Criticality in single-distance phase retrieval

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Abstract: We investigate why in free-space propagation single-distance phase retrieval based on a modified contrast-transfer function of linearized Fresnel theory yields good results for moderately strong pure-phase objects. Upscaling phase-variations in the exit plane, the growth of maxima of the modulus of the Fourier transformed intensity contrast dominates the minima. Cutting out small regions around the latter thus keeps information loss due to nonlocal, nonlinear effects negligible. This quasiparticle approach breaks down at a critical upscaling where the positions of the minima start to move rapidly. We apply our results to X-ray data of an early-stage Xenopus (frog) embryo.

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References and links
With the advent of 3rd-generation synchrotron light sources, producing highly intense and spatially coherent X-rays, the investigation of materials of low absorption but considerable phase-shifting capability can be and is routinely performed. This opens up the potential for the application of new, nondestructive imaging techniques relevant to in vivo investigation of biological samples. Moreover, satisfactory phase retrieval from a single-distance projection in free-space propagation in combination with the small exposure times due to large photon fluxes at synchrotron beamlines enable time resolved tomographic imaging for the study of evolution processes on the cellular and subcellular level. Therefore, in particular the field of developmental biology should benefit from the method discussed in this paper.

For monochromatic and parallel X-ray illumination (wave number \( k = \frac{2 \pi}{\lambda} = \frac{2 \pi n}{\lambda c} \), wave length \( \lambda \), circular frequency \( \omega \), energy \( E \), quantum of action \( h \), speed of light in vacuum \( c \)) of a pure-phase object, which does not diminish the (ideal) spatial coherence properties of the incoming wavefront, we consider free-space propagation of the modulated exit wavefront \( \psi_{z=0}(\vec{r}) \) away from plane \( z = 0 \) to generate intensity contrast \( g_z \equiv \frac{I_z - I_{z=0}}{I_{z=0}} \) at distance \( z > 0 \) [1–7].

Here \( I_z \) is the intensity measured in plane \( z \), and \( I_{z=0} \equiv \text{const} \) for a pure-phase object. In such a setting, we consider phase retrieval based on a projected version of the contrast-transfer function (CTF) [8], which represents a linear and local [9] relation between \( g_z \) and the phase shift \( \phi_{z=0} \) exiting the object, when \( \phi_{z=0} \) violates the CTF criterion

\[
\phi_{z=0} \left( \vec{r} - \frac{\pi z}{k} \frac{\hat{z}}{\hat{z}} \right) - \phi_{z=0} \left( \vec{r} + \frac{\pi z}{k} \frac{\hat{z}}{\hat{z}} \right) \ll 1. \tag{1}
\]

Here \( \vec{\xi} \) is a transverse-plane wave vector. Such a regularized form of CTF retrieval, named \textit{projected CTF}, was proposed in [10] and yields, via the local retrieval of an effective phase in the spirit of a quasiparticle model [11], remarkably good results for single-distance phase retrieval. The present paper aims at a deeper understanding of this situation.

In Fresnel theory the following important relation holds [8]

\[
(\mathcal{F} I_z)(\vec{\xi}) = \int d^2 r \exp(-2\pi i \vec{r} \cdot \vec{\xi}) \times \psi_{z=0} \left( \vec{r} - \frac{\pi z}{k} \frac{\hat{z}}{\hat{z}} \right) \psi_{z=0}^* \left( \vec{r} + \frac{\pi z}{k} \frac{\hat{z}}{\hat{z}} \right), \tag{2}
\]

where \( \mathcal{F} \) denotes Fourier transformation in the transverse plane. Writing \( \psi_{z=0} = \sqrt{I_{z=0}} e^{i\phi_{z=0}} \) and expanding the exponential up to quadratic order in \( \phi_{z=0} \) yields upon substitution into Eq. (2) and use of the Fourier convolution theorem

\[
(\mathcal{F} g_z)(\vec{\xi}) = 2 \sin(s) (\mathcal{F} \phi_{z=0})(\vec{\xi}) - \cos(s) \int d^2 \xi' (\mathcal{F} \phi_{z=0})(\vec{\xi}')(\mathcal{F} \phi_{z=0})(\vec{\xi}' - \vec{\xi}'),
\]

