

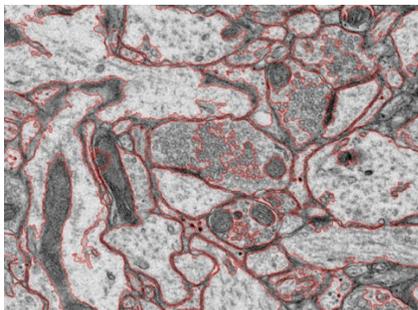
Geometric Modeling and Visualization

<http://www.cs.utexas.edu/~bajaj/cs384R07/>

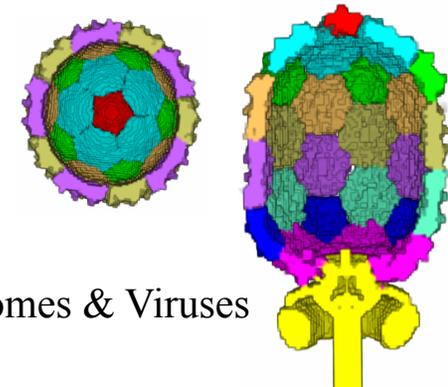
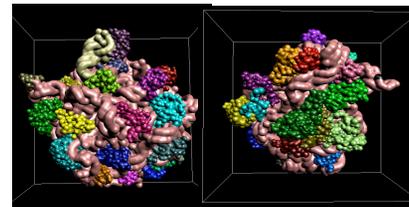
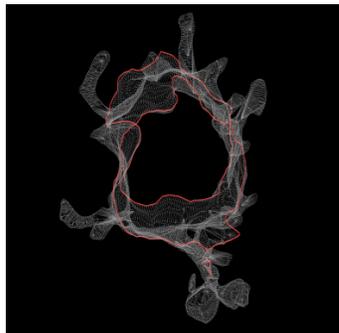
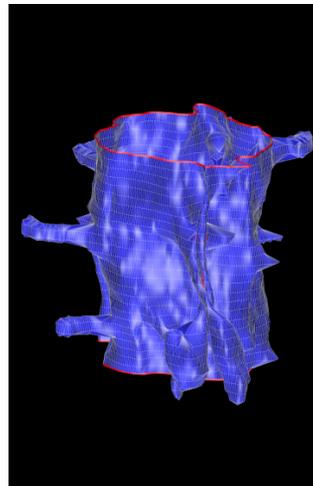
T, TH 9:30 – 10:45pm

Taylor 3.114

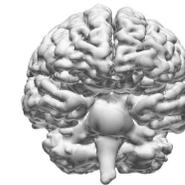
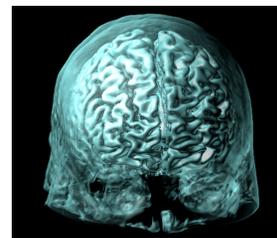
➤ Spatially realistic modeling to simulate and visually depict “How THINGS WORK” at multiple scales



Neuronal Processes



Ribosomes & Viruses



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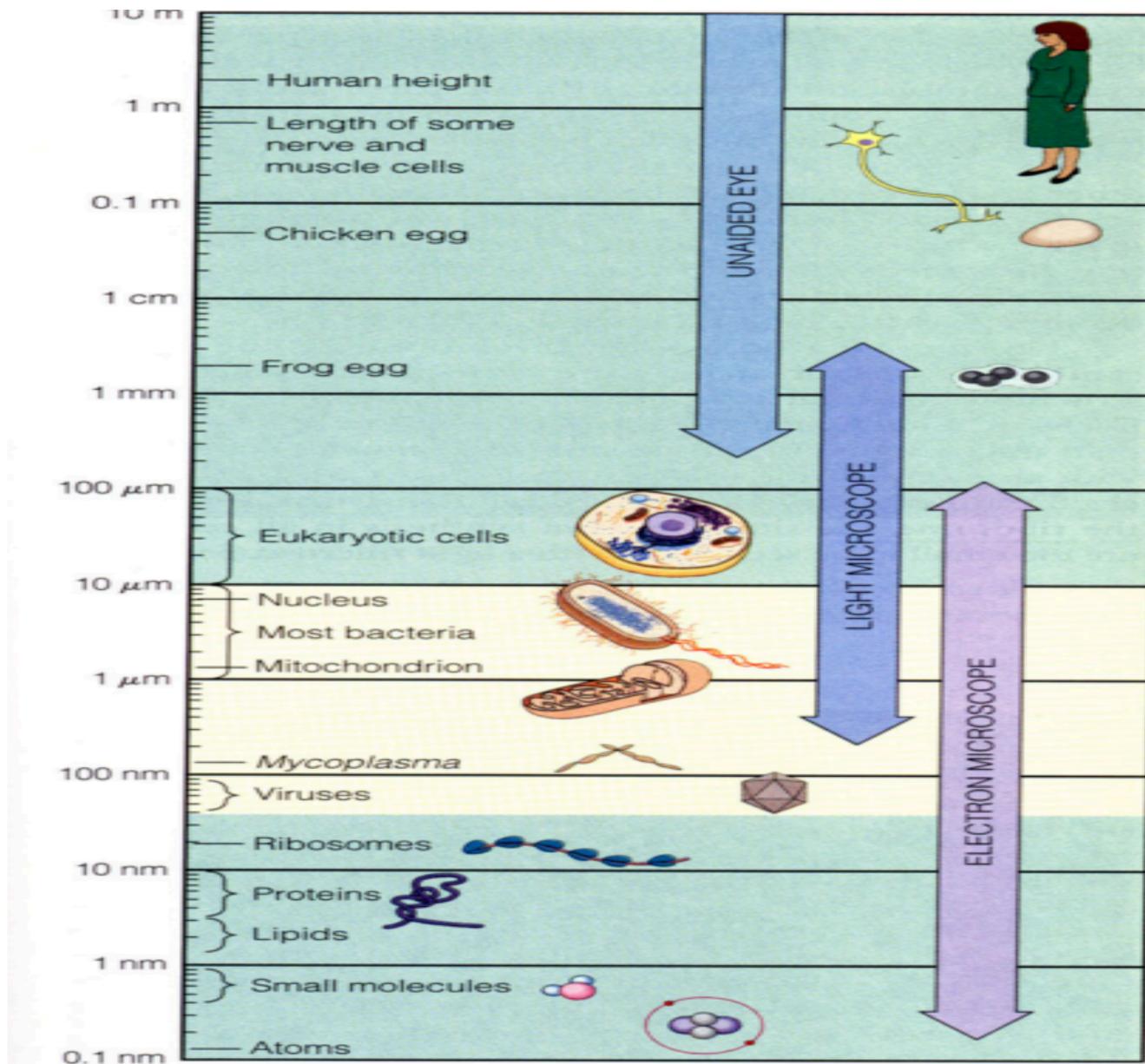
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CS384R/CAM395T/BME385J

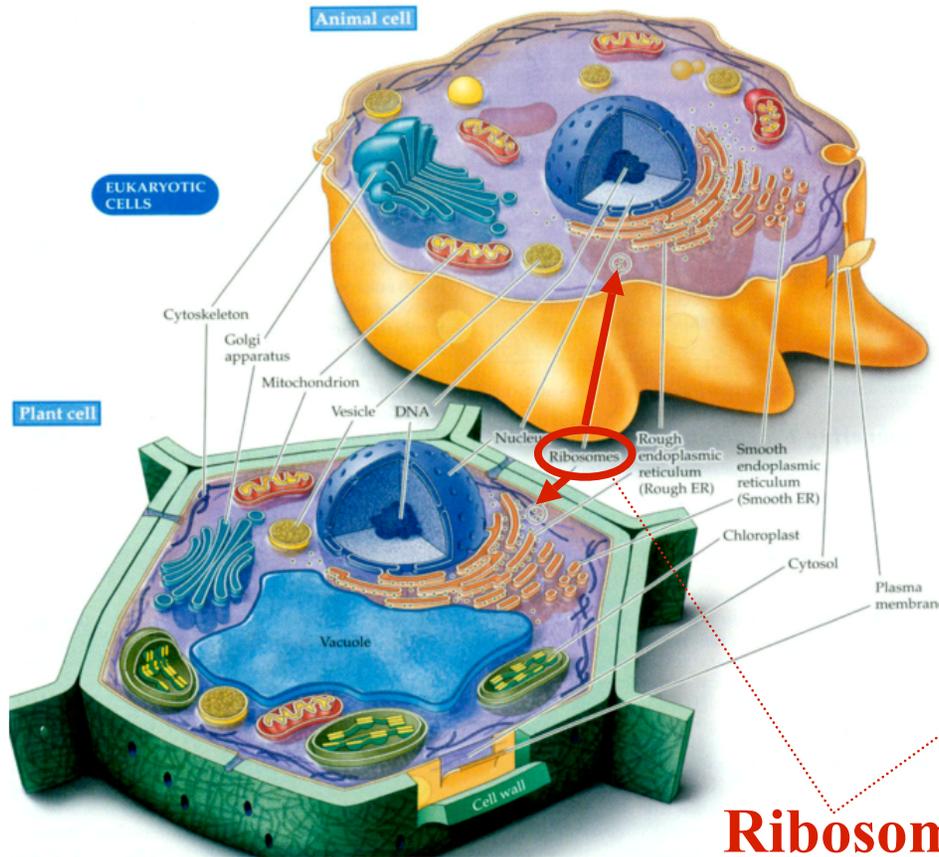
1. Imaging2Models: filtering, contrast enhancement, classification, symmetry detection, segmentation, skeletonization, subunit identification, matching, compression, reconstruction
2. Models2Analytics I: surfaces, finite element meshing, spline representations, feature identification, symmetry detection, shape segmentation, matching & complementary docking, flexibility, fluids
3. Models2Analytics II: polar and non-polar energetics, forces, torques, dynamics, cubature, discrete differential operators, sparsifiers, preconditioners
4. Analytics2Informatics I: differential/integral/combinatorial properties, active sites, regions of interest, MACT analysis
5. Analytics2Informatics II: multi-dimensional transfer functions, visible surface and volume rendering, function on surface, VisPortal



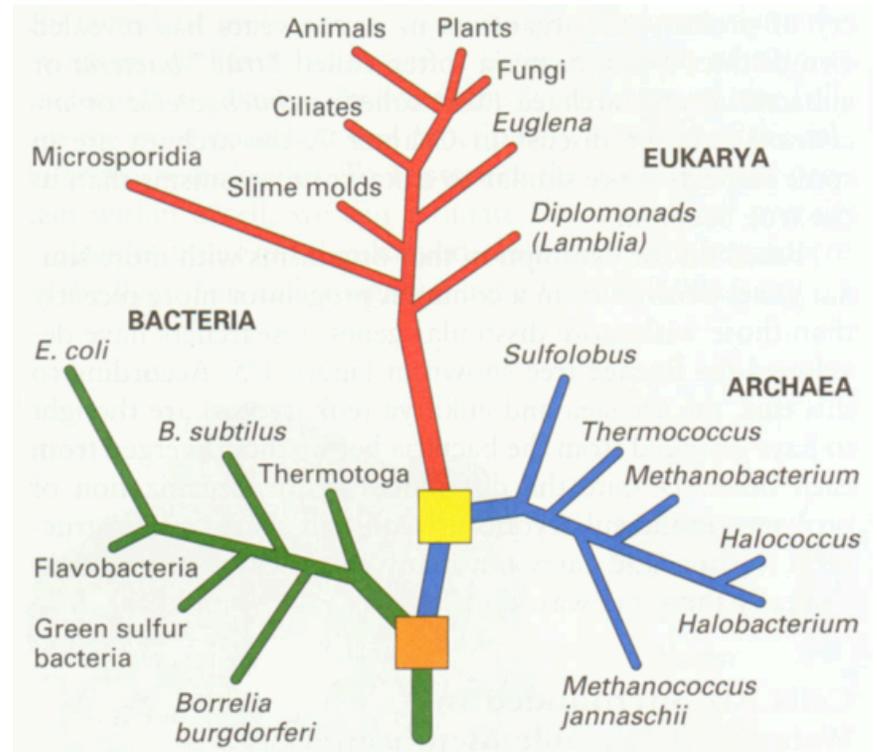


The Tree of Life?

