>3</sub>OH intermediates, respectively at 350 °C and 3 MPa. The sample was prepared by physical mixing of one-pot synthesized Na-Fe<sub>3</sub>O<sub>4</sub> nano catalyst and the commercial/hydrothermal synthesized nanocrystalline zeolite. Zeolite helped increase the selectivity to gasoline-range isoparaffins and aromatics enormously, at the same time the opposite function for C<sub>1</sub>-C<sub>4</sub>. <sup>58,59</sup> Based on these results, another bifunctional catalyst, indium-zirconium composite oxide mixed with SAPO-34 zeolite (In-Zr/SAPO-34), was prepared by similar way but realized a direct conversion of CO<sub>2</sub> to C<sub>2</sub>-C<sub>4</sub>. <sup>34</sup> High selectivity of low olefins and low paraffins reach 80% and 93%, respectively at 360 °C. The metal oxide and the zeolite were responsible for the CO<sub>2</sub> activation and C-C coupling, respectively. A tandem catalyst designed with two metal/metal oxide interfaces has also been announced to convert CO<sub>2</sub> to C<sub>2</sub>-C<sub>4</sub> with selectivity up to 60% among all hydrocarbon products.<sup>35</sup> The catalyst was composed by a CeO<sub>2</sub>-Pt core and a mesoporous silica shell which was further decorated with cobalt nanoparticles. The CeO<sub>2</sub>/Pt interface converts CO<sub>2</sub> and H<sub>2</sub> into CO through the RWGS reaction, and the Co/mSiO<sub>2</sub> interface subsequently converts CO to C<sub>2</sub>-C<sub>4</sub> through FT process.

### 1.4 Structure-Activity Relationships

Understanding the relationships between catalyst structures and their reactivities is the key to optimize the catalyst and therefore to tune the catalytic activity.

#### 1.4.1 Size effect

Minimizing the particle size is a way of optimize the use of precious metal catalysts. More importantly in fundamental science, when the particle size reduces to nanosized, the specific surface area increases to enable enhanced adsorption of the reactants, thus enhance the conversion. When the particle size reduces to single nanometer, not just the specific surface area increases, but the electronic and surface atomic structures of the particles present different properties due to the low coordination and high chemical potential. 60-62 Vogt, *et al.* found that decreasing particle size of Ni from 7 to 1 nm lead to a decreasing CO adsorption strength during CO<sub>2</sub> hydrogenation. The rate-determining step of CO<sub>2</sub> hydrogenation was hypothesized to be the process of hydrogenation of intermediate CO. 63 Single dispersed Ru agglomerates to form Ru clusters and even nanoparticles during CO<sub>2</sub> hydrogenation reaction at 350 °C. However, the activity of CO<sub>2</sub> conversion and the selectivity of CH<sub>4</sub> over CO increase gradually. 64 This indicates dynamic of the reconstruction plays positive role in the activity.

Size effect has been especially widely investigated in FT reaction especially on cobalt.  $^{65,66}$  De Jong's group has found that the cobalt particle size did not affect the reaction in terms of turnover frequency (TOF), selectivity and activity for CO hydrogenation until 6 nm at 1 bar or 8 nm at 35 bar.  $^{67,68}$  When the cobalt particle size was reduced to 2.6 nm, the TOF decreased about 16 times and the  $C_{5+}$  selectivity decreased 1.6 times at 35 bar compared to those on 16 nm particles. The lower TOF of Co particles <6 nm is caused by both blocking of edge/corner sites and a lower intrinsic activity at the small terraces because irreversible CO coverage was found to be increased on the smaller particles. The higher methane selectivity of small Co particles is mainly brought about by their higher hydrogen coverages. Besides, the particle size effects facilitate the reversibly bonding of  $CH_x$  and  $OH_x$  intermediates, whereas inhibit reversible CO coverage for small Co particles (<6 nm). These were attributed to the low-coordinated surface sites of cobalt based on the observation of a decrease of the cobalt coordination number under reaction conditions in extended X-ray absorption fine structure (EXAFS) spectroscopy.

#### 1.4.2 Interface

The metals have been considered to be the reactive centers, while the supports were used for dispersing and stabilizing the metal nanoparticles and even for deactivation function. <sup>69–71</sup> Burch and coworkers clearly summarized the hypotheses about the synergistic interactions between copper and zinc oxide into six categories as follows: (a) the formation of Cu<sup>+</sup> ions in ZnO; (b) electronic interactions between Cu and ZnO; (c) Schottky Junction effects at the Cu/ZnO interface; (d) the formation of a Cu/Zn pair; (e) a specific reaction at the Cu/ZnO interface; (f) stabilization of Cu in a morphologically active form by ZnO. Surprisingly, they concluded that direct contact between the active sites and support is not necessary for higher activity. <sup>72</sup> Liu's and Guang's group proved the highly active ZnCu alloy formed by partial reduction of ZnO or a decoration of Cu with metallic Zn. <sup>33,73</sup> Moreover, Liu's group found that the selectivity to CO or CH<sub>4</sub> in CO<sub>2</sub> hydrogenation on supported bimetallic PtCo can be tuned, *i.e.* CeO<sub>2</sub> or ZrO<sub>2</sub> supported PtCo shows high selectivity of CH<sub>4</sub> production through \*HCOO/\*HOCO and/or \*CH<sub>3</sub>O intermediate steps, while TiO<sub>2</sub> support favors CO formation via \*HCOO/\*HOCO intermediates. The intrinsic reason was explained by DFT calculation that the interface has selectivity toward C<sub>2</sub>O-bound and O-bound species. <sup>74</sup>

Overall, the interfacial effect arises from the strong metal-support interaction. The strong metal-support interaction could be determined by the adhesion energy of the supported metal atoms. The adhesion energy increases when the heat of formation of the oxide is high, the enthalpy of the reduction of the oxide is low, and the density of surface oxygen atoms on the oxide is high. The adsorbates sit on the support site of the interface because the support usually acts as acidic site with anionic vacancy or with hydroxyl group to host the CO<sub>2</sub> or CO molecules.<sup>75,76</sup>

#### 1.4.3 Specific surface sites

Besides those "detectable" active sites described above, some more micro-structures of the surface are also proposed to be the key active sites for catalytic reaction. Those include surface defects such as step, edge, corner, oxygen vacancies, and B5 center (e.g. five Ru atoms at the step of hcp-crystals). As characterizations of those sites require restrict conditions, for instance, single crystalline surface, ultrahigh vacuum, and relies on special instrument, a direct detection of those atomic structures under reaction condition is a case-by-case challenge. Therefore, we do not expand the discussion of this part.

#### 1.5 Instrumental Methods

The investigation methods often include spectroscopic analyses, such as diffuse infrared reflectance infrared Fourier transform spectroscopy (DRIFTS)<sup>82</sup>, mass spectroscopy (MS), x-ray photoelectron spectroscopy (XPS), nuclear magnetic resonance (NMR), and gas and liquid chromatography (GC and LC, respectively). These instruments are generally used in situ, which is to use these methods independently. Here below is the brief introduction of each technique in this operando method.

#### 1.5.1 DRIFTS

DRIFTS monitors both the gaseous molecules and the surface species due to the molecular spectrum of the bond vibrations are in the IR spectra region. It is the core part in the setup used in this thesis and mainly used for the surface species analysis.

The molecular spectrum originates from the molecular motions which can be expressed by several motion modes:

$$\varepsilon_i = \varepsilon_i^T + \varepsilon_i^R + \varepsilon_i^V + \varepsilon_i^E$$
, Eq. 1.7

where  $\varepsilon_i^T$ ,  $\varepsilon_i^R$ ,  $\varepsilon_i^V$ , and  $\varepsilon_i^E$  are the translational, rotational, vibrational, and electronic energy, respectively. The first three terms come from nuclear motion and the fourth term is electron motion. The energy levels are discrete according to quantum theory but with different gaps between the energy levels. The energy range of each motion, calculated by statistical thermodynamic methods, is different and follows the order  $\varepsilon_i^T < \varepsilon_i^R < \varepsilon_i^V < \varepsilon_i^{E}$ . This explains why  $\varepsilon_i^R$  and  $\varepsilon_i^V$  can be excited by far~middle and middle~near infrared (IR), respectively. Therefore, we utilize the rotational-vibrational spectrum of IR absorption to study the CO<sub>2</sub> chemistry in this thesis. One of the difficulties of IR spectroscopy is the assignment of the bond vibrations of each species (molecules or adsorbates). Because one species could possess multiple stretching and bending modes due to the molecular symmetry, the IR peak of the bond vibrations could couple and disturb the discerning especially for similar species, for example, carbonate (CO<sub>3</sub><sup>2</sup>-), bicarbonate (HCO<sub>3</sub><sup>-</sup>), and formate (HCOO<sup>-</sup>) which could be formed from CO<sub>2</sub> chemisorption.

The CO<sub>2</sub> molecule has four fundamental vibrational degrees of freedom (3N-5 for linear molecules where N is the number of the atoms in the molecule). They are symmetric stretching mode  $v_1$  at around 1380 cm<sup>-1</sup>, two identical bending modes  $v_2$  including in plane and out of plane bending at 667 cm<sup>-1</sup>, and asymmetric mode  $v_3$  at 2349 cm<sup>-1</sup>. The  $v_2$  and  $v_3$  are IR active as they have dipole

moment change ( $\mu = \mathbf{q} \cdot \mathbf{r}$ ), while  $v_1$  is Raman active as the symmetric stretching does not have dipole moment change but polarizability change. In addition, there are two combinational peaks, i.e.  $v_3 + 2v_2$  at 3610 cm<sup>-1</sup>, and  $v_3 + v_1$  at 3710 cm<sup>-1</sup> which are IR active, and  $v_1$  is split to a doublet peak at 1288 and 1389 cm<sup>-1</sup> which are caused by Fermi resonance of  $v_1$  and  $2v_2$  and are Raman active. 15

 $CO_2$  adsorbed on the surface leads to a weakened C=O bond by electrostatic interaction or surface- $CO_2$  chemical bond formation. Bent  $CO_2$  could be formed when the interaction is strong. This appears as a redshift of the peak on the IR spectrum, which is used to justify physisorption or chemisorption of  $CO_2$ . When  $CO_2$  dissociates or forms other compound on the surface, usually like  $CO_3^{2-}$ ,  $HCO_3^{-}$ ,  $HCO_3^{-}$ , carbon monoxide (CO), oxygenate ( $C_2O_4^{-}$ ), and so on, new IR peaks that are completely different from  $CO_2$  peaks will emerge. This is used for defining the products of  $CO_2$  chemisorption reaction on the surface.

DRIFTS is a feasible method for studying the reaction mechanisms from both the surface and gas phase in the catalyzed CO<sub>2</sub> hydrogenation process. Some specific issues about the DRIFTS instrument need to be figured out first, for example, avoiding the interference from the atmospheric gas in IR spectra, optimizing measurement parameters of scanning speed and resolution, the IR peak assignments, etc. Herein, we studied the CO<sub>2</sub> peak intensity in the IR spectra varying with the pressure and temperature first to find the proper measurement parameters and to understand the CO<sub>2</sub> IR spectra. It is of importance to keep the DRIFTS instrument flushing in N<sub>2</sub> gas to blow away the atmospheric gases in the IR beam pathways. At least 500 NL/h N<sub>2</sub> flow for 1 h is required before the first measurement. Longer flush time is needed for very low concentration gas or vacuum surface measurement. As shown in Figure 1.9, pure CO<sub>2</sub> was filled in the DRIFTS chamber which is loaded by KBr powder sample. CO<sub>2</sub> presents as free gas molecule with the asymmetric stretching centered at 2349 cm<sup>-1</sup>, because the low-energy rotational motion consists the IR peak. 2360, 2341, and 2310 are the R branch ( $\Delta J = +1$ , ground state), P branch ( $\Delta J = -1$ , excited state), and hot band of rotational spectra, respectively. 84 When pressure increases, the whole rotational-vibrational peaks increase correspondingly (Figure 1.9(a)). When the temperature increases, the P branch and hot band are enhanced obviously.

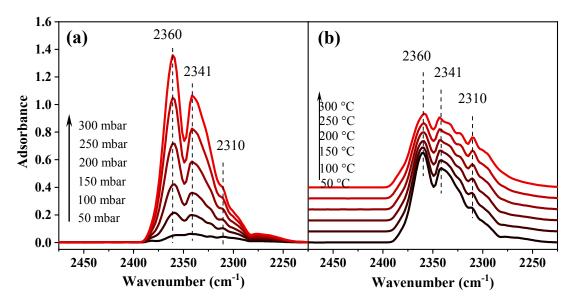


Figure 1.9. (a) Pure  $CO_2$  adsorption on KBr at pressure from 50 to 300 mbar. (b) 200 mbar  $CO_2$  adsorption on KBr at temperature from 50 to 300 °C.

#### 1.5.2 MS, GC, NMR and other Methods

MS measures the mass-to-charge (m/z) ratio of the gas fragments which are ionized by the electrons at 1 kV. MS can be used for quantitative analysis of the gas components in the reactants and products in the gas flow when the ion current intensities of the CO<sub>2</sub>, H<sub>2</sub>, and CH<sub>4</sub> gases are calibrated at different gas concentrations. MS has fast response of the sample scan, which can be programmed in a few hundred milliseconds for a full scan. Therefore, MS data analysis facilitates the kinetic parameters of the reactions.

GC measures the retention time of the gases passing through the stationary phase with a specific column filling. The gases interact with the stationary phase differently and exit the column at different time due to the different chemical and physical properties of the gases. GC has advantages of separation of the gases that have overlapped signals in MS, for example, the abundance of m/z = 28 from both CO and CO<sub>2</sub> gases, and can detect low concentration of a dozen ppm precisely. However, GC has long measuring time (~15 minutes) for one-time detection comparing to the fast response in DRIFTS and MS. Therefore, GC can be used for a supplementary gas analysis method in addition to MS.

NMR measures the chemical shift of the resonance frequencies of the nuclear spins of the sample molecules, which are dissolved in the reference solvent, in a magnetic field. NMR can supplement

the analysis of the liquid or dissolvable reaction products, such as alcohols and acids. Moreover, NMR can detect low concentration of the samples down to a few ppm.

Other methods, such as X-ray photoelectron spectroscopy (XPS), transmission electron microscopy (TEM), X-ray diffraction (XRD), and BET surface area via N<sub>2</sub> adsorption, are generally used for sample characterizations.

## 1.6 Challenges in this Field and Objectives of this Thesis

CO<sub>2</sub> hydrogenation has been investigated over a century. But the reaction mechanisms and effective (high activity and selectivity) catalysts are still under research. There are four frontier questions highlighted here. Starting from the instrumental methods, the majority of the current investigations are using in situ equipment, for instance, in situ DRIFTS or in situ MS. However, using these equipments independently leads to either inconsistent experimental conditions or incomplete information. Secondly, the data analysis part is onerous but vital, for example, the deconvolution of the IR peaks from the strongly overlapped spectra, the quantification of the reaction components, the kinetic analysis, etc. Thirdly, the relation between the reactivity and the catalysts, such as the active sites for the reaction, is always ambiguous. Fourthly, the grasp of the reaction intermediates in the experiment is disturbed by the complex of the reaction, e.g. mixing with byproducts and rapid conversion.

Therefore, to address these issues, we set the objectives of this thesis as developing instrument for an operando study, developing data analysis methods for both DRIFTS and MS, identifying the reaction intermediates and explain the reaction mechanisms, developing novel and efficient catalyst and finding out the relation between the reactivity and the catalyst structure.

#### 1.7 Overview of the Research Wok in this Thesis

We build an operando platform for investigating the catalytic process of one experiment stream using multiple detect methods. On the basis of the developed instrument, we create an analysis program for resolving spectral dataset. Apart from the instrumental side, we studied variously transition metal-based catalysts and the mechanisms of CO<sub>2</sub> adsorption and reduction reactions over those catalysts. Finally, we designed a novel catalyst according to what we have discovered to optimize the catalytic reactivity and to further understand the relationship between the catalyst surface and the CO<sub>2</sub> hydrogenation. Following is the brief introduction of each chapter.

In Chapter 2, an operando method, DRIFTS-MS-GC, is developed, aiming at analyzing the gas components and the surface adsorbed species simultaneously in the reaction stream. The details of this setup, the fundamental research on CO<sub>2</sub> interaction with pure metal, alloy, and metal-oxide, the quantification of the gas amounts, and the kinetic determinations are described in depth.

In Chapter 3, we developed an efficiently automatic program, bilevel evolutionary Gaussian Fitting (BEGF) program, for analyzing the spectral sets of the  $CO_2$  hydrogenation experiments. The BEGF program searches the deconvolution results by genetic algorithm and fitting the peaks by Gaussian function. The analyzed results show the correct deconvoluted and kinetics of the peaks. Therein, we showed the results of IR peak assignments of gas and adsorbates from  $CO_2$  hydrogenation reaction and from isotopic  $^{13}CO_2+H_2$  and  $CO_2+D_2$  reactions over  $Ru/Al_2O_3$  surface.

Continuing the establishment above, in Chapter 4, we investigated the surface reaction mechanisms of CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub> in DRIFTS via controlling the formation and hydrogenation of each adsorbed species. The development of each adsorbed species verified which are intermediates and which are byproducts. Therein, the CO<sub>2</sub> hydrogenation steps were elaborated. Moreover, the oxide support, Al<sub>2</sub>O<sub>3</sub>, is not inert, but participates in CO<sub>2</sub> activation. The initial hydrogenation takes place on the interface of Ru and Al<sub>2</sub>O<sub>3</sub>.

Learning from above results that the catalyst requires oxide to facilitate  $CO_2$  hydrogenation reaction, we suspect there could be a relationship between the ratio of metal/oxide and the reactivity. Therefore, in Chapter 5, we designed  $Co_x(CoO)_{1-x}$  catalyst from an in situ reduction methods in the DRIFTS-MS-GC instrument. The results showed high concentration of CoO in the catalyst is the key to achieve high  $CO_2$  conversion. This not because CoO provides new catalytical center but because CoO enhanced the  $CO_2$  adsorption.

Conclusions and perspective of this thesis are organized after the last chapter.

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# Chapter 2 A Combined Diffuse Reflectance Infrared Fourier Transform Spectroscopy—Mass Spectroscopy—Gas Chromatography for the Operando Study of the Heterogeneously Catalyzed CO<sub>2</sub> Hydrogenation over Transition Metal-Based Catalysts

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**Summary:** this Chapter introduces the work of setup building, the first application tests, the explorations on different catalysts, and kinetic calculation models for CO<sub>2</sub> methanation reaction. The reactivities of pristine and alloyed metals and metal-metal oxide were compared. Metal oxide was found to be essential to enable the observation of adsorbed species on the surface using DRIFTS, and to improve the reactivity for CO<sub>2</sub> methanation.

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## Abstract

We built an inline diffuse reflectance infrared Fourier transform spectroscopy-mass spectroscopy-gas chromatography (DRIFTS-MS-GC) apparatus aiming at operando mechanistic study of the heterogeneous catalyzed CO<sub>2</sub> hydrogenation reaction. The multifunctional and accurate system enabled the simultaneous utilization of IR, MS, GC, and NMR techniques in one single device to analyze the surface, gas and liquid products formed during the reaction process. To assess the potential of the system, we compared the activity of pristine metals (Fe, Co, Ni, and Cu), metal alloys (LaNi<sub>4</sub>Cu) and metal-metal oxides (Co-CoO) catalysts with respect to the interactions between gaseous CO<sub>2</sub> and the catalyst surfaces. For the quantitative comparison, the rate constants and activation energies of CO<sub>2</sub> hydrogenation were determined. The results showed a composition dependent reactivity of the metals. The metal oxide mixed with the metal is essentially important for the formation of observable of the surface species deriving from CO<sub>2</sub> adsorption and for the enhancement of the CO<sub>2</sub> conversion to CH<sub>4</sub>.

## 2.1 Introduction

The conversion of CO<sub>2</sub> into synthetic hydrocarbons is becoming of increasing importance, due to the demand of the storage of the exponentially growing renewable and sustainable energy sources.<sup>1-3</sup> Multiple reaction pathways, including thermal, electrochemical, and photo(electro)chemical catalysis have been used to successfully explore the conversion processes.<sup>4–8</sup> At the current state of the art, thermal catalysis is the method with the highest power density and the greatest potential for scaling up due to high activity of the catalysts employed to this scope. 9-11 However, the efficiency and selectivity of the synthetic processes are expected to be improved through the design of highly active and selective catalysts. Recent studies reported several novel catalysts for CO<sub>2</sub> hydrogenation reactions. 12,13 Ru-, Rh-, and Pd-based catalysts were found to be especially active for the transformation of CO<sub>2</sub> to CH<sub>4</sub> through the Sabatier reaction. For this reaction, reactor based on the selected noble metal-based catalyst can succeed in reaching 99% conversion. However, the high cost of these elements limits the employment on a large scale. Nano sized metals on supports reduce the economic issues, as the total load can be reduced to a few weight percentage. Yet, large loading is necessary for improving activity and selectivity. 18 Ni- and Co-based catalysts, which are less expensive, are also active and widely used for CO2 methanation. However, these catalysts show lower yields and require higher reaction temperature compared with Ru/Al<sub>2</sub>O<sub>3</sub>. <sup>19-21</sup> Numerous alteration of the active phase, such as doping, 22 alloying, 23-25- promoting, 26,27 and nanosizing, 28,29 have been attempted to increase their activity and selectivity. Yet, there is no systematical comparison of the catalysts with different structural design in experiment to give instructions of the choice of a specifically structured catalysts.

In order to correctly address the development of new, less expensive and more performing catalysts, suitable integrated investigation techniques are necessary. The experimental and analytical tools are two essential aspects to be addressed. The investigation methods for the CO<sub>2</sub> hydrogenation studies often include spectroscopic analysis, such as diffuse infrared reflectance infrared Fourier transform spectroscopy (DRIFTS)<sup>30–33</sup>, mass spectroscopy (MS), x-ray photoelectron spectroscopy (XPS), nuclear magnetic resonance (NMR), and gas and liquid chromatography (GC and LC, respectively). However, these detection methods are generally performed independently or *ex situ*, which leads to either inconsistent experimental conditions or incomplete information. An operando method facilitates the collection of coherent and complete information of the reaction in one single experiment. This consideration is the main motivation for the development of the system here described.

With regard to the selection of the catalysts, ahead of designing the new materials, a systematic understanding of the fundamental differences of the metals in the CO<sub>2</sub> hydrogenation reaction is of great interest and importance. Recently, our group has compared the activities of the pristine metals Fe, Co, Ni, Cu in the Sabatier reaction.<sup>21</sup> The results showed that Co and Ni can convert 70% and 55% CO<sub>2</sub> to CH<sub>4</sub> at 390 and 520 °C, respectively. These two pristine metals show similar activation energies of around 75 kJ/mol. Fe converted CO<sub>2</sub> to CO mainly above 300 °C, through the reversed water gas shift reaction. Cu was inactive toward CO<sub>2</sub> conversion. These results are consistent with the report by Bartholomew, *et al.* in the 1980s about the silica-supported transition metals for CO<sub>2</sub> hydrogenation.<sup>34</sup> However, in these valuable studies, no information on the binding products on the surfaces during the CO<sub>2</sub> conversion process are provided, leaving an critical gap in the explanation of the reaction mechanisms. Theoretical simulations that calculate the elementary steps of CO<sub>2</sub> adsorption and hydrogenation reactions could address this issue. However, the calculations are normally performed using specified single crystalline facets and under ideal condition.<sup>35</sup> These stimulate the demand of the experimental evidences of the intermediates formed under real reaction conditions in addition to the observation of the final products.

Therefore, we built an inline analysis system consisting of a diffuse reflectance infrared Fourier transform spectroscopy (DRIFTS), a mass spectroscopy (MS), a gas chromatography (GC) analyzer. The deionized water (DIW) bottle for nuclear magnetic resonance (NMR) analysis was an optional connection. We simplified the name as DRIFTS-MS-GC. This infrastructure enables the detection of surface, gas, and liquid products during the CO<sub>2</sub> hydrogenation reaction over the catalyst operando. The careful integration of the three instruments gathers the advantages of the variously important analytical techniques, and synchronizes the coherent data, which is main innovation in the field of scientific instruments and opens the way to the investigation of reaction pathways operando. At the best of our knowledge, as of today no study reports such an integrated system in operation.

Thanks to this apparatus, we investigated systematically the catalysts in the CO<sub>2</sub> hydrogenation reaction. Aiming at developing new highly active and efficient catalysts, we selected the first-row group 8–11 transition metal-based catalysts, and designed three different forms of these metals as representative catalysts. We began with the pristine metals, aiming at understanding the fundamental distinctions of CO<sub>2</sub> interaction with these pure metal surfaces. Second, considering the activation of the CO<sub>2</sub> molecule is hydrogen assisted, we used an alloy form, LaNi<sub>4</sub>Cu metal hydride which can adsorb 3.63 hydrogen atoms per formula unit, <sup>36</sup> in order to evaluate the effect of hydrogen pre-storage in the metals on the CO<sub>2</sub> hydrogenation. Based on the experiences on these pristine and alloyed

metals, we examined the metal oxide effect using cobalt-cobalt oxide (Co-CoO), because the metal oxide is reported to enhance the catalytic conversion of CO<sub>2</sub>.<sup>37</sup>

## 2.2 Experimental

## 2.2.1 **Setup**

The DRIFTS-MS-GC setup consists of five parts as shown in Figure 1. Part I, a gas flow controller connected to H<sub>2</sub>, CO<sub>2</sub>, and He gas lines, whose flows were controlled using mass flow controller (MFC) and Labview program. Part II, a DRIFTS chamber (HVC, Harrick Scientific) integrated with a Fourier transform infrared (FTIR, Tensor 27, Bruker) spectrometer using a mercury cadmium telluride (MCT) detector. Part III, a mass spectrometer (MS, Pfeiffer OmniStar 320) using a detector of Faraday cup. Part IV, a sealed bottle containing DIW for the collection of any liquid products, such as ethanol. Part V, gas chromatography (GC, SRI 8610C) using a flame ionization detector (FID). In addition, a branch connection to MS was included, to make temperature-programmed desorption-mass spectrometer (TPD-MS) measurements.

The operation conditions for each part are as follows. For part I, the max flow speed for H<sub>2</sub>, CO<sub>2</sub>, and He are 10, 10, and 73 mL/min, respectively. For part II, DRIFTS can be operated in the pressure range from 10<sup>-6</sup> – 10<sup>6</sup> mbar and in the temperature range from room temperature (RT) to 900 °C, with an optimized scan speed of 38 scan/min. In addition, the entire DRIFTS part is maintained in N<sub>2</sub> gas flush to eliminate interference from atmospheric H<sub>2</sub>O and CO<sub>2</sub> whose vibrational signals are especially IR sensitive. For part III, the MS measurements were taken at pressure below 10<sup>-5</sup> mbar with a scan speed of 200 ms/amu in a mass range of 0-50. For parts IV and V, the exhaust gas passes through DIW and GC at ambient pressure. The measurement time (retention time) was set as 9 minutes for GC measurement with an interval time of 4 minutes between each measurement. Note that a back-pressure regulator has been placed at the exhaust gas line of DRIFTS.

The function of each part is as follows. For part I, a gas flow controller is utilized to precisely control gas flows using digital commands. For part II, DRIFTS scans the surface adsorption species, in addition to detecting the gas phase. For part III, MS detects the gas-phase reactants and products. For part IV, DIW collects any liquid products for NMR analysis. For part V, GC detects the gas phase to complement the analysis of gas products which have overlapped signals in MS.

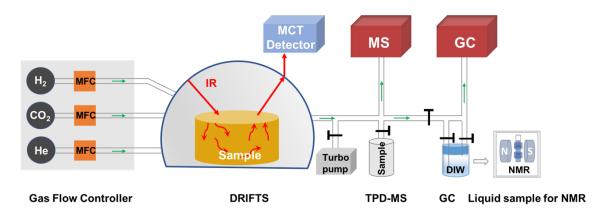


Figure 2.1. Schematic of the DRIFTS-MS-GC instrument utilized in this study

## 2.2.2 Experiments

## 2.2.2.1 Materials preparation

Fe, Co, Ni, and Cu powders (99%, max. particle size 60 µm, Goodfellow) were used as purchased, but compressed into soft pellets of the same size as the DRIFTS chamber (diameter, 6 mm; thickness 3.5 mm). Although the DRIFTS requires normally samples to not be pressurized, we observed that most of the intensity of the infrared (IR) signal was maintained over the soft pellet surface compared to powder surface. Moreover, pellet samples exhibit two important advantages compared to the powder samples. First, pellet samples have little problem of sample loss due to gas flow or pumping, which is particularly important for nanomaterials. Second, pellets have better thermal conductivity during the heating experiment.

LaNi<sub>4</sub>Cu was synthesized through arc melting of La, Ni, and Cu metals under an Ar atmosphere. The details can be found in our previous work.<sup>36</sup> The LaNi<sub>4</sub>Cu alloy was activated in pure H<sub>2</sub> gas at a pressure of 20 bar. The bulk alloy became a powder after H<sub>2</sub> activation. After releasing the high-pressure H<sub>2</sub>, the sample was transferred to the DRIFTS chamber via an operation in the Ar gas-filled glovebox.

Co-CoO was synthesized by reducing Co<sub>3</sub>O<sub>4</sub> nanoparticles in an H<sub>2</sub>/He flow (6mL/min / 4 mL/min) in the DRIFTS chamber at 250 °C for 4 h, with a heating rate of 2 °C/min. Afterwards, the sample was cooled down in the same H<sub>2</sub>/He flow. The Co<sub>3</sub>O<sub>4</sub> nanoparticles were prepared by the calcination of Co(NO<sub>3</sub>)<sub>2</sub>·6H<sub>2</sub>O (Sigma-Aldrich, 99%). The calcination program was set to 300 °C for 12 h and continuing heating to 400 °C for 2 h, using heating a rate of 2 °C/min.

## 2.2.2.2 Reaction settings

CO<sub>2</sub> adsorption and hydrogenation reactions on pristine metals. The pristine Fe, Co, Ni, and Cu metal samples were loaded in the DRIFTS chamber and then evacuated to high vacuum at RT. The IR spectrum background was recorded on the metal surface at this high vacuum. CO<sub>2</sub> adsorption experiment was executed by filling this evacuated DRIFTS chamber with pure CO<sub>2</sub> gas of 1 bar. Afterwards, the samples were heated from RT to 500 °C with a heating rate of 5 °C/min. The spectra were taken at every 50 °C. The CO<sub>2</sub> hydrogenation reactions on Fe, Co, Ni, and Cu metals were performed also in the closed chamber condition. Again, the chamber was first pumped to high vacuum at RT. Afterwards, the samples were heated to 200 °C in the vacuum, and the IR backgrounds were taken. Then, 200 mbar CO<sub>2</sub> and 800 mbar H<sub>2</sub> were filled in the chamber. The spectra were taken every half an hour.

*CO*<sub>2</sub> hydrogenation reaction on metal hydride. The LaNi<sub>4</sub>Cu alloy sample was loaded into the DRIFTS chamber through air-free operation. The chamber was then pumped to high vacuum at RT. The IR background was taken later on. Then 200 mbar CO<sub>2</sub> and 800 mbar H<sub>2</sub> were filled in the chamber. The sample was heated from RT to 450 °C with a heating rate of 2 °C/min, and the spectra were scanned continuously every 10 °C.

CO<sub>2</sub> hydrogenation on metal-metal oxide. The CO<sub>2</sub> hydrogenation reaction on the Co-CoO catalyst surface was carried out under continuous gas flow condition. After the Co-CoO catalyst was synthesized in the DRIFTS chamber, the IR background was taken. Then, CO<sub>2</sub> at 1.5 mL/min, H<sub>2</sub> at 6 mL/min, and He at 2.5 mL/min were allowed to flow through the whole DRIFTS-MS-GC system. Heating from RT to 350 °C with a ramp of 2 °C/min was applied to the sample. The IR spectra were taken every 20 °C. The MS measured the mass range of 0–50 amu, with a rate of 0.2 s per mass unit. The GC took 9 min to obtain each spectrum, with a cooling interval of 4 min between each measurement.

## 2.2.3 Determinations of rate constant and activation energy

The main reaction of CO<sub>2</sub> hydrogenation far before the reaction equilibrium is

$$CO_2 + 4H_2 \rightarrow CH_4 + 2H_2O$$
. Eq. 2.1

Therefore, the kinetics of this reaction can be simplified as

$$\frac{d[CH_4]}{dt} = -k[CO_2]^m [H_2]^n,$$
 Eq. 2.2

where  $[CH_4]$ ,  $[CO_2]$ , and  $[H_2]$  are the concentrations of CH<sub>4</sub>, CO<sub>2</sub>, and H<sub>2</sub>, respectively, at reaction time t, with units of mol/L. k is rate constant. m and n are the reaction orders of CO<sub>2</sub> and H<sub>2</sub>, respectively.

According to the stoichiometry,  $[H_2]$  is four-fold  $[CO_2]$ . As we kept the gas feed of  $H_2$  and  $CO_2$  at ratio of 4:1, the  $[H_2]$  can be replaced by  $4 \cdot [CO_2]$ . As for the reaction orders, the reaction order of  $CO_2$  is reported to be less than 0.4, and that of  $H_2$  is less than 0.9 at reaction temperatures lower than 250 °C.<sup>38–41</sup> Therefore, we assume the overall reaction order is 1. Thence, the reaction kinetics is further simplified as

$$\frac{d[CH_4]}{dt} = -k'[CO_2]^{m+n},$$
 Eq. 2.3

where m + n is 1 and k' is  $4^n \cdot k$ .

Therefore, to obtain k', we only need to quantify the derivation of CH<sub>4</sub> quantity over the reaction time and the CO<sub>2</sub> quantity.

Note that Eq. 2.3 is the reaction rate of the overall reaction, which is from the beginning of dose of  $CO_2$  to the end of the product of  $CH_4$ . Therefore, the intermediate steps between  $CO_2$  and  $CH_4$ , i.e.  $CO_2 \rightarrow$  surface reactive species  $\rightarrow CH_4$ , are incorporated. However, if the feeding ratio of  $H_2 / CO_2$  is not 4 (nonstoichiometric), this simplification of Eq. 2.3 could not be used. Instead, the  $[H_2]$ ,  $[CO_2]$ , m and n have to be quantified independently, and their real values have to be all used as described in the Eq. 2.2.

## 2.2.3.1 Determination of gas concentrations

We used two models of CO<sub>2</sub> hydrogenation reactions: constant volume without gas flow for the pristine and alloyed metals, and constant pressure with gas flow for the metal-metal oxide. Therefore, we used two different evaluation methods. For constant volume reaction, the pressure in the DRIFTS reaction chamber could be easily tracked by the pressure sensor, which is connected right before the reaction chamber. The quantity of each gas component is then calculated from the partial pressure. This calculation method was used for calculating the CH<sub>4</sub> yield over the four pure metals and the kinetic constant and activation energy over LaNi<sub>5</sub>Cu.