\[+ e^{is} \int d^2 \xi' e^{-\frac{4\pi^2 \xi' \cdot \xi}{k}} (\mathcal{F} \phi_{z=0})(\vec{\xi}')(\mathcal{F} \phi_{z=0})(\vec{\xi} - \vec{\xi}') + O((\mathcal{F} \phi_{z=0})^3), \tag{3}
\]

where \( s \equiv \frac{2\pi^2 \xi \cdot \xi}{k} \). CTF retrieval corresponds to a truncation of the right-hand side of Eq. (3) at linear order in \( \mathcal{F} \phi_{z=0} \). Provided that \( (\mathcal{F} g_z)(\vec{\xi}) \) exhibits zeros of the same order as those of the sine function at \( |\vec{\xi}| \equiv \sqrt{(k n)/(2\pi z)} \) (\( n = 0, 1, 2, \cdots \)) CTF retrieval in Fourier space does not produce singularities. In analogy to quantum statistical mechanics, CTF represents a

is nonlocal terms in Eq. (3) starting at these “vacua”. Explicit violations of scaling symmetry are introduced by the nonlinear and average related to a “partition function” the exit phase map, to the CTF “dispersion law”. To do so, we appeal to a 2D isotropic Gaussian model (GM) of

\[ F \]

Let us now exemplarily investigate the effect in Eq. (3) of the quadratic, nonlocal correction to a global U(1) or constant-phase-shift symmetry of Fresnel theory.) When the exponential in the round brackets can be neglected. On the other hand, the ratio is

\[ \frac{2\pi z}{\sigma^2} \]

Thus the sine function in Eq. (4) as induced by the cosine correction (order \( S^2 \)) in the vicinity of \( |\xi|^2 = \frac{2}{1} \) is concerned. Using

\[ a \sin x + b \cos x = \sqrt{a^2 + b^2} \sin(x + \phi) \]

where \( \phi = \arcsin \frac{b}{\sqrt{a^2 + b^2}} \), we have at \( \frac{2}{1} \) to linear order in \( S \) and with the above parameter values a phase shift \( \phi \) of the sine function in Eq. (4) given as

\[ \varphi \sim \frac{1}{4} S \frac{1}{\sqrt{e^{-2\pi^2 \sigma^2 \xi^2} + \frac{\xi^2}{16}}} \sim \frac{1}{4} S. \]

Thus, for sufficiently small values of \( S \), the shift of the first zero of the sine function as introduced by the quadratic, nonlocal corrections in Eq. (3) is negligible for the Gaussian model...
On the other hand, for the symmetry to be broken dynamically the locations, where minimal \(|\tilde{\xi}|_{\text{min,1}}\) does not move away from \(|\tilde{\xi}|_{1}\) at all for a wide range of \(S\) values that upscale the regime where linear CTF retrieval is applicable. A critical increase of \(|\tilde{\xi}|_{\text{min,1}}\) sets in rather late at a maximal relative phase variation larger than unity. Therefore, the entirety of higher-order corrections to the right-hand side of Eq. (3) actually stabilizes our perturbative, Gaussian-model finding of a slow variation of \((\mathcal{F} g_\mathcal{C})(\tilde{\xi})\) are no longer invariant under the symmetry. The fact that the minima of the modulus of \(\mathcal{F} g_\mathcal{C}\) are not moving for \(0 < S \leq S_c\) indicates that explicit scaling-symmetry violation is not supplemented by dynamical breaking all the way up to \(S_c\). Recall that explicit symmetry breaking refers to the fact that finite as opposed to vanishing values of the “energy” \((\mathcal{F} g_\mathcal{C})(\tilde{\xi})\) are no longer invariant under the symmetry. On the other hand, for the symmetry to be broken dynamically the locations, where minimal “energy” is attained, are shifted under the symmetry. For a continuous symmetry such as scaling symmetry the latter situation changes the spectrum drastically: It introduces new degrees of freedom (Goldstone bosons [12–14]), and the description in terms of the old spectrum is lost. In our case, this happens for \(S \geq S_c\). (The quasiparticle concept leading to an effective CTF phase then is as useless as the description of an atomic crystal in terms of moderately interacting atoms which, however, applies to the liquid phase.) If condition (1) is sufficiently well satisfied then limited resolution in transverse Fourier space in any discretized formulation does not resolve the small-residue poles of CTF retrieval that appear in \(\mathcal{F} \phi_{\tau=0}\) at \(|\tilde{\xi}|_{\text{min,1}}\), and numerical Fourier
inversion yields satisfactory phase retrieval. We define $\phi_{\text{max}} \equiv \max \{\phi_{=0}(\vec{r})\}$ with the convention that $0 \leq \phi_{=0}(\vec{r})$. With our pixel resolution of $\Delta x = 1.1 \, \mu m$, $E = 10 \, keV$, and $z = 0.5 \, m$ we are in this CTF scaling regime when setting $\phi_{\text{max}} = 0.01$ for the phase map $\phi_{=0,\text{CTF}}$ in Fig. 1(a) which serves as an input to Fresnel forward propagation. In this case we refer to the phase map as $\phi_{=0,\text{CTF}}$. In Fig. 1(b) we show angular averages $\mathcal{F} \, g_z(\vec{\xi}) = \frac{1}{2\pi} \int_0^{2\pi} d\theta \, |\mathcal{F} \, g_z(\vec{\xi})| \cos \theta, \sin \theta \rangle$ (modulo a suitable treatment of truncation rods) as functions of $|\vec{\xi}|$ obtained for two inputs $\phi_{=0} = S\phi_{=0,\text{CTF}}$ with $S = 200 < S_c = 356$ and $S = 450 > S_c$. ($S = 1$ corresponds to $\phi_{=0,\text{CTF}}$.)

