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Quantum enhanced non-interferometric quantitative phase imaging

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Abstract

Quantum entanglement and squeezing have significantly improved phase estimation and imaging in interferometric settings beyond the classical limits. However, for a wide class of non-interferometric phase imaging/retrieval methods vastly used in the classical domain, e.g., ptychography and diffractive imaging, a demonstration of quantum advantage is still missing. Here, we fill this gap by exploiting entanglement to enhance imaging of a pure phase object in a non-interferometric setting, only measuring the phase effect on the free-propagating field. This method, based on the so-called "transport of intensity equation", is quantitative since it provides the absolute value of the phase without prior knowledge of the object and operates in wide-field mode, so it does not need time-consuming raster scanning. Moreover, it does not require spatial and temporal coherence of the incident light. Besides a general improvement of the image quality at a fixed number of photons irradiated through the object, resulting in better discrimination of small details, we demonstrate a clear reduction of the uncertainty in the quantitative phase estimation. Although we provide an experimental demonstration of a specific scheme in the visible spectrum, this research also paves the way for applications at different wavelengths, e.g., X-ray imaging, where reducing the photon dose is of utmost importance.

Introduction

Quantum imaging¹⁻³ and sensing⁴⁻⁶ have provided genuine and valuable advantages in many measurement applications ranging from fundamental physics^{7,8} to biology⁹⁻¹¹ from microscopy¹²⁻¹⁵ to optical sensors^{16,17}.

In particular, given the importance of optical phase measurement, appearing in all the science fields, a considerable effort has been made to exploit quantum entanglement or squeezing for this task. Quantum phase estimation through first-order interference involving the mixing of two optical modes in a linear 18,19 or nonlinear 20,21 interaction is well understood. The ultimate uncertainty bound with quantum optical states is known to scale with the number of probing particles N as N^{-1} , the so-called 'Heisenberg scaling'. In contrast, for the

classical probing state, it is limited to $N^{-\frac{1}{2}}$, referred to as the standard quantum limit (SQL) or shot-noise limit. Although the quantum advantage would, in principle, be disruptive for $N\gg 1$ in a realistic scenario, the gain over the SQL is rather in the form of a constant depending on the optical losses¹⁹. Proofs of principle of quantumenhanced linear interferometry with the so-called entangled NOON states have been achieved, for example, in phase contrast²² and polarization scanning microscopy²³, usually limited to the case of N=2. However, the generation and preservation of NOON states involving a higher number of particles are extremely demanding, so their usability in a real-world application is questionable. More practical is the use of squeezed states^{7,24–27}. The socalled SU(1,1) non-linear interferometer, involving parametric amplifiers instead of beam splitters for mixing the light modes, is promising for some applications, especially because the detection can be done at a wavelength different from the probing one²⁸ and the quantum advantage is robust to the detection noise and losses²⁹. However,

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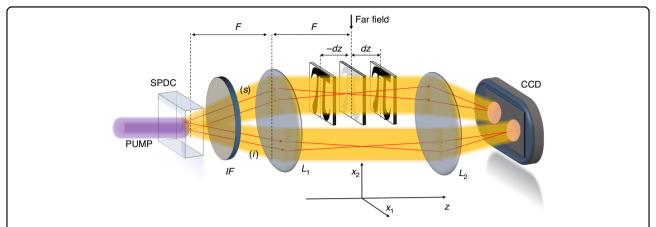


Fig. 1 Scheme of the NIQPR. Two correlated beams labeled signal (s) and idler (i) are generated by the spontaneous parametric down conversion (SPDC) pumped by a CW laser @405 nm and propagate through an imaging system composed of two lenses (L_1 is the far field lens with focal length F = 1 cm and L_2 is the imaging lens with focal length of 3 cm) and a test object. An interference filter (IF) is used to select a bandwidth of 40 nm around the degenerate wavelength (@810 nm) and to block the pump. L_2 images the far field plane on the camera chip with a magnification factor of about 8. The object is placed near to the far field of the source, and only the probe beam interacts with it. Phase information can be retrieved from intensity measurements taken at some out of focus ($\pm dz$) planes

apart from some proof of principle study³⁰, SU(1,1) interferometric schemes do not provide spatial resolution, that is, they do not operate in full-field mode. Conversely, there are other kinds of non-linear interferometric schemes that, if operated in very low gain, namely in the two-photon regime, can produce wide-field images^{31,32} but do not retain sub-shot-noise features.

Thus, in general, apart from some remarkable exceptions³³, quantum interferometry fails to provide quantum enhancement in multi-parameter wide-field mode, requiring raster scanning for extended samples.

We mention that a fully classical interferometric scheme, exploiting homodyne detection have been recently used to retrieve wide-field phase information with low illumination³⁴.