Eukaryotic cell

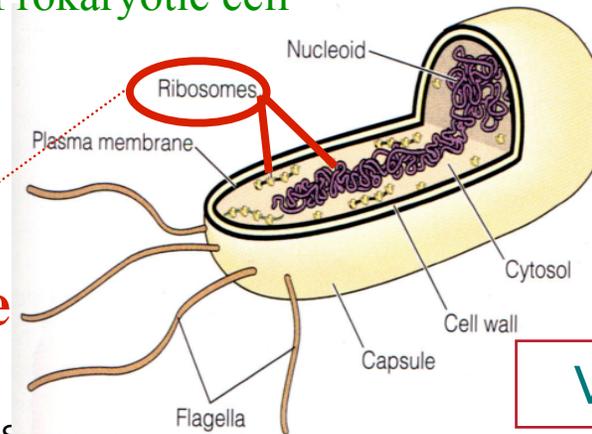


Ribosome



Archaeobacteria cell

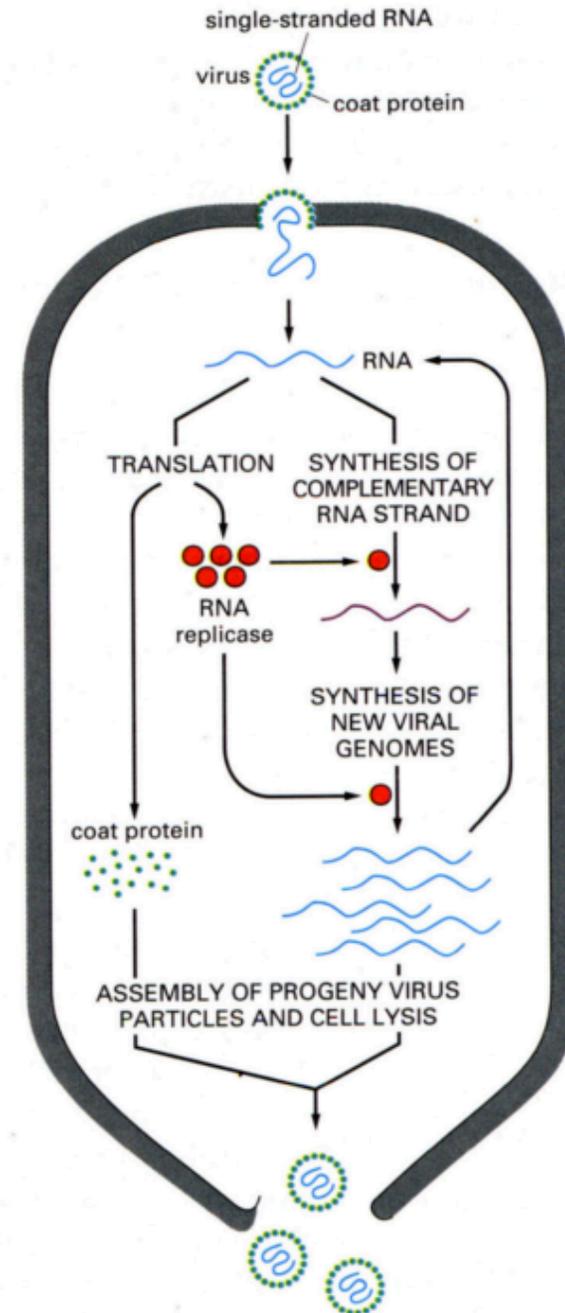
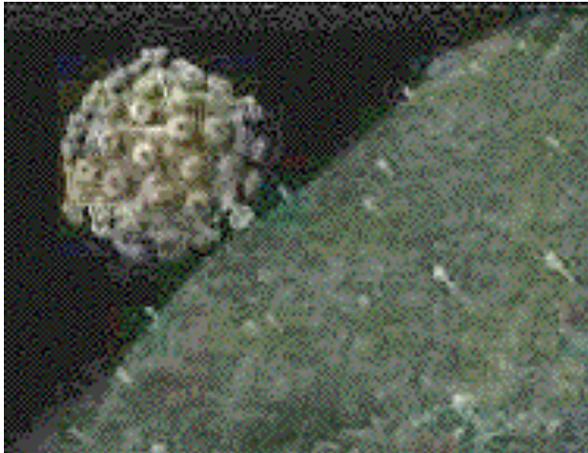
Prokaryotic cell



Viruses?



The Life Cycle of Viruses



Imaging2Models

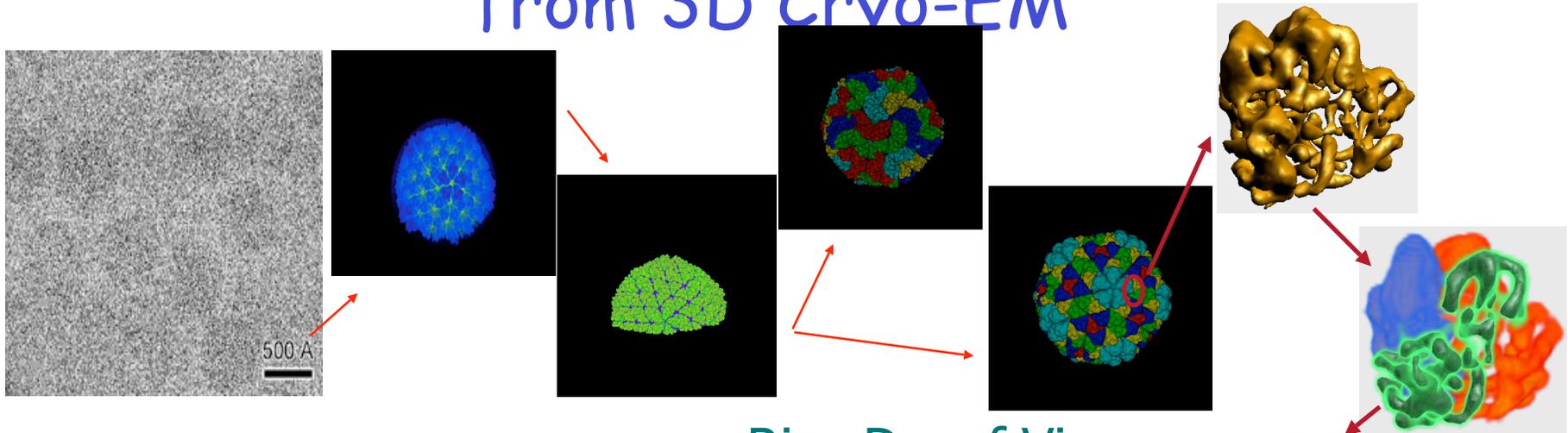


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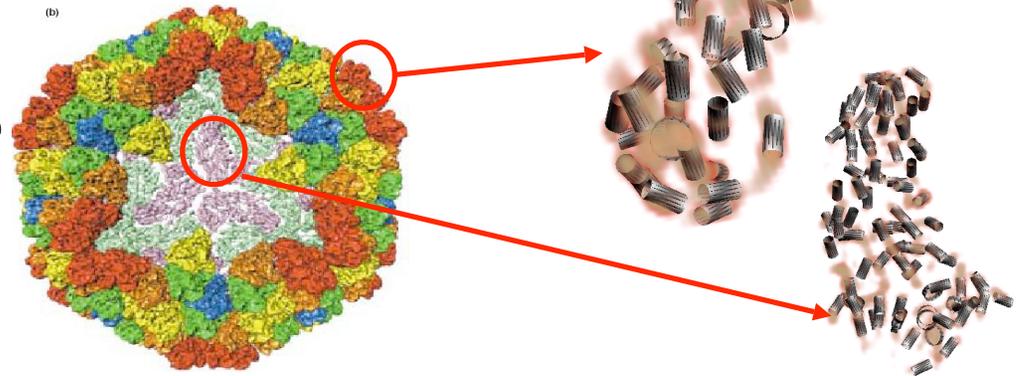
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Sub-nanometer Structure Elucidation from 3D Cryo-EM



Cryo-EM → FFT based 3D
Reconstruction
→ Anisotropic and Vector
Diffusion Filtering →
Structure Segmentation
→ Quasi-Atomic Modeling

Rice Dwarf Virus



**Sponsored by NSF, TRM



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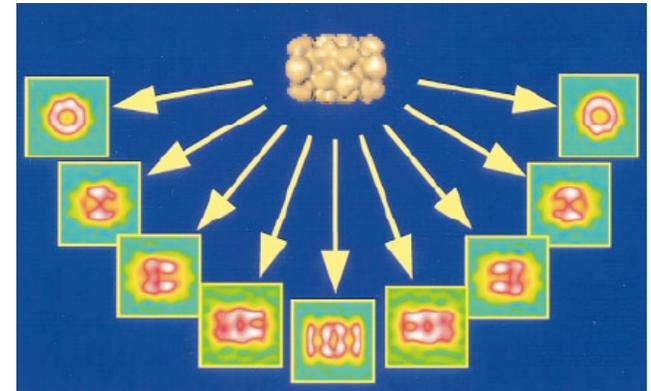
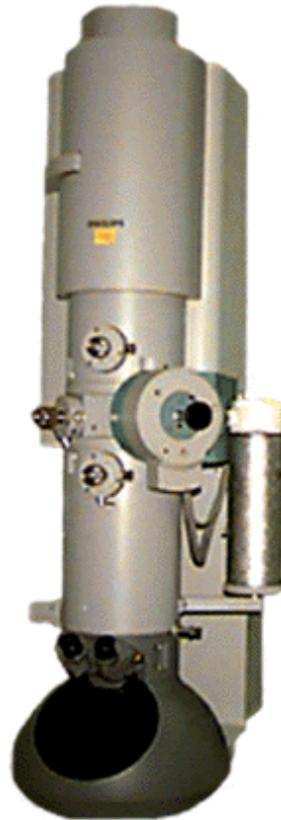
(Collaborators: Dr. Wah Chiu, NCMI, Baylor
College of Medicine, Dr. A. Sali, UCSF, Dr. Tim
Baker, UCSD)

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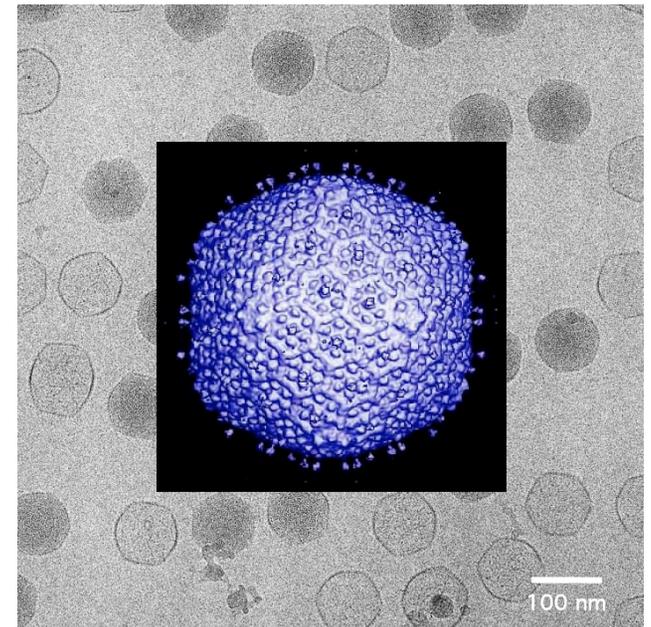
Tools for 3D Structure

- X-ray crystallography (diffraction)
 - Atomic resolution
 - Difficulties (experimental, computational)
- Nuclear magnetic resonance (NMR)
 - Atomic resolution
 - Limited to relatively small units
- Electron Microscope
 - Cryo-electron tomography
 - Low resolution (20Å – 200Å)
 - Good for whole cell or cell organelles
 - Single particle cryo-EM
 - Intermediate resolution (5Å – 20Å)
 - Computationally more complicated