While for $S = 200$ the position of $|\vec{\xi}|_{\text{min}}$ coincides with the CTF “vacuum” $|\vec{\xi}|_1$ this is not true for $S = 450$. “Finite-energy” minima at $S = 200$ introduce poles in Fourier space and thus quasiperiodic artifacts [10] into position-space CTF retrieval. To cope with this, the following projection is applied [10]

$$
(\mathcal{F} \, g_z)(\vec{\xi}) \rightarrow \Theta \left(\left| \sin \left(\frac{2\pi^2 z \vec{\xi}^2}{k S}\right) \right| - \varepsilon \right) \times (\mathcal{F} \, g_z)(\vec{\xi}),
$$

where $\frac{2\pi^2 z \vec{\xi}^2}{k S} > \xi$, $\Theta$ denotes the Heaviside step function, and $\varepsilon$ is a threshold ($0 < \varepsilon < 1$) such that minima are centrally cut about the CTF “vacua”. Applying CTF retrieval to the projected intensity contrast on the right-hand side of replacement (6) yields good results even for very small values of $\varepsilon$.

To show how scaling symmetry is increasingly broken in an explicit way within the window $1 \leq S \leq S_c$, where no dynamical breaking occurs, we have investigated in Fig. 2 the behavior of the transfer function of the CTF approximation in dependence of $S$ for the phase map of Fig. 1(a). Observing a smooth sinusoidal shape for $S = 1$ justifies the above-mentioned consideration of $\phi_{\text{max}} = 0.01$ as a representative of the linear scaling regime. Notice the increasingly dramatic and nervous deviations from this sinusoidal dependence for $S = 100$ and $S = 200$. Therefore, we conclude that even for maximal phase shifts well below $S_c \times 0.01 \sim 3.6$ (moderately strong maximal phase variation) the assumed linearity of CTF retrieval fails judging by the behavior of the associated transfer function.

Let us now spell out the reasons for why projected CTF retrieval is good within the window...
Fig. 3. Plot of pixel number $p_{\xi}$, which belongs to $|\vec{\xi}|_{\text{min},1}$, as a function of $S$. Notice the onset of critical behavior (second-order like phase transition) to the right of $S_c = 356$. Notice also that the variance of $|\vec{\xi}|_{\text{min},1}$ for $S < S_c$ practically is zero.

Fig. 4. Plot of function $R(S) \equiv \frac{v_{\text{max},1}}{v_{\text{min},1}}$. (The “data” $\mathcal{F}_{GF}(\xi_{\text{max},1})(S)$ and $\mathcal{F}_{GF}(\xi_{\text{min},1})(S)$ was fitted to 9th-degree polynomials, and the derivatives defining $v_{\text{max},1}$ and $v_{\text{min},1}$ were taken of these polynomials.)

