

# 计算光学成像与 光信息处理技术前沿

#### (第8讲)



南京理工大学电光学院光电技术系

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# 光强传输方程

### Transport of intensity equation

#### Chao Zuo (左超)

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### **Computational** microscopy



#### Phase of a image



#### Phase of a object



#### Phase contrast microscopy







#### Digital Holography





### See Phase w/o Interference

Intensity  $\rightarrow$  Phase

 $Phase \rightarrow intensity$ 

### How does wave propagate?

Non-planar phase changes the intensity during wave propagation





$$U(x,y) = \sqrt{I(x,y)}e^{i\phi(x,y)}$$

Transport-of-intensity equation (TIE)<sup>1</sup>

 $\phi(x, y) = \text{constant}$ 

Parakina Wavequation  $\nabla^2 U \sqrt{k} (x, y) = 0$ 

 $-k\frac{\partial I(x,y)}{\partial z} = \nabla \cdot \left[I(x,y)\nabla\phi(x,y)\right]$ 

[1] M. Reed Teague, J. Opt. Soc. Am. 73, 1434-1441 (1983) .

### Transport-of-intensity equation (TIE)



[4] C. Zuo, Q. Chen, H. Li, W. Qu, and A. Asundi Optics Express 22, 18310-18324 (2014).

### Dynamic TIE microscopy



### Use d'Biomager with any light microscope

C. Zuo, Q. Chen, W. Qu, A. Asundi, Optics Express, 21 (2013) 24060-24075.

## Dynamic TIE microscopy



C. Zuo, Q. Chen, W. Qu, A. Asundi, Optics Express, 21 (2013) 24060-24075.



#### **Optics Letters**

#### Dual-mode phase and fluorescence imaging with a confocal laser scanning microscope

#### JUANJUAN ZHENG,<sup>3</sup> Chao Zuo,<sup>4</sup> Peng Gao,<sup>1,2</sup> and G. Ulrich Nienhaus<sup>1,2,5,6,\*</sup>

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<sup>4</sup>School of Electronic and Optical Engineering, Nanjing University of Science and Technology, 210094 Nanjing, China <sup>6</sup>Institute of Toxicology and Genetics, Karlsruhe Institute of Technology, 76344 Eggenstein-Leopoldshafen, Germany <sup>6</sup>Department of Physics, University of Illinois at Urbana-Champaign, Urbana, Illinois 61801, USA

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500

250





## Dynamic TIE microscopy

Single-shot quantitative phase microscopy (SQPM)



C. Zuo, Q. Chen, W. Qu, A. Asundi, Optics Letters, 38 (2013) 3538-3541.

## Dynamic TIE microscopy

Elapsed Time: 0 s

Phase[rad]

2

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C. Zuo, Q. Chen, W. Qu, A. Asundi, Optics Letters, 38 (2013) 3538-3541.

10µm

#### Transport of intensity equation



#### Transport of intensity equation

$$-k\frac{\partial I(\mathbf{x}, z)}{\partial z} = \nabla \cdot \left[I(\mathbf{x}, z)\nabla\phi\left(\mathbf{x}\right)\right]$$

#### Solution

$$\phi\left(\mathbf{x}\right) = -k\nabla^{-2}\nabla\cdot\left[I^{-1}\left(\mathbf{x}\right)\nabla\nabla^{-2}\frac{\partial I\left(\mathbf{x}\right)}{\partial z}\right]$$

#### Coherent TIE

Methods	Approximation conditions	Phase reconstruction algorithms
TIE	Paraxial approximation $\lambda^2  \mathbf{u} ^2 \ll 1$	$-k\frac{\partial I(\mathbf{x})}{\partial z} = \nabla \cdot [I(\mathbf{x})\nabla\phi(\mathbf{x})]$ Fourier solution:
	Weak defocusing approximation $\Delta z \to 0$	$\begin{split} \phi(\mathbf{x}) &= -k\mathscr{F}^{-1}\{\frac{j2\pi\mathbf{u}}{4\pi^2 \mathbf{u} ^2 + \varepsilon}\mathscr{F}[\frac{1}{I(\mathbf{x})}\mathscr{F}^{-1}\{\frac{j2\pi\mathbf{u}}{4\pi^2 \mathbf{u} ^2 + \varepsilon}\mathscr{F}[\frac{\partial I(\mathbf{x})}{\partial z}]\}]\\ \varepsilon &> 0 \text{ is a small constant.} \end{split}$

Coherent illumination, ideal imaging?

