



## Compact in-line lensfree digital holographic microscope

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### ABSTRACT

Phase imaging provides intensity contrast to visualize transparent samples such as found in biology without any staining. Among them, digital holographic microscopy (DHM) is a well-known quantitative phase method. Lensfree implementations of DHMs offer the added advantage to provide large field of views (several mm<sup>2</sup> compared to several hundred μm<sup>2</sup>) and more compact setups than traditional DHM which have high quality microscope objectives. In this article, a lensfree DHM is presented using a side illumination technique in order to further reduce the device size. Its practical use is described and results on a transparent (phase only) sample are shown.

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### 1. Introduction

Imaging transparent objects is an important challenge for biology since cells are mostly transparent to visible and infrared light. Phase imaging allows imaging such objects without any prior staining of the sample. Different modalities exist. Phase contrast microscopy [1] and differential interference contrast (DIC) microscopy are two of the most spread techniques. They are based on the conversion of the phase changes due to the sample, which cannot be seen, into intensity changes that can be observed by eye or with a visible camera. Without additional modifications, these techniques do not give quantitative information about the phase shift, i.e. the optical thickness of the cell (the product of index of refraction by the cell thickness); they only allow visualization.

Digital holographic microscopy (DHM) is based on recording a hologram of the sample. The latter is then reconstructed digitally in order to retrieve the amplitude and phase of the sample. It is a quantitative phase imaging technique, which means that transparent objects cannot only be visualized but quantitative information about the optical thickness (i.e. morphology) can be extracted with nanometer precision [2–7]. It is thus a label-free method which does not require the kind of staining used in fluorescent microscopy [8]. The DHM technique also allows for real time data recording, such as to view the damage or the repair of cells in real time during laser microsurgery [9], observe cell division [10] or changes of cellular volume to monitor apoptosis for example [4,5,11–14]. During the digital image reconstruction, the object can be retrieved at different focal planes which makes 3D tracking

of particles/cells possible [2,15–19]. The observation of neuronal network activity also paves the way to functional imaging using DHM [20]. Finally biophysical parameters such as intra cellular refractive index are accessible [4,5,12,13] and dried mass concentration [21].

DHM has also been developed without any microscope objective or lenses in order to obtain a simpler setup. Those devices are made of the same three parts as a classical microscope: illumination, a sample on a slide and a detector; however the detection part only contains a camera; no optical element is situated between the sample and the camera. This makes the microscope more compact and cheaper. Such compact lensless setups can be used to monitor cellular growth directly within the incubator. Another advantage is the field of view (FOV) which is equal to the size of the camera chip (~several mm<sup>2</sup>). Most implementations use in-line digital holography [22–24]. The existing setups use partially coherent light (LEDs) in order to have less noisy images by limiting speckle and to be cost effective. However the compactness is impacted by the need of obtaining a certain degree of spatial coherence. Indeed, an inline setting uses a small distance between the cell plane and the camera chip (z2) and a large distance (z1) between the source and the cell plane [22]. This allows using a LED source with a pinhole of the order of 50 μm and obtaining a large FOV. The sum of the distance from pinhole to camera (z1 + z2) is the same as for typical inline holographic setup with large spatial coherence length. In the latter, the z2 is large and z1 is small. The partially coherent illumination is restricted to samples containing objects smaller or equal to the spatial coherence disk at the sample, which is typically 500–1000 times the wavelength. Since a highly coherent source is used in our implementation, we are not limited to have a small z1 (which is the case for LEDs to

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obtain a minimum spatial coherence). Hence, by placing the cell plane close the camera plane (small  $z_2$ ), the fringe magnification is close to 1 and the FOV is the illuminated area (chip). Effectively, the coherent point source is collimated by the analog hologram which creates a secondary illumination making the distance  $z_1$  and  $z_2$  small. Inline holography requires, in most cases, more than one hologram to retrieve the quantitative phase information of the sample (in the previous described concepts for off-axis DHM, only one hologram was required). However, if a phase image is wanted, one image is sufficient (but the quantitative phase is lost).

