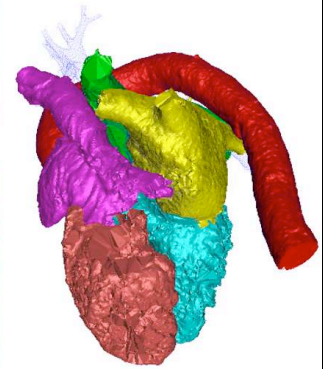
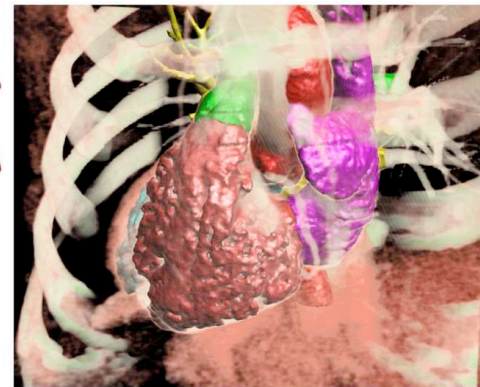
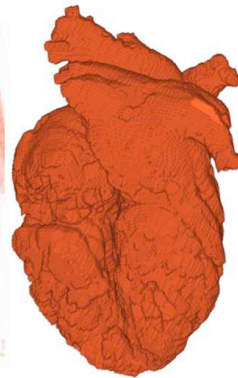
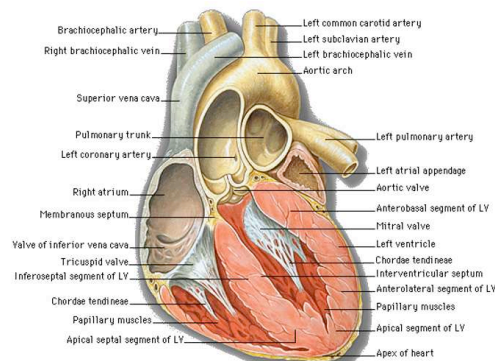