For constant pressure (flow gas) reaction, the quantification is more challenging. The molar quantities of H<sub>2</sub>, CO<sub>2</sub>, CH<sub>4</sub>, and He gases were determined using MS signals with m/z at 2, 44, 15, and 4, respectively. We mixed H<sub>2</sub>/CO<sub>2</sub>/He or CH<sub>4</sub>/CO<sub>2</sub>/He gases at different concentrations to obtain the correlation between the concentration and MS signal. He gas not only acted as carrier gas, but also the reference intensity of the MS signal. Herein, for H<sub>2</sub>, CO<sub>2</sub> and CH<sub>4</sub> gases, we obtained

$$\frac{f(H_2)}{f(He)} = (3.98 \pm 0.18) \cdot \frac{I(H_2)}{I(He)},$$
 Eq. 2.4

$$\frac{f(CO_2)}{f(He)} = (2.57 \pm 0.04) \cdot \frac{I(CO_2)}{I(He)},$$
 Eq. 2.5

$$\frac{f(CH_4)}{f(He)} = (2.50 \pm 0.17) \cdot \frac{I(CH_4)}{I(He)},$$
 Eq. 2.6

where  $f(H_2)$ ,  $f(CO_2)$ ,  $f(CH_4)$ , and f(He) (mL/min) are the flow rates of H<sub>2</sub>, CO<sub>2</sub>, CH<sub>4</sub>, and He gases, respectively.  $I(H_2)$ ,  $I(CO_2)$ ,  $I(CH_4)$ , and I(He) are the MS signal intensities with m/z at 2, 44, 15, and 2, respectively.

Combining Eq. 4-6, we can finally obtain the transient CO<sub>2</sub> and CH<sub>4</sub> molar numbers

$$n(CO_2) = \frac{f(CO_2)}{24.5},$$
 Eq. 2.7

$$n(CH_4) = \frac{f(CH_4)}{24.5},$$
 Eq. 2.8

where 24.5 (mL/mol) is the mole volume of idea gas at 25°C.

The Eq. 2.3 for calculating the kinetic constant can now be expressed as

$$\frac{dn(CH_4)}{dt} = -k'n(CO_2) .$$
 Eq. 2.9

The reaction time t is the gas passing time through the sample, which is calculated as

$$t = \frac{v_{sample}}{f_{total}},$$
 Eq. 2.10

where  $V_{sample}$  is the sample volume calculated from the size of the sample pellet.  $f_{total}$  is the total flow of the mixed gases which is 10 mL/mim.

## 2.2.3.2 Determination of activation energy $(E_a)$

The correlation between k and  $E_a$  is determined using the Arrhenius equation

$$lnk = lnA - \frac{E_a}{R} \cdot \frac{1}{T},$$
 Eq. 2.11

where A is the pre-exponential factor, R is the gas constant, and T is reaction temperature.

Replacing k by k', we obtain

$$lnk' = lnA' - \frac{E_a}{R} \cdot \frac{1}{T},$$
 Eq. 2.12

where the new pre-exponential factor A' is  $4^n \cdot A$ .

## 2.3 Results and Discussions

## 2.3.1 CO<sub>2</sub> adsorption and hydrogenation reactions on the pristine metal surfaces

CO<sub>2</sub> adsorption on the pristine Fe, Co, Ni, and Cu metal surfaces showed only gaseous CO<sub>2</sub> in the IR spectra with asymmetric stretching vibrations centered at 2349 cm<sup>-1</sup> (not shown). The derivative species, such as non-dissociated product carbonate and dissociated product CO\*, were missing, indicating that CO<sub>2</sub> interacts very weakly on these pristine metal surfaces at RT. This is consistent with the reported low CO<sub>2</sub> binding energies (less than 40 kJ/mol) and with the desorption temperatures lower than RT on the single crystalline metal surfaces. <sup>42,43</sup> To examine whether CO<sub>2</sub> molecules interacted stronger with the pure metal surfaces when increasing the temperature, we heated the surfaces up to 500 °C. As shown in Figure 2(a), CO gas, with rotational-vibrational modes in the range from 2230 to 2030 cm<sup>-1</sup>, were produced on the Fe surface at 400 °C. Very low IR intensities of CO gas were also recorded on the Co and Ni surfaces at 400 °C. However, no products were detected on the Cu surface over the entire temperature range. Note that the small peak at 2070 cm<sup>-1</sup> represents the rotational bands of CO<sub>2</sub> gas. <sup>44</sup> Therefore, CO<sub>2</sub> gas interacts with pure Fe, Co, and Ni surfaces at high temperatures by dissociation into CO gas. Fe is the most active metal for the CO<sub>2</sub> dissociation reaction, whereas Cu is not active in the CO<sub>2</sub> adsorption reaction.

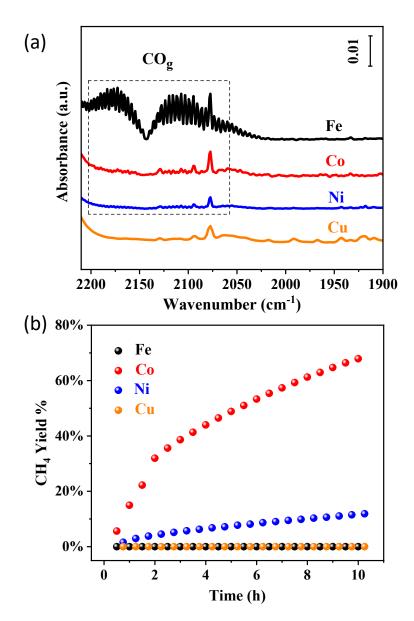


Figure 2.2. (a) IR spectra for 1 bar CO<sub>2</sub> adsorption on Fe, Co, Ni, and Cu surfaces at 400°C. (b) CH<sub>4</sub> yields from the CO<sub>2</sub> hydrogenation reactions on the Fe, Co, Ni, and Cu surfaces at 200°C.

CO<sub>2</sub> hydrogenation was subsequently investigated on these four pure metals. This reaction primarily produces CH<sub>4</sub>, which is known as the Sabatier reaction. The CH<sub>4</sub> yields at 200 °C as a function of reaction time are shown in Figure 2(b). The highest CH<sub>4</sub> yield occurred on the Co surface, and second highest on the Ni surface. After 10 h of reaction, CH<sub>4</sub> yield on Co surface was seven-fold higher than that on Ni surface. No CH<sub>4</sub> was produced on the Fe and Cu surfaces in these conditions. Therefore, Co is the most reactive metal for the CO<sub>2</sub> methanation reaction, and Ni is the second most reactive. This is in line with the previous results from our group.<sup>21</sup> These results suggest that Co is the most

promising catalyst for the efficient CO<sub>2</sub> conversion into synthetic methane. This inspires us to design Co-based materials for the further study of CO<sub>2</sub> hydrogenation, which is presented in the section 2.3.3.

## 2.3.2 CO<sub>2</sub> hydrogenation reaction on the metal hydride surface

In our previous study, we observed that adsorbed H<sub>2</sub> is a key component to weaken the C=O bond of CO<sub>2</sub> to form adsorbed formate or carbon monoxide. 45 Hence, we hypothesize that the poor performance of CO<sub>2</sub> hydrogenation observed for Fe, Ni, and Cu may be caused by insufficient H<sub>2</sub> on the surface. For this reason, we used LaNi<sub>4</sub>Cu alloy for CO<sub>2</sub> reduction as this material represents a classic hydrogen storage material. 36,46 As shown by the IR spectra in Figure 3(a), CO<sub>2</sub> was consumed, along with the production of CH<sub>4</sub> and CO gases when elevating the temperature. We integrated the absorbance of the reactant and product gases to understand the reaction kinetics. As shown in Figure 3(b), CH<sub>4</sub> and CO gases emerged above 350 °C. CH<sub>4</sub> production continued to increase until 450 °C, and CO production continued to increase until 410 °C. Above those temperatures, the intensities of these two products started to decrease. Nevertheless, the high onset temperature of the CO<sub>2</sub> hydrogenation reaction signifies that the LaNi<sub>4</sub>Cu alloy did not help to lower down the reaction temperature, although the alloy was hydrogenated beforehand. Moreover, as the stored H<sub>2</sub> in the alloy remains stable until 100 °C, 46 the high onset temperature for CO<sub>2</sub> hydrogenation invalidated the advantages of H<sub>2</sub> pre-storage. In addition, no adsorbed species were observed from the IR spectra, similar to the cases for pristine metals, making it not possible to explain the intermediate catalyzed steps. Therefore, these pristine and alloyed metals are not suitable for reaction step study which is limited by the DRIFTS analysis, and we did not continue to study the reaction over these pure and alloyed metals using the rest of the methods such as MS, GC, and NMR.

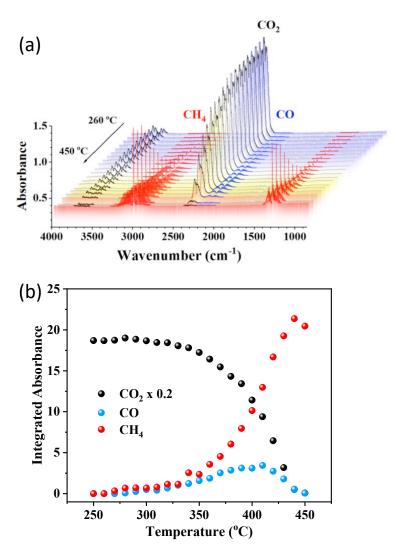


Figure 2.3. (a) IR spectra for the CO<sub>2</sub> hydrogenation reaction on LaNi<sub>4</sub>Cu surface at elevating temperatures. (b) The integrated IR absorbance of gaseous reactant of CO<sub>2</sub> and gaseous products of CO and CH<sub>4</sub>. CO<sub>2</sub> intensity was divided by five times.

## 2.3.3 CO<sub>2</sub> hydrogenation reaction on the Co-CoO surface

As we found that Co is the most reactive metal for CO<sub>2</sub> methanation among the transition metals tested, and based on the observation that metal oxides provide abundant adsorption sites in our previous study, <sup>45,47,48</sup> we synthesized Co-CoO nanoparticles to investigate the gas, liquid, and surface products under flow gas conditions. The Co-CoO nanoparticles possessed a 20% molar concentration of metallic cobalt, as quantified by the consumed amount of H<sub>2</sub> gas measured using MS.

The CO<sub>2</sub> to CH<sub>4</sub> conversion were analyzed by means of MS. As shown in Figure 4(a), the CO<sub>2</sub> hydrogenation reaction on this Co-CoO catalyst began at approximately 160 °C. The primary and

main product was CH<sub>4</sub>, with approximately 90% yield. Weak signals of the very small amounts of CO and C<sub>2</sub>H<sub>6</sub> detected in MS overlapped with the signal of CO<sub>2</sub> fragments. Therefore, GC was employed to separate these gases. As shown in Figure 4(b), C<sub>2</sub>H<sub>6</sub> and CO production have onset temperatures similar to CH<sub>4</sub> production, and show maximum yield of 0.15% and 0.024%, respectively, both at 270 °C. Above 270 °C, the observed amount of both C<sub>2</sub>H<sub>6</sub> and CO decreased, indicating that high temperatures are not favorable for C<sub>2+</sub> synthesis and reversed gas shift reactions on Co-CoO. A reason for this phenomenon could be that the intense methanation reaction produced large amount of H<sub>2</sub>O at high conversion of CO<sub>2</sub>, as we observed condensed water on the chamber window after long time reaction at high temperature. The produced H<sub>2</sub>O competitively adsorbs on the surface and inhibits the reaction in the forward direction. Besides the gas products, traces of methanol, ethanol and acetic acid products were found using NMR, as shown in Figure 4(c). These latter species could be traced only by means of this analytical method. The overall yield of the non-methane products is less than 0.2%. However, the methods used in the study are able to collect information for all of the products.

After clarified the overall products of CO<sub>2</sub> conversion, we analyzed the intermediates on the surface during the reaction process. We tracked the surface adsorption species using the DRIFTS part. The IR spectra region between 1700 and 1200 cm<sup>-1</sup> contain information about the adsorption species (Figure 5(a)). These peaks formed upon CO<sub>2</sub> and H<sub>2</sub> co-adsorption at RT. A deconvolution using the bi-level evolutionary Gaussian fitting showed the development of the peaks. Please refer to our previous work for the peak deconvolution, assignment and identification. <sup>40,47</sup> The peak at 1620 cm<sup>-1</sup> was ascribed to the O-C-O asymmetric stretching mode of formate on the metal-metal oxide interface, and the wide peak centered at 1520 cm<sup>-1</sup> was assigned to the adsorbed carbonate (CO<sub>3</sub><sup>2-\*</sup>). The wide peak centered at 1385 cm<sup>-1</sup> was coupled by the C-H bending and O-C-O symmetric stretching of formate. <sup>49–52</sup> As shown in Figure 5(b), the formate consumed during the reaction, and the CO<sub>3</sub><sup>2-\*</sup> did not vary before 200 °C. Due to the strong interference of the IR spectra from H<sub>2</sub>O, which was formed from the dominant CO<sub>2</sub> methanation reaction, the peaks after 200 °C could not be distinguished well. However, after CO<sub>2</sub> hydrogenation reaction and overnight flashing in He gas, the previously observed formate and carbonate species disappeared, as shown in in the top green plot in Figure 5(a). This suggests that these species are completely consumed above 200 °C. However, new peaks at 1261, 1100, and 1020 cm<sup>-1</sup> remained on the surface after He flow.

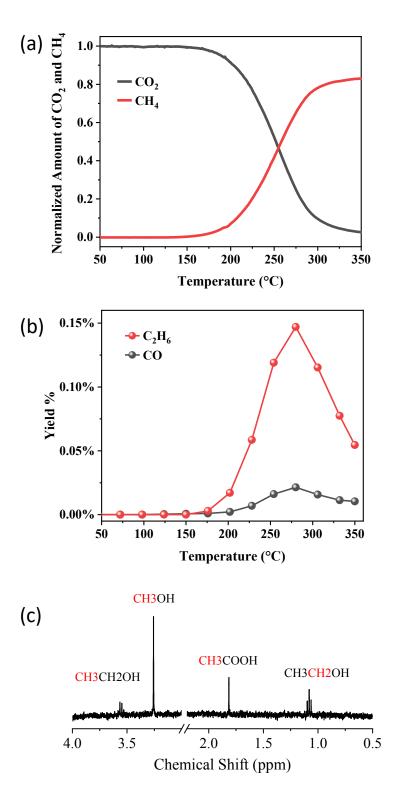


Figure 2.4. (a)  $CO_2$  and  $CH_4$  conversion from  $CO_2$  hydrogenation on Co-CoO surface analyzed using MS data. (b) The calculated yields of  $C_2H_6$  and CO gas products using GC data. (c) Very small quantities of  $CH_3OH$ ,  $C_2H_5OH$ , and  $CH_3COOH$  liquid products collected using the inline deionized water and measured using NMR.

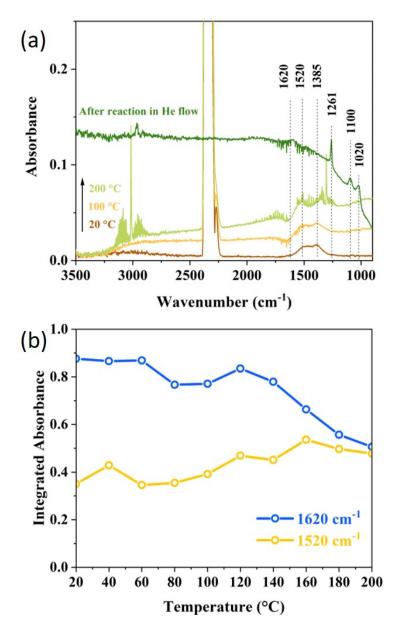


Figure 2.5. (a) IR spectra for the CO<sub>2</sub> hydrogenation reaction on Co-CoO surface. (b) Development of the adsorbed formate and carbonate with IR peaks at 1620 and 1520 cm<sup>-1</sup>, respectively.

To identify the new peaks, we referred to the NMR results. We separately applied 1  $\mu$ L of CH<sub>3</sub>OH, C<sub>2</sub>H<sub>5</sub>OH, HCOOH, and CH<sub>3</sub>COOH liquids to the resulting Co-CoO surface in the DRIFTS chamber in a glovebox. By comparing the IR peaks of the standard chemicals (spectra not shown), the peak at 1261 cm<sup>-1</sup> was found to be fitted with the O-H bending mode of C<sub>2</sub>H<sub>5</sub>OH, the peak at 1100 cm<sup>-1</sup> overlapped with the C-O stretching of HCOOH and C<sub>2</sub>H<sub>5</sub>OH, and the peak at 1020 cm<sup>-1</sup> overlapped with the C-O stretching of CH<sub>3</sub>OH and C<sub>2</sub>H<sub>5</sub>OH. These species may have been retained on the

surface after CO<sub>2</sub> reduction. Yet, the retained species could also be strongly bound CO\* and bidentate carbonate on the cobalt.<sup>54</sup>

Consequently, the surface analysis provided the information that the formate at the metal-metal oxide interface and carbonate at the metal oxide formed upon CO<sub>2</sub> and H<sub>2</sub> co-adsorption. These two species were the intermediates of CH<sub>4</sub> formation. Some carbon oxides, either alcohol/acid or strongly bound CO\*, were retained on the Co-CoO surface as byproducts.

Comparing to the invisible surface species on the pristine and alloyed metals, we speculate that the metal surfaces interact with  $CO_2$  molecules weakly in the applied dry gas and clean surface condition, as the observations of  $CO_2$  adsorption and desorption on metal surfaces are in ultrahigh vacuum and at low temperature (< 0 °C). However, on the oxide surface,  $CO_2$  adsorption and desorption are usually above room temperature. Therefore, the physical properties of the material surface determines the  $CO_2$  adsorption behavior and result in the invisible adsorbed species on the metal and visible adsorbed species on the metal oxide or the interface of the metal and metal oxide. Metal oxide is essentially important for the mechanism study of the surface reactions.

## 2.3.4 Kinetic comparison of the CO<sub>2</sub> methanation reaction on the pristine and alloyed metals, and the Co-CoO surface

As a final example of the capabilities of the instrumental set-up here developed, we calculated the kinetics of CO<sub>2</sub> methanation on the three types of catalysts studied to compare the activities of these catalysts. We calculated the kinetic constants at 200 °C using the Eq. 2.9. As shown in Figure 6 (left axis), Co-CoO exhibits tremendously higher kinetic constant than the pristine Co metal; Co metal possesses ten-fold higher kinetics than Ni; LaNi<sub>4</sub>Cu is not reactive at 200 °C. These explained the high activity of the Co-CoO sample.

The activation energies (E<sub>a</sub>) of CO<sub>2</sub> methanation were calculated using Eq. 2.12 for Co-CoO and LaNi<sub>4</sub>Cu samples at their low CO<sub>2</sub> conversions of 2–40%. These low conversions related to temperature ranges of 166–236 °C for Co-CoO and 310–390 °C for LaNi<sub>4</sub>Cu. The value of E<sub>a</sub> on Co and Ni were taken from a previous work of our group. <sup>18</sup> The results were demonstrated in Figure 6 (right axis). Co-CoO has higher activation energy than Co and Ni, indicating the kinetic constant change faster with temperature on Co-CoO than that on the Co and Ni. This coherent with the observations in Figure 2(b) and Figure 4(a). LaNi<sub>4</sub>Cu has the highest activation energy, which is consistent with its less active at low temperature, and reflects the reaction rate changing fast at high temperature.

These are in line with the observations in Figure 2.3. These results emphasize the importance of the presence of metal oxide phase in the enhancement of the activity of the catalyst in the CO<sub>2</sub> methanation reaction.

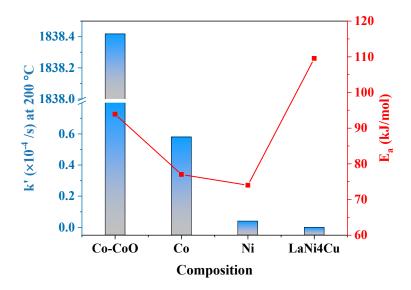


Figure 2.6. Reaction rate constants k' at 200 °C (left axis) and activation energies  $E_a$  of  $CO_2$  methanation (right axis). Activation energies of  $CO_2$  methanation on Co and Ni were taken from the reference<sup>21</sup>.

## 2.4 Conclusions

We built an inline DRIFTS-MS-GC apparatus to perform an operando study of the heterogeneously catalyzed CO<sub>2</sub> hydrogenation reaction. Pristine metals, metal hydride alloy, and metal-metal oxide materials were used as example materials to show the potential of the system and the related analytic methods including the calculation of the kinetic parameters of the reaction and the resolving of the complicated adsorption species. The results verified the reliability of the combined system and sensitivity of this apparatus for the simultaneous investigation of the gas, liquid, and surface products of CO<sub>2</sub> adsorption and hydrogenation reactions. Importantly, the observation of the adsorbed species on the catalyst surface requires the presence of a metal oxide phase in the catalyst. No adsorbed species but only gas phase was found on the purely metallic surfaces, such as pristine and alloyed metals.

In addition to the development of this special instrument and the correspondingly analytic method, this study shows the systematic understanding of the fundamental differences in the interaction of CO<sub>2</sub> with metals, and provides instructions of synthesizing highly active and efficient catalyst. Co is the most active metal to hydrogenate CO<sub>2</sub> to CH<sub>4</sub>, while Fe is the most active to dissociate CO<sub>2</sub> to

CO gas. Pre-stored  $H_2$  in metal hydride alloy does not assist the  $CO_2$  hydrogenation. However, metal oxide mixed with metal facilitate the  $CO_2$  hydrogenation, due to the adsorption of  $CO_2$  at the metal oxide surface and the metal/metal oxide interface. As a result, the activity in the  $CO_2$  methanation follows the order of  $Co-CoO > Co > Ni > LaNi_4Cu$ . This enlightens the importance of metal oxide phase in the design of the efficient catalyst to achieve high activity in  $CO_2$  methanation.

Overall, the coupling of different analytic technique in a single experimental unit is therefore essential for the advancement of science in this complex field, enabling the contemporaneous understanding of different effects, which could not be revealed by means of the single individual tools.

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## Chapter 3 Identifying Reaction Species by Evolutionary Fitting and Kinetic Analysis: an Example of CO<sub>2</sub> Hydrogenation in DRIFTS

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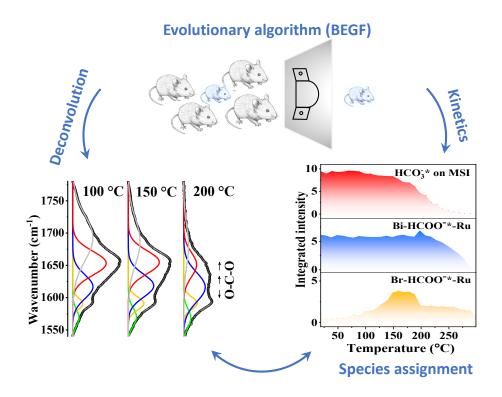
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**Edit:** caption numbers of figures, tables, and equations were edited to adapter the thesis chapter number.

**Summary:** This Chapter is methodological work foucing on analysis of the sophisticated diffuse reflectance infrared spectra. A fitting program has been developed to deconvolute the spectral sets and output the developing plots of each IR peak from the catalyzed CO<sub>2</sub> hydrogenation process on Ru/Al<sub>2</sub>O<sub>3</sub> surface.

## **Abstract**

Diffuse reflectance infrared Fourier transform spectroscopy (DRIFTS) investigations of molecules at the surface of catalysts exhibit strong overlap of the adsorption peaks. Therefore, the investigation of the CO<sub>2</sub> hydrogenation on a highly active catalyst surfaces requires a deconvolution of the adsorption spectra in order to clearly assign the signal to the chemical species. We developed an autonomous and efficient bilevel evolutionary Gaussian fitting (BEGF) procedure with a genetic algorithm at the upper level and a multi-peak Gaussian fitting algorithm at the lower level to analyze self-consistently the set of spectra of an entire experiment. We show two examples of the application of BEGF procedure by analyzing the DRIFTS spectral sets of ex-situ-HCOO<sup>-\*</sup> and CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub>. The fitting procedure deconvoluted the overlapped peaks, and identified the bond vibrations of carbon monoxide, formate, bicarbonate and carbonate through the developing trends of the peak intensities along the reaction. These revealed the progression of those species over the reaction timeline.



## 3.1 Introduction

Heterogeneous catalysis on surfaces, such as CO<sub>2</sub> hydrogenation catalysis, has been widely studied by diffuse reflectance infrared Fourier transformation spectroscopy (DRIFTS), as both the gas phase components and the surface adsorption species can be detected in situ and in operando. <sup>1-7</sup> The correct assignment of the infrared (IR) peaks is not easy, because they are strongly overlapped. Especially, the O–C–O asymmetric stretching modes of HCO<sub>3</sub><sup>-</sup>, HCOO<sup>-</sup>, COOH<sup>-</sup> and bent CO<sub>2</sub><sup>δ-</sup> share very close positions in the range of 1800–1300 cm<sup>-1</sup>. This has led to discrepant explanations of the production of the adsorption species, thence diverse reaction pathways about either bicarbonate, formate or carbon monoxide is the key intermediate. 7,9,10,11 Many issues affect the analysis of CO<sub>2</sub> hydrogenation using IR spectroscopy. First, the determination of the IR peak positions of the species present on reactive surfaces such as Ru, Rh, Pd, etc. is not simple due to the strong overlap of the peaks. As a result, the manual assignment of the peak positions among the multi-peaks and shoulders does not have an obvious unique solution. Second, some subpeaks in the overlapped region vanish or appear during the reaction, which is easily neglected in the analysis. Thus, assigning the peaks using data only at one or a few stages in the reaction can lose information. A global analysis of the spectra taken over the entire course of the reaction is necessary. This brings us to the third issue: there is no efficient procedure to fit self-consistently the peaks of all the spectra recorded during the reaction. Fitting spectra non-self-consistently, or using inconsistent parameters, can give an incorrect description of the development of the peaks along the reaction coordinate. A multi-peak Gaussian curve fitting can be performed with nonlinear gradient-based solvers, 12 but the results depend strongly on the guesses of initial values and bounds of the parameters related to each peak. Bad guesses lead the solvers be trapped at local optima, resulting in unsatisfactory or even wrong results. Moreover, most of the deconvolution methods treat one peak or one spectrum instead of treating the spectral set at once.

Here, we attack the three issues just raised by developing a novel bilevel evolutionary Gaussian fitting (BEGF) procedure to fit the peaks from a set of spectra and select the reasonably deconvoluted peaks automatically. This BEGF procedure combines gradient-free evolutionary algorithms at the upper-level and nonlinear multi-peak Gaussian fittings at the lower level to optimize the peaks. An evolutionary algorithm is an optimization algorithm that ranks the candidate solutions, recombines the parameters of the best ones to create a new generation of candidate solutions and iterates till convergence is reached.<sup>13</sup> The evolutionary algorithm overcomes the problem of Gaussian fitting being trapped at local optima. The fitting results elucidate the developing trends of the resolved peaks

along the reaction. According to the similarities of the peak developments in the reaction, and combined with the peak positions from the standard samples such as formic acid (HCOOH), sodium carbonate (Na<sub>2</sub>CO<sub>3</sub>), calcium carbonate (CaCO<sub>3</sub>), sodium bicarbonate (NaHCO<sub>3</sub>) and potassium bicarbonate (KHCO<sub>3</sub>), the peaks were clearly assigned to the bond vibrations of the specific species.

In the next section, we provide a description of the BEGF algorithm. More detailed information and the MATLAB code used for the work reported here are given in the SI. Later on, we describe the procedure with two examples: (1) formate hydrogenation where formate was from HCOOH droplet and therefore named as ex-situ-HCOO<sup>-\*</sup>\* to distinguish the formate formed from CO<sub>2</sub> hydrogenation process; (2) CO<sub>2</sub> hydrogenation. These two examples show how the procedure helps the assignment of the peaks and analyze the reactive progression of the reaction species.

## 3.2 Fitting and Experimental Methods

## 3.2.1 Bilevel evolutionary Gaussian fitting (BEGF) procedure

The multi-peak Gaussian fitting is a least-square problem (Eq. 3.1), which minimizes the sum of squared errors between the fitted value and the experimental data of the spectrum to find the best fit:

$$\min_{\boldsymbol{a},\boldsymbol{b},\boldsymbol{c}} f = \sum_{i=1}^{N_{S}} \left( \sum_{j=W_{S}}^{W_{e}} (Y_{i,j}(\boldsymbol{a}_{i},\boldsymbol{b},\boldsymbol{c}_{i}) - Y_{i,j}^{*})^{2} \right), \boldsymbol{a}_{i} = \{ \dots a_{i,k} \dots \}, \boldsymbol{b} = \{ \dots b_{k} \dots \}, \boldsymbol{c}_{i} = \{ \dots c_{i,k} \dots \}, \text{ Eq. 3.1}$$

with 
$$Y_{i,j} = \sum_{k=1}^{N_{peak}} a_{i,k} e^{-\left(\frac{x-b_k}{c_{i,k}}\right)^2}$$
, Eq. 3.2

where i stands for the  $i^{th}$  spectrum in the total  $N_s$  spectra, and j is the wavenumber within the defined range  $[W_s, W_e]$ , where  $W_s$  and  $W_e$  are the starting and ending wavenumber.  $Y_{i,j}$  and  $Y_{i,j}^*$  are the fitted and measured values, respectively. The variables  $a_{i,k}$ ,  $b_k$  and  $c_{i,k}$  are the height, position and width, respectively, of each Gaussian peak k ( $1 \le k \le N_{peak}$ ), respectively.  $a_i$  and  $c_i$  vary along the reaction, while b is generally assumed not to change as the reaction proceeds.

The optimization problem is highly-nonlinear due to the Gaussian function used in the definition of  $Y_{i,j}$  (Eq. 3.1 and 3.2). The whole problem can be solved by gradient-based solvers. However, in our experience with fitting DRIFTS spectra, gradient-based solvers get trapped at local minima depending on the guesses of the initial values of Gaussian parameters, and these guesses are usually obtained manually by time-consuming trial-and-error.

To overcome this difficulty, we decomposed the mathematical optimization problem into two levels: for the upper level we used a genetic algorithm to provide initial values for a multi-peak Gaussian fitting algorithm used on the lower level.

The schema of the BEGF process is shown in Figure 3.1, with the problem decomposition described as:

Upper level:

$$\min_{\boldsymbol{I},\boldsymbol{I},\boldsymbol{I},\boldsymbol{U}} \sum_{i=1}^{N_S} \delta_i(\boldsymbol{I},\boldsymbol{L},\boldsymbol{U}), \boldsymbol{I} = \{...\{I_{a_k},I_{b_k},I_{c_k}\}...\}, \boldsymbol{L} = \{...\{L_{a_k},L_{b_k},L_{c_k}\}...\}, \boldsymbol{U} = \{...\{U_{a_k},U_{b_k},U_{c_k}\}...\}.$$
Eq. 3.3

Lower level:

$$\min_{\boldsymbol{a},\boldsymbol{b},\boldsymbol{c}} \delta_{i}(\boldsymbol{a}_{i},\boldsymbol{b},\boldsymbol{c}_{i}) = \min_{\boldsymbol{a},\boldsymbol{b},\boldsymbol{c}} \sum_{j=W_{S}}^{W_{e}} \left(Y_{i,j} - Y_{i,j}^{*}\right)^{2} = \min_{\boldsymbol{a},\boldsymbol{b},\boldsymbol{c}} \sum_{j=W_{S}}^{W_{e}} \left(\sum_{k=1}^{N_{\text{peak}}} \left(a_{i,k} \ e^{-\left(\frac{x-b_{k}}{c_{i,k}}\right)^{2}}\right) - Y_{i,j}^{*}\right)^{2},$$

$$\boldsymbol{a}_{i} = \{\ldots a_{i,k} \ldots\}, \boldsymbol{b} = \{\ldots b_{k} \ldots\}, \boldsymbol{c}_{i} = \{\ldots c_{i,k} \ldots\}$$

$$\text{subject to } L_{a_{k}} \leq a_{i,k} \leq U_{a_{k}}, L_{b_{k}} \leq b_{k} \leq U_{b_{k}}, L_{c_{k}} \leq c_{i,k} \leq U_{c_{k}}$$

where I shows the initial values of the parameters (a height, b position and c width) of the Gaussian peaks. L and U are the lower and upper bounds of the parameters of the Gaussian peaks, which are used to constrain the multi-peak Gaussian fitting.

The BEGF algorithm works as follows and is sketched in Figure 3.1. The original spectra are first corrected by subtracting a baseline, which was taken as a straight line between the endpoints of the defined wavenumber range. The baseline-corrected spectra are used in each run of the low-level algorithm. The solving procedure starts from the upper-level algorithm by generating a number of global candidate solutions (individuals, represented by a set of values of I, L, and U (Eq. 3.3), which are randomly generated within the user-specified bounds) to form an initial population. Each individual of the population is passed to the lower-level algorithm to obtain the best fit values for the parameters  $a_i$ , b, and  $c_i$  and to assign the sum of the fitting errors as the value of the objective function (Eq. 3.4). The evaluated individual is then passed back to the upper-level algorithm. After evaluating all individuals in the initial population, the upper-level algorithm compares the individuals and discards those with large errors. Afterwards, the population starts to evolve iteratively by selecting some existing individuals as parents and generating a new individual as a child with certain crossover and mutation mechanisms. The newly generated child individual is further evaluated in the lower level, returned to the upper level with the objective value and compared with the parent

individuals. The child individual will be preserved if better than the parents; otherwise discarded. In such a way, the whole population is updated by always keeping the better individuals until convergence is reached: no better individual is found after a number of latest individual evaluations. The rate of convergence depends on the complexity of the spectra.

The BEGF algorithm starts with a user-specified number of Gaussian peaks. The redundant Gaussian peaks are removed when the  $L_{a_k}$  and  $U_{a_k}$  for peak k optimized at the upper level reach zero simultaneously.

Although good initial guesses are not needed for the genetic algorithm, using apparent information of the peaks in the spectra as initial values reduces the search time. Further details of the algorithm, including a MATLAB code implementation, are given in the SI.

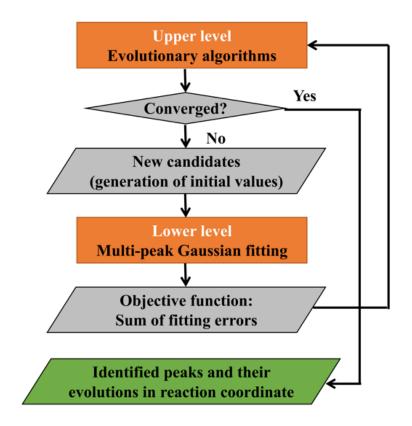


Figure 3.1. The developed bilevel evolutionary Gaussian fitting algorithm.

Our bilevel algorithm is distinguished from available fitting codes by the following features: (1) it consistently fits the peaks in a given range of wavelengths across the entire set of spectra measured during a reaction; (2) the number of Gaussian peaks used for fitting is determined automatically; (3)

the centroid of a given peak is identical for all spectra; (4) peak evolution directly gives the kinetics of the species; (5) manual intervention is not needed; (6) good initial guesses are not necessary.

## 3.2.2 Experimental methods

Ex-situ-HCOO<sup>-\*</sup> and CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub> (Sigma-Aldrich, 0.5 wt% loading on 3.2 mm pellets of Al<sub>2</sub>O<sub>3</sub>) pellets and Al<sub>2</sub>O<sub>3</sub> (Sigma-Aldrich) pellets were carried out in the reaction chamber (HVC, Harrick Scientific) of DRIFTS (Bruker Tensor 27).

