

DOI: [10.29026/oea.2023.230047](https://doi.org/10.29026/oea.2023.230047)

Adding dimensions with Lucy–Richardson–Rosen algorithm to incoherent imaging

Tatsuki Tahara*

A novel computational reconstruction method called the Lucy–Richardson–Rosen algorithm (LRRRA) for the construction of a single-shot infrared 3D imaging microscope was reported in *Opto-Electronic Science*. In that study, a commonly available optical element, the Cassegrain objective lens, was used as a coded aperture for 3D imaging using LRRRA. Unlike regular coded aperture imaging systems, achieving 3D imaging using commonly available imaging devices leads to the development of hybrid imaging systems where direct and indirect imaging concepts coexist. The development above will make 3D imaging more commonly used in daily life.

Tatsuki T. Adding dimensions with Lucy–Richardson–Rosen algorithm to incoherent imaging. *Opto-Electron Adv* 6, 230047 (2023).

Incoherent digital holography (IDH) is a rapidly evolving research area with a rich history^{1–4}. In IDH, the light from an object point is split into two, differently modulated, and interfered to form a self-interference hologram that contains the 3D location information of the object point. The 3D information is reconstructed by computational reconstruction methods such as numerical back propagation with a diffraction integral. The two main challenges of IDH, namely, robustness to external vibrations and low temporal resolution, were solved systematically by different research groups^{1–4}. However, IDH requires state-of-the-art optical device(s) and/or a highly technical optical architecture to generate the interference fringe image of spatially and temporally incoherent light.

Coded aperture imaging (CAI) is another incoherent imaging technique developed in the 20th century to achieve lensless 2D imaging with nonvisible wavelengths^{5,6}. In CAI, the light from an object is modu-

lated by a coded mask and recorded. The recorded intensity distribution is processed with the point spread function (PSF) recorded under identical conditions to reconstruct the object image. An IDH technique using CAI called coded aperture correlation holography (COACH)^{7,8} was developed in 2016, wherein the light from an object is modulated by a random phase mask and interfered with an unmodulated object wave. In COACH, there is no numerical image plane unlike its precursors^{1–4}. Therefore, the reconstruction technique of CAI was mandatory, which involves the recording of point spread holograms (PSHs) along all axial planes, followed by computational processing of the object hologram with the PSHs. At this point, a connection between CAI and IDH was established. Later, it was found by the research group that the 3D information is encoded in both the amplitude and the phase of the light diffracted by the random phase mask. This led to the development of a simpler version of COACH called interferenceless

National Institute of Information and Communications Technology, 4-2-1 Nukuikitamachi, Koganei, Tokyo 184-8795, Japan.

*Correspondence: T Tahara, E-mail: tahara@nict.go.jp

Received: 28 March 2023; Accepted: 3 April 2023; Published online: 25 April 2023



Open Access This article is licensed under a Creative Commons Attribution 4.0 International License.

To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2023. Published by Institute of Optics and Electronics, Chinese Academy of Sciences.

COACH (I-COACH)⁸. I-COACH had the advantages of both IDH and CAI, that is, 3D imaging capability and simple optical architecture, respectively.

One drawback with I-COACH is the low SNR due to scattering by the random phase mask, which makes it unsuitable for light-sensitive applications and complicated microscope configurations. The main reason for using a random phase mask in I-COACH is that the intensity distribution obtained by scattering has sharp autocorrelation functions and low cross-correlation along depth (SALCAD). During an attempt to apply I-COACH to the infrared microscope (IRM) of the Australian Synchrotron, it was found that the Cassegrain objective lens exhibited the SALCAD property except with a higher SNR than a random phase mask. This discovery opened up many possibilities. However, the optimal reconstruction method used in I-COACH, called nonlinear reconstruction (NLR), did not reconstruct images with a high SNR⁹.

Therefore, a novel reconstruction method called the Lucy–Richardson–Rosen algorithm (LRRRA) was developed by integrating NLR with the well-known Lucy–Richardson algorithm^{10–12}. The LRRRA method with the Cassegrain objective lens as the coded aperture reconstructed 3D object information with a high SNR. The schematic of the IRM system and the recorded PSF images for 0 to 200 μm in steps of 50 μm are shown in Fig. 1. The schematic of the LRRRA, the images recorded for pinholes and silk samples, and their reconstructions using LRRRA are shown in Fig. 2(a–e).