Geometric Modeling and Visualization

<http://www.cs.utexas.edu/~bajaj/cs384R08/>



Lecture 5

Structure Elucidation: Geometric and Signal Processing Algorithms

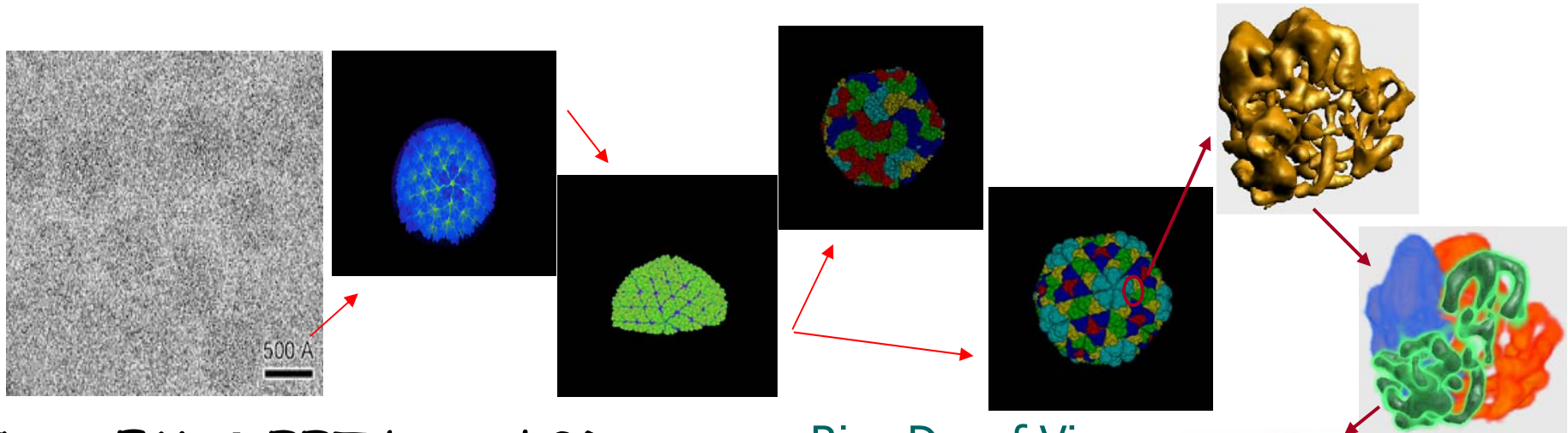


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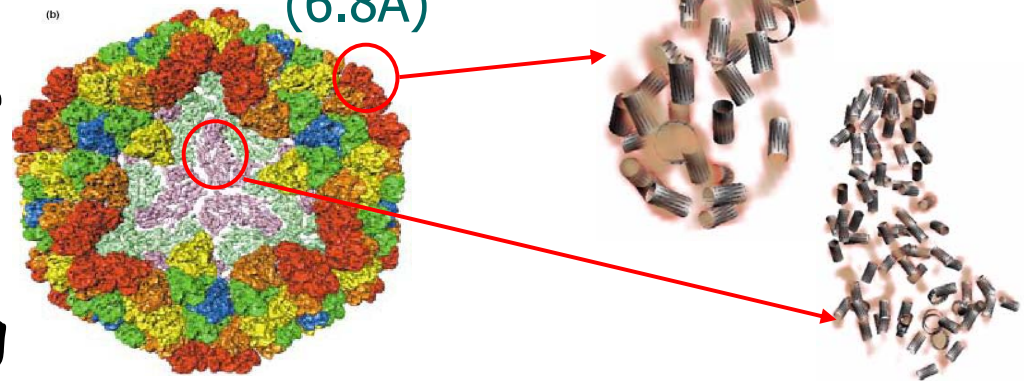
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Sub-nanometer Structure Elucidation from 3D Cryo-EM



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

Rice Dwarf Virus
(6.8Å)



