## The Skin of Venice: Automatic Facade Extraction from Point Clouds.

#### Guhennec, Paul

paul.guhennec@epfl.ch Digital Humanities Laboratory, EPFL, Switzerland

#### di Lenardo, Isabella

isabella.dilenardo@epfl.ch Institute for Area and Global Studies, EPFL, Switzerland

### Facades as objects of study

While recent years have seen the flourishing of a digital art history (Bonfait et al. 2021), the intersection between architectural history and "distant viewing" within Digital Humanities remains mostly an open ground. In particular, a large-scale compositional study of buildings based on the analysis of the distribution of elements on the fa çade is still unexplored.

Such comparative analysis of facades would, though, be particularly valuable, for they are key descriptive elements to understand the evolutionary palimpsest of a building, as if they were the historical 'skin' of its construction (Savorra 2006, Radding and Clark 1992). Facades also act also, often, as an indicator of the articulation of interior spaces (Trinanato 1948). Furthermore, the grammatical analysis of the facade permits its constitutive elements to be defined separately as key chronological and stylistic signs from which to infer information on its location, temporality, construction method and, of course, authorship (Zevi 1949, Zevi 1973).

Considering the articulation of the facade elements as a "discourse" – in which what is relevant is not only the element in itself but its position and relationship with the other elements – stems from a long tradition in architectural theory (Guadet 1904). Whether at the micro-scale of elements of a single facade, or with the larger-scale comparison of different neighbourhoods, cities or landscapes, across time and space, the identification of constitutive elements of facades and their "grammatical reading" would be particularly suited to a computational approach (Mitchell 1994).

# An automated method for orthophoto generation

These considerations call for a set of homogeneous representations of facades, free from disparities in perspectives and points of view, from which visual elements can be automatically extracted and onto which comparative analyses can be conducted at scale. Orthogonal views of facades are one possible homogeneous solution. The so-called orthophoto is a representation of the facade as if drawn on a plane with all points equally distant to the virtual camera, and is as such analogous to an orthographic drawn elevation. Producing orthophotos from photogrammetric surveys is a time-consuming effort and can hardly be envisioned for the city-scale analyses we suggest. Instead we propose an approach which

automatically generates orthophotos by combining an input pointcloud with footprint geometries.

The pointcloud we apply our method to covers the full city of Venice, and was obtained through photogrammetry on airborne images (Fig. 1). The footprint geometries are provided by the City of Venice open data portal, along with the geometries of canals and of the street network. We determine for each line segment in the footprints whether they spatially intersect with those canal and street geometries; this permits us to identify which segments correspond canal-side or street-side facades (Fig. 2). Each point in the point cloud is then labelled with the facade it belongs to (if any). To account for the depth of the facade (which is flattened in any orthophoto), we allow for a small buffer around the facade segment.

At the end of this process, a set of 3D coloured points is associated to each facade segment. This set needs to be rotated around the z-axis, so that the plotting plane of the photo is properly orthogonal to the vision axis. Applying Principal Component Analysis to the set of points permits us to identify the dominant axes, and as such to reduce points from three dimensions (x, y, z) to two (x', z). The orthophoto is finally obtained by scatter plotting the points in these reprojected coordinates.



Figure 1. Photogrammetric model of Venice obtained from airborne imagery



Figure 2. Distribution of canal-side (in blue) and street-side (in red) facades on the main island of Venice.

In this way, the facade orthophotos of more than 8,000 buildings were extracted, forming the first complete set of the facades of the city. As an example, the orthophotos of the 156 facades in direct contact with the Canal Grande are shown in (Fig. 3), ordered by height. The applicability of our method to smaller-scale point-clouds was also successfully tested on a denser photogrammetric model made from street-level images (Fig. 4). This complementarity of scale and densities is valuable, as photogrammetric cam-

paigns can be more easily conducted on site to overcome local occlusions or lower point density in the airborne model.



Figure 3. Orthophotos of 156 facades on the Canal Grande obtained following the automatic division of a city-scale photogrammetric model.



Figure 4. Automatically produced orthophotos of four buildings from a point-cloud obtained by street-level photogrammetry of the Campo Santa Margherita

# Research perspectives: Venetian architectural history at the large-scale

This proposed pipeline makes possible, for the first time, the extraction of orthophotos for all the facades of a city. Applied to Venice, the creation of such very large homogeneous facade corpora opens up new avenues of research for its architectural history.

A first study could consist in the exhaustive analysis of dimensions across the city, considering not only the landmarks of the city but also the larger mass of buildings considered 'minor'. Dimensional analysis makes it possible to recognise any proportional specificities of the best-known buildings, but above all to comparatively assess the dimensional structure (e.g. the number of storeys and the ratio between the height and width of facades) of the entire urban fabric in an attempt to understand its statistical dimensional distribution and more broadly, some of the fundamental characteristics of the Venetian urban space.

The facade orthophotos can also be input into a subsequent segmentation algorithm through which individual elements are identified and extracted (Murtiyoso et al. 2021). From there, another possible approach is the geometric-proportional analysis of the facade as a complex syntax of these individual elements. This classic methodology of facade analysis has also been attempted for the vernacular architecture of Venetian *palazzetti* (Goy 1989). This type of analysis is particularly interesting when attempting to reread the iconic architecture of large buildings as a repertoire of prototypical forms that can be redistributed to the architecture of the outlying lagoon landscape. The segmentation of the facades elements of the 8,657 buildings in the city would allow a comprehensive computational approach to assess the propagation of certain architectural motifs, as well as the density and popularity of certain rules of geometric proportionality among Venetian facades.

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