Other phase-imaging methods born in the quantum domain exploit second-order intensity correlation measurement (or two-photon coincidence) among signal and idler beams of SPDC to retrieve the phase information. In contrast, the first-order intensity measurement of either the signal or the idler arm does not show interference³⁵. These techniques include ghost imaging and diffraction^{36–40} quantum holography^{41–43}, quantum Fourier ptychography⁴⁴ and phase reconfigurable contrast microscopy⁴⁵. In general, the accumulation of a very large number of frames is required to estimate the secondorder momenta; thus, they are not suitable for real-time applications. For the same reason, the signal-to-noise ratio (SNR) is smaller than direct shot-noise-limited firstorder measurement. However, some advantages can be found in some cases at few photon illumination levels, for example, the rejection of independent external noise 46-48, robustness through turbulence and scattering^{49,50}.

Here, we present a quantitative non-interferometric quantum-enhanced phase-imaging (NIQPI) scheme exploiting quantum correlations that do not belong to any of the techniques mentioned above since it does not involve neither interference nor measurements of second-order momenta of the joint photon number distribution. In fact, only first-order momenta (intensities) in both branches are measured, so the full-field phase retrieval is obtained in real-time by quasi-single-shot measurement, as described in the following. We will demonstrate, theoretically and experimentally that, thanks to the quantum correlations, the method can provide a clear advantage compared to the corresponding classical direct imaging at a fixed number of photons interacting with the sample.

The NIQPI protocol exploits the scheme depicted in Fig. 1. We consider two quantum correlated beams produced by the spontaneous down-conversion process (SPDC), usually dubbed as signal beam (s) and idler (i) beam, with intensity patterns that are perfectly identical in the far-field, point-by-point. Even the shot-noise fluctuation is, in principle, perfectly reproduced in the two beams, which is impossible in the classical domain. The far field of SPDC is imaged at the sensors of a highly efficient and low-noise CCD camera. Only the signal beam probes the object, while the idler one is used as the reference for the noise. When the object is placed close to the far field but not exactly there, it produces an intensity perturbation on the signal photons propagation that is registered at the CCD camera. In particular, by measuring the signal intensity pattern $I(x, \pm dz)$ at the detection plane for two different 'defocused' object positions along the z-axis, namely, +dz and -dz, it is possible to reconstruct the phase profile $\phi(x, z = 0)$, by solving the so-called transport of intensity equation (TIE)⁵¹:

$$-k\frac{\partial}{\partial z}I(\mathbf{x},z) = \nabla_{\mathbf{x}} \cdot [I(\mathbf{x},0)\nabla\phi(\mathbf{x},0)] \tag{1}$$

where the derivative is approximated by the finite difference of two measurements out of focus, $\frac{\partial}{\partial z}I(\boldsymbol{x},z)\approx [I(\boldsymbol{x},dz)-I(\boldsymbol{x},-dz)]/(2dz)$ and $I(\boldsymbol{x},z=0)$ is the far field intensity of the source. In this sense, the technique is `quasi-single-shot' since only two intensity measurements performed at each plane are needed.

TIE is experimentally easy and computationally efficient as compared to the conventional phase retrieval techniques and, under suitable hypotheses described in the M&M, the method leads to a unique and quantitative wide-field image of the phase profile^{51–53}. However, the reconstruction obtained in the signal arm can be strongly affected by the detection noise and by the shot noise if low illumination is used (see M&M for a detailed discussion). On the one hand, a faithful reconstruction through Eq. (1) requires a small defocus distance |dz| in order to well approximate the derivative on its right-hand side. But, on the other hand, if |dz| is too small, the effect of the phase gradient on the measured intensity becomes negligible and can be covered entirely by the shot noise. Here, we show that the techniques of TIE can be combined with the wellestablished sub-shot-noise imaging protocol 14,54,55. In fact, we show that the noise pattern acquired on the idler beam can be used to reduce the effect of the shot noise in the signal beam, enhancing the overall phase image reconstruction and reducing the uncertainty on the quantitative spatially resolved phase retrieval⁵⁶. Note that ref. ⁵⁷ exploits TIE in a two-photon interferometric approach but, in that case, both photons travel through the sample, and the phase signal is improved thanks to the double accumulation of the phase of the two interacting photons.

NIQPI can work with partially coherent light and has some advantages compared to interferometric schemes: it can be directly applied to wide-field transmission microscopy settings and it is intrinsically more stable than an interferometric setup⁵³. Moreover, since NIQPI is based on free propagation effect, it can be realized without using lenses and optical components, thus being particularly suitable in extreme UV or X-Ray imaging, where optical components are not efficient but where SPDC sources are available and quantum-enhanced detection has been already demonstrated^{58,59}.

Results

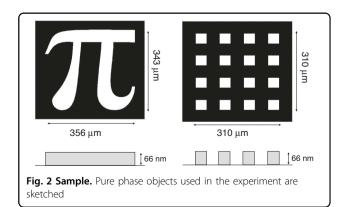
In our experiment, the number of photons per pixel per frame is about $n \approx 10^3$, so that for the purpose of this work we can substitute the continuous quantity I(x) appearing in Eq. (1) with the number of photons detected by the pixel at the coordinate x. Actually, before the TIE algorithm, we

apply an averaging filter of size d=4 to the intensity image, that consists in replacing the count in each pixel by the average count of a neighborhood of size 4×4 pix² around it, so that the final image conserves the same number of pixels. However, the averaging filter does not have any influence on the classical reconstructions, neither positive nor negative, while it improves the quantum reconstruction (see discussion in M&M and related Fig. 9). From now on we will refer to I(x) with that meaning, namely after the application of such averaging filter.