**Sponsored by NSF-ITR, NIH



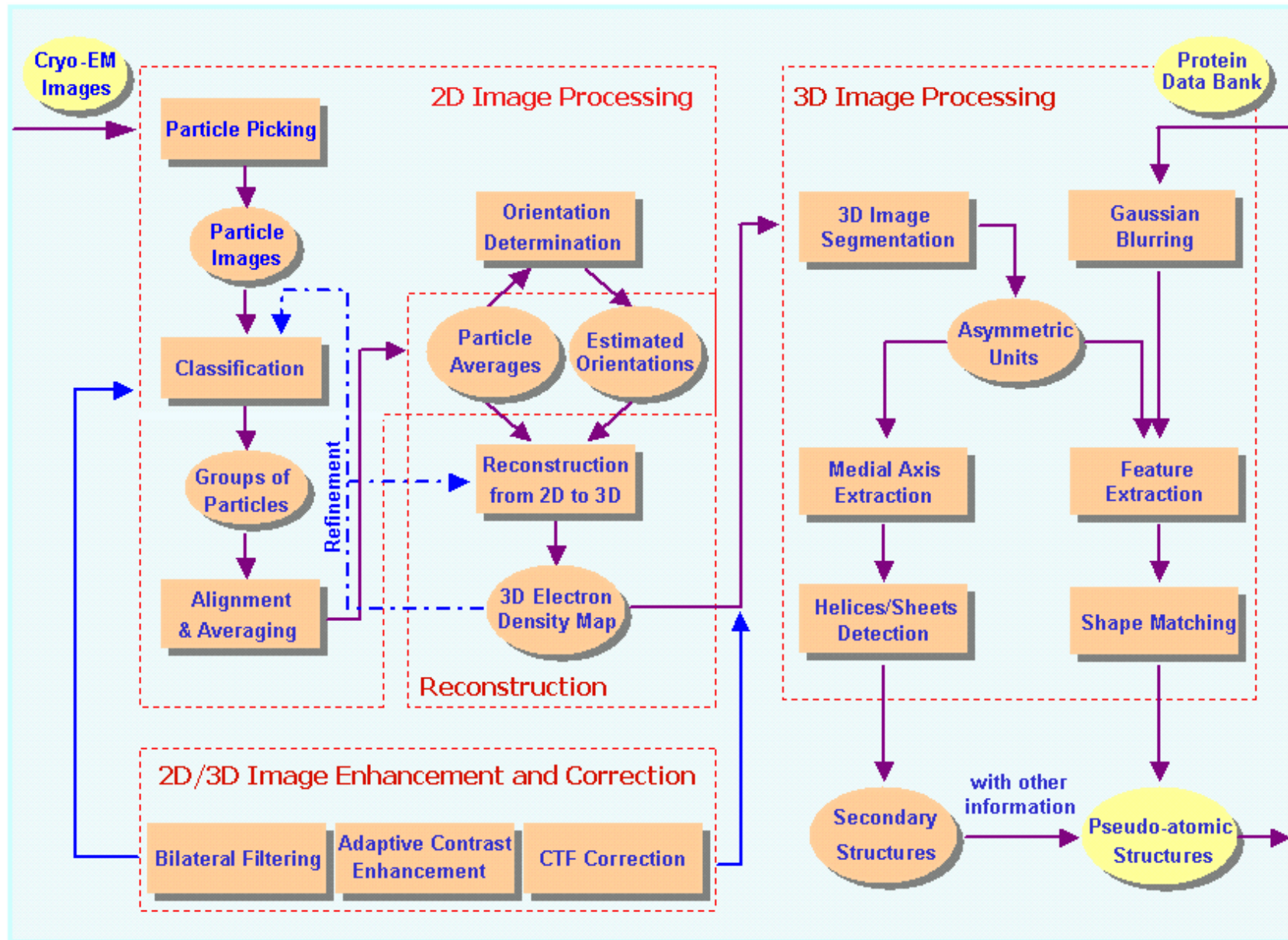
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(Collaborators: Wah Chiu, NCMI, Baylor
College of Medicine, Andrej Sali, UCSF)

