

## Breakout Session 1: Track B

# Cloud Computing for Optical Image Restoration and Intramural Training

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# Cloud Computing for Optical Image Restoration and Intramural Training

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NEI, NIBIB, and AIM

Intramural Research Program, National Institutes of Health

# Objectives

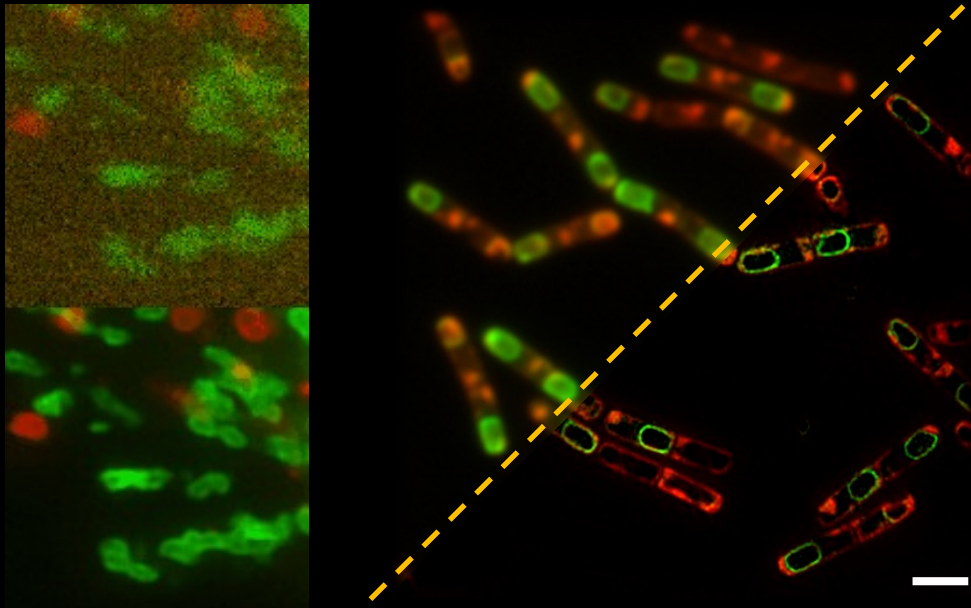
1. Develop and apply artificial intelligence-based methods to imaging datasets in the cloud.
2. Train the next generation of data scientists by creating a small community of cloud users interested in optical imaging and microscopy.

# Part 1: Cloud computing for optical microscopy

Jiamin Liu

Advanced Imaging and Microscopy (AIM) Resource

# Deep Learning to Denoise and Enhance Resolution for Super Resolution Imaging



Advanced Imaging and Microscopy Resource (AIM)  
NIBIB, NIH

## ARTICLES

<https://doi.org/10.1038/s41592-021-01155-x>

nature | methods

Check for updates

### Three-dimensional residual channel attention networks denoise and sharpen fluorescence microscopy image volumes

Jiji Chen<sup>1,10</sup>, Hideki Sasaki<sup>2,3,10</sup>, Hoyin Lai<sup>2,3,10</sup>, Yijun Su<sup>1,2,3,4,10</sup>, Jiamin Liu<sup>1</sup>, Yicong Wu<sup>4</sup>, Alexander Zhovmer<sup>5</sup>, Christian A. Combs<sup>6</sup>, Ivan Rey-Suarez<sup>7,8</sup>, Hung-Yu Chang<sup>2,3</sup>, Chi Chou Huang<sup>2,3</sup>, Xuesong Li<sup>4</sup>, Min Guo<sup>4</sup>, Srineil Nizambad<sup>1</sup>, Arpita Upadhyaya<sup>7,8,9</sup>, Shih-Jong J. Lee<sup>2,3</sup>, Luciano A. G. Lucas<sup>2,3,11</sup> and Hari Shroff<sup>1,4,11</sup>