It is essential to point out that the SPDC source operates in the regime of very low photon number per spatio-temporal mode. In this limit, the photon statistics follows a Poisson distribution (see *M&M* Sec. for details). So, aside from the negligible contribution of electronic readout noise, the measurement on the single beam is shot-noise limited.

We image pure phase objects reported in Fig. 2 with 66 ± 3 nm thickness estimated by profilometer (DektakXT, Bruker). It corresponds to a phase shift of 0.230 ± 0.012 rad @ 810 nm, the central degeneracy frequency of the SPDC photons. The samples have been realized by etching structures on a UV-fused Silica glass window using buffered oxide etch.

Figure 3 shows the experimental reconstructions of the " π "-shaped phase sample of Fig. 2 as a function of the defocussing distance dz. Each pixel of the phase image corresponds to a transverse resolution of about 5 µm in the object plane. As a reference, the first row of Fig. 3 shows the phase retrieved averaging 100 shots, so the shot-noise effect is estimated to be negligible compared to the other sources of disturbance. However, even in this case, the reconstruction at small dz is not perfect because of the wellknown sampling error due to the discretization of the image, while at large defocussing the finite approximation of the derivative in z fails, essentially producing blurred images. These two opposite trends determine a defocussing distance for which the reconstruction is optimal. The second row of Fig. 3 shows the reconstructions obtained by single-frame intensities $I_s(x_s, \pm dz)$ measured at the CCD



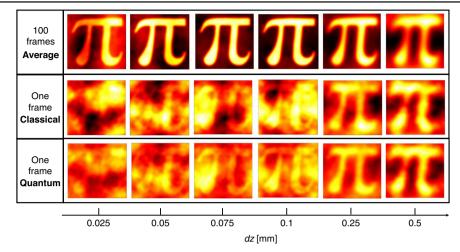


Fig. 3 Experimental reconstruction of the "π" sample as a function of the defocusing distance. First row presents the phase reconstruction when 100 intensity patterns are used. Second and third rows show the single-frame reconstructions for the classical and the quantum case, respectively. The classical reference is realized by the measurement performed using only the signal beam of the SPDC source. The size of each image is 80×80 pix²

camera in the signal arm. In this case, the shot-noise dominates and yields a drop in the reconstruction quality for all values of dz. How the noise on the intensity propagates to the phase reconstruction through the TIE is discussed in M&M. In particular, the region of smaller dz is the most affected since the intensity variation produced by the phase gradient is still small and is almost completely hidden in the shot noise.

In order to take advantage of the quantum correlations, here we propose to replace into the Eq. (1) the single beam intensity with the following one ^{55,60,61}:

$$I_{s-i}(\mathbf{x}, z) = I_s(\mathbf{x}_s, z) - k_{opt} \delta I_i(\mathbf{x}_i, 0)$$
(2)

where $\delta X \equiv \langle X \rangle - X$ represents the quantum fluctuation of the operator X, and $\langle \cdot \rangle$ is the quantum expectation value. In fact, the second term on the right-hand side of Eq. (2) is meant to compensate for the quantum fluctuation of the signal pattern exploiting the local correlation between probe and reference beams. The factor k_{opt} is a parameter chosen to minimize the residual fluctuation $\langle \delta^2 I_{s-i} \rangle$ and can be evaluated experimentally by a calibration of the system since it is related to the detection efficiency. A phenomenological model describing noise reduction is discussed in M&M. It turns out that the fluctuation of the quantity in Eq. (2) is reduced with respect to the shot noise according to the following expression:

$$\langle \delta^2 I_{s-i} \rangle = \left[1 - (1 - \alpha)^2 \eta^2 \right] \langle I(0) \rangle$$
 (3)

where $0 \le \eta \le 1$ is the heralding efficiency, namely the probability of detecting an idler photon in the pixel in x_i conditioned to the detection of the correlated signal photon in the pixel in x_s (see M&M section). The

parameter α is the average fraction of photons that deviate from the original path due to the phase object and depends on the average phase gradient. It can be experimentally evaluated as the spatial average of the quantity $\alpha(\mathbf{x}) \equiv \langle |I(\mathbf{x}_s,0) - I(\mathbf{x}_s,dz)| \rangle / \langle I(\mathbf{x}_s,0) \rangle$. Equation (3) states that the intensity fluctuation is reduced below the shot noise by a factor that depends on the efficiency in detecting quantum correlation and that it is effective if the object is weakly affecting the intensity distribution, namely when $\alpha \ll 1$. In our experiment, following the absolute calibration method reported in following filter size d=4. The value of α for the faint object considered is very small, for example we estimated $\alpha=7\cdot 10^{-3}$ for dz=0.1 mm.