Ex-situ-HCOO<sup>-\*</sup> was obtained by adding one drop of formic acid to the surface of Ru/Al<sub>2</sub>O<sub>3</sub> or Al<sub>2</sub>O<sub>3</sub> exposed to air, followed by pumping for 24 h to reach a vacuum of  $5 \times 10^{-3}$  mbar at room temperature (RT) in DRIFTS. The hydrogenation of HCOOH on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> was performed by heating in 1 bar H<sub>2</sub> from RT to 350 °C at a rate of 1 °C/min in DRIFTS.

 $CO_2$  hydrogenation was performed by mixing 200 mbar of  $CO_2$  and 800 mbar of  $H_2$  at RT, and heating to 300 °C at a rate of 1 °C/min on  $H_2$ -pretreated  $Ru/Al_2O_3$  and  $Al_2O_3$  in DRIFTS, as in our previous work.<sup>14</sup>

## 3.3 Results and Discussions

Ex-situ-HCOO<sup>-\*</sup> and CO<sub>2</sub> hydrogenations were used as reaction models for showing the complex spectra and how the BEGF program resolves the peak positions and variations. Formate is one of the intermediates of CO<sub>2</sub> hydrogenation. For this reason, we first analyzed the spectra of HCOOH hydrogenation to understand the reactivities of ex situ formate (ex-situ-HCOO<sup>-\*</sup>) in H<sub>2</sub> thermal reduction, and then turned to the analysis of CO<sub>2</sub> hydrogenation.

## 3.3.1 BEGF analysis of spectra of ex-situ-HCOO<sup>-\*</sup> hydrogenation

## 3.3.1.1 Convergence of fitting

The error evolution approaching convergence as a function of time and iteration numbers is illustrated in Figure 3.2 (a) for the fitting in the range of 1800–1500 cm<sup>-1</sup> from 20 to 220 °C, noting that above 220 °C the peaks and the baseline in this range changed significantly. Re-confining the range of the spectra above 220 °C for the new baseline correction is not necessary, but is helpful in shortening the entire fitting time. We compared the fitting with coarse initial values from wide bounds, and with fine initial values from reading of the spectra. Around 4 h were taken for the coarse initial

values to reach convergence, with around 4000 iterations, and around 1 h for the convergence of fine initial values, with around 3000 iterations. The average time of iteration in Figure 3.2 (b) decreased during evolution because the improved guesses (i.e., I, L, and U) in the iteration reduced the time for each run of lower-level Gaussian fitting. Especially, with fine bounds of I, L and U (blue line) the average time of iteration was shorter in the beginning due to the better solutions from the good bounds, which was beneficial in generating even better initial values for the next iteration. After enough iterations, the competitiveness of the preserved solutions for both blue and red lines became similar, as shown by the similarly converging average time after around 4000 iterations in the Figure 3.2 (b).

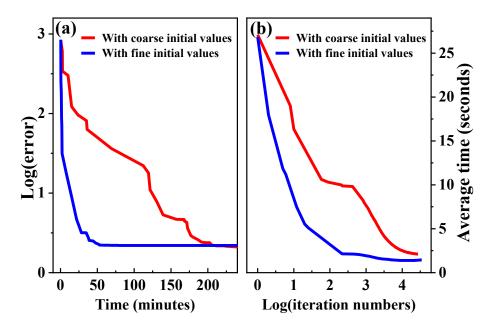


Figure 3.2. (a) The error evolution approaching convergence as a function of time and (b) the average time of iteration for the fitting in the range of  $1800-1500~\text{cm}^{-1}$  from 20-220~°C by BEGF.

## 3.3.1.2 Assignment of adsorption species based on the kinetic results

The fitted spectra at 100, 150, 200, and 250 °C are shown in Figure 3.3 (a). Although the peaks are discernible, the evolution of the peak intensities along the reaction is not easily understandable by a first sight of the spectra. We then used the BEGF program to produce the integrated intensities of each peak throughout the spectral set so that we obtained the evolution profile of each peak as a function of temperature. The intensity progression both facilitated the assignments of the peaks to specific species and revealed the reactivity of each species during the catalytic reaction.

Table 3. 1. Vibrational modes and infrared peak positions (cm<sup>-1</sup>) of formate, bicarbonate and carbonate from CO<sub>2</sub> hydrogenation.

Species	C–H as. str.	C–H b	C=O str.	O-C-O as. str.	O-C-O s. str.	О–Н b.
НСООН	2940 (cbn), 2871, 2760 (cbn)		1748, 1670	1618; 1560	1405?, 1360	1220
HCOO-*-MSI		1405	1720	1618	1405?	1220
Br-HCOO <sup>-*</sup> -Ru	2896	1390		1592	1375	1220
Bi-HCOO <sup>-</sup> *- Al <sub>2</sub> O <sub>3</sub>		1415	1710	1560	1360	1230
HCO <sub>3</sub> -*			1690	1650	1440	1230
CO <sub>3</sub> <sup>2-</sup> *				1500	1450	

as. str.: asymmetric stretching; s. str.: symmetric stretching; b.: bending; (cbn): combination modes; \*: adsorbed state.

As shown in Figure 3.3 (b) and (c), O–C–O asymmetric stretching (1560 and 1618 cm<sup>-1</sup>, the assignments refer to Section S3.1.1 in SI) decreased from 200 °C until full reduction at 250 °C. The unassigned peaks at 1415 cm<sup>-1</sup> and 1405 cm<sup>-1</sup> showed the same trend as O–C–O asymmetric stretching. By comparing that the relative intensity of peak 1415 cm<sup>-1</sup> to peak 1405 cm<sup>-1</sup> had a much stronger intensity on Al<sub>2</sub>O<sub>3</sub> than on Ru/Al<sub>2</sub>O<sub>3</sub> (Figure 3 (b)–(c) and Figure S3.2 (a)–(c)), peak 1415 cm<sup>-1</sup> was associated to the peak 1560 cm<sup>-1</sup>, and 1405 cm<sup>-1</sup> was associated to 1618 cm<sup>-1</sup>. Since 1560 cm<sup>-1</sup> had been paired with 1360 cm<sup>-1</sup> as O–C–O asymmetric and symmetric stretching on Al<sub>2</sub>O<sub>3</sub>, respectively (Section S3.1.2 in SI), 1415 cm<sup>-1</sup> could be assigned to C–H bending to complete the vibration modes of this species. Thence, the peak at 1405 cm<sup>-1</sup> could be either C–H bending or O–C–O symmetric stretching, associated with the peak at 1618 cm<sup>-1</sup>. The remaining three peaks at 1592, 1390 and 1375 cm<sup>-1</sup> varied in the same trend (Figure 3.3 (d)). In view that 1592 cm<sup>-1</sup> was in the region O–C–O

asymmetric stretching, and was absent on Al<sub>2</sub>O<sub>3</sub> under all experimental conditions (Figure S3.1 and S3.2), we assigned this peak to O–C–O asymmetric stretching of formate on Ru sites. The other two peaks at 1390 and 1375 cm<sup>-1</sup> were assigned as C–H bending and O–C–O symmetric stretching, respectively, of this structure of formate. These assignments are consistent with the reported values.<sup>1,7</sup> The combinational vibration of C–H bending and O–C–O asymmetric stretching at 2912 cm<sup>-1</sup>, which gradually red-shifted to 2896 cm<sup>-1</sup> during the reaction, also varied similarly as 1592 cm<sup>-1</sup> (Figure S3.3). Thus, the peak at 2896 cm<sup>-1</sup> could be classified as C–H stretching and a companion of the peak at 1592 cm<sup>-1</sup>.

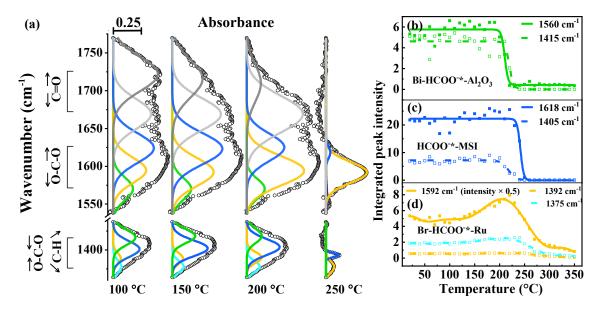


Figure 3.3 (a) The experimental spectra of ex-situ-HCOO<sup>-\*</sup> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub> (black circles) with fitted peaks (colored lines) in the ranges of 1770–1538 and 1440–1360 cm<sup>-1</sup>. The fitting result of the evolution of (b) Bi-HCOO<sup>-\*</sup>-Al<sub>2</sub>O<sub>3</sub>, (c) HCOO<sup>-\*</sup>-MSI, (d) Br-HCOO<sup>-\*</sup>-Ru during the reaction of ex-situ-HCOO<sup>-\*</sup> hydrogenation.

The splitting value between the asymmetric and symmetric stretching ( $\Delta v = v_{as} - v_s$ ) of O–C–O of HCOO<sup>\*\*</sup> also indicates the orientations of the adsorption. For free and bridged formate,  $\Delta v = 220$ –280 cm<sup>-1</sup>. When  $\Delta v$  is smaller than 220 cm<sup>-1</sup>, formate is a bidentate structure; when  $\Delta v$  is larger than 280 cm<sup>-1</sup>, formate is a monodentate structure. Therefore, formate, with the O–C–O asymmetric stretching and symmetric stretching at 1592 and 1375 cm<sup>-1</sup>, respectively, is in bridged orientation; formate with the O–C–O symmetric stretching at 1560 and 1360 cm<sup>-1</sup>, respectively, is in bidentate orientation. As has been explained above, formates with main peaks at 1592 and 1560 cm<sup>-1</sup> are on Ru and Al<sub>2</sub>O<sub>3</sub> sites, respectively; these two formates are abbreviated as Br-HCOO<sup>\*\*</sup>-Ru and Bi-HCOO<sup>\*\*</sup>-Al<sub>2</sub>O<sub>3</sub>, respectively. Formate with the main peak at 1618 cm<sup>-1</sup> is located at the metal-support interface (MSI) because of its enhanced intensity on Ru/Al<sub>2</sub>O<sub>3</sub> compared to that on Al<sub>2</sub>O<sub>3</sub>

(Section S3.1.1 in SI), and is thus named HCOO<sup>-\*</sup>-MSI. The related vibrational modes are listed in Table 3.1.

# 3.3.1.3 Reactivity of the adsorption species during ex-situ-HCOO<sup>-\*</sup> hydrogenation

The reactive trends of each species were exposed at the same time of fitting as shown in Figure 3.3 (b)–(d)). Ex-situ-HCOO<sup>-\*</sup> on Ru/Al<sub>2</sub>O<sub>3</sub> was reduced by H<sub>2</sub> at 200 °C until being fully consumed at 250 °C. Along with the decrease of ex-situ-HCOO<sup>-\*</sup>, three species emerged (Figure S3.3 and S3.4). Those were adsorbed carbon monoxide (CO\*) on Ru, gaseous CO<sub>2</sub>, and CH<sub>4</sub> gas with peaks in the ranges 2100–1900, 2450–2250, and 3100–2900 cm<sup>-1</sup>, respectively. Consequently, ex-situ-HCOO<sup>-\*</sup> on Ru/Al<sub>2</sub>O<sub>3</sub> was reduced by H<sub>2</sub> at 200 °C until being fully consumed at 250 °C. The products were adsorbed CO\*, gaseous CO<sub>2</sub> and gaseous CH<sub>4</sub>. CO\* came either from CO<sub>2</sub> reduction or from formate decomposition because CO\* increased at the same temperature as CO<sub>2</sub> formation and kept increasing until 230 °C, while both CO<sub>2</sub> and formate were reduced. CH<sub>4</sub> also came either from formate or from CO<sub>2</sub> hydrogenation because CH<sub>4</sub> increased from 220 to 250 °C, while both formate and CO<sub>2</sub> reduced between 200 and 250 °C. There was no evidence of conversion between CO\* and CH<sub>4</sub>, because the concentrations of both CO\* and CH<sub>4</sub> did not change above 270 °C.

In comparison, ex-situ-HCOO<sup>-\*</sup> hydrogenation on Al<sub>2</sub>O<sub>3</sub> produced noticeable gaseous CO above 200 °C which was represented by the occurrence of the rotational-vibrational peaks centered at 2142 cm<sup>-1</sup> (Figure S3.2 (e)), and invariant adsorbed CO<sub>2</sub>\* which was represented by O=C=O symmetric stretching and resonance at 1387 and 1288 cm<sup>-1</sup>, respectively (Figure S3.2 (f)).

# 3.3.2 BEGF analysis of spectra of CO<sub>2</sub> hydrogenation

# 3.3.2.1 Convergence of fitting

The information of the adsorption species during CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub> was mainly in the overlapped peaks below 2100 cm<sup>-1</sup>, including HCO<sub>3</sub><sup>-\*</sup>, CO<sub>3</sub><sup>2-\*</sup>, HCOO<sup>-\*</sup> and CO\*, as we presented in our previous work. He main contribution of this work is the methodology of decoupling the peaks and understanding their meaning via the BEGF program. The initial values of peak positions in BEGF were taken from the IR bands of the samples of carbonates and bicarbonates (Figure S3.5). Even though the initial values can also be used in regular multi-peak Gaussian fitting procedures, the pseudo-solutions from the local optima require the heavy manual work of repeatedly adjusting the initial values to reach consistent results, including the number of Gaussian peaks, peak positions and

the variations of the integrated intensity for the related experiments. With the BEGF program, the spectral set of CO<sub>2</sub> hydrogenation was resolved by global solution within one day (Figure S3.6), and the fitted results are consistent with the results of our previous publication, obtained by an inefficient Gaussian fitting.

## 3.3.2.2 Assignment of adsorption species based on the kinetic results

By comparing the trend of the integrated intensity of each peak along with the reaction coordinate (details in the following paragraphs), we found several groups of peaks in the wavenumber range of  $1800-1480~\rm cm^{-1}$  (Figure 3.4) – group I:  $1560~\rm and~1360~\rm cm^{-1}$ ; group II:  $1618~\rm and~1405~\rm cm^{-1}$ ; group III: 2895, 1592,  $1390~\rm and~1375~\rm cm^{-1}$ ; group IV: 1650,  $1440~\rm and~1230~\rm cm^{-1}$ ; and group V:  $1500~\rm and~1460~\rm cm^{-1}$ . Based on the assignment of formate from Section 3.3.1 (see also Table 3.1), groups I to III belonged to Br-HCOO<sup>-\*</sup>-Ru, HCOO<sup>-\*</sup>-MSI, and Bi-HCOO<sup>-\*</sup>-Al<sub>2</sub>O<sub>3</sub>, respectively. Referring to the measured peaks from the reference samples (Figure S3.5), groups IV and V belonged to adsorbed bicarbonate (HCO<sub>3</sub><sup>-\*</sup>) and adsorbed carbonate (CO<sub>3</sub><sup>2-\*</sup>), respectively. The splitting value of the O–C–O asymmetric (v<sub>as</sub>) and symmetric (v<sub>s</sub>) stretching bands of CO<sub>3</sub><sup>2-\*</sup> corresponds to different adsorption orientations. A splitting value ( $\Delta v = v_{as} - v_{s}$ ) less than  $100~\rm cm^{-1}$  relates to a monodentate structure,  $\Delta v$  larger than  $200~\rm cm^{-1}$  relates to a bidentate structure, and  $\Delta v$  larger than  $300~\rm cm^{-1}$  relates to a bridged structure. Since  $\Delta v$  was far less than  $100~\rm cm^{-1}$  in our case,  $CO_3^{2-*}$  must be adsorbed on the surface with a monodentate structure. Its precursor HCO<sub>3</sub><sup>-\*</sup>, which has a similar molecular structure, could also be monodentate.

In the wavenumber range of 2100–1800 cm<sup>-1</sup>, five adsorption structures of CO\* were deconvoluted with peaks at 2035, 2015, 1990, 1950 and 1905 cm<sup>-1</sup>. The high frequency at 2035 cm<sup>-1</sup> was assigned to linear-CO\* on Ru<sup>0</sup>; the peak at 2015 cm<sup>-1</sup> was assigned to linear-CO\* on isolated Ru<sup>0</sup> surrounded by partially oxidized Ru<sup>8+</sup>; the low frequencies at 1990, 1950 and 1905 cm<sup>-1</sup> corresponded to bridged-CO\*.<sup>7,12,17</sup>

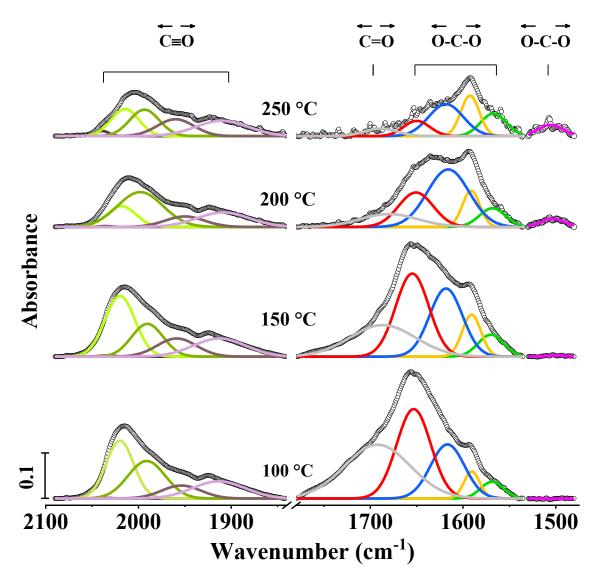


Figure 3.4. The spectra of  $CO_2$  hydrogenation on  $Ru/Al_2O_3$  (black circles) with fitted Gaussian peaks (colored lines) in the ranges 2100–1840, 1780–1535 and 1530–1480 cm<sup>-1</sup>. The vibrations in the range of 2100–1840 cm<sup>-1</sup> are  $C \equiv O$  asymmetric stretching, and in1780–1535 cm<sup>-1</sup> are O-C-O asymmetric stretching of Bi-HCOO<sup>-\*</sup>- $Al_2O_3$  (green peak), HCOO<sup>-\*</sup>-MSI (blue peak), Br-HCOO<sup>-\*</sup>-Ru (yellow peak), HCO3<sup>-\*</sup>(red peak), and  $CO_3^{2-*}$  (magenta).

## Isotope spectra

To assist the peak assignment, especially to separate the strongly overlapped frequencies of O-C-O symmetric stretching and C-H bending modes, we have done the isotopic experiments with  $^{13}\text{CO}_2$  at the same conditions as CO<sub>2</sub> hydrogenation. As shown in Figure 3.5 (a) and (b), there are certain shifts to the low frequency of the assigned peaks comparing to the rich carbon species, including C-H stretching of CH<sub>4</sub> shifted from 3016 to 3007 cm<sup>-1</sup>, C-H bending of CH<sub>4</sub> shifted from 1306 to 1297

cm<sup>-1</sup>, the center of O=C=O asymmetric stretching of CO<sub>2</sub> shifted from 2350 to 2283 cm<sup>-1</sup>. The rest of the peak positions of the adsorption species were listed in Table 3.2. <sup>13</sup>C spectra facilitated to confirm the strong peaks of asymmetric stretching modes. However, it did not help the separation of O-C-O symmetric stretching and C-H bending modes. This could be understood that <sup>13</sup>C shifted the O-C-O symmetric stretching and C-H bending modes simultaneously as they both contain carbon bond. Moreover, the signal/noise ratio did not improve as the intensity of infrared absorbance decreased due to the heavier mass.

Instead of using  $^{13}$ C, we considered that  $D_2$  could be more helpful to separate O-C-O and C-H vibrations. Because C-H would be changed to C-D, so that the vibrational frequency could be moved away from O-C-O vibrational frequency in the infrared spectra. Therefore, we did  $CO_2$  deuteration by mixing 200 mbar  $CO_2$  and 800 mbar pure  $D_2$  using the same conditions and procedures. Unfortunately, the peak intensities were weakened more significantly in the low frequency region (<1500 cm<sup>-1</sup>) (Figure 3.5 (c) and (d)). Except the obvious peaks from  $CD_xH_{4-x}$  (x=2,3,4),  $^{16}$  only slight shifts of the strong peaks of the adsorption species were observed (Table 3.3).

Moreover, the reaction kinetics of these two isotopic experiments did not fully match the CO<sub>2</sub> hydrogenation results. For instance, the onset and ending temperatures of methane production are higher and lower, respectively, compared to those in CO<sub>2</sub> hydrogenation experiment; the peak intensities were plausibly monotonically increasing/decreasing, nevertheless in fact occurring complicated shifts at high temperature (> 150 °C). The similar phenomena showed in the spectra of <sup>13</sup>CO<sub>2</sub> hydrogenation in DRIFTS in reference 1. An investigation of the isotopic effect and comprehensive analysis of the kinetics from these isotopic data await future work to qualify the conclusions.

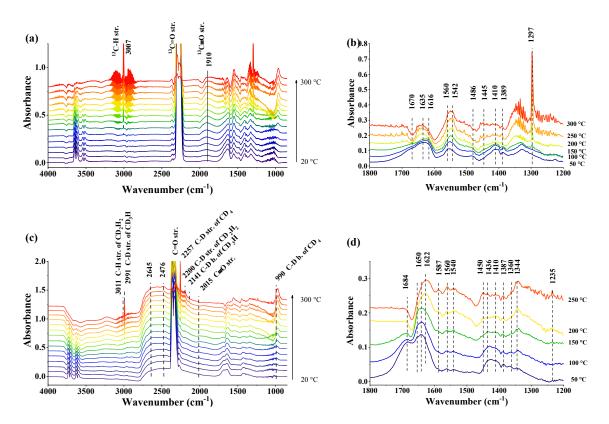


Figure 3.5. The full infrared spectra of (a)  $^{13}\text{CO}_2$  hydrogenation by mixing 200 mbar  $^{13}\text{CO}_2$  and 800 mbar  $\text{H}_2$ , after which heated from 20 to 300 °C by 1 °C/min, (c)  $^{12}\text{CO}_2$  deuteriation in pure  $D_2$  by mixing 200 mbar  $^{12}\text{CO}_2$  and 800 mbar  $D_2$ , after which heated from 20 to 300 °C by 1 °C/min. The extracted spectra in the wavenumber range between 1800 to 1200 cm<sup>-1</sup> from (b)  $^{13}\text{CO}_2$  hydrogenation and (d)  $^{12}\text{CO}_2$  deuteration.

Table 3.2. Vibrational modes and infrared peak positions (cm<sup>-1</sup>) of <sup>13</sup>C-formate, -bicarbonate and -carbonate from <sup>13</sup>CO<sub>2</sub> hydrogenation.

Species	<sup>13</sup> C=O str.	O- <sup>13</sup> C-O as. str.	O- <sup>13</sup> C-O s. str.	O–H b.
H <sup>13</sup> COO <sup>-*</sup> -MSI	1700	1616		1220
Br-H <sup>13</sup> COO <sup>-*</sup> -Ru		1575		
Bi-H <sup>13</sup> COO <sup>-*</sup> -Al <sub>2</sub> O <sub>3</sub>				
H <sup>13</sup> CO <sub>3</sub> -*	1670	1635		1230

Table 3.3. Vibrational modes and infrared peak positions (cm $^{-1}$ ) of D-formate, -bicarbonate and -carbonate from CO<sub>2</sub> hydrogenation in pure D<sub>2</sub>.

Species	C=O str.	O-C-O as. str.	O-C-O s. str.	O–D b.
DCOO-*-MSI	1705	1622	1410	
Br-DCOO <sup>-</sup> *-Ru		1587		
Bi-DCOO <sup>-*</sup> -Al <sub>2</sub> O <sub>3</sub>		1560		
DCO <sub>3</sub> ·*	1684	1659	1436	1230
CO <sub>3</sub> <sup>2</sup> -*		1500	1450	

Note: not labeled carbon is regular <sup>12</sup>C.

## 3.3.2.3 Reactivities of adsorption species during CO<sub>2</sub> hydrogenation

#### In-situ-HCOO-\*

To distinguish the formate from the ex-situ-HCOO<sup>\*</sup> in Section 3.3.1, we named the formate formed from CO<sub>2</sub> hydrogenation process as in-situ-HCOO<sup>\*</sup>. Bi-HCOO<sup>\*</sup>-Al<sub>2</sub>O<sub>3</sub> increased very slightly during the whole reaction (Figure 3.6 (a)), indicating an inactive property. HCOO<sup>\*</sup>-MSI was abundant and stable up to 220 °C, after which it was consumed until its disappearance at 300 °C (Figure 3.6 (b)), consistent with the result of the conversion equilibrium between HCOO<sup>\*</sup>-MSI and CO<sub>2</sub><sup>\*</sup> (Section S3.2.1 in SI). Conversely, Br-HCOO<sup>\*</sup>-Ru increased from 70 to 150 °C, followed by a slow decrease (Figure 3.6 (c)), implying multiple kinetic steps.

These in-situ-HCOO<sup>-\*</sup> species exhibited different reactivities from ex-situ-HCOO<sup>-\*</sup> species in the hydrogenation reaction. For in-situ-HCOO<sup>-\*</sup>, Bi-HCOO<sup>-\*</sup>-Al<sub>2</sub>O<sub>3</sub> was inert; HCOO<sup>-\*</sup>-MSI was the most reactive towards reduction; and Br-HCOO<sup>-\*</sup>-Ru formed during the reaction until 150 °C and was then consumed. For ex-situ-HCOO<sup>-\*</sup>, Bi-HCOO<sup>-\*</sup>-Al<sub>2</sub>O<sub>3</sub> and HCOO<sup>-\*</sup>-MSI were the most reactive towards reduction; Br-HCOO<sup>-\*</sup>-Ru increased between 100 and 220 °C, followed by a decrease.

Therefore, the ex-situ-HCOO<sup>-\*</sup> assists in the peak assignments for in-situ-HCOO<sup>-\*</sup> but not in the prediction of the reactivities of the species.

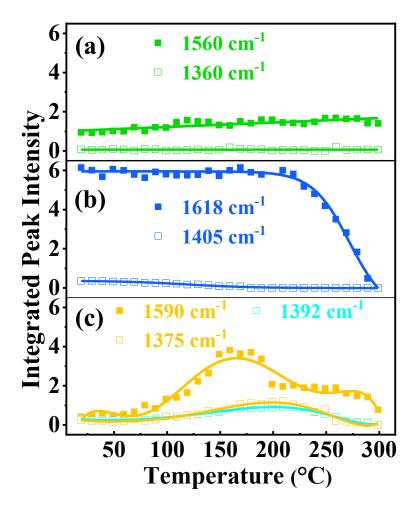


Figure 3.6. The fitting result of the evolution of (a) Bi-HCOO<sup>-\*</sup>-Al<sub>2</sub>O<sub>3</sub>, (b) HCOO<sup>-\*</sup>-MSI, (c) Br-HCOO<sup>-\*</sup>-Ru during the CO<sub>2</sub> hydrogenation.

# HCO<sub>3</sub><sup>-\*</sup> and CO<sub>3</sub><sup>2-\*</sup>

HCO<sub>3</sub><sup>-\*</sup> on Ru/Al<sub>2</sub>O<sub>3</sub> decreased slowly below 130 °C, then accelerated until complete consumption at 300 °C (Figure 3.7 (a)). In comparison, HCO<sub>3</sub><sup>-\*</sup> on Al<sub>2</sub>O<sub>3</sub> was reduced at 100 °C and fully converted at 160 °C (Figure S7 (a) and (b)). This illustrated that HCO<sub>3</sub><sup>-\*</sup> was formed continuously on Ru/Al<sub>2</sub>O<sub>3</sub> from CO<sub>2</sub> until the CO<sub>2</sub> concentration dropped, but could not be continuously formed on Al<sub>2</sub>O<sub>3</sub>. In addition, the peak intensity of HCO<sub>3</sub><sup>-\*</sup> was much stronger on Ru/Al<sub>2</sub>O<sub>3</sub> than on Al<sub>2</sub>O<sub>3</sub>. These implied that HCO<sub>3</sub><sup>-\*</sup> on Ru/Al<sub>2</sub>O<sub>3</sub> was formed at the MSI. HCO<sub>3</sub><sup>-\*</sup> reduction showed a relation with CO<sub>3</sub><sup>2-\*</sup> formation above 200 °C (Figure 3.7 (b)), indicating a deprotonation process.

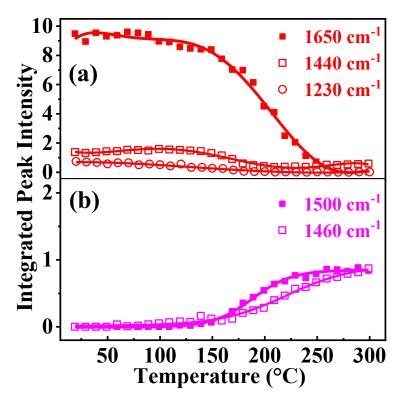


Figure 3.7. The fitting result of the evolution of (a) HCO<sub>3</sub><sup>-\*</sup>and (b) CO<sub>3</sub><sup>2-\*</sup> during CO<sub>2</sub> hydrogenation.

# CO\*

Five CO\* on Ru/Al<sub>2</sub>O<sub>3</sub> showed distinct reactivities. The linear-CO\* on Ru<sup>0</sup> was of negligible intensity and invariable, while the linear-CO\* on isolated Ru<sup>0</sup> showed an accumulation till 150 °C and a consumption afterwards (Figure 3.8 (a)). The bridged-CO\* exhibited an increase until 100 °C, followed by a decrease up to the reach of an equilibrium level at 200 °C (Figure 3.8 (b)). These plots suggested that linear-CO\* on Ru<sup>0</sup> was inactive in CO<sub>2</sub> hydrogenation reaction. The other four forms of CO\* participate in the reaction, yet carrying distinct reactivities. It has been reported that the different peak position of CO\* is the result of changed coverage of CO\*.<sup>9,17</sup> The peak red-shifted when CO\* coverage increased. This happened by supplying low-pressure CO gas to single crystalline metal surfaces at a certain low temperature.<sup>18</sup> However, in our reaction conditions, the broad CO\* peak showed the evolution of subpeaks related to the kinetics of each adsorption structure of CO\* during the reaction. Among those structures of CO\*, linear-CO\* on isolated Ru<sup>0</sup>, surrounded by partially oxidized Ru<sup>8+</sup>, showed a longer accumulation and a faster reduction, indicating a higher reactivity than the other structures of CO\*.

On the other hand, CO\* on Al<sub>2</sub>O<sub>3</sub> generated one broad and weak peak between 2200 and 2100 cm<sup>-1</sup>. This peak disappeared after pumping to a vacuum (Figure S3.10), in accordance with results reported for adsorbed CO\* on metal oxides from CO gas.<sup>19</sup> The weak adsorption and high frequency (> 2100 cm<sup>-1</sup>) of CO\* on Al<sub>2</sub>O<sub>3</sub> confirmed that the strong adsorption and low frequency (< 2100 cm<sup>-1</sup>) of CO\* on Ru/Al<sub>2</sub>O<sub>3</sub> were adsorbed on Ru sites.

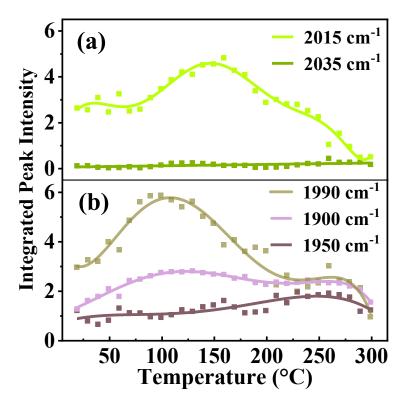


Figure 3.8. The fitting result of the evolution of (a) linear-CO\* and (b) bridged-CO\* during the reaction.

# 3.4 Conclusions

We resolved comprehensively the strongly overlapped and controversial IR peaks of CO<sub>2</sub> hydrogenation reaction in DRIFTS by a bilevel evolutionary Gaussian fitting procedure. This procedure allowed the robust and automatic identification of the peaks and their evolution along the reaction coordinate with no need for manual intervention. This method helped to attribute the peaks to the right species, and gave the kinetic curves of those species directly. The isotopes <sup>13</sup>C and D were used to assist the assignment of the infrared peaks. From the analysis of ex-situ-HCOO<sup>-\*</sup> and CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub> and on Al<sub>2</sub>O<sub>3</sub> surfaces, those kinetic curves of the resolved species revealed straightforwardly their reactivities during the reactions. In-situ-HCOO<sup>-\*</sup> formed from CO<sub>2</sub> hydrogenation was assigned thanks to the peak analysis of ex-situ-HCOO<sup>-\*</sup>, even though the reactivities

of each adsorption structure being distinct from those of ex-situ-HCOO<sup>-\*</sup>. During CO<sub>2</sub> hydrogenation, in-situ-HCOO<sup>-\*</sup> adsorbed on the metal–support interface exhibited a high reactivity, similar to CO<sub>2</sub> conversion; in-situ-HCOO<sup>-\*</sup> adsorbed on Ru showed less reactivity, and in-situ-HCOO<sup>-\*</sup> adsorbed on Al<sub>2</sub>O<sub>3</sub> was inactive. Bicarbonate also showed high reactivity, similar to CO<sub>2</sub> conversion. CO\* showed distinctive properties during CO<sub>2</sub> hydrogenation, in that it was formed until the middle of the reaction and reduced afterwards. These results from BEGF analysis are identical to our previous work by manual iteration of Gaussian fitting. This BEGF method is not only suitable for IR spectra, but is universal for the deconvolution of overlapping spectra.

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# Notes

The authors declare no competing financial interests.

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#### ASSOCIATED CONTENT

The Supporting Information contains:

- All the figures mentioned in the main text, including HCOOH adsorption and hydrogenation on Al<sub>2</sub>O<sub>3</sub>, FT-IR transmittance of Na<sub>2</sub>CO<sub>3</sub>, CaCO<sub>3</sub>, KHCO<sub>3</sub> and NaHCO<sub>3</sub>, CO<sub>2</sub> adsorption and hydrogenation on Al<sub>2</sub>O<sub>3</sub>.
- The BEGF program.

This material is available free of charge via the Internet at <a href="http://pubs.acs.org">http://pubs.acs.org</a>.