## nature biotechnology



Article

<https://doi.org/10.1038/s41587-022-01651-1>

### Three-dimensional structured illumination microscopy with enhanced axial resolution

Received: 15 August 2022

Accepted: 16 December 2022

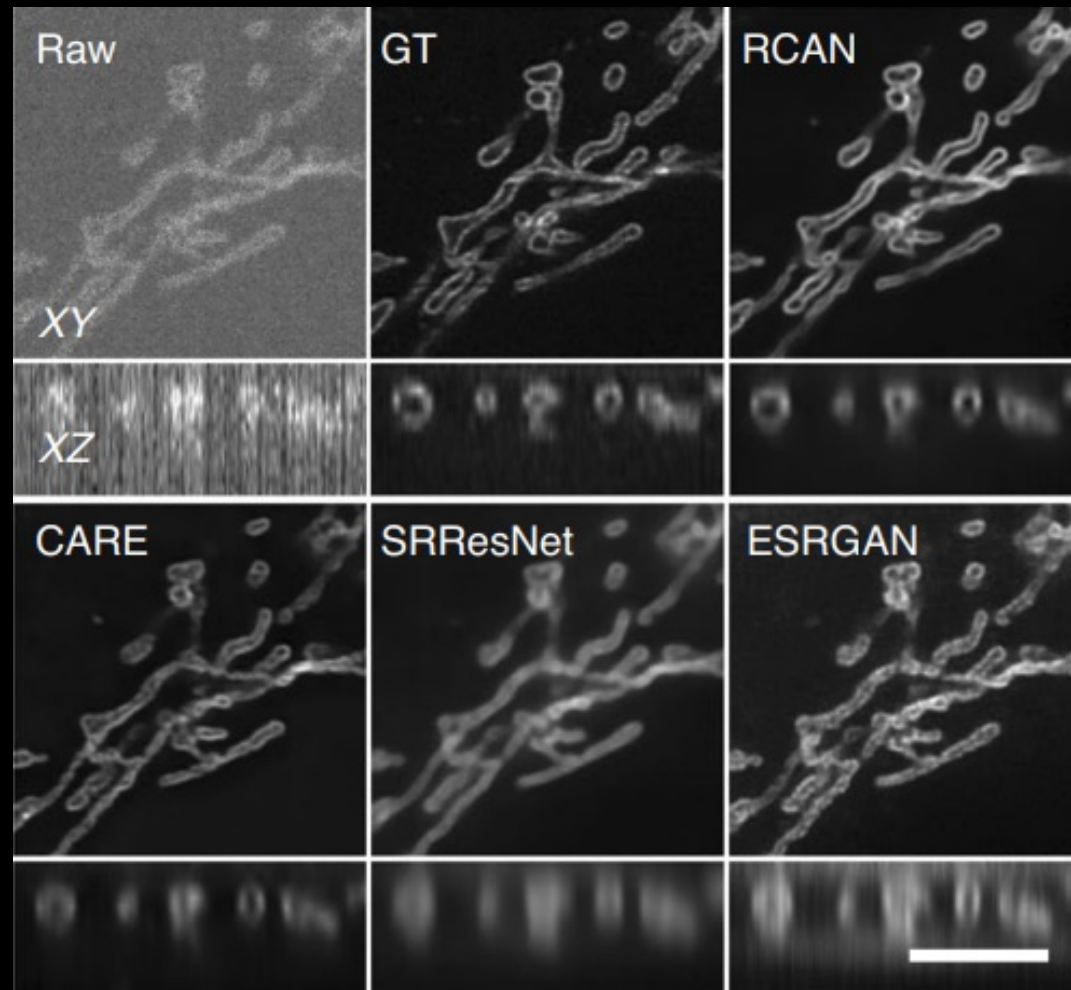
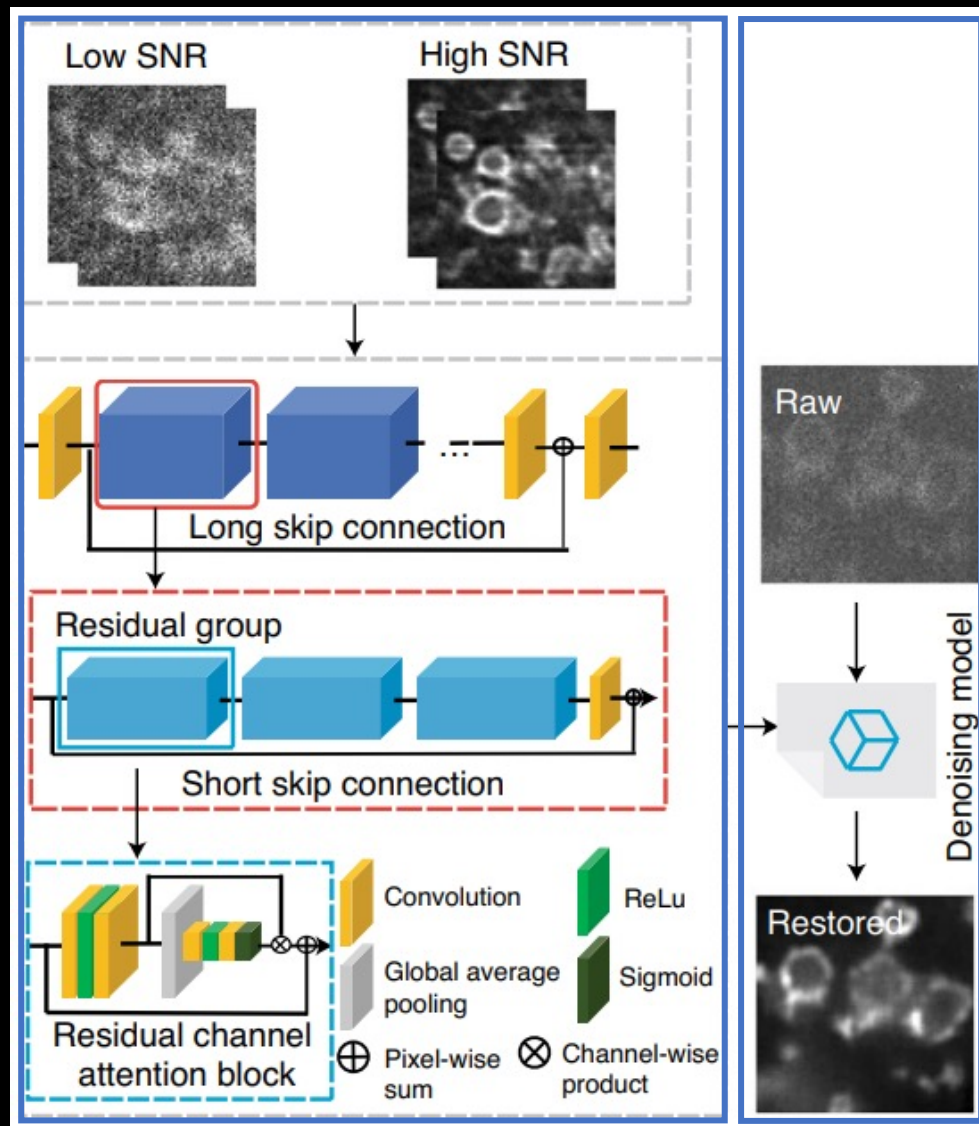
Published online: 26 January 2023

Check for updates

Xuesong Li<sup>1,4</sup>, Yicong Wu<sup>1,2</sup>, Yijun Su<sup>1,2,3,4,14</sup>, Ivan Rey-Suarez<sup>5</sup>, Claudia Mattheaus<sup>6</sup>, Taylor B. Updegrave<sup>7</sup>, Zhuang Wei<sup>8</sup>, Lixia Zhang<sup>2</sup>, Hideki Sasaki<sup>3,4</sup>, Yue Li<sup>9</sup>, Min Guo<sup>1,15</sup>, John P. Giannini<sup>1</sup>, Harshad D. Vishwasrao<sup>2</sup>, Jiji Chen<sup>2</sup>, Shih-Jong J. Lee<sup>3,4</sup>, Lin Shao<sup>10</sup>, Huafeng Liu<sup>9</sup>, Kumaran S. Ramamurthi<sup>7</sup>, Justin W. Taraska<sup>6</sup>, Arpita Upadhyaya<sup>3,11</sup>, Patrick La Riviere<sup>12,13</sup> & Hari Shroff<sup>1,2,13,14</sup>