In the present paper, we present a lensfree DHM where the novelty resides in the side illumination which reduces the height of a lensfree DHM by one order of magnitude. The compact in-line lensfree digital holographic microscope is described in Section 2. Then more practical details are given in Section 3. Results on biological cells are shown in Section 4. Section 5 contains discussion and conclusion.

## 2. Compact in-line digital lensfree holographic microscope description

### 2.1. Working principle

The proposed device is based on in-line digital holography. This technique consists in illuminating the sample with a coherent or partially coherent light, such as from a laser for example. After the sample, the light is decomposed in two parts: one disturbed part and one undisturbed part as shown in Fig. 1. The disturbed part (also known as scattered part) is the part of the light that has been scattered by the transparent sample and the undisturbed part is the part of the light that goes through without “seeing” the sample. Both parts are coherent with each other and interfere at the camera plane. This interference pattern is sampled and digitized by the chip to give the so-called in-line hologram. The 3D information of the object is contained in this intensity image.

In order to retrieve the quantitative amplitude and phase of the sample, phase retrieval algorithms [25,26] require more than one hologram. This is due to the well-known twin-image problem. Indeed, the real, virtual and zero order images are superimposed in the spectrum, which implies that the image is disturbed by the out-of-focus twin-image [25] and the phase cannot be retrieved correctly. This twin-image problem arises from the intensity-only measurements and the subsequent loss of the phase. Fig. 2 shows a simulation of inline holography. The ground truth consists of human epithelial cells on a microscope slide have been imaged using a commercial DHM from LynceeTec. The reconstructed amplitude and phase of the cells measured with the DHM are then used to simulate inline holography. Fig. 2(a) is the original amplitude and Fig. 2(b) is the original phase. These two are com-

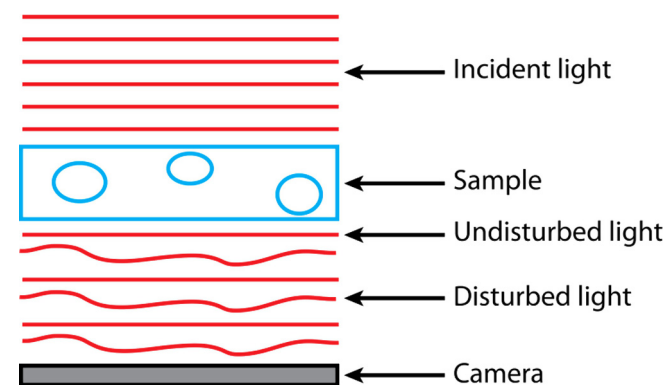


Fig. 1. Sketch of in-line digital hologram recording.

bined to make a simulated hologram. Fig. 2(c) (resp. Fig. 2(d)) shows the reconstructed amplitude (resp. phase) using only back-propagation of one hologram. The twin image is clearly visible creating ringing structures around objects.

This twin-image problem is characteristic of in-line holography. One way to avoid it is to use off-axis holography has been primarily developed to avoid this problem. This technique consists in illuminating the sample with one beam that interferes coherently with a second beam that does not go through the sample and makes an angle with the first beam. The real image, virtual image and zero order are then separated in the spectrum, which allows retrieving a twin-image free image and a correct phase with simple spectrum filtering and backpropagation algorithm. Compact off-axis DHM have already been presented, either as a device to be inserted in a classical microscope [27], or as a portable device that uses a grating to redirect part of the incident light to create a reference beam with a specific angle [28–30]. This technique still limits the compactness and/or the FOV due to the necessary angle between the two beams to have interference fringes resolved by a camera with specific pixel size and the fact that the reference beam should not go through the sample part.