#### Imaging System





#### **Coherent Imaging System**

$$H(\mathbf{u}) = P(\mathbf{u}) H_{\Delta z}(\mathbf{u}) = P(\mathbf{u}) e^{jk\Delta z\sqrt{1-\lambda^2|\mathbf{u}|^2}},$$
$$P(\mathbf{u}) = circ\left(\frac{\mathbf{u}}{NA/\lambda}\right) = \begin{cases} 1 & |\mathbf{u}| \le \frac{NA}{\lambda}\\ 0 & \text{else} \end{cases}$$

$$\begin{split} h\left(r\right) &= \int_{\rho} \operatorname{circ}\left(\frac{\rho}{NA/\lambda}\right) J_{0}\left(2\pi r\rho\right) 2\pi\rho d\rho \\ &= \frac{NA}{\mu\lambda} J_{1}\left(2\pi r\frac{NA}{\lambda}\right) \\ &= \pi \left(\frac{NA}{\lambda}\right)^{2} \left[\frac{2J_{1}\left(\bar{r}\right)}{\bar{r}}\right] \end{split}$$

#### **Coherent Limit**



#### Coherence in a microscope





#### **Coherent Limit**



PUPIL FUNCTION AUTOCORRELATION

#### **Coherent Limit**



### Resolution improvement in DHM

#### Superresolution digital holographic microscopy for three-dimensional samples

Vicente Micó<sup>1\*</sup>, Zeev Zalevsky<sup>2</sup>, Carlos Ferreira<sup>1</sup>, and Javier García<sup>1</sup>

<sup>1</sup>Departamento de Óptica, Universitat de Valencia, C/Dr. Moliner, 50, 46100 Burjassot, Spain <sup>2</sup>School of Engineering, Bar-Ilan University, Ramat-Gan, 52900 Israel <sup>6</sup>Corresponding author: <u>vicente.mico@uv.es</u>

#### Resolution improvement in digital holography by angular and polarization multiplexing

Caojin Yuan,1.2\* Guohai Situ,2 Giancarlo Pedrini,2 Jun Ma,2 and Wolfgang Osten2



Fig. 3. Schematic chart of the used methodology used where the images depicted in the chart correspond with experimental results obtained with the proposed approach.

1328 OPTICS LETTERS / Vol. 38, No. 8 / April 15, 2013

#### Structured illumination for resolution enhancement and autofocusing in digital holographic microscopy

Peng Gao,<sup>1,2,\*</sup> Giancarlo Pedrini,<sup>1</sup> and Wolfgang Osten<sup>1</sup> <sup>1</sup>Institut für Technische Optik, Universität Stuttgart, Pfaffenwaldring 9, Stuttgart 70569, Germany <sup>2</sup>State Key Laboratory of Transient Optics and Photonics, Xi'an Institute of Optics and Precision Mechanics, Chinese Academy of Sciences, Xi'an 710119, China \*Corresponding author: peng.gao@ito.uni-stuttgart.de



Synthetic Aperture (Beam scanning or Structured illumination) Multi-angle measurement to achieve ~ 2NAobj

#### Coherence in a microscope





#### No interference



#### Transport of intensity equation ?

 $-k\frac{\partial I(\mathbf{x}, z)}{\partial z} = \nabla \cdot \left[I(\mathbf{x}, z)\nabla\phi(\mathbf{x})\right]$ 

### Effect of partially coherent illumination



2D complexity plitude

 $I\left(x\phi\left(x,y\right)\right)\left(x,y\right)\left(x,y\right)\left(x,y\right)\left(x,y\right)\left(x,y\right)\right)^{2}$ 

Purely coherent field



Partially coherent field

#### Transport of intensity equation ?

 $-k\frac{\partial I(\mathbf{x}, z)}{\partial z} = \nabla \cdot \left[I(\mathbf{x}, z)\nabla\phi(\mathbf{x})\right]$
### Generalized transport of intensity equation

$$\frac{\partial I\left(\mathbf{x}\right)}{\partial z} = -\nabla_{\mathbf{x}} \cdot \iint \lambda \mathbf{u} W_{\omega}\left(\mathbf{x}, \mathbf{u}\right) d\mathbf{u} d\omega$$

OPTICS LETTERS / Vol. 39, No. 3 / February 1, 2014

### Light field moment imaging: comment

Chao Zuo,<sup>1,2,3</sup> Qian Chen,<sup>1,\*</sup> and Anand Asundi<sup>2</sup>

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Chao Zuo<sup>a,b,\*</sup>, Qian Chen<sup>a</sup>, Lei Tian<sup>c</sup>, Laura Waller<sup>c</sup>, Anand Asundi<sup>b</sup>

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### Generalized transport of intensity equation

$$\frac{\partial I\left(\mathbf{x}\right)}{\partial z} = -\lambda \nabla_{\mathbf{x}} \cdot \int \mathbf{u} W\left(\mathbf{x}, \mathbf{u}\right) d\mathbf{u}.$$

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### Transport of intensity equation

 $-k\frac{\partial I(\mathbf{x},z)}{\partial z} = \nabla \cdot \left[I(\mathbf{x},z)\nabla\phi\left(\mathbf{x}\right)\right]$ 

