

ITERATIVE METHODS IN LARGE FIELD ELECTRON MICROSCOPE TOMOGRAPHY

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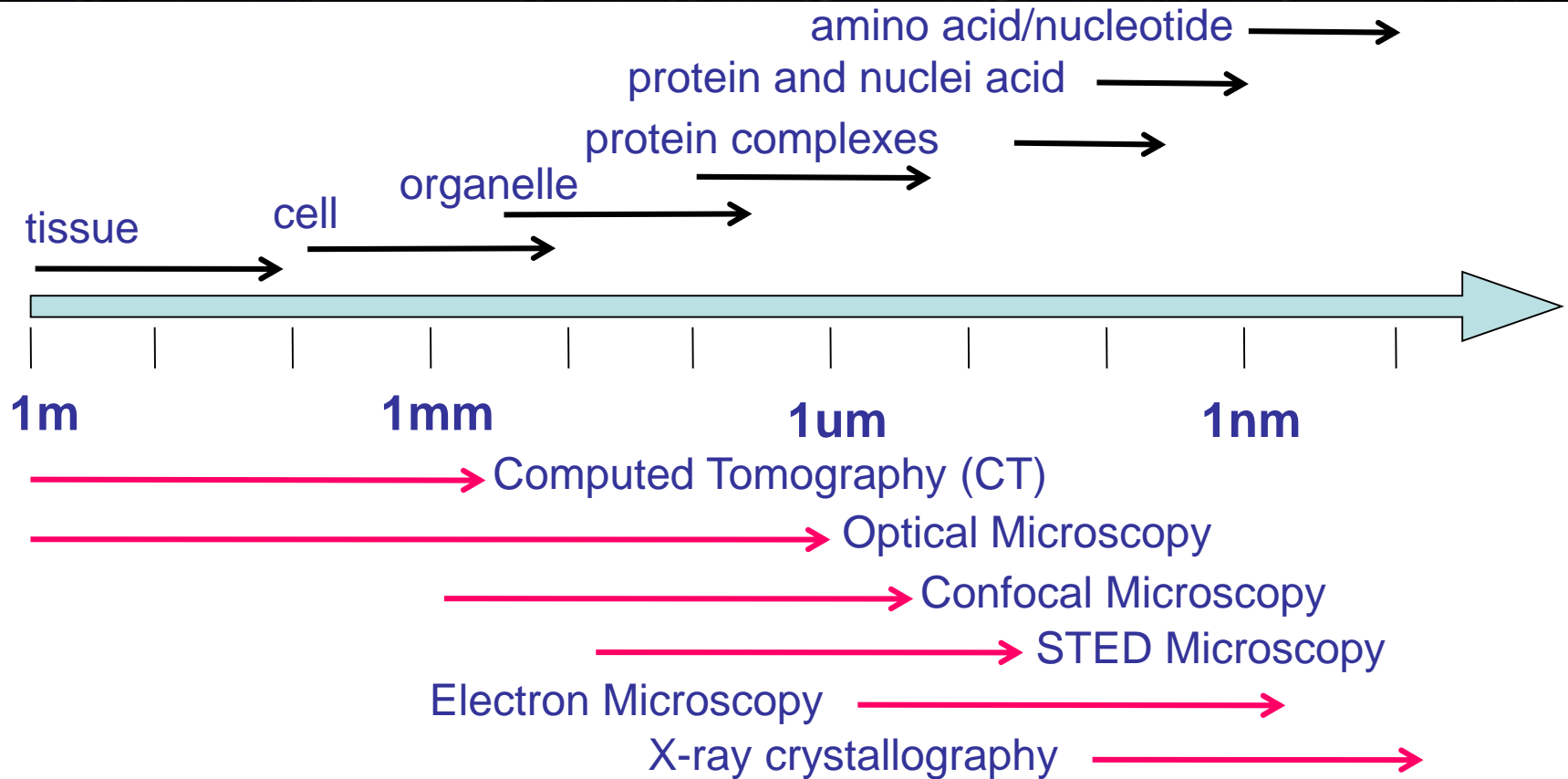
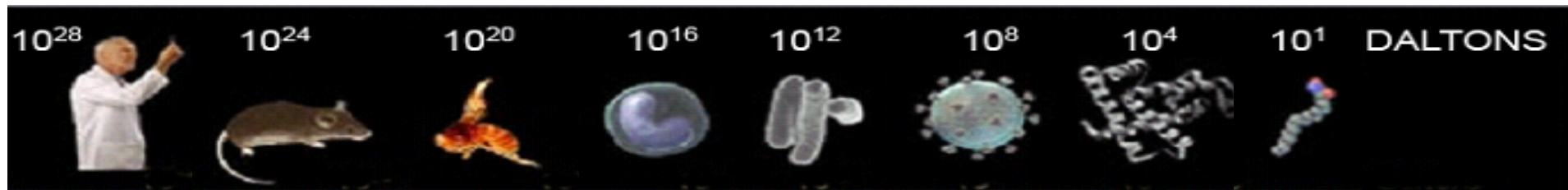
**Institute of Computing Technology,
Chinese Academy of Sciences**

Outline

- Background
- Problem
- Our work
- Future work

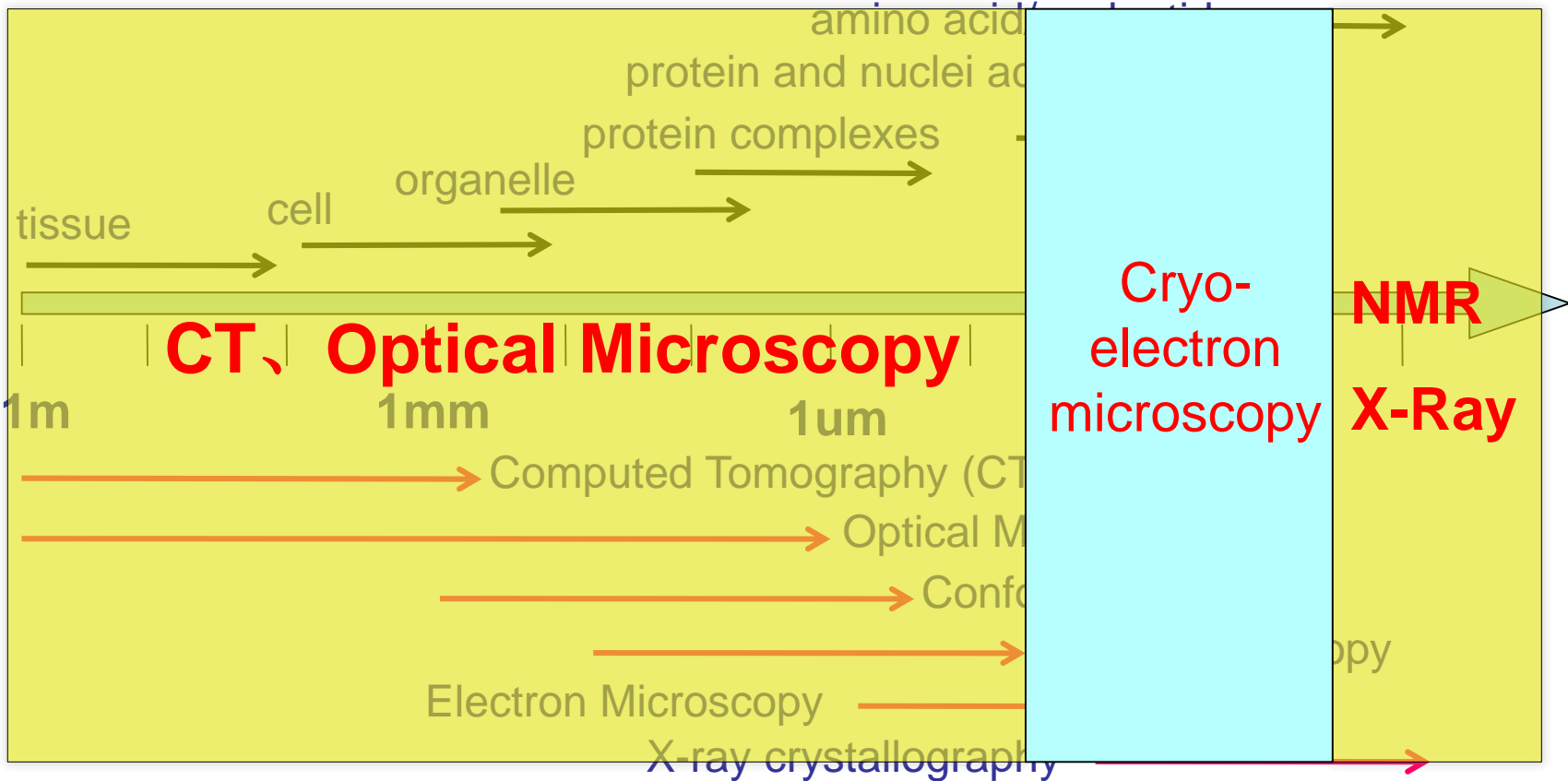
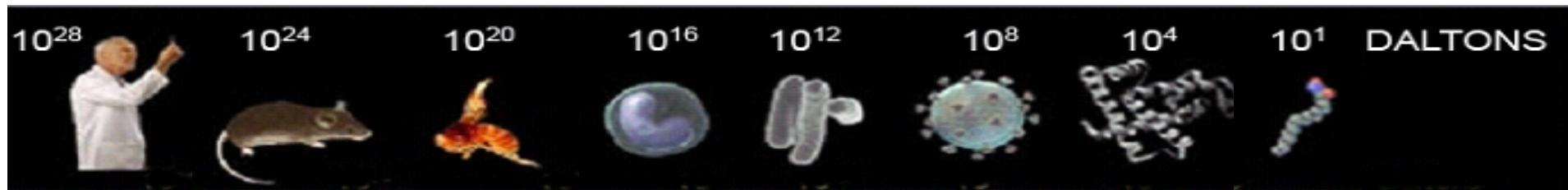
Microscopy and Scale