$1 \leq S \leq S_c$. Figure 3 shows how the position of the first minimum $|\vec{\xi}|_{\text{min},1}$ changes with increasing $S$. At $S_c = 356$, which corresponds to $\phi_{\text{max}} \sim 3.6$ and thus to a profound violation of condition (1), a critical increase of $|\vec{\xi}|_{\text{min},1}$ away from the first CTF “vacuum” $|\vec{\xi}|_1$ takes place. A fit to $A(S - S_c)^\nu + B$ ($A, B, \nu$ real, $S > S_c$) of this critical behavior, which resembles a second-order phase transition, yields an exponent $\nu \sim 0.15 \pm 0.1$, the large error being associated with instabilities w.r.t. the length of the fitting interval. ($|\vec{\xi}|_{\text{min},1} - |\vec{\xi}|_1$ is only a pseudo-order parameter for dynamical scaling-symmetry breaking since the latter occurs on top of explicit breaking. For a discrete-symmetry analog, consider an Ising model with magnetic field $H$. For $H = 0$ the model is $\mathbb{Z}_2$ invariant, for $H \neq 0$ not. For $T \leq T_c$ ferromagnetic ordering occurs, and, given moderate values of $H$, it makes sense to consider mean magnetization a pseudo-order parameter for dynamical $\mathbb{Z}_2$ breaking.)

Figure 4 depicts the ratio $R$ of $v_{\text{max},1} \equiv \frac{d}{dS} \mathcal{F}_{GF}(\xi_{\text{max},1})$ and $v_{\text{min},1} \equiv \frac{d}{dS} \mathcal{F}_{GF}(\xi_{\text{min},1})$ as a function of $S$ for $1 \leq S \leq S_c = 356$. Notice that for all such $S$ the growth of the first maximum by far out-
races that of the first minimum. This can be understood as follows. While, according to Eq. (3),
the growth of the minima solely is due to the nonlocal terms at quadratic and higher order in
$F_{φ_0}$ there is a local component in the growth of the maxima (scaling proportional to $S$ due
to the linear and local CTF order in Eq. (3)). For reasonably “nervous” $F_{φ_0}$ and for sufficiently moderate $S$ successive $n$-fold autoconvolutions of $F_{φ_0}$ ($n ≥ 2$) tend to homogenize
the nonlinear corrections, which are proportional to $S^n$, to small values. Thus, in this regime
the dominantly linearly and locally driven growth of the maxima outraces the growth of the
minima, and little information is lost if for $1 ≤ S ≤ S_c$ thin rings centered at $|⃗ξ_{min}|$ are cut out to
enable singularity-free phase retrieval [10], see Eq. (6).

Fig. 5. The CTF situation: (a) phase retrieval of a projection through the four-cell stage of
a Xenopus embryo. The size of the projection is 1725 x 1338 pixel$^2$, or 1.3 x 1.0 mm$^2$. (b)
2-D slice of the tomographic reconstruction of the electron density. The data, compare with
Fig. 6(a),(d), was taken at the ID19 beamline at ESRF with $E = 20$keV (monochromatized
to $ΔE/E = 10^{-4}$ using double Si 111 crystals), 1599 projections per tomogram, an exposure
time per frame of 2 s, an effective pixel size of 0.745 μm, and an object-detector distance
of $z = 0.945$ m. The size of the slice is 1532 x 1691 pixel$^2$, or 1.14 x 1.25 mm$^2$. In both
images large-scale variations were subtracted for better visibility.

Figures 5 and 6 show the results of an analysis of experimental data for phase contrast from
the four-cell stage of a Xenopus embryo. Figure 5 indicates the uselessness of CTF retrieval
in view of the considerable phase variations introduced by the object, and Fig. 6 points out
the higher resolving power of projected CTF versus retrieval using the linearized transport-of-
intensity equation (yolk particles clearly can be tracked in former case).