Electron tomography

(Picture from A.J. Koster et al, JSB, 1997)



Single particle cryo-EM

(Picture from Tim S. Baker)

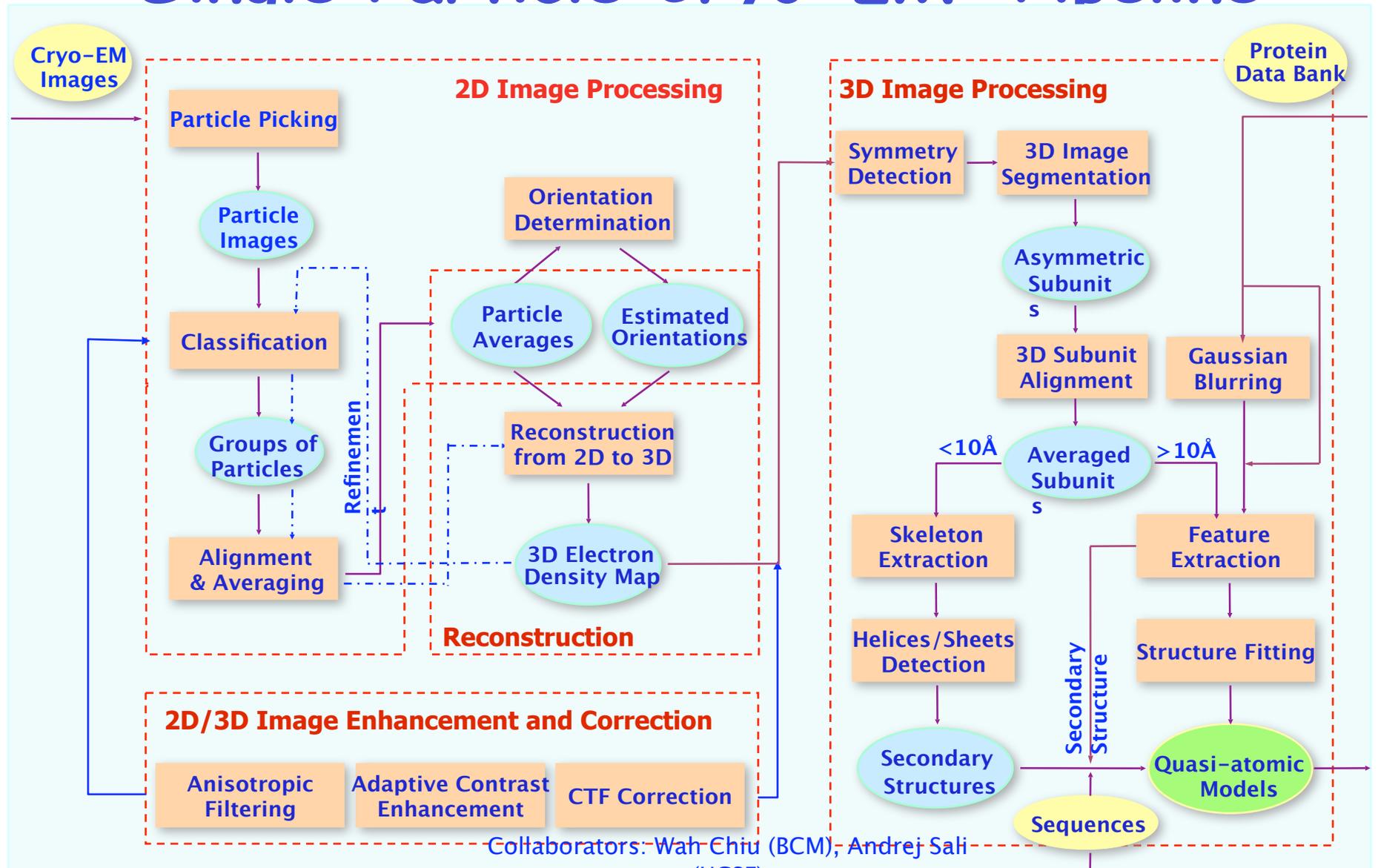


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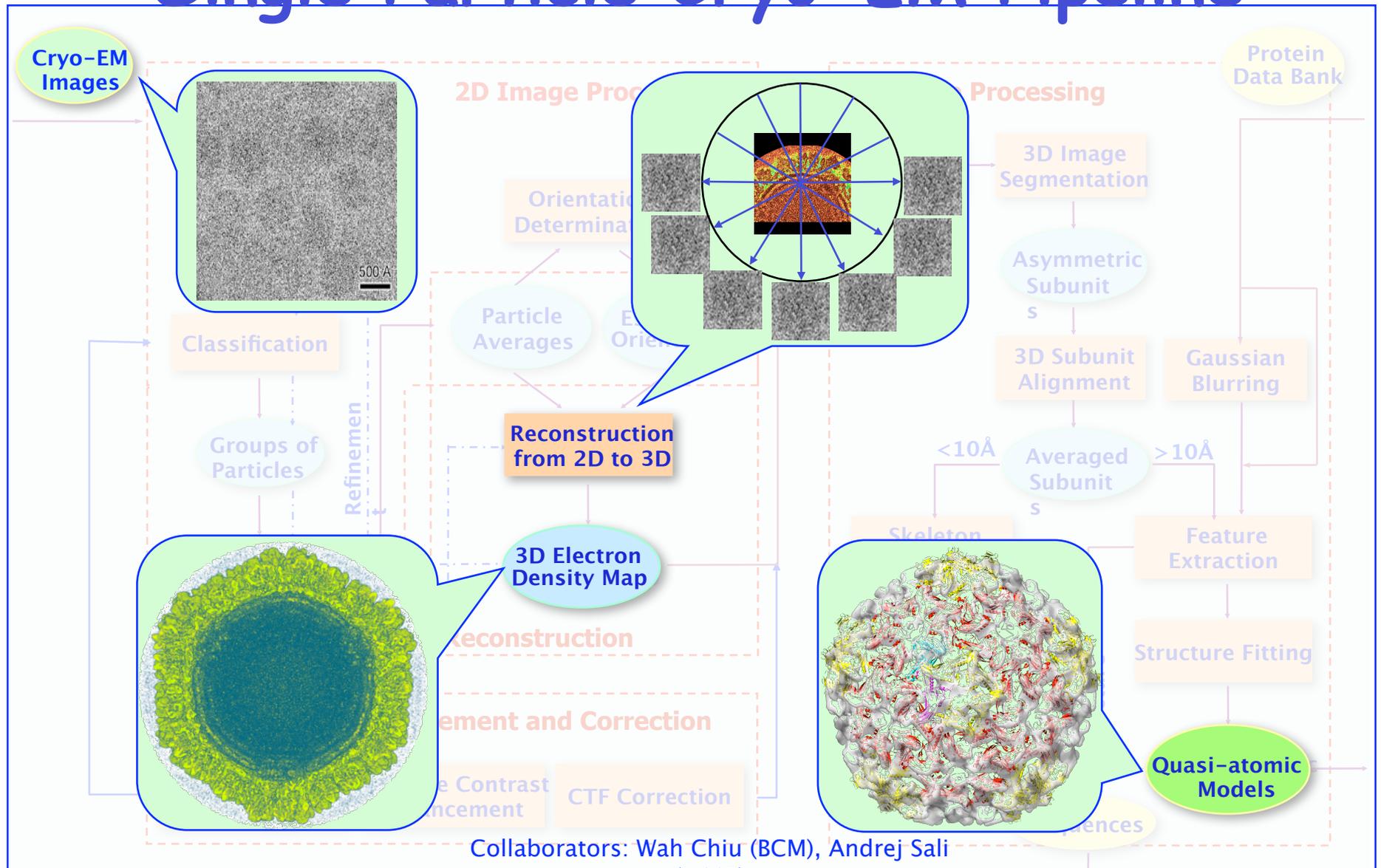
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Single Particle Cryo-EM: Pipeline

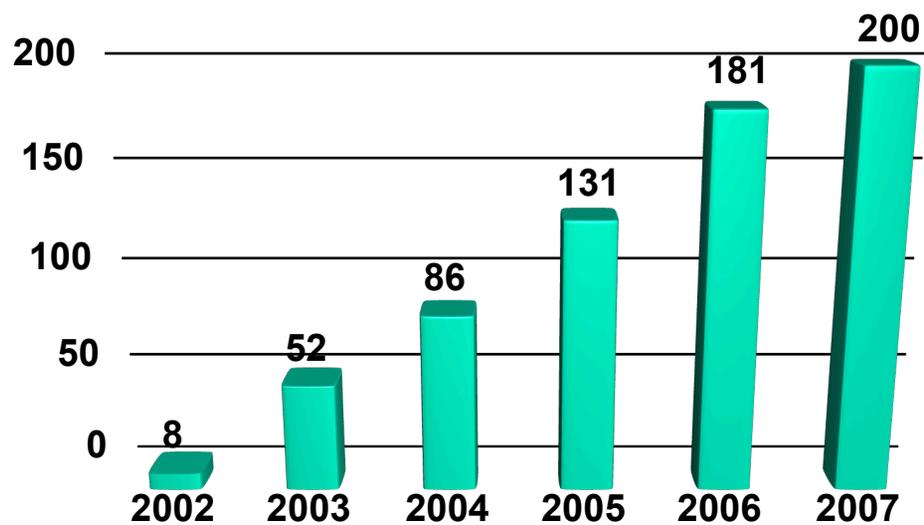


Single Particle Cryo-EM Pipeline



3D-Electron Microscopy DataBase

3D-EM Maps Deposited in EMDB

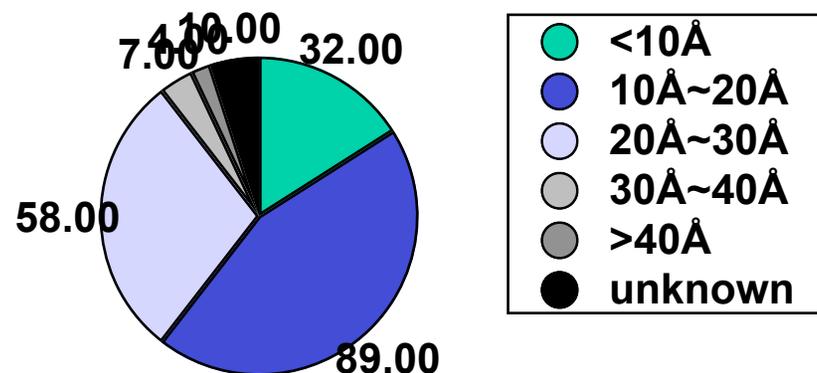


Data from: <http://www.ebi.ac.uk/msd-srv/emsearch/>,
as of March 14th, 2006

Automatic interpretation?

Quantitative analysis?