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# **Supporting Information**

# Identifying Reaction Species by Evolutionary Fitting and Kinetic Analysis: an Example of CO<sub>2</sub> Hydrogenation in DRIFTS

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## S3.1 HCOOH on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> surfaces

## S3.1.1 HCOOH adsorption on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> surfaces

HCOOH on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> surfaces at room temperature (RT) shows the strongest absorbance at 1748 cm<sup>-1</sup>, assigned to C=O asymmetric stretching (Figure S3.1). The relatively weak peak observed at 1670 cm<sup>-1</sup> is assigned to C=O symmetric stretching.<sup>1-23</sup> The peaks between 1670 and 1450 cm<sup>-1</sup> are not obvious. The peaks at 1420–1380 cm<sup>-1</sup> are a mixture of O–C–O symmetric stretching and C–H bending, needing to be identified by the variation trend of integrated intensity in the main text in Section 3.3.1.2. The peaks at 1360 and 1220 cm<sup>-1</sup> are assigned to O–C–O symmetric stretching and O–H bending of adsorbed formate (HCOO<sup>-\*</sup>), respectively.<sup>4,5</sup> The peak at 2940 cm<sup>-1</sup> is a combination of O–C–O asymmetric stretching and C–H bending, and the peak at 2870 cm<sup>-1</sup> is C–H asymmetric stretching.<sup>5,6</sup>

After evacuating the superfluous HCOOH, we called the adsorbed formate ex-situ-HCOO<sup>-\*</sup>, to distinguish it from the in-situ-HCOO<sup>-\*</sup> produced during CO<sub>2</sub> hydrogenation described in the main text, Section 3.3.2. The peak of C=O asymmetric stretching red-shifted from 1748 cm<sup>-1</sup> to 1720 and 1710 cm<sup>-1</sup> on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> surfaces, respectively. The combinational vibration of O–C–O

<sup>&</sup>lt;sup>1</sup> Chang, Y. T.; Yamaguchi, Y.; Miller, W. H.; Schaefer, H. F. An Analysis of the Infrared and Raman Spectra of the Formic Acid Dimer (HCOOH)2. *J. Am. Chem. Soc.* **1987**, *109*, 7245–7253.

<sup>&</sup>lt;sup>2</sup> Pettersson, M.; Lundell, J.; Khriachtchev, L.; Räsänen M. IR Spectrum of the Other Rotamer of Formic Acid, cis-HCOOH. *J. Am. Chem. Soc.* **1997**, *119*, 11715–11716.

<sup>&</sup>lt;sup>3</sup> Reva, I. D.; Plokhotnichenko, A. M.; Radchenko, E. D.; Sheina, G. G.; Blagoi, Y. P. The IR Spectrum of Formic Acid in an Argon Matrix. *Spectrochimi. Acta Part A: Mol. Spectrosc.* **1994**, *50*, 1107–1111.

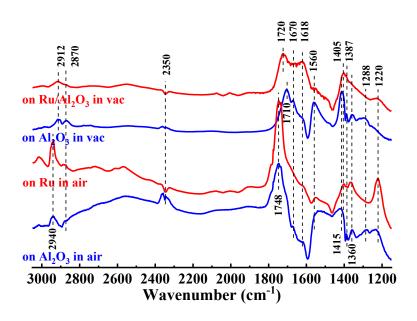
<sup>&</sup>lt;sup>4</sup> Taifan, W.; Boily, J.-F.; Baltrusaitis, J. Surface Chemistry of Carbon Dioxide Revisited. *Surf. Sci. Rep.* **2016**, *71*, 595–671.

<sup>&</sup>lt;sup>5</sup> Busca, G.; Lamotte, J.; Lavalley, J. C.; Lorenzelli, V. FT-IR Study of the Adsorption and Transformation of Formaldehyde on Oxide Surfaces. *J. Am. Chem. Soc.* **1987**, *109*, 5197-5202.

<sup>&</sup>lt;sup>6</sup> Roiaz, M.; Monachino, E.; Dri, C.; Greiner, M.; Knop-Gericke, A.; Schlögl, R.; Comelli, G.; Vesselli, E. Reverse Water–Gas Shift or Sabatier Methanation on Ni(110)? Stable Surface Species at Near-Ambient Pressure. *J. Am. Chem. Soc.* **2016**, *138*, 4146–4154.

asymmetric stretching and C–H bending also red-shifted from 2940 to 2912 cm<sup>-1</sup> on both surfaces. The O–H bending peak weakened on both surfaces.

One of the most interesting observations following evacuation is the protrusion of peaks at 1618 and 1560 cm<sup>-1</sup>, assigned to O–C–O asymmetric stretching of formate. <sup>5-7</sup> The ratio of peak intensity of the 1618 and 1560 cm<sup>-1</sup> peaks on Ru/Al<sub>2</sub>O<sub>3</sub> was apparently much larger than that on Al<sub>2</sub>O<sub>3</sub>. Therefore, the peak at 1560 cm<sup>-1</sup> is ascribed to formate on the support Al<sub>2</sub>O<sub>3</sub>, and the peak at 1618 cm<sup>-1</sup> is ascribed to formate on Ru or the metal-support interface (MSI) of Ru/Al<sub>2</sub>O<sub>3</sub>. Another distinctive difference between the HCOOH adsorption on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> surfaces is the feature of CO<sub>2</sub>: on Al<sub>2</sub>O<sub>3</sub>, the peak centered at 2350 cm<sup>-1</sup> is typically CO<sub>2</sub> asymmetric stretching, accompanied by the weak symmetric stretching and fermi resonance at 1387 and 1288 cm<sup>-1</sup>, respectively; whereas on Ru/Al<sub>2</sub>O<sub>3</sub>, CO<sub>2</sub> peaks are absent. This indicates that some formate on Al<sub>2</sub>O<sub>3</sub> decomposed to CO<sub>2</sub> at RT. Combined with the phenomenon of weakened intensity of O–C–O asymmetric stretching at 1618 cm<sup>-1</sup> from Ru/Al<sub>2</sub>O<sub>3</sub> to Al<sub>2</sub>O<sub>3</sub>, we conjecture that this O–C–O asymmetric stretching is in equilibrium between formate and CO<sub>2</sub> at MSI ( $HCOO^{-*} \rightleftharpoons CO_2^{-*} + H^* \rightleftharpoons CO_2 + H^*$ ). When attached to Al<sub>2</sub>O<sub>3</sub> sites, this formate decomposes to CO<sub>2</sub>; when attached to Ru sites, it retains its integrity.



<sup>7</sup> Marwood, M.; Doepper, R.; Renken, A. In-Situ Surface and Gas Phase Analysis for Kinetic Studies under Transient Conditions the Catalytic Hydrogenation of CO2. *Appl. Catal. A Gen.* **1997**, *151*, 223-246.

Figure S3.1. Infrared spectra of HCOOH adsorption on  $Ru/Al_2O_3$  (red lines) and on  $Al_2O_3$  (blue lines) in air and in vacuum by pumping to low vacuum of  $5 \times 10^{-3}$  mbar.

# S3.1.2 Evolution of adsorption state during ex-situ-HCOO-\* hydrogenation on Al<sub>2</sub>O<sub>3</sub>

On Al<sub>2</sub>O<sub>3</sub>, the peak intensities of Br-HCOO<sup>\*\*</sup>-Al<sub>2</sub>O<sub>3</sub>, with the main peak at 1560 cm<sup>-1</sup>, decreased slowly with temperature (Figure S3.2 (b)). The peak intensities of Br-HCOO<sup>\*\*</sup>-Al<sub>2</sub>O<sub>3</sub>, with the main peak at 1618 cm<sup>-1</sup>, are weak, and do not vary obviously (Figure S3.2 (c)). The C=O asymmetric stretching at 1710 cm<sup>-1</sup> decreased the most obviously (Figure S3.2 (d)). The intensity of C–H stretching at 2870 cm<sup>-1</sup> increased below 250 °C followed by a decrease; the combinational vibration at 2912 cm<sup>-1</sup> red-shifted to 2895 cm<sup>-1</sup>, with the intensity varying the same as the C–H stretching mode; the combination of O–C–O symmetric stretching and C–H bending showed up at 2760 cm<sup>-1</sup>, also with the same intensity trend as the C–H stretching (Figure S3.2 (d)).

Gaseous CO formed at 200 °C (Figure S3.2 (e)), represented by the occurrence of the rotational-vibrational peaks centered at 2142 cm<sup>-1</sup>. Adsorbed CO<sub>2</sub> maintained equilibrium in the whole process (Figure S3.2 (f)), represented by the unchanged peak intensity of O=C=O symmetric stretching and resonance at 1387 and 1288 cm<sup>-1</sup>. The bond vibration of the CO<sub>2</sub> produced could be the reason for the increase in intensity of the combinational vibrations.

Therefore, HCOO<sup>\*</sup> hydrogenation on Al<sub>2</sub>O<sub>3</sub> produced only gaseous CO. No CH<sub>4</sub> was observed.

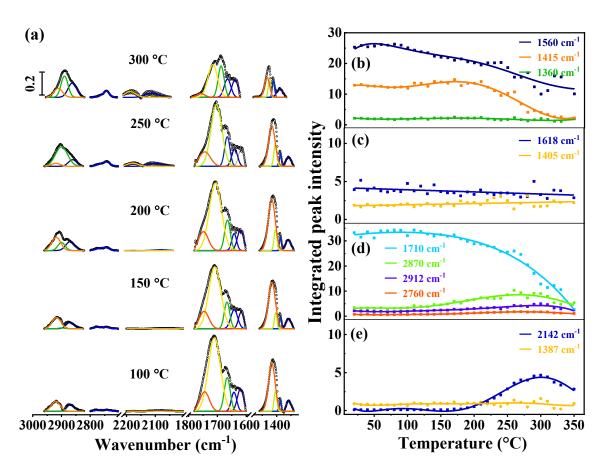


Figure S3.2. The fitting result of ex-situ-HCOO\*\* hydrogenation on  $Al_2O_3$ . (a) The fitted spectra at separated ranges from 100 to 300 °C. The evolution of (b) Bi-HCOO\*\*- $Al_2O_3$  (c) HCOO\*\*-MSI at  $Al_2O_3$  sites, (d) C=O asymmetric stretching and C-H stretching and C-H combination, (e) gaseous CO at 2142 cm<sup>-1</sup> and adsorbed  $CO_2$ \* at 1387 cm<sup>-1</sup> during the reaction.

# S3.1.3 Evolution of adsorption state during ex-situ-HCOO<sup>-\*</sup> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub>

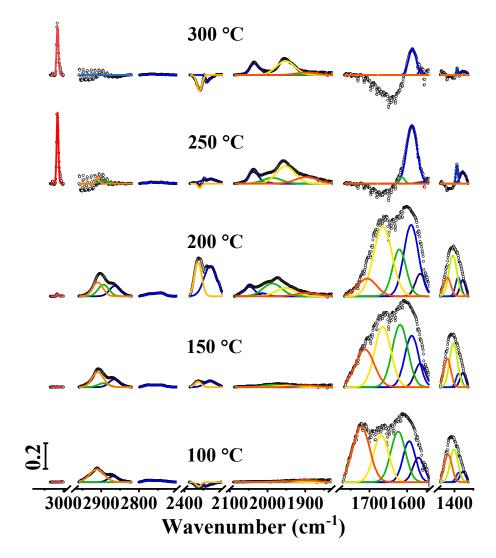


Figure S3.3. The experimental spectra of ex-situ-HCOO<sup>-\*</sup> hydrogenation on  $Ru/Al_2O_3$  (black circles) with fitted peaks (colored lines) in the ranges 3035–3000, 2960–2820, 2800–2700, 2390–2300, 2090–1830, 1770–1538, and 1440–1360 cm<sup>-1</sup>

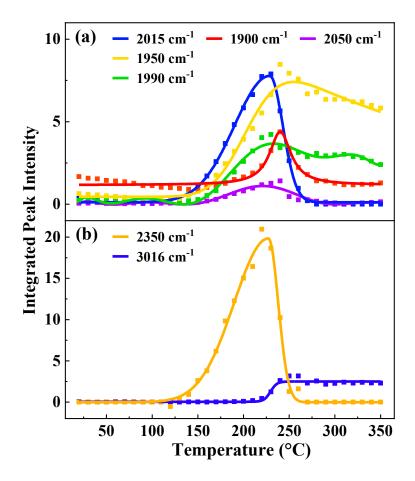


Figure S3.4. The evolution of the generations during the reaction of ex-situ-HCOO<sup>-\*</sup> hydrogenation on  $Ru/Al_2O_3$ . (a) linear-CO\* at 2015 and 2050 cm<sup>-1</sup>, bridged-CO\* at 1990, 1950 and 1900 cm<sup>-1</sup>, and (b) gaseous  $CO_2$  centered at 2350 cm<sup>-1</sup> and gaseous  $CH_4$  centered at 3016 cm<sup>-1</sup>.

# S3.2. Other supplementary figures

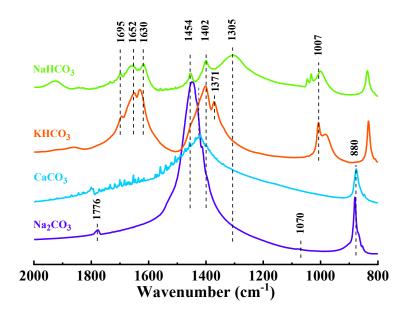


Figure S3.5. FT-IR transmittance of Na<sub>2</sub>CO<sub>3</sub>, CaCO<sub>3</sub>, KHCO<sub>3</sub> and NaHCO<sub>3</sub>.

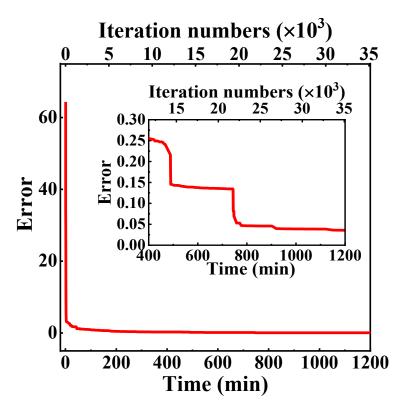


Figure S3.6. The error evolution approaching convergence as a function of time for fitting the spectra set of  $CO_2$  hydrogenation on  $Ru/Al_2O_3$  in the range of 1780–1535 cm<sup>-1</sup> from 20–300 °C by BEGF.

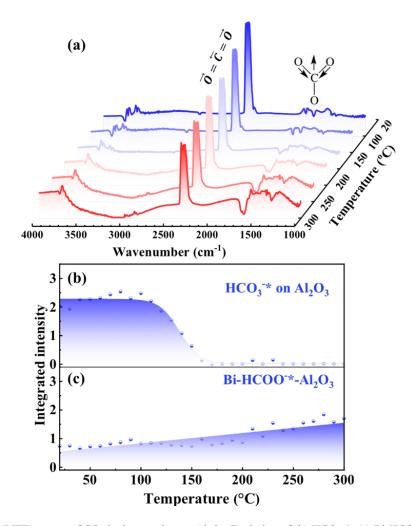


Figure S3.7. (a) DRIFT spectra of  $CO_2$  hydrogenation on  $Al_2O_3$ . Evolution of (b)  $HCO_3^{-*}$ , (c) Bi- $HCOO^{-*}$ - $Al_2O_3$  during the reaction.

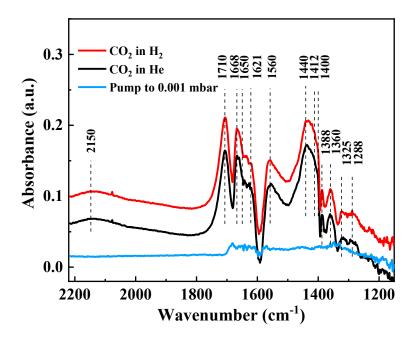


Figure S3.8. The infrared spectra of CO<sub>2</sub> adsorption (200 mbar CO<sub>2</sub> and 800 mbar He) and its co-adsorption with H<sub>2</sub> (200 mbar CO<sub>2</sub> and 800 mbar H<sub>2</sub>) on Al<sub>2</sub>O<sub>3</sub> at RT under 1 bar.

#### S3.3 Global optimization by evolutionary algorithms<sup>8</sup>

Evolutionary algorithms, inspired by biological evolution, are generic, stochastic, derivative-free, population-based, direct search techniques. They often perform better than derivative-based deterministic algorithms for solving complex non-linear optimization problems, even with multi-modal, noncontinuous objective functions, incoherent solution space and discrete decision variables; moreover, global optimality, although not guaranteed, can be closely approached within a limited number of function evaluations. Genetic algorithms are one type of evolutionary algorithm.

As given in Figure S3.9, the basic run of an evolution algorithm starts from an initialization, in which a set (population) of candidate solutions (individuals) with randomly generated decision variables are proposed and evaluated for assigning the finesses (the objective function value, if feasible; otherwise, a penalty value). Afterwards, for evolving the current parent population to an offspring population, the algorithm starts an iteration loop of parent selection, recombination (crossover), mutation, evaluation and offspring selection. To produce each new individual, based on the fitness values, one

<sup>&</sup>lt;sup>8</sup> Doctoral thesis: Ligang Wang, et al. Thermo-economic Evaluation, Optimization and Synthesis of Large-scale Coal-fired Power Plants, Doctoral thesis, Technical University of Berlin, 2016, https://depositonce.tu-berlin.de/handle/11303/5852.

or more parents are selected to have crossover and mutation. A crossover operation takes place randomly and reassembles parts of the selected parents, whereas a mutation operation performs a small random perturbation of one individual. The newly-born offspring are then evaluated; finally, a ranking of offspring (and parent) individuals is performed, so that those individuals with larger possibility of leading to the optimality survive and are selected as the offspring population. The iteration continues until a termination criterion, e.g., a limit of computation time or total fitness-evaluation number, is reached.

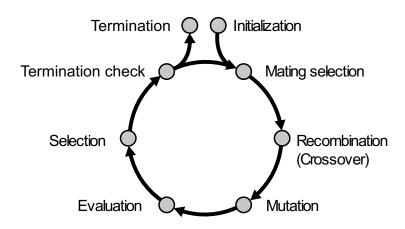


Figure S3.9. Flowchart of an evolutionary algorithm<sup>1</sup>

Selection, crossover and mutation are three genetic operators of evolutionary algorithms for maintaining local intensification and diversification of the search. Different strategies on these three aspects lead to a variety of evolutionary algorithms. Selection strategy exerts influence mainly on population diversity. One commonly used strategy of selection is the  $(\mu + \lambda)$ -selection proposed in evolution strategies, where  $\mu$  and  $\lambda$ , satisfying  $1 \le \mu \le \lambda$ , denote the sizes of parent and offspring populations, respectively. Selection ranks the fitness of all  $\mu + \lambda$  individuals and takes the  $\mu$  best individuals.

Depending on the search space and objective function, the crossover and/or the mutation may or may not occur in specific instantiations of the algorithm. Crossover intensifies the local search but is not essential, as self-adaption of individuals is available due to mutation, which, in contrast, is usually dispensable to avoid premature convergence toward sub-optimal solutions. There are different mechanisms of crossover and mutation. For example, a genetic algorithm usually employs bit strings to represent variables.

# Chapter 4 In Situ Control of the Adsorption Species in CO<sub>2</sub> Hydrogenation: Determination of Intermediates and Byproducts

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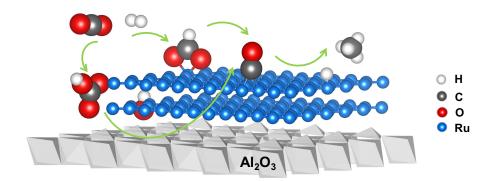
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**Edit:** caption numbers of figures, tables, and equations were edited to adapter the thesis chapter number.

**Summary:** this Chapter is continuous work after the previous methodological work on resolving the IR spectra. The surface reaction steps of CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub> were identified through in situ control of the development of each adsorbed species.

#### Abstract

CO<sub>2</sub> hydrogenation over catalysts is a potentially exciting method to produce fuels while closing the CO<sub>2</sub> cycle and mitigating global warming. The mechanism of this process has been controversial due to the difficulty in clearly identifying the species present and distinguishing which are reaction intermediates and which are byproducts. We in situ manipulated the independent formation and hydrogenation of each adsorption species produced in CO<sub>2</sub> hydrogenation reaction over Ru/Al<sub>2</sub>O<sub>3</sub> using operando diffuse reflectance infrared Fourier transformation spectroscopy (DRIFTS) and executed a novel iterative Gaussian fitting procedure. The adsorption species and their role in CO<sub>2</sub> hydrogenation reaction have been clearly identified. The adsorbed carbon monoxide (CO\*) of four reactive structures was the key intermediate of methane (CH<sub>4</sub>) production. Bicarbonate (HCO<sub>3</sub><sup>\*\*</sup>), formed on the metal-support interface, appeared to be not only the primary product of CO<sub>2</sub> chemisorption, but also a reservoir of CO\*, and consisted the dominate reaction steps of CO<sub>2</sub> methanation from the interface to the metal surface. Bidentate formate (Bi-HCOO\*\*) formed on Ru under a certain condition, consecutively converting to CO\* to merge into the subsequent methanation process. Nonreactive byproducts of the reaction were also identified. The evolution of the surface species revealed the essential steps of the CO<sub>2</sub> activation and hydrogenation reactions which inevitably initiated from HCO<sub>3</sub><sup>-\*</sup> to CO\* and finally from CO\* to CH<sub>4</sub>.



# 4.1 Introduction

CO<sub>2</sub> reduction by H<sub>2</sub> is a promising way to store hydrogen energy in hydrocarbons, producing synthetic fuels that exhibit the same energy density as fossil fuels to meet the increasing energy demands.<sup>1,2</sup> Moreover, the use of CO<sub>2</sub> as feedstock allows closure of the CO<sub>2</sub> cycle, reducing CO<sub>2</sub> emission and alleviating global warming. The mechanisms of CO<sub>2</sub> hydrogenation have been widely investigated on supported group VIII metals such as Ni, Ru and Rh. 3-8 One of the principal analytical methods used is infrared spectroscopy, particularly diffuse reflectance infrared Fourier transformation spectroscopy (DRIFTS) for studying both the gaseous phase and the adsorption species on the catalyst surface. The main product is commonly found to be gaseous CH<sub>4</sub>. However, various reaction mechanisms have been proposed referring to different intermediates. Gaseous CO and adsorbed CO\* were considered as important intermediates of CO<sub>2</sub> methanation because the well-known reversed water gas shift (RWGS) reaction could take place in the path of CH<sub>4</sub> production. 9-12 Some research has found that gaseous CO is not an intermediate as CO<sub>2</sub> produced without visible occurrence of gaseous CO. 13,14 Instead, the adsorbed CO\*, which is formed via surface RWGS reaction, is more favorable to be the intermediate as the adsorbed CO\* exhibits relation with CH<sub>4</sub> formation. <sup>15-</sup> <sup>19</sup> However, other research also support that the adsorbed formate (HCOO<sup>-\*</sup>) is the intermediate rather than CO\*. 20 The mechanism of CO<sub>2</sub> hydrogenation is still controversial.

There are two key problems with the previous work: difficulties in the definitive determination of the species appeared during the reaction, and difficulty with knowing whether a given species is an intermediate or a byproduct of CO<sub>2</sub> methanation.

To address the first problem, we resolved the peaks of the adsorbates using Gaussian fittings which were iteratively improved to produce a consistent view of the trends in observed species. To address the second problem, we controlled the formation of each adsorption species in situ, following by reducing the obtained adsorption species individually in  $H_2$  to monitor their role in hydrogenation process. This allowed us to trace the origin and reaction path of each adsorption species, and to determine the key intermediate of  $CO_2$  methanation. We found that the essential pathway of  $CO_2$  activation was  $CO_2 \rightarrow HCO_3^{-*} \rightarrow CO^*$  whether  $H_2$  was present or not. The surface RWGS reaction and  $HCOO^{-*}$  contributed to  $CO^*$  formation only when the system had abundant  $CO_2$  and  $H_2$ .  $CO^*$  was the key intermediates of  $CO_2$  methanation. Besides, the reactivities of the adsorption species were adsorption structure-dependent.

# 4.2 Experimental Section

Chemicals and Apparatus. The experiments were performed on ground Ru/Al<sub>2</sub>O<sub>3</sub> (Sigma-Aldrich, 0.5 wt.% loading on 3.2 mm pellets) or Al<sub>2</sub>O<sub>3</sub> (Sigma-Aldrich). The infrared spectra were recorded using a Bruker Tensor 27 spectrophotometer with a resolution of 2 cm<sup>-1</sup>, equipped with the Praying Mantis accessory and high-temperature reaction chamber (HVC) from Harrick Scientific for the diffuse reflectance infrared Fourier transformation spectroscopy (DRIFTS). The chamber was connected to He (purity 99.999%), H<sub>2</sub> (purity 99.999%) and CO<sub>2</sub> (purity 99.998%) gas lines and a turbomolecular pump. The tubing and the chamber were heated at 100 °C under vacuum overnight after loading the sample. The background pressure was 1×10<sup>-5</sup> mbar. The spectrophotometer was continuously flushed with clean dry compressed air.

**Sample Preparation.** Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> was pre-reduced in the DRIFTS cell in H<sub>2</sub> flow with heating from room temperature (RT) to 350 °C at a heating rate of 2 °C/min and maintained at 350 °C for 4 h to remove the surface oxides on the Ru metal. The sample was then allowed to cool to RT in H<sub>2</sub> flow. A high vacuum of  $1\times10^{-5}$  mbar was recovered after pumping.

**Experiments Performed.** Following the pretreatment, seven sets of experiments were done: **Exp. I** CO<sub>2</sub> hydrogenation reaction. This was initiated by mixing 200 mbar of CO<sub>2</sub> and 800 mbar of H<sub>2</sub> at RT, and heated to 300 °C with a rate of 1 °C/min on both Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub>. Exp. II CO<sub>2</sub> adsorption reaction. This was initiated by mixing 200 mbar of CO<sub>2</sub> and 800 mbar of He at RT, followed by heating to 300 °C with a rate of 1 °C/min on both Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub>. Exp. III HCO<sub>3</sub><sup>-\*</sup> decomposition reaction. This was initiated by mixing 200 mbar of CO<sub>2</sub> and 800 mbar of He at RT, followed by pumping to high vacuum of 5×10<sup>-5</sup> mbar, then heating to 300 °C with a rate of 1 °C/min on Ru/Al<sub>2</sub>O<sub>3</sub>. Exp. IV CO\* hydrogenation. This was obtained directly from HCO<sub>3</sub><sup>-\*</sup> decomposition experiment at 300 °C, followed by cooling down to RT, then filling with 1 bar of H<sub>2</sub> and heating to 300 °C with a rate of 1 °C/min on Ru/Al<sub>2</sub>O<sub>3</sub>. Exp. V HCO<sub>3</sub><sup>-\*</sup> hydrogenation reaction. This was initiated by mixing 200 mbar of CO<sub>2</sub> and 800 mbar of He at RT, followed by pumping to high vacuum of 5×10<sup>-5</sup> mbar, then filling the cell with 1 bar of H<sub>2</sub> and heating to 300 °C with a rate of 1 °C/min on Ru/Al<sub>2</sub>O<sub>3</sub>. There are also two experiments which were done without reducing the surface: Exp. VI HCOOH adsorption. HCOOH was obtained from external HCOOH droplet. The HCOOH droplet was added on the sample of Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> in air. Afterwards, the sample was pumped to low vacuum of 5×10<sup>-3</sup> mbar over 24h at RT. Exp. VII HCOOH hydrogenation. To determine the

hydrogenation properties of HCOOH on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub>, the samples were exposed to 1 bar of H<sub>2</sub> after Exp VI, and then heated to 300 °C with a rate of 1 °C/min.

In addition, solid reference samples of Na<sub>2</sub>CO<sub>3</sub>, CaCO<sub>3</sub>, NaHCO<sub>3</sub> and KHCO<sub>3</sub> were analyzed by transmission FT-IR to obtain the infrared bands of CO<sub>3</sub><sup>2-</sup> and HCO<sub>3</sub><sup>-</sup>.

Gaussian fittings. Four regions were separately fitted: 2100 ~ 1800 cm<sup>-1</sup>, 1800 ~ 1530 cm<sup>-1</sup>, 1530 ~ 1420 cm<sup>-1</sup>, 1420 ~ 1350 cm<sup>-1</sup>. The baseline of each region was taken as a linear function. The position, width and height of each Gaussian contribution were all constrained. The initial values of these constraints were taken from a combination of an estimation of the peak ranges observed in the spectra and the measured peaks of the reference samples. These initial parameters were used to simulate all the peaks in these ranges from all the experiments. The results of a fitting run were used to give the new values of parameters and constraint ranges for the next fitting run. This process was iterated manually hundreds of times until two criteria were met: (1) all the peaks followed regular and physically meaningful trends as the reaction proceeded; and (2) subsequently fits did not change the parameters of the peak position, height, and width.

The combination of the measurement of the reference samples and the Gaussian fittings through the reaction coordination helped to identify and assign the observed peaks.

# 4.3 Results and Discussions

# 4.3.1 Correlations of coexisting adsorption species in the CO<sub>2</sub> hydrogenation reaction

In order to learn what species comes out during CO<sub>2</sub> hydrogenation, we triggered CO<sub>2</sub> hydrogenation reaction on Ru/Al<sub>2</sub>O<sub>3</sub> by mixing CO<sub>2</sub> and H<sub>2</sub> followed by program heating (Exp. I). Figure 4.1(a) shows the main reaction of CO<sub>2</sub> converting to CH<sub>4</sub> from 100 °C. The variations in the complex peaks below 2200 cm<sup>-1</sup> suggest the development of adsorption species from CO<sub>2</sub> and H<sub>2</sub> co-adsorption during the hydrogenation reaction. The peaks were distinguished in three regions: C-O stretching of adsorbed carbon monoxide (CO\*) between 2100 and 1800 cm<sup>-1</sup>; O-C-O stretching of adsorbed bicarbonates (HCO<sub>3</sub>-\*), carbonates (CO<sub>3</sub><sup>2</sup>-\*) and formate (HCOO-\*) between 1700 and 1400 cm<sup>-1</sup>; and C-H and O-H bending between 1400 and 1200 cm<sup>-1</sup> (Fig 1(a)). To identify the infrared peaks, we measured reference samples of carbonates, bicarbonates, and surface formic acid on Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub> (Figure S4.1 and S4.2). More importantly, we resolved the peaks of the adsorbates of each

reaction using Gaussian fittings (Figure S4.3). The peak assignments are summarized in Table 4.1 based on the combination of reference peaks and gaussian fittings.

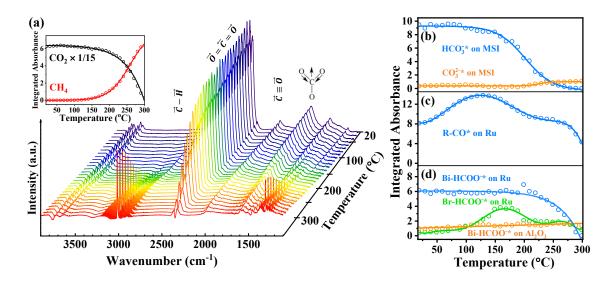


Figure 4.1. (a) Infrared absorbance spectra with the insertion of  $CO_2$  to  $CH_4$  conversion during  $CO_2$  hydrogenation (Exp. I). And evolution of adsorption species of (b)  $HCO_3^{-*}$  with peak at 1650 cm<sup>-1</sup> and  $CO_3^{2-*}$  with peak at 1450 cm<sup>-1</sup> located at MSI, (c) R-CO\* on Ru, (d) Bi-HCOO\* on Ru, Br- and Br-HCOO\* on Ru, and Bi-HCOO\* on Al<sub>2</sub>O<sub>3</sub>. In (b)-(d), circles are the original data of integrated peak intensity from Gaussian fittings, and the lines are the non-linear fittings of those original data.

At RT, four types of adsorption species were formed during the CO<sub>2</sub> hydrogenation reaction on Ru/Al<sub>2</sub>O<sub>3</sub>: HCO<sub>3</sub><sup>-\*</sup>\*, CO<sup>3</sup>\*, CO<sup>3</sup>\*, and HCOO<sup>-\*</sup>\*. HCO<sub>3</sub><sup>-\*</sup>\* were formed by reaction of CO<sub>2</sub> with the surface hydroxyl groups on the Al<sub>2</sub>O<sub>3</sub> support following the H<sub>2</sub> pretreatment. The intensity of HCO<sub>3</sub><sup>-\*</sup>\* was larger on Ru/Al<sub>2</sub>O<sub>3</sub> than on bare Al<sub>2</sub>O<sub>3</sub>, and HCO<sub>3</sub><sup>-\*</sup>\* on Al<sub>2</sub>O<sub>3</sub> could not be continuously formed from CO<sub>2</sub> on Al<sub>2</sub>O<sub>3</sub> (Figure S4.4 and S4.5), indicating the adsorption of HCO<sub>3</sub><sup>-\*</sup>\* is increased by the metal-support interface (MSI). As shown in Figure 4.1(b), during the temperature ramp the concentration of HCO<sub>3</sub><sup>-\*</sup>\* was initially constant and started to decrease above about 150 °C. CO<sub>3</sub><sup>2</sup>-\* increased gradually with increasing temperature above 200 °C, the increase most likely came from HCO<sub>3</sub><sup>-\*</sup>\* deprotonation. Assuming that the peak intensities for O-C-O stretching are similar in HCO<sub>3</sub><sup>-\*</sup>\* and CO<sub>3</sub><sup>2</sup>-\* at the same site and coverage, the much lower intensity of CO<sub>3</sub><sup>2</sup>-\* indicates that only some of the HCO<sub>3</sub><sup>-\*</sup>\* decomposed to CO<sub>3</sub><sup>2</sup>-\*, and the remaining HCO<sub>3</sub><sup>-\*</sup>\* molecules were consumed in other processes, for instance desorption or decomposition.

Reactive CO\* (R-CO\*) with the peaks at 2015, 1990, 1950, and 1905 cm<sup>-1</sup> (Table 4.1 and Figure S4.6) increased from RT up to 150 °C (Figure 4.1(c)) and then decreased, indicating that its

production was slower than its consumption above 150 °C. At 220 °C, R-CO\* concentration leveled off, possibly because a new route of R-CO\* production became active. Nevertheless, linear-CO\* on Ru<sup>0</sup> at 2035 cm<sup>-1</sup> (Table 4.1) remained constant throughout the entire experiment, indicating the inert character of this species (Figure S4.6). It has been reported that hydrogen-perturbed CO could locate in the range between 1840 – 1700 cm<sup>-1</sup>, and could be H<sub>2</sub>CO species or carbonyl hydrides and formyl/formaldehyde.<sup>21,22</sup> In our case, we did not have peaks between that region as shown in Figure S4.6. The discrepancy between the reference and our work could be originated by the different effects of different catalyst surfaces which are sensitive/selective to the different adsorption species.

HCOO<sup>-\*</sup> is present in three forms (bidentate on Ru with a high frequency of 1620 cm<sup>-1</sup>, bridged on Ru with a frequency of 1590 cm<sup>-1</sup> and bidentate on Al<sub>2</sub>O<sub>3</sub> with a frequency of 1560 cm<sup>-1</sup> (Table 4.1). Bidentate-HCOO<sup>-\*</sup> (Bi-HCOO<sup>-\*</sup>) on Ru was abundant and stable up to 220 °C, after which it was consumed and completely disappeared at 300 °C. Conversely, bridged-HCOO<sup>-\*</sup> (Br-HCOO<sup>-\*</sup>) on Ru, increased from 70 to 160 °C, followed by a slow decrease (Figure 4.1 (d)). Bidentate-HCOO<sup>-\*</sup> (Bi-HCOO<sup>-\*</sup>) on Al<sub>2</sub>O<sub>3</sub> showed only one weak peak at 1560 cm<sup>-1</sup> (Figure 4.1 (d)). The slight increase in production of this species, instead of consumption, indicates it is not reactive during CO<sub>2</sub> hydrogenation.

## 4.3.2 Unraveling the roles of individual species using in situ control

The temperature-dependent evolution of the abovementioned species shows correlations with the CO<sub>2</sub> methanation reaction. However, their simultaneous existence makes the determination of their origins and roles in the reaction equivocal. To unravel these mysteries, we isolate the adsorption species step by step in the following sections.