The third row of Fig. 3 reports the reconstructions when the shot noise has been reduced using quantum correlations between probe and reference, according to Eq. (3). A general improvement of the reconstruction can be appreciated. As expected, the noise reduction is more evident at smaller dz leading to an improvement in the reconstruction of higher spatial frequency.

A quantitative analysis of the quality of the reconstructions and of the quantum advantage can be performed by evaluating the Pearson correlation coefficient between the reference phase image and the reconstructed one. The Pearson coefficient is defined as,

$$\mathscr{C} = \frac{\sum_{x} \left(\phi_r(x) - \overline{\phi}_r \right) \left(\phi(x) - \overline{\phi} \right)}{\sqrt{\text{Var}[\phi_r] \text{Var}[\phi]}} \tag{4}$$

where $\overline{\phi}$ and $Var[\phi]$ denote the spatial mean and variance of the phase image ϕ , and provides a simple and

commonly used figure of merit to quantify the similarity between the two images.

Figure 4, shows the Pearson coefficient as a function of the defocusing. Each curve has a correspondence with each image strip in Fig. 3. The red curve corresponds to the reconstruction using 100 frames, where shot noise is

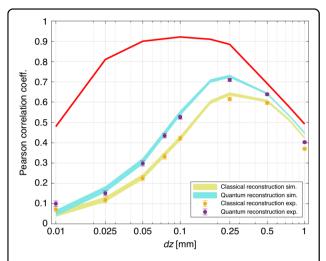


Fig. 4 Pearson correlation between reconstructed and reference images. The light-blue and yellow curves are the result of a Fourier optics based⁶⁷ simulation. The line-width is the confidence interval of one standard deviation after an average over 100 reconstructions for each *dz*. The experimental points are represented as purple and yellow dots with uncertainty bar also corresponding to one standard deviation. The red curve corresponds to the reconstruction obtained by summing of 100 intensity patterns, where the shot noise becomes negligible (in this case, quantum and classical correlation overlaps)

negligible (corresponding to the first strip in Fig. 3). The lower curves present the performance of single-frame experimental reconstructions, both quantum and classical, obtained from a simulation. Experimental points are well in agreement with these simulations. As expected, according to this figure of merit, an optimal reconstruction is reached for the intermediate value of defocusing. The quantum advantage is confirmed in terms of correlation with the reference image.

Besides the correct reconstruction of the complex phase profile assessed by the correlation coefficient, in many cases, it is of utmost importance to achieve a quantitative estimation of the phase. Figure 5a reports the phase value estimated as a function of dz, where, for the analysis, we have selected the region indicated in the red rectangle in the insets. The results indicate that the phase step is reconstructed without bias compared to the nominal value (red horizontal line) up to $dz = 100 \,\mu\text{m}$ for both the classical and the quantum case. The experimental points and their error bars agree with the confidence bandwidths provided by the simulations. Note that, the uncertainty on the estimated value is smaller for the quantum case. The quantum advantage, reported in Fig. 5b, is relatively constant in the range considered up to a 40%. From Fig. 5a is evident that a larger defocusing dz leads to an inconsistent phase estimation, indicating that the approximation of the derivative in Eq. (1) is no longer valid. This is consistent with the blurring of the images observed in the last two columns of Fig. 3 for large dz.

We have also tested a different object, the pattern of regular squares represented in Fig. 2. In Fig. 6a we report

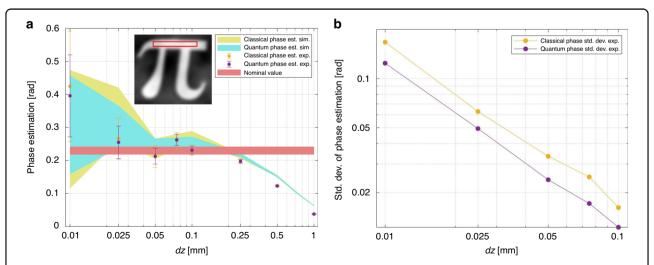


Fig. 5 Phase estimation. a The estimated value of the phase step (average of the rectangular selected region) is plotted at different defocusing distances. Experimental points for the classical (yellow dot) and the quantum (purple dot) phase retrieval are compared with the simulations. Simulation line-width and experimental uncertainty bar correspond to one standard deviation after an average over 100 reconstructions. For comparison, we also report the nominal value, estimated by the profilometer in reflection, of the phase step difference between the etched/nonetched areas. **b** The uncertainty in the phase estimation for quantum and classical cases demonstrate the quantum advantage