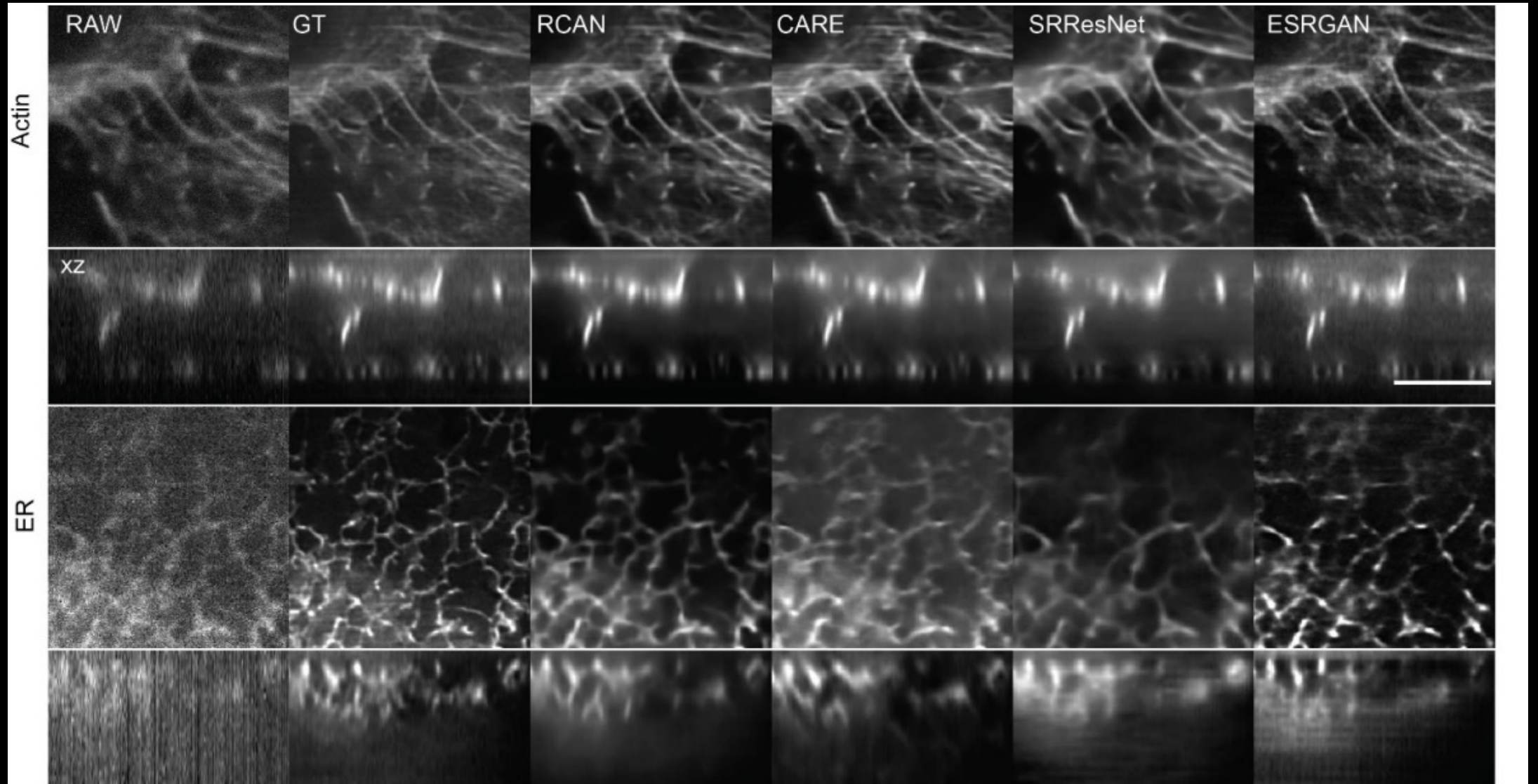
## Training

## Testing

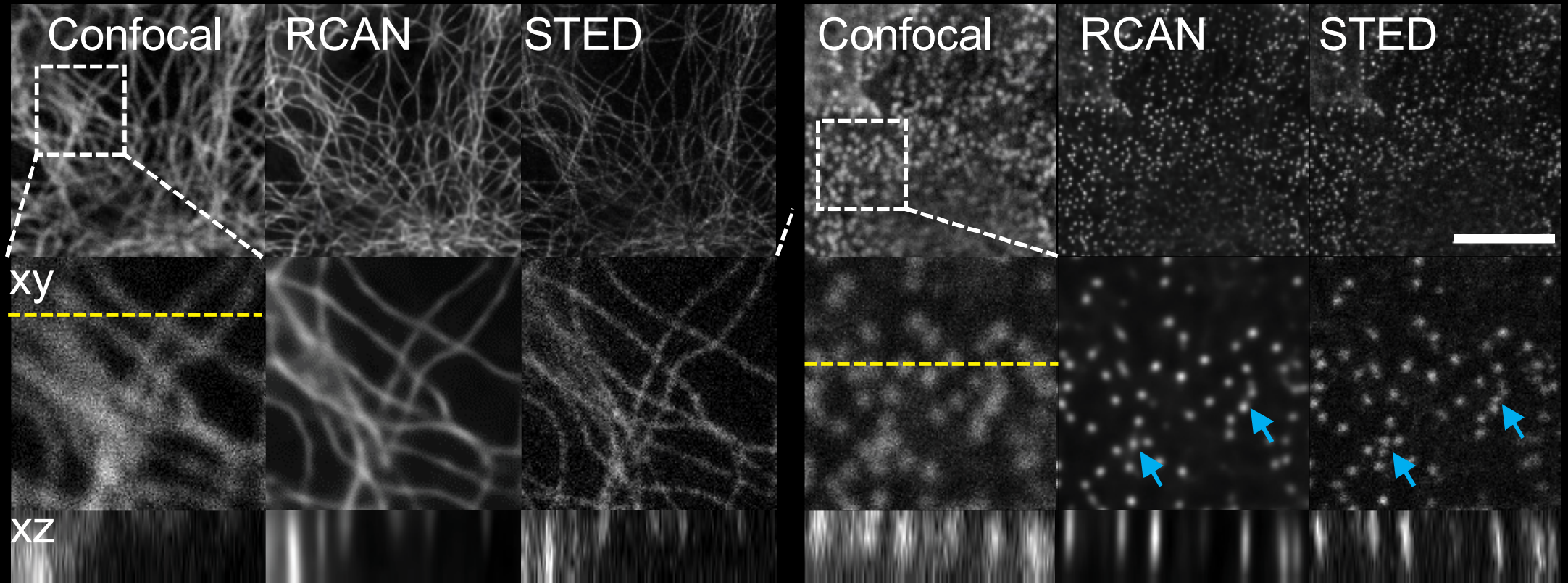


CARE: Content-aware image restoration Nat Methods. 2018 Dec;15(12):1090-1097.  
 ESRGAN: Enhanced super resolution generative adversarial network arXiv:1809.00219v2  
 SRResNet: Super resolution ResNet arXiv:1609.04802v5

# RCAN vs State-of-Art Methods

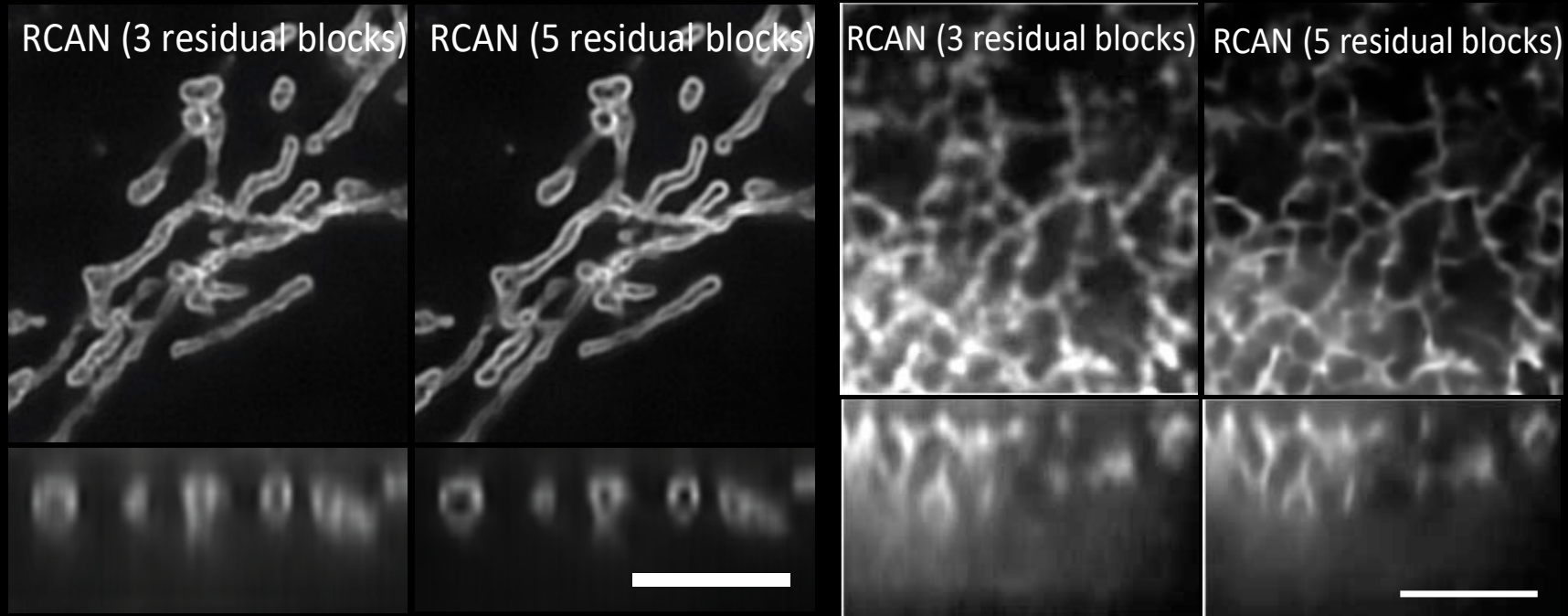


# Cross Imaging Modality: Confocal to STED





## Hyperparameters Tuning



More residual blocks increase 3D RCAN performance.  
It requires much more training time and high-end GPU.