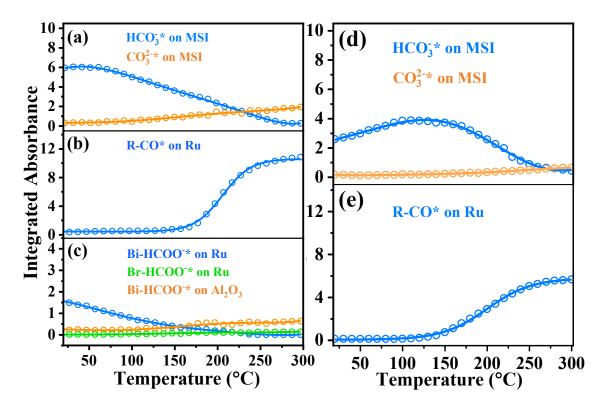


Figure 4.2. (a)  $HCO_3^{-*}$  and  $CO_3^{2-*}$ , (b)  $R-CO^*$ , (c) three structural  $HCOO^{-*}$  during  $CO_2$  adsorption reaction (Exp. II); (d)  $HCO_3^{-*}$  and  $CO_3^{2-*}$ , (e)  $R-CO^*$  during  $HCO_3^{-*}$  decomposition (Exp. III). The peak positions were the same as in Figure 4.1. The circles are the original data of integrated peak intensity from Gaussian fittings, and the lines are the non-linear fittings of those original data.

# 4.3.2.1 Interactions of CO<sub>2</sub> and the surface

We first investigated the interactions between CO<sub>2</sub> and the surface by replacing H<sub>2</sub> with He, keeping all other conditions the same (Exp. II). The results are shown in Figure 4.2(a)-(c). At RT, HCO<sub>3</sub><sup>-\*</sup> was the main species formed when the surface was exposed in CO<sub>2</sub>, indicating that it is the primary product of CO<sub>2</sub> adsorption (Figure 4.2(a)). HCO<sub>3</sub><sup>-\*</sup> decreased almost linearly with increasing temperature after 50 °C. Simultaneously, CO<sub>3</sub><sup>2-\*</sup> increased almost linearly with increasing temperature. These trends are similar as those in the CO<sub>2</sub> hydrogenation reaction Figure 4.1(b). The higher ratio of CO<sub>3</sub><sup>2-\*</sup>/HCO<sub>3</sub><sup>-\*</sup> for CO<sub>2</sub> adsorption than that for CO<sub>2</sub> hydrogenation reflects the more favorable deprotonation of HCO<sub>3</sub><sup>-\*</sup> in H<sub>2</sub>-deficient condition.

All the CO\* showed the same peaks as those in  $CO_2$  hydrogenation except for a 25 cm<sup>-1</sup> redshift of the peak of linear-CO\* at 2035 cm<sup>-1</sup> (Figure S4.7). This redshift was probably due to the adsorption of linear-CO\* onto the oxidized metal surface ( $Ru^{\delta^+}$ ) in a hydrogen-deficient environment. This linear-CO\* at 2035 cm<sup>-1</sup> showed no change in the whole process, as same insensitiveness as in  $CO_2$ 

hydrogenation reaction (Figure S4.7). Notably, R-CO\* increased above 150 °C (Figure 4.2(b)). This increase in R-CO\* production explains the plateau in R-CO\* concentration starting at 220 °C in CO<sub>2</sub> hydrogenation (Figure 4.1(c)). However, whether these CO\* was produced from the decomposition of CO<sub>2</sub> or HCO<sub>3</sub>-\* is not clear yet and needed further controlling experiments.

Bi-HCOO<sup>\*\*</sup> on Ru at RT had much weaker intensity (Figure 4.2(c)) than the corresponding intensity when H<sub>2</sub> was present (Figure 4.1(d)). The intensity decreased with increasing temperature until complete disappearance at 220 °C. We speculate that Bi-HCOO<sup>\*\*</sup> is not formed from HCO<sub>3</sub><sup>\*\*</sup> since HCOO<sup>\*\*</sup> does not increase when HCO<sub>3</sub><sup>\*\*</sup> decreases. Rather, Bi-HCOO<sup>\*\*</sup> must be formed by CO<sub>2</sub> reacting with adsorbed H atoms on the surface. Thus, we conclude that there must be a small amount of residual H atoms present in this experiment, and that the small concentration of H explains the small concentration of Bi-HCOO<sup>\*\*</sup>. Br-HCOO<sup>\*\*</sup> on Ru was almost invisible, indicating that CO<sub>2</sub>, HCO<sub>3</sub><sup>\*\*</sup> and CO<sup>\*\*</sup> do not form Br-HCOO<sup>\*\*</sup> in a hydrogen-deficient environment. Bi-HCOO<sup>\*\*</sup> on Al<sub>2</sub>O<sub>3</sub> slightly increased above 150 °C when Bi-HCOO<sup>\*\*</sup> on Ru disappeared possibly due to migration of Bi-HCOO<sup>\*\*</sup> on Ru to Al<sub>2</sub>O<sub>3</sub> support. <sup>15</sup>

# 4.3.2.2 In situ isolation and decomposition of HCO<sub>3</sub><sup>-\*</sup>

To determine whether CO\* was formed from the decomposition of CO<sub>2</sub> or HCO<sub>3</sub><sup>-\*</sup>\*, we pumped out the gases after CO<sub>2</sub> adsorption at RT (Exp. III). In this way, we produced a surface exclusively covered by HCO<sub>3</sub><sup>-\*</sup>\* at RT. The catalyst was then heated. Broadly speaking, during heating HCO<sub>3</sub><sup>-\*</sup>\* decreased (Figure 4.2(d)) starting from 130 °C and there was a corresponding increase in R-CO\* concentration (Figure 4.2(e)), excluding the inert linear-CO\* at 2065 cm<sup>-1</sup> (Figure S4.8). Thus, we conclude that the R-CO\* originates from HCO<sub>3</sub><sup>-\*</sup>\* and not from CO<sub>2</sub>. The 20 °C-lower temperature than the onset temperature of R-CO\* formation in CO<sub>2</sub> adsorption reaction (Figure 4.2(b)) is probably the reason of released active sites in high vacuum. We currently do not have an explanation for the increase in HCO<sub>3</sub><sup>-\*</sup>\* at the beginning of the temperature ramp, but the broad conclusion stands.

# 4.3.2.3 In situ isolation and hydrogenation of CO\*

To find out which adsorption species can react to form CH<sub>4</sub>, we hydrogenated them separately by preparing them individually with in situ control.

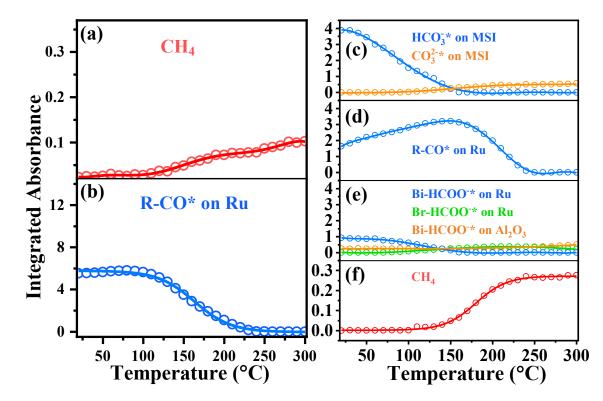


Figure 4.3. (a) Production of CH<sub>4</sub> and (b) reduction of CO\* during R-CO\* hydrogenation (Exp. IV). Evolution of (c) HCO<sub>3</sub><sup>-</sup> and CO<sub>3</sub><sup>2</sup>-\*, (d) R-CO\*, (e) three structural HCOO<sup>-</sup>\*, (f) CH<sub>4</sub> during HCO<sub>3</sub><sup>-</sup>\* hydrogenation (Exp. V). The peak positions were the same as in Figure 1. The circles are the original data of integrated peak intensity from Gaussian fittings, and the lines are the non-linear fittings of those original data.

We first isolated all the CO\* in situ from HCO<sub>3</sub><sup>-\*</sup> decomposition following the process shown in Figure 4.2(d) and (e) and cooling to RT. 1 bar of H<sub>2</sub> was then filled followed by program heating (Exp. IV). As shown in Figure 4.3(a) and (b), R-CO\* decreased and CH<sub>4</sub> increased starting at 120 °C. Note that this onset temperature is 20 °C higher than that observed in the CO<sub>2</sub> hydrogenation reaction (Figure 4.1(a)) probably because of the lower R-CO\* concentration in this case. Linear-CO\* at 2040 cm<sup>-1</sup> was still inert in this hydrogenation process (Figure S4.9). Thus, we conclude R-CO\* is clearly an intermediate in the CH<sub>4</sub> formation reaction while the linear-CO\* above 2035 cm<sup>-1</sup> is a byproduct.

# 4.3.2.4 In situ isolation and hydrogenation of HCO<sub>3</sub><sup>-\*</sup>

Next, we investigate whether HCO<sub>3</sub><sup>-\*</sup> is an intermediate. HCO<sub>3</sub><sup>-\*</sup> was obtained in situ from CO<sub>2</sub> adsorption followed by pumping to high vacuum at RT (Exp. V). As shown in Figure 4.3(c)-(e), when the sample was heated in H<sub>2</sub>, HCO<sub>3</sub><sup>-\*</sup> concentration decreased immediately till completely consumed by 150 °C. Meanwhile, R-CO\* and Bi-HCOO<sup>-\*</sup> on Ru immediately produced at RT. There is a corresponding increase in the concentration of R-CO\* which is the result of surface RWGS

reaction triggered by HCO<sub>3</sub><sup>-\*</sup> hydrogenation at MSI. Thus, we conclude that HCO<sub>3</sub><sup>-\*</sup> is an intermediate in the overall reaction, producing CO\* which is subsequently converted to CH<sub>4</sub> (Figure 4.3(f)).

#### 4.3.2.5 The role of HCOO<sup>-\*</sup>

Finally, we consider whether HCOO\*\* is an intermediate. Unfortunately, we were unable to produce isolated HCOO<sup>-\*</sup> by in situ control because HCO<sub>3</sub><sup>-\*</sup> was always present when HCOO<sup>-\*</sup> was produced. Nonetheless, we have evidence that Bi-HCOO\*\* on Ru formed in our in situ control is a reaction intermediate. Figure 4.1(d) shows that in CO<sub>2</sub> hydrogenation reaction Bi-HCOO<sup>-\*</sup> on Ru formed from CO<sub>2</sub> hydrogenation, and was consumed in the same shape of the reactive species of CO<sub>2</sub>, HCO<sub>3</sub><sup>-</sup> \* and R-CO\* above 220 °C. This consumption could involve the formation reaction of CO\* or CH<sub>4</sub>. In Figure 4.3(e) when there was no CO<sub>2</sub>, Bi-HCOO<sup>-\*</sup> on Ru formed by the previous step of CO<sub>2</sub> adsorption reacting with residual hydrogen on the surface. Bi-HCOO\* on Ru started to decrease at a 40 °C-lower temperature than the onset temperature of CH<sub>4</sub> formation. Therefore, we conclude Bi-HCOO\* on Ru is reduced by hydrogen to form CO\* instead of directly to CH<sub>4</sub>. Additionally, Bi-HCOO\*\* on Ru could convert to bridged form on Ru from 70 to 160 °C as illustrated in Figure 4.1(d) and Figure 4.3(e). This Br-HCOO\*\* on Ru could be reduced above 160 °C but not completely when it was abundant (Figure 4.1(d)). However, it kept constant above 160 °C when it had low concentration. These imply Br-HCOO\*\* on Ru has a high activation energy of hydrogenation. Bi-HCOO\*\* on Al<sub>2</sub>O<sub>3</sub> was a byproduct as it always slowly increased by the migration of those HCOO\*\* on Ru in all the experiments.

The distinct reactivities between the HCOO\*\* of different adsorption structures on Ru can be understood by atomic structure of the surface. The distance between neighboring Ru atoms in a hexagonal structure is 2.71 Å, while the distance between the two oxygen atoms of formate is 2.20 Å. These two comparable distances facilitate adsorption of the bridged structure of formate to the surface of the bulk Ru, where the two oxygen atoms bind to two adjacent Ru atoms. A larger distance between Ru atoms, e.g. at the edge or defect where some Ru atoms are isolated, is required to accept Bi-HCOO\*\* on Ru so that two oxygen atoms bind to one Ru atom. Therefore, the bulk sites of the surface result in the stable Br-HCOO\*\* on Ru, and the edge or defect centers promote the high reactivity of Bi-HCOO\*\* on Ru.

We also prepared isolated HCOO<sup>-\*</sup> by ex situ application of a drop of HCOOH to the sample in air followed by pumping to vacuum. All the forms of HCOO<sup>-\*</sup> on Ru/Al<sub>2</sub>O<sub>3</sub> were reactive and started to form CO\* above 150 °C (Figure S4.2). Above 220 °C, Bi-HCOO<sup>-\*</sup> on Ru and on Al<sub>2</sub>O<sub>3</sub> were

substantially reduced, leading to CO\* formation slowing down and CH<sub>4</sub> formation. Br-HCOO<sup>-\*</sup> on Ru was not reduced completely. The ex situ experiment supports the conclusion that Bi-HCOO<sup>-\*</sup> on Ru is a reaction intermediate and Br-HCOO<sup>-\*</sup> on Ru possesses high activation energy of reduction; but, on the other hand, it showed a discrepancy with the in situ experiment where Bi-HCOO<sup>-\*</sup> on Al<sub>2</sub>O<sub>3</sub> was also reactive. The discrepancy is not surprising given that the ex situ experiment involved exposure to air and the high acidity of the sample. The discrepancy points out the danger of obtaining misleading results by ex situ preparation.

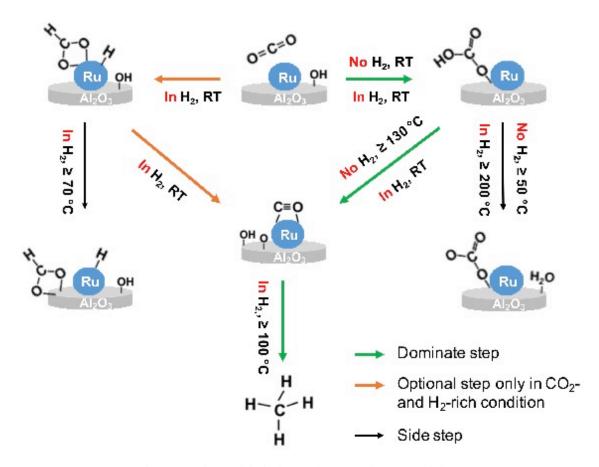


Figure 4.4 Schema of the hydrogenation steps of CO<sub>2</sub> on Ru/Al<sub>2</sub>O<sub>3</sub>.

Table 4.1. Vibrational modes and infrared peak positions (cm<sup>-1</sup>) of the reference samples and the reaction species from this work.

Species	C-H as. str.	C-H b.	C=O str.	O-C-O as. str.	O-C-O s. str.	O-C-O b.	O-H b.	C-OH str.
CO <sub>3</sub> <sup>2-</sup>			1776	1454	1454	880		
CO <sub>3</sub> <sup>2-*†23</sup>				1500	1450			
HCO₃ <sup>-</sup>			1695	1650, 1630	1402, 1371		1305	1007
HCO <sub>3</sub> -*+20, 23-27			1690	1650	1440		1230	
HCOOH <sup>†28-30</sup>	2940, 2871	1415	1748, 1670	1620; 1560 (on Al <sub>2</sub> O <sub>3</sub> )	1405, 1360		1220	970
Bi-HCOO·* on Ru	2913, 2895, 2870	1390	1720	1620	1405		1220	970
Br-HCOO-* on Ru	2913, 2895, 2870	1390	1720	1590	1375		1220	970
Bi-HCOO·* on Al <sub>2</sub> O <sub>3</sub> <sup>†31</sup>	2918, 2895, 2870	1387	1710	1560	1360		1230	970

Table 4.2 Vibrational modes and infrared peak positions (cm<sup>-1</sup>) of CO\* from this work.

Species	C≡O as. str.
Linear-CO* on Ru <sup>δ</sup> +†26,30,32-35	2060
Linear-CO* on Ru <sup>0†26,30,32-35</sup>	2035
Linear-CO* on Ru <sup>0</sup> /Ru <sup>0</sup> +†26,30,32-35	2015
Bridged-CO* on Ru <sup>†26,30,32-35</sup>	1990, 1950, 1905
Gaseous CO	2150

str.: stretching. as.: asymmetric. s.: symmetric. b.: bending. (w): weak. \*: adsorbed state. †the corresponding bond vibrations and infrared peak positions are comparable to the given references.

The way of distinguish bidentate and bridged structures of formate: bidentate-HCOO\*\* has the splitting value of O-C-O asymmetric ( $v_{as}$ ) and symmetric ( $v_{as}$ ) and symmetric ( $v_{as}$ ) stretching  $\Delta v = v_{as} - v_{s}$  less than 220 cm<sup>-1</sup>; bridged-HCOO\*\* has  $\Delta v$  in the range of 220 – 280 cm<sup>-1</sup>.<sup>36</sup>

### 4.4 Conclusions

The results we have just described, can be understood in terms of the reaction mechanisms summarized in Figure 4.4. There are two pathways to CO<sub>2</sub> methanation. One is initiated by HCO<sub>3</sub><sup>-\*</sup> formation, illustrated by the green arrow. The other is initiated by the formation Bi-HCOO<sup>-\*</sup> on Ru, illustrated by the orange arrow. In the HCO<sub>3</sub><sup>-\*</sup> pathway, first, HCO<sub>3</sub><sup>-\*</sup> is formed at RT when CO<sub>2</sub> adsorbs and reacts with the surface hydroxyl groups on the metal-support interface which originated from the H<sub>2</sub> pre-reduction of the surface. Next, the HCO<sub>3</sub><sup>-\*</sup> is reduced to CO\* by hydrogen at RT. HCO<sub>3</sub><sup>-\*</sup> also produces CO\* via thermal decomposition above 130 °C in high vacuum and above to 170 °C in a CO<sub>2</sub> and H<sub>2</sub> rich environment. The temperature shift is due to competition for adsorption sites. In the Bi-HCOO<sup>-\*</sup> pathway, the first step is the reaction of CO<sub>2</sub> and hydrogen to produce Bi-HCOO<sup>-\*</sup> on Ru at RT. This species then reacts with hydrogen to produce CO\* on Ru at RT. Alternatively, Bi-HCOO<sup>-\*</sup> on Ru converts to more stable Br-HCOO<sup>-\*</sup> on Ru which has a higher activation

energy to reaction and does not fully convert under our conditions (not shown in the figure). In both

pathways, the final process is the hydrogenation of R-CO\* to CH<sub>4</sub> above 100 °C. R-CO\* is conse-

quently a key intermediate in CO<sub>2</sub> methanation.

In addition to the pathways leading to CH<sub>4</sub> formation, there are also notable side reactions that lead

to non-reactive byproducts. As shown by the black arrow on the right side of Figure 4.4, HCO<sub>3</sub>\*

decomposes to CO<sub>3</sub><sup>2</sup>\* at 50 °C in a hydrogen-deficient environment, and 200 °C in hydrogen-rich

environment. The black arrow on the left side of Figure 4.4 shows Bi-HCOO\*\* on Ru converts to

Bi-HCOO\*\* on Al<sub>2</sub>O<sub>3</sub>. Besides, linear-CO\* on Ru<sup>0</sup> forms along with R-CO\*, but also insensitive to

the hydrogenation reaction (not shown in the figure).

In summary, we unraveled surface reaction mechanism of CO<sub>2</sub> hydrogenation via in situ control of

the individual formation and hydrogenation of each adsorption species in operando DRIFTS com-

bined with iterative Gaussian fitting.  $CO_2 \rightarrow HCO_3^{-*} \rightarrow CO^* \rightarrow CH_4$  is the dominate reaction step

which takes place from the metal-support interface to the metal surface. This enlightens us the effec-

tive pathway and surface sites for CO<sub>2</sub> methanation.

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Notes

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this work.

ASSOCIATED CONTENT

**Supporting Information** 

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The infrared spectra of all the experiments, the evolution of each vibrational modes of each species, and the explanation of bicarbonate adsorption at MSI are illustrated. This material is available free of charge via the Internet at <a href="http://pubs.acs.org">http://pubs.acs.org</a>.

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# **Supporting Information**

# In Situ Control of the Adsorption Species in CO<sub>2</sub> Reduction: Determination of Intermediates and Byproducts

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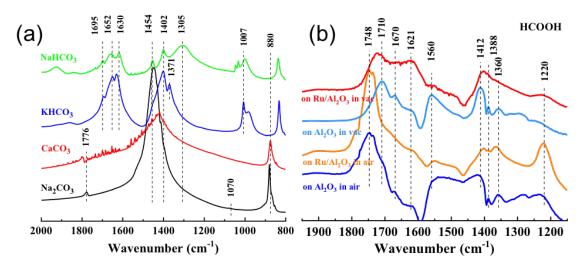


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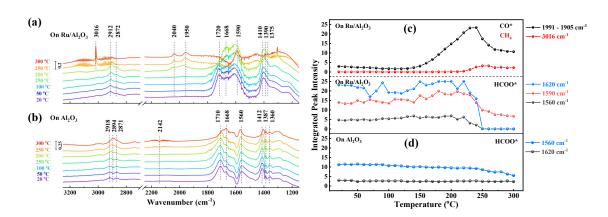


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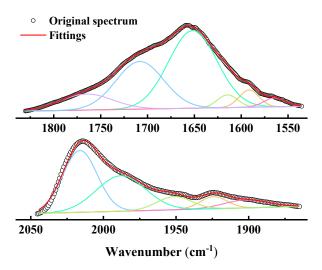


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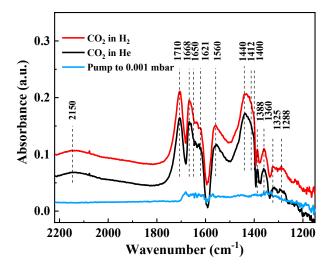


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Concerning the adsorption site of HCO<sub>3</sub><sup>-\*</sup>, we do not have direct proof of HCO<sub>3</sub><sup>-\*</sup> adsorption on the metal-support interface (MSI), but we judged this by three sufficient points: (1) the surface hydroxyl group (OH\*) is generally on Lewis acid site of Al<sub>2</sub>O<sub>3</sub>. Since HCO<sub>3</sub><sup>-\*</sup> formed by CO<sub>2</sub> reacting with OH\*, HCO<sub>3</sub><sup>-\*</sup> has to locate on Al<sub>2</sub>O<sub>3</sub> initially. (2) HCO<sub>3</sub><sup>-\*</sup> formed on Ru/Al<sub>2</sub>O<sub>3</sub> was much stronger than on Al<sub>2</sub>O<sub>3</sub> (Figure S4.10). Thus this enhancement is because of the effect of MSI. (3) During CO<sub>2</sub> hydrogenation, HCO<sub>3</sub><sup>-\*</sup> on Ru/Al<sub>2</sub>O<sub>3</sub> was continuously formed from CO<sub>2</sub> until CO<sub>2</sub>

concentration dropped. However, HCO<sub>3</sub><sup>-\*</sup> on Al<sub>2</sub>O<sub>3</sub> consumed fast and depleted at 160 °C, illustrating that HCO<sub>3</sub><sup>-\*</sup> could not be continuously formed from CO<sub>2</sub> on Al<sub>2</sub>O<sub>3</sub>. This proved that HCO<sub>3</sub><sup>-\*</sup> from CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub> was located on MSI instead of on Al<sub>2</sub>O<sub>3</sub>.

The intermediates located at the interface were HCO<sub>3</sub><sup>-\*</sup> and bidentate HCOO<sup>-\*</sup> on Ru. These two species were formed at the interface and active in the hydrogenation reaction. This means before the CO\* hydrogenation step, the CO<sub>2</sub> activation steps favourably took place at MSI. We added this explanation in the supporting information.

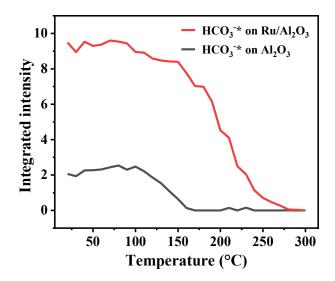


Figure S4.5 HCO<sub>3</sub>-\* evolution during CO<sub>2</sub> hydrogenation on reduced Ru/Al<sub>2</sub>O<sub>3</sub> and Al<sub>2</sub>O<sub>3</sub>.

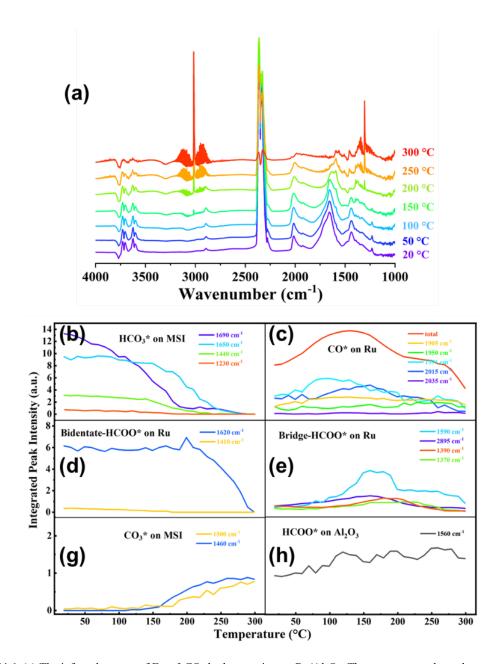


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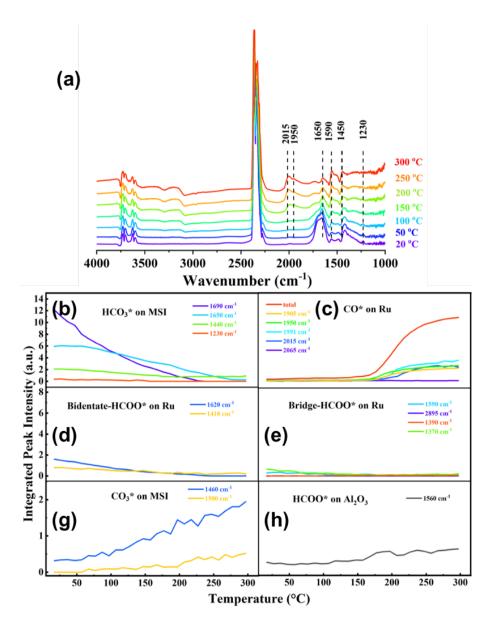


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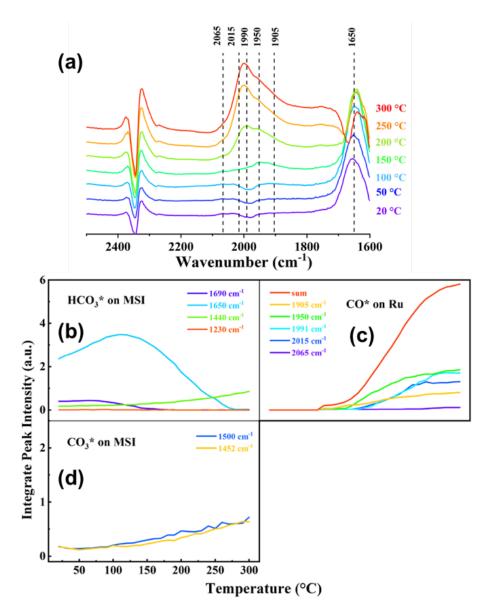


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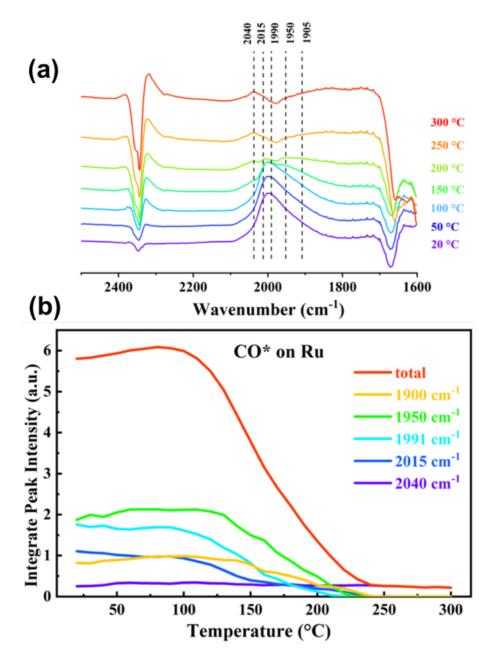


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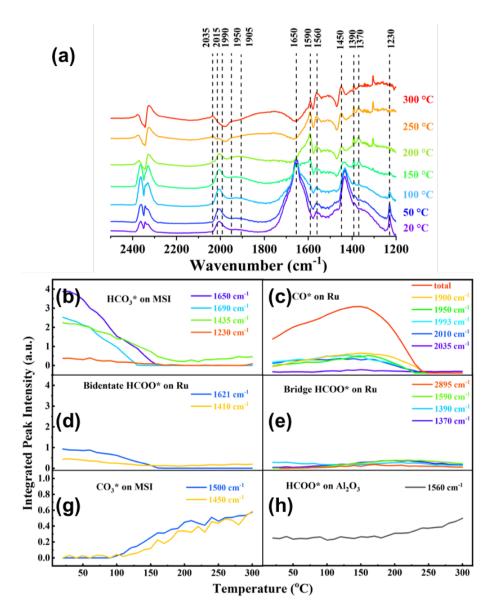


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# Chapter 5 Unraveling and Optimizing the Metal-Metal Oxide Synergistic Effect in a Highly Active Co<sub>x</sub>(CoO)<sub>1-x</sub> Catalyst for CO<sub>2</sub> Hydrogenation

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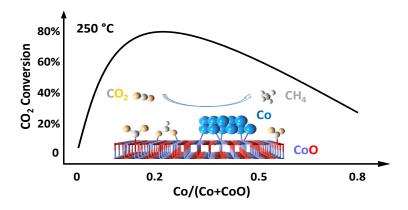
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**Summary:** this Chapter is further work of developing new catalyst based on the previous discoveries of the relation between catalyst compositions and their reactivities in the  $CO_2$  hydrogenation. The catalyst with high concentration of metal oxide boosts  $CO_2$  conversion due to the enhanced  $CO_2$  adsorption on the metal oxide.

#### Abstract

The relation between catalytic reactivities and metal/metal oxide ratios, as well as the functions of the metal and the metal oxides were investigated in the  $CO_2$  hydrogenation reaction over highly active  $Co_x(CoO)_{1-x}$  catalysts in operando. The catalytic reactivity of the samples in the  $CO_2$  methanation improves with the increased CoO concentration. Strikingly, the sample with the highest concentration of CoO, i.e.,  $Co_{0.2}(CoO)_{0.8}$ , shows activity at temperatures lower than  $200\,^{\circ}C$  where the other samples with less CoO are inactive. The origins of this improvement are the increased amount and moderate binding of adsorbed  $CO_2$  on CoO sites. The derivative adsorption species are found to be intermediates of the  $CH_4$  formation. The metallic Co functions as the electronically catalytic site which provides electrons for the hydrogenation steps. As a result, an abundant amount of CoO combined with Co is the optimal composition of the catalyst for achieving the highest reactivity for  $CO_2$  hydrogenation.

**Keywords:** Cobalt and cobalt oxide; Reactivity; CO<sub>2</sub> hydrogenation; Active site; Adsorption; Activation energy



# 5.1 Introduction

CO<sub>2</sub> conversion to hydrocarbons has received enormous attention in the past decade for the possibilities of exploiting CO<sub>2</sub> as feedstock in the storage of sustainable energy and of closing the carbon cycle. Metal oxides-supported transition metals such as Fe, Co, Ni, Cu and Ru have been studied as effective catalysts in the CO<sub>2</sub> hydrogenation reaction. The main products of the reaction over the above-mentioned catalysts at atmospheric pressure are CH<sub>4</sub> and CO [1–5].

In general, CO<sub>2</sub> hydrogenation catalysts are prepared in the form of supported metal particles. The metal site is considered as the reactive center while the support is used for dispersing and stabilizing the metal nanoparticles [6,7]. However, recent studies showed that the support could also have an important role in the heterogeneous catalysis of carbon-related reactions. In methanol synthesis from CO<sub>2</sub> and H<sub>2</sub> on Cu-based supported catalysts, the ZrO<sub>2</sub> support facilitates the moderate bindings of the key reaction intermediates at the interface of Cu and ZrO<sub>2</sub> [8,9]. Moreover, different supports lead to different key intermediates of methanol production, e.g., TiO<sub>2</sub> and ZnO<sub>2</sub> support surfaces produce formate intermediate, while ZrO<sub>2</sub> support surface forms CO\*, HCO\*, and H<sub>2</sub>CO\* intermediates. The formate intermediate is less active for methanol formation compared to the other intermediates, resulting in a less active catalyst with TiO<sub>2</sub> support [10–12]. In higher alcohol synthesis from syngas over Co/CeO<sub>2</sub> catalyst, the CeO<sub>2</sub> support functions for dispersing the Co nanoparticles. However, the Co is partially oxidized into  $CoO_x$  due to the strong metal-support interactions. This results in an active Co-CoO<sub>x</sub> pair for the higher alcohol synthesis where the Co site accounts for CO dissociation to form  $CH_x$  species and the  $CoO_x$  site accounts for CO undissociated activation to form CH<sub>x</sub>O\* species. These CH<sub>x</sub> and CH<sub>x</sub>O\* species combine to form higher alcohol at the interface of Co and  $CoO_x$  [13]. In  $CO_2$  and CO hydrogenation reaction, the partially cobalt nanoparticles on  $TiO_2$ supports, Co/CoO/TiO<sub>2</sub>, exhibit higher CO<sub>2</sub> and CO conversion rate than the metallic Co/TiO<sub>2</sub>, indicating CoO improves reactivity of the catalyst either by the component itself or by forming active interface with the metal or with the support. However, changing the TiO<sub>2</sub> support to SiO<sub>2</sub> support reversed the activity, implying that different support varies the activity of the catalyst [14]. An early work from Somorjai and co-workers claimed a promotion effect of oxide on Rh metal surface for the CO and CO<sub>2</sub> hydrogenation [15]. The promotion effect was attributed to the high Lewis acidity of the metal cations of the oxide by the possible function of cleavage of the C-O bond at the interface of Rh/oxide for CH<sub>4</sub> formation. Therefore, they suggested the support participated in the catalytic reaction via cleaving chemical bonds, but this was still disputable. Recent work using supports from Lewis acidic to basic properties to study the support effects in Fischer-Tropsch reaction

demonstrated a volcano relation between the reaction rate and Lewis acid-base nature of the support, where the supports was not considered to be catalytic active [16].

The above-mentioned arguments on the role of the support motivate us to clarify the role of the support in the CO<sub>2</sub> hydrogenation reaction, and the relation between the combinations of metal and support and their catalytic reactivity, as these are important for the design of efficient catalysts for CO<sub>2</sub> conversion. In our previous study on a Ru/Al<sub>2</sub>O<sub>3</sub> catalyst, we found that CO<sub>2</sub> adsorbed initially on the Al<sub>2</sub>O<sub>3</sub> surface and on the interface of Al<sub>2</sub>O<sub>3</sub> and Ru. Then the adsorbed CO<sub>2</sub> and its derivative species migrate to the Ru atoms for the subsequent hydrogenation steps. The support itself did not provide a site for the CO<sub>2</sub> hydrogenation steps [17,18]. Herein, we hypothesized that there might be an optimized metal to metal oxide ratio for the highest reactivity toward CO<sub>2</sub> hydrogenation.