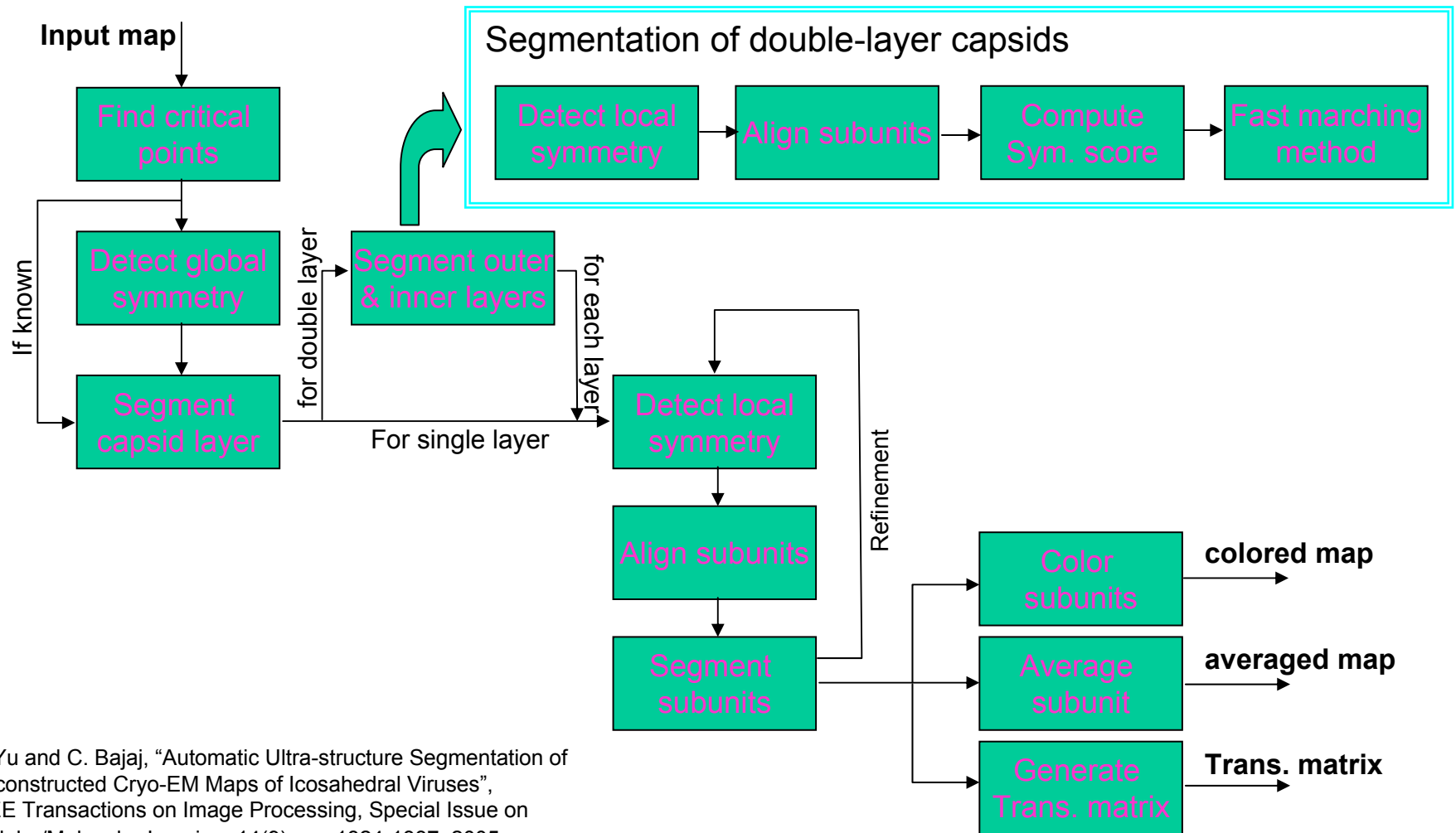
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A Structure Determination Pipeline for single particle cryo-EM



Structure Elucidation for Icosahedral Viruses



Z. Yu and C. Bajaj, "Automatic Ultra-structure Segmentation of Reconstructed Cryo-EM Maps of Icosahedral Viruses", IEEE Transactions on Image Processing, Special Issue on Cellular/Molecular Imaging, 14(9), pp. 1324-1337, 2005.



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Structure Elucidation 1(A)

- Adaptive contrast enhancement
- Bilateral filtering

$$h(x, \xi) = e^{-\frac{(x-\xi)^2}{2\sigma_d^2}} \cdot e^{-\frac{(f(x)-f(\xi))^2}{2\sigma_r^2}}$$

