Twin-image reduction in inline digital holography using an object segmentation heuristic

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Abstract. We present a digital image processing heuristic for the removal of the twin-image in inline digital holograms. Typically, the unwanted twin manifests itself as visible corruptive noise in the reconstruction plane. We reconstruct the unwanted twin-image at its in-focus plane and suppress it by first finding the boundary of the object, and then removing the optical energy within this boundary. In this plane, the wanted twin-image optical energy is largely dispersed outside this boundary and so it is retained. The heuristic’s effectiveness is demonstrated using a digital hologram of a real-world object.

1. Introduction
Since the invention of holography by Gabor [1] in 1948, the removal of the unwanted twin-image has remained a persistent area of research. The results of Gabor’s original in-line experiment were marred by the presence of this out of focus twin-image and the so called zero-order intensity terms. While some early attempts at removing these unwanted noise terms were successful [2] the additional experimental processing involved was laborious and time consuming. Following the invention of the laser an innovative approach to separate the wanted image from the unwanted terms was invented [3]. This entailed the use of an off-axis reference beam at some angle to the incident object wavefield. The new architecture proved to be a resounding success but notably increased the need for recording materials with higher resolution capacities.

Despite the obvious advantages of the off-axis method there remain a number of holographic applications for which it is either undesirable or is without implementation. The original in-line architecture remains the mode of choice in many cases such as electron holography, x-ray holography and gamma ray holography [4] due to the lack of physical elements, e.g. an x-ray lens. In the case of optical digital holography [6, 5, 7, 4, 8, 9] the off-axis method has been successfully proposed and investigated [5]. However, the inherent high resolution requirements of the off-axis technique impose a severe demand on the relatively low resolution of current digital cameras. The resulting restrictions include the placement of macroscopic objects at large distances from the camera and the permission of a very limited range of reconstruction angles (approximately 1-2 degrees for an acceptable image resolution). These parameters can be improved upon by an integer factor if an in-line set-up is used but this introduces the unwanted noise terms.

Removal of the twin-image in digital holography, optical or otherwise, can be broken down into at least five main groups; (i) Off-axis techniques [3, 5], (ii) Phase shifting interferometry (PSI) [6], (iii) Linear filtering [7] (iv) Phase retrieval methods [4] and (v) filtering of the complex wavefront in
reconstruction planes [8, 9]. Phase-shifting requires multiple captures with different phase shifts of the reference beam and is therefore not ideal for single capture applications. Linear filtering can work with a single capture but it is generally limited to real objects and is often not as successful as (i) and (ii). Phase retrieval can also work with a single capture but generally requires an intensive iterative computational process, the convergence of which is not always guaranteed. The method outlined in this paper falls into category (v). It requires only a single capture and no additional experimental processing. It can be performed rapidly and shows results comparable with the best of the other methods.

In [10, 9] the first instance of filtering the complex wavefront in the reconstruction planes of digital holograms appeared in the literature. This involved cutting out the wanted digitally reconstructed image from its surrounding pixels. However this area still contained considerable noise from the unwanted twin-image. In [5] spatial filtering was applied to an off-axis digital hologram. In [10, 8] a novel method of filtering the complex wavefront in the reconstruction domain was proposed and it is this method that we build upon in this paper. It was shown that by cutting out the reconstructed focused unwanted twin and returning to the plane of the wanted image by numerical propagation one could free oneself of the unwanted noise. The method was proposed only in the area particle holography and the removal of the twin-images was a manual operation. In this paper we propose the use of a similar technique for macroscopic objects and we make the significant addition of using automatic segmentation algorithms to remove the unwanted macroscopic image. While this paper focuses on optical digital holography, we note that it may be applied to any of the other holographic fields listed above.

2. Methodology

Several new approaches to the segmentation of holographic reconstructions into a compact representation of the useful information held in these reconstructions have been developed [13, 15, 11, 14, 12]. These approaches have used phase [11], intensity [13, 12] and complex information [14] as well as the estimated depth [15] to segment a reconstruction into object(s) and background. They can be further refined into approaches which segment using a single reconstruction [13, 11] or multiple independently focused reconstructions [15, 14, 12]. Most of these methods have been developed for segmenting reconstructions containing microscopic objects and plankton. The reconstructions of these near 2D biological organisms are relatively free of speckle noise compared to reconstructions of macroscopic objects encoded in DHs.
In this paper we will use a modified version of the object segmentation algorithm [12] developed for macroscopic objects, of which speckle is a fundamental characteristic.

We use the Fresnel approximation, the propagation transfer function, to numerically propagate our digital holograms [16]. This is a lossless transform and ensures that the energy of the object signal is preserved after propagation. Due to its use of the discrete Fourier transform with finite support and the conservation of energy the object signal will be wrapped within the reconstruction window. We therefore have to pad at the hologram plane sufficiently that the reconstruction window is larger than the spatial extent of the object signal. This is evident from Fig. 1 where the original hologram data was 2048 × 2048 and is centered within the new 8196 × 8196 hologram plane.