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<sup>a</sup> Jiangsu Key Laboratory of Spectral Imaging & Intelligence Sense, Nanjing University of Science and Technology, Nanjing, Jiangsu Province 210094, China <sup>b</sup> Centre for Optical and Laser Engineering, School of Mechanical and Aerospace Engineering, Nanyung Technological University, 639788 Singapore <sup>b</sup> Department of Edetrical Engineering and Computer Sciences, University of Calforniae Reference, O49720, USA

### **Generalized Phase**

 $\frac{\int \mathbf{u} W(\mathbf{x}, \mathbf{u}) \, d\mathbf{u}}{\int W(\mathbf{x}, \mathbf{u}) \, d\mathbf{u}} = \frac{1}{2\pi} \nabla_{\mathbf{x}} \hat{\phi}(\mathbf{x})$ 

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# Light field ~ Wigner distribution $L\left(\mathbf{x},\theta\right) \approx W\left(\mathbf{x},\lambda\mathbf{u}\right)$

Z. Zhang and M. Levoy, "Wigner distributions and how they relate to the light field," in "2009 IEEE International Conference on Computational Photography (ICCP)," (2009), pp. 1–10. A. Walther, "Radiometry and coherence," J. Opt. Soc. Am. 58, 1256–1259 (1968).

A. Walther, "Radiometry and coherence," J. Opt. Soc. Am. 58, 1256–1259 (1973).

### Computational light field imaging



OPTICS LETTERS / Vol. 38, No. 15 / August 1, 2013

### Light field mome

Antony Orth<sup>1,2</sup> and Kennether Groups of Constant of C

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tive

 $\frac{\partial I(x,y)}{\partial z}$ 



maging: comment and Anand Asundi<sup>2</sup>

### Computational light field imaging



OPTICS LETTERS / Vol. 38, No. 15 / August 1, 2013

### Light field m

Antony Orth<sup>1,2</sup> and Kenneth B. Crozier<sup>2,2</sup> <sup>1</sup>Harvard University School of Engineering and Applied Sciences, Cambridge, Massachusetts 02138, USA <sup>2</sup>e-mail: tonyorth@seas.harvard.edu <sup>3</sup>e-mail: kcrozier@seas.harvard.edu

### laging: comment

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### **Generalized Phase**

 $\frac{\int \mathbf{u} W(\mathbf{x}, \mathbf{u}) \, d\mathbf{u}}{\int W(\mathbf{x}, \mathbf{u}) \, d\mathbf{u}} = \frac{1}{2\pi} \nabla_{\mathbf{x}} \hat{\phi}(\mathbf{x})$ 

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## Phase of the object



$$W_{_{out}}$$
  $\mathbf{x},\mathbf{u}$   $= W_{_{in}}$   $\mathbf{x},\mathbf{u}$   $\underset{\mathbf{u}}{\otimes}W_{_{T}}$   $\mathbf{x},\mathbf{u}$ 

### **Generalized Phase**

$$\frac{\int \mathbf{u} W_{out}\left(\mathbf{x},\mathbf{u}\right) d\mathbf{u}}{\int W_{out}\left(\mathbf{x},\mathbf{u}\right) d\mathbf{u}} = \frac{\int \mathbf{u} W_T\left(\mathbf{x},\mathbf{u}\right) d\mathbf{u}}{\int W_T\left(\mathbf{x},\mathbf{u}\right) d\mathbf{u}} + \frac{\int \mathbf{u} W_{in}\left(\mathbf{x},\mathbf{u}\right) d\mathbf{u}}{\int W_{in}\left(\mathbf{x},\mathbf{u}\right) d\mathbf{u}}$$

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### Light field moment imaging: comment

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### **Generalized Phase**

 $\nabla_{\mathbf{x}}\hat{\phi}_{out}\left(\mathbf{x}\right) = \nabla_{\mathbf{x}}\left[\hat{\phi}_{in}\left(\mathbf{x}\right) + \phi\left(\mathbf{x}\right)\right]$ 

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# "Zero-moment" condition $\int \mathbf{u} W_{in} \left( \mathbf{x}, \mathbf{u} \right) d\mathbf{u} = 0$

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## Imaging System



### Imaging System

$$W_{image} \left( \mathbf{x}, \mathbf{u} \right) = \int \Gamma_{image} \left( \mathbf{x} + \frac{\mathbf{x}'}{2}, \mathbf{x} - \frac{\mathbf{x}'}{2} \right) \exp\left(-j2\pi \mathbf{u}\mathbf{x}'\right) d\mathbf{x}$$
$$= W_{out} \left( \mathbf{x}, \mathbf{u} \right) \bigotimes_{\mathbf{x}} W_{psf} \left( \mathbf{x}, \mathbf{u} \right)$$
$$= W_T \left( \mathbf{x}, \mathbf{u} \right) \bigotimes_{\mathbf{u}} W_{in} \left( \mathbf{x}, \mathbf{u} \right) \bigotimes_{\mathbf{x}} W_{psf} \left( \mathbf{x}, \mathbf{u} \right)$$

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Transport of intensity phase retrieval and computational imaging for partially coherent fields: The phase space perspective