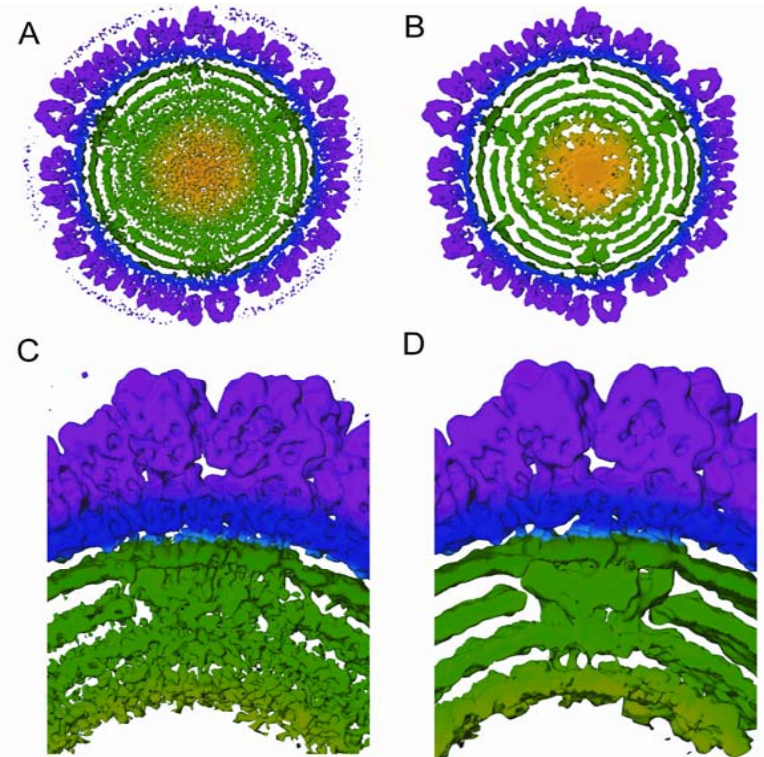
where σ_d and σ_r are parameters and $f(\cdot)$ is the image intensity value.

- Anisotropic diffusion filtering

$$\partial_t \phi - \text{div}(a(|\nabla \phi|) \nabla \phi) = 0$$

where **a** stands for the diffusion tensor determined by local curvature estimation.

- Anisotropic gradient vector diffusion



W. Jiang, M. Baker, Q. Wu, C. Bajaj, W. Chiu, Journal of Structural Biology, 144, 5, (2003), 114-122

C. Bajaj, G. Xu, ACM Transactions on Graphics, (2003), 22(1), 4 - 32.

Z. Yu & C. Bajaj, Proc. Int'l Conf. Image Processing, 2002. pp. 1001-1004.

Z. Yu & C. Bajaj, Proc. Int'l Conf. Computer Vision and Pattern Recognition, 2004. 415-420.

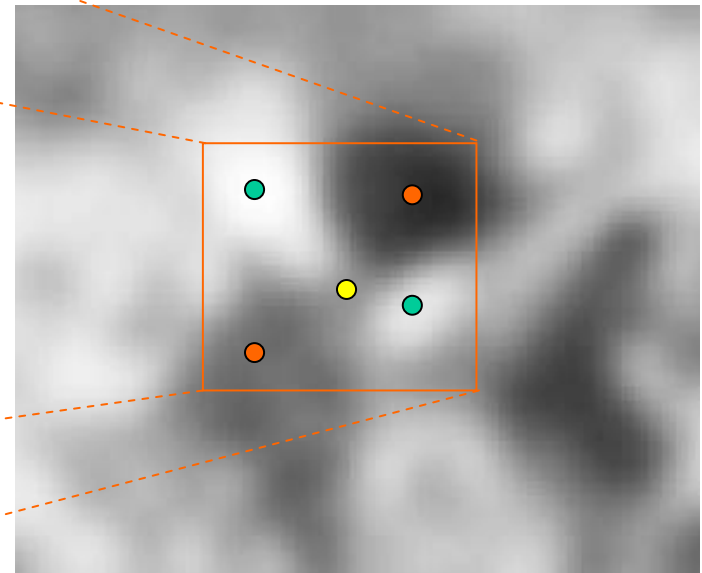
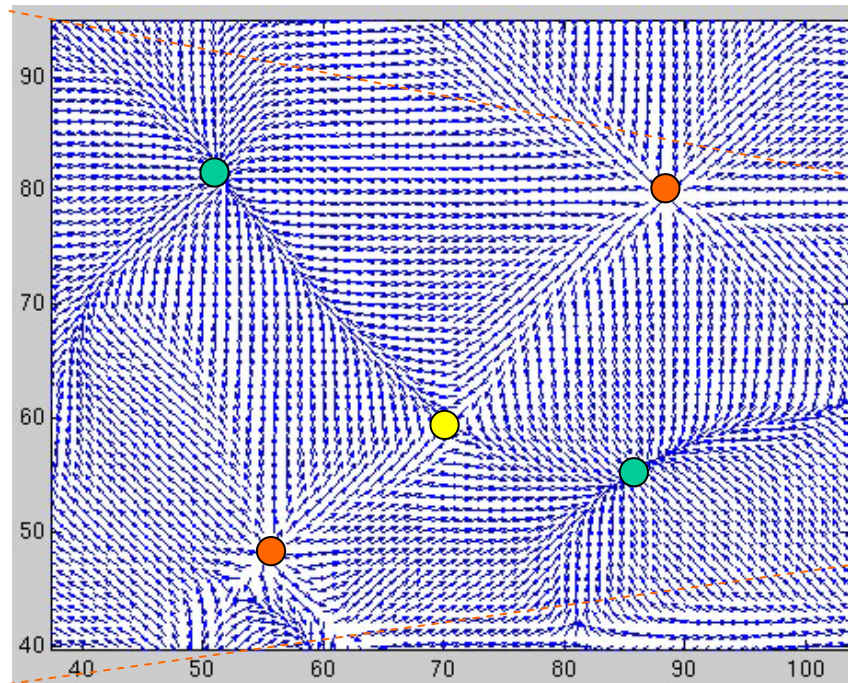