# Three-dimensional structured illumination microscopy with enhanced axial resolution

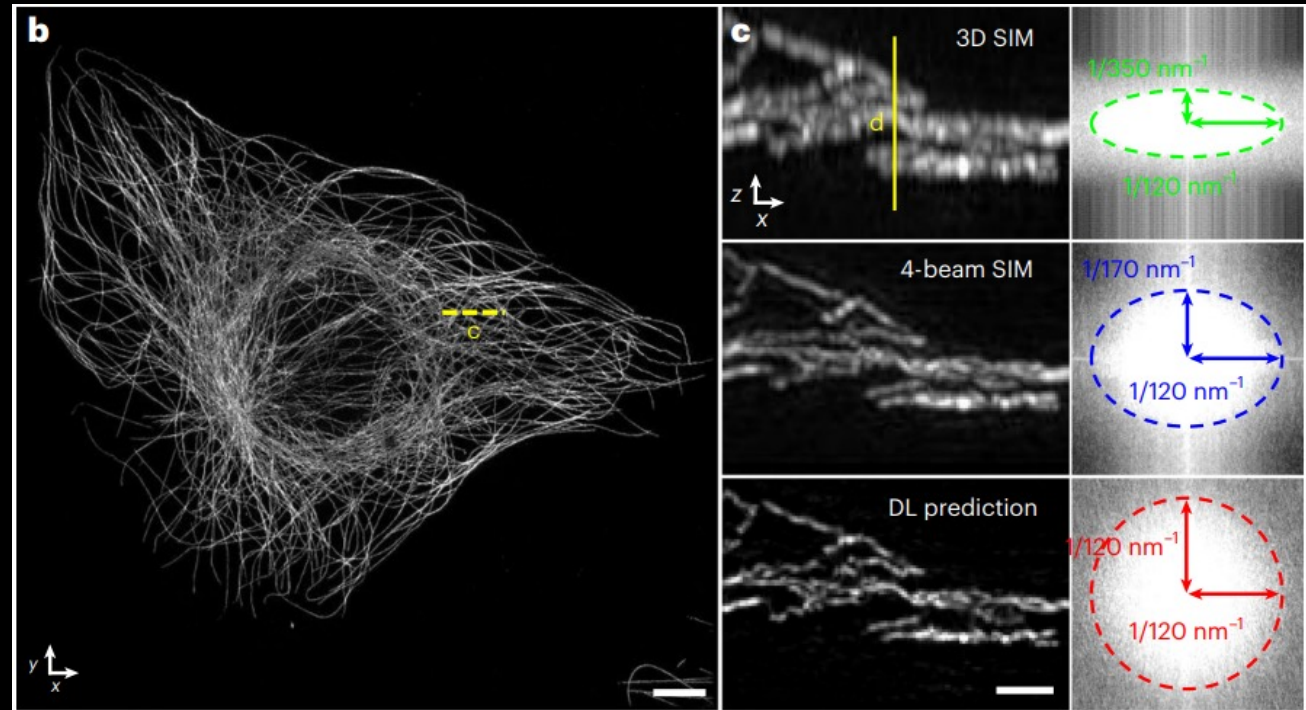
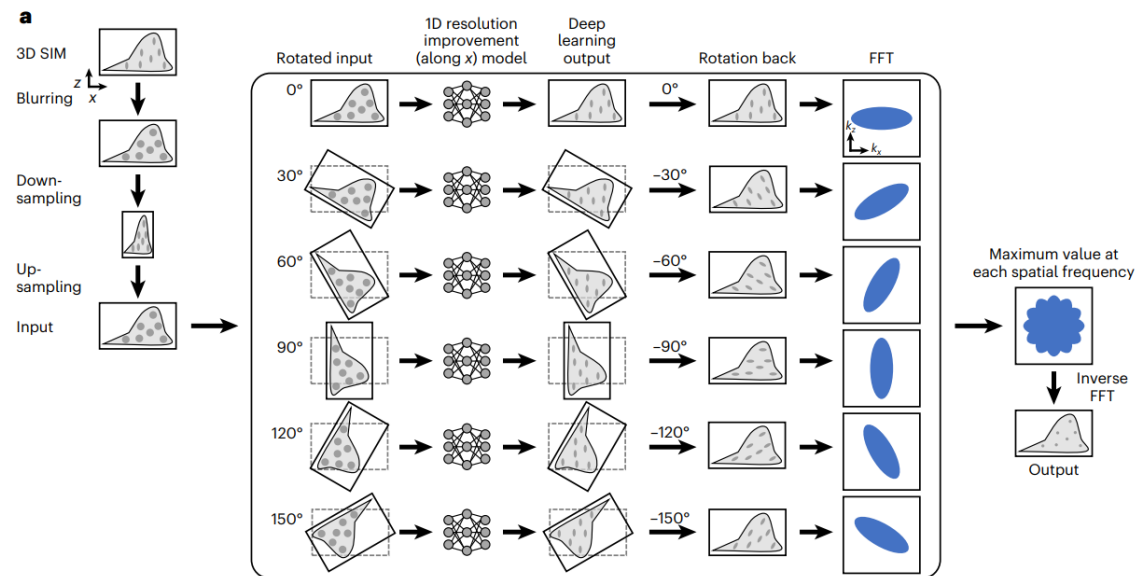
Received: 15 August 2022