Background



Microscopy and Scale

Background

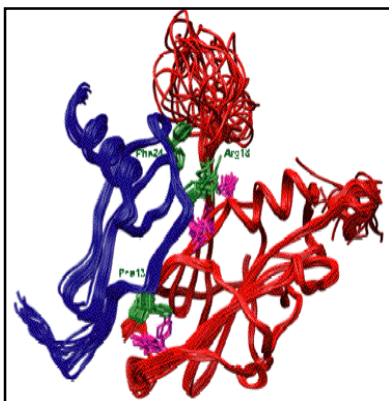


Methods for protein structures

Background

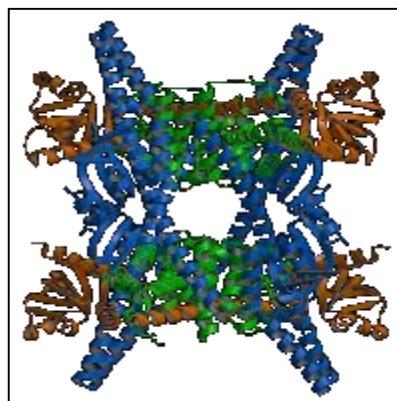
Protein Structures

NMR



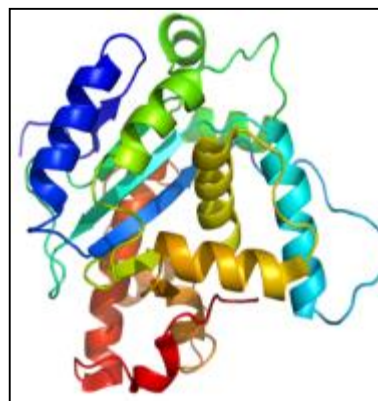
20kD

X-ray
crystallography



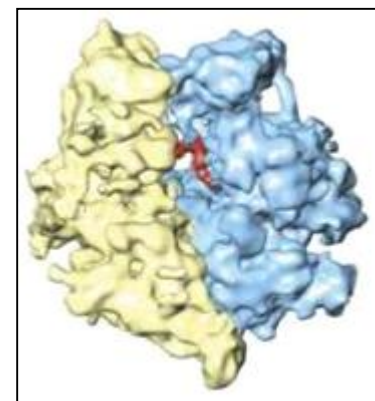
virus

Structure
Prediction



20kD

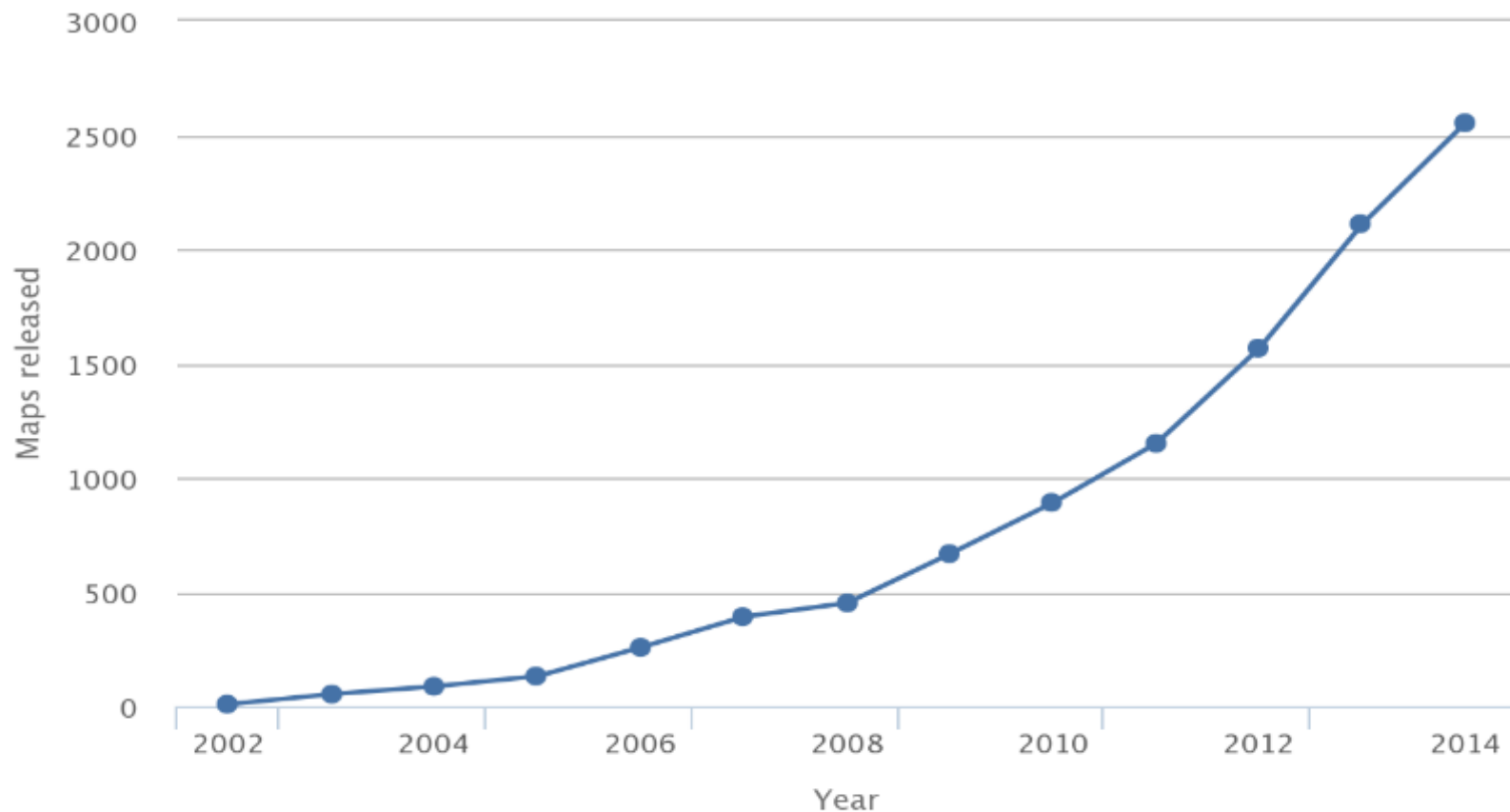
Electron
Microscopy



200kD

3D-EM Structures

Background