In inline holography, this twin image problem is solved numerically by the mean of phase retrieval algorithms. They estimate both phase and intensity from intensity only holograms using additional information. This can be prior knowledge about the sample as support constraints [31–35]. The required information can also be gathered by recording several holograms of the same sample with for instance different distances between the sample and the camera [36,37], different light source wavelengths [38], or by illuminating the sample with different illumination directions [24,39]. The last method is used in the proposed device.

### 2.2. Device

The proposed device is made of 3 elements: a vertical-cavity surface-emitting lasers (VCSELs) array, a prism and a camera. Fig. 3 shows a schematic of the device with all the components. The total height of the device is  $\sim 10$  mm for a FOV of  $\sim 17$  mm<sup>2</sup>.

The array of sources is placed in front of the entrance surface of the prism. Each VCSEL is single-mode with a wavelength of 673 nm and a linewidth of 100 MHz (Vixar 680S). They consume low power ( $\sim 1$  mW) which makes them suitable for a battery operated device.

On the longest surface of the K9 prism, a photopolymer BAY-FOL<sup>®</sup>HX is laminated. This material is sensitive to light: it changes its refractive index according to the amount of light it receives. Thanks to this property phase (transparent) volume hologram gratings can be recorded inside. A grating is used to redirect the light from one direction to another direction. Several gratings are recorded in the photopolymer. The sequential recording process is described in Ref. [24]. For each VCSEL corresponds one hologram grating which diffracts its light out of the prism with a specific angle. The diffracted light goes through the sample and the in-line hologram is recorded by the camera. The angular scanning is performed in 2D.

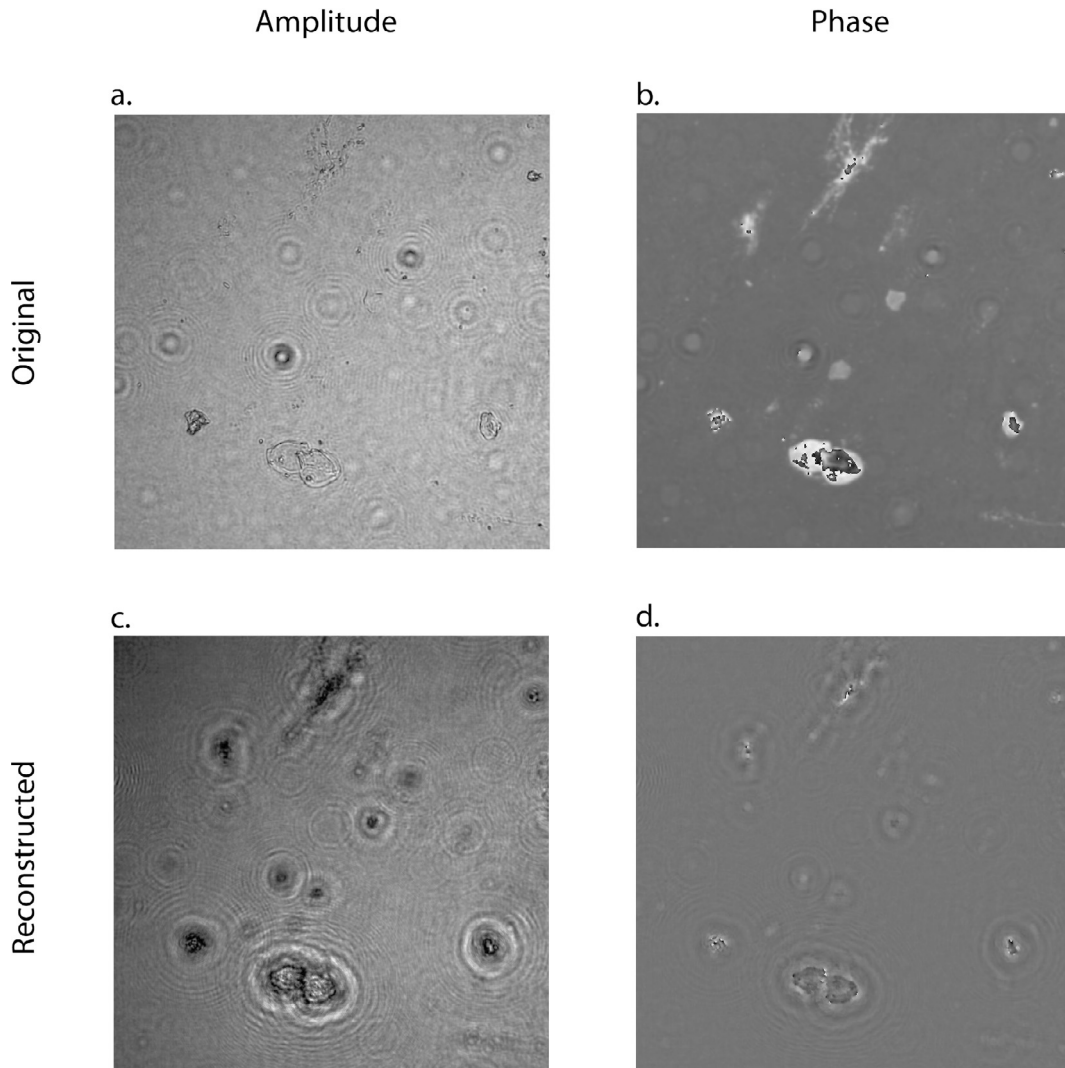
The camera is a complementary metal-oxidesemiconductor (CMOS) sensor with 5.2  $\mu\text{m}$  pixel size (Thorlabs DCC1545M).