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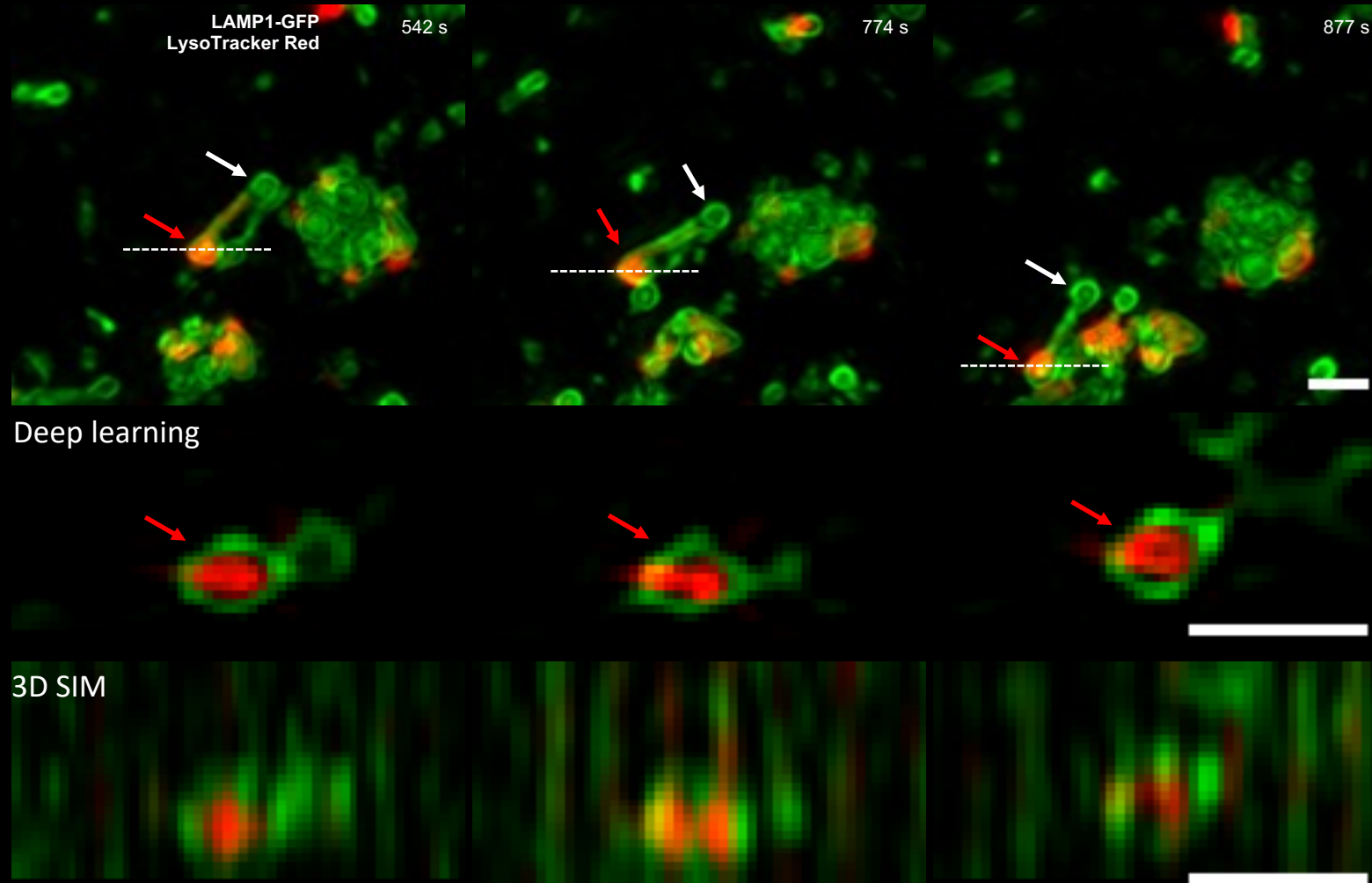
Published online: 26 January 2023

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Xuesong Li<sup>1,14</sup>✉, Yicong Wu<sup>1,2</sup>✉, Yijun Su<sup>1,2,3,4,14</sup>, Ivan Rey-Suarez<sup>5</sup>, Claudia Matthaeus<sup>6</sup>, Taylor B. Updegrave<sup>7</sup>, Zhuang Wei<sup>8</sup>, Lixia Zhang<sup>2</sup>, Hideki Sasaki<sup>3,4</sup>, Yue Li<sup>9</sup>, Min Guo<sup>1,15</sup>, John P. Giannini<sup>1</sup>, Harshad D. Vishwasrao<sup>2</sup>, Jiji Chen<sup>2</sup>, Shih-Jong J. Lee<sup>3,4</sup>, Lin Shao<sup>10</sup>, Huafeng Liu<sup>9</sup>, Kumaran S. Ramamurthi<sup>7</sup>, Justin W. Taraska<sup>6</sup>, Arpita Upadhyaya<sup>5,11</sup>, Patrick La Riviere<sup>12,13</sup> & Hari Shroff<sup>1,2,13,14</sup>



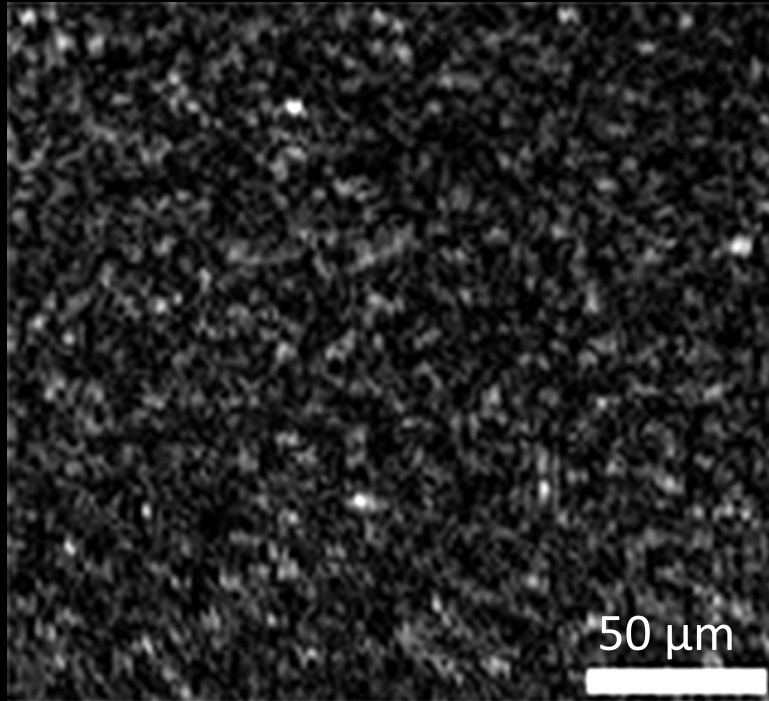
# DL Enables 120 nm Isotropic Resolution