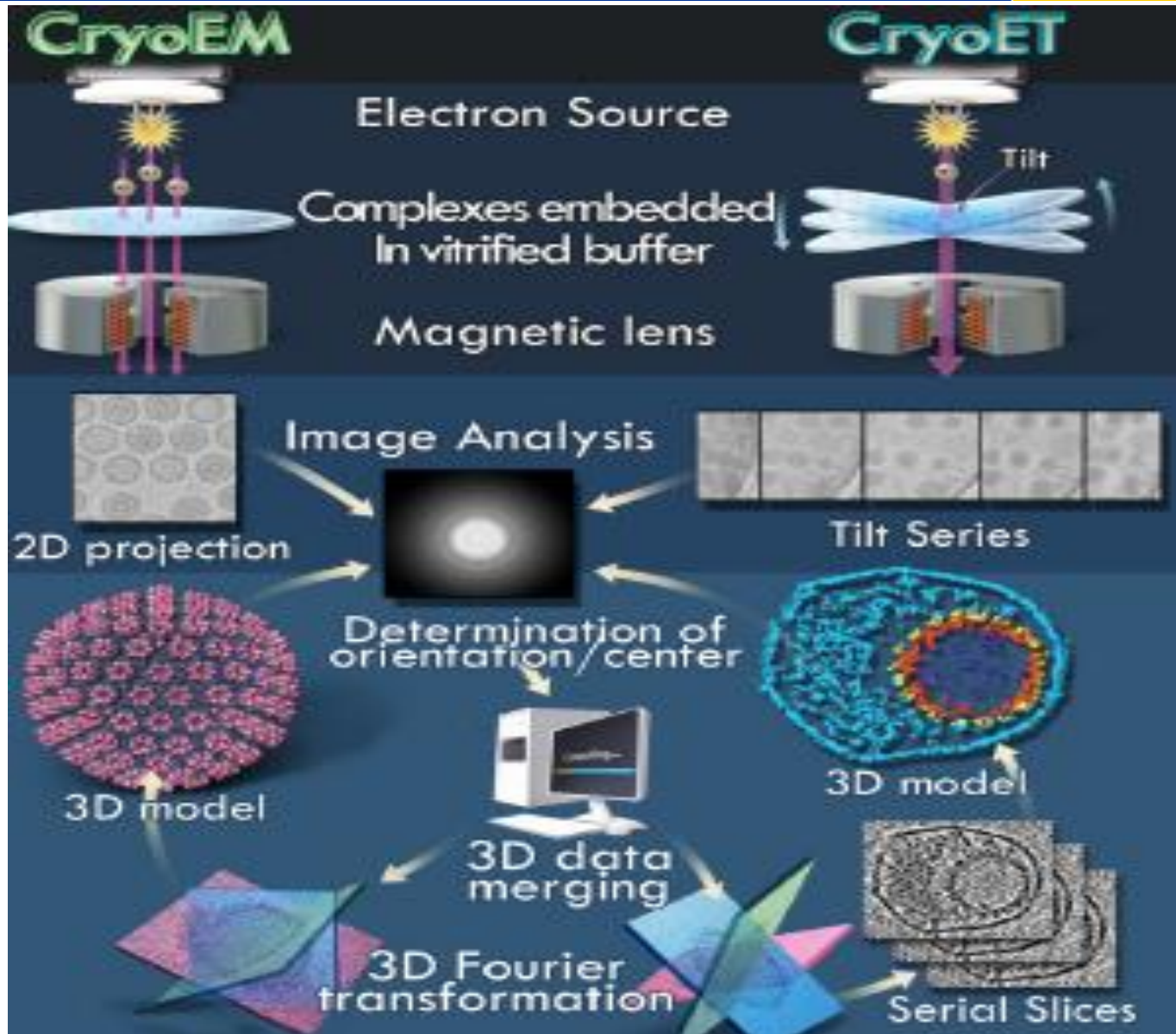


Electron Microscopy

Background

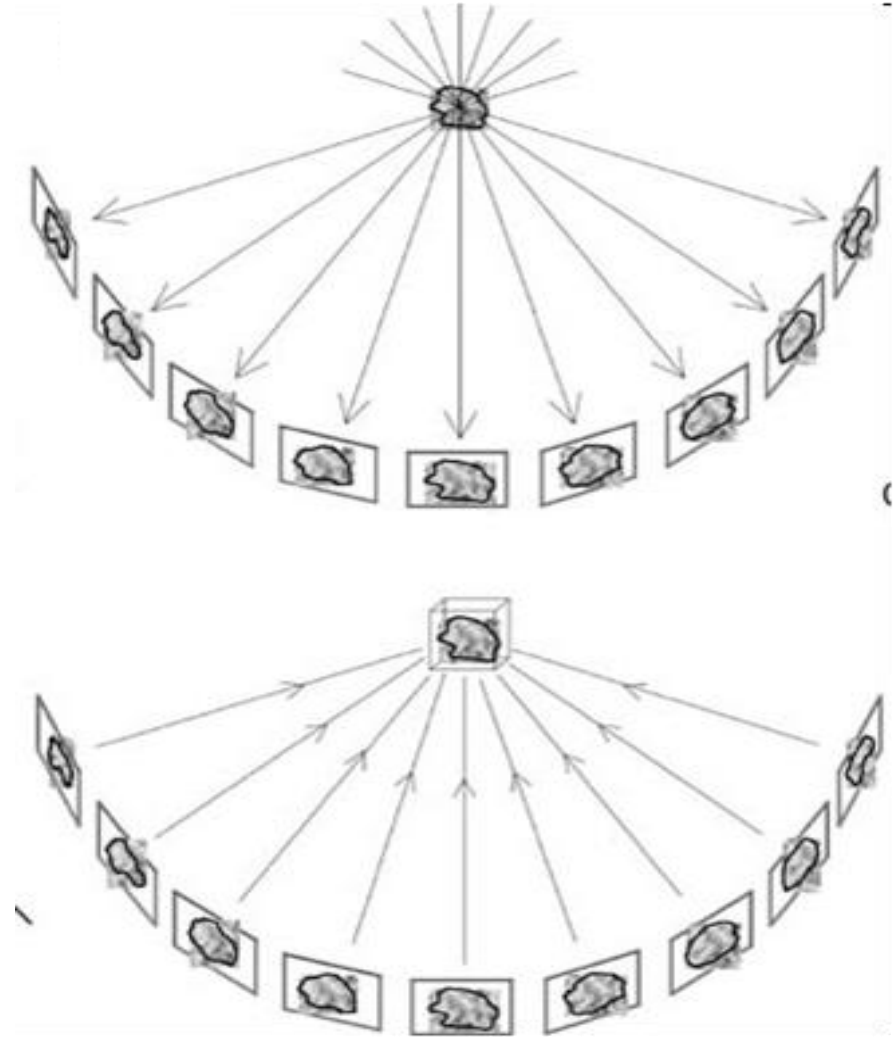
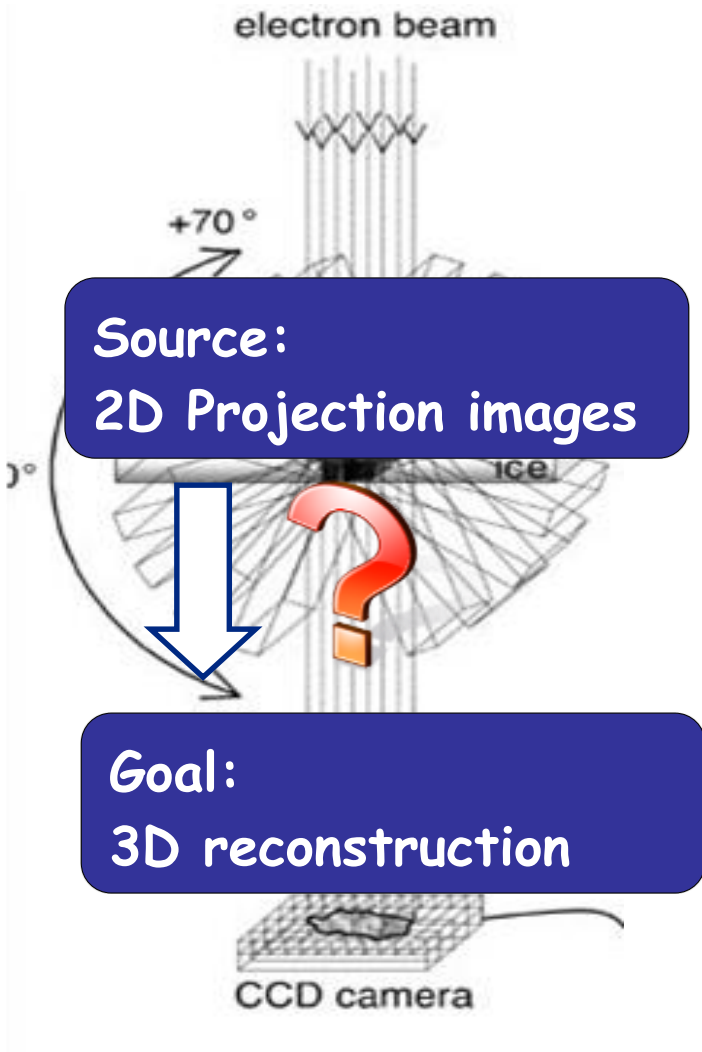
Single Particle

Electron Tomography



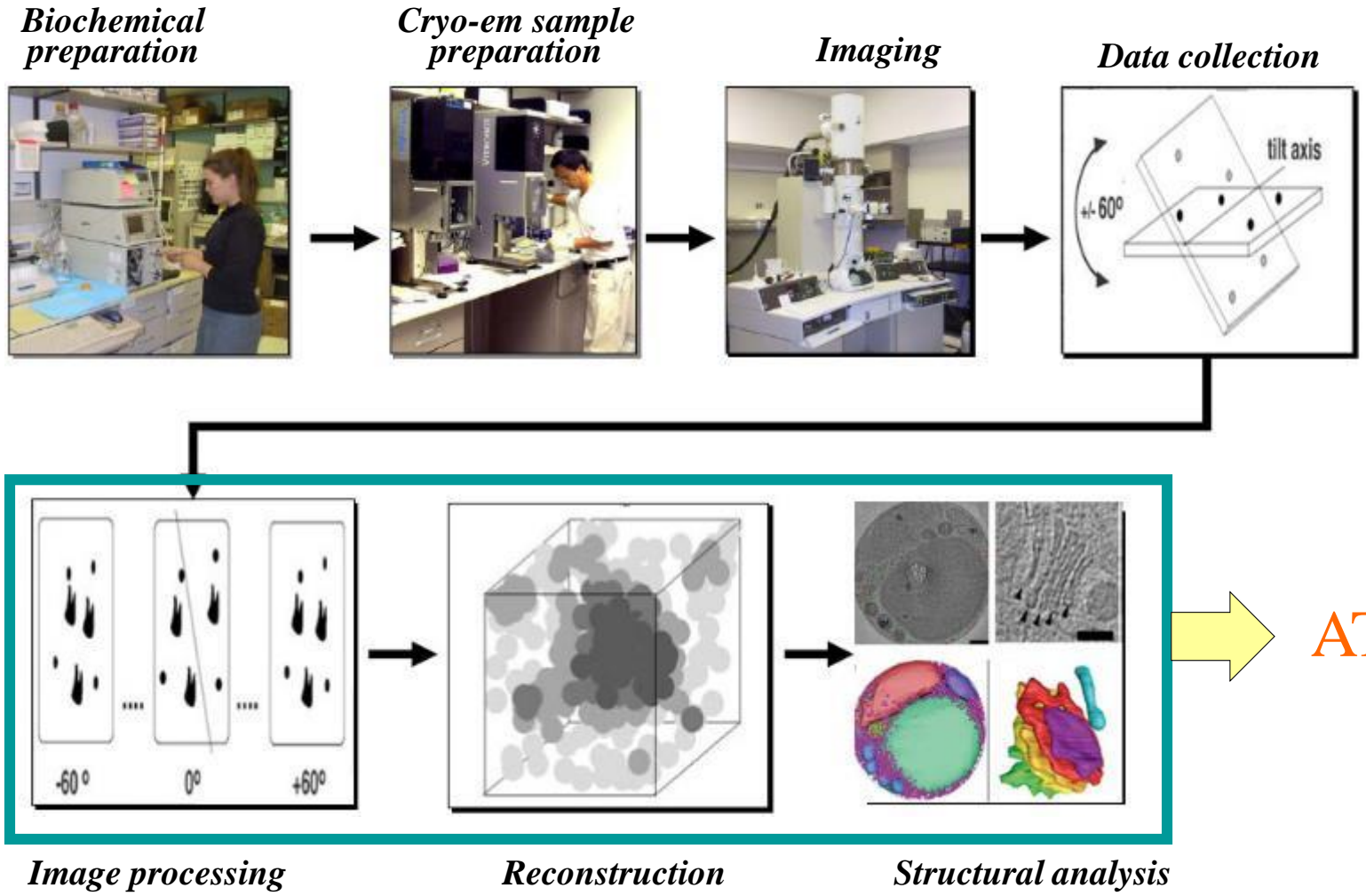
Electron Tomography (ET)

Background



Electron Tomography (ET)

Background



Outline

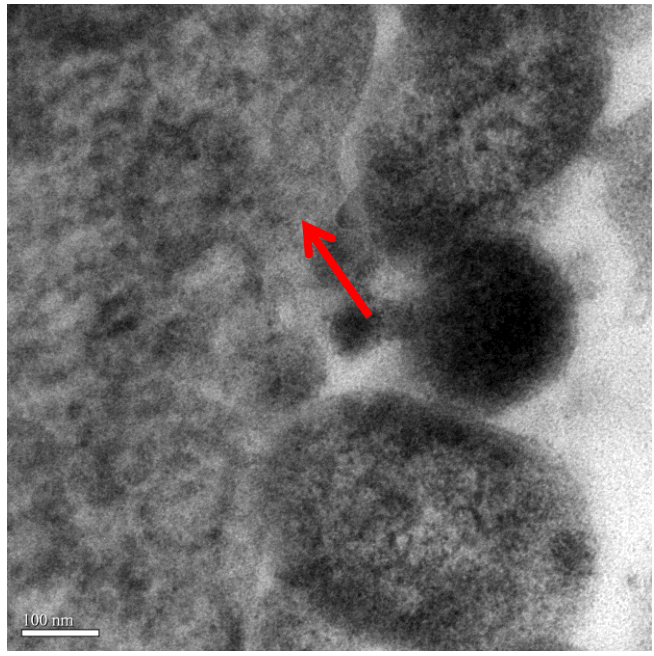
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Technical Problems in ET