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Compute Critical Points Using AGVD



● : minimum

(0)

● : maximum

(3)

● : saddle

(1, 2)



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Anisotropic Gradient Vector Diffusion (AGVD)

Isotropic Diffusion (Xu *et al.*, 1998)

$$\begin{cases} \frac{\partial u}{\partial t} = \mu \nabla^2 u - (u - f_x)(f_x^2 + f_y^2) \\ \frac{\partial v}{\partial t} = \mu \nabla^2 v - (v - f_y)(f_x^2 + f_y^2) \end{cases}$$

Where:

$(u(t), v(t))$ stands for the evolving vector field;

μ is a constant;

f is the original image to be diffused;

$(f_x, f_y) = (u(0), v(0))$.

Anisotropic Diffusion (Yu & Bajaj ICPR'02)

$$\begin{cases} \frac{\partial u}{\partial t} = \mu \nabla (g(\alpha) \cdot \nabla u) - (u - f_x)(f_x^2 + f_y^2) \\ \frac{\partial v}{\partial t} = \mu \nabla (g(\alpha) \cdot \nabla v) - (v - f_y)(f_x^2 + f_y^2) \end{cases}$$

Where

$(u(t), v(t))$ stands for vector field;

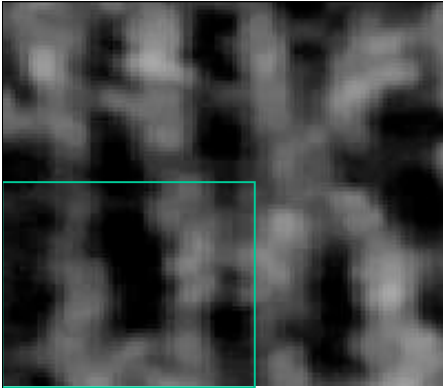
μ is a constant; $(f_x, f_y) = (u(0), v(0))$.

f is the original image to be diffused;