Chao Zuo<sup>a,b,\*</sup>, Qian Chen<sup>a</sup>, Lei Tian<sup>c</sup>, Laura Waller<sup>c</sup>, Anand Asundi<sup>b</sup>

\* Jiangsu Key Laboratory of Spectral Imaging & Intelligence Sense, Nanjing University of Science and Technology, Nanjing, Jiangsu Province 210094, China <sup>10</sup> Centre for Optical and Laser Engineering, School of Mechanical and Aerospace Engineering, Nanyang Technological University, 639798 Singapore <sup>10</sup> Department of Selectrical Engineering and Computer Sciences, University of Calfornia Derkeley, CA 92720, USA Optics and Lasers in Engineering 71 (2015) 20-32



Transport of intensity phase retrieval and computational imaging for partially coherent fields: The phase space perspective

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Chao Zuo<sup>a,b,\*</sup>, Qian Chen<sup>a</sup>, Lei Tian<sup>c</sup>, Laura Waller<sup>c</sup>, Anand Asundi<sup>b</sup>

\* Jiangsu Key Laboratory of Spectral Imaging & Intelligence Sense, Nanjing University of Science and Technology, Nanjing, Jiangsu Province 210094, China \* Centre for Optical and Lasser Engineering, School of Mechanical and Aerospace Engineering, Nanyang Technological University, 635798 Singapore \* Department of Electrical Engineering and Computer Science, University of California Revieley, 0 49720, USA





### **Imaging System**





Invited Paper

Proc. of SPIE Vol. 9718 97180A-1

### Phase microscope imaging in phase space

Colin J. R. Sheppard\*<sup>a</sup>, Shalin B. Mehta<sup>b</sup> <sup>a</sup>Nanoscopy, Nanophysics, Istituto Italiano di Tecnologia, Via Morego 30, Genoa, 16163, Italy; <sup>b</sup>Eugene Bell Center for Regenerative Biology & Tissue Engineering, Marine Biological Laboratory, Woods Hole, MA 02543, USA.

### 6. THE IMAGE IN PHASE SPACE

This approach can be extended to consider the partial coherence of the image itself. In particular, we can consider t mutual intensity, WDF or ambiguity function of the image. It is important to note that  $\Psi$  is not a WDF, and not t WDF of the image. The phase space representations of the image have relevance to phase reconstruction methods su as phase space tomography, or the transport of intensity equation approach, and to the 3D image properties.

In phase space tomography, knowledge of the mutual intensity of a wave field in 3D can be used to reconstruct the way field, including its phase and the correlation coefficient [33-38].

It is interesting to note that Hopkins calculated the image intensity in a partially coherent microscope by propagating mutual intensity through the system, but did not give an expression for the mutual intensity of the image [23]. I mutual intensity of the image is [39]

$$J(\mathbf{x}_{1},\mathbf{x}_{2}) = \iiint P(\mathbf{m}_{1}+\xi)P^{*}(\mathbf{m}_{2}+\xi)S(\xi)T(\mathbf{m}_{1})T^{*}(\mathbf{m}_{2})\exp\{i2\pi[(\mathbf{m}_{1}+\xi)\cdot\mathbf{x}_{1}-(\mathbf{m}_{2}+\xi)\cdot\mathbf{x}_{2}]\}\,\mathrm{d}\mathbf{m}_{1}\,\mathrm{d}\mathbf{m}_{2}\,\mathrm{d}\xi.$$

[39] Zuo, C., Chen, Q., Tian, L., Waller, L. and Asundi, A. "Transport of intensity phase retrieval and computational imaging for partially coherent fields: The phase space perspective," Optics and Lasers in Proc. of SPIE Vol. 9718 97180A-1 Engineering 71, 20-32 (2015).

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JOSA A 35, 8 (2018)

taken into account [12–14]. Significant advances have been made in describing partially coherent fields with phase space distributions [15]. However, only a few papers have addressed the question of what forward model to use for elegantly capturing the properties of partially coherent imaging [16–18]. Even

- S. B. Mehta and C. J. R. Sheppard, "Phase-space representation of partially-coherent imaging systems using the Cohen class distribution," Opt. Lett. 35, 348–350 (2010).
- S. B. Mehta and C. J. R. Sheppard, "Using the phase-space imager to analyze partially coherent imaging systems: bright-field, phase contrast, differential interference contrast, differential phase contrast, and spiral phase contrast," J. Mod. Opt. 57, 718–739 (2010).
- C. Zuo, Q. Chen, L. Tian, L. Waller, and A. Asundi, "Transport of intensity phase retrieval and computational imaging for partially coherent fields: the phase space perspective," Opt. Lasers Eng. 71, 20–32 (2015).