Resolution Distribution

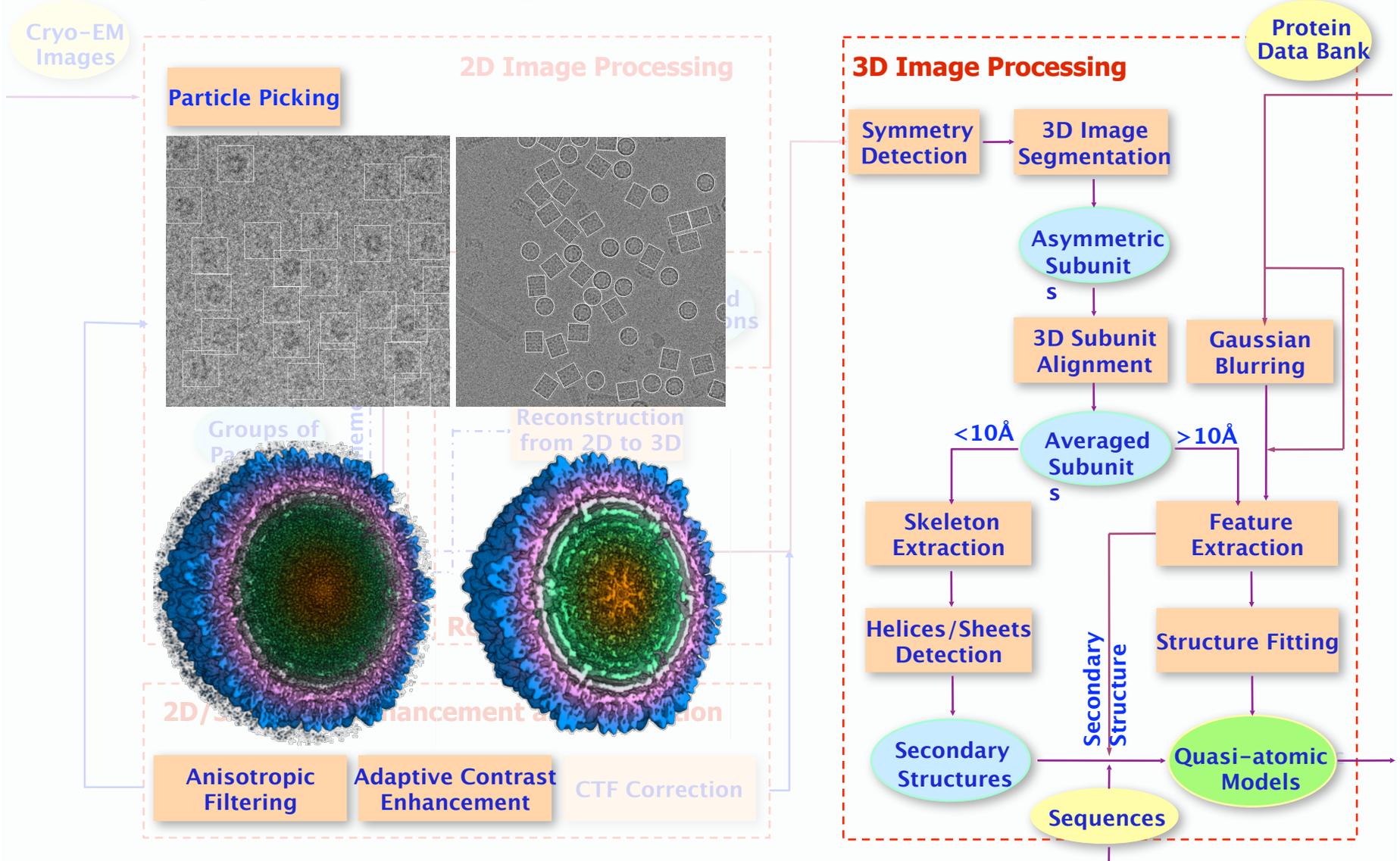


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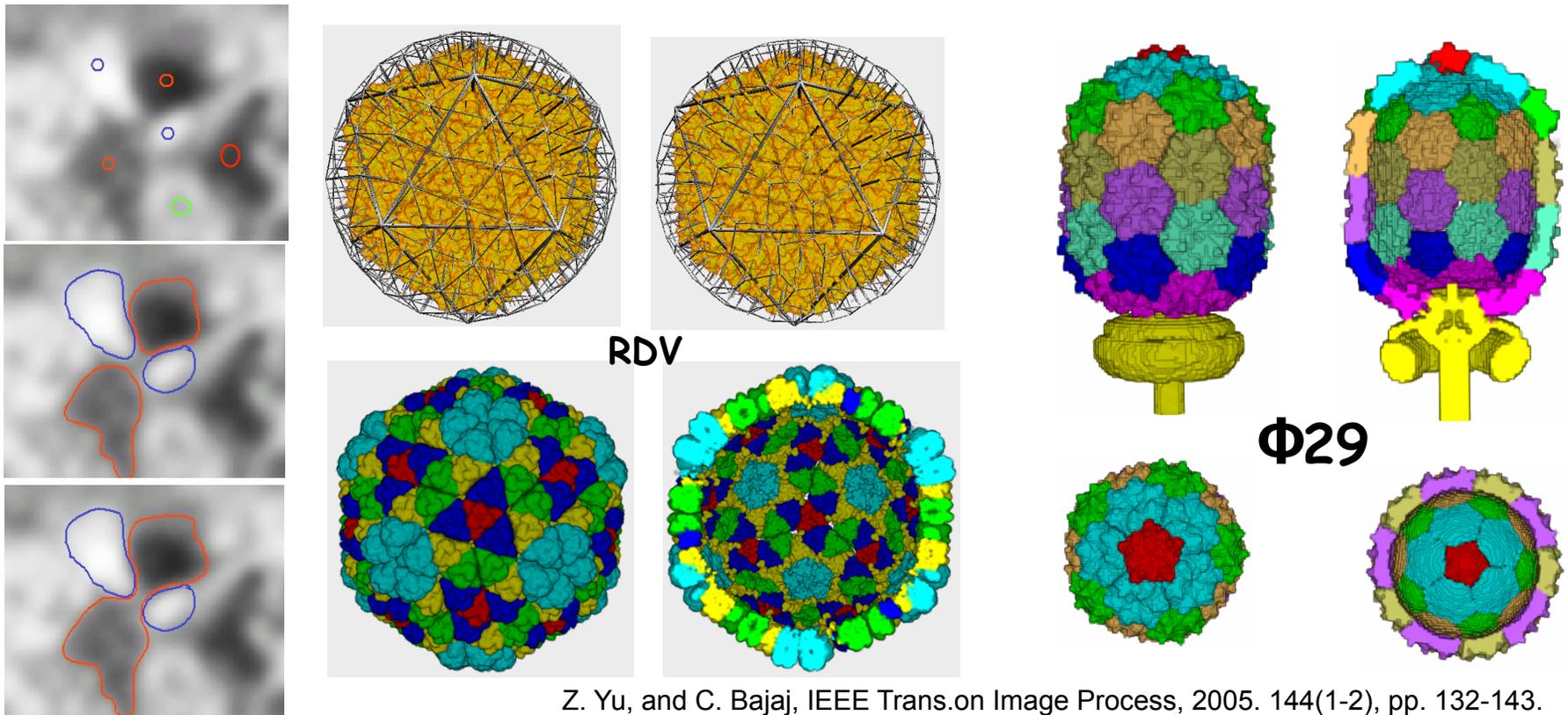
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Single Particle Cryo-EM: Towards Automatic Processing

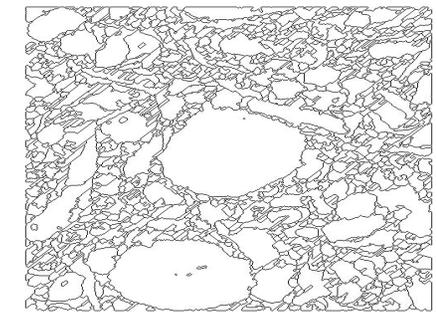
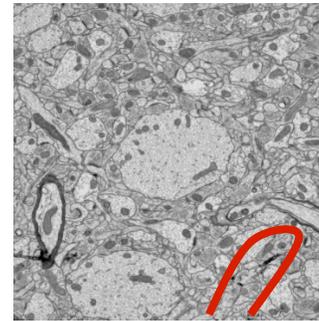
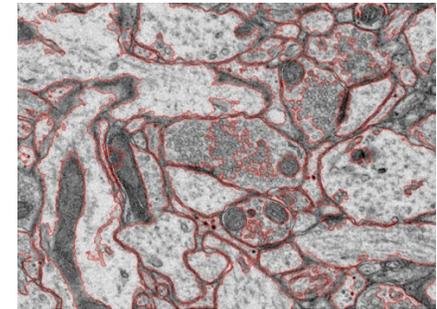
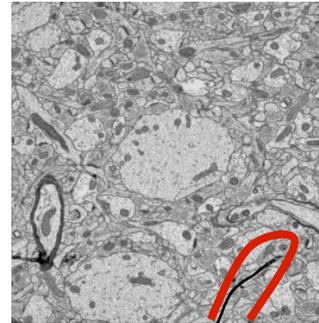
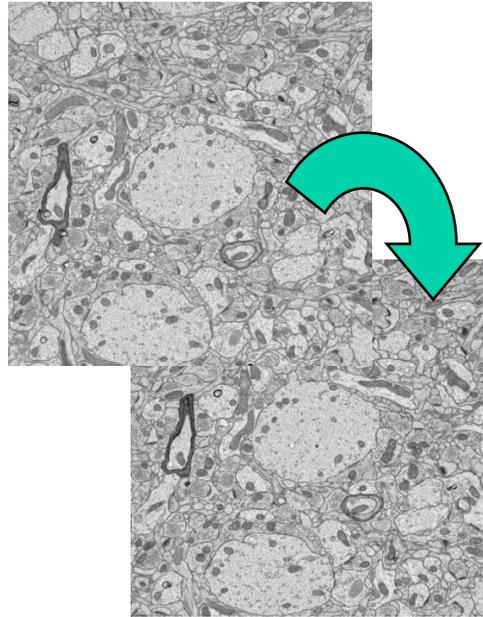
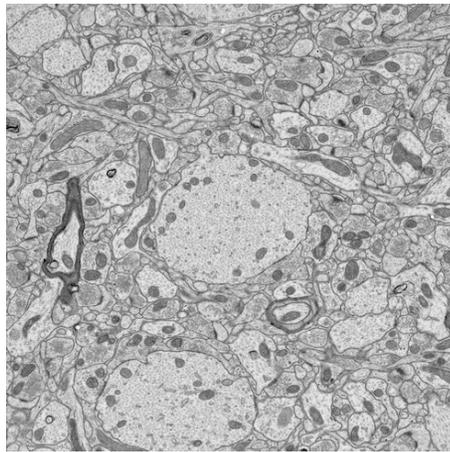


Structure Elucidation 1(B): Boundary Segmentation

- Multi-seed Fast Marching Method
 - Classify the critical points based on local symmetry.
 - Each seed initializes one contour, with its group's membership.
 - Contours march simultaneously. Contours with same membership are merged, while contours with different membership stop each other.