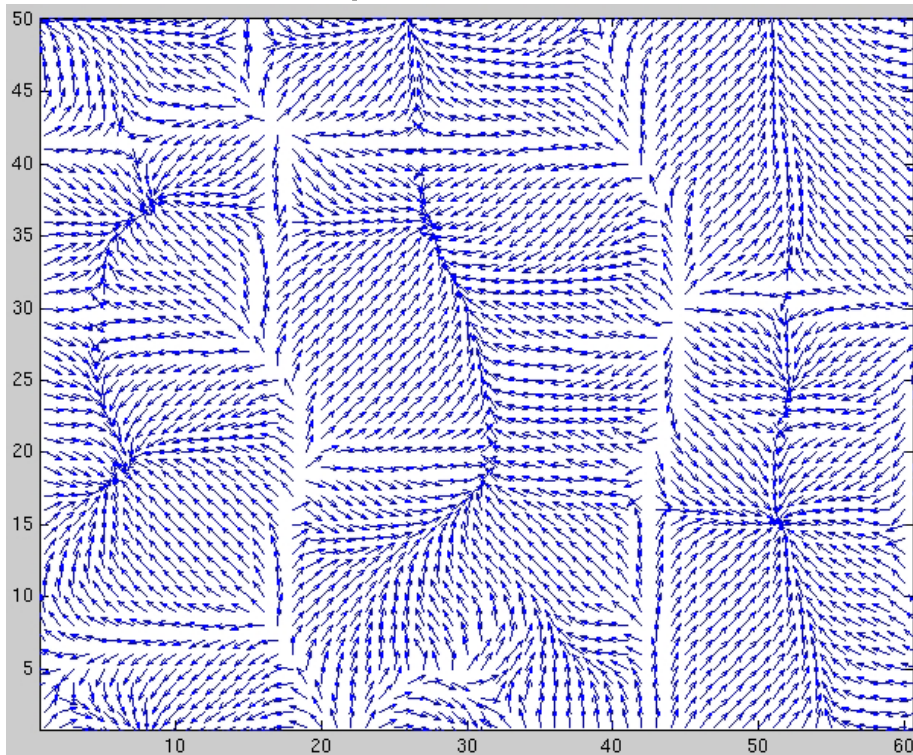
$g(\cdot)$ is the angle between two vectors



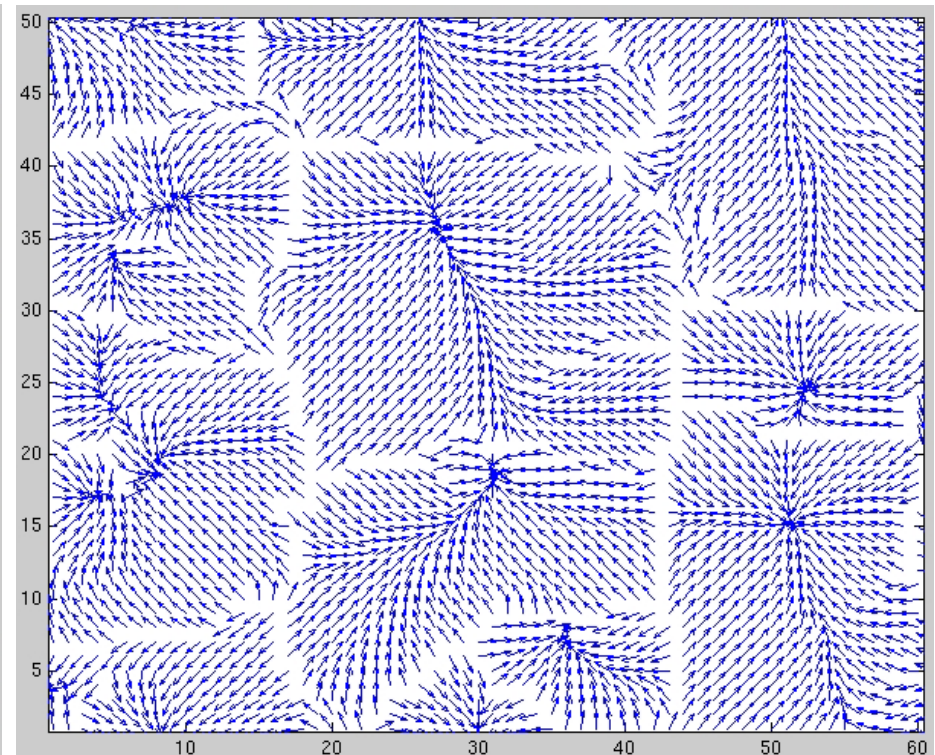
GVD v.s. AGVD



Isotropic diffusion