## 3. Compact in-line DHM in practice

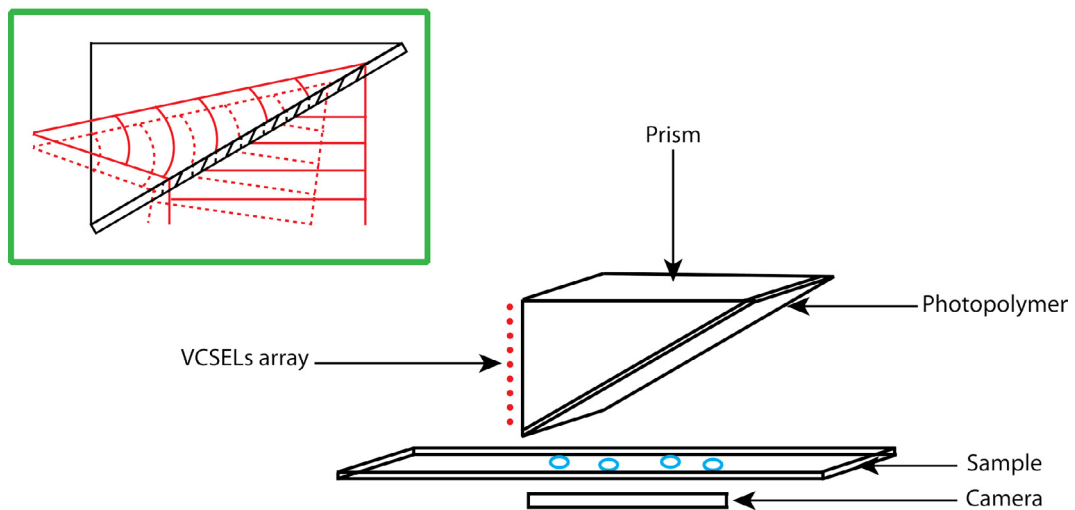
Image acquisition and reconstruction steps are depicted in Fig. 4.