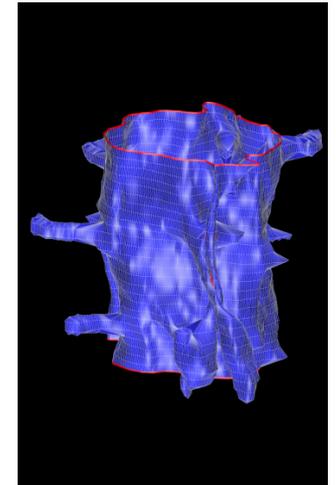
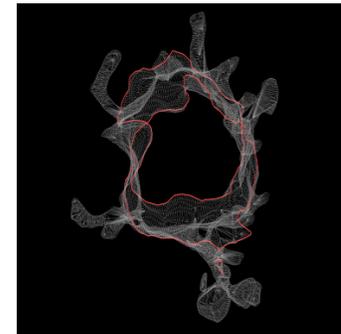
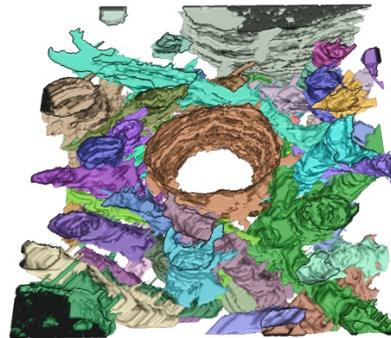


Quantitative Morphology of Hippocampal Neurons



Transmission Electron
Microscopy, Thin
Sections:

Kristen Harris, University of
Texas at Austin



Addtl. Collab: Tom Bartol, Salk Institute



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Models2Analytics



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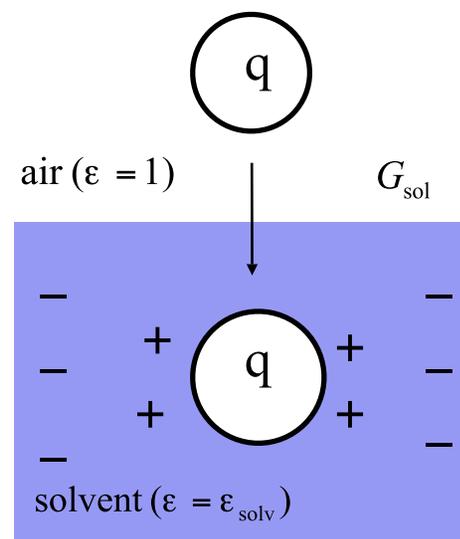
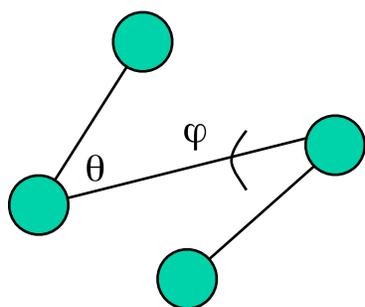
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Free Energy of a Macromolecule in Solvent

Total free energy : $G = E_{MM} + G_{sol} - TS$

$$E = E_b + E_\theta + E_\varphi + E_{vdw} + E_{elec}$$

$$G_{sol} = G_{cav} + G_{vdw} + G_{pol}$$



How to Compute G_{pol} ?

$$G_{\text{pol}} = \frac{1}{2} \int [\phi_{\text{solvent}}(\mathbf{r}) - \phi_{\text{air}}(\mathbf{r})] \rho(\mathbf{r}) dV$$

- Poisson-Boltzmann (PB) Theory

$$-\nabla \cdot [\epsilon(\mathbf{r}) \nabla \phi(\mathbf{r})] = 4\pi \rho(\mathbf{r}) + 4\pi \lambda(\mathbf{r}) \sum_{j=1}^{\infty} c_j^{\infty} q_j \exp(-q_j \phi(\mathbf{r}) / k_B T)$$

finite difference, boundary element, finite element

ϵ	dielectric constant
ϕ	electrostatic potential
ρ	solute charge density
λ	ion accessibility parameter
c_j^{∞}	ion bulk concentration
q_j	ion charge
k_B	Boltzmann's constant
T	temperature

- Generalized Born (GB) Theory

- Born formula (Born 1920), Generalized Born formula (Still 1990)

$$G_{\text{pol}} = -\frac{\tau}{2} \sum_{ij} \frac{q_i q_j}{\left[r_{ij}^2 + R_i R_j \exp\left(-\frac{r_{ij}^2}{4R_i R_j}\right) \right]^{\frac{1}{2}}} \quad R_i^{-1} = \frac{1}{4\pi} \int_{\text{ex}} \frac{1}{|\mathbf{r} - \mathbf{x}_i|^4} dV$$

$$\tau = 1 - \frac{1}{\epsilon_{\text{solv}}}$$

r_{ij} : distance between atom i and j

ex: exterior to molecule

q_i : charge of atom i R_i : effective Born radius of atom i



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- Born formula (Born 1920)

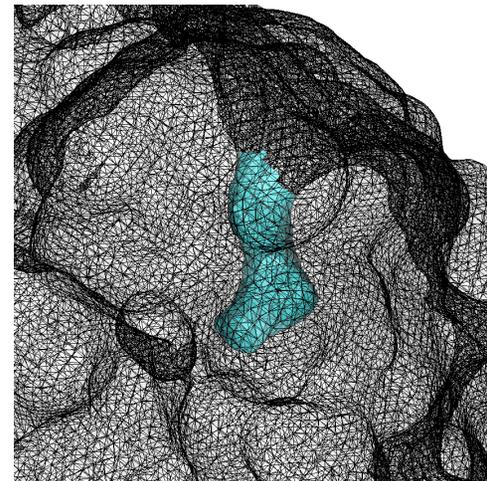
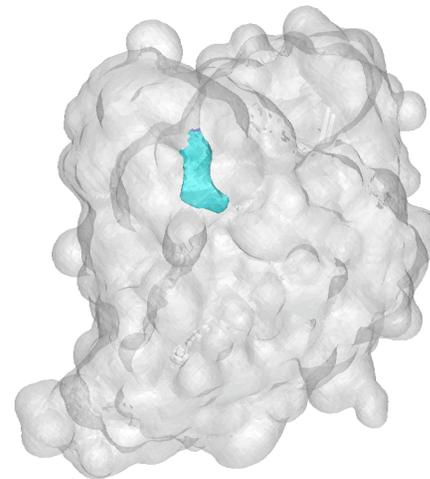
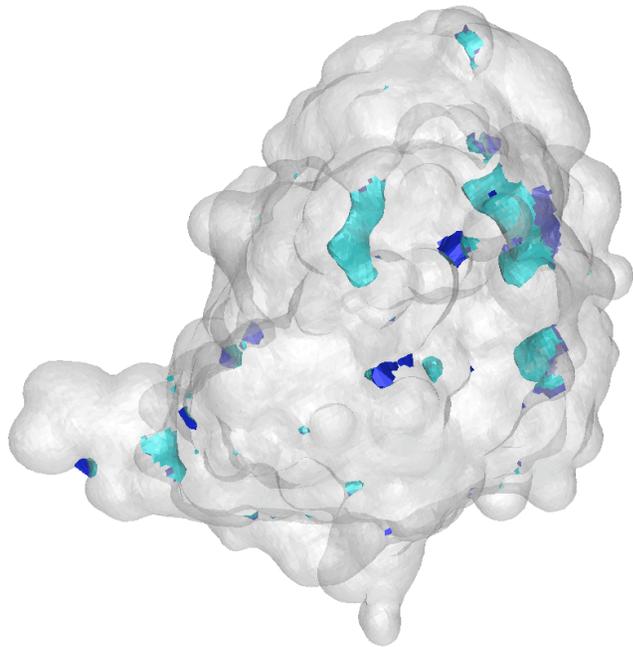
generalized Born formula (Still 1990)

- methods to compute the Born radii:

- pairwise summation methods: fast but not easy for force calculation
- analytic integration methods: slow but straight forward for force



Topological Noise Removal



C.Bajaj, A. Gillette, S. Goswami, **Topology Based Selection and Curation of Level Sets**, 2007

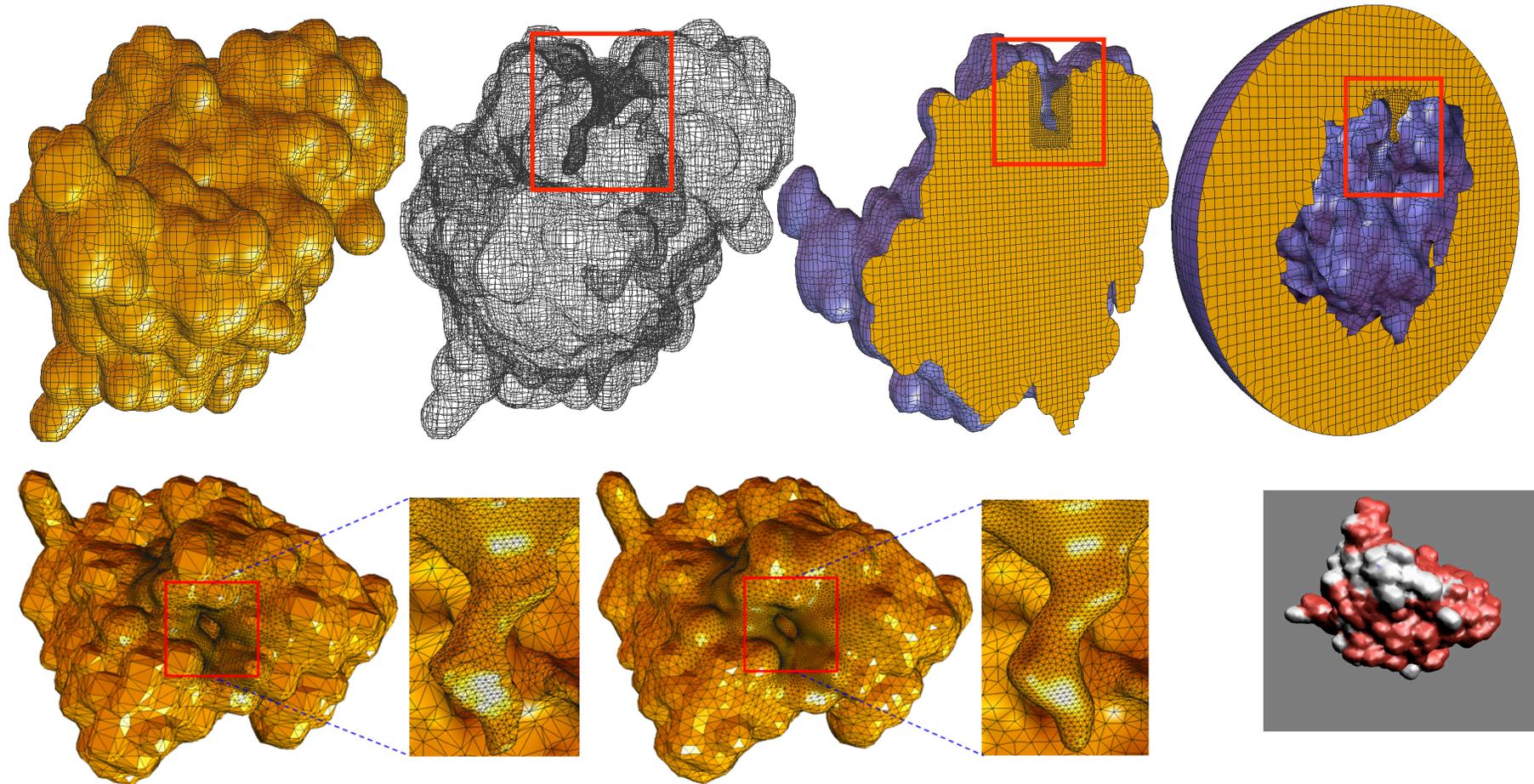


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Quality Boundary, Interior-Exterior Meshing



Y. Zhang, G. Xu, C. Bajaj
Quality Meshing of Implicit Solvation Models of Biomolecular Structures,
Computer Aided Geometric Design (CAGD), 23, 6, 2006, 510-530

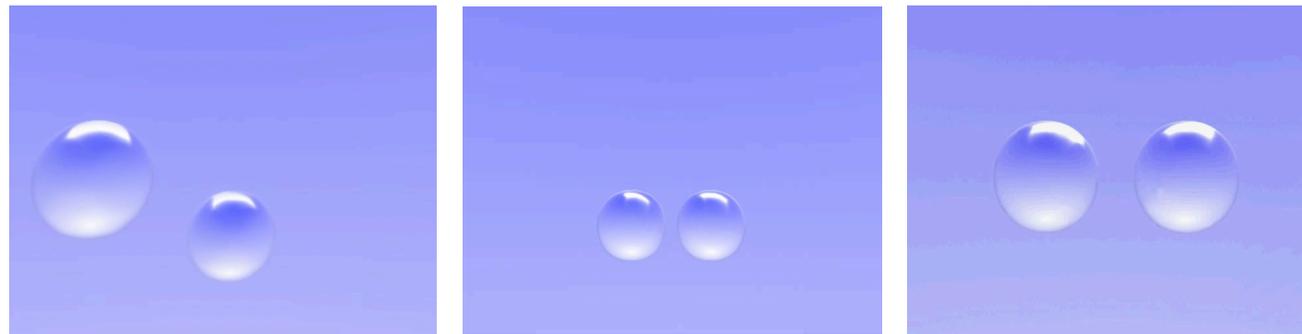
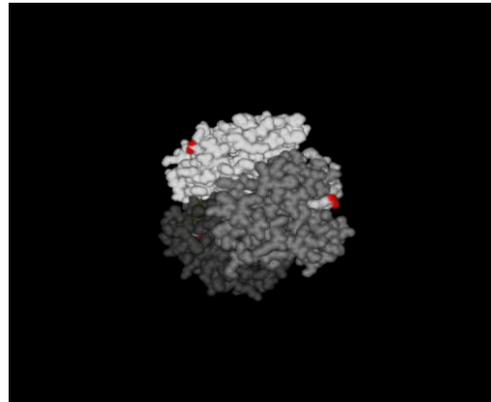


