

Computational adaptive optics for broadband optical interferometric tomography of biological tissue

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Aberrations in optical microscopy reduce image resolution and contrast, and can limit imaging depth when focusing into biological samples. Static correction of aberrations may be achieved through appropriate lens design, but this approach does not offer the flexibility of simultaneously correcting aberrations for all imaging depths, nor the adaptability to correct for sample-specific aberrations for high-quality tomographic optical imaging. Incorporation of adaptive optics (AO) methods have demonstrated considerable improvement in optical image contrast and resolution in noninterferometric microscopy techniques, as well as in optical coherence tomography. Here we present a method to correct aberrations in a tomogram rather than the beam of a broadband optical interferometry system. Based on Fourier optics principles, we correct aberrations of a virtual pupil using Zernike polynomials. When used in conjunction with the computed imaging method interferometric synthetic aperture microscopy, this computational AO enables object reconstruction (within the single scattering limit) with ideal focal-plane resolution at all depths. Tomographic reconstructions of tissue phantoms containing subresolution titanium-dioxide particles and of ex vivo rat lung tissue demonstrate aberration correction in datasets acquired with a highly astigmatic illumination beam. These results also demonstrate that imaging with an aberrated astigmatic beam provides the advantage of a more uniform depth-dependent signal compared to imaging with a standard Gaussian beam. With further work, computational AO could enable the replacement of complicated and expensive optical hardware components with algorithms implemented on a standard desktop computer, making high-resolution 3D interferometric tomography accessible to a wider group of users and nonspecialists.

low-coherence tomography | three-dimensional microscopy | aberration compensation | holography | inverse scattering

The light microscope is a fundamental tool underpinning many historic developments in medicine and biology. Modern optical microscopy, capitalizing on the development of the laser, has provided capabilities to image thick specimens and visualize microstructure deeper into scattering tissues. The confocal laser scanning microscope uses a pinhole to reject light from out-of-focus planes to achieve superior optical sectioning and enable 3D imaging (tomography). With two-photon microscopy, imaging depth can be increased to hundreds of micrometers in biological tissue (1).

The development of optical coherence tomography (OCT) has enabled in vivo tomography with a relatively large imaging depth (1–3 mm) in scattering tissues (2–6). OCT has achieved widespread clinical use in ophthalmology (7), and applications in cardiology, oncology, gastroenterology, and dermatology are currently undergoing translation from the research lab into clinical practice (3, 8, 9). OCT has also found applications in developmental biology (10). In addition to imaging the structure of tissue, it can be adapted to perform molecular imaging (11, 12). Near-infrared broadband sources can provide micrometer scale axial resolution (13), but transverse resolution, which is inversely proportional to N.A., is typically low, resulting in an asymmetric 3D point-spread function (PSF). The use of higher N.A. optics

(14) has enabled cellular resolution (15), but with significant reduction of the depth of field. One solution is to combine tomograms obtained at different focal depths (16), at the expense of acquisition time and mechanical scanning. Interferometric synthetic aperture microscopy (17, 18), a computed imaging technique based on a solution to the inverse scattering problem for OCT, enables object reconstruction with spatially invariant focal-plane resolution without having to scan the focus in depth. Although interferometric synthetic aperture microscopy (ISAM) corrects defocus for all depths, it does not account for aberrations of the incident beam (19).

Aberrations in optical microscopy degrade resolution and reduce the signal-to-noise ratio (SNR). Defined as deviations from ideal optical wavefronts, aberrations can be caused by the optical imaging system or by the sample itself. Adaptive optics provides a means to correct aberrations by physically modifying the effective pupil phase profile of the objective lens, enabling significant improvements in resolution and SNR (20–24). Adaptive optics has enabled high-resolution imaging of the rods and cones of the human retina, with confocal microscopy (24) and OCT (25–27). A disadvantage of adaptive optics (AO) methods is that they require relatively elaborate and expensive optical components, and any optimization of the aberration correction needs to be achieved at the time of imaging. Additionally, existing AO hardware is incompatible with catheter-based endoscopic OCT systems (6, 8, 9, 28) for imaging deep within the human body, as well as needle-based OCT systems (29). Both of these imaging configurations experience problems with astigmatism that are expected to become more prominent at higher resolution.