### 3.1. Image acquisition

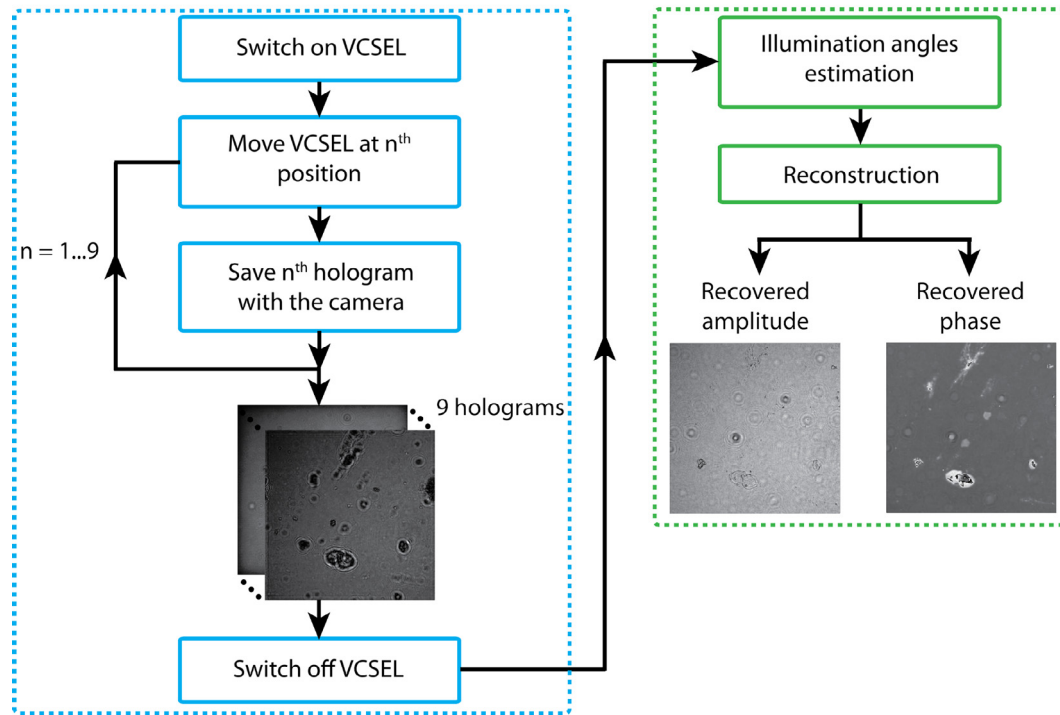
In the presented results only one VCSEL on a translation stage was used. The system can be made more practical, instead of trans-



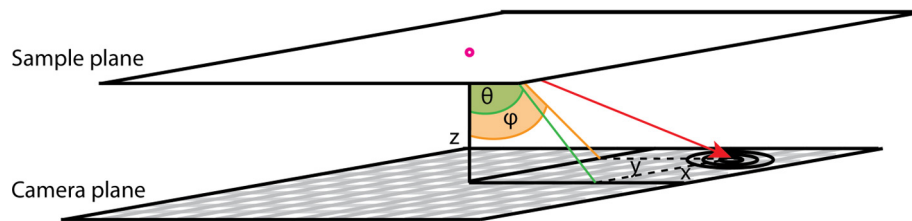
**Fig. 2.** Simulated backpropagation with an in-line hologram. (a) Original object amplitude. (b) Original object phase. (c) reconstructed amplitude using backpropagation algorithm with only one simulated hologram. (d) Reconstructed phase using backpropagation algorithm with only one simulated hologram.