### **Coherent Limit**

coherent



incoherent



 $\begin{array}{l} \text{frequency} \\ \nu_{\text{o}} \text{ = 2 sinu } / \, \lambda \end{array}$ 

frequency  $v_o = \sin u / \lambda$ 

# Tradeoff between resolution and contrast



Microscope based on Köhler Illumination: 6f system

Partially coherent diffraction limit

 $NA_{eff} = NA_{obj} + NA_{ill} \le 2NA_{obj}$  Incoherent limit

# Tradeoff between resolution and contrast



Phase effect gradually vanishes with the increase of NA<sub>III</sub> Tradeoff between resolution and phase contrast in brightfield microscopy

Partially coherent imaging  

$$WOTF(\mathbf{u}) \equiv TCC(\mathbf{u}, 0) =$$

$$\iint S(\mathbf{u}') P(\mathbf{u}') P(\mathbf{u}' + \mathbf{u})$$

$$e^{jk\Delta z \left(-\sqrt{1-\lambda^2 |\mathbf{u}'|^2} + \sqrt{1-\lambda^2 |\mathbf{u}+\mathbf{u}'|^2}\right)} d\mathbf{u}'$$

C. J. R. SHEPPARD and A. CHOUDHURY Image formation in the scanning microscope OPTICA ACTA, 1977, VOL. 24, NO. 10, 1051-1073 On the diffraction theory of optical images

By H. H. HOPKINS

Proc. R. Soc. Lond. A 217, 408 (1953)

# Tradeoff between resolution and contrast



### Noninterferometric single-shot quantitative phase microscopy

Chao Zuo,12.\* Qian Chen,1 Weijuan Qu,3 and Anand Asundi2 Jiangsu Key Laboratory of Spectral Imaging & Intelligence Sense, Nanjing University of Science and Technology, Nanjing, Jiangsu Province 210094, China <sup>2</sup>Centre for Optical and Laser Engineering, School of Mechanical and Aerospace Engineering, Nanyang Technological University, Singapore 639798 <sup>3</sup>Centre for Applied Photonics and Laser Technology, Ngee Ann Polytechnic, 535 Clementi Road, Singapore 599489 \*Corresponding author: surpasszuo@163.com

 $(S = NA_{cond}/NA_{obi})$ . Conventionally, high-resolution optical microscopy depends on the numerical aperture of the condenser being comparable to that of the objective  $(S = 0.7 \sim 0.8)$ . For TIE phase measurements, the results are largely independent of the condenser setting (especially for the low spatial frequency components) [15]. However, in the SQPM, we prefer to narrow down the condenser aperture a bit ( $S = 0.3 \sim 0.4$ ) to ensure a certain level of spatial coherence. This allows a larger depth of field, higher phase contrast on defocus, and, more importantly, a wider linear spatial frequency response range for TIE phase retrieval [15,16].

VOTF<sub>0.75</sub>(u)

0.5

0

0.5

1.5

Normalized spatial frequency

2

0



Normalized spatial frequency

1.5

2

0.5

### Transport of intensity equation ?

 $-k\frac{\partial I(\mathbf{x}, z)}{\partial z} = \nabla \cdot \left[I(\mathbf{x}, z)\nabla\phi(\mathbf{x})\right]$ 

## Imaging System !





## Illumination Engineering

ww.nature.com/scientificreports

# SCIENTIFIC REPORTS

### OPEN High-resolution transport-ofintensity quantitative phase microscopy with annular illumination

Received: 1 March 2017 Accepted: 7 June 2017 Published online: 09 August 2017

Chao Zuo<sup>1,2</sup>, Jiasong Sun<sup>1,2</sup>, Jiaji Li<sup>1,2</sup>, Jialin Zhang<sup>1,2</sup>, Anand Asundi<sup>3</sup> & Qian Chen<sup>2</sup>

For quantitative phase imaging (QPI) based on transport-of-intensity equation (TIE), partially coherent illumination provides speckle-free imaging, compatibility with brightfield microscopy and transverse resolution beyond coherent diffraction limit. Unfortunately, in a conventional microscope with circular illumination aperture, partial coherence tends to diminish the phase contrast, exacerbating the inherent noise-to-resolution tradeoff in TIE imaging, resulting in strong low-frequency artifacts and compromised imaging resolution. Here, we demonstrate how these issues can be effectively addressed by replacing the conventional circular illumination aperture with an annular one. The matched annular illumination not only strongly boosts the phase contrast for low spatial frequencies, but significantly improves the practical imaging resolution to near the incoherent diffraction limit. By incorporating high-numerical aperture (NA) illumination as well as high-NA objective, it is shown, for the first time, that TIE phase imaging can achieve a transverse resolution up to 208 nm, corresponding to a méterive NA of 2.65. Time-lapse time aging of *in vitro* Hela cells revealing cellular morphology and subcellular dynamics during cells mitosis and apoptosis is exemplified. Given its capability for high-resolution QPI as well as the compatibility with widely available brightfield microscopy hardware, the proposed approach is expected to be adopted by the wider biology and medicine community.