To explore this hypothesis, we would like to synthesize catalysts with varying fractions of metal and support for  $CO_2$  hydrogenation. However, a "foreign" support could create multiple interfaces, i.e. metal/metal oxide interface, metal/support interface, metal oxide/support interface due to strong metal-support interaction, and this would make it difficult to explore cleanly the effect of the metal/metal oxide ratio [19–22]. To avoid this complexity and to vary only the metal/oxide ratio, we designed a "self-supported" cobalt catalyst with different ratios of the metallic Co and the CoO, i.e.,  $Co_x(CoO)_{1-x}$  with 0 < x < 1.

Herein, we developed an in operando reduction method to synthesize the  $Co_x(CoO)_{1-x}$  samples and to analyze the  $CO_2$  hydrogenation reaction in continuous experiments on one platform: a diffuse reflectance infrared Fourier transform spectroscopy-mass spectroscopy-gas chromatograph (DRIFTS-MS-GC) instrument, previously described [23]. The molar concentrations of Co were quantified using the  $H_2$  consumption from the MS data. To verify this in situ quantification, X-ray photoelectron spectroscopy (XPS) was applied to analyze the compositions and the ratios of Co content in the catalysts. Subsequently, the reactivity of these  $Co_x(CoO)_{1-x}$  samples in the  $CO_2$  hydrogenation reaction was investigated in the DRIFTS-MS-GC instrument. The gas phase and catalyst surface were observed simultaneously to unravel the reaction mechanisms. To understand the origins of the different reactivities, we analyzed the gas—surface interaction using temperature-programmed desorption—mass spectroscopy (TPD-MS). Additionally, surface electronic structures of these samples were measured using near ambient-pressure X-ray photoelectron spectroscopy (NAP-XPS) to check whether the oxide creates special electronic states for the catalysis.

The specific purpose of this work is to answer three key scientific questions: (1) What is the optimal ratio of metal/metal oxide to achieve the highest reactivity in CO<sub>2</sub> hydrogenation? (2) Is the role of the support simply to disperse the metal nanoparticles or does it have a direct role in the reaction? (3) If there is a direct role, is it only to provide adsorption sites for CO<sub>2</sub> and the associated adsorbed species, or also to provide electronically active sites that reduce those adsorbed species to hydrocarbons?

We found that the reactivity of the samples depended strongly on the Co/(Co+CoO) molar ratio. Importantly, we produced a catalyst that is highly active at low reaction temperature. The catalyst with a higher concentration of CoO has a lower onset reaction temperature, a lower activation energy of CH<sub>4</sub> formation, and a higher CO<sub>2</sub> conversion. We demonstrate that the improved activity of the catalyst stems solely from the role of CoO in providing sites for CO<sub>2</sub> adsorption and lowering the CO<sub>2</sub> binding energy, but not in providing active sites for the hydrogenation reaction.

# **5.2** Experimental Methods

# 5.2.1 Sample preparations

The samples were prepared by starting with  $Co_3O_4$  and then reducing this material in  $H_2$  at various temperature/time profiles to produce several self-supported catalysts with controlled ratios of Co and CoO,  $Co_x(CoO)_{1-x}$  (0 < x < 1).  $Co_3O_4$  was obtained by calcination of  $Co(NO_3)_2 \cdot 6H_2O$  (Sigma-Aldrich, 98%) at 300 °C for 12 h followed by a temperature ramp of 2 °C min<sup>-1</sup> to 400 °C and then continued calcination for 2 h at 400 °C.

To determine the temperature required for reducing Co<sub>3</sub>O<sub>4</sub>, the reduction process was tracked with a microbalance (Rubotherm, Germany). Typically, 160 mg of Co<sub>3</sub>O<sub>4</sub> was loaded in the microbalance and a gas flow mixture of 30 mL min<sup>-1</sup> H<sub>2</sub> and 45 mL min<sup>-1</sup> He at 1 bar was supplied 3 h before the reduction to remove the air. A heating ramp of 2 °C min<sup>-1</sup> from 25 °C to 400 °C was then applied and the mass loss due to reduction was monitored with an accuracy of 1 μg.

 $Co_x(CoO)_{1-x}$  (0 < x < 1) catalyst synthesis. The actual catalyst samples used in this study were prepared by reduction of  $Co_3O_4$  in the reaction chamber (HVC, Harrick Scientific) of a DRIFTS instrument (Bruker Tensor 27) in a mixture of H<sub>2</sub>/He (flow rate 6 mL min<sup>-1</sup>/4 mL min<sup>-1</sup>). Control of the reduction temperature and time allowed us to obtain samples with different Co ratios in a reproducible manner. During reduction, the pressure in the chamber was kept constant at 1 bar by a back

pressure valve installed at the exhaust side of the reaction chamber. A quadrupole mass spectrometer (MS, Pfeiffer OmniStar 320) was connected with the DRIFTS reaction chamber to analyze the composition of reactant and product gases using a Faraday detector.

#### 5.2.2 Characterization

MS meaurements. The amount of  $H_2$  consumed during the reduction was determined by MS analysis. This allowed us to quantify the removal of O atoms from  $Co_3O_4$  during the reduction process and thus obtain the bulk composition of the catalyst.

*XPS core level measurements*. To quantify the fraction of metallic cobalt on the surface of the  $Co_x(CoO)_{1-x}$  catalysts, samples were transferred to the XPS through a glovebox to avoid surface oxidation by the air. The XPS is equipped with a dual anode X-ray source and a Phoibos 100 (SPECS GmbH) hemispherical energy analyzer. The Mg  $K_\alpha$  (1253.6 eV) source was used for this study. The survey scan and narrow scan were collected at 90 eV and 20 eV pass energy, respectively. The oxidation states of partially oxidized Co samples were deconvoluted using CasaXPS software. Separate measurements of Co, CoO and Co<sub>3</sub>O<sub>4</sub> were used to provide the standard peaks used for the deconvolution.

NAP-XPS valence band measurements. In addition to the core level XPS spectra, we performed measurements of the valence band to probe which components of our samples are catalytically active. The above XPS instrument did not have sufficient resolution for this purpose. Instead, we used a NAP-XPS (SPECS GmbH) instrument. An Al  $K_{\alpha}$  (1486.6 eV) monochromatic X-ray source and a Phoibos 150 NAP hemispherical energy analyzer were used. Survey scans were taken with 50 eV pass energy and narrow scans with 10 eV pass energy. Unfortunately, we could not transfer the samples to this system without exposure to air. To overcome this difficulty we reduced air exposed sample in-situ in the NAP-XPS using  $H_2$ . This allowed us to study partially reduced samples and measure the valence band of the Co and CoO components. The details of this procedure are given in section 3.6.

 $N_2$  adsorption-desorption isotherm. The specific surface areas were evaluated using a BELSORP mini system (MicrotracBEL Corp., Japan) by nitrogen adsorption—desorption isotherms at 77 K, and was calculated by the Brunauer–Emmet–Teller (BET) method from the built-in software. The empty tube was measured at the same time of the measurements of the samples in order to eliminate the dead volume. The results were listed in Table 1. As we obtained small values of BET surface areas,

we measured the nitrogen adsorption-desorption isotherm again in another instrument, Micromeritics Tristar 3000, to be sure of the obtained values. The  $CO_2$  adsorption-desorption isotherm was measured as well at room temperature using Micromeritics Tristar 3000 instrument for evaluating the  $CO_2$  adsorption amount. The BET surface areas and  $CO_2$  adsorption amounts from the Micromeritics Tristar 3000 instrument were listed in Table S1. As the samples were transferred through a glovebox, no activation was applied before the measurements. The accuracies of the measurements were 0.01  $cm^2 mg^{-1}$ .

*TEM*. The morphology of the samples was visualized in TEM (FEI Tecnai Spirit microscope) operating at 120 kV. The ultrasonic dispersion in ethanol was applied for the sample preparation. The dispersed samples with ethanol were dropped onto the TEM carbon/copper grids and dried in air.

#### 5.2.3 CO<sub>2</sub> hydrogenation

CO<sub>2</sub> hydrogenation reaction on Co<sub>x</sub>(CoO)<sub>1-x</sub> samples was carried out in an operando surface–gas analysis system. The reactor is a DRIFTS reaction chamber, which at the inlet is connected to a mass flow controller system, and at the outlet is connected to an MS and GC (SRI 8610C). The GC was equipped with a flame ionization detector (FID) and a thermal conductivity detector (TCD). This setup allows gathering surface information by DRIFTS while quantifying the gases by MS and GC. For CO<sub>2</sub> hydrogenation reaction, typically, a Co<sub>x</sub>(CoO)<sub>1-x</sub> sample (160 mg) was compressed into a pellet with 4 mm high and 6 mm diameter. In general, the inlet gas was a mixture of CO<sub>2</sub>/H<sub>2</sub>/He with flow rates of 1.5 mL min<sup>-1</sup>/6 mL min<sup>-1</sup>/4 mL min<sup>-1</sup>, respectively, at 1 bar. The reaction temperature was programmed from 20 to 350 °C at a heating rate of 2 °C/min. The background of the infrared spectra was taken on the as-reduced sample surface (or 3 h of H<sub>2</sub>/He flushed surface for Co<sub>3</sub>O<sub>4</sub>) in H<sub>2</sub>/He flow at room temperature. The infrared spectra were collected every 10 min with spectroscopic resolution of 2 cm<sup>-1</sup>. The MS determined the mass range of 0–50 amu with a rate of 0.5 s per mass unit. The GC took 9 min for each spectrum, with a cooling interval of 4 min between each scan.

# 5.2.4 $CO_2 + H_2$ adsorption

 $CO_2 + H_2$  co-adsorption on the samples at room temperature was measured with TPD-MS in a flow gas condition where He was used as the carrier gas. The experimental steps include: (1)  $Co_3O_4$  sample was loaded in a quartz tube in air and reduced in  $H_2/He$  flow (6 mL min<sup>-1</sup>/4 mL min<sup>-1</sup>) in TPD-MS to obtain the fresh  $Co_x(CoO)_{1-x}$  sample; (2) the as-prepared  $Co_x(CoO)_{1-x}$  sample was flushed by He for one hour; (3) 10 mL min<sup>-1</sup>  $CO_2$  and 10 mL min<sup>-1</sup>  $H_2$  gases were applied for 20 min; (4) He

flush for at least 40 min to remove the gas phase  $CO_2$  and  $H_2$ ; (5) heating started to trigger the desorption. The working pressure on the sample was 1 bar. The spectra were taken using a Faraday detector at heating rates of 5, 10, 15, 25, and 40 °C min<sup>-1</sup>.

# 5.3 Results and Discussion

#### 5.3.1 Sample synthesis and characterization

It is generally accepted that the reduction of Co<sub>3</sub>O<sub>4</sub> proceeds in a two-step process: Co<sub>3</sub>O<sub>4</sub> to CoO, and CoO to Co. However, the reduction temperature of each step is strongly influenced by the properties of Co<sub>3</sub>O<sub>4</sub> [13,24–27]. To determine the reduction process of our Co<sub>3</sub>O<sub>4</sub> sample, a microbalance was used to monitor the weight loss during the reduction. As shown in Figure 5.1, the mass loss shows that Co<sub>3</sub>O<sub>4</sub> starts to be reduced at around 200 °C. Until 300 °C, approximately 7% mass loss can be observed, indicating the removal of one oxygen atom per Co<sub>3</sub>O<sub>4</sub> molecule to form CoO. Above 300 °C, the slope of the mass loss curve increases and finally the mass loss reaches a plateau of 27% at 370 °C, which can be ascribed to the complete reduction of Co<sub>3</sub>O<sub>4</sub> to metallic cobalt. This analysis demonstrates that through controlling the reduction temperature and the reduction time, we can obtain samples with different extents of partially reduced Co.

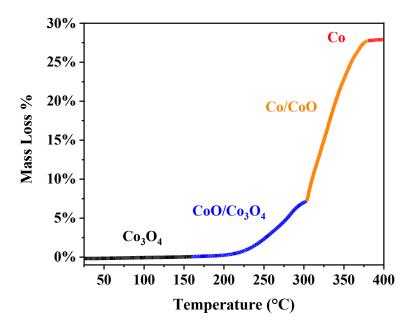


Figure 5.1. Mass loss of Co<sub>3</sub>O<sub>4</sub> sample when reduced in H<sub>2</sub>/He flow with a heating rate of 2 °C min<sup>-1</sup> in a microbalance.

Using the microbalance results as a guidance to find the temperature to use for reduction, we prepared the catalyst samples in situ in the DRIFTS reaction chamber. This avoided exposing the samples to

air before running reactions. We produced three  $Co_x(CoO)_{1-x}$  samples at different conditions. The amount of reduced Co in each sample was determined by quantifying the H<sub>2</sub> consumed during the reduction. Details on the experimental procedures are given in Section S5.1 and Figure S5.1. The method of preparation was very reproducible as shown in Figure S5.2. Table 5.1 summarizes the results of the sample preparation for three sets of temperature-time processing conditions. The table gives the Co/(Co+CoO) ratios as determined by hydrogen consumption from the MS analysis as well as data on this ratio obtained by XPS and surface area determined by BET. It is clear that higher reduction temperatures lead to a higher fraction of reduced Co. The reduction time at a given temperature was chosen to obtain a stable ratio of Co/(Co+CoO). XRD patterns of  $Co_x(CoO)_{1-x}$  also confirm the reduction of  $Co_3O_4$  to metallic cobalt and CoO (Figure S5.3).

Table 5.1.  $H_2$  reduction conditions, metal ratio and specific surface area of  $Co_x(CoO)_{(1-x)}$  samples.

Sample	H <sub>2</sub> reduction conditions	Co/(Co + CoO) ratio from MS	Co/(Co + CoO) ratio from XPS	BET surface area (m <sup>2</sup> g <sup>-1</sup> )
Co <sub>3</sub> O <sub>4</sub>	N/A	0	0	18.59
$Co_{0.2}$	200 °C 10 h	$0.16 \pm 0.01$	0.19	13.92
$Co_{0.5}$	300 °C 5 h	$0.57 \pm 0.05$	0.51	5.62
Co <sub>0.8</sub>	400 °C 4 h	$0.79 \pm 0.04$	0.75	2.09

Further verification of the oxidation states of  $Co_x(CoO)_{1-x}$  was given by XPS measurements via airfree transfer of the samples from the DRIFTS chamber to a glovebox attached to the XPS. As shown in Figure 5.2, the as-prepared  $Co_3O_4$  sample shows typical nonsymmetric  $2p_{3/2}$  and  $2p_{1/2}$  peaks at 780.0 and 795.1 eV, respectively, with additional weak satellite peaks, confirming that the surface composition is  $Co_3O_4$ . The  $Co_x(CoO)_{1-x}$  samples were deconvoluted with standard Co and CoO spectra, where the  $2p_{3/2}$  and  $2p_{1/2}$  peaks of metallic cobalt located at 778.7 and 793.7 eV, respectively, and those of CoO located at 781.1 and 796.8 eV. The ratios of the peak areas showed that the fractions of Co were 19%, 51%, and 75% for the three  $Co_x(CoO)_{1-x}$  samples. The slight difference in the value of Co fraction compared to the results calculated from  $H_2$  consumption is likely due to that XPS is surface sensitive while  $H_2$  consumption is bulk sensitive. Referring to the quantifications from both XPS and  $H_2$  consumption, we name the samples as  $Co_{0.2}$ ,  $Co_{0.5}$ , and  $Co_{0.8}$ .

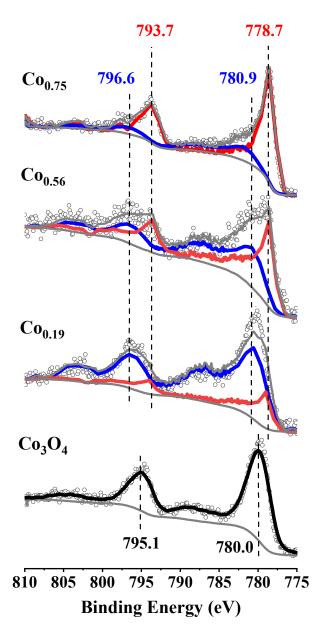


Figure 5.2. XPS of Co  $2p_{3/2}$  and  $2p_{1/2}$  peaks of synthesized samples. Black, blue and red lines represent the deconvoluted signals of  $Co_3O_4$ , CoO and Co states, respectively. Gray and gray dash lines are the total fitted spectra and baseline, respectively. The peaks were fitted by using the standard spectra of  $Co_3O_4$ , CoO and Co.

The morphology of the samples was visualized using TEM. As shown in Figure 5.3, all four samples show elongated particle shape and the particle width increases from 20 to 100 nm along with increasing metallic cobalt concentration. The increased particle size originates from the sintering of metallic cobalt through high temperature reduction treatment. BET measurements were used for evaluating the specific surface area (Table 5.1). In agreement with the TEM image, the specific surface area decreases with the increased ratio of metallic cobalt.

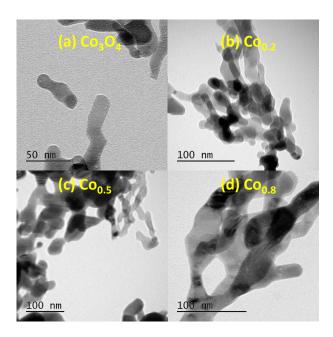


Figure 5.3. TEM of prepared samples. (a) Co<sub>3</sub>O<sub>4</sub>, (b) Co<sub>0.2</sub>, (c) Co<sub>0.5</sub>, (d) Co<sub>0.8</sub>.

# 5.3.2 Activity in the CO<sub>2</sub> conversion

The activities of the  $Co_x(CoO)_{1-x}$  samples for the  $CO_2$  hydrogenation reaction were evaluated in the DRIFTS chamber under a CO<sub>2</sub>/H<sub>2</sub>/He gas flow with a programmed temperature ramp. To check the reactivity of the samples in a wide temperature range, we heated the reaction chamber from room temperature up to a high temperature of 350 °C. Figure 5.4(a) shows the CO<sub>2</sub> conversion, as measured by the consumption of CO<sub>2</sub>, as a function of reaction temperature. The trend of CO<sub>2</sub> conversion over the different samples is in the order  $Co_{0.2} > Co_{0.5} > Co_{0.8} > Co_3O_4$  at any given temperature below 280 °C. For instance, 63%, 53%, and 23% CO<sub>2</sub> are converted at 250 °C on Co<sub>0.2</sub>, Co<sub>0.5</sub>, and Co<sub>0.8</sub> samples, respectively. The CO<sub>2</sub> conversion reaches highest value with 98%, 99%, and 93% at 350 °C on Co<sub>0.2</sub>, Co<sub>0.5</sub>, and Co<sub>0.8</sub> samples, respectively. The reason of the similar high conversion at this high temperature could be that the reaction approaches the thermodynamic limit. The same trend was found in the yield of the main product CH<sub>4</sub> (Figure S5.4). The yields are commensurate as the CO<sub>2</sub> conversion. For comparison, the conversions obtained here are higher than the conversions on the commercial 0.5 wt% Ru/Al<sub>2</sub>O<sub>3</sub> catalyst at the same applied pressure at 1 bar and space velocity at 5300 h<sup>-1</sup> as in this work [3]. The maximum conversion of CO<sub>2</sub> on that Ru/Al<sub>2</sub>O<sub>3</sub> is reported to be 75% and at 380 °C, where 75% conversion is found at 260 °C on our Co<sub>0.2</sub> sample. These conversions are also much higher than the reported <60% CO<sub>2</sub> conversion on the 3% Ru/Al<sub>2</sub>O<sub>3</sub> and 20% Ni/Al<sub>2</sub>O<sub>3</sub> samples at the temperature of 350 °C and space velocity of 55000 h<sup>-1</sup> [28]. The details of CO<sub>2</sub> conversion, CH<sub>4</sub> yield, CH<sub>4</sub> selectivity, and CH<sub>4</sub> production rate per surface area via normalizing with BET surface area at 200, 225, 250, 275, 300, 325, and 350 °C are showed in Section S5.3 Figure S5.5. The CO<sub>2</sub> conversion and CH<sub>4</sub> yield and selectivity have similar trends as the CO<sub>2</sub> conversion profile shown in Figure 5.4(a). The CH<sub>4</sub> production rate per surface area inverts this trend, plausibly indicating that the Co is the location where the hydrogenation step takes place.

In addition, we tested the reactivity of the  $Co_{0.2}$  sample for long-time  $CO_2$  hydrogenation reaction (Figure S5.6). We found that the  $CO_2$  conversion to  $CH_4$  remains stable above 80% after 3 days in stream, demonstrating the sample is long-time active. Therefore, the  $Co_x(CoO)_{1-x}$  samples are highly active and efficient for the Sabatier reaction. The differences in the reactivity of these partially reduced samples imply a dependence on the initial state of the catalysts, although the samples could have been further reduced at the high reaction temperature. We believe the reactivity of the  $Co_3O_4$  sample at high temperature is due to some limited partial reduction of this sample in the  $CO_2/H_2/He$  gas flow.

Strikingly, these partially reduced samples are quite active at low temperatures. The onset temperatures of  $CO_2$  conversion (2% conversion) increase in the order  $Co_{0.2} < Co_{0.5} < Co_{0.8} < Co_3O_4$ , at temperatures of 160, 178, 202, and 275 °C, respectively (Figure 5.4(b)). We compared the  $CO_2$  conversion extent at temperatures of 180, 200, and 220 °C on these samples. As shown in Figure 5.4(c),  $Co_{0.2}$  sample shows activity at 180 °C while the other samples are not active at this low temperature.  $Co_{0.2}$  sample converts 16% and 31%  $CO_2$  at 200 and 220 °C, respectively at the applied space velocity of 5300 h<sup>-1</sup>. Note that decreasing the space velocity will increase the conversion. These conversions are higher than those on all the rest of the samples at the same temperatures. These results verify our hypothesis that there is an optimal ratio of metal/metal oxide to obtain the highest reactivity toward  $CO_2$  hydrogenation.

The rate constants of CH<sub>4</sub> production were calculated with the assumption of an overall first-order reaction of CO<sub>2</sub> to CH<sub>4</sub> [28–32]. As shown in Figure 5.4(d), the highest rate constant occurs on Co<sub>0.2</sub> sample at the given temperatures, and decreases gradually when the metallic cobalt concentration increases (excluding the Co<sub>3</sub>O<sub>4</sub> sample).

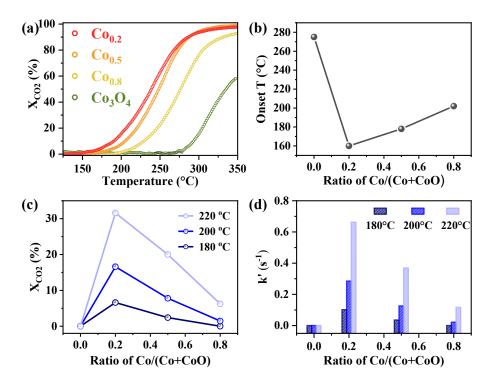


Figure 5.4. (a) CO<sub>2</sub> conversion as a function of temperature, (b) onset temperature of 2% CO<sub>2</sub> conversion, (c) CO<sub>2</sub> conversion at 180, 200, and 220 °C, and (d) CH<sub>4</sub> production rate at 180, 200, and 220 °C over the Co<sub>3</sub>O<sub>4</sub>, Co<sub>0.2</sub>, Co<sub>0.5</sub> and Co<sub>0.8</sub> samples.

Small amounts of CO and C<sub>2</sub>H<sub>6</sub> were also detected by MS and GC, and GC data were used to quantify the yield (Figure S5.7). The maximum yield of C<sub>2</sub>H<sub>6</sub> increases for samples with increasing Co/(Co+CoO) ratio, opposite to CH<sub>4</sub> yield (Figure S5.8). C<sub>2</sub>H<sub>6</sub> yield is around five-fold larger than CO yield on Co<sub>x</sub>(CoO)<sub>1-x</sub> samples, but threefold lower than CO yield on Co<sub>3</sub>O<sub>4</sub> (Figure S5.7). These results suggest that C<sub>2</sub>H<sub>6</sub>, generated through carbon chain growth, is preferably produced on the samples with high Co concentration. Hence, the metallic site, instead of the oxide site, is responsible for the carbon-carbon coupling. This is in agreement with results for the Fischer–Tropsch reaction where metallic cobalt is the active site for carbon chain growth [33]. On the other hand, pure Co<sub>3</sub>O<sub>4</sub> surface produces more CO than C<sub>2</sub>H<sub>6</sub>, suggesting that a reversed-water-gas-shift reaction is more favorable than the carbon-carbon coupling on the pure oxide surface.

The activation energy of CH<sub>4</sub> production,  $E_a^f(CH_4)$ , was determined using the Arrhenius equation. Details of the calculations based on the measured MS data are given elsewhere [23]. Figure 5.5 shows the Arrhenius plot and the values of  $E_a^f(CH_4)$ . The  $E_a^f(CH_4)$  over the samples increases in the order of  $Co_{0.2} < Co_{0.5} < Co_{0.8} < Co_{3}O_{4}$ . Thus, we see that samples with lower activation energies have lower

onset reaction temperatures and higher CO<sub>2</sub> conversions before approaching to the thermodynamic limit.

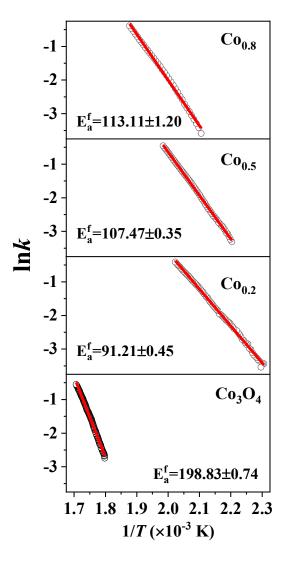


Figure 5.5. Arrhenius plot of CH<sub>4</sub> formation in the CO<sub>2</sub> conversion range of 2%–30% for Co<sub>0.5</sub>, Co<sub>0.5</sub>, Co<sub>0.8</sub>, and Co<sub>3</sub>O<sub>4</sub> samples. The corresponding temperature ranges are 160–220 °C for Co<sub>0.2</sub> sample, 180–231 °C for Co<sub>0.5</sub> sample, 202–260 °C for Co<sub>0.8</sub> sample, and 283–313 °C for Co<sub>3</sub>O<sub>4</sub> sample.

#### 5.3.3 Sample stability during hydrogenation

As the CO<sub>2</sub> hydrogenation environment is highly reductive, there is an issue of the stability of the samples during the hydrogenation reaction. For temperatures well below those used to prepare the samples, we are confident that the composition is stable, since the preparation reaction was run long time enough for the composition to reach a constant value as confirmed by the ceasing in hydrogen

consumption (Figure S5.1). Hence, the measurements of onset temperatures for the reaction (Figure 5.4(a, b)) and reaction rate at low temperatures (Figure 5.4(c, d)) should correspond to the initial compositions of the samples.

To check the sample stability after high temperature reaction, the oxidation states of the samples after CO<sub>2</sub> hydrogenation were further investigated using XPS. We found that the Co fraction in the Co<sub>0.2</sub>, Co<sub>0.5</sub>, and Co<sub>0.8</sub> samples increased to 25%, 74%, and 86%, respectively (Figure S5.9). Thus, the samples maintained the partial oxidation states and the Co fraction followed the same order as that of the fresh samples.

Table 5. 2. Activation energies of CH<sub>4</sub> formation ( $E_a^f(CH_4)$ ), CO<sub>2</sub> desorption from CO<sub>2</sub> + H<sub>2</sub> co-adsorption ( $E_a^{d1}(CO_2)$ ) and  $E_a^{d2}(CO_2)$ ), the main adsorption products on the sample surfaces and the corresponding main infrared peaks, i.e., O-C-O asymmetric stretching ( $v_{as}$ (O-C-O)).  $E_a^{d1}(CO_2)$  and  $E_a^{d2}(CO_2)$  refer to the first and second peak in the TPD spectrum, respectively.

Sample	$E_{\rm a}^{\rm f}({ m CH_4})$	$E_{\rm a}^{\rm d1}({\rm CO_2})$	$E_{\rm a}^{\rm d2}({\rm CO_2})$	Main adsorption species	ν <sub>as</sub> (O-C-O)
	$(kJ \text{ mol}^{-1})$	$(kJ mol^{-1})$	$(kJ mol^{-1})$		(cm <sup>-1</sup> )
Co <sub>3</sub> O <sub>4</sub>	$198.83 \pm 0.74$	N/A	N/A	HCOO <sup>-*</sup> -Co <sub>3</sub> O <sub>4</sub>	1570
$Co_{0.2}$	$91.21 \pm 0.45$	$38.04\pm3.08$	$76.09 \pm 12.45$	HCOO-*-MOI; CO <sub>3</sub> <sup>2-</sup> *-CoO	1620;
					1520
$Co_{0.5}$	$107.47 \pm 0.35$	$44.47\pm4.02$	$129.17 \pm 9.32$	HCOO-*-MOI	1620
$Co_{0.8}$	$113.11 \pm 157$		_	_	_

#### 5.3.4 Surface reaction mechanisms

To understand the reason why the samples with higher CoO concentration have lower activation energy of CO<sub>2</sub> to CH<sub>4</sub> conversion, we analyzed the surface species recorded by DRIFTS in the operando experiment. The adsorbed species were identified according to our previous work on IR peak assignments and intermediates identification [17,18]. The assigned vibrations of the main IR peaks are listed in Table 2. As shown in Figure 5.6(a), after CO<sub>2</sub> + H<sub>2</sub> co-adsorption, on the Co<sub>0.2</sub> surface we found formate located at the metal–oxide interface (HCOO<sup>-\*</sup>–MOI) and carbonate located on the oxide surface (CO<sub>3</sub><sup>2-\*</sup>–CoO); on the Co<sub>0.5</sub> surface, HCOO<sup>-\*</sup>–MOI was the main adsorption product; on the Co<sub>0.8</sub> surface, no visible adsorbed species was found; on Co<sub>3</sub>O<sub>4</sub> surface, oxide-bound formate (HCOO<sup>-\*</sup>–Co<sub>3</sub>O<sub>4</sub>) was observed. The peaks with wavenumbers below 1500 cm<sup>-1</sup> were not listed specifically, but they are the corresponding O–C–O symmetric and C–H bending modes according to our previous assignment [18]. The peak positions are very similar as those observed on Ru/Al<sub>2</sub>O<sub>3</sub>

in our previous work [18]. The formation of formate could originate from  $CO_2$  interaction with the adsorbed  $H_2$  on the under-coordinated cobalt atom on the interfacial CoO and/or on the metallic site of Co [34,35]; and the carbonate could be formed from  $CO_2$  adsorption on the metal oxide surfaces [36,37]. The peak intensities of the adsorption species are the strongest on  $Co_{0.2}$  sample, implying an enhanced amount of the adsorbed species on this sample. Moreover, while the formate species formed on all the sample surfaces,  $CO_3^{2-*}$ —CoO formed exclusively on the  $Co_{0.2}$  surface. This suggests that  $Co_{0.2}$  sample might promote additional  $CO_2$  adsorption via forming an additional chemisorption product on the CoO site.

To confirm the observations in IR,  $CO_2$ -TPD was performed. Figure 5.6(b) shows the  $CO_2$  desorption spectra (m/z = 44) of the three  $Co_x(CoO)_{1-x}$  samples. The  $Co_{0.2}$  TPD shows two peaks ~110 °C and 200 °C and a weak peak at ~320 °C;  $Co_{0.5}$  shows three clear peaks at ~100 °C, 180 °C, and 260 °C respectively;  $Co_{0.8}$  is different showing only two desorption peaks at ~160 °C, and 270 °C respectively. It is common that  $CO_2$  desorbs at room temperature on metal oxide surfaces [38–42], while below 0 °C zero on metal surfaces [43–46]. Thus, these desorption peaks are ascribed to the  $CO_2$  adsorbed on the  $CoO_2$ . With the increase of metallic cobalt fraction, the peak intensity of  $CO_2$  desorption becomes weaker, indicating a decreasing amount of adsorbed  $CO_2$ .

Note that the desorption peak intensity on the Co<sub>0.2</sub> sample is more than ten-fold higher than that for the other samples. The intensity trend of the TPD measurements is consistent with the DRIFTS result of the CO<sub>2</sub> adsorption. However, the differences in the amount of CO<sub>2</sub> adsorbed on the three samples are much larger than the differences of their BET surface areas. While BET was measured using N<sub>2</sub> isotherm and reflects physisorption properties, CO<sub>2</sub> adsorption embodies chemisorption properties of the reactive surface, as CO<sub>2</sub> adsorption is used as an indicator of Lewis basicity of the surface [42,47,48]. Higher CO<sub>2</sub> adsorption capacity implies more adsorption sites, and stronger CO<sub>2</sub> binding implies more basic property of the surface. Therefore, the sample with more CoO component adsorbing more CO<sub>2</sub> further confirms that CoO acts as active sites for CO<sub>2</sub> adsorption. This also explains the exclusive existence of CO<sub>3</sub><sup>2-\*</sup>-CoO on the Co<sub>0.2</sub> sample observed in DRIFTS: more chemisorbed CO<sub>2</sub> increased the concentration of CO<sub>3</sub><sup>2-\*</sup> species on CoO sites via a CO<sub>2</sub>-surface O combination.

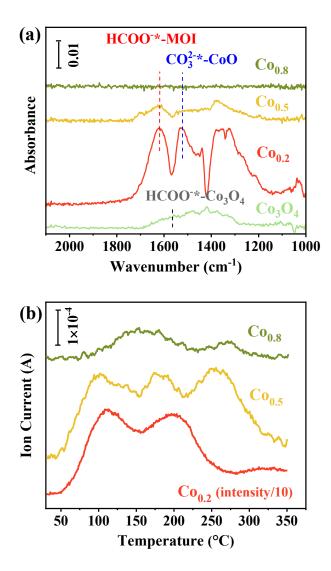


Figure 5.6. (a) DRIFTS spectra during  $CO_2 + H_2$  co-adsorption at 100 °C, revealing the presence of formate and carbonate species. (b)  $CO_2$  desorption measured using TPD-MS (m/z = 44) from  $CO_2 + H_2$  co-adsorption with a heating rate of 15 °C min<sup>-1</sup>, and the intensities are normalized with He intensity.

We also checked the signals of  $H_2$  and  $CH_4$  from the TPD-MS measurement. As shown in Figure S5.10, only very weak signals of  $H_2$  were found and no observable  $CH_4$  was produced. These phenomena hint that very limited amount of  $H_2$  adsorbed on all these sample surfaces, and the hydrogenation of  $CO_2$  either could not take place at this very low concentration of reactant gases or produced scanty products that below the detection limit.