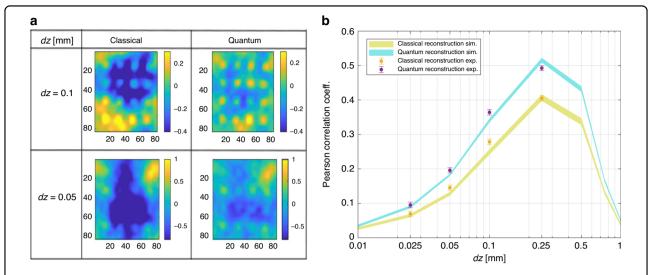


Fig. 6 Single-frame reconstruction of the squares pattern. a Examples of classical and quantum reconstructions of the sample with squares in Fig. 2 (right-hand side) for two different defocusing distances. **b** Pearson correlation coefficient between the reconstructed phase image by a single intensity frame and the reference image as a function of the defocusing

two examples of reconstructions, at $dz=50\,\mu\mathrm{m}$ and $dz=100\,\mu\mathrm{m}$, respectively. In Fig. 6b, the Pearson coefficient is reported alongside the simulations. The quantum advantage is comparable to the one obtained for the " π ", showing its robustness and independence from the particular spatial shape of the sample. Although the quantitative analysis of the Pearson coefficient confirms a similar quantum advantage as the one reported in Fig. 4, by looking at the images, it appears that the quantum advantage in the localization of dots could be even larger, indicating the possibility of significant advantages for specific tasks related to the recognition of finer spatial details.

In summary, these results demonstrate, for the first time, a significant advantage of quantum phase imaging, that can be further extended in the future with various potentially significant applications.

Discussions

Here, we have demonstrated a genuine quantum enhancement in non-interferometric quantitative phase imaging, showing that the spatially multimode quantum correlations can be used to reduce the detrimental effect of quantum noise in phase reconstruction. The present NIQPI scheme exports the classical methods known as the transport of intensity equation to the quantum regime, which provides real-time wide-field phase imaging and the quantitative local estimation of the phase. The last aspect is fundamental for many applications, providing reliable information on the object's internal parameters related to the phase.

We point out that, compared to the imaging of an amplitude object 14,54,55,61, the propagation of the shot

noise of the intensity measurement to the retrieved phase in the NIQPI is not as trivial. On the one side, the noise reduction allows reaching smaller defocusing distances for a better approximation of the derivative in the TIE, thus providing a more faithful reconstruction of the phase details. On the other side, artifacts due to the noise appear at low spatial frequencies (see discussion in *M&M* and Fig. 3) and are known to affect mainly the reconstruction of slow phase curvature, which produces weaker intensity signals⁶³. In this work, in order to obtain a quantitative validation of the protocol, we studied binary phase objects with sharp borders. However, it is expected that for an object with smoother phase changes, e.g., biological samples, the quantum advantage can be even more significant.

Materials and methods

Phase retrieval by TIE

A non-interferometric method⁵¹ to retrieve the phase of an object consists of probing the object with a light beam and measuring the intensity $I(\boldsymbol{x},z=0)$ at the object plane of coordinate \boldsymbol{x} and its derivative along the propagation axis z. The derivative is computed by a finite difference of two measurements out-of-focus of a distance dz, $\frac{\partial}{\partial z}I(\boldsymbol{x},z)\approx \Delta I(\boldsymbol{x},dz)/(2dz)$ with $\Delta I(\boldsymbol{x},dz)=I(\boldsymbol{x},dz)-I(\boldsymbol{x},-dz)$. Under paraxial approximation, the phase is retrieved using the TIE reported in Eq. (1).

Using energy conservation considerations, this equation has been proven valid even with partially coherent sources⁵². This feature makes the TIE approach perfectly suited for being used with light from SPDC, where transverse and longitudinal coherence lengths can be much smaller than the object size and the whole

illuminating beam. This is not a secondary aspect since it is exactly due to the multimode nature of the emission that correlation shows a local character and shot noise can be removed pixel-by-pixel in the image. The solution of the Eq. (1) is unique provided that the on-focus intensity I(x, 0) and the intensity derivative along z are known and the phase is continuous.

In our experiment the validity conditions for the TIE mentioned above, i.e., the paraxial approximation and the partial coherence, are satisfied.

Following the analysis in 63 , we assume that the intensity is varying sufficiently slowly that the effects of phase curvature dominate the intensity derivative, so that the right side of Eq. (1) can be safely approximated as $I_0\nabla^2\phi(x,0)$. Then, we consider for a moment that the only contribution to the finite difference $\Delta I(x,\delta z)$ is the noise fluctuation on the intensity measurement, $\sigma(x)$. In this case, substituting the latter in Eq. (1), one has that the phase artifacts in the reconstruction due to the noise are:

$$-k\frac{\sigma(\mathbf{x})}{\sqrt{2}I_0\delta z} = \nabla_{\mathbf{x}}^2 \phi_{noise}(\mathbf{x})$$
 (5)