**Fig. 3.** Scheme of the compact in-line lensfree digital holographic microscope. The distance between the sample and the lower edge of the prism is less than 1 mm, as well as between the sample and the camera. The prism is  $2\text{ cm} \times 1.7\text{ cm} \times 1\text{ cm}$ . The green inset shows the diffraction of two different illumination angles with two different gratings. The wavefront shaping is also depicted. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



**Fig. 4.** Acquisition and reconstruction process of the proposed compact in-line lensfree microscope. Acquisition steps are in blue and reconstruction step in green. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



**Fig. 5.** Illumination angles determination.  $\phi$  and  $\theta$  are the angles between the normal to the camera plane and the diffracted beam in x and y directions.

lating a single VCSEL, an array of individually addressable VCSELS would perform the same task but without any moving parts. A user-friendly Labview interface has been implemented to automate the recording procedure. The program starts by switching on the VCSEL, which is moved to the first position at the entrance surface of the prism. This first position creates a first beam by diffraction off the volume hologram. A first digital hologram is recorded. Then the VCSEL is moved to the second position at the entrance surface of the prism, which creates a second beam by diffraction off the volume hologram. A second digital hologram is recorded. This sequence is repeated for the 9 positions of the VCSEL which corresponds to 9 illumination directions of the sample.

### 3.2. Image reconstruction

The stack of holograms is then inserted in a registration algorithm [40] in order to extract the 2D shifts of each hologram at the camera plane with respect to the hologram taken with normal incidence. These shifts are then converted in illumination angles using the following equations

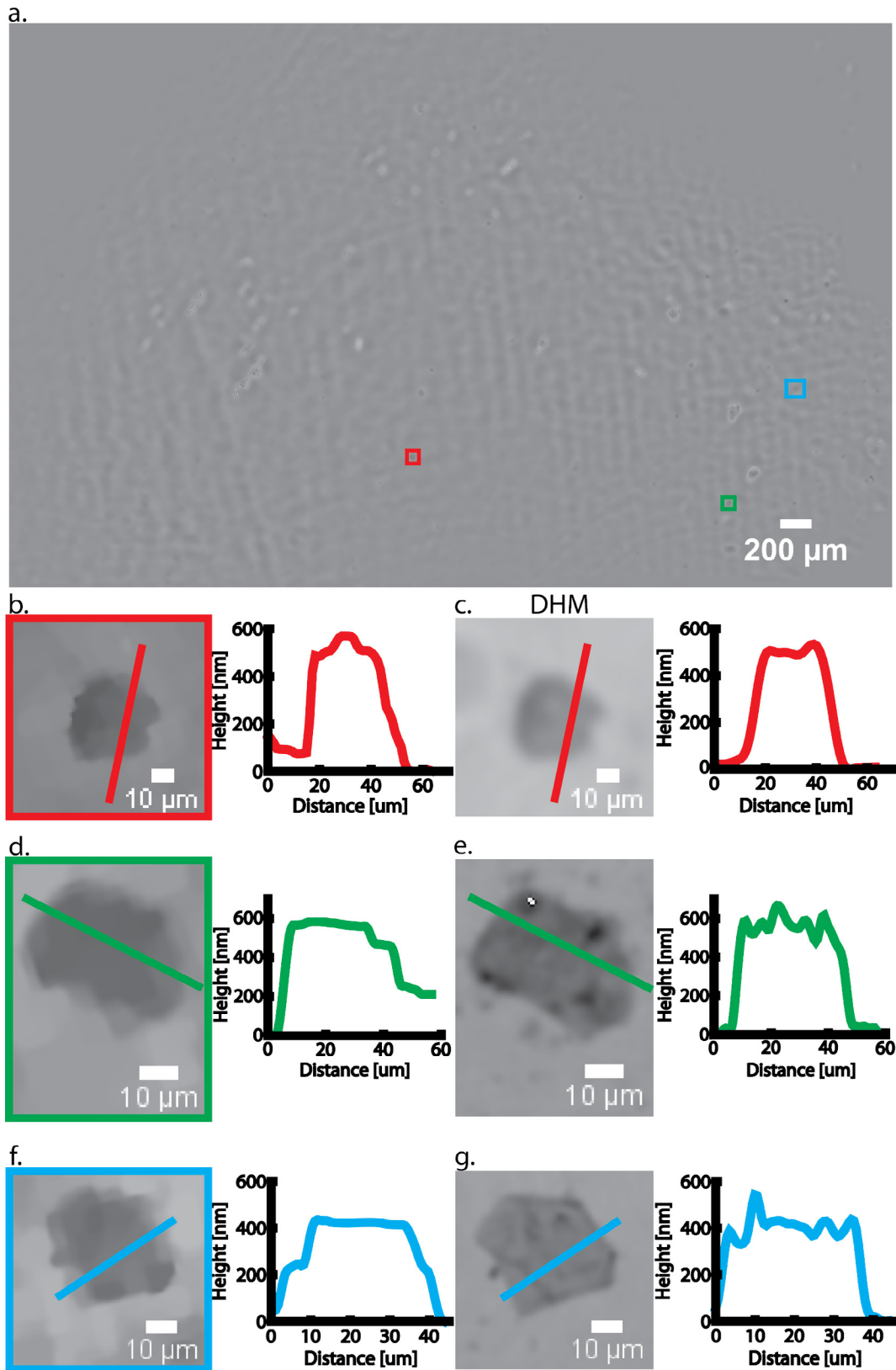
$$\phi = \tan^{-1} \frac{x \times p}{z}; \quad \theta = \tan^{-1} \frac{y \times p}{z}$$