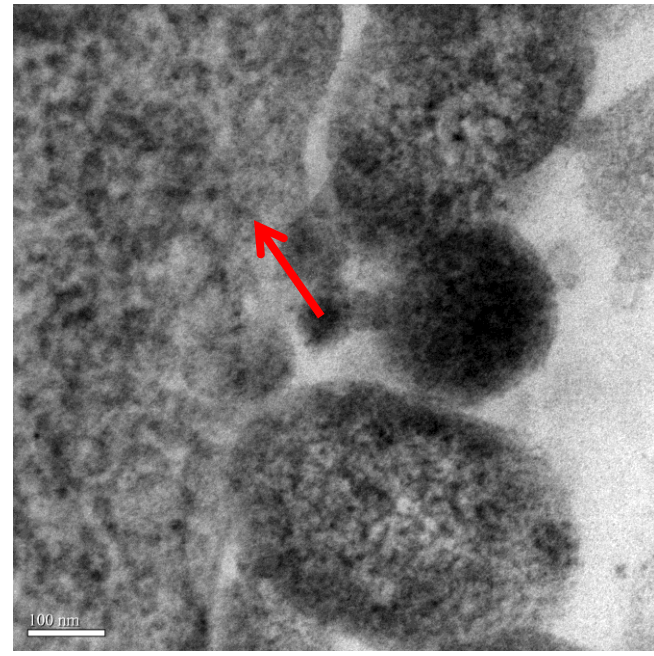
Problem

➤ **Noise (SNR < 0.1)**

Caveolae of PAE cell



-60 °

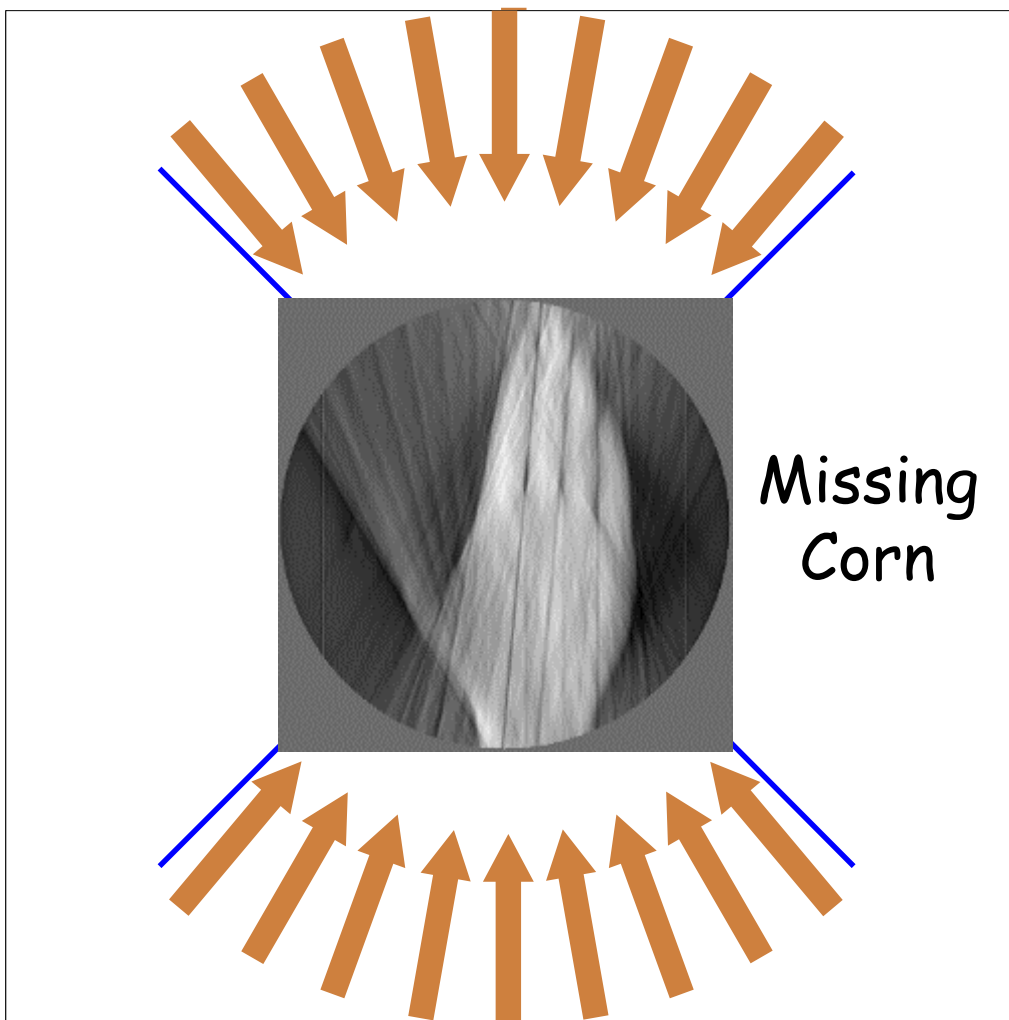
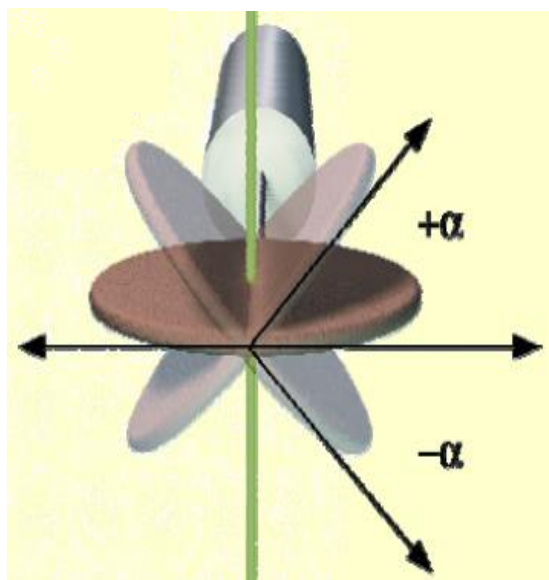


-50 °

Technical Problems in ET

Problem

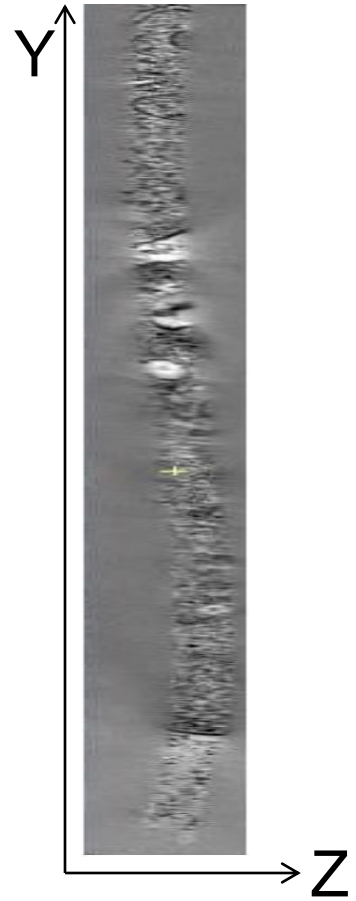
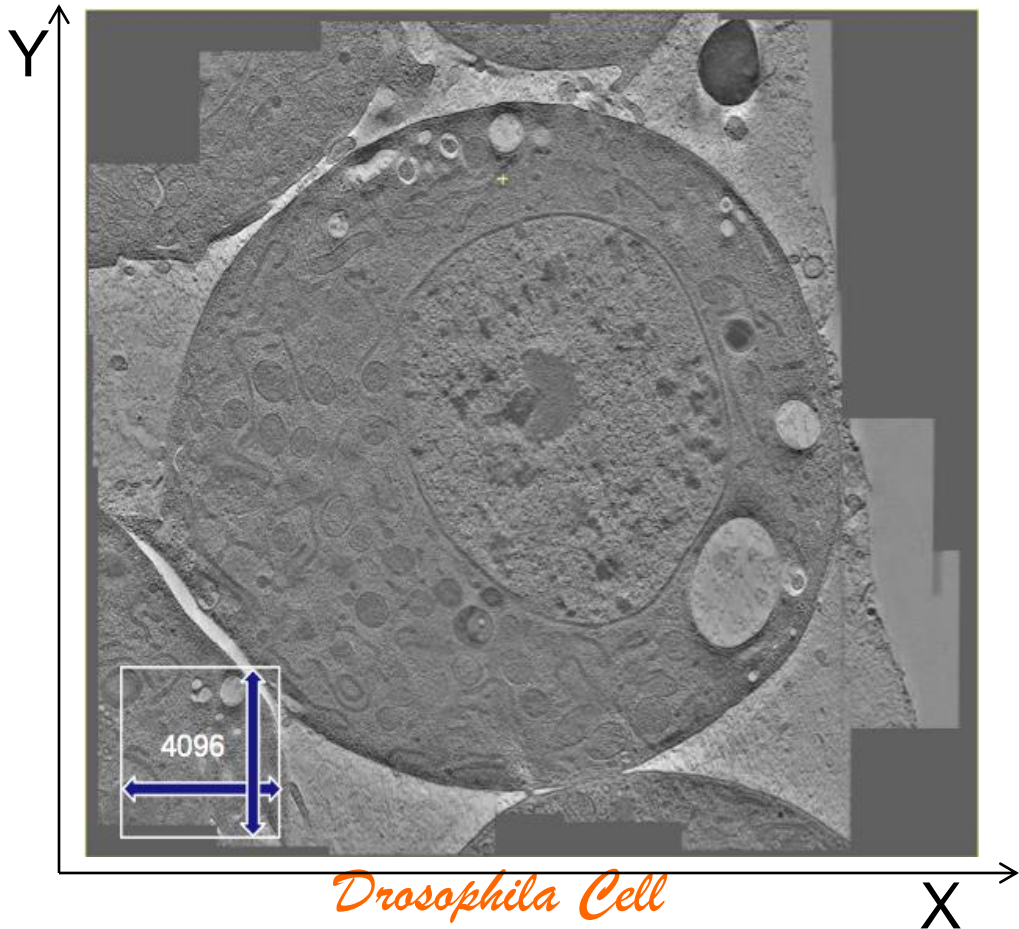
- **Noise**
- **Incomplete Data**



Technical Problems in ET

Problem

- Noise
- Incomplete Data
- Distortions in large-scale reconstruction



Technical Problems in ET

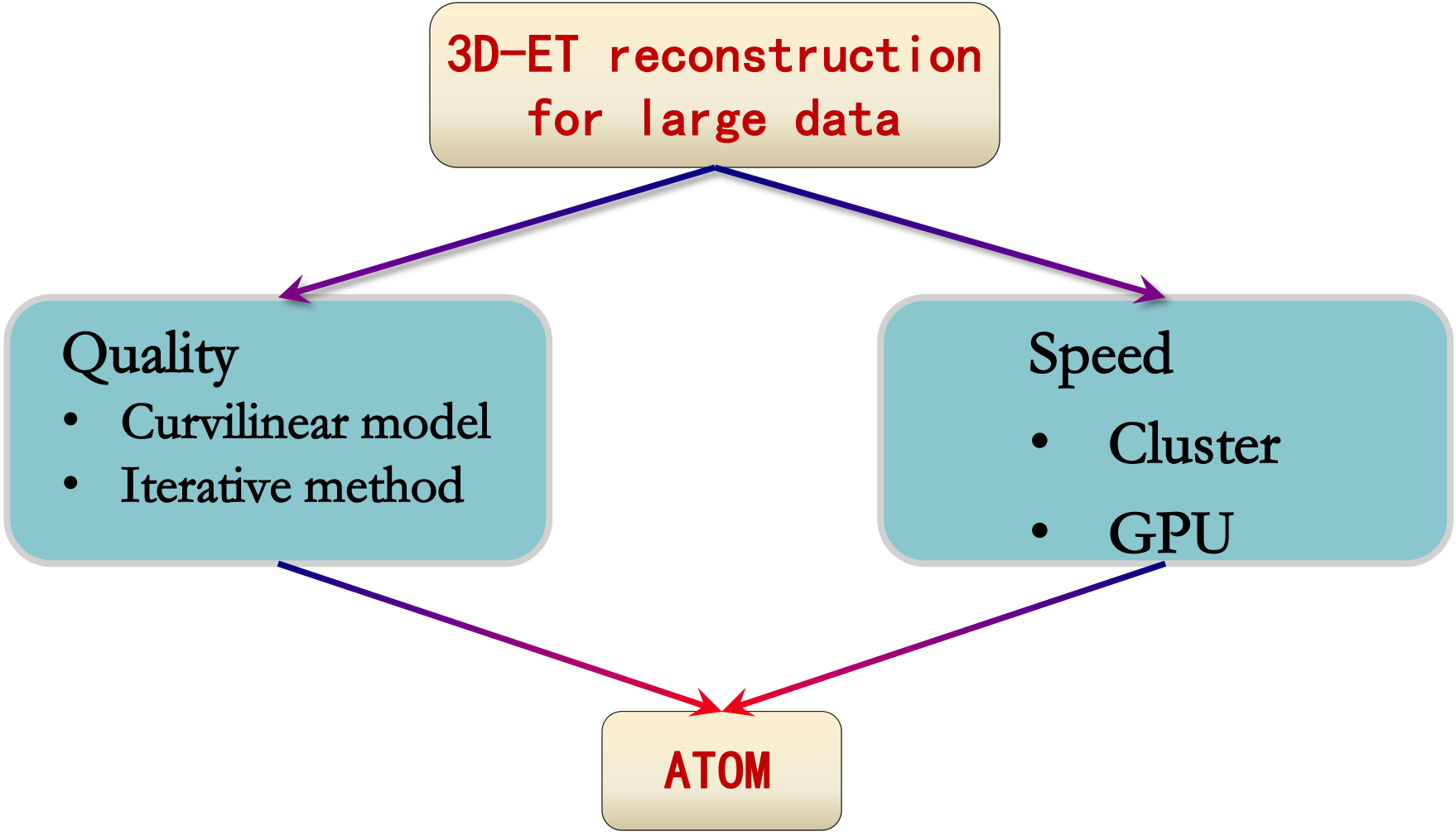
Problem

- **Noise**
- **Incomplete Data**
- **Distortions in large-scale reconstruction**
- **Large computational resources and processing time**
 - **8K*8K, TB**
 - **several months**
 - **an exascale computing problem**