*JOSA A* 35, 11 (2018)

circular source for S = 0.613. In each case the maximum values have been normalized to unity. It is seen that the annular source has a broader spatial frequency response. An interesting and important feature is that the parabolic region for low spatial frequencies for the circular case vanishes for the annular case, so that low spatial frequencies are imaged more efficiently. The imaginary part of the WOTF for different values of defocus has been presented by Zuo *et al.* [40].

Interestingly, for S = 1,  $C_{CG}(l)$  is very close to linear over its whole non-zero domain, so this is a good arrangement for performing TIE, but the scaling of the phase would need to be calibrated. We find that

$$C_{\rm CG}(l) = -\frac{2}{\pi} + \left(\frac{\pi^2 - 2}{\pi^2}\right)l + \left(\frac{\pi^2 - 8}{4\pi^3}\right)l^2 + \left(\frac{\pi^2 - 12}{6\pi^4}\right)l^3 + \dots$$
$$= -0.637 + 0.797l + 0.015l^2 - 0.0036l^3 + \dots$$
(53)

In fact, using an annular source for the TIE has been proposed by Zuo *et al.* [40].

 C. Zuo, J. Sun, J. Li, J. Zhang, A. Asundi, and Q. Chen, "Highresolution transport-of-intensity quantitative phase microscopy with annular illumination," Sci. Rep. 7, 7654 (2017).







Experimental setup: 1.4 NA<sub>ill</sub> + 1.4 NA<sub>obi</sub> 100X MO

C. Zuo, J. Sun, J. Li et.al., Scientific Reports 7, 7654, (2017).

### rad 0.5



Area 2

# NA<sub>eff</sub> = 2.66 (I.4 NA<sub>ill</sub> + I.4 NA<sub>obj</sub> IOOX MO) 208 nm lateral resolution 3 images only without synthetic aperture

# 20 µm

C. Zuo, J. Sun, J. Li et.al., Scientific Reports 7, 7654, (2017).

Long-term time-lapse imaging of HeLa cell dividing in culture (60 h)



### Long-term time-lapse imaging of HeLa cell dividing in culture (60 h)



Cell No.:13

### Confluence:13.8%



C. Zuo, J. Sun, J. Li et.al., Scientific Reports 7, 7654, (2017).



Multi-modal computational imaging of HeLa cell apoptosis



# Multi-modal Imaging



**Biomedical Optics EXPRESS** 

### Efficient quantitative phase microscopy using programmable annular LED illumination

JIAJI LI,<sup>1,2,3,4</sup> QIAN CHEN,<sup>1,2</sup> JIALIN ZHANG,<sup>1,2,3</sup> YAN ZHANG,<sup>1,2,3</sup> LINPENG LU,<sup>1,2,3</sup> AND CHAO ZUO<sup>1,2,3,\*</sup>

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J Li, C. Zuo et. al. Biomedical Optics Express 8 (10), 4687-4705
## Best?



Yes!



#### Optics EXPRESS

#### Optimal illumination pattern for transport-of-intensity quantitative phase microscopy

#### JIAJI LI,<sup>1,2,3</sup> QIAN CHEN,<sup>1,2,4</sup> JIASONG SUN,<sup>1,2,3</sup> JIALIN ZHANG,<sup>1,2,3</sup> XIANGPENG PAN,<sup>1,2,3</sup> AND CHAO ZUO<sup>1,2,3,\*</sup>

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<sup>4</sup>chenqian@njust.edu.cn

surpasszio@163.com; ziochao@njust.edu.cn



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		Optimal illumination pattern for transport-of-	
		intensity quantitative phase microscopy	
110 Mar.	LED illumination	See Visualization 1 in Opt. Express 26(21), 27599-	
1.1	pattern	27614 (2018).	
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	10mm	Optics ImageBank	

J Li, C. Zuo et. al. Biomedical Optics Express 8 (10), 4687-4705, (2017)

## 3D phase imaging ?



## QPI vs ODT (optical diffraction tomography)



QPI: 2.5D optical path length **Profile** 

C. Zuo, et. al., Opt Express, 21 24060-24075 (2013).

# ODT: true **3D** refractive index

Volume

| Li, et. al. Biomed. Opt. Express 9, 2526-2542 (2018)

## Transport-of-intensity diffraction tomography (TIDT)



EWolf. Opt. Commun. 1, 153–156 (1969).

## Transport-of-intensity diffraction tomography (TIDT)

### Fourier diffraction theorem for a limit-aperture system



#### 3D real space

#### 3D Fourier space

Microscopic imaging: partial spherical cap bounded by the lens aperture

E Wolf. Opt. Commun. 1, 153–156 (1969).