where  $x$  (resp.  $y$ ) is the shift in pixels in one direction (resp. the other one),  $p$  is the pixel size and  $z$  is the distance between the sample and the camera. Fig. 5 shows the case of one illumination direction.

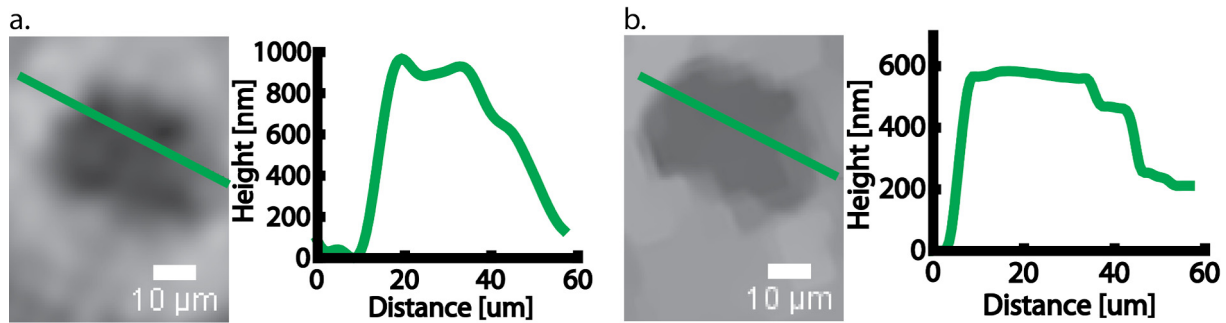
The algorithm takes the stack of holograms recorded with different illumination directions and iteratively estimates the object phase and amplitude with the help of appropriate proximity operators [41]. The reconstructed object  $o^+ \in \mathbb{C}^N$  (where  $N$  is the number of pixels) is estimated in a variational framework by minimizing a cost function which is a sum of the likelihood term  $L$  and a regularization term  $R$ :

$$o^+ = \arg \min_{o \in D^N} L(o) + \mu R(o)$$

where  $D = \{x \in \mathbb{C}; |x| = 1\}$  is the subspace of  $\mathbb{C}$  of phase only objects.  $\mu$  is a regularization parameter that tunes the balance between the information given by the measurements and the priors. In this approach known as penalized maximum likelihood, the data term is defined according to the forward model and the statistics of the noise, whereas the regularization function is designed to enforce some prior knowledge about the object (such as support, non-negativity, smoothness...). In the presented work,