The noise is assumed independent in the two planes $+\delta z$ and $-\delta z$, so it has been combined in quadrature. The Eq. (5) can be solved by taking the Fourier transform on both sides, leading to

$$k \frac{\widetilde{\sigma}(\boldsymbol{q})}{4\pi^2 \sqrt{2} I_0 \delta z |\boldsymbol{q}|^2} = \widetilde{\boldsymbol{\phi}}_{noise}(\boldsymbol{q})$$
 (6)

where the tilde indicate the Fourier transform and \boldsymbol{q} is the spatial frequency. The damping factor $|\boldsymbol{q}|^2$ of the higher frequencies at the denominator of Eq. (6) and the fact that the quantum noise (shot noise) has a flat white spectrum $\sigma_{SN}(\boldsymbol{q}) = \sigma_{SN}$, indicate that the effect of shot noise is to generate artifacts especially at lower frequencies, which are not intrinsically suppressed by the phase retrieval algorithm. This noise at low-frequencies is evident in the single-frame images reported in Fig. 3. Moreover, in the direct propagation problem, higher frequencies of the phase object generate a stronger effect on the intensity. Thus, based on these remarks, the regions with rapid changes in the phase (higher frequency) are better reconstructed than the ones characterized by slow curvature.

Experimental details: source, sample, detection *Source*

In the experiment, we use SPDC in the low gain regime in which a photon of the pump beam (p) (CW laser @405 nm), thanks to the interaction with a bulk betabarium borate non-linear crystal as long as 15 mm, have a small probability of converting in a couple of photons, usually called signal (s) and idler (i), subject to conservation

of energy, $\omega_p = \omega_s + \omega_i$, and of momentum, $\mathbf{k}_p = \mathbf{k}_s + \mathbf{k}_i$. Thus, under the plane wave pump approximation, signal and idler photons are perfectly correlated in frequency and direction $q_s = -q_i$ (assuming $q_p = 0$), although their individual spectrum is broadband both in space and frequency. In the far field, obtained at the focal plane of a thin lens in a f - f configuration, a transverse mode q is mapped in a single transverse position x according to the transformation $(2cf/\omega)q \rightarrow x$, so that momentum correlation translate in a position correlation, $x_s = -x_i$ (for degenerate frequency $\omega_s \approx \omega_i$). Signal and idler photons generate two symmetrical intensity noise patterns, and pairs of symmetric pixels of a camera will detect the same number of photons in the ideal lossless scenario in the same time window. Thus, quantum fluctuation at the object plane in the signal beam can be measured independently on the idler beam. The coherence time of the SPDC sources is typically of hundreds of fs and the spatial coherence in the far field is proportional to the inverse of the pump transverse size. The number of photons per spatial-temporal mode is very low, $\sim 10^{-8}$ and in general, the time bandwidth of the detector is orders of magnitude smaller than the inverse of the coherence time. Although the single SPDC mode is thermal, in the limit above, the detected multi-thermal photon statistics are indistinguishable from a Poisson distribution ⁶⁴.

For a Gaussian distributed pump with angular full-width-half-maximum (FWHM) of Δq the spatial cross-correlation is also Gaussian with FWHM of $\Delta x = 2\sqrt{2\log 2}\sigma = (2cf/\omega_p)\Delta q$: if a signal photon is detected in the position x_s the twin idler photon will be detected according to that Gaussian probability centered in $x_i = -x_s$. In the experiment we have estimated $\Delta x \approx 5 \, \mu \text{m}$ at the far-field plane.

Test sample

The structures are etched on to a fused Silica glass window (WG41010-A, Thorlabs) with an anti-reflection coating on one side. The window is coated with positive PMMA resist and the design is exposed using electron beams. The exposed structures are developed using a MIBK-IPA solution. After development, the window is submerged in a buffered oxide etch for 30 seconds to etch the structures into the window. The etch depth is determined by the submergence time. The unexposed resist is then removed using acetone solution.

The sample is fabricated to have negligible absorption difference between signal and idler beams. In fact, the two beams pass through the same glass and the only difference between the two beams path is the 66 nm extra glass that introduces a negligible transmission difference (of the order of 10^{-8} (ref. ⁶⁵). In Fig. 7, we report the intensity measurement at three different distances. When the sample is in the conjugate plane of the CCD camera, dz = 0, it is not possible to recognize the presence of the

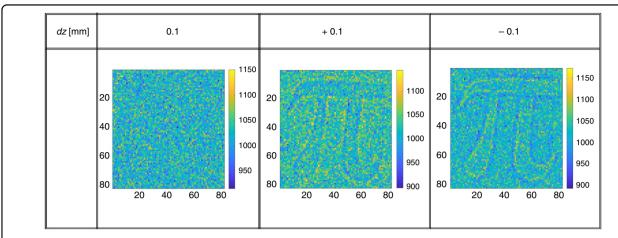


Fig. 7 Intensity images at different defocus. At dz = 0 the intensity-induced changes are negligible, while structures become visible for displacement of $dz = \pm 0.1$ with respect to the conjugate plane. The color-bar refers to the number of photon per pixel

object, while with $dz = \pm 0.1$ mm the structure becomes visible due to the propagation effects.