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Fast Dynamic BEM Electrostatics of Molecular and Cell Membrane Models



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finite difference, boundary element, finite element

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$\tau = 1 - \frac{1}{\epsilon_{\text{solv}}}$

r_{ij} : distance between atom i and j
 q_i : charge of atom i R_i : effective Born radius of atom i
ex: exterior to molecule



Fast Computation of Born Radii

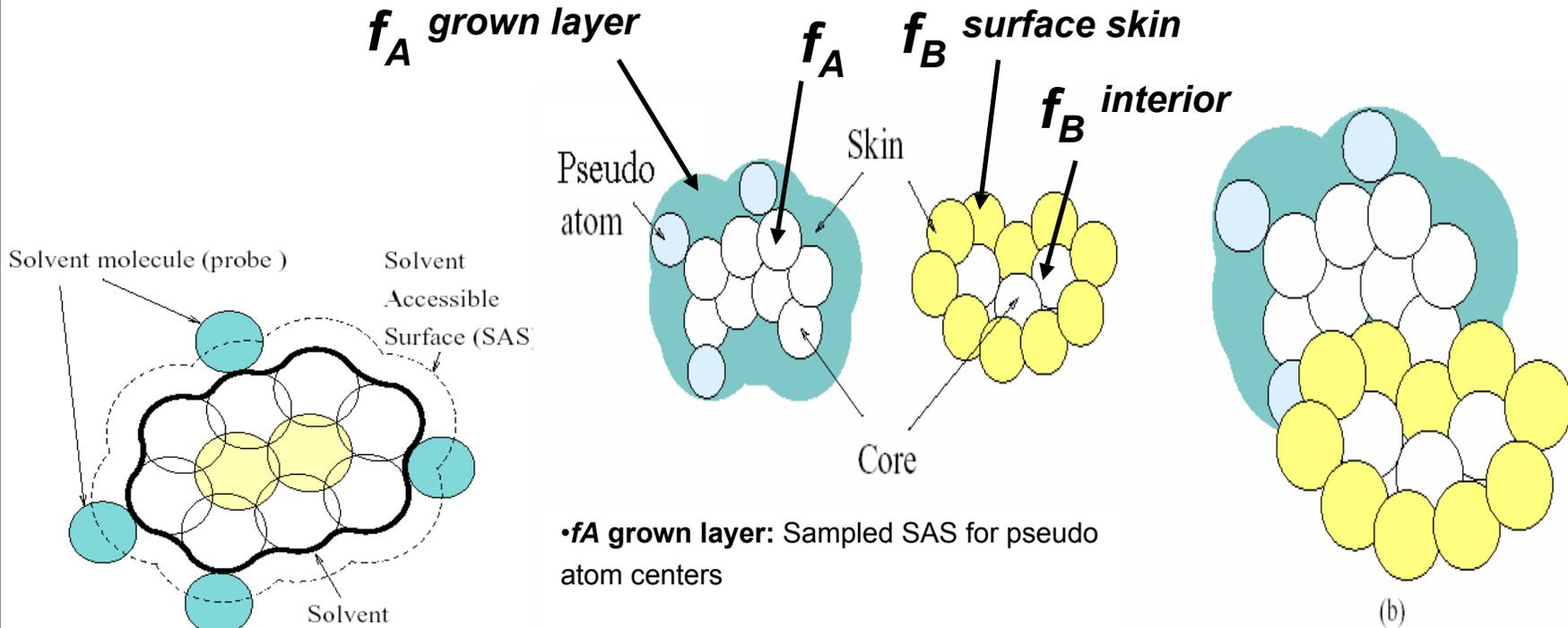
$$R_i^{-1} = \frac{1}{4\pi} \int_{\Gamma} \frac{(\mathbf{r} - \mathbf{x}_i) \times \mathbf{n}(\mathbf{r})}{|\mathbf{r} - \mathbf{x}_i|^4} dS \approx \frac{1}{4\pi} \sum_{k=1}^N w_k \frac{(\mathbf{r}_k - \mathbf{x}_i) \times \mathbf{n}(\mathbf{r}_k)}{|\mathbf{r}_k - \mathbf{x}_i|^4}, \quad \mathbf{r}_k \in \Gamma$$

Algorithm:

1. Generate a model for the molecular surface Γ .
2. Cubature: choose w_k and \mathbf{r}_k for higher order accuracy to be obtained for small N .
3. Fast Fourier summation to evaluate R_i , $i = 1, \dots, M$.



F³ Dock: Fast Flexible Fourier Docking



• **f_A grown layer:** Sampled SAS for pseudo atom centers

• **f_A :** Atom centers of the protein
 (a) SKIN and CORE regions. Atoms are drawn as white and yellow.

• **f_B surface skin:** Surface atoms

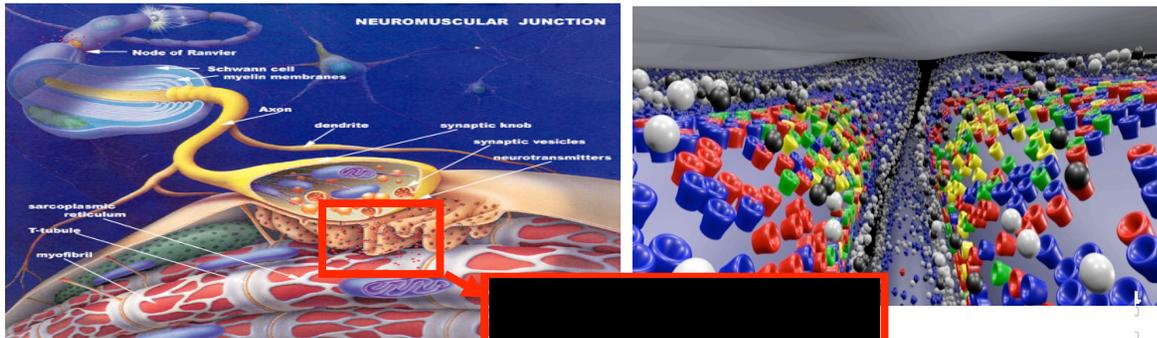
• **f_B interior atoms:** Atoms of B which are not surface atoms

Stable Docking

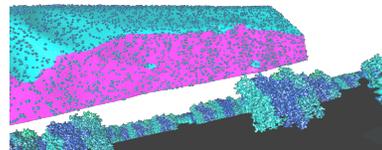
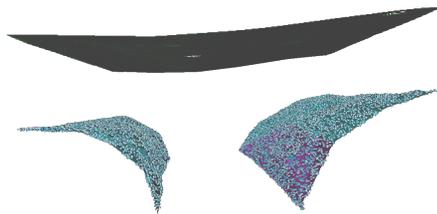
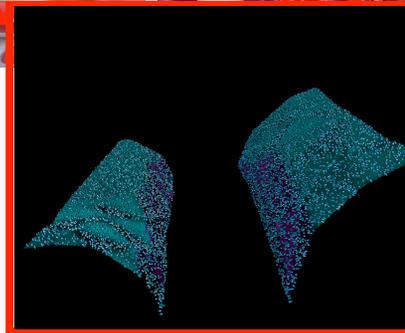
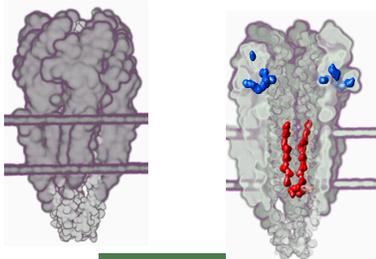
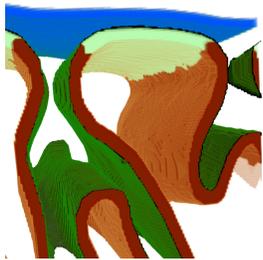
Collaborators: Art Olson, Michel Sanner (TSRI)



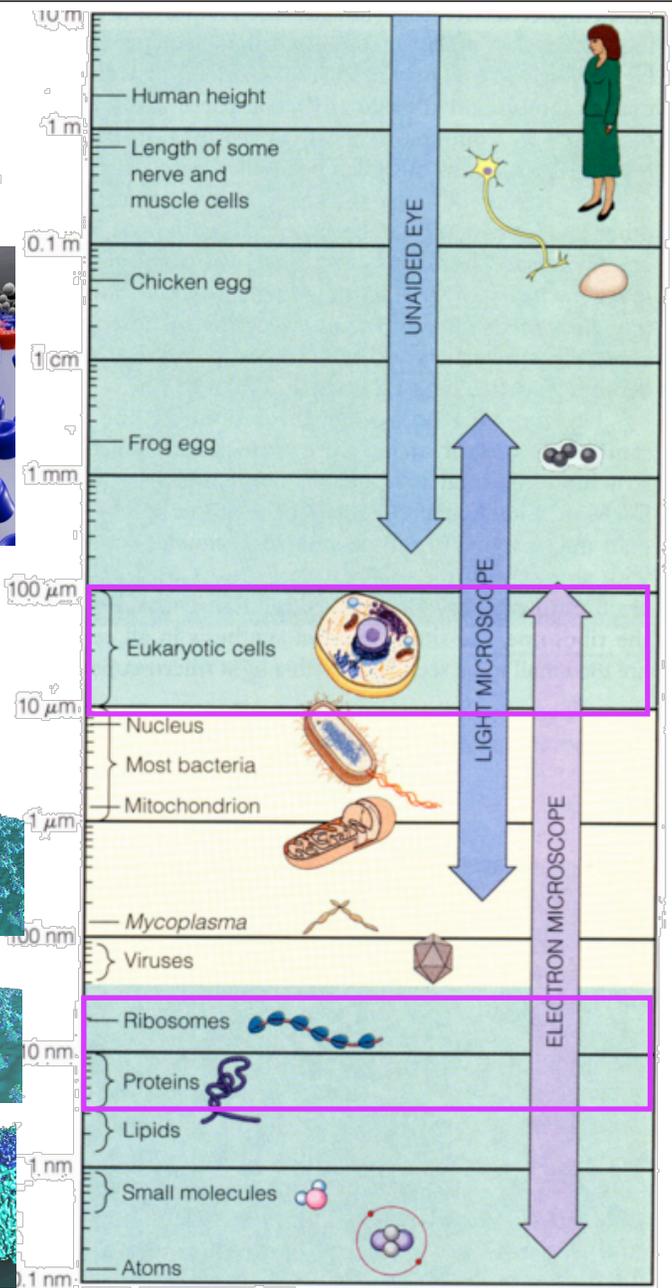
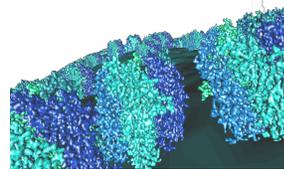
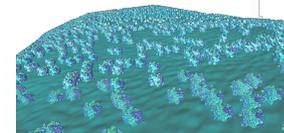
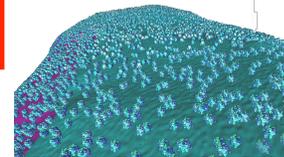
Multiscale Modeling of the Neuro-Muscular Junction



<http://fig.cox.miami.edu/~cmallery/150/neuro/neuromuscular-sml.jpg> <http://mcell.salk.edu/>



Multi-scale
LOD



“The World of the Cell”, 1996)