The following self-consistency test for projected CTF can be devised in applications to nearly
pure-phase objects. Retrieve the phase $φ^{CTF}_{z=0}(⃗r)$ according to projected CTF (including a subtrac-
tion of large-scale variations arising from small absorption effects) from the measured intensity
contrast $g_z(⃗r)$, let $φ^{CTF}_{z=0} → S φ^{CTF}_{z=0}$ with a moderate value of $S$, say, $S = 2$, Fresnel propagate
$S φ^{CTF}_{z=0}$ to $z$ to generate the new intensity contrast $g_z^{S}(⃗r)$ and investigate whether, compared to
$F g_z(⃗ξ) = F g_z^{CTF}(⃗ξ)$, the minima $|⃗ξ_{min,1}|$ have moved in $F g_z^{S}(⃗ξ)$. In Fig. 7 $F g_z^{S}(⃗ξ)$
($S = 1, 2$) are depicted for projected CTF applied to the Xenopus data of Fig. 6(a),(d), and
it is obvious that $|⃗ξ_{min,1}|$ did not move. Thus we conclude that projected CTF retrieval self-
consistently operates within its regime of validity for this particular experiment.

To summarize, we have in a quite generic way shown why the local (quasiparticle) approach
to single-distance phase retrieval yields robust and good results. Specifically, we have con-
sidered the behavior of the angular averaged modulus of the Fourier transform of the intensity

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contrast $\mathcal{F}_{g_z}(|\vec{\xi}|)$ which emerges at distance $z$ under Fresnel propagation from a pure-phase induced exit-plane test map of realistic complexity. On one hand, an investigation was performed of the response of the position of the first minimum $|\vec{\xi}|_{\text{min,1}}$ of $\mathcal{F}_{g_z}(|\vec{\xi}|)$ to upscaling of the test map (scale factor $S$). For $S = 1$ phase variations were prepared to lie within the Fresnel scaling regime (symmetry under moderate upscaling, linearity). For a large range $1 \leq S \leq S_c$ the value of $|\vec{\xi}|_{\text{min,1}}$ is observed to be indifferent to upscaling: It stays at the first CTF “vacuum” $|\vec{\xi}|_1$. At $S_c = 356$, which corresponds to a maximal phase variation of about 3.6, critical behavior sets in which resembles a second-order like phase transition of critical exponent $\nu = 0.15 \pm 0.1$. (At $S_c = 356$ explicit breaking is supplemented by a dynamical breakdown of scaling symmetry, and $|\vec{\xi}|_{\text{min,1}} - |\vec{\xi}|_1$ is the associated pseudo-order parameter.) We have not in detail investigated other minima of $\mathcal{F}_{g_z}(|\vec{\xi}|)$, but, qualitatively, we see similar behavior. Therefore, cutting out thin rings around $|\vec{\xi}|_n$ ($n = 1, 2, 3, \ldots$) from the Fourier transform of the intensity contrast, as is done in projected CTF to enable regular phase retrieval at large values of $S$, works all the way up to $S_c$. On the other hand, we have shown that under upscaling the growth of the first maximum of $\mathcal{F}_{g_z}(|\vec{\xi}|)$ outpaces the growth of the first minimum for $1 \leq S \leq S_c$. This can be
understood by the fact that the growth of maxima is generated linearly in $S$ and locally in the Fourier transformed phase map $\mathcal{F} \phi_{z=0}$ while the growth of minima, albeit subject to higher powers in $S$, is due to successive autoconvolutions of $\mathcal{F} \phi_{z=0}$ which yield small coefficients generically. As a consequence, the omission of thin rings around $|\vec{z}_n|$ ($n = 1, 2, 3, ...$) from the Fourier transform of the intensity contrast keeps information loss at a low level. Therefore, it seems that below $S_c$ the use of projected CTF for the retrieval of moderately strong phases is justified. We have applied projected CTF to the phase retrieval from single-distance intensity induced by an early-stage Xenopus embryo under coherent X-ray illumination. Moreover, we have shown self-consistency of projected CTF in this case by a moderate upscaling of the retrieved phase and subsequent Fresnel forward propagation, and we have performed a tomographic reconstruction of the biological sample.

Notice that in philosophy projected CTF is similar to Zernike phase contrast where a bias on the spectrum of the wave field is introduced at locations in Fourier space with no relevant information content [15, 16]. In Zernike phase-contrast microscopy this gives rise to useful intensity contrast. As we have shown in the present work, to retrieve phase in a local way in Fourier space from a single-distance intensity-contrast map, projected CTF may introduce a bias on the spectrum of the latter at fixed locations because the associated information loss is minimal.

Since projected CTF is single-distance and applicable to a wide range of relative phase variations it should be useful for real-time tomographic in vivo or in vitro phase-contrast imaging of compact developmental stages of optically opaque biological model systems such as Xenopus embryos [17].

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