# Part 2: Cloud computing for optical imaging in the eye

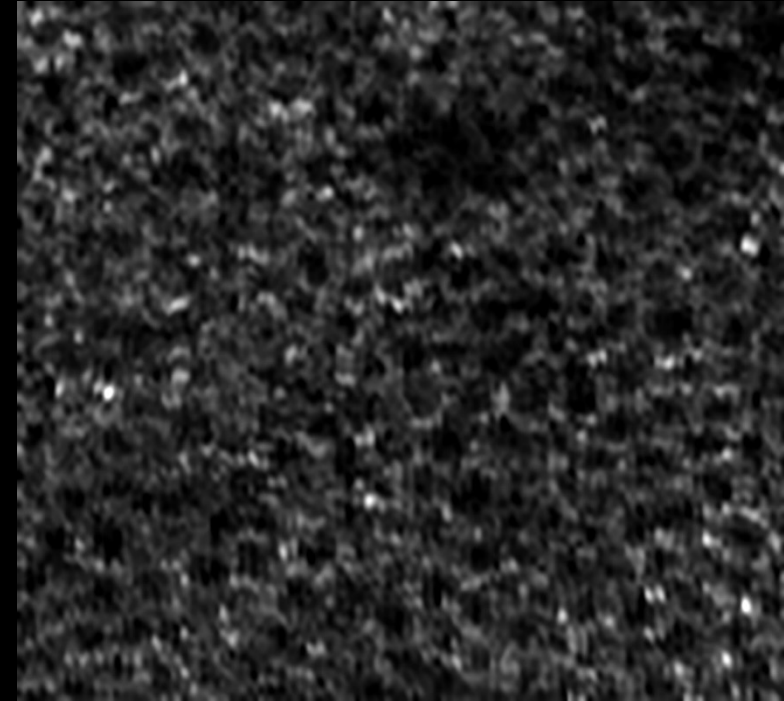
Vineeta Das  
National Eye Institute

# Imaging of the RPE cells



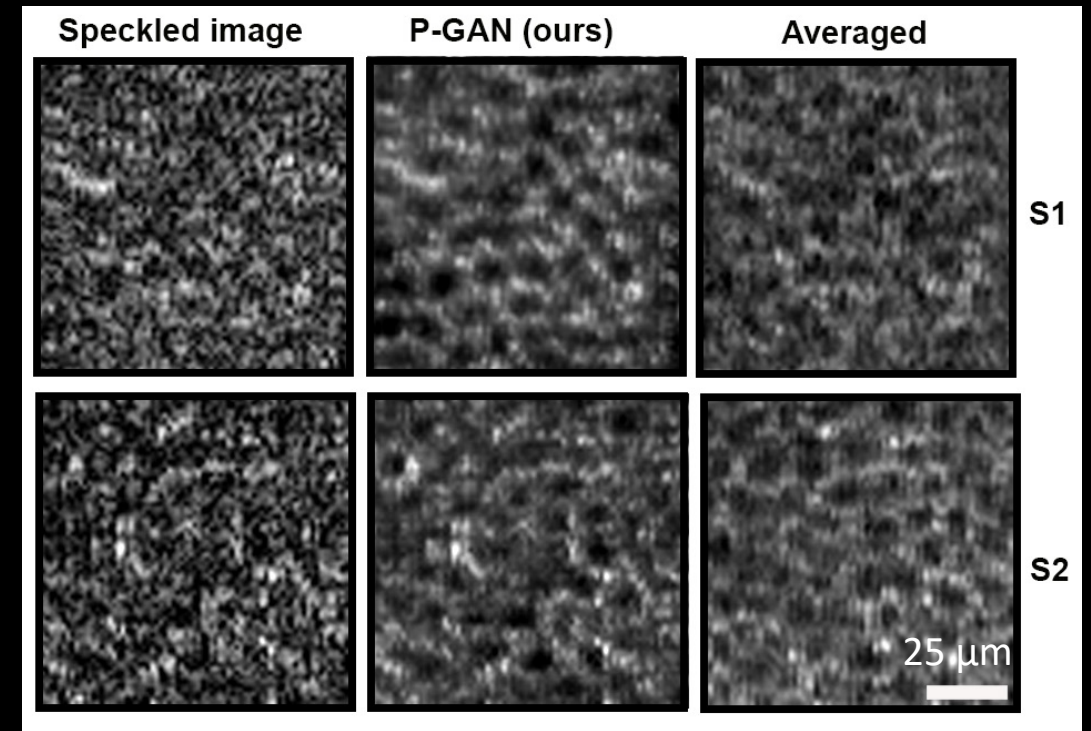
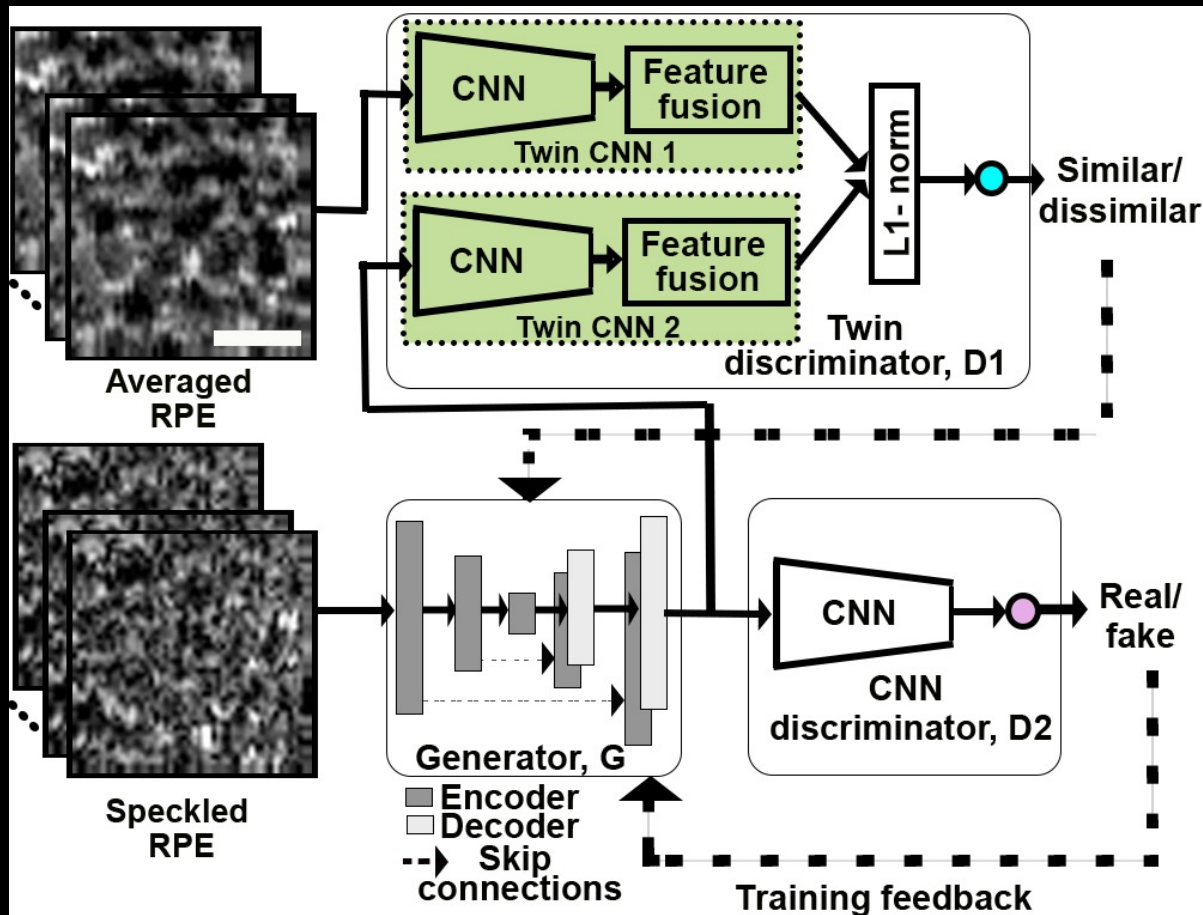
Single acquisition of RPE cells