## 3D phase imaging ?



### Coherent / partially coherent ODT





### Lensless TIE microscope







Quantitative phase of cheek cells (entire FOV 24mm<sup>2</sup>)

# Computed tomography (CT)

http://www.merckmanuals.com/home/special-subjects/common-imaging-tests/computed-tomography-ct

## Lensless TIE tomography





Change Illumination angle ( ≈±45°) Fill the 3D Fourier Space of the object

# Lensless TIE tomography

The uterus of Parascaris equorum

#### Phase tomography

#### Absorption tomography







Optics and Lasers in Engineering 95 (2017) 26-34

20µm (a) (b) 465 (g) Contents lists available at ScienceDirect Optics and Lasers in Engineering 1.46 ELSEVIER journal homepage: www.elsevier.com/locate/optlaseng 1.455 Optical diffraction tomography microscopy with transport of intensity -10µm -5µm CrossMark .45 equation using a light-emitting diode array (c) (d) Jiaji Li<sup>a,b</sup>, Qian Chen<sup>b</sup>, Jialin Zhang<sup>a,b</sup>, Zhao Zhang<sup>a,b</sup>, Yan Zhang<sup>a,b</sup>, Chao Zuo<sup>a,b,\*</sup> <sup>a</sup> Smart Computational Imaging (SCI) Laboratory, Nanjing University of Science and Technology, Nanjing, Jiangsu 210094, China
<sup>b</sup> Jiangsu Key Laboratory of Spectral Imaging & Intelligent Sense, Nanjing University of Science and Technology, Nanjing, Jiangsu 210094, China ----DHM -----TIE Ideal (a) (b) (c) -2µm 2µm 1.45 (e) (f) 10µm 0 10 -10 X(um) (d) (f) -Idea 20µm 0.6 5µm 10µm 0.4 1.45 0.2 15 -10 0 5 10 X(um) Camera н 11 j I ... ••• Г Tube Lens 1 11 \*\*\* 111 **3D** Fourier spectrum Objective 11  $\theta_x = 0^\circ, \theta_y = 0^\circ$  $\theta_{\gamma} = 23^{\circ}, \theta_{\gamma} = 0^{\circ}$  $\theta_x = 37^\circ, \theta_v = 0^\circ$ ¦≓ Pupil Phase retrieval by LED element Objective non-negative constraint Sample 10µm FT and mapping FT and mapping FT and mapping Condenser Lens .59 LED Array

\_ \_ \_

### Partially coherent ODT



### Partially coherent 3D imaging



### Partially coherent 3D imaging

 $WOTF(\mathbf{u}) \equiv TCC(\mathbf{u}, \mathbf{0})$  $= \iint S(\mathbf{u}') H(\mathbf{u}' + \mathbf{u}) H^*(\mathbf{u}') d\mathbf{u}'$  $H(\rho, l) = \int P(\rho) e^{jkz\sqrt{1-\lambda^2\rho^2}} e^{-j2\pi z l} dz$  $= P(\rho) \delta\left(l - \sqrt{\left(\frac{1}{\lambda}\right)^2 - \rho^2}\right)$ 





**Biomedical Optics EXPRESS** 

#### Three-dimensional tomographic microscopy technique with multi-frequency combination with partially coherent illuminations

JIAJI LI,<sup>1,2,3</sup> QIAN CHEN,<sup>1,2,4</sup> JIASONG SUN,<sup>1,2,3</sup> JIALIN ZHANG,<sup>1,2,3</sup> JUNYI DING,<sup>1,2,3</sup> AND CHAO ZUO<sup>1,2,3,\*</sup>

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3D intensity spectrum



3D phase / amplitude transfer function

0.2

-0 2

Transport-of-intensity diffraction tomography (TIDT)

J Li, et. al. Biomed. Opt. Express 9, 2526-2542 (2018)

## Annular-illumination ODT



1.45

10um



1.47

10um

1.45

1.46

3D rendering of Pandorina

I.4 NAill + I.4 NAobj 100X MO; Lateral resolution 200nm; axial resolution 650 nm.

J Li, et. al. Biomed. Opt. Express 9, 2526-2542 (2018)

## Annular-illumination ODT



I.4 NAill + I.4 NAobj 100X MO; Lateral resolution 200nm; axial resolution 650 nm.