Computational correction of aberrations provides an alternative method of aberration correction, providing the flexibility of post-data-acquisition correction without the hardware overhead of AO. An example of this method is numerical aberration correction in digital holography (30–36). Aberration correction in digital holographic microscopy (DHM), however, has only been demonstrated for nonbiological samples or “thin” biological samples (e.g., a single cell) using discrete-wavelength optical sources, and not for broadband tomography of bulk biological tissue. A different computational AO (CAO) method proposed space-variant deconvolution to compensate sample-specific aberrations (37). Demonstrated by imaging of a fluorescent bead under an oil droplet, this method used a separate measurement of the sample

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by Nomarski differential interference microscopy to map its refractive index. This map was then used to perform 3D optical ray tracing to compute the magnitude of the aberrated PSF used for deconvolution. This CAO method is suited for noninterferometric imaging of fluorescence from relatively weakly scattering biological samples, and performed deconvolution based only on the magnitude of a computed PSF.

In this paper, we present a method for post-data-acquisition aberration correction that computationally modifies the effective pupil phase profile corresponding to the complex PSF of an OCT system, and demonstrate tomographic imaging of bulk biological tissue with computational aberration correction. An OCT tomogram is a record of both amplitude and phase of the backscattered field, and therefore it can be considered to be related to DHM (38). As in digital holography, the acquired signal is an invertible transformation of the optical field, suggesting it may be possible to compensate for beam aberrations. However, an OCT system possesses distinct advantages that make it well suited to performing high-resolution tomography in scattering (turbid) biological tissue. Unlike with DHM, in OCT and ISAM a broadband optical signal is collected. With a spectral-domain OCT system, reconstruction is simplified by the simultaneous (therefore phase-stable) recording of the wavelength-dependent interferometric signal at each lateral scan coordinate.

Another distinguishing characteristic of OCT from DHM is scanned acquisition with a focused beam, similar to a confocal microscope, which rejects cross-talk from adjacent regions and out-of-plane scattering in turbid samples. A challenge is presented by the fact that object reconstruction may need to account for spatially dependent phase noise from random fluctuations of interferometric optical path length or from beam scanning errors. We have developed algorithms to correct phase noise in order to generate phase-stable data for CAO and subsequent ISAM reconstruction. Additionally, the theoretical treatment of aberrations should account for the double-pass detection (reflection geometry) of an OCT system. In addition to providing a unique capability for correcting aberration effects in OCT and ISAM, our CAO technique is easily adaptable to other broadband interferometric imaging geometries, and for nonbiological imaging applications as well.

Results and Discussion

Fig. 1 demonstrates aberration correction of 3D, broadband, interferometric data acquired from a silicone phantom with subre-

solution titanium-dioxide (TiO_2) microparticles, acquired with a highly astigmatic beam (see *Methods* for details of the experimental setup and data acquisition). This sparse phantom provides a convenient measure of the depth-dependent 3D PSF of the system. An astigmatic optical system is characterized by asymmetry that results in two axially separated line foci that are orthogonal to each other in the transverse plane. The so-called circle of least confusion, where the transverse PSF of an aberrated optical system has the minimum circular cross-section, occurs midway between the two line foci, in the plane of least confusion. After standard OCT processing (see *Methods* for details of standard OCT, CAO, and ISAM processing), the 3D tomogram of the subresolution scatterers clearly shows the presence of two line foci associated with astigmatism (see OCT in Fig. 1). A plane of least confusion can be identified approximately midway between them, where the (aberrated) transverse PSF associated with each subresolution scatterer has a minimum circular cross-section. After CAO aberration correction, the plane of least confusion is restored as the nominal astigmatism-free focal plane, and the line foci are transformed into circular symmetric transverse PSFs free of astigmatism (see aberration-corrected OCT in Fig. 1). Subsequent ISAM resampling results in a 3D reconstruction of the phantom with the defocus removed (see aberration-corrected ISAM in Fig. 1).