Detection

We measure the SPDC emission and the effect of the phase object by imaging the far field of the source at the sensor of a CCD camera (Princeton Pixis 1024 Excelon BR) operated in the conventional linear mode. Each pixel delivers a count proportional to the number of incident photons. The proportionality coefficient (electronic gain g) has been carefully estimated (g = 0.97) and the quantum efficiency of the camera is nominally above 95% @810 nm. The electronic readout noise is $4e^-/(\text{pix} \cdot \text{frame})$. The number of photons detected per pixel per frame is 10^3 , where the integration time of the camera is set to 100 ms. Thus, the photon flux per pixel is 10^4 photons/(pix · s).

Because of the finite cross-correlation area defined in the previous section of the M&M, in order to collect most of the correlated photons, two symmetrically placed detectors (or pixels) must have areas larger than the cross-coherence area. Pixel size is 13 μ m and a binning of 3 × 3 is performed to set the resolution to 5 μ m at the object plane, considering the magnification of about 8x, which matches the measured cross-coherence area. Actually, the heralding efficiency η , i.e., the probability of detecting an idler photon conditioned to the prior detection of the twin signal photon, depends on the pixel size L and possible misalignment Δ of the two pixels compared to the optimal positions, according to this expression:

$$\eta(L,\Delta) = \eta_0 L^{-2} \int_{L \times L} d\mathbf{x}_s \int_{L \times L} d\mathbf{x}_i \frac{1}{\sqrt{2\pi}\sigma} e^{-\frac{(x_i + x_s + \Delta)^2}{2\sigma^2}}$$
(7

where, η_0 is the single photon detection efficiency. As the the pixel size L increases with respect to the coherence area Δx , we have that $\eta \longmapsto \eta_0$.

As a consequence of that, in Eq. (3), the noise reduction depends on the pixel size used for the measurement. This trade-off between the quantum advantage and the spatial resolution of the intensity measurement has been reported and analyzed in the context of sub-shot-noise imaging of amplitude objects ^{14,64}.

In the experiment, in order to increase the heralding efficiency, and thus the quantum enhancement, we apply an averaging filter to the intensity image that substitutes the count in each pixel by the average of a square of size $d \times d$ pix² in which the original pixel is on the left-up corner. The quantum correlations are then enhanced because the effective integration area is larger, while the number of pixels in the final image is unvaried. The photon number correlation between the signal and idler beams can be evaluated by measuring the noise reduction factor (NRF) defined as NRF = $\frac{\left\langle \delta^2(I_i-I_s)\right\rangle}{\langle I_i+I_s\rangle}$. It is worth noting that NRF ≥ 1 for any classical state of light while for

factor (NRF) defined as NRF = $\frac{1}{\langle I_1+I_s \rangle}$. It is worth noting that NRF ≥ 1 for any classical state of light while for SPDC it is NRF_{SPDC} = $1-\eta$, indicating the non-classical character of the correlation. In Fig. 8, we report the NRF as a function of the resolution, i.e., the size of the averaging filter. Note that, the photon statistics of the single beam is indeed Poissonian as expected. This is witnessed by values of the Fano factor (F), which is compatible with

the unity, where the Fano factor is defined as $F = \frac{\left\langle \delta^2 I \right\rangle}{\left\langle I \right\rangle}$ (see Fig. 8). So, using the signal beam of the SPDC source for the intensity measurement and then for phase reconstruction represents the best, i.e., shot-noise-limited, classical approach in this non-interferometric context.

We underline that in the present imaging of pure phase objects, a certain resolution loss in the intensity pattern is well tolerated. In fact, as it is described in the first section of this M&M, the solution of the TIE tends by itself to suppress the higher frequency component of the intensity

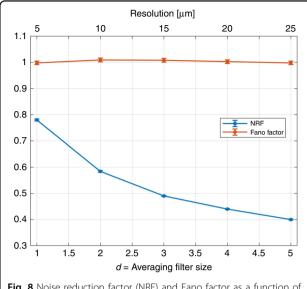


Fig. 8 Noise reduction factor (NRF) and Fano factor as a function of the averaging filter size

perturbation. Thus, to some extent, a reduction of resolution in the intensity measurement does not affect the phase reconstruction of the classical scheme. In Fig. 9, we report the quality of the phase reconstruction, evaluated in terms of the Pearson correlation with the reference image in Fig. 2, as a function of the averaging size. On the one hand, the quantum reconstruction is enhanced as expected when the effective resolution in the intensity measurement decreases (*d* increases). On the other hand, the classical reconstruction is unaffected, confirming that classically we do not have any negative issue related to the poorer resolution in the intensity pattern. In summary, moderate use of the averaging filter to enhance the quantum effects is perfectly legitimate in this context.