**Fig. 6.** (a) Reconstructed phase with the proposed device and algorithm full FOV. (b) Reconstructed phase with the proposed device and algorithm (crop from a. of  $0.0064 \text{ mm}^2$ ). (c) Reconstructed phase with a Digital Holographic Microscope (DHM) using a  $5\times$  objective (crop  $0.0064 \text{ mm}^2$ ). (d) Reconstructed phase with the proposed device and algorithm (crop from a. of  $0.0033 \text{ mm}^2$ ). (e) Reconstructed phase with a Digital Holographic Microscope (DHM) using a  $10\times$  objective (crop  $0.0033 \text{ mm}^2$ ). (f) Reconstructed phase with the proposed device and algorithm (crop from a. of  $0.004 \text{ mm}^2$ ). (g) Reconstructed phase with a Digital Holographic Microscope (DHM) using a  $10\times$  objective (crop  $0.004 \text{ mm}^2$ ).



**Fig. 7.** (a) Reconstructed phase by only backpropagating one hologram recorded with the proposed. (b) Reconstructed phase with the proposed device and algorithm (crop from a. of 0.0033 mm<sup>2</sup>).

we use the well-known total variation regularization function [42]. The equation is solved by the mean of the alternating direction method of multipliers (ADMM). It uses a closed form solution for proximity operator of each function [41]. Such an iterative projection method is a Total Variation regularized evolution of the seminal algorithms of Gerschberg Saxon [43] and Fienup [44]. The outputs of the algorithm are the reconstructed amplitude and phase of the sample. In order to obtain quantitative phase results, a calibration of the reconstruction is made using commercial DHM images as references.

All the beams overlap on a ~17 mm<sup>2</sup> FOV, corresponding to ~50% of the camera chip size. This is in the same order of magnitude of FOV demonstrated in [22,23]. However it is larger than classical off-axis scheme since no objective is used.

#### 4. Experimental results

Dried human epithelial cells on a microscope slides were imaged using the presented device with illumination angles ranging between  $-9^\circ$  and  $9^\circ$  along both directions. The reconstructed phases from the device using 9 holograms and from a commercial DHM (LynceeTec T1003, 5 $\times$  and 10 $\times$  objectives) are shown in Fig. 6. Profile cuts were performed to show the quantitative phase capability of the technique. Using our device, the thickness of the cells can be estimated and is in agreement with the DHM observation. This thickness  $H$  is deduced from the phase value using the following equation:

$$H = \frac{\Delta\phi \times \lambda}{2\pi\Delta n}$$

where,  $\Delta\phi$  is the measured phase in radian,  $\lambda$  is the wavelength in vacuum and  $\Delta n$  is the difference between the refractive index of air and that of the dried cell. The refractive index of the dried cell chosen is 1.3.

However, as the illumination with our device is not as uniform as with a DHM, the reconstructed phase image is noisier and presents some ‘pixelation’ artifacts and non-uniformity across the full FOV. This last point is not a limitation since a calibration is taking into account this non-uniform illumination. The apparent noisy background of the reconstruction is coming from the illumination beams that suffer from non-uniformities in the photopolymer substrate.

Note that the DHM has a FOV about 4 times smaller with a 5 $\times$  objective for a similar resolution.

Fig. 7 shows the difference between the reconstructed phase by backpropagating only one hologram (Fig. 7(a)) and by using the proposed algorithm with 9 holograms (Fig. 7(b)). It is clear that the retrieved phase of the first case is not quantitative. The use of the proposed algorithm is relevant.

#### 5. Discussion and conclusions

A compact lensfree in-line digital holographic microscope was presented in this paper. The device is ~10 mm height and easy to use thanks to the user interface. It allows visualizing and measuring the thickness of transparent objects, which can be used to extract different parameters for cells study for example. The device has been tested with a phase only sample and showed good quantitative phase retrieval. We are currently working on the reconstruction algorithm to reduce the artefacts and increase the phase accuracy.

The digital holographic capacity can be combined with another microscopy modality such as fluorescence since the sample is visually accessible from the top of the device. Further work on fabricating a hand-held version of the device is ongoing.

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