The effect of aberrations in the spatial domain is to broaden the complex system PSF and potentially introduce additional (non-Gaussian) structure. Fig. 2 and *Movie S1* show the effect of CAO correction of astigmatism on both the amplitude and phase of the data. In particular, the phase of the aberration-corrected OCT at depths corresponding to the two line foci have circular symmetry, and the depth-dependent OCT resolution (Fig. 3A) is characteristic of imaging with a Gaussian beam. After CAO and ISAM, the 3D object scattering potential, $\eta(x, y, z)$, is reconstructed with spatially invariant resolution at all depths (Figs. 1 and 3A). The procedure for computing the curves in Fig. 3 is given in *Methods*. Deviations from the ideal focal-plane resolution can be attributed to a non-Gaussian PSF (most likely from the presence of high-order aberrations), or to overlap between the PSFs of neighboring microparticles. *Movie S1* demonstrates real-time tuning of the CAO correction for individual *en face* depths using the Zernike polynomials (39) for astigmatism (Z_5 , Z_6) and defocus (Z_4), as well as spherical aberration (Z_{11}). The quartic term of Z_{11} was isolated by applying a Z_4 defocus phase correction of equal and opposite sign to cancel the quad-

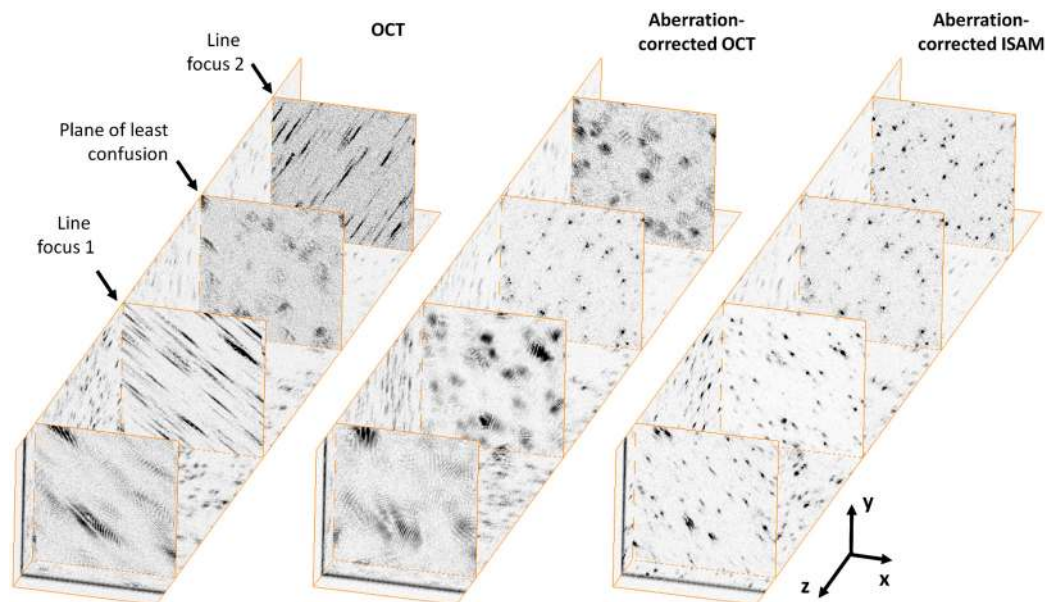


Fig. 1. Computational aberration correction of astigmatism in a silicone tissue phantom containing $1\ \mu\text{m}$ titanium-dioxide particles. These images were generated from a single 3D dataset that was acquired with a highly astigmatic illumination beam. The OCT images show the two *en face* (x - y) planes with the best line foci, located $300\ \mu\text{m}$ above and $300\ \mu\text{m}$ below the plane of least confusion. The aberration-corrected OCT and aberration-corrected ISAM images show *en face* planes corresponding to the same depths as the OCT images. Dimensions of the 3D dataset are $256 \times 256 \times 1230\ \mu\text{m}$ ($x \times y \times z$), where the units of the z axis denote optical path length.

spatial frequency content. The intensity-based image metric was based on the underlying principle that the optimal pupil phase results in constructive interference at the focal plane and therefore the highest peak intensity, and was computed from an array of maximum values that were calculated for each row and separately for each column of the image (see the maximum intensity projection method described below, under *Calculation of the Depth-Dependent Resolution and SNR*). The metric was evaluated as the average ratio between the highest 10% of maxima values after aberration correction to the highest 10% of maxima values before aberration correction. The second metric was based on the assumption that the mid- to high-frequency content of an amplitude image should increase as the resolution improves (i.e., when aberrations are minimized). This metric was calculated as the ratio of energy within a bandpass frequency range of the transverse Fourier transform of the amplitude image, normalized to the total energy contained within the upper frequency limit.