Outline

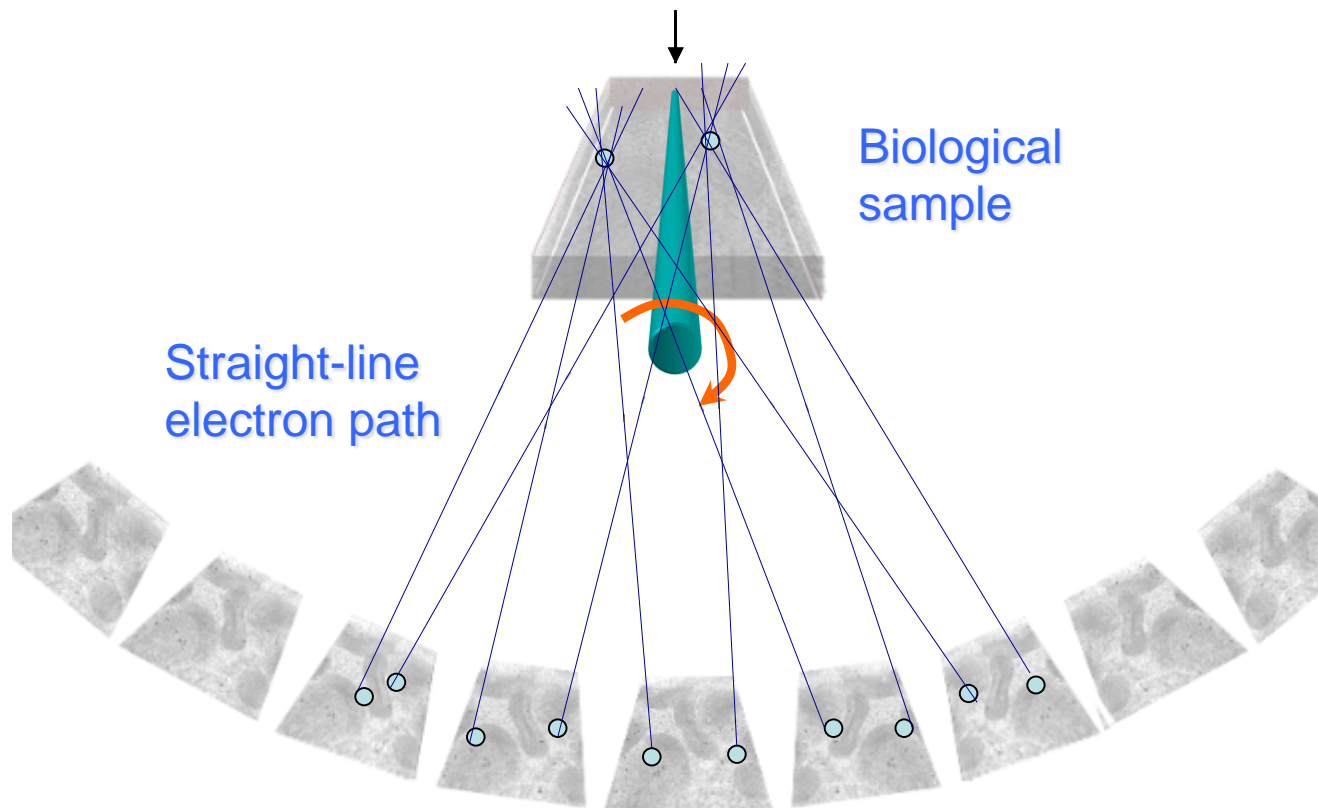
- Background
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- Future work

Our research



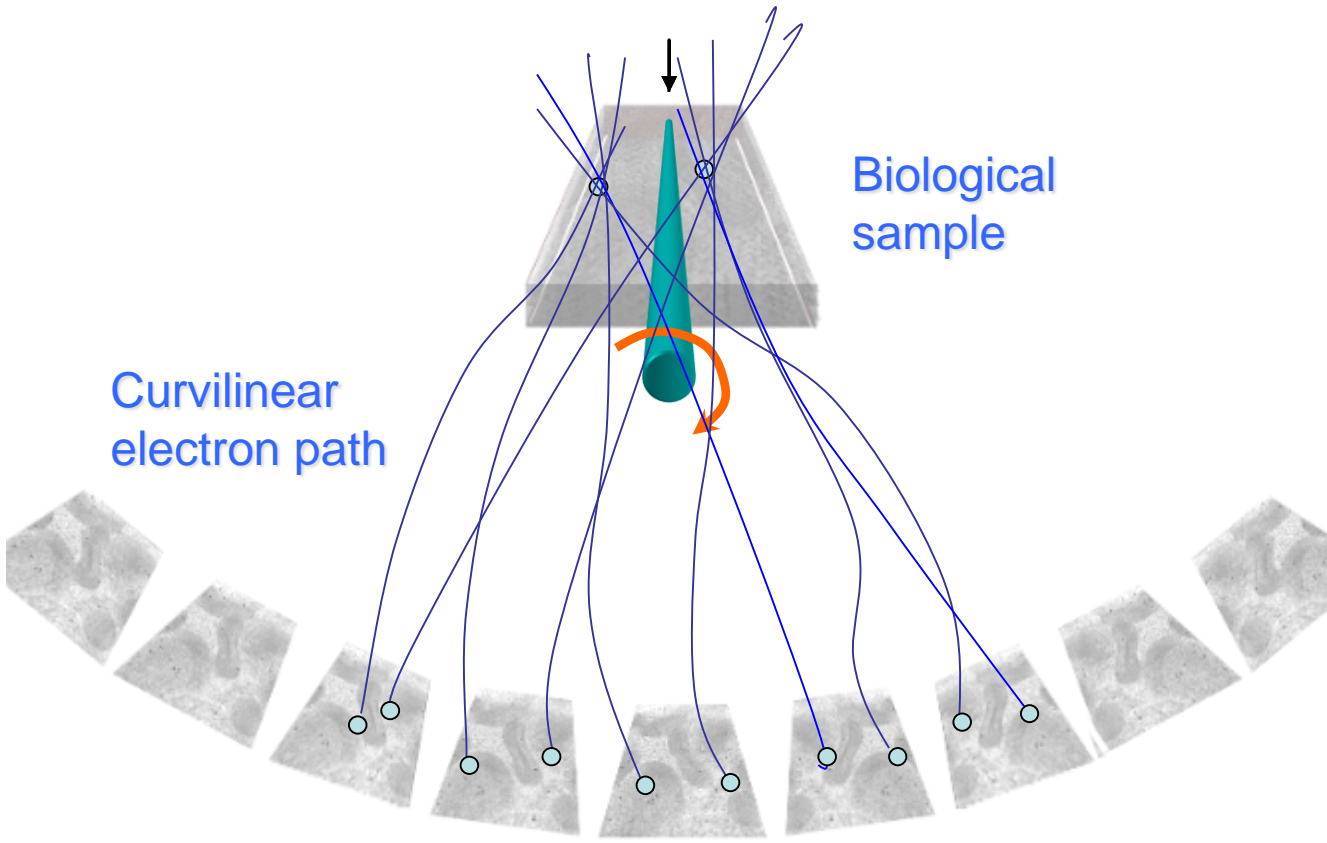
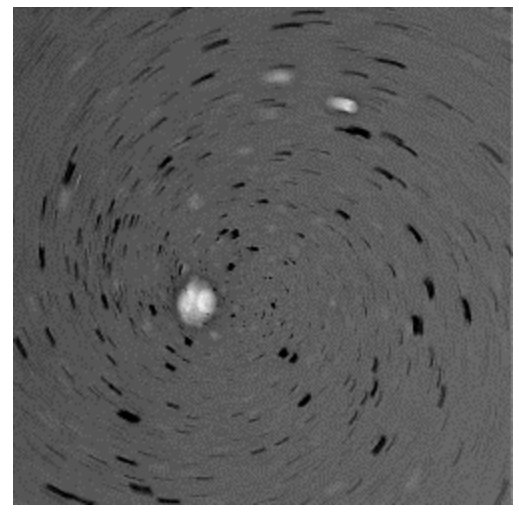
Our methods

■ Straight-line projection model



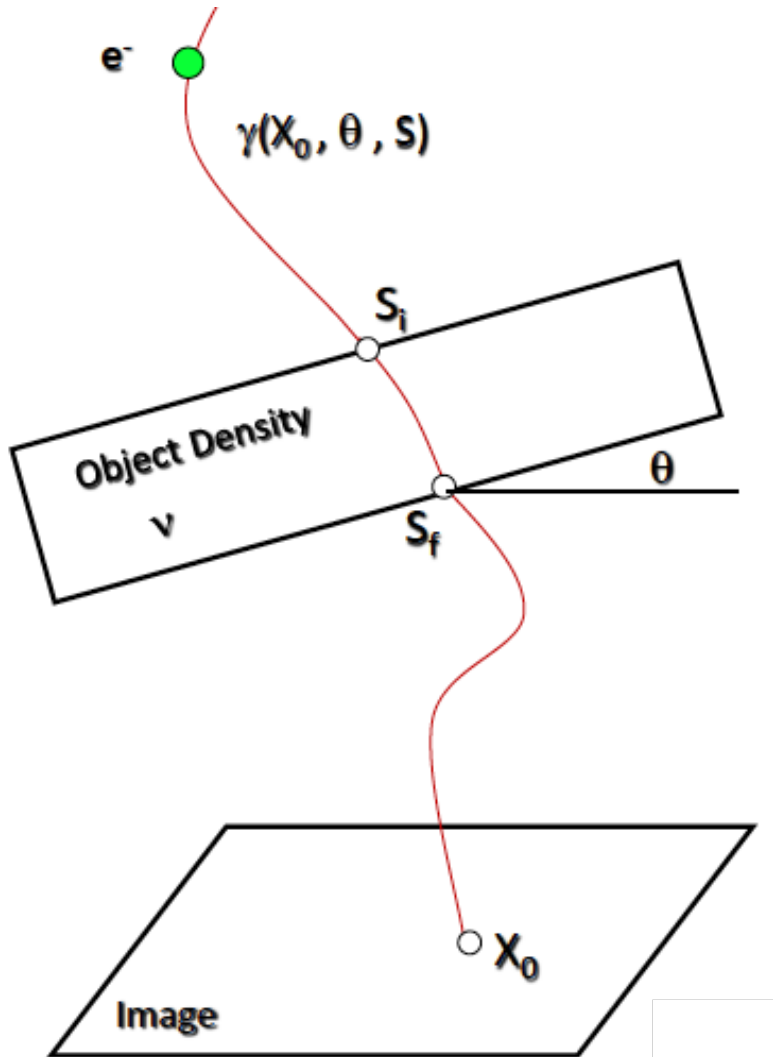
Our methods

■ Curvilinear projection model



Our methods

Curvilinear projection model



$$\Gamma = \{ \gamma_{x, \omega}(t) \mid t_0 \leq t \leq t_1 \}$$

$$I = I_0 e^{-\int_{t_0}^{t_1} u[\gamma_{x, \omega}(t)] dt}$$

Our methods

■ Generalized radon transform

$$R_{\Gamma}u(\mathbf{x}, \omega) \equiv v(\mathbf{x}, \omega) = \int_{t_0}^{t_1} u[\gamma_{\mathbf{x}, \omega}(t)] dt$$

■ Determination of the curves $\gamma_{\mathbf{x}, \omega}(t)$



Projection map:

$$P_{\omega}(\gamma_{\mathbf{x}, \omega}^1(t), \gamma_{\mathbf{x}, \omega}^2(t), \gamma_{\mathbf{x}, \omega}^3(t)) = (x_1, x_2)$$

Our methods

■ Reconstruction

$$R_G u(C, q) \circ v(C, q) = \int_{t_0}^{t_1} u[g_{C,q}(t)] dt \implies u(X) = R_\Gamma^{-1} v(\mathbf{x})$$

■ Two reconstruction methods:

- Filter Backprojection (FBP) (easy)
- Iterative methods (noisy+incomplete data)

Our methods

- ASART based on a curvilinear projection map
 - Initial value (BPT and FBP)
 - Modified multilevel scheme for data access
 - Adaptive adjustment for relaxation parameters
 - Curvilinear projection map

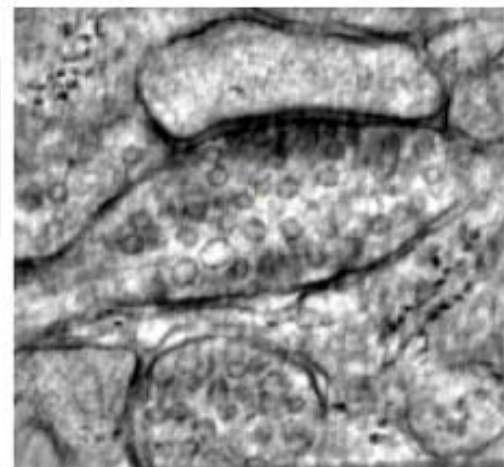
$$\begin{cases} u_j^{(0)} = \frac{\sum_{i=1}^M w_{ij} v_i(P_b(j))}{\sum_{i=1}^M w_{ij}} \\ u_j^{(k+1)} = u_j^k + \sum_{s=1}^S \frac{\lambda w_{ij} u_j^{(k)}}{\sum_{s=1}^S w_{ij} \sum_{h=1}^N w_{ih} u_h^{(k)}} (v_i(P_b(j)) - \sum_{h=1}^N w_{ih} u_h^{(k)}) \end{cases}$$

Results

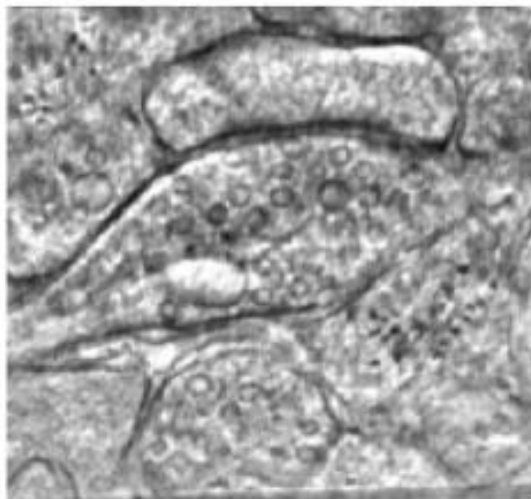


FBP + curvilinear projection map

There is a distortion because of the straight-line projection model.



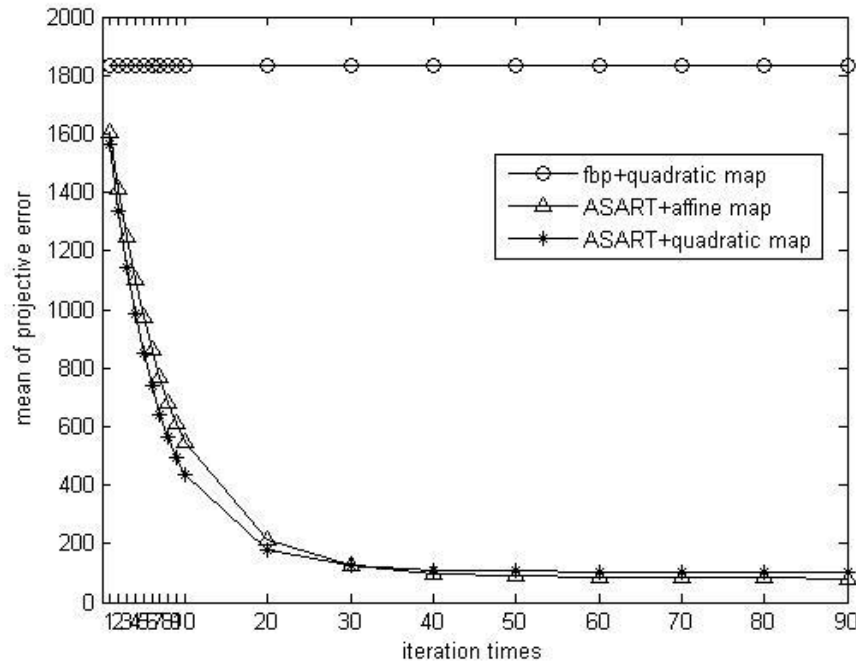
ASART + straight projection map



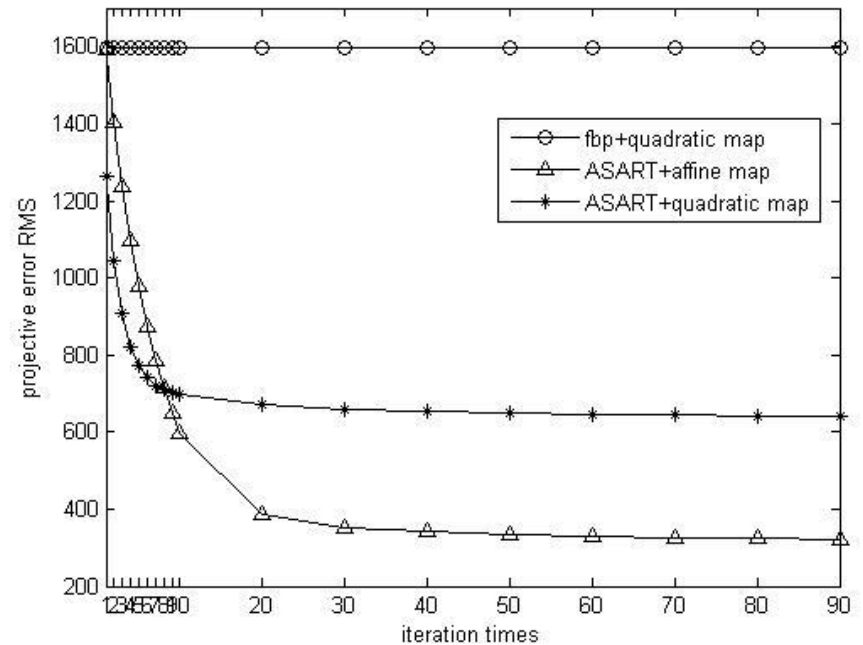
ASART + curvilinear projection map

There is no distortion because of the curvilinear projection model.

Results



Mean of projection error

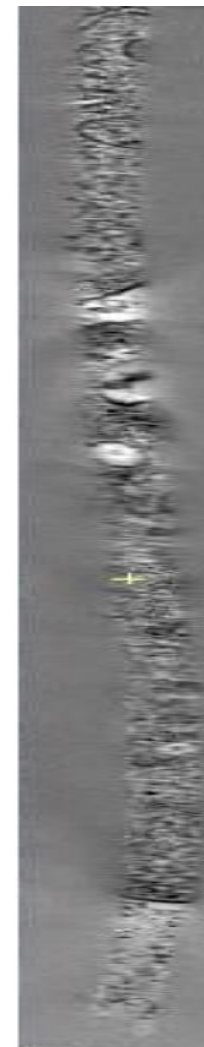
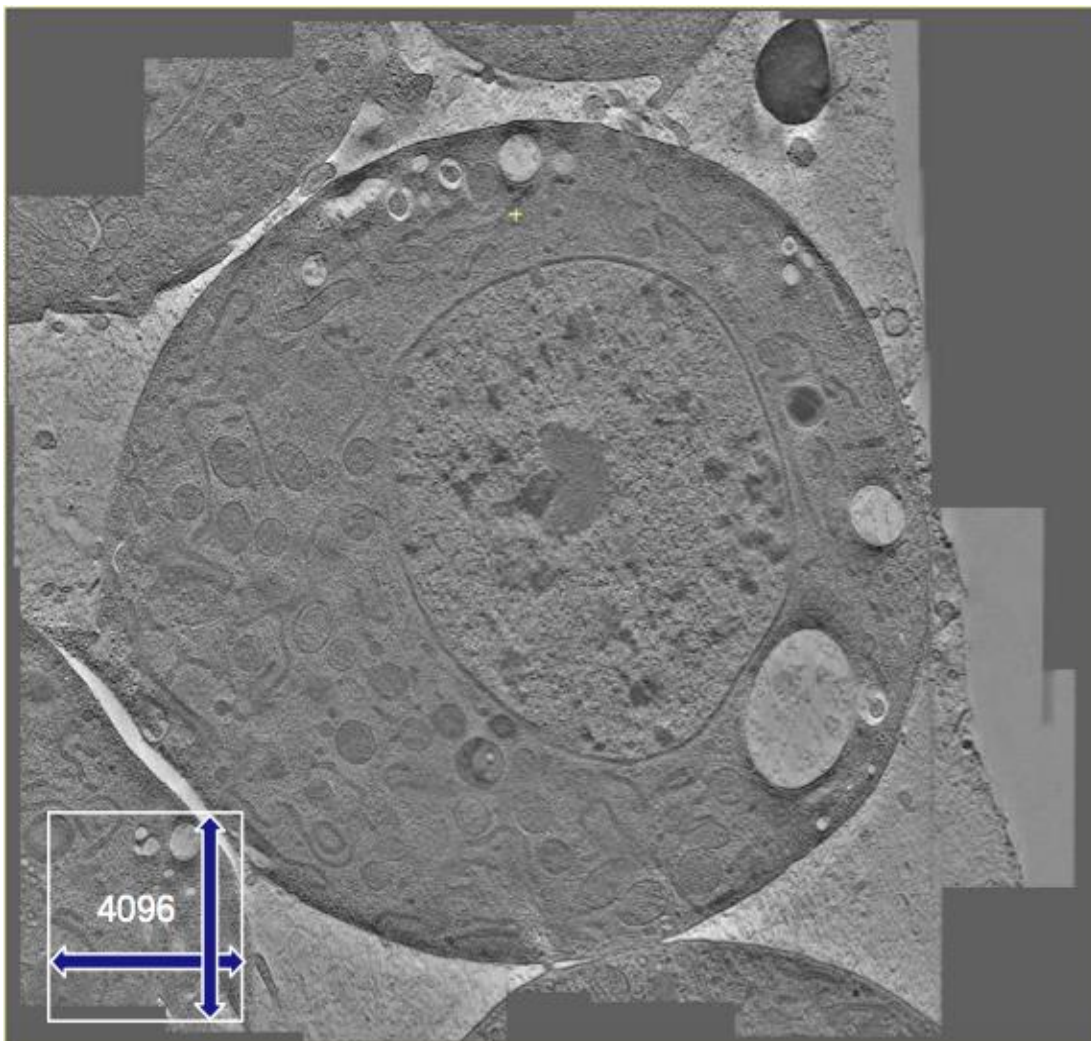


RMS of projection error

Xiaohua Wan, Sebastien Phan, Albert Lawrence, Fa Zhang, Renmin Han, Zhiyong Liu, Mark Ellisman. "Iterative Methods in Large Field Electron Microscope Tomography". **SIAM Journal on Scientific Computing**, 35(5).

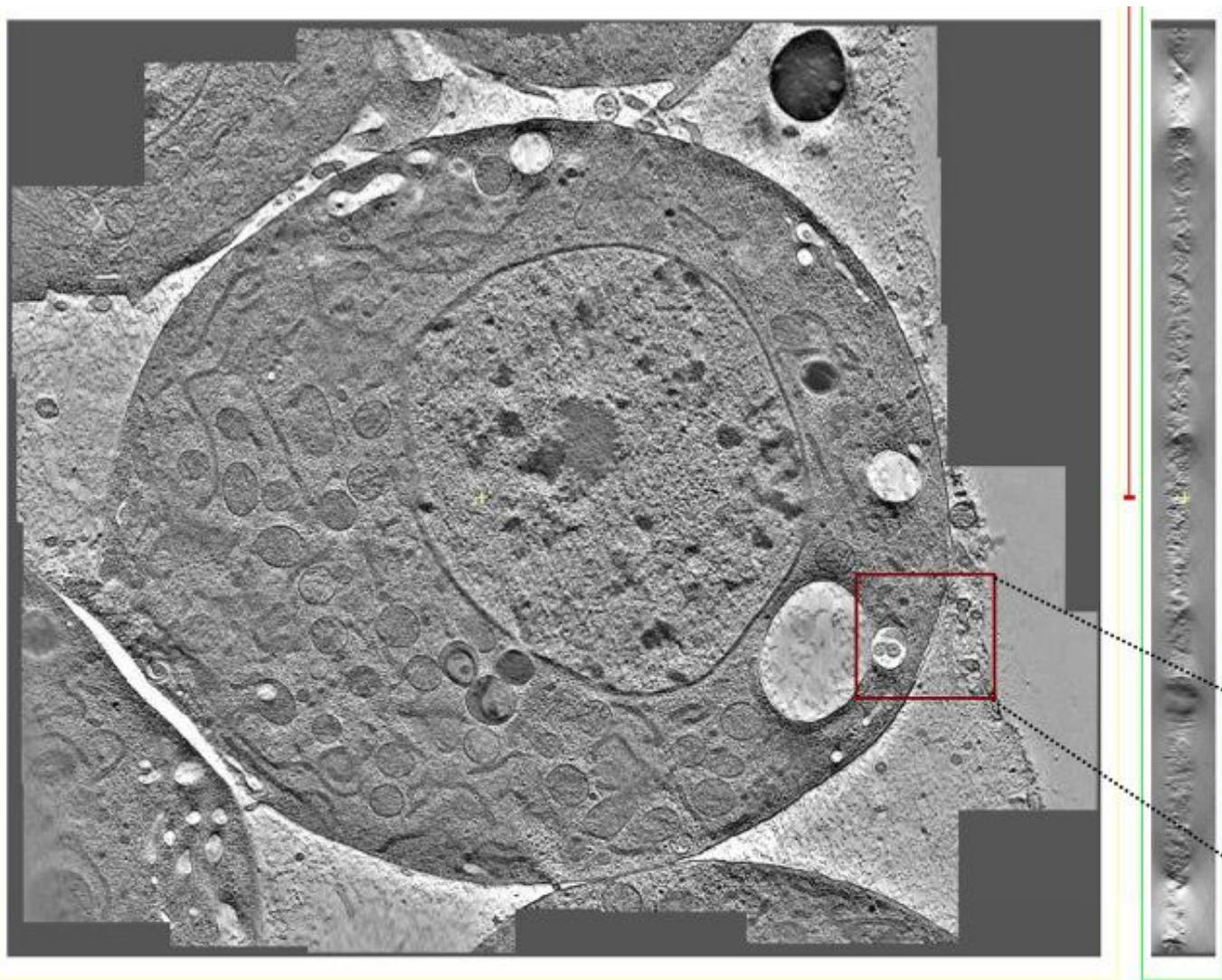
Results

➤ Straight-line projection model+FBP



Results

➤ Curvilinear projection model+ASART

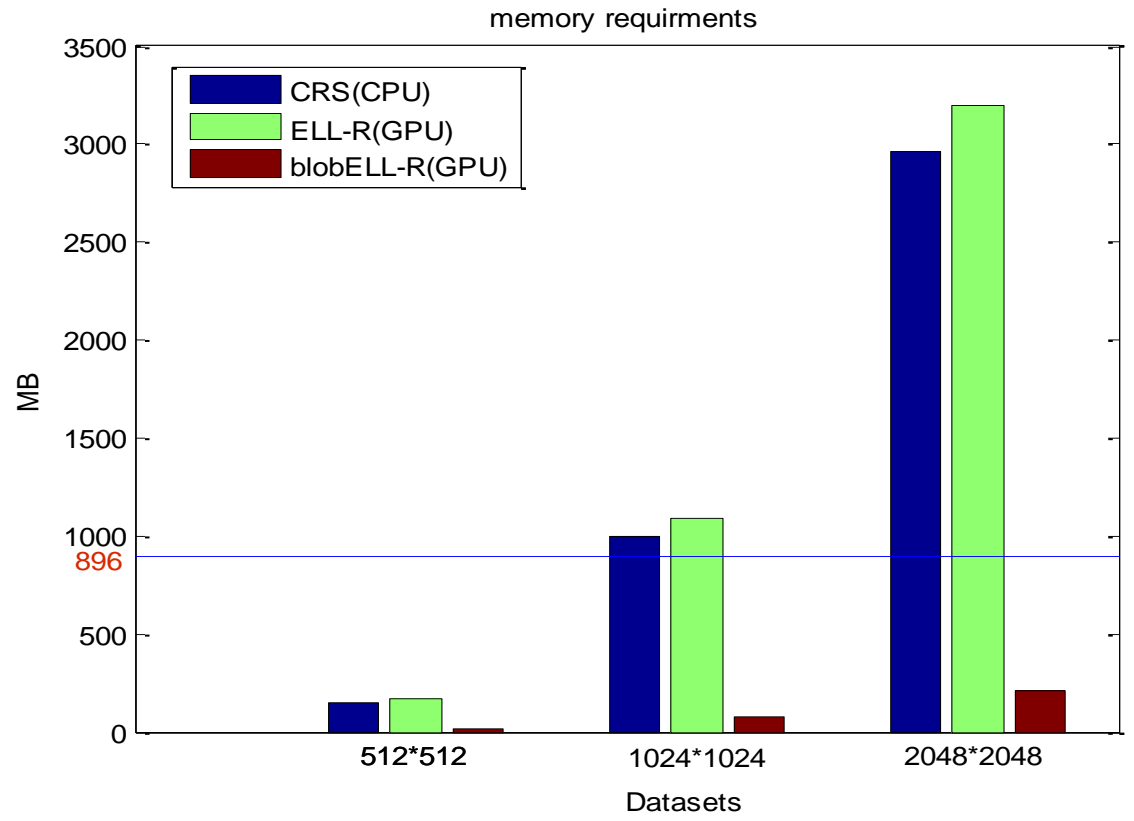


Our methods

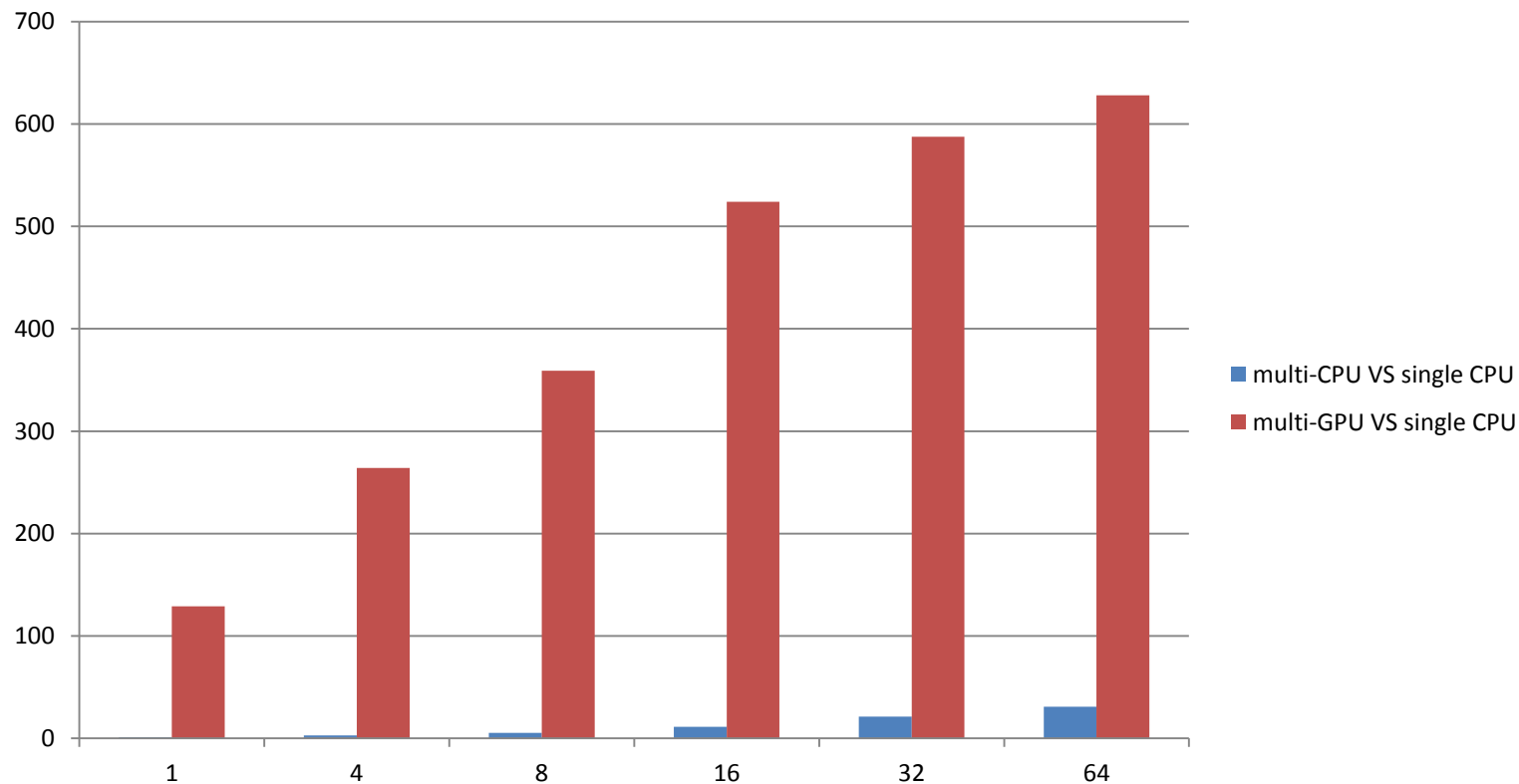
- Parallel strategy for iterative reconstructions
 - Decomposition of reconstruction into independent slabs along Z-axis
 - Computing the polynomials of each X-line in parallel
 - Blob-ELLR

Results

➤ Blob-ELLR

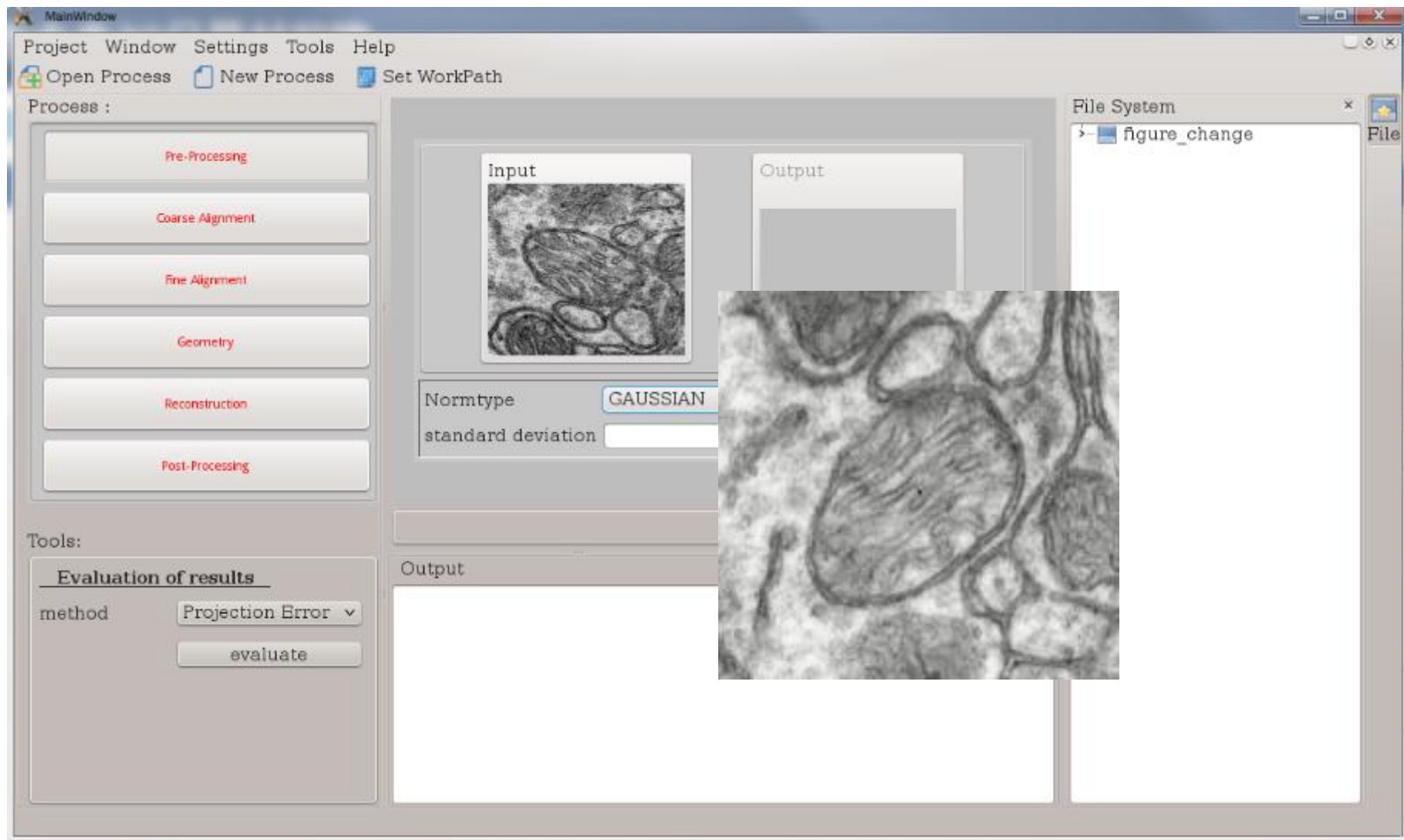


Results



node num	1	4	8	16	32	64
multi-CPU	1	2.8	5.5	11.2	21.2	30.9
multi-GPU	128.9	264	359	524	587.6	627.9

Results – ATOM

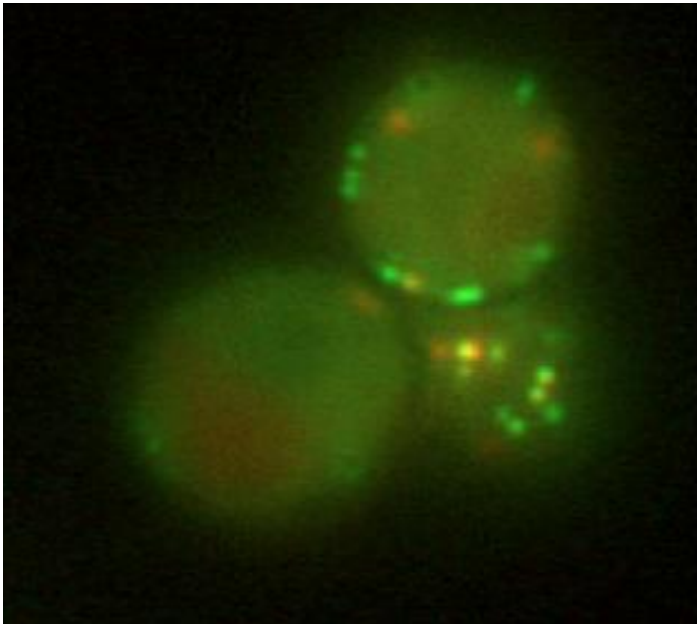


Outline

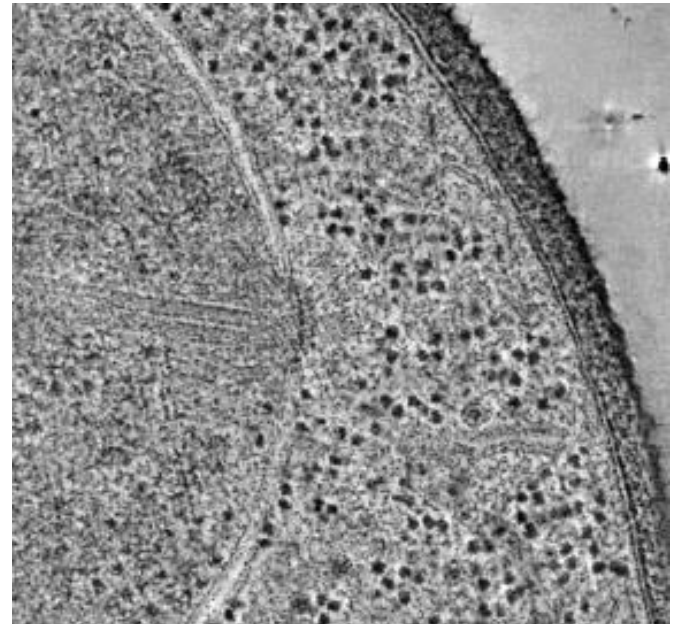
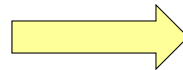
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Future work

- Large-scale Electron Tomography
- How to combine light microscopy and electron microscopy
 - ❖ New techniques in fluorescence microscopy allow us to label specific biological molecules for light microscopy and then stain for electron microscopy.



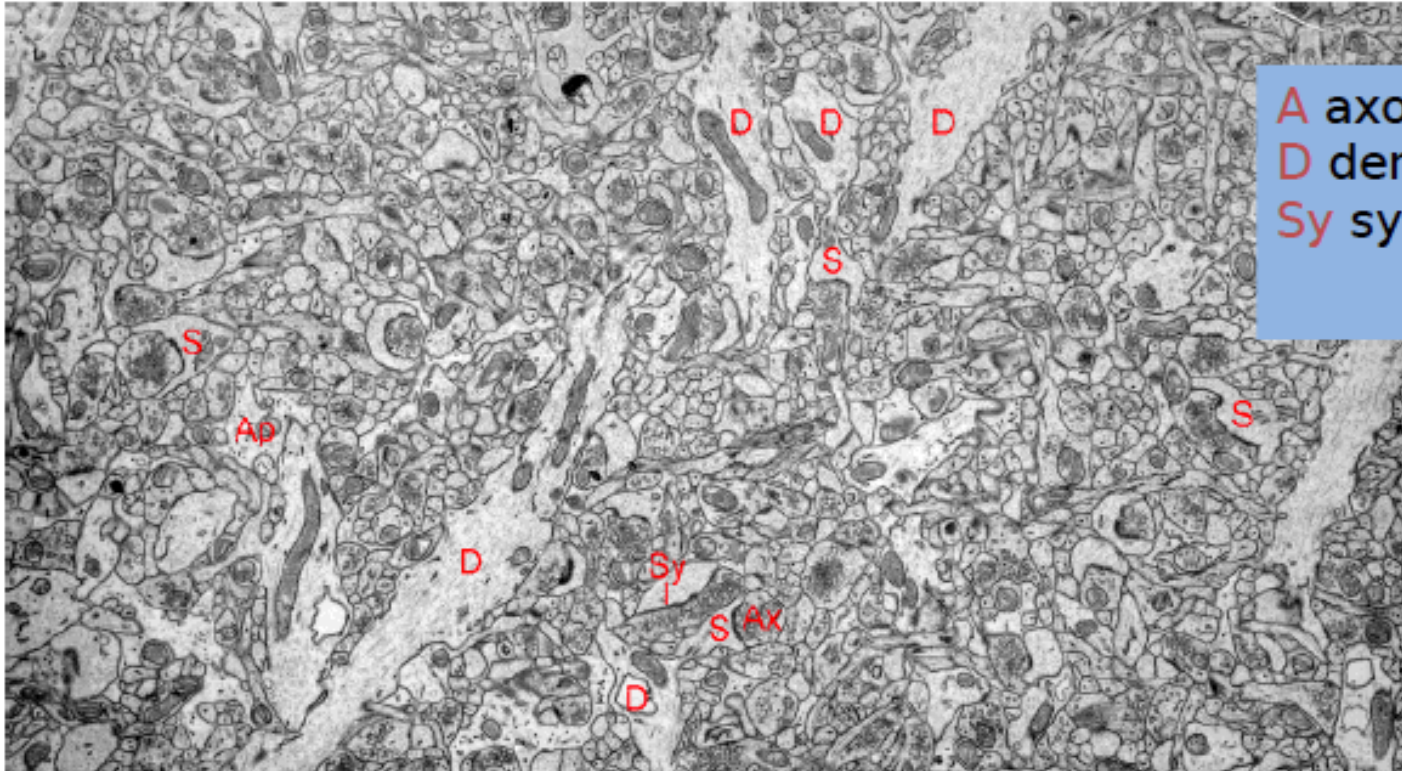
Fluorescence Microscopy



Electron Microscopy

Future work

➤ Large-scale Electron Tomography



A axons
D dendrites
Sy synapses

Thin section of neuropil
(How we look at the brain)

Acknowledgements

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NCB (Spain)

- Dr. Jose-Jesus

Fernandez