Model for the noise reduction

According to the scheme in Fig. 1, the signal beam of SPDC probes the object, while the idler beam is used as a reference for the noise. When the object is inserted with a defocusing distance dz, the photons in the signal beam are deflected, creating local depletion or accumulation of photons at the detection plane, and the perturbed intensity can be written as:

$$I_s(\mathbf{x}, z) = I_s(\mathbf{x}, 0) - \Delta I_-(\mathbf{x}) + \Delta I_+(\mathbf{x})$$
(8)

where $I_s(\mathbf{x},0)$ is the unperturbed pattern and \mathbf{x} indicates the position of a pixel. The quantity $\Delta I_-(\mathbf{x})$ ($\Delta I_+(\mathbf{x})$) represents the photons that are deflected out from (into) the position \mathbf{x} . From now on, to simplify the notation, the spatial average of the quantities is simply indicated by dropping the spatial dependence on \mathbf{x} . Since the total number of photons is conserved, the spatial average of the number of photons per pixel is unchanged, i.e., $I_s(z) = \frac{1}{2} \sum_{i=1}^{n} \frac{1}{2} \sum_{i=1$

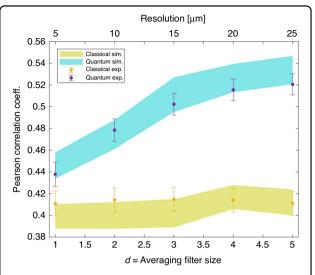


Fig. 9 Pearson correlation as a function of averaging filter size. The purple (yellow) dots represent the values corresponding to the quantum (classical) experimental reconstructions. The quantum (classical) confidence bands at one standard deviation are also shown in turquoise (yellow)

 $I_s(0)$ and thus $\Delta I_- = \Delta I_+$. The loss of photons can be described as the action of a beam splitter of transmittance $1-\alpha$ (average value) so that, the quantum expectation value for the ΔI_- is simply $\langle \Delta I_- \rangle = \alpha \langle I_s(0) \rangle = \langle \Delta I_+ \rangle^{64}$. In this work, we are interested in small perturbations that can be hidden or strongly affected by the quantum noise, so we will assume $\alpha \ll 1$.

In order to reduce spatial intensity fluctuation, we replace in the TIE the quantity in Eq. (8) with the one in Eq. (2) involving the idler measurement.

The optimal factor k_{opt} appearing there is chosen to minimize the residual fluctuation, by imposing $\frac{\partial}{\partial k} \langle \delta^2 I_{s-i}(\mathbf{x}, z) \rangle = 0$. We obtain,

$$k_{opt}(\mathbf{x}) = \frac{\langle \delta I_s(\mathbf{x}_s, z) \delta I_i(\mathbf{x}_i, 0) \rangle}{\langle \delta^2 I_i(\mathbf{x}_i, 0) \rangle}$$

$$\left\langle \delta^{2} I_{s-i}(\boldsymbol{x}, z) \right\rangle = \left\langle \delta^{2} I_{s}(\boldsymbol{x_{s}}, z) \right\rangle - \frac{\left\langle \delta I_{s}(\boldsymbol{x_{s}}, z) \delta I_{i}(\boldsymbol{x_{i}}, 0) \right\rangle^{2}}{\left\langle \delta^{2} I_{i}(\boldsymbol{x_{i}}, 0) \right\rangle}$$
(9)

According to the Poisson distribution of the detected photon, we can replace the variance of the intensities appearing in Eq. (9) with the respective quantum mean values. In particular, by performing the spatial averaging, one gets $\langle \delta^2 I_i(0) \rangle = \langle I_i(0) \rangle = \langle \delta^2 I_s(z) \rangle = \langle I_i(z) \rangle$. For the calculation of the covariance in Eq. (9), note that $I_s(\mathbf{x}_s,z)$ and $I_i(\mathbf{x}_i,0)$ are correlated only for the fraction of photons that are not lost, namely not deviated from the path due to phase effect on the propagation along z. Thus, after spatial

averaging⁶⁴:

$$\langle \delta I_s(z)\delta I_i(0)\rangle = (1-\alpha)\langle \delta I_s(0)\delta I_i(0)\rangle \tag{10}$$

$$= \eta(1 - \alpha)\langle I_s(0)\rangle \tag{11}$$

The last equality is justified again using the Poisson hypothesis, and introducing the heralding efficiency η that spoils the otherwise perfect signal-idler correlation. By using Eq. (11), and the Poisson hypothesis above, we can rewrite Eq. (9) as,

$$k_{opt} = (1 - \alpha)\eta$$

$$\left\langle \delta^2 I_{s-i} \right\rangle = \left[1 - (1 - \alpha)^2 \eta^2 \right] \left\langle I_s(0) \right\rangle$$

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Author contributions

G.O. and I.R.B. devised the scheme of NIQPI. P.B. participated in the realization of the setup and preliminary measurement with G.O., while A.P. and C.N. performed the final experimental acquisitions, which were realized in the laboratories of the research sector directed by M.G. The samples have been prepared and characterized by S.S. and S.P. Simulations and data analysis have been carried out by G.O. and A.P. with the help of I.R.B. I.R.B. and M.G. supervised the whole project. I.R.B. wrote the paper with the contribution of all authors.

Data availability

All data needed to evaluate the conclusions are reported in the paper. Further data, for reproducibility of the results, are open access available at https://doi.org/10.5281/zenodo.8039275.

Conflict of interest

The authors declare no competing interests.

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