Calculation of the Depth-Dependent Resolution and SNR. The depth-dependent resolution in the sparse TiO₂ tissue phantom (Fig. 3A) was calculated using a previously reported method (18). The depth-dependent SNR in the tissue phantom (Fig. 3B) was estimated from the peak (magnitude) signals of point scatterers about a given depth, and the corresponding tomogram noise floor. Due to the sparse nature of the sample, the signal (in the SNR) was computed as the (depth-dependent) histogram mode of the maximum signals corresponding to an ensemble of particles over a depth range (rolling

window of 26 depths spanning 52 μm), and the corresponding noise floor was computed as the histogram mode of the minimum signals. These two modes were calculated from the maximum intensity projection (MIP) taken over the range of depths in the rolling window to reduce sparsity, resulting in a 2D array of x by y pixels. From this MIP, an array of maximum values was calculated for each row and separately for each column, producing a total of $x + y$ maxima values for calculating the signal histogram. An array of $x + y$ minima values were similarly obtained for each depth. A robust estimation of the mode was obtained by fitting a quadratic function about the peak of each histogram and computing the turning point of the fit.

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- Helmchen F, Denk W (2005) Deep tissue two-photon microscopy. *Nat Methods* 2:932–940.
- Huang D, et al. (1991) Optical Coherence Tomography. *Science* 254:1178–1181.
- Fercher AF, Drexler W, Hitzinger CK, Lasser T (2003) Optical coherence tomography—principles and applications. *Rep Prog Phys* 66:239–303.
- Fujimoto JG (2003) Optical coherence tomography for ultrahigh resolution in vivo imaging. *Nat Biotechnol* 21:1361–1367.
- Fujimoto JG, et al. (1995) Optical biopsy and imaging using optical coherence tomography. *Nat Med* 1:970–972.
- Tearney GJ, et al. (1997) In vivo endoscopic optical biopsy with optical coherence tomography. *Science* 276:2037–2039.
- Drexler W, et al. (2001) Ultrahigh-resolution ophthalmic optical coherence tomography. *Nat Med* 7:502–507.
- Fujimoto JG, et al. (2007) Three-dimensional endomicroscopy using optical coherence tomography. *Nat Photonics* 1:709–716.
- Liu LB, et al. (2011) Imaging the subcellular structure of human coronary atherosclerosis using micro-optical coherence tomography. *Nat Med* 17:1010–U1132.
- Boppart SA, et al. (1997) Noninvasive assessment of the developing *Xenopus* cardiovascular system using optical coherence tomography. *Proc Natl Acad Sci USA* 94:4256–4261.
- John R, et al. (2010) In vivo magnetomotive optical molecular imaging using targeted magnetic nanoprobes. *Proc Natl Acad Sci USA* 107:8085–8090.
- Robles FE, Wilson C, Grant G, Wax A (2011) Molecular imaging true-colour spectroscopic optical coherence tomography. *Nat Photonics* 5:744–747.
- Povazay B, et al. (2002) Submicrometer axial resolution optical coherence tomography. *Opt Lett* 27:1800–1802.
- Izatt JA, Hee MR, Owen GM, Swanson EA, Fujimoto JG (1994) Optical coherence microscopy in scattering media. *Opt Lett* 19:590–592.
- Boppart SA, et al. (1998) In vivo cellular optical coherence tomography imaging. *Nat Med* 4:861–865.
- Rolland JP, Meemon P, Murali S, Thompson KP, Lee KS (2010) Gabor-based fusion technique for Optical Coherence Microscopy. *Opt Express* 18:3632–3642.
- Ralston TS, Marks DL, Carney PS, Boppart SA (2007) Interferometric synthetic aperture microscopy. *Nat Phys* 3:129–134.
- Ralston TS, Adie SG, Marks DL, Boppart SA, Carney PS (2010) Cross-validation of interferometric synthetic aperture microscopy and optical coherence tomography. *Opt Lett* 35:1683–1685.
- Adie SG, et al. (2011) The impact of aberrations on object reconstruction with interferometric synthetic aperture microscopy. *Proc SPIE* 7889:78891O.
- Booth MJ, Neil MAA, Juskaitis R, Wilson T (2002) Adaptive aberration correction in a confocal microscope. *Proc Natl Acad Sci USA* 99:5788–5792.