### Transport of intensity equation



## For further details, please refer to:

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Outline			f special issue:	
Highlights	Transport of intensity equation: a tutorial Chao Zuo ** * b, Jiaii Li * b, Jiasong Sun * b, Yao Fan * b, Jialin Zhang * b, Linpeng Lu * b, Runnan Zhang * b,		view of Recent Advances in Optical	
Abstract			/ Pramod Rastogi, Rishikesh Kulkarni	
Keywords	Bowen Wang <sup>a, b</sup> , Lei Huang	<sup>s</sup> , Qian Chen <sup>b</sup>		
1. Introduction	* Smart Computational Imaging (SCI) Laboratory, Nanjing University of Science and Technology, Nanjing, Jiangsu Province 210094, China Jiangsu Key Laboratory of Spectral Imaging & Intelligent Sense, Nanjing University of Science and Technology, Nanjing, Jiangsu Province 210094, China		Download special issue	
2. Basic concept of TIE	<sup>6</sup> Brookhaven National Laboratory, NSLS II 50 R	therford Drive, Upton, NY 11973-5000, United States	_	
3. Solutions to TIE	ADTICLE INFO	A. R. C. T. C. T.	nmended articles	
4. Image formation of coherent imaging an	ARTICLE INFO	ABSIRACI	projection decamouflaging	
5. Axial intensity derivative estimation	Keywords: Transport of Intensity Equation (TIE)	When it comes to "phase measurement" or "quantitative phase imaging", many people will automatically con nect them with "laser" and "interferometry". Indeed, conventional quantitative phase imaging and phase me	nd Lasers in Engineering, Volume 134, 2020,	
6. Image formation under partially coheren	Quantitative Phase Imaging (QPI) Phase Retrieval Partial Coherence	surement techniques generally rely on the superposition of two beams with a high degree of coherence: con plex interferometric configurations, stringent requirements on the environmental stabilities, and associated law	thase PDF View details ∨	
7. Generalized TIE under partially coherent	Optical Diffraction Tomography (ODT)	speelde noise severely limit their applications in optical imaging and microscopy. On a different note, as or of the most well-known phase retrieval approaches, the transport of intensity equation (TIE) provides a ne	ve w a	
8. 3D phase imaging under partially cohere		non-interferometric way to access quantitative phase information through intensity only measurement. Despi the insufficiency for interferometry, TIE is applicable under partially coherent illuminations (like the Köhler	nd Lasers in Engineering, 2020, Article 106358	
9. Applications of TIE in optical imaging an		illumination in a conventional microscope), permitting optimum spatial resolution, higher signal-to-noise rati and better image quality. In this tutorial, we give an overview of the basic principle, research fields, and repr	chase PDF View details ∨	
10. Conclusions and future directions		sentative applications of TIE, focus particularly on optical imaging, metrology, and microscopy. The purpose ( this tutorial is twofold. It should serve as a self-contained introduction to TIE for readers with little or no know	■ ■ ***********************************	
CRediT authorship contribution statement		edge of TIE. On the other hand, it attempts to give an overview of recent developments in this field. These resul highlight a new era in which strict coherence and interferometry are no longer presequisites for quantitativ	nd Lasers in Engineering, Volume 132, 2020,	
Declaration of Competing Interest		phase imaging and diffraction tomography, paving the way toward new generation label-free three-dimension microscopy, with applications in all branches of biomedicine.	al chase PDF View details 🗸	
Acknowledgments			- 1 2 Next >	
Appendix A. Supplementary materials	are d	escribed.	_	
Processing math: 26%				

Transport of intensity equation: a tutorial

C Zuo, J Li, J Sun, Y Fan, J Zhang, L Lu, R Zhang, B Wang, L Huang, Q Chen Optics and Lasers in Engineering, 106187, 2020

## Computational imaging



第 40 卷 第 1 期	光学学报	Vol. 40, No. 1
2020年1月	Acta Optica Sinica	January, 2020

・特邀综述・

#### 深度学习下的计算成像:现状、挑战与未来

#### 左超<sup>1,2</sup>,冯世杰<sup>1,2</sup>,张翔宇<sup>1,2</sup>,韩静<sup>2</sup>,陈钱<sup>2</sup>\*

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<sup>2</sup>南京理工大学江苏省光谱成像与智能感知重点实验室, 江苏 南京 210094

摘要 近年来,光学成像技术已经由传统的强度、彩色成像发展进入计算光学成像时代。计算光学成像基于几何 光学、波动光学等理论对场景目标经光学系统成像再到探测器采样这一完整图像生成过程建立精确的正向数学模 型,再求解该正向成像模型所对应的"逆问题",以计算重构的方式来获得场景目标的高质量图像或者传统技术无 法直接获得的相位、光谱、偏振、光场、相干度、折射率、三维形貌等高维度物理信息。然而,计算成像系统的实际成 像性能也同样极大程度地受限于"正向数学模型的准确性"以及"逆向重构算法的可靠性",实际成像物理过程的不 可预见性与高维病态逆问题求解的复杂性已成为这一领域进一步发展的瓶颈问题。近年来,人工智能与深度学习 技术的飞跃式发展为计算光学成像技术开启了一扇全新的大门。不同于传统计算成像方法所依赖的物理驱动,深 度学习下的计算成像是一类由数据驱动的方法,它不但解决了许多过去计算成像领域难以解决的难题,还在信息 获取能力、成像的功能、核心性能指标(如成像空间分辨率、时间分辨率、灵敏度等)上都获得了显著提升。基于此, 首先概括性介绍深度学习技术在计算光学成像领域的研究进展与最新成果,然后分析了当前深度学习技术在计算 光学成像领域面临的主要问题与挑战,最后展望了该领域未来的发展方向与可能的研究方向。

关键词 成像系统;计算成像;深度学习;光学成像;光信息处理

**中图分类号** O436 文献标志码 A

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## Computational imaging





Thank you

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