50  $\mu\text{m}$



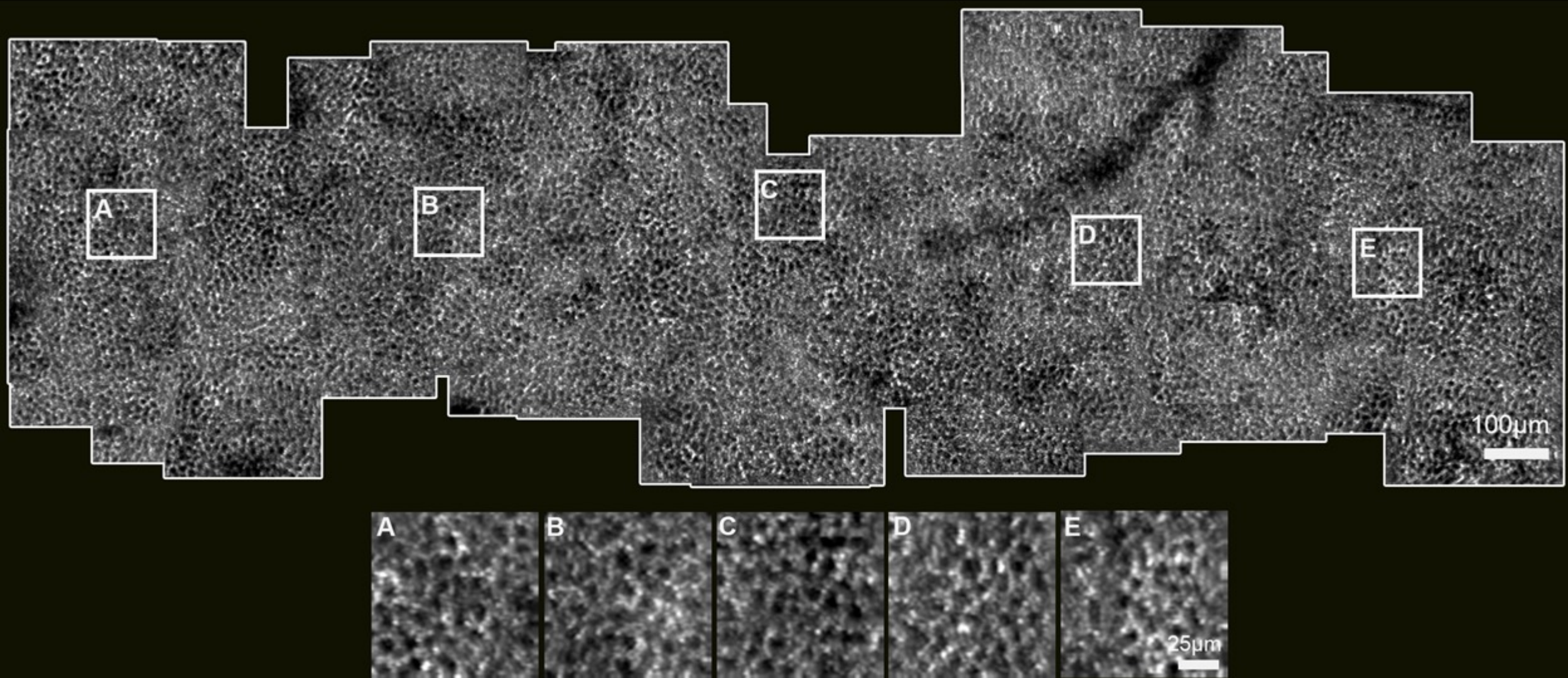
Average of 120 acquisitions

# Parallel discriminator GAN (P-GAN) for RPE recovery

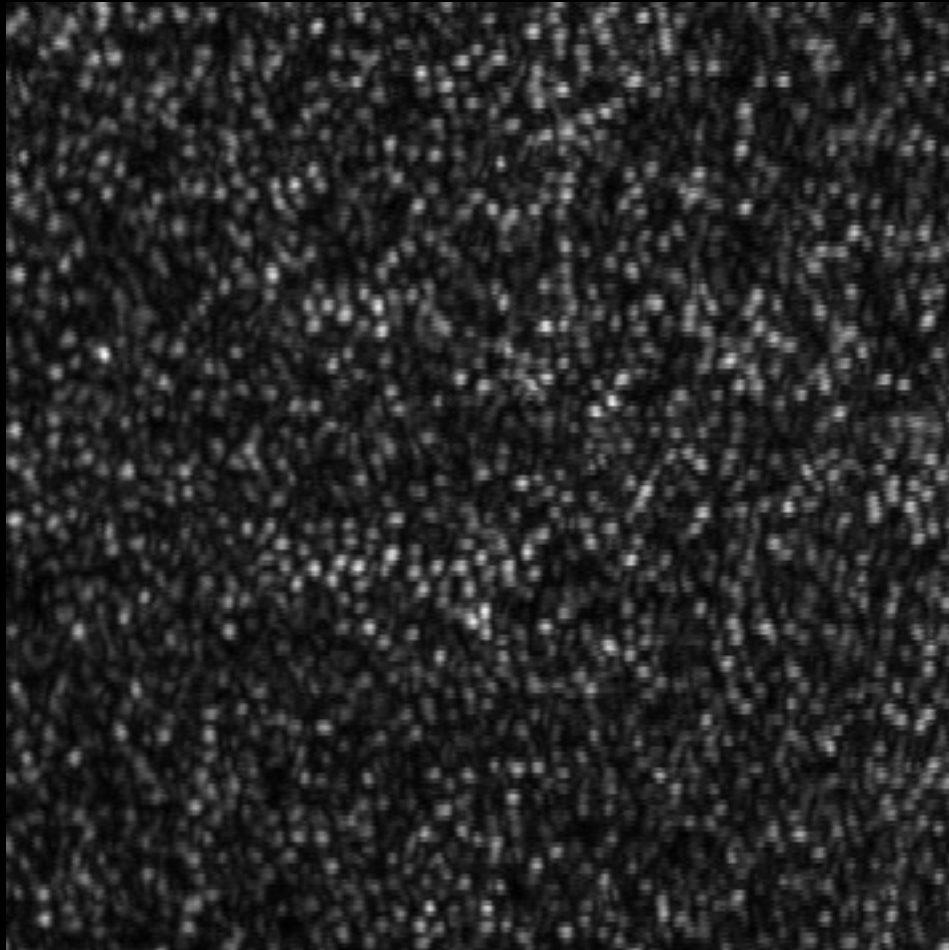


\*S1 and S2 represent subjects

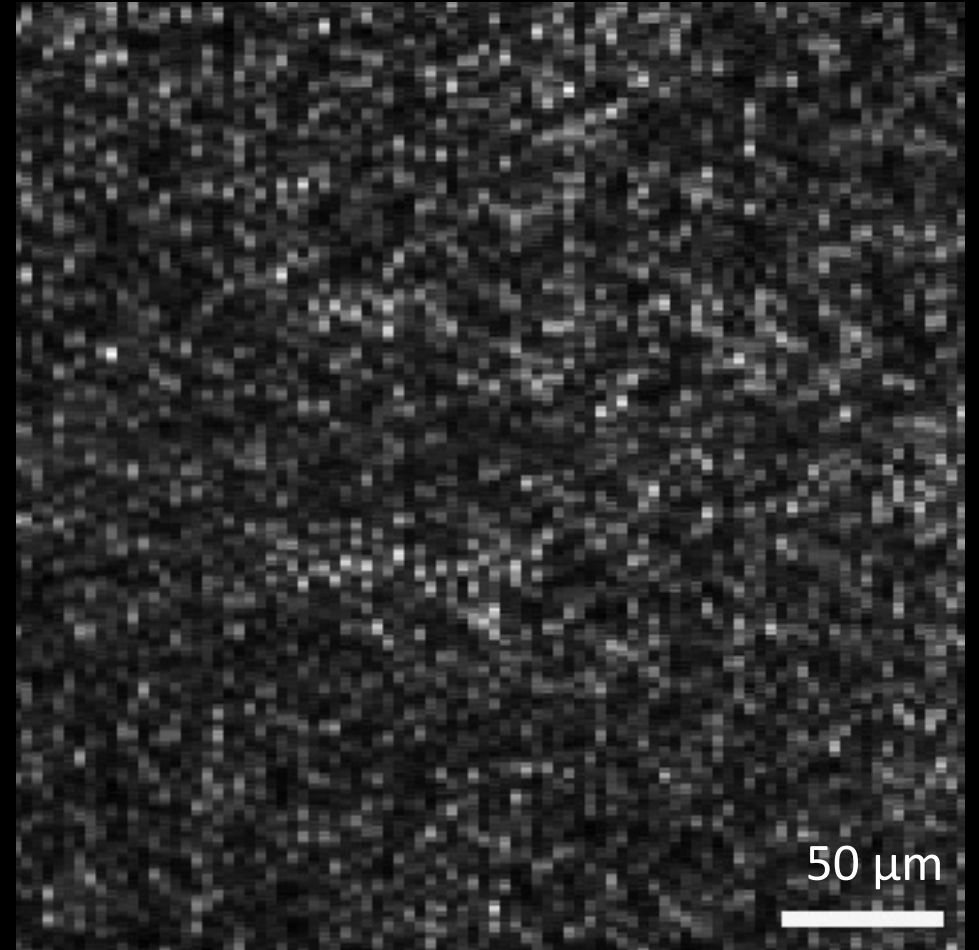
# AI assisted imaging enables large scale RPE visualization



# Imaging of the cone photoreceptors



Dense sampling (DS)



Sparse sampling (SpS)



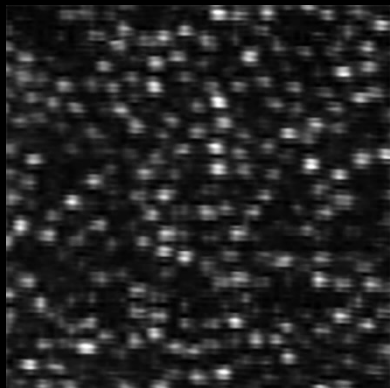
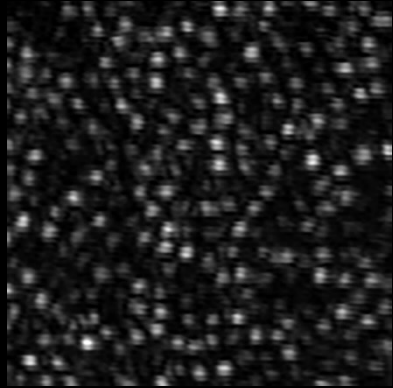
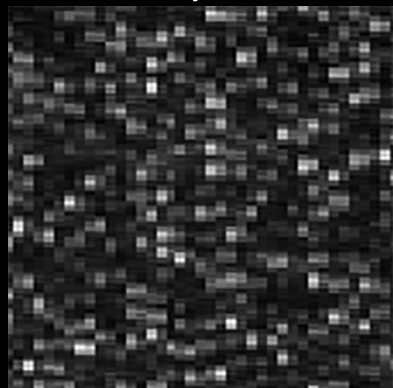
# Results

SpS

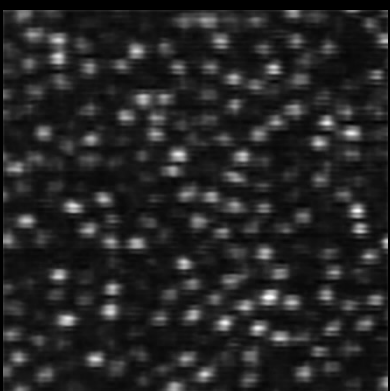
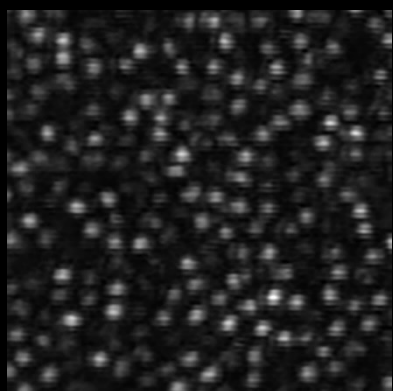
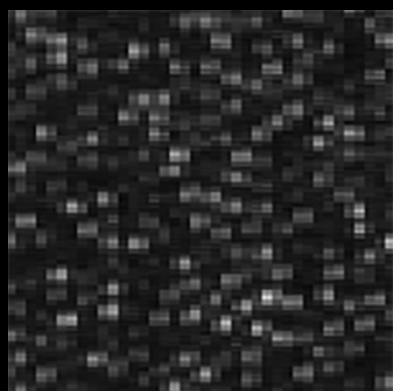