3. Algorithm
Our algorithm requires three inputs: a dc-term suppressed hologram \( H_{TI}(x,y) \) in which the dc or zero order term has been removed by some means, the depth, \( d \) mm, of the focal plane of the twin-image, and a block size \( n \times n \). Our algorithm can be described in three individual stages, and is displayed in Fig.1:

**Stage 1: Propagate to the twin-image plane**
The first stage requires us to numerically propagate our hologram to the focal plane of the unwanted twin-image using our input hologram \( H_{TI}(x,y) \) and the distance \( d \) mm. This reconstruction is stored in \( R_{TI}(x,y) \) and it’s intensity is used to calculate the segmentation mask.

**Stage 2: Segment twin-image**
To segment the twin-image we need to calculate a segmentation mask \( SMask(x,y) \). We use a modified version of the segmentation approach developed for digital holograms containing macroscopic

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**Figure 2.** Numerical reconstructions of knight hologram, reconstruction of (a) unprocessed hologram, (b) hologram after dc-term removal, (c) hologram after dc-term and twin-image removal, (d) centre of unprocessed hologram, (e) centre of hologram after dc-term removal, (f) centre of hologram after dc-term and twin-image removal and (g) segmentation mask.
objects [12]. In this modified approach the segmentation mask is created through the thresholding of a single variance map. The variance map is calculated by processing an in-focus reconstruction. We select a block size of $n \times n$ and process the intensity of our in-focus reconstruction $|R_{TI}(x,y)|^2$ by calculating variance on the overlapping blocks using:

$$V(k,l) = \frac{1}{n^2} \sum_{x=k-\lceil \frac{n-1}{2} \rceil}^{k+\lceil \frac{n-1}{2} \rceil} \sum_{y=l-\lceil \frac{n-1}{2} \rceil}^{l+\lceil \frac{n-1}{2} \rceil} \left[ |R_{TI}(x,y)|^2 - \mu \right]^2,$$

where $\mu$ is the arithmetic mean of the current block of $n \times n$ pixels and where any indexes $(x,y)$ that go outside the extent of $R_{TI}(x,y)$ evaluate to 0. A location with high variance indicates the nearby presence of an object. A threshold $\tau$ is chosen and $V(k,l)$ is transformed as

$$SMask(k,l) = \{ 1 , \text{if } V(k,l) < \tau 0, \text{if } V(k,l) \geq \tau,$$

where 1 denotes a background pixel and 0 denotes an object pixel. The binary image SMask is our segmentation mask and we obtain the segmented twin-image by simulating an inverse aperture using

$$R_S(x,y) = R_{TI}(x,y) \cdot SMask(x,y)$$

where · indicates pointwise product.

Stage 3: Propagate to the hologram plane

Once we have successfully segmented the twin-image we then propagate $R_S(x,y)$ to the hologram plane, a distance of $d$ mm. We now have a hologram, $H(x,y)$, free of the twin-image.

4. Experiments

We verify our twin-image removal technique using a DH of a real-world object. The wires object was positioned approximately 256 mm from the camera. Our CCD has 1280 $\times$ 960 pixels and we have padded the hologram plane to 4096 $\times$ 4096 pixels. A reconstruction of the hologram before suppression of the dc-term is shown in Fig. 2(a). We manually suppress the dc-term through applying a high pass filter to the Fourier transformed hologram and inverse Fourier transforming the result [5, 17]. We selected a circular aperture with a radius of 100 pixels for this hologram. The reconstruction after dc-term suppression is shown in Fig. 2(b). Our second input was selected by qualitatively determining the depth of the in-focus plane, we selected a depth of 256 mm. Our final input is the block size, 81 $\times$ 81. We display the calculated segmentation mask in Fig. 2(g) and the output reconstruction after twin-image removal in Fig. 2(c). We have zoomed in on the center of these reconstructions and displayed the respective images in Fig. 2(d-f).

5. Conclusion

Due to the large hologram size we decided to use the simplified segmentation mask creation process outlined in this paper instead of the more exhaustive approach from Ref. [12]. For objects with a large depth-of-focus it may be necessary to use the depth-independent segmentation approach from Ref. [12]. The accuracy of our approach is currently limited by the manual selection of a threshold in to create the segmentation mask and the manual selection of the twin-image in-focus plane. We have demonstrated the removal of the twin-image from a in-line digital hologram using only digital processing, removing the need for the use of experimental processing, multiple captures or an off-axis experimental setup. This process is computationally expensive and we intend to address through the implementation of our algorithm on a graphics processing unit.
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