The CO<sub>2</sub> binding energies were evaluated using the activation energies of CO<sub>2</sub> desorption,  $E_a^d(CO_2)$  determined from TPD data at various heating rates (Table 5.2, Figure S5.11) [49,50],

$$\ln \frac{T_p^2}{\kappa} = \ln \frac{E_a^d}{R} - \ln k_0 + \frac{E_a^d}{R \cdot T_p},$$

in which  $E_a^d$  is the activation energy of desorption,  $T_p$  is the maximal temperature of desorption,  $\kappa$  is the heating rate, R is the gas constant, and  $k_0$  is a constant.

From the first desorption peak, we find  $E_a^{d1}(CO_2) = 38$  and  $44 \text{ kJ mol}^{-1}$  on  $Co_{0.2}$  and  $Co_{0.51}$  surfaces, respectively.  $E_a^{d2}(CO_2)$ , from the second desorption peak, = 76 and 129 kJ mol<sup>-1</sup> on  $Co_{0.2}$  and  $Co_{0.5}$  surfaces, respectively.  $E_a^{d}(CO_2)$  is not reported for the  $Co_{0.8}$  sample due to the very weak desorption peaks and associated large uncertainty. The values of  $E_a^{d1}(CO_2)$  and  $E_a^{d2}(CO_2)$  are comparable to the reported  $CO_2$  binding energies on pristine and defective metal oxide surfaces, respectively [51,52]. Therefore, we ascribe the low temperature desorption as originated from  $CO_2$  adsorbed on the pristine CoO surface, which leads to similarly low activation energy of desorption on both  $Co_{0.2}$  and  $Co_{0.5}$  surfaces; the high temperature desorption as from  $CO_2$  adsorbed on defective CoO surface, which leads to much stronger activation energy of desorption. The  $E_a^{d2}(CO_2)$  on  $Co_{0.2}$  sample is nearly twofold lower than that on  $Co_{0.5}$  sample, suggesting a moderate adsorption of  $CO_2$  on  $Co_{0.2}$  surface compared to strong adsorption of  $CO_2$  on  $Co_{0.5}$  surface. As explained above, the stronger  $CO_2$  binding indicates a stronger Lewis basic surface. Hence, the  $Co_{0.5}$  surface is more basic than the  $Co_{0.2}$  surface, probably due to a higher concentration of metallic cobalt of the  $Co_{0.5}$  sample.

It is interesting that more  $CO_2$  adsorbs on the  $Co_{0.2}$  surface than on the  $Co_{0.5}$  surface although the binding energy is actually larger for the  $Co_{0.5}$  surface. We can understand this by noting that if we are below the desorption temperature, the capacity of the surface to adsorb  $CO_2$  is related to the number of binding sites. Since  $Co_{0.2}$  has more CoO sites, it can bind more  $CO_2$ .

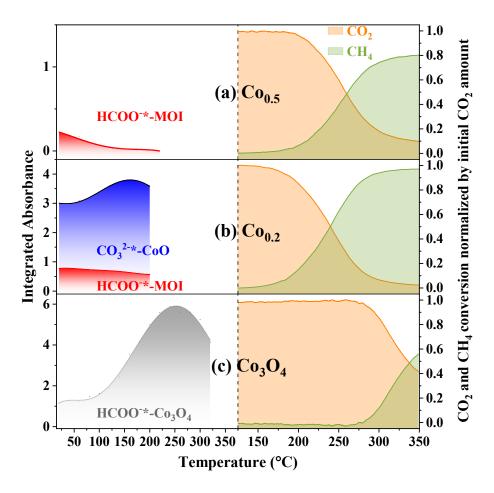


Figure 5.7. The evolution of adsorbed species and  $CO_2$  to  $CH_4$  conversions during  $CO_2$  hydrogenation on (a)  $Co_{0.5}$ , (b)  $Co_{0.2}$ , (c)  $Co_3O_4$ . Left panels were data from DRIFTS, and right panels were data from MS.

The observation of enhanced adsorption of CO<sub>2</sub> on the Co<sub>0.2</sub> sample is sufficient to explain the improved catalytic performance of Co<sub>0.2</sub> because the adsorbed species might be byproducts rather than reaction intermediates. To check the reactivity of the adsorbed species, we analyzed the evolution of these adsorbed species using our previously developed method [18]. As shown in Figure 5.7(a, b), HCOO<sup>-\*</sup>–MOI was reduced almost linearly upon heating on both Co<sub>0.2</sub> and Co<sub>0.5</sub> samples, indicating this species is a reaction intermediate. CO<sub>3</sub><sup>2-\*</sup>–CoO on Co<sub>0.2</sub> surface (Figure 5.7(b)) and HCOO<sup>-\*</sup>–Co<sub>3</sub>O<sub>4</sub> on Co<sub>3</sub>O<sub>4</sub> surface (Figure 5.7(c)) increased while heating, but started to decrease when CH<sub>4</sub> started to be formed. Thus, these two species were also reaction intermediates. Unfortunately, water produced in the reaction condensed on the windows and gave strong IR interference. We were only able to track the surface species up to 200 °C for Co<sub>0.2</sub> and Co<sub>0.5</sub> samples, and 320 °C for Co<sub>3</sub>O<sub>4</sub> sample. However, Liu and the co-authors have proved using theoretical calculations that the wet surfaces favored the protonation of carbonate through interacting with the neighboring hydroxyl

groups to form bicarbonate [36,37]. The bicarbonate is an intermediate of CH<sub>4</sub> formation from CO<sub>2</sub> hydrogenation reaction according to our previous work and the other report [17,53].

These results affirm that the adsorption of  $CO_2$  has a positive effect on the  $CO_2$  methanation reaction because all the adsorbed species are consumed. Better adsorption of  $CO_2$  is related to an improved catalytic performance of the sample. This could also be the reason for the differences in the activation energies of  $CH_4$  formation, where  $E_a^f(CH_4)$  is the lowest on  $Co_{0.2}$  sample. This further indicates that  $CO_2$  adsorption step is the rate determining step of the overall hydrogenation reaction.

It is interesting to compare these results with our previous results for CO<sub>2</sub> methanation on Ru/Al<sub>2</sub>O<sub>3</sub> [17,18]. There, CO<sub>3</sub><sup>2-\*</sup> and HCOO<sup>-\*</sup> on the oxide site are byproducts, not reaction intermediates as they are here. This confirms our previous supposition of surface-structure sensitive reactivity of the adsorbed species.

#### **5.3.5** Surface electronic structure

A further mechanistic investigation should reveal whether the CoO component of our catalysts participated the catalytic reaction. Considering that heterogeneous catalysis proceeds by electron transfer between the adsorbates and the surface atoms, we can get this information on the activity of CoO by measuring the valence band maximum (VBM) of the surface electronic states. For this measurement, we used a higher resolution XPS which did not allow us to transfer samples without air exposure. Thus, we transferred a Co<sub>0.8</sub> sample to the NAP-XPS system through air. This sample was then reduced at 350 °C with 0.4 mbar H<sub>2</sub> flow in the NAP-XPS sample preparation chamber. We used XPS core level spectra to determine the composition of the sample after transfer and after 1 h and 2 h of H<sub>2</sub> reduction (Figure S12). After 2h, the sample was fully reduced and we used this to provide standard core level and valence band spectra for Co for deconvolution with the CasaXPS software [26,54]. After 1 h, the sample was partially reduced with composition of 58% Co and 42% CoO. The core level spectrum of this partially reduced sample is shown in Figure 8(a). A deconvoluted valence band spectrum is shown in Figure 8(b). The fraction of Co from the valence band deconvolution is 47%, as compared to 58% from the core level deconvolution. The difference is not completely understood and may be related to differing surface sensitivity and/or to deconvolution error. The onset of the edge of the valence band for CoO is 1.15 eV below the Fermi level, as indicated by the line in Figure 8(b). This value is so large that at the temperatures used in this work, it is not possible to thermally excite a sufficient number of electron hole pairs to produce catalytic activity. Although there is a "tail" extended to Fermi level, the population is very small compared to the abundantly electronic states of Co.

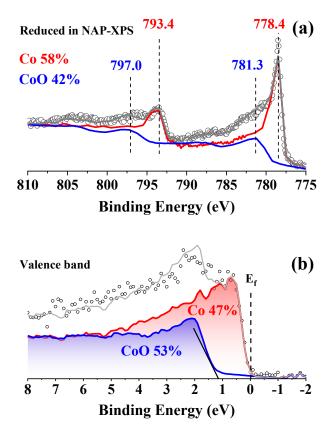


Figure 5.8. (a) Core-level XPS and (b) valence band of the partially reduced sample (58% Co and 42% CoO) prepared and measured in NAP-XPS. The black line which is crossed at 1.15 eV of x-axis shows the onset of the edge of the valence band of CoO. Fermi level ( $E_f$ ) is at 0 eV.

Therefore, we conclude that the CoO component does not contribute to the hydrogenation process. In contrast, the Co component has high electron density near the Fermi level, suggesting that the excited electrons for the hydrogenation steps are offered by Co. This is in line with the indication from  $CH_4$  production rate per surface area discussed in Section 5.3.2 that the rate per surface area increased with the increasing concentration of Co. Species which are adsorbed on the CoO sites contribute to the catalysis through migration from CoO to the interfacial Co atoms. This is the same as that found on the on  $Ru/Al_2O_3$  [17].

Here we envision that, when Co concentration decreased to a critical point, the hydrogenation will be suppressed because of the lack of electronically active center. We speculate this critical point is below 5 wt% ( $\sim$  6% molar concentration) referring to the research on Ru/Al<sub>2</sub>O<sub>3</sub> catalysts where

increasing Ru loading from 0.1 wt% to 5 wt% on Al<sub>2</sub>O<sub>3</sub> facilitates the CH<sub>4</sub> yield and selectivity in CO<sub>2</sub> hydrogenation reaction [55]. However, the in situ phase change method here used would be improper to synthesize such low concentration of Co. Different synthetic method, such as chemical or physical deposition, could be applied for extending this investigation.

In addition, we noticed that the differences in the overall kinetics of CO<sub>2</sub> conversion (Figure 5.4(d)) are smaller than those in the intensities of CO<sub>2</sub> adsorption/desorption (Figure 5.6) on these samples. This could be understood that the samples with higher Co concentration could reduce the migration distance of the adsorbed species, and reserve more available electrons for the hydrogenation steps. These effects compensated partially the drawbacks of less CO<sub>2</sub> adsorption and reduced the differences in the overall kinetics of CO<sub>2</sub> conversion.

## 5.4 Conclusions

We have shown a facile method to synthesize "self-supported" cobalt nanoparticles composed of  $Co_x(CoO)_{1-x}$  with different ratios of x = Co/(Co+CoO) via reduction of precursor  $Co_3O_4$  nanoparticles in  $H_2$  gas flow to investigate the relation between the metal/metal oxide fractions and their catalytic properties. Samples with the metal ratios of x = 0.2, 0.5 and 0.8 were obtained. The samples show very high activity in the Sabatier reaction. Super high conversions of  $CO_2$  reach 98%, 99%, and 93% on  $Co_{0.2}$ ,  $Co_{0.5}$ , and  $Co_{0.8}$  samples, respectively at 350 °C, where the reaction meets the reaction thermodynamic limit. Below 280 °C, the activity varies with the sample in the order  $Co_{0.2} > Co_{0.5} > Co_{0.8} > Co_3O_4$  at all temperatures. For instance, 63%, 53%, and 23%  $CO_2$  are converted at 250 °C on  $Co_{0.2}$ ,  $Co_{0.5}$ , and  $Co_{0.8}$  samples, respectively. The  $Co_{0.2}$  sample even shows low-temperature activities from 160 to 180 °C, at which temperatures the rest samples do not have activities. The overall activation energy of  $CH_4$  formation increases with the sample in the sequence of  $Co_{0.2} < Co_{0.5} < Co_{0.8} < Co_3O_4$ . Therefore, there is an optimal composition of metal and metal oxide in the catalyst to achieve the highest reactivity.

The differences in reactivity among the samples originate from the different functions of the metal and the metal oxide. CoO provides active sites of CO<sub>2</sub> adsorption but not electron-transfer sites for the hydrogenation reaction. Co acts as an electronically active center for the hydrogenation reaction. The derivative adsorbed products are observed as formate and carbonate, and these are found to be intermediates of CH<sub>4</sub> formation. Of the partially reduced samples, the Co<sub>0.2</sub> sample has highest CoO concentration; consequently it adsorbs the largest amount of CO<sub>2</sub>. Moreover, the low fraction of Co/(Co+CoO) facilitates moderate binding of CO<sub>2</sub>. The CO<sub>2</sub> adsorption step could be the rate-

determining step of the overall methanation reaction. Therefore, the Co<sub>0.2</sub> sample shows the highest reactivity: the lowest onset temperature and activation energy of CH<sub>4</sub> formation, and the highest conversion of CO<sub>2</sub> below thermodynamic limit. In comparison, the Co<sub>0.5</sub> sample with its higher fraction of Co/(Co+CoO) has a higher binding energy for CO<sub>2</sub> due to its stronger Lewis basicity; but it adsorbs less CO<sub>2</sub> because there are less CoO sites. As a result, the Co<sub>0.5</sub> sample converts less CO<sub>2</sub> than the Co<sub>0.2</sub> sample. Co<sub>0.8</sub> sample does not have the advantage of abundant CoO concentration, therefore not show significant CO<sub>2</sub> adsorption amount. This leads to the lowest reactivity of Co<sub>0.8</sub> compared to Co<sub>0.2</sub> and Co<sub>0.5</sub> samples.

These results of this work elucidate the optimal composition of metal and metal oxide for achieving the highest catalytic reactivity in the Sabatier reaction. Furthermore, they clarified the different active functions of the metal and metal oxide in the whole CO<sub>2</sub> hydrogenation reaction. These two main attainments open the way for the design of efficient catalysts with the optimal ratio of metal over metal oxide.

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## **Supporting Information**

The H<sub>2</sub> consumption plots and calculations, XRD, BET, normalized MS signals of CO<sub>2</sub> and CH<sub>4</sub>, CH<sub>4</sub> yield, Arrhenius plot of CH<sub>4</sub> formation, yield of C<sub>2</sub>H<sub>6</sub> and CO, XPS of samples after CO<sub>2</sub> hydrogenation reaction, Co 2p<sub>3/2</sub> and 2p<sub>1/2</sub> peaks measured by NAP-XPS, activation energy plots of CO<sub>2</sub> desorption, the evolution of the adsorption species.

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## **Supporting Information**

# Unraveling and Optimizing the Metal–Metal Oxide Synergetic Effect in a Highly Active Co<sub>x</sub>(CoO)<sub>1-x</sub> Catalyst for CO<sub>2</sub> Hydrogenation

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## Section S1. Determination of the molar ratio of metallic cobalt using $H_2$ consumption recorded using MS

The calculation method for removed O atom by  $H_2$  reduction:

## I. Determine the H<sub>2</sub> consumption amount

- 1) normalize H<sub>2</sub> intensity by He intensity;
- 2) integrate H<sub>2</sub> depletion area (A);
- 3) make a sum of overall  $H_2$  supplied  $(A_0)$ ;
- 4) divide the  $H_2$  depletion area by the overall  $H_2$  to obtain ratio of consumed  $H_2$  ( $R_H = A/A_0$ );
- 5) calculate total molar number of supplied  $H_2$  ( $N_H$  = flow (mL min<sup>-1</sup>) × time (min) ÷ 24.5 (mL mmol<sup>-1</sup>);
- 6) molar number of consumed  $H_2$  is to multiply ratio of consumed  $H_2$  by total molar number of supplied  $H_2$ :  $n_H = R_H \times N_H$ .

## II. Determine the removed amount of O atoms

According to the stoichiometric reaction:

$$C_{03}O_4 + 4H_2 = 3C_0 + 4H_2O$$
.

To remove all the O atoms from a certain weight of  $Co_3O_4$  (m (g)), the theoretical molar number (n<sub>0</sub>) of  $H_2$  is:

$$n_0 = m (g) \div 241 (g \text{ mol}^{-1}) \times 4.$$

As one mole of H<sub>2</sub> molecule takes away one mole of O atom, the molar ratio of consumed H<sub>2</sub> molecules equals to the molar ratio of removed O atoms. Therein,

$$R_{\rm O} = n_{\rm H}/n_0$$
.

R<sub>O</sub> is the molar ratio of removed O atoms.

## III. Determine the molar ratio of metallic cobalt

The remained molar number of O atoms per molecular unit of cobalt oxide is:

$$n_0 = 4 \times (1 - R_0)$$
.

The molar ratio of metallic cobalt is:

$$Co\% = \frac{Co}{Co + CoO} = \frac{3 - n_o}{(3 - n_o) + n_o} = \frac{3 - n_o}{3}$$

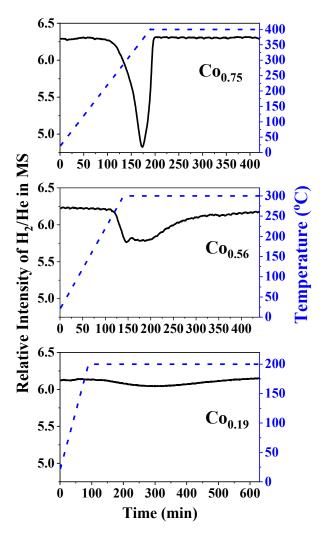


Figure S5.1. H<sub>2</sub> consumption of Co<sub>x</sub>(CoO)<sub>1-x</sub> samples by in situ reduction from Co<sub>3</sub>O<sub>4</sub> and detected by mass spectrometry.

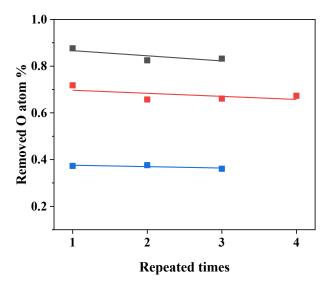


Figure S5.2. The removed ratio of O atom ( $R_0$ ) in each repeated synthesis of  $Co_x(CoO)_{1-x}$  samples.

Table S5.1. Specific surface area and  $CO_2$  adsorption amount of  $Co_x(CoO)_{(1-x)}$  samples measured using Micromeritics Tristar 3000 instrument

Sample name	BET surface area (m <sup>2</sup> g <sup>-1</sup> )	CO <sub>2</sub> adsorbed at 1 bar (mmol g <sup>-1</sup> )
Co <sub>3</sub> O <sub>4</sub>	12.58	0.107
Co <sub>0.2</sub>	13.75	0.075
Co <sub>0.5</sub>	4.04	0.025
Co <sub>0.8</sub>	1.12	0.023

## Section S5.2. Other characterizations

XRD. The crystal structures of all the samples were determined via powder X-ray diffractometer (PXRD, Bruker D8 Discover) using a Cu K $\alpha$  source. The samples were loaded in the glovebox in an airtight sample holder. Specifically, we used cling film and an aluminum ring to cover the top of sample holder during the sample transfer and measurement. This is air-free condition is not rigorous for long-time operation.

We measured the  $2\theta$  range from 20 to  $80^{\circ}$ , which took around  $1{\sim}1.5$  hours for each measurement. During this transfer and measurement hour, the sample may be partially oxidized by oxygen. As CoO can be easily oxidized to Co<sub>3</sub>O<sub>4</sub>, the less reduced Co<sub>0.2</sub> sample show higher peak intensity of Co<sub>3</sub>O<sub>4</sub>. Moreover, the CoO peaks of these samples did not show obvious differences in the Co<sub>x</sub>(CoO)<sub>1-x</sub> samples, which must be caused by the imperfect protection of the samples during the transfer and measurement. However, from our XPS measurements which were performed through rigorously air-free transfer of the samples, we confirm that the surface of the Co<sub>0.2</sub> catalyst has only Co and CoO, and the certain ratios of the Co to CoO in all the samples.

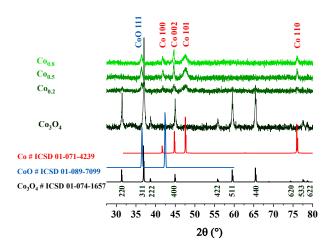


Figure S5.3. XRD of the Co<sub>3</sub>O<sub>4</sub>, Co<sub>0.2</sub>, Co<sub>0.5</sub> and Co<sub>0.8</sub> samples.

## Section S5.3. Activity of CO<sub>2</sub> to CH<sub>4</sub> conversion

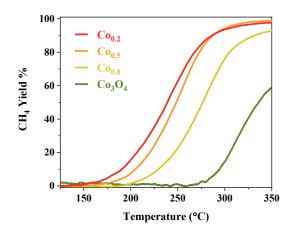


Figure S5.4. CH<sub>4</sub> yield of Co<sub>3</sub>O<sub>4</sub>, Co<sub>0.2</sub>, Co<sub>0.5</sub> and Co<sub>0.8</sub> samples.

As shown in Figure S5.5(a) and (b), CO<sub>2</sub> conversion and CH<sub>4</sub> yield showed the same developments throughout the temperatures. The selectivity of CH<sub>4</sub> formation was provided above the onset reaction temperature on each sample to reduce the calculation errors. As shown in Figure S5.5(c), the selectivity of CH<sub>4</sub> also showed the similar trend as CH<sub>4</sub> yield over these samples below 275 °C, and was generally high, above 92% on Co<sub>0.2</sub>, Co<sub>0.5</sub> and Co<sub>0.8</sub> samples. Above 275 °C, the selectivity of CH<sub>4</sub> on these samples reached the maximum 98%. The CH<sub>4</sub> production rate per surface area scattered out above 225 °C when the CH<sub>4</sub> production on the Co<sub>0.2</sub>, Co<sub>0.5</sub> and Co<sub>0.8</sub> samples were above the onset temperature (Figure S5.5(d)).

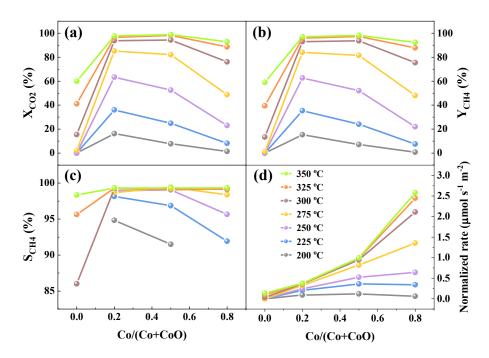


Figure S5.5. (a)  $CO_2$  conversion, (b)  $CH_4$  yield, (c)  $CH_4$  selectivity, and (d)  $CH_4$  production rate per surface area of  $N_2$  adsorption at 200, 225, 250, 275, 300, 325, and 350 °C.

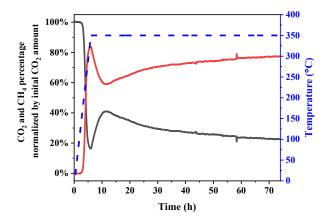


Figure S5.6. The  $CO_2$  hydrogenation reaction at 350 °C for 3 days on  $Co_{0.2}$  sample.

## Section S5.4. The selectivity of CO and C2H6

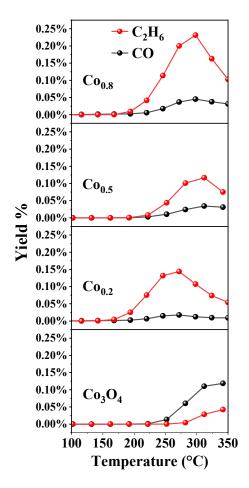


Figure S5.7. The yield of CO and  $C_2H_6$  on  $Co_3O_4$ ,  $Co_{0.2}$ ,  $Co_{0.5}$  and  $Co_{0.8}$  samples.

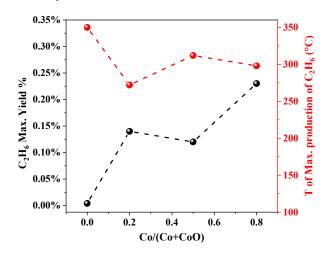


Figure S5.8. The maximum yield of  $C_2H_6$  (left axis) and the temperature of the maximum yield of  $C_2H_6$  (right axis) over the  $Co_3O_4$ ,  $Co_{0.2}$ ,  $Co_{0.5}$  and  $Co_{0.8}$  samples.

## Section S5.5. The stability of samples

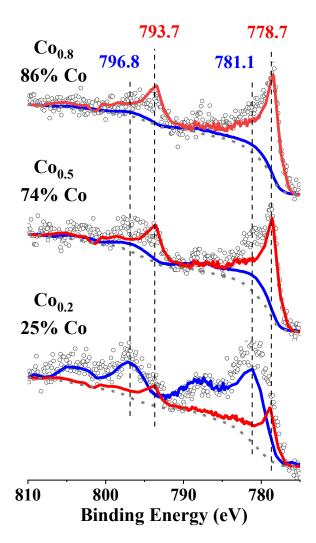


Figure S5.9. The XPS of  $Co_{0.2}$ ,  $Co_{0.5}$  and  $Co_{0.8}$  samples after  $CO_2$  hydrogenation reaction. These three samples are further reduced to have 25%, 74%, and 86% Co, respectively.

## Section S5.6. Surface reaction mechanisms

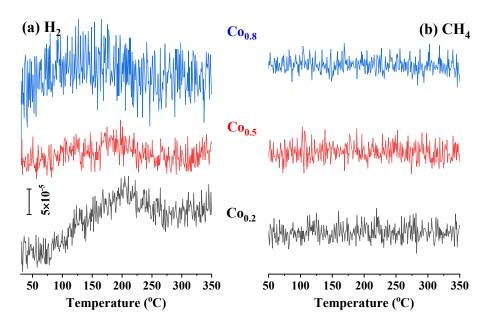


Figure S5.10. (a)  $H_2$  with m/z = 2 and (b)  $CH_4$  with m/z = 15 from  $CO_2 + H_2$  co-adsorption in TPD-MS with a heating rate of 15 °C min<sup>-1</sup>. The intensities are normalized with He intensity.

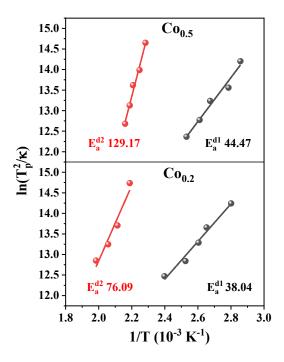


Figure S5.11. Calculation of activation energy of  $CO_2$  desorption from  $CO_2 + H_2$  co-adsorption in TPD-MS by varying the heating rate 5, 10, 15, 25, and 40 °C min<sup>-1</sup>. The black plot is from the first desorption peak at Figure 6(b) in the main manuscript, and the red plot is from the second desorption peaks.

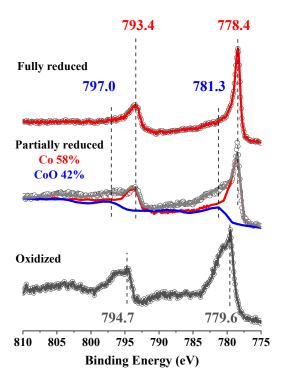


Figure S5.12. Co  $2p_{3/2}$  and  $2p_{1/2}$  peaks of not reduced, reduced after 1h (partially reduced) and 2h (fully reduced) in  $H_2$ , respectively in situ NAP-XPS. Black, blue and red lines represent the deconvoluted signals of  $Co_3O_4$ , CoO and Co states, respectively. Gray line is the total fitted spectra.

## **Conclusions**

In this thesis, we focused on disclosing the reaction mechanisms of CO<sub>2</sub> hydrogenation on the catalyst surface. The project was accomplished through four sub-projects.

Firstly, we built up an in situ DRIFTS and investigated the spectroscopy of CO<sub>2</sub> gas as functions of pressure and temperature. The pristine metals, Fe, Co, Ni, and Cu were utilized to study the CO<sub>2</sub> adsorption behavior and their properties in CO<sub>2</sub> activation. CO<sub>2</sub> reduction by H<sub>2</sub> were carried out on these metal surfaces under constant volume conditions to understand the reactivities of these metals. The results showed Fe is the most active in CO<sub>2</sub> activation that dissociate CO<sub>2</sub> to CO gas at temperature above 350 °C. Co and Ni rank the second. Cu is not active in CO<sub>2</sub> activation reaction. While in CO<sub>2</sub> hydrogenation reaction at mild temperature (200 °C), Co is the most active to convert CO<sub>2</sub> to CH<sub>4</sub>; Ni produced four times less yield of CH<sub>4</sub> than Co; Fe and Cu are not active at this temperature. We conceived that formation of metal hydride could improve the CO<sub>2</sub> methanation profited from H<sub>2</sub> pre-storage in the material. Therefore, we employed the classical metal hydride, LaNi<sub>4</sub>Cu alloy, for CO<sub>2</sub> reduction. CH<sub>4</sub> produces only above 300 °C. Unfortunately, at this temperature the stored H<sub>2</sub> was desorbed already. Hence, H<sub>2</sub> pre-storage might be not the key to trigger CO<sub>2</sub> methanation. Besides, there are no adsorption species observed on these pure metal surfaces. However, on the metaloxide Co-CoO catalysts, CO<sub>2</sub> methanation exhibits lower onset temperature and higher conversion than those pristine and alloyed metals. Moreover, there are adsorption species on the surface detected by IR. Therefore, we start to change the catalyst category from pure metals to metal-oxide. Also, we upgraded the in situ DRIFTS to operando DRIFTS-MS-GC, where the gases were detected by MS and GC, the liquid products were detected by ex-situ NMR, and the surface adsorbates were detected by IR.

Secondly, we developed an analysis program, bilevel evolutionary Gaussian fitting (BEGF) program. This program deconvolutes the overlapping IR bands of the similar bond vibrations in spectral sets automatically and efficiently. The standard chemicals, including carbonate and bicarbonate salts, formic acid, acetic acid, methanol, and ethanol adsorbed on the catalyst surface, were measured by IR for assigning the peaks generated from CO<sub>2</sub> hydrogenation. Isotopic spectra of <sup>13</sup>CO<sub>2</sub>+H<sub>2</sub> and CO<sub>2</sub>+D<sub>2</sub> reactions were employed for assisting the peak assignments also. In addition, the reactivity of formate adsorbed on the Ru/Al<sub>2</sub>O<sub>3</sub> surface by H<sub>2</sub> reduction was examined for the purpose of clarifying whether it is intermediate or byproduct. As a result, we resolved the peak positions of O-C-O asymmetric and symmetric stretching of different adsorption structures: HCO<sub>3</sub><sup>-\*\*</sup>, CO<sub>3</sub><sup>2-\*\*</sup>, HCOO<sup>-\*\*</sup>,

and CO\*, as well as the C-H stretching and bending of HCOO<sup>-\*</sup>, on both  $Ru/Al_2O_3$  and  $Al_2O_3$  surfaces. What is more, the  $HCO_3^{-*}$ ,  $HCOO^{-*}$ , and  $CO^*$  on the Ru site and the interface of  $Ru/Al_2O_3$  were reducible by  $H_2$ .

Thirdly, in order to understand the reaction steps of CO<sub>2</sub> methanation, we in situ controlled the individual formation and hydrogenation of each adsorption species appears in the CO<sub>2</sub> methanation reaction on Ru/Al<sub>2</sub>O<sub>3</sub>. The results showed that the first step is CO<sub>2</sub> adsorbed as HCO<sub>3</sub><sup>-\*</sup>\* at the interface of Ru and Al<sub>2</sub>O<sub>3</sub> no matter if there is H<sub>2</sub> in the system or not. Surface hydroxyl groups provide the acceptance sites for CO<sub>2</sub>. The second step is HCO<sub>3</sub><sup>-\*</sup>\* dissociating into \*CO. The dissociation temperature is high (130 °C) in H<sub>2</sub> depletion condition but at room temperature in H<sub>2</sub> rich environment. The third step is \*CO hydrogenation to CH<sub>4</sub> starting at 100 °C, through transition states, without detectable intermediates. If in H<sub>2</sub>-rich condition at the beginning, HCOO<sup>-\*</sup>\* at the interface also forms as the first step of CO<sub>2</sub> activation, and infuse with the CO\* formation and hydrogenation step.

Fourthly, since we discovered the important function of the oxide support in the CO<sub>2</sub> hydrogenation reaction, we designed Co/(Co+CoO) catalysts with different ratios to investigate the relationship of the metal/oxide ratio and their reactivities. The results showed more composition of CoO in the catalysts facilitates higher activity in the CO<sub>2</sub> conversion (98%). CH<sub>4</sub> is the main product on these samples. Trace C<sub>2</sub>H<sub>6</sub> is preferentially produced on the sample with a high concentration of metallic cobalt, while the trace CO production is favored on the pure oxide. The origin of the distinct reactivity comes from the CO<sub>2</sub> chemisorption on the CoO surface. The CO<sub>2</sub> chemisorption is the rate demining step of the overall hydrogenation reaction. High CoO concentration surface not only enhanced the adsorption amount but lowered down the binding strength of CO<sub>2</sub>. However, CoO did not create catalytic center, the CO<sub>2</sub> reduction center is still on Co atom. These results elucidate the optimal composition of metal and metal oxide for achieving the highest catalytic reactivity, and clarified the different active functions of the metal and metal oxide in the CO<sub>2</sub> hydrogenation reaction.

These results established mature and sensitive methods for operando study of heterogeneous catalysis over gas/solid interface, accompanied by analysis program of IR dataset and the database of IR peak positions of the adsorbates from CO<sub>2</sub> methanation on the metal-oxide surfaces. The systematic and progressive investigations present the performances of pristine metals, metal hydride alloy, and metal-oxide catalysts in CO<sub>2</sub> adsorption and methanation reactions. CO<sub>2</sub> activation initiates on the interface of metal-oxide, and is reduced to CH<sub>4</sub> through converting to multiple intermediate species, such as HCO<sub>3</sub><sup>-\*</sup>, HCOO<sup>-\*</sup>, CO\* on Ru/Al<sub>2</sub>O<sub>3</sub> catalyst surface, or HCOO<sup>-\*</sup> and CO<sub>3</sub><sup>-\*</sup> on Co<sub>x</sub>(COO)<sub>1</sub>-

 $_{x}$  catalyst surface. Concurrent exist of metal and metal oxide is vital for efficient  $CO_{2}$  methanation. The metal oxide is not just supporting the metal nanoparticles, more importantly it functions as  $CO_{2}$  adsorption site, which is the initial step of the catalytic reaction. Therefore, the design of the catalyst should consider the concentration of oxides for optimizing the  $CO_{2}$  conversion.

## **Perspectives**

We have established a powerful DRIFTS-MS-GC setup and analysis program for operando study of CO<sub>2</sub> hydrogenation process on gas/solid interface. The CO<sub>2</sub> methanation mechanisms and their relation with the different transition metal-based catalysts have been elaborated using IR, MS, XPS, GC, NMR, etc. techniques. Three continuous work are envisioned for the future.

First, CO<sub>2</sub> methanation reaction occurs through one step, or passing through CO\* or HCOO\* as intermediates, according to the literature and this thesis. However, the observation of the intermediate steps from CO\* or HCOO\* to CH<sub>4</sub> are limited by the current experimental research. Therefore, which intermediate determines the reaction ending with CH<sub>4</sub> or continuing with carbon chain growth remains mystery. Relative coverage of CO\*/H\*, H<sub>2</sub> pressure, binding energies of the possible transitional adsorbates, and surface structure are discussed in the literature. Therefore, controlling experiments of adjusting CO\* and H\* coverage on model catalyst, e.g. Ru/Al<sub>2</sub>O<sub>3</sub>, could be helpful to understand the CO\* hydrogenation step. Especially, carrying out the controlling experiments in vacuum would enable the observation of transitional adsorbates, such as COH\* and CHO\* using DRIFTS.