One major advantage of using an imaging element as a coded aperture is the coexistence of direct imaging and indirect imaging concepts in the same framework. When the imaging condition is satisfied, reconstruction is not needed, and in other cases, a reconstruction by LRRRA is needed. The outcome of this research enabled the deep deconvolution of images recorded by a refractive lens¹³

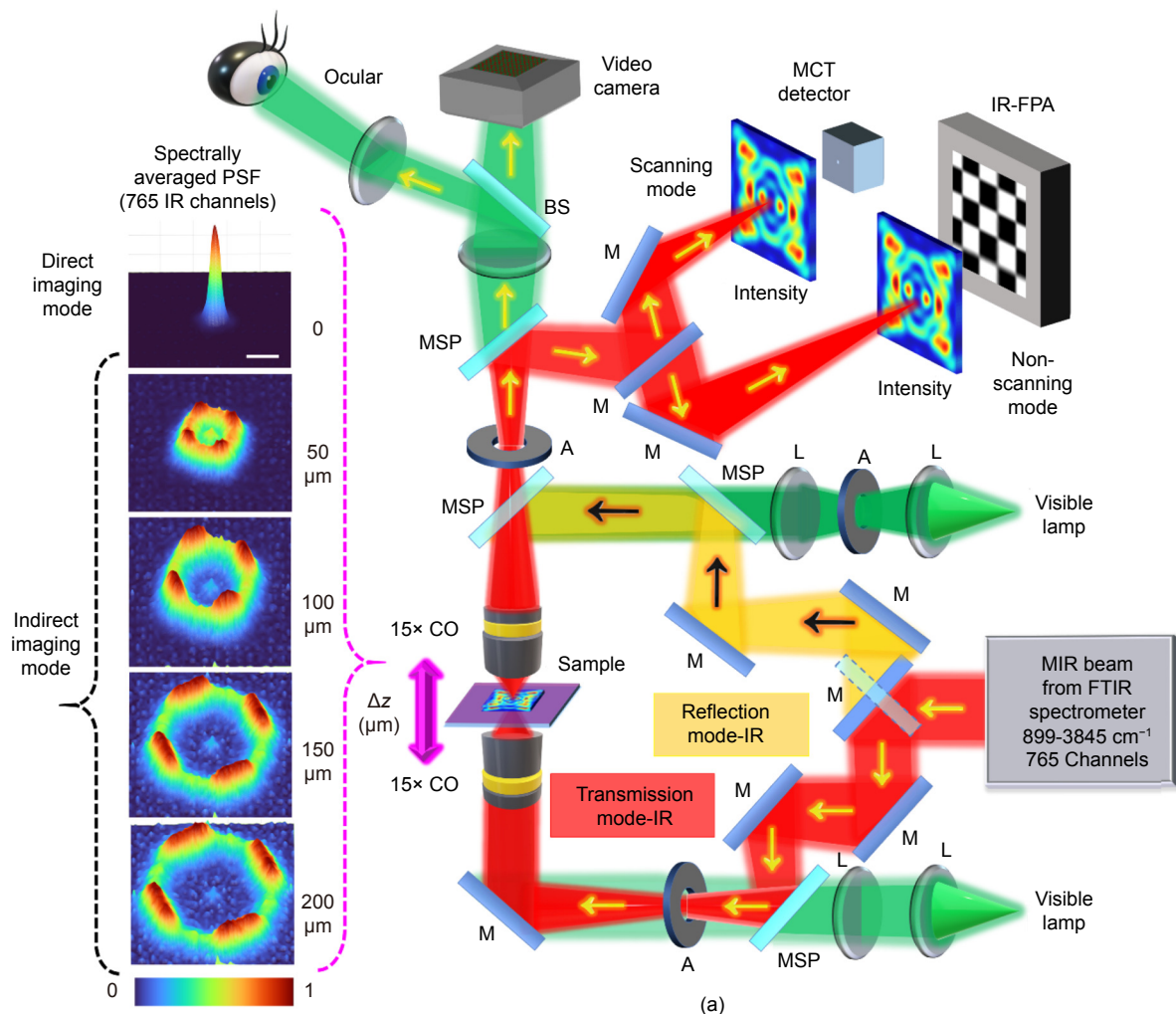


Fig. 1 | Schematic of IRM system at Australian Synchrotron. Please see ref.¹² for detailed information.