- Rueckel M, Mack-Bucher JA, Denk W (2006) Adaptive wavefront correction in two-photon microscopy using coherence-gated wavefront sensing. *Proc Natl Acad Sci USA* 103:17137–17142.
- Kner P, Sedat JW, Agard DA, Kam Z (2010) High-resolution wide-field microscopy with adaptive optics for spherical aberration correction and motionless focusing. *J Microsc* 237:136–147.
- Wright AJ, et al. (2007) Adaptive optics for enhanced signal in CARS microscopy. *Opt Express* 15:18209–18219.
- Roorda A, et al. (2002) Adaptive optics scanning laser ophthalmoscopy. *Opt Express* 10:405–412.
- Hermann B, et al. (2004) Adaptive-optics ultrahigh-resolution optical coherence tomography. *Opt Lett* 29:2142–2144.
- Zhang Y, Rha JT, Jonnal RS, Miller DT (2005) Adaptive optics parallel spectral domain optical coherence tomography for imaging the living retina. *Opt Express* 13:4792–4811.
- Zhang Y, et al. (2006) High-speed volumetric imaging of cone photoreceptors with adaptive optics spectral-domain optical coherence tomography. *Opt Express* 14:4380–4394.
- Xi JF, et al. (2009) High-resolution OCT balloon imaging catheter with astigmatism correction. *Opt Lett* 34:1943–1945.
- Lorenser D, et al. (2011) Ultrathin side-viewing needle probe for optical coherence tomography. *Opt Lett* 36:3894–3896.
- Colomb T, et al. (2006) Numerical parametric lens for shifting, magnification, and complete aberration compensation in digital holographic microscopy. *J Opt Soc Am A* 23:3177–3190.
- Miccio L, et al. (2007) Direct full compensation of the aberrations in quantitative phase microscopy of thin objects by a single digital hologram. *Appl Phys Lett* 90:041104.
- De Nicola S, et al. (2005) Recovering correct phase information in multiwavelength digital holographic microscopy by compensation for chromatic aberrations. *Opt Lett* 30:2706–2708.
- Ferraro P, et al. (2008) Full color 3-D imaging by digital holography and removal of chromatic aberrations. *J Disp Technol* 4:97–100.
- Thurman ST, Fienup JR (2008) Phase-error correction in digital holography. *J Opt Soc Am A* 25:983–994.
- Thurman ST, Fienup JR (2008) Correction of anisoplanatic phase errors in digital holography. *J Opt Soc Am A* 25:995–999.
- Tippie AE, Kumar A, Fienup JR (2011) High-resolution synthetic-aperture digital holography with digital phase and pupil correction. *Opt Express* 19:12027–12038.
- Kam Z, Hanser B, Gustafsson MGL, Agard DA, Sedat JW (2001) Computational adaptive optics for live three-dimensional biological imaging. *Proc Natl Acad Sci USA* 98:3790–3795.
- Yu LF, Chen ZP (2007) Digital holographic tomography based on spectral interferometry. *Opt Lett* 32:3005–3007.
- Malacara D (2007) *Optical Shop Testing* (Wiley-Interscience, Hoboken, NJ), 3rd Ed, p 519.
- Booth MJ (2006) Wave front sensor-less adaptive optics: A model-based approach using sphere packings. *Opt Express* 14:1339–1352.
- Debarre D, Booth MJ, Wilson T (2007) Image based adaptive optics through optimisation of low spatial frequencies. *Opt Express* 15:8176–8190.
- Debarre D, et al. (2009) Image-based adaptive optics for two-photon microscopy. *Opt Lett* 34:2495–2497.
- Goodman JW (1996) *Introduction to Fourier Optics* (McGraw-Hill, San Francisco), 2nd Ed, pp 135–137, pp 145–146.
- Ralston TS, Marks DL, Carney PS, Boppart SA (2006) Inverse scattering for optical coherence tomography. *J Opt Soc Am A* 23:1027–1037.
- Davis BJ, et al. (2007) Nonparaxial vector-field modeling of optical coherence tomography and interferometric synthetic aperture microscopy. *J Opt Soc Am A* 24:2527–2542.
- Ji N, Milkie DE, Betzig E (2010) Adaptive optics via pupil segmentation for high-resolution imaging in biological tissues. *Nat Methods* 7:141–147.
- Vellekoop IM, Lagendijk A, Mosk AP (2010) Exploiting disorder for perfect focusing. *Nat Photonics* 4:320–322.
- Marks DL, Oldenburg AL, Reynolds JJ, Boppart SA (2003) Autofocus algorithm for dispersion correction in optical coherence tomography. *Appl Optics* 42:3038–3046.