DS

AI

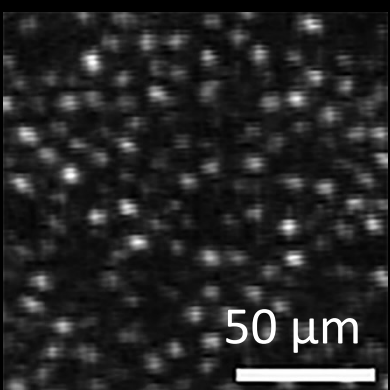
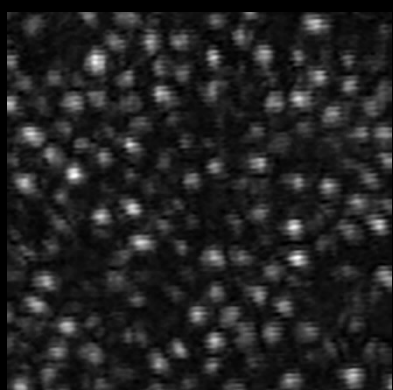
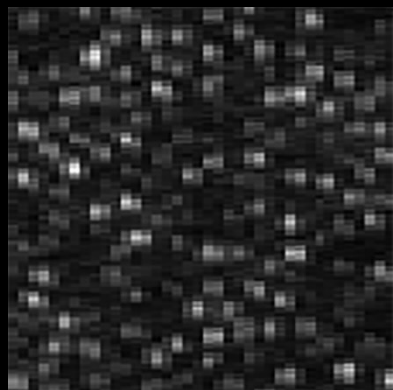
L1



L2



L3



Estimated cell spacing ( $\mu\text{m}$ )

Location	DS	AI
L1	11.5	11.3
L2	9.8	10.2
L3	8.3	8.0

L1, L2, and L3 denote regions of interest imaged at 1.5 mm, 2.1 mm and 2.7 mm temporal to the fovea, respectively.

# Acknowledgements

	<u>AIM / NIBIB</u>	<u>NEI</u>
Current members	Harshad Vishwasrao Jiji Chen Jiamin Liu	Andrei Volkov Tao Liu
<i>Previous members</i>	<i>Hari Shroff</i> <i>Yicong Wu</i> <i>Xuesong Li</i>	<i>Bruno Alvisio</i> <i>Jianfei Liu</i>

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