Second, synthetic methanol is much more valuable than synthetic methane. The disadvantage of methanol production is the requirement of high pressure (> 20bar). The working pressure of our apparatus is limited to 10 bar. However, this limit is because of the commercial DRIFTS chamber where the dome consists of 4mm thick windows for the IR beam passing. It is possible to change the dome to allow thicker glass window for holding higher pressure. Then we can study the methanol processes on the catalyst surface using the developed methods in this thesis. C-C coupling also occurs under high pressure reaction, hence, C-C coupling mechanisms in long chain hydrocarbons could also be investigated.

Third, numerous researches investigate the active sites of the catalysts. The effects from size, support, interface, alloy, and so on, are well presented. However, plenty of the reports are limited at explanation of the phenomena. The intrinsic causes of those effects are still less proved. Therefore, we suggest further investigations of specific design of catalysts together with comprehensive characterizations under reaction conditions.

## Apendix – BEGF Program

## Execution file 1 and Execution file 2

The code structure is given in Table A.1 with all detailed description of each matrix involved given directly in the code comments.

Table A.1. Code structure.

File name	Function	Calling	Called by
main.m	Execution file with all input specifications and solving options. This file calls preprocess.m first to process input spectra and then executes a genetic algorithm (the upper-level algorithm) for global optimization.	preprocess.m	-
preprocess.m	Customized processing of given spectrum files. This needs to be adapted for specific format of recorded data to return the required data to be used in main.m.	Input source experimental spectra	main.m
gafitness.m	Lower-level algorithm: multi-peak Gaussian fitting with the calculation of objective function and file writing to record the evolution information. This file also activates a monitoring plot to illustrate the evolution progress. This file is called by genetic algorithm for each low-level evaluation.	gfparser.m	Genetic algorithm executed in main.m
gfparser.m	Parse the results returned by the original multi- peak Gaussian fitting algorithm from MATLAB and update the monitoring plots of each spectrum. This file is called by gafitness.m.	gfparser.m	gafitness.m
gaussian.m	Formulation of Gaussian function	_	gfparser.m

## **Execution file 1 main.m:**

Note: the initial values in Pini, Plbd, Pubd, olbd and oubd were what we used for the spectra set of CO<sub>2</sub> hydrogenation reaction on Ru/Al<sub>2</sub>O<sub>3</sub> catalyst surface.

```
% Clear and clean matlab and prepare pathes
clear all;
clc;
format compact
global fsep curdir
fsep = filesep;
curdir = pwd;
% Input and output folder
global inpdir outdir
inpdir = [curdir fsep 'sources'];
outdir = [curdir fsep 'results'];
disp(['sources path: 'inpdir]);
disp(['results path: 'outdir]);
0/,0/, -----
% Automatic iterative Gaussian fitting with evolutionary algorithms
% Only for inhouse use by Kun Zhao. Distribution of the code should be
% authorized by Dr. Ligang Wang, since it is based on inhouse evolutionary
% algorithms developed in IPESE-STI-FM.
% Key features:
% 1. Automatic iterative Gaussian fitting without mannual interfere
% 2. Automatic decision on the number of peaks
% 3. No mannual initialization needed for each peak due to global search
% 4. Global optimization with less risk of local optimum
% 5. Every run handles one wavelength, due to complexity of figure display
0/0-----
%% Global setup
% Control display
% fsrc : plot source data? (0: no plot; 1: do plot)
% fres: plot results? (0: no plot; 1: do plot)
global fres
fsrc = 0;
```

```
fres = 1;
% Problem setup
% rngs: wavelength ranges considered, rngs = [[11,u1];[12,u2];];
% nitm: Number of peaks considered
% npar: Number of parameters for each peak formulation
        3-parameter Gaussian fitting: height, center, deviation;
% Pini: Initialization of npar-parameter peak
% Plbd: Lower-bound of npar-parameter peak
% Pubd: Upper-bound of npar-parameter peak
% olbd : Global lower-bound for Plbd
% oubd: Global upper-bound for Pubd
% doGA: Whether do GA to iteratively find peaks
% yini : 0 - GA use olbd, oubd as bound; 1 - GA use Plbd, Pubd as bound
% X
        : Wavelenght range considered of each file
        : The corresponding Absorbance of each file
% y
% rng1
        : Starting wavelength
% rng2 : End wavelength
% fnames : All file names
global npar doGA rngs nitm
global x y rng1 rng2 fnames temp lb
doGA = 1;
yini = 1;
rngs = [1535, 1780];
npar = 3;
nitm = 5;
Pini = [0.041 1560 10 0.057 1591 10 0.1 1620 15 0.1 1650 20 0.01 1690 30 0.01 1690 30 0.01 1690 30 0.01 1690 30];
Plbd = [0.01 1555 16 0.01 1589 12 0.00 1616 25 0.0 1650 20 0.0 1680 0 0 1535 0 0 1535 0 0 1535 0];
Pubd = [0.08 1571 25 0.20 1593 16 0.20 1635 32 0.5 1655 30 0.3 1705 50 50 1780 60 50 1780 60 50 1780 60];
% Global initialization for optimization (centroids are important)
olbd = [0 1540 16 0 1580 12 0 1620 25 0 1650 20 0 1670 0 0 1535 0 0 1535 0 0 1535 0];
oubd = [50 1580 60 50 1620 60 50 1650 60 50 1670 60 50 1710 60 50 1780 60 50 1780 60 50 1780 60];
% data preprocessing
rng1 = rngs(1,1); % Starting wavelength
rng2 = rngs(1,2); % Ending wavelength
[x,y,temp,fnames] = preprocess(rngs,fsep,inpdir,fsrc);
%% Close all figures first
if fres == 1 \parallel doGA == 1
  close all;
```

```
end
% remove results folder
if isdir(outdir)
  rmdir results s
end
mkdir(outdir)
% Reduce the size of Pini, Plbd and Pubd with npar and nitm
% Check size, warning and resize arrays
if isequal(size(Pini),size(Plbd)) && isequal(size(Pini),size(Pubd))
  nnum = size(Pini, 2);
  if nnum < npar*nitm
     disp('Error: Sizes of Pini & Plbd & Pubd less than npar * nitm!');
  else
     % Now reduce Pini, Plbd and Pubd sizes
     Pini = Pini(1,1:npar*nitm);
     Plbd = Plbd(1,1:npar*nitm);
     Pubd = Pubd(1,1:npar*nitm);
  end
else
  disp('Error: Sizes of Pini, Plbd, Pubd inequal!');
  return
end
%% GA setup
% Form input
if doGA == 0
  % Perform Gaussian fitting
  gafitness([Pini,Plbd,Pubd]);
else
  % Prepare GA
  % Set bounds
  galb = [];
  gaub = [];
  1b = [];
  for i = 1:nitm
     galb = [galb [0.01 0.01 0.01]];
     gaub = [gaub [0.99 0.99 0.99]];
  for i = 1:nitm
```

```
galb = [galb [0.01 \ 0.01 \ 0.01]];
    gaub = [gaub [0.99 0.99 0.99]];
  end
 if yini == 0
    olbd = olbd(1,1:npar*nitm);
    oubd = oubd(1,1:npar*nitm);
    galb = [galb \ olbd];
    gaub = [gaub oubd];
    lb = [lb olbd];
  else
    Plbd = Plbd(1,1:npar*nitm);
    Pubd = Pubd(1,1:npar*nitm);
    galb = [galb Plbd];
    gaub = [gaub Pubd];
    lb = [lb Plbd];
  end
 %disp('Lowerbound, upperbound: ')
 %format long g
 %[galb' gaub']
 GAoptions = optimoptions('ga');
 %GAoptions.OutputFcn = @gaoutput;
 %GAoptions.PlotFcn = @gaplotbestf;
 GAoptions.CreationFcn
                         = @gacreationlinearfeasible;
 GAoptions.MutationFcn
                          = @mutationadaptfeasible;
 GAoptions.CrossoverFcn = {@crossoverintermediate, 0.5};
 GAoptions. Crossover Fraction = 0.5;
 %GAoptions.Display
                         = 'iter'; % 'off' | 'iter' | 'diagnose' | {'final'}
  fobj = @gafitness;
 %[gax,gay] = ga(fobj,3*npar*nitm,A,b,[],[],lb,ub,[],[],GAoptions)
  fprintf('Current time %s\n', datestr(now, 'HH:MM:SS.FFF'))
 disp('Start GA:');
 [gax,gay] = ga(fobj,3*npar*nitm,[],[],[],[],galb,gaub,[],[],GAoptions)
end
disp(['Run completed, wavelength [' num2str(rng1) ',' num2str(rng2) ']']);
rmpath(genpath([curdir fsep 'moo']));
```

## **Execution file 2 preprocess.m:**

```
%% Customized source-data preprocessing
% File name related to read txt or csv file generated from experiment
% nsrt: Starting text file
% nint: This is added to avoid
% nend: End text file
% tsrt : Starting temperature, C
% tint: Temperature interval, C
% temp : Temperature range, C
function [x,y,temp,fnames] = preprocess(rngs,fsep,inpdir,showfig)
nsrt = 12;
nint = 1;
nend = 40;
tsrt = 19;
tint = 10;
x = [];
y = [];
temp = [];
fnames = [];
% Process experimental source data
rng1 = rngs(1,1); % Starting wavelength
rng2 = rngs(1,2); % Ending wavelength
id = 0;
              % Index of active spectrum
for i = nsrt : nend
  if mod((i-nsrt), nint) == 0
     id = id + 1;
     % Current temperature
     tcur = tsrt + tint * (i - nsrt);
     temp = [temp;tcur];
     % Form and display file name
     ifi < 10
       fname = [num2str(tcur) ' C.000' num2str(i)];
     else
       fname = [num2str(tcur) ' C.00' num2str(i)];
     end
     fnames \{id\} = fname;
     disp(['File to be read: ' fname '.txt']);
     % Read the file indicated above and store contents into a matrix (dat)
```

```
fid = fopen([inpdir fsep fname '.txt']);
txt = textscan(fid, '%f', 'delimiter', ', ');
fclose(fid);
mat = txt\{:\};
nrow = size(mat, 1);
dat = [];
for j = 1: nrow/2
  dat = [dat; [mat(2*j-1) mat(2*j)]];
end
% All data read can be plotted below to check if data is correct
if showfig == 1
  figname = 'Source data all';
  hall = findobj('Type', 'Figure', 'Name', figname);
  if isempty(hall)
     hall = figure('NumberTitle','off','Name',figname);
     set(gcf,'Name',figname,'NumberTitle', 'off');
     movegui('west');
  else
     figure(hall);
  end
  plot(dat(:,1),dat(:,2));
  xlabel('Wavelenght (cm^{-1})');
  ylabel('Absorbance (a.u.)');
  ax = gca;
  ax. Title. String = 'Original source: total range';
  hold on
end
% Find the wavelength expected from the data read
index wl = dat(:,1) \ge rng1 \& dat(:,1) \le rng2;
reduced dat = dat(index wl,:);
% Put the interested data in X-Y format in a local matrix
xloc = reduced_dat(:,1);
yloc = reduced dat(:,2);
%plot(xloc,yloc,'linewidth',1.5);
%hold on
% Smooth measurement first to reduce noise
yloc = smooth(xloc,yloc,0.1,'loess');
```

```
%plot(xloc,yloc_new,'linewidth',1.5);
  % Wavelength size
  nxloc = size(xloc, 1);
  % Baseline processing to be added
  slope = (yloc(nxloc) - yloc(1)) / (xloc(nxloc) - xloc(1));
  base = yloc(1);
  for ip = 1: nxloc
    yloc(ip) = yloc(ip) - (base + slope * (xloc(ip)-xloc(1)));
  end
  % Remove negative numbers
  yloc(yloc < 0) = 0;
  % Store xloc and yloc into x, y
  x(:,id) = xloc;
  y(:,id) = yloc;
  % All data read can be plotted below to check if data is correct
  if showfig == 1
    figname = 'Source data range';
    hrng = findobj('Type','Figure','Name',figname);
    if isempty(hrng)
       hrng = figure('NumberTitle','off','Name',figname);
       set(gcf,'Name',figname,'NumberTitle','off');
       movegui('east');
    else
       figure(hrng);
    end
    plot(xloc,yloc);
    xlabel('Wavelenght (cm^{-1})');
    ylabel('Absorbance (a.u.)');
    ax = gca;
    ax. Title. String = ['Original source: [' num2str(rng1) ', ' num2str(rng2) ']'];
    hold on
  end
end
```

end

## **Life Story**

Carrying the strong curiosity about the origin of modern science and about the western life, I arrived in Switzerland for PhD from a village in Wuhan, China after all the endeavors. EPFL is famous as a leadership university, especially in photo(electric) energy field. I knew it because there are many large groups researching on photo(electric) energies at top 15 universities in Wuhan. I appreciate very much that I study here. The challenge in my study here was starting over: facing new research topic; switching from theoretical calculations to experiments; and all my previous achievements became no relation here no matter how proud I was and what fame I obtained. Also, the research topic of CO<sub>2</sub> hydrogenation was new in this group. I had no sense of feasibilities of the instruments in this research. When searching the investigation methods and the catalysts, I had an impression that everything was investigated because so many techniques, catalysts, and mechanisms were reported. Therefore, it was a long and lonely journey to pass through countless up and down and to get the novel results finally. I worked the most intense on the last three months of thesis preparation: working 12-16 hours per day, taking one day as two days. Afterwards, I managed to finish two more articles and the thesis. That was ever most efficient time. At the end I am proud of my skills in experiment, the methods I developed, the scientific discoveries of the CO<sub>2</sub> hydrogenation mechanisms on the catalyst surfaces, and the life in Switzerland.

Before starting the PhD, some PhDs at the last year warned me that these four years would develop as this curve "\sum ". I was doubting it would happen on me, especially I had super nice supervisor and colleagues. However, I did not escape from this curve. I expected very high for the achievements at the beginning, then dropped into depression in the reality. It is said misfortunes never come singly. Truly, there were contineous pressures and anxieties joined from other sides: the relationships, the cultural conficts, and the increasing competition from China. Four years passed like a blink. But every year was so different to me. I did not want to admit, but the real challenge was going through the overwhelming conflicts of the differences between the Chinese and European sides: the cultures, the political bias, the social communications, the way of thinking, and so on. It was totally a battle in the minds and the battle crashed my beliefs. I have been searching the answer and myself in this battle.

Now I can understand more or less why the battle and crash happened. It consumed my enormous energies to go through and figure out, because the new things I met here challenged my past life and belief. Therefore, I must record it

#### About the nation

China is a country with really long and heavy history. Chinese people have to learn the poems and ancient articles from those dynasties throughout the educational periods. Those poems carry poignant and beautiful souls. One of the most famous books reflecting the life and minds in one dynasty is "Dream of the Red Chamber"

("Le Rêve dans le Pavillon Rouge" in French), which was written around 270 years ago. It tells highly complex stories about love, the rise and fall of a representative noble family, and wonderful descriptions about Chinese women under that time background. It writes with very delicate ancient words and poems. There is a big official group studying this book exclusively since from 1980s in China. When my landlord here, an elder Swiss couple, showed me that they had been reading this book in French for ten years, I was shocked and gratified.

After revolutions of thousands of years, this nation survives. The recent over a hundred years of wars opened the decayed door of the dynasty, also subverted its sacred image established over the dynasties. However, the culture, humanity, and spirit implanted into Chinese people's characters and consciousness. Along with the development in the recent one century, the traditional and modern cultures clash all the time. Besides, the magnificence China had and the humiliation the invasion wars brought formed the complicated sensations to Chinese people.

World today is a political world. Chinese communist is more famous than Chinese culture. When I say I love my country, people reflect immediately that I must love the communist party. This is sad to me. Because people put almost the full emotions to the communist, not really seeing the culture and life there. As for the Chinese communist party, on one hand, it indeed builds the new China very well; on the other hand, its bureaucracy, fawning the superior and disrespect the subordinates/normal people, and tight control are hateful. Not until I have life in Switzerland did I understand what freedom and respect are. However, China has a very complex society and history. It might become more transparent and trustable after the development arrives a higher level.

## About the mentality

Generally, Chinese people are used to be led by one power as in the history. In personality, Chinese people supress the needs of oneself, even deny the selves, have deep sense of conservative morality and fame, and easily feel shamed for a manner or a failure. The speaking is often serious and playing around instead of relaxed and straighforwd, especially speaking with superiors. We have to guess the meaning carefully. Speaking about the government is a very sensitive topic, except saying good or constructive but not aggressive words. I did not know that talking about the governments, including Chinese government, is a daily chat in Europe. That made me very nervous, shamed and angry at the beginning. After I learned the international relations and the developing processes of many countries, I started to understand the natural processes of a country grow and the political measures and bias, being calmer and more aware.

Chinese way of thinking originated from two major phylosophies: Confucianism and Taoism, which developed around 2500 years ago. Confucius teaches the relationships of the person with the family, friends, society, and government in a kindness and respect manner. Confucianism flourishes and widespreads the most after traversing so long history, having the strongest influence ubiquitous in China. However, it carries conservative

minds and too many restrictions, and tends to educate the communication regarding to people's tiltle, not the person him/herself. Tao imparts the connection of the person with the inner energy and the universe, and suggests freedom in the spirit.

Influenced by the conservative rules, Chinese normally connect the spirit and flesh mentally strongly, which might be comparable to the old Christian style. We eaily live in sin or shame: when we did not get good performance in the school, drank/smoked/dated at high school, did not follow various rules, not married above 30 years old especially for woman, no car or apartment/house before marrage especially for man, being disagreed by others' opinions, etc. The society is filled with rushes, competitions, comparisons, and the Chinese communist. Although I realize the contradictory parts after the comparison with the life in Switzerland, I have to burden these pressures as long as I live in this society.

Society in Switzerland is so open. People live comfortably, weathily, confidently, and can develop their interests freely. There are so many greetings in the mornings, evenings, holidays, before and after meals, and so on, while Chinese usually do not have. How enviable the life is! However, men and women are unbelievably open with funs, having no struggles with separating the "spirit and flesh". When people say he/she likes someone, it does not mean the same "like" in China. In China, saying "like" to a girl/boy between friends means pursuing a relationship. And the relationship here is independent from the aim of marriage. While in China, relationship usually aims at marriage, although it could fizzle out. So, when we judge things based on our backgrounds, a lot of contradictions and misunderstandings could be created, which is miserable.

#### About the life experiences

This is a personal case. When I was in China, I was lost because of no sense of the physical life. Acurally, the students were commented as having eyes high and hands low by the society. I did not know the basic living skills: how to use vacuum cleaner, how to cut meat, how to cook, and so on. I never thought one day I had to find apartment, furniture, and health insurance alone, because in China the dormitory, food, insurances, etc. are provided by the schools or universities. It was impossible to live off campus for me.

The worst was to live in the expectations from the family, friend, and society due to the social sense of fame and competition. Those expectations pointed to me only one road to Rome, which was "good good study, day day up" – getting good performance in the school and entering one of the top universities. There were 9 to 11 million students competing the universities every year. I had to use high scores or grades to convince my family that I am a promising person, to draw teachers' attention, and to be confident among friends and neighborhoods. I had also to be very careful with my behavior and speaking when I was a child because I was the unexpected second girl in the family under the "one child" policy. To obtain good judgements from others, I put myself in all kinds of "behavior templates". That was choking time.

Luckily, I became more or less free after attending the university. I could finally read and study a lot of knowl-wdges that I was interested, participate various activities, and travel. Abandoning all the templates and people's eyes, suddenly I felt nothing was really important, nearly "the unbearable lightness of being". I lived in a spiritual world, seeming like free, but with invisible cage. The older I grew, the deeper I felt. But I did not know what the cage was. Until I lived four years in Switzerland, I understood it was because of the ubiquitous competition, the hateful part of the social circumstance, and the harsh education originated from the family. What was more, there was no balance between work and life. Work was at everywhere and anytime except when sleeping. What poor Chinese! Everyone was in a rush of supporting the life. I felt stronger the competition from China when I am in Switzerland due to the fast movements in China and the slow progress in Europe. Without time to enjoy life, Chinese people generally were not really happy, and easily to be serious, angry and shouting.

In Switzerland, the social environment, people's minds, and working styles are open, kind and flexible. The natures are well protected; having the real seasons and countless stars; energy sources are abundant; roads are well built; infrastructures are well established; shops have selected the optimal products for the consumers and not varyed the prices very much between different shops; people are polite, quiet, well educated and respectful..... Here, people can stop working on weekends and take vacations without worrying about the work, can even relax without worrying about the job and the carrer. The society is so harmonic even without "fixed" president. Living here is like living in the heaven with freedom, equality, wealth, peace, and incredibly beautiful nature. I not only love and enjoy living here very much, but also feel the connection of the environment here to my soul. I could not imagine elsewhere would have better environment. However, at the starting two years, the differences in living style, way of thinking, and some contradictions in the senses of morality of people's behaviors described above created terrible loneliness, misunderstandings and spiritual crash.

As a consequence, these two spirits – Chinese tradition and western opening – in me struggled in fierce battle for three and half years. I remember I arrived in Switzerland naive, innocent, enthusiastic, courious, unworldly, loving, and high-expectation. Under so many strong conflicts, I became miserable, aggressive in words, and antipathetic for all the things opposed to my Chinese spirit. I was exhausted mentally in the years of spiritual battle. But at the end, I break through these difficulties and found out the compromise. I become comfortable, confident and certain, and understand the nations, international relations and the politics more. This was a journey from sorrow to happiness, a journey full of harsh philosophy of life, which took me three quarters of my PhD time to pass. This is indeed a doctorate of PHILOSOPHY! "What does not kill us makes us stronger."

Overall, PhD is harsh. In addition to the difficult research work, PhD time is also the first state of handling independent life, dealing with colleague relationships, facing all kinds of conflicts, all the time trying to calm down from the pressures and to solve the problems. Passing the PhD exam is a rebirth. Thankfully, I found what life I want at the end.

## **Curriculum Vitae**

#### I Profile

Name: Kun ZHAO 赵焜 Gender: Female

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**Summary:** I am a highly motivated, persistent and hard-working young scientist. I am specialized and enthusiastic in the investigations of the reaction mechanisms of surface catalysis and the relation between surface structure and reactivity for energy conversion and storage. In my eight years of research study since from the last year of undergraduate, I have found the facets structure-dependent molecular oxygen activation of bismuth oxychloride by means of experiments and theoretical simulations, discovered the reaction pathways of CO<sub>2</sub> hydrogenation on metal/support interface by finely controlling the surface intermediates in in situ spectroscopic apparatus, and elaborated the support effect in CO<sub>2</sub> hydrogenation reaction. I have fourteen high-quality publications and been cited more than 2000 times, at the same time acquired multiple instrumental skills listed below. I am always looking forward to expanding my knowledge and improving my skills in the fields of surface catalysis and materials at advanced platforms with passionate and intelligent people.

#### **II Education**

2/2016 – 6/2020	PhD in Ecole Polytechnique Fédérale de Lausanne (EPFL), 1015 Lausanne, Switzerland.
9/2012 – 6/2015	M.S. in Physical Chemistry, Key Laboratory of Pesticide & Chemical Biology of Ministry of Education, College of Chemistry, Central China Normal University, Wuhan 430079, P. R. China.
9/2008 – 6/2012	B.S. in Applied Chemistry, Central China Normal University, Wuhan 430079, P. R. China.
9/2008 - 6/2012	B.S. in Physics, Central China Normal University, Wuhan 430079, P. R. China.

## **III Research Experience**

7/2020 - 8/2020	Internship in Prof. Dr. Hannes Jónsson's group at University of Iceland, working on DFT	
	calculations of facet-dependent CO <sub>2</sub> hydrogenation on copper.	
2/2016 - 6/2020	PhD in Laboratory of Materials for Renewable Energy (LMER), EPFL, working on ca-	
	talysis of CO <sub>2</sub> hydrogenation on gas/solid interface utilizing spectroscopic methods under	
	supervision of Prof. Dr. Andreas Züttel.	

- 7/2015 9/2015 Internship in Laboratory of Nanostructures at Surface (LNS), EPFL, working on catalysis of substrate-supported clusters utilizing STM and DFT calculations.
- 9/2012 6/2015 Master's thesis of Surface Structure-Dependent Photocatalysis of BiOCl Single Crystalline Surfaces under supervision of Prof. Dr. Lizhi Zhang.
- 11/2011 12/2012 Visiting student in Hefei National Laboratory for Physical Sciences at the Microscale, University of Science and Technology of China, Hefei 230026, P. R. China, learning DFT calculations by VASP code under supervision of Prof. Dr. Qunxiang Li.

#### IV Publications\*

- 1. <u>Zhao, K.</u>; Calizzi, M.; Moioli, E.; Li, M.; Borsay, A.; Lombardo, L.; Mutschler, R.; Luo, W.; Züttel, A. Unraveling and Optimizing the Metal–Metal Oxide Synergetic Effect in a Highly Active Co<sub>x</sub>(CoO)<sub>1-x</sub> Catalyst for CO<sub>2</sub> Hydrogenation. *J. Enegry Chem.* **2020**, in press.
- 2. Luo, W.; Zhang, Q.; Zhang, J.; Emanuele, M.; <u>Zhao, K.</u>; Züttel, A. Electrochemical reconstruction of ZnO enhances selective reduction of CO<sub>2</sub> to CO. *Appl. Catal.* B **2020**, *273*, 119060.
- 3. Lombardo, L.; Heena, Y.; Zhao, K.; Dyson, P. J.; Züttel, A. Solvent-free and catalyst-free CO<sub>2</sub> capture and reduction to formate with borohydride ionic liquid. *ChemSusChem.* **2020**, *13*, 2025.
- Mutschler, R.; Moioli, E.; <u>Zhao, K.</u>; Lombardo, L.; Oveisi, E.; Porta, A.; Falbo, L.; Visconti, C. G.; Lietti, L.; Züttel, A. Imaging catalysis: Operando investigation of the CO<sub>2</sub> hydrogenation reaction dynamics by means of infrared thermography. *ACS Catal.* 2020, 10, 1721.
- 5. Li, M.; Borsay, A.; Dakhchoune, M.; Zhao, K.; Züttel, A. Thermal stability of size-selected copper nanoparticles: effect of size, support and CO<sub>2</sub> hydrogenation atmosphere. *Appl. Sur. Sci.* **2020**, *510*, 145439.
- Zhao, K.; Zhang, J.; Luo, W.; Li, M.; Moioli, E.; Spodaryk, M.; Züttel, A. A Combined Diffuse Reflectance Infrared Fourier Transform Spectroscopy-Mass Spectroscopy-Gas Chromatography for the Operando Study of the Heterogeneously Catalyzed CO<sub>2</sub> Hydrogenation over Transition Metal-Based Catalysts. *Rev. Sci. Instrum.* 2020, under review.
- 7. Calizzi, M.; Mutschler, R.; Patellic, N.; Zhao, K.; Züttel, A.; Pasquinic, L. CO<sub>2</sub> hydrogenation over unsupported Fe-Co nanoalloy catalysts. Nanomaterials. **2020**, under review.
- 8. <u>Zhao, K.</u>; Wang, L.; Calizzi, M.; Moioli, E.; Züttel, A. Identifying Reaction Species by Evolutionary Fitting and Kinetic Analysis: An Example of CO<sub>2</sub> Hydrogenation in DRIFTS. *J. Phys. Chem. C* **2019**, *123*, 8785.
- 9. Spodaryk, M.; Zhao, K.; Zhang, J.; Oveisi, E; Züttel, A. The Role of Malachite Nanorods for the Electrochemical Reduction of CO<sub>2</sub> to C<sub>2</sub> Hydrocarbons. *Electrochimica Acta* **2019**, *297*, 55.
- 10. <u>Zhao, K.</u>; Wang, L.; Calizzi, M.; Moioli, E.; Züttel, A. In Situ Control of the Adsorption Species in CO<sub>2</sub> Hydrogenation: Determination of Intermediates and Byproducts. *J. Phys. Chem. C* **2018**, *112*, 20888.

- 11. Li, H.; Shang, J.; Shi, J. G.; Zhao, K.; Zhang, L. Z. Facet-Dependent Solar Ammonia Synthesis of BiOCl Nanosheets via a Proton-Assisted Electron Transfer Pathway. *Nanoscale* **2016**, *8*, 1986.
- 12. Li, J.; Zhao, K.; Yu, Y.; Zhang, L. Z. Facet-Level Mechanistic Insight into General Homogeneous Carbon Doping for Enhanced Solar-to-Hydrogen Conversion. *Adv. Funct. Mater.* **2015**, *25*, 2189.
- 13. Li, H.; Shi, J. G.; Zhao, K.; Zhang, L. Z. Sustainable Molecular Oxygen Activation with Oxygen Vacancies on the {001} Facets of BiOCl Nanosheets under Solar Light. *Nanoscale* **2014**, *6*, 14168.
- 14. Ding, X.; Zhao, K.; Zhang, L. Z. Enhanced Photocatalytic Removal of Sodium Pentachlorophenate with Self doped Bi<sub>2</sub>WO<sub>6</sub> under Visible Light by Generating More Superoxide Ions. *Environ. Sci. Technol.* 2014, 48, 5823.
- Zhao, K.; Zhang, L. Z.; Wang, J. J.; Li, Q. X.; He, W. W.; Yin, J. J. Surface Structure- Dependent Molecular Oxygen Activation of BiOCl Single-Crystalline Nanosheets. J. Am. Chem. Soc. 2013, 135, 15750.
- 16. Jiang, J.; Zhao, K.; Xiao, X. Y.; Zhang, L. Z. Synthesis and Facet-Dependent Photoreactivity of BiOCl Single-Crystalline Nanosheets. *J. Am. Chem. Soc.* **2012**, *134*, 4473.
- 17. Dong, G. H.; Zhao, K.; Zhang, L. Z. Carbon Self Doping Induced High Electronic Conductivity and Photoreactivity of g-C<sub>3</sub>N<sub>4</sub>. *Chem. Commun.* **2012**, *48*, 6178.
- \* Google scholar citations more than 2000 times in total, increasing on average 300 times per year.

## V Laboratory skills

**Experimental:** Diffuse Reflectance Infrared Fourier Transform Spectroscopy (DRIFTS), Raman, Tip-Enhanced Raman Spectroscopy (TERS), Thermal Desorption Spectroscopy (TDS), Differential Scanning Calorimetry (DSC), Transmission Electron Microscopy (TEM), X-ray Photoelectron Spectroscopy (XPS), Scanning tunneling microscope (STM), UV-vis spectroscopy, Photoluminescence, X-ray Powder Diffraction (XRD), Swagelok connections, glove box.

**Theoretical:** Density Functionary Theory (DFT) by Vienna Ab-initio Simulation Package (VASP) and Materials Studio.

## VI Teaching

- 1. Teaching assistant of Lecturer Guido Rothenberger for the course "Chimie Physique des Interfaces", 09, 2016 01, 2017, Undergraduate student course of Chemistry and Chemical Engineering, EPFL, Lausanne.
- 2. Teaching assistant of Prof. Andreas Züttel for the course "Thermodynamics of Energy Conversion and Storage", 02 06, 2017, Master Program of Chemistry and Chemical Engineering, EPFL, Lausanne.
- 3. Supervision of for two master students, Mr. Adrien Depallens and Mr. Matthieu Porchet, on research of

- "Spectroscopic study of CO<sub>2</sub> reduction on Ru/Al<sub>2</sub>O<sub>3</sub> surface", 09 12, 2017, Interdisciplinary / Disciplinary Project of Chemical master, EPFL, Sion.
- 4. Teaching assistant of Prof. Andreas Züttel for the course "Thermodynamics of energy conversion and storage", 02 06 2018, Master Program of Chemistry and Chemical Engineering, EPFL, Lausanne.
- Raman training and service for EPFL Sion users on Renishaw Raman instrument, 02 12, 2016, EPFL Sion.

## VII Language

Chinese (mother tongue), English (second language), French (B1).

#### **VIII Conferences**

- Kun Zhao, "Hydrogen Storage with CO<sub>2</sub> as Synthetic Hydrocarbons", invited speaker. Hydrogen-Metal Systems Gordon Research Seminar (GRS), June 29<sup>th</sup> – 30<sup>th</sup>, 2019, Castelldefels, Spain.
- 2. Kun Zhao, *et al.* "In Situ Control of the Adsorption Species in CO<sub>2</sub> Hydrogenation: Determination of Intermediates and Byproducts", **oral presentation**. 16<sup>th</sup> International Symposium on Metal-Hydrogen Systems, October 28<sup>th</sup> November 2<sup>nd</sup>, 2018, Guangzhou, China.
- Kun Zhao, et al. "Evolution of Adsorption species during CO<sub>2</sub> hydrogenation on Ru/Al<sub>2</sub>O<sub>3</sub>: Intermediates
  or Byproducts?", poster. The Fourteenth International Conference on Electronic Spectroscopy and Structure, October 8<sup>th</sup> 12<sup>th</sup>, 2018, Shanghai, China.
- 4. Kun Zhao. "H<sub>2</sub> Storage in Hydrocarbon by CO<sub>2</sub> Hydrogenation: Surfaces Interaction Studies", **oral presentation**. 12<sup>th</sup> Int. Symposium Hydrogen & Energy, February 11<sup>th</sup> 16<sup>th</sup>, 2018, Lausanne, Switzerland.
- Kun Zhao, Andreas Züttel. "CO<sub>2</sub> interactions with Fe, Co, Ni, and Cu powder surface", poster. Gordon Research Conference Carbon Capture, Utilization & Storage, June 11<sup>th</sup> – 16<sup>th</sup>, 2017, Colby-Sawyer College, USA.
- Kun Zhao, Andreas Züttel. "CO<sub>2</sub> adsorption reaction on Ni and Cu powder surface", poster, 11<sup>th</sup> Int. Symposium Hydrogen & Energy, February 26<sup>th</sup> March 3<sup>rd</sup>, 2017, Hawaii, USA.
- Kun Zhao, Andreas Züttel. "Spectroscopic Characterizations of CO<sub>2</sub> Reduction", poster, Summer School on Interfaces and Energy, September 4<sup>th</sup> – 9<sup>th</sup>, 2016, Göttingen, Germany.
- Kun Zhao, Andreas Züttel. "CO<sub>2</sub> Adsorption and Reduction in DRIFT and Raman", poster, International Summer School on CO<sub>2</sub> Conversion: From Fundamentals towards Applications, August 29<sup>th</sup> – September 2<sup>nd</sup>, 2016, Villars, Switzerland.
- 9. Kun Zhao, Andreas Züttel. "FT-IR Spectroscopy of CO<sub>2</sub> Adsorption and Reduction", poster, 15<sup>th</sup> International Symposium on Metal-Hydrogen Systems, August 7<sup>th</sup> 12<sup>th</sup>, 2016, Interlaken, Switzerland.

10. Kun Zhao, Andreas Züttel. "Spectroscopy of  $CO_2$  Electrocatalytic Reduction", poster, Hydrides as Energy Materials, June  $1^{st} - 3^{rd}$ , 2016, Aarhus, Denmark.

## **IX Life Hobbies**

Ski (good), Via Ferrata (good), Cycling (good), Fitness (intermediate), Chinese Ancient Music Instrument GuZheng (intermediate)