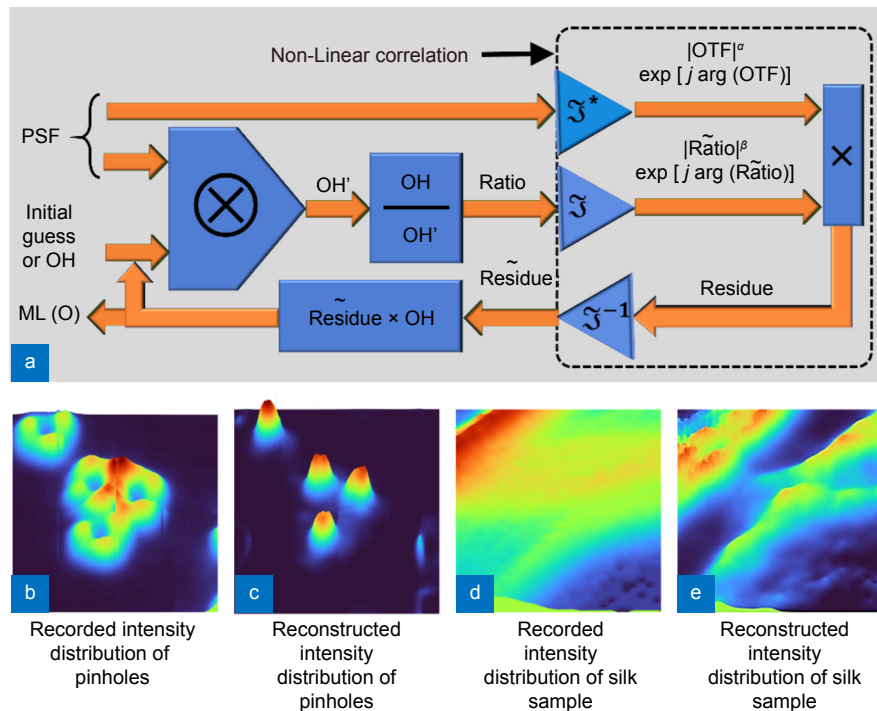


Fig. 2 | (a) Lucy–Richardson–Rosen algorithm. O: object; OH: object hologram, also used as the initial guess solution R^1 ; PSF: point spread function; OTF: – optical transfer function; \otimes : element by element product; \oslash : 2D convolution; \mathcal{F} : Fourier transform; \mathcal{F}^* : complex conjugate operation following a Fourier transform; \mathcal{F}^{-1} : inverse Fourier transform; \sim : Fourier transform of a variable; R^n and $R^{(n+1)}$: – n^{th} and $(n+1)^{\text{th}}$ solutions, respectively; and ML(O): maximum likelihood solution of the object. (b) Recorded image of pinholes and (c) its reconstruction using LRR. (d) Recorded image of silk sample and (e) its reconstruction using LRR.

and also simplified the IDH technique¹⁴. The acceleration of computational processing time and the experimental demonstration with natural visible light are keys to develop real-time 3D imaging applications by the proposed technique. The reported study¹² will have a significant effect on the current state-of-the-art IDH as well as CAI techniques and open new pathways to imaging.

References

- Rosen J, Vijayakumar A, Kumar M, Rai MR, Kelner R et al. Recent advances in self-interference incoherent digital holography. *Adv Opt Photonics* **11**, 1–66 (2019).
- Tahara T, Zhang YP, Rosen J, Anand V, Cao LC et al. Roadmap of incoherent digital holography. *Appl Phys B* **128**, 193 (2022).
- Liu JP, Tahara T, Hayasaki Y, Poon TC. Incoherent digital holography: a review. *Appl Sci* **8**, 143 (2018).
- Rosen J, Alford S, Anand V, Art J, Bouchal P et al. Roadmap on recent progress in FINCH technology. *J Imaging* **7**, 197 (2021).
- Dicke RH. Scatter-hole cameras for X-rays and gamma rays. *Astrophys J* **153**, L101 (1968).
- Ables JG. Fourier transform photography: a new method for X-ray astronomy. *Publ Astron Soc Aust* **1**, 172–173 (1968).
- Vijayakumar A, Kashter Y, Kelner R, Rosen J. Coded aperture correlation holography—a new type of incoherent digital holograms. *Opt Express* **24**, 12430–12441 (2016).
- Vijayakumar A, Rosen J. Interferenceless coded aperture correlation holography—a new technique for recording incoherent digital holograms without two-wave interference. *Opt Express* **25**, 13883–13896 (2017).
- Rai MR, Vijayakumar A, Rosen J. Non-linear adaptive three-dimensional imaging with interferenceless coded aperture correlation holography (I-COACH). *Opt Express* **26**, 18143–18154 (2018).
- Richardson WH. Bayesian-based iterative method of image restoration. *J Opt Soc Am* **62**, 55–59 (1972).
- Lucy LB. An iterative technique for the rectification of observed distributions. *Astron J* **79**, 745–754 (1974).
- Anand V, Han ML, Maksimovic J, Ng SH, Katkus T et al. Single-shot mid-infrared incoherent holography using Lucy–Richardson–Rosen algorithm. *Opto-Electron Sci* **1**, 210006 (2022).
- Praveen A, Arockiaraj FG, Gopinath S, Smith D, Kahro T et al. Deep deconvolution of object information modulated by a refractive lens using Lucy–Richardson–Rosen Algorithm. *Photonics* **9**, 625 (2022).
- Balasubramani V, Anand V, Reddy ANK, Rajeswary ASJF, Magistretti PJ et al. Fresnel incoherent correlation holography using Lucy–Richardson–Rosen algorithm. In *Proceedings of the Digital Holography and Three-Dimensional Imaging 2020 Th2A-1* (Optica Publishing Group, 2022); <http://doi.org/10.1364/DH.2022.Th2A.1>.