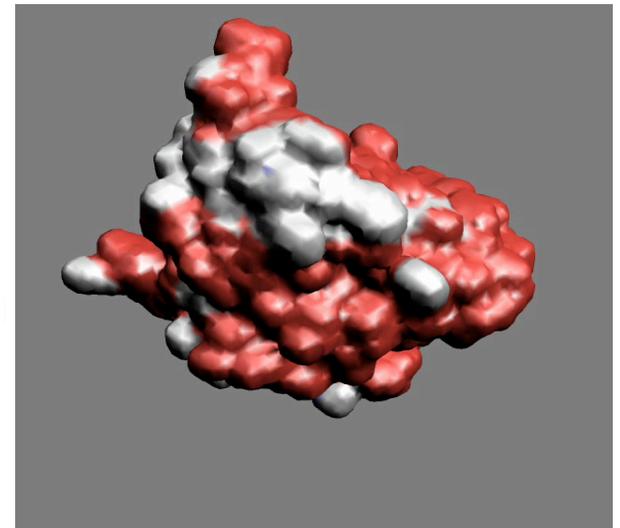
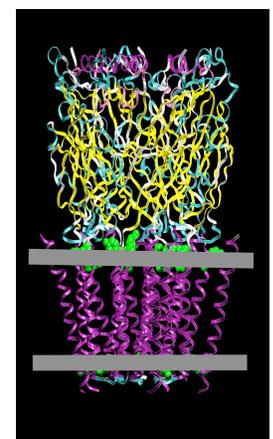
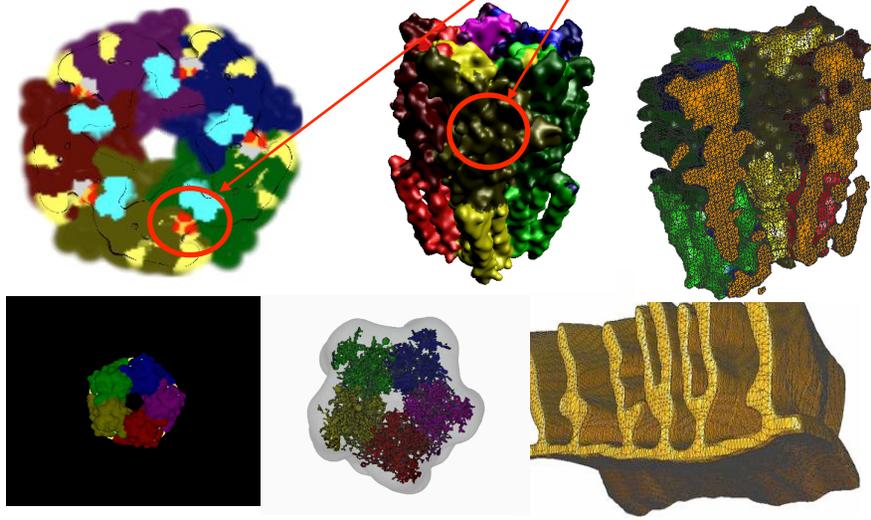
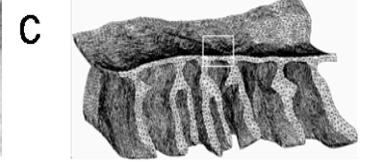
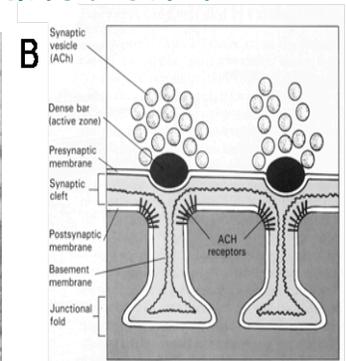
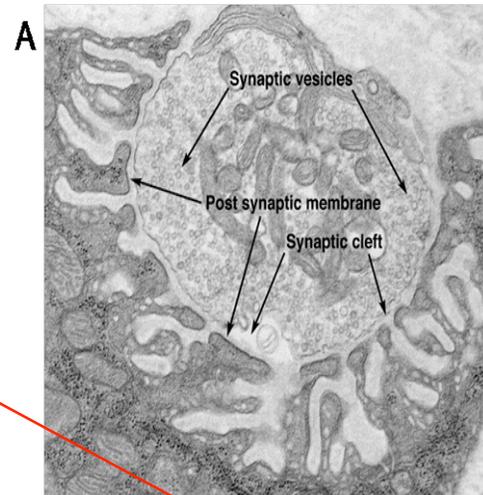
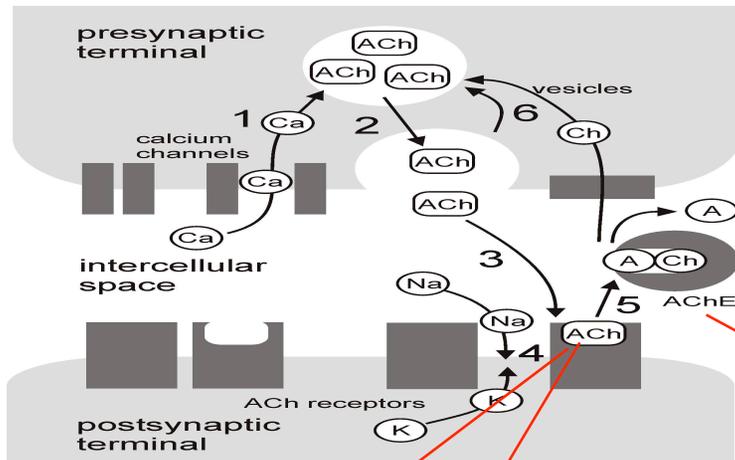


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How do Synapses Occur at the Neuro-Muscular Junction ?



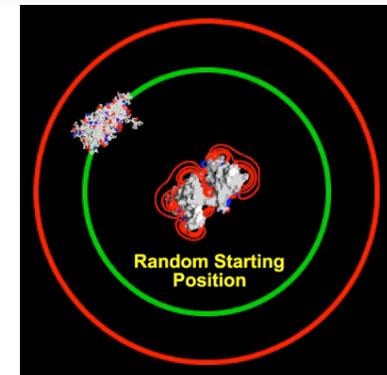
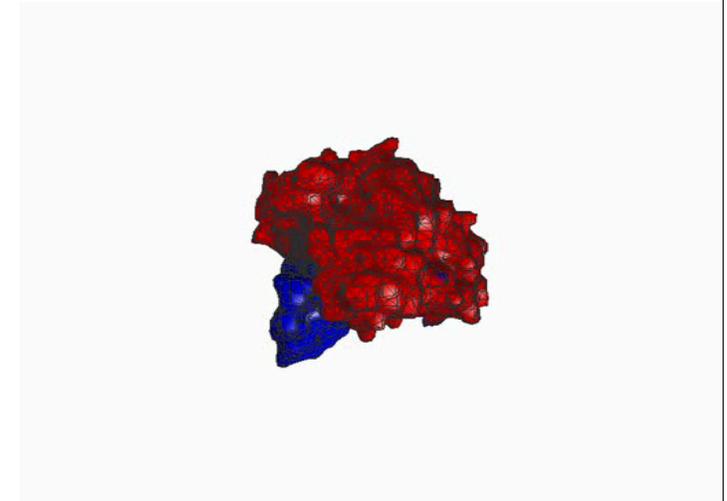
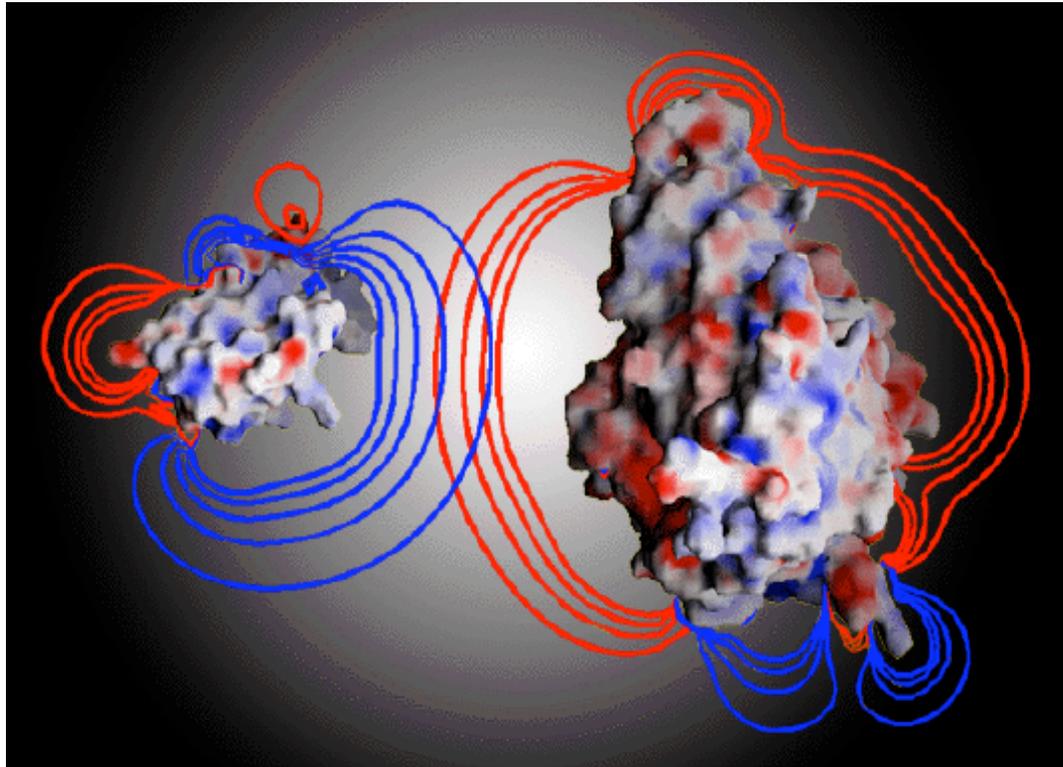
- Y. Zhang, C. Bajaj, B. Sohn, *Special issue of Computer Methods in Applied Mechanics and Engineering (CMAME) on Unstructured Mesh Generation*, 2004.
- Y. Song, Y. Zhang, T. Shen, C. Bajaj, J. A. McCammon and N. A. Baker, *Finite Element Solution of the Steady-State Smoluchowski Equation*, *Biophysical Journal*, 86(4):2017-2029, 2004.



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Collaborators: Nathan Baker (Wash. U), Andy McCammon, Mike Holst, Mark Ellisman (UCSD)

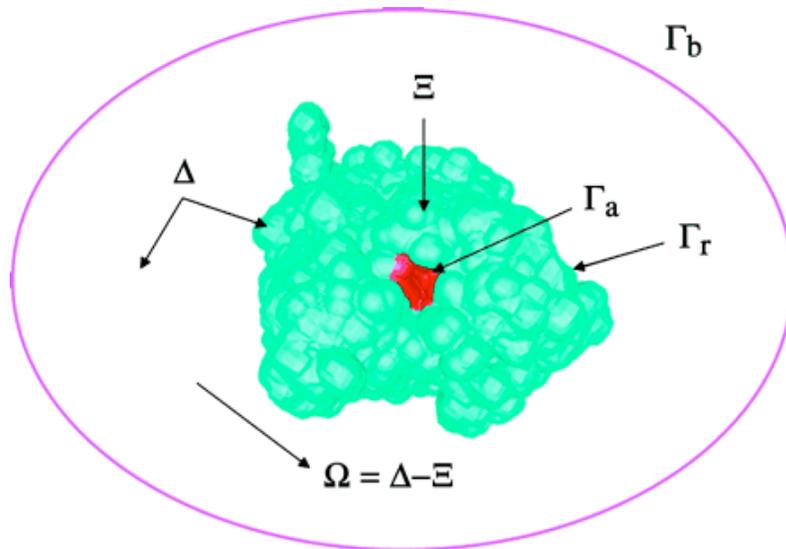
Fas2 meets AChE



Steady State Smulochowski Equation

(Diffusion of multiple particles in a potential field)

$$\vec{J}p(\vec{r}) = D(\vec{r})[\nabla p(\vec{r}) + \beta p(\vec{r})\nabla U(\vec{r})]$$



- Δ -- entire domain
- Ξ -- biomolecular domain
- Ω -- free space in Δ
- Γ_a – reactive region
- Γ_r – reflective region
- Γ_b – boundary for Δ

$$p(\vec{r}) = p_{bulk} \text{ for } \vec{r} \in \Gamma_b$$

$$p(\vec{r}) = 0 \text{ (Dirichlet BC) for } \vec{r} \in \Gamma_a$$

$$\text{or } \vec{n} \times \vec{J}p(\vec{r}) = \alpha(\vec{r})p(\vec{r}) \text{ (Robin BC)}$$

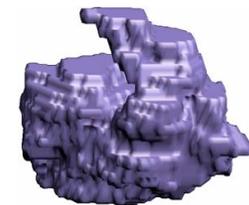
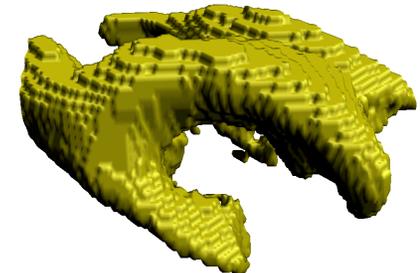
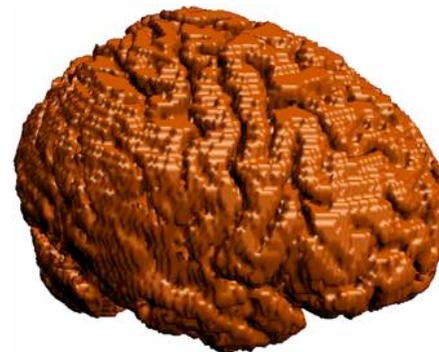
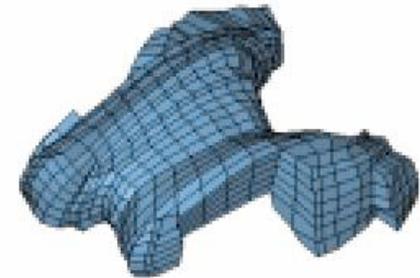
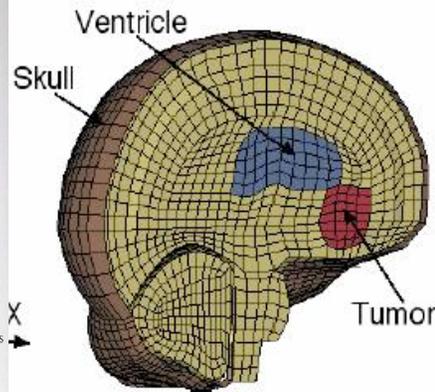
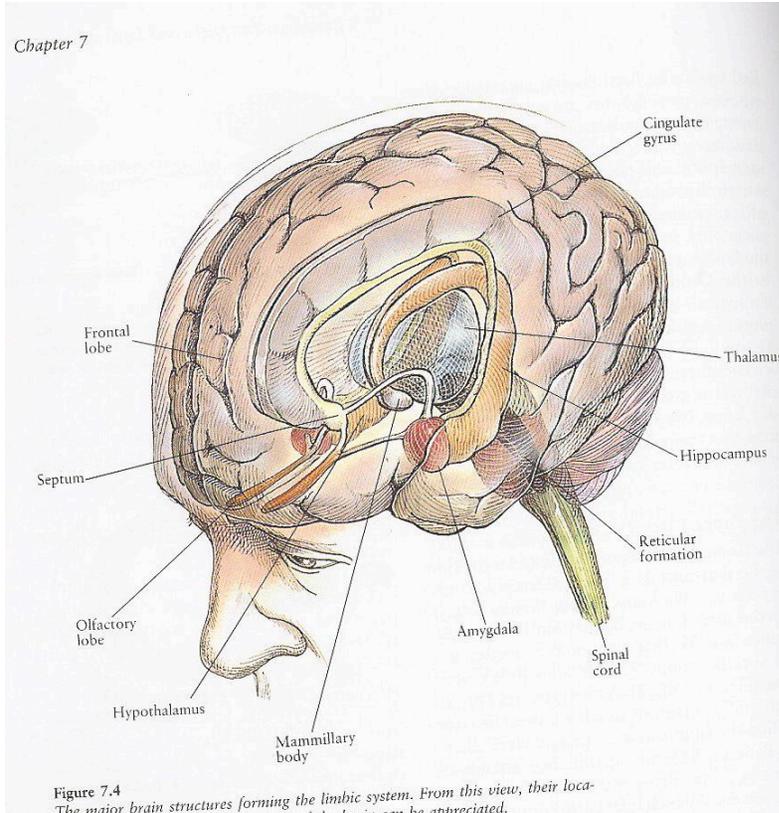
$$\vec{n} \times \vec{J}p(\vec{r}) = 0 \text{ for } x \in \Gamma_r$$

Diffusion-influenced biomolecular reaction rate constant :

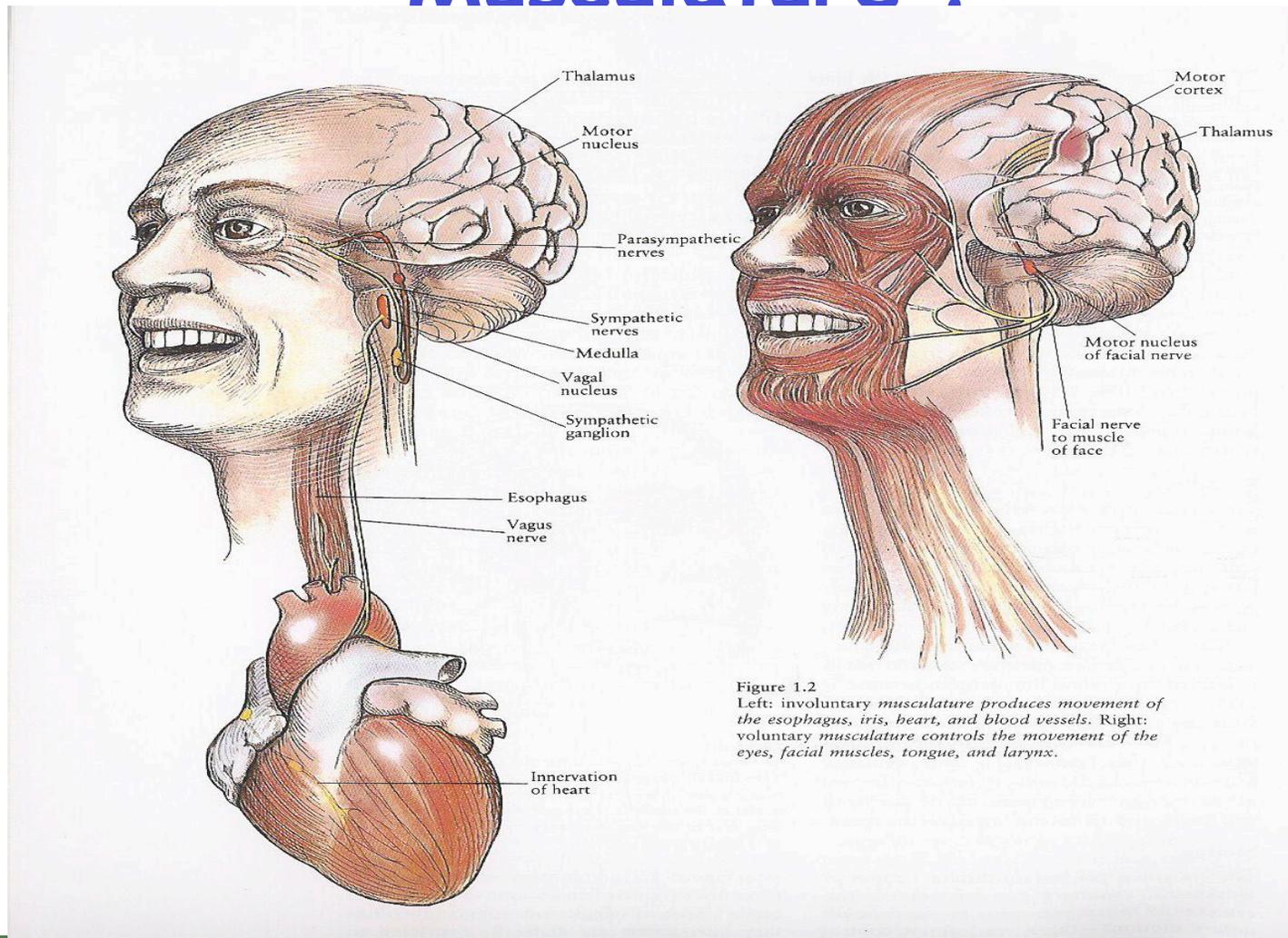
$$k = \frac{\int_{\Gamma_a} \vec{n} \times \vec{J}p(\vec{r}) dS}{p_{bulk}}$$



How does the Brain function ?



How does the Brain pulse the Musculature ?



Analytics2Informatics



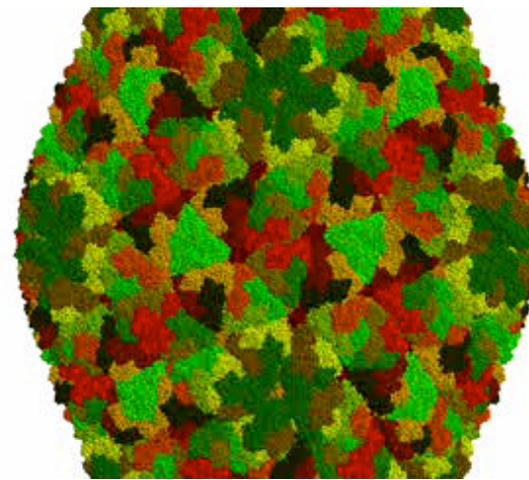
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August 2007

Interrogative Scalable Visualization

- **Novel techniques**
 - Surface/2D Textures/3D Texture based rendering exploit hardware acceleration
 - Multi-dim Transfer Functions for Regions of Interest
 - Compressed data processing
 - Parallelism (back-end PC cluster)
 - Hierarchical processing and rendering



TexMol

C. Bajaj, I. Ihm, S. Park, *ACM Trans. on Graphics*, 20, 1, 10-28, 2001

C Bajaj, P Djeu, V Siddavanahalli, A Thane, *IEEE visualization*, 2003. 243-250.

C. Bajaj, J. Castrillon-Candas, S. Vinay, A. Xu, *Structure*, 13,3,2005,463-471

X. Zhang, C. Bajaj, *IEEE Symp. On Parallel, Large Data Visualization*, 2001, 51-58

X. Zhang, C. Bajaj *Eurographics-IEEE TVCG Symposium on Visualization 2002*, 9-18



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GroEL Data courtesy: Dr. Wah Chiu
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Today's Examples

- Ss TEM, Cryo-EM and Tomographic Imaging to Ultra-Structure to Geometry (**Volumetric Image Processing**)
- Geometry to Finite Element Meshes (**Geometric Modeling**)
- Faster Solvers (**Geometry Adaptive Integral / Differential Equations Solving**)
- Quantitative Analysis of Structure & Properties – Topological, Combinatorial, Metric (**Comp. Geometry**)
- Immersive/Exploratory **Visualization**



What could you learn from this course ?

- Techniques and tools to generate computer **structure (geometry)** models of life forms with spatial realism
- Techniques and tools to computationally model and simulate **physiological function**
- Techniques and tools to **visualize & analyze structure and function**



Additional Reading for the Next Lectures

- C. Bajaj “Modeling and Visualizing Virus Ultrastructure”

<http://www.cs.utexas.edu/~bajaj/cs395T05/reading/b05-virus-arch.pdf>

- C. Bajaj and Z. Yu “Geometric Processing of 3D Cryo-EM”

<http://www.cs.utexas.edu/~bajaj/cs395T05/reading/by05-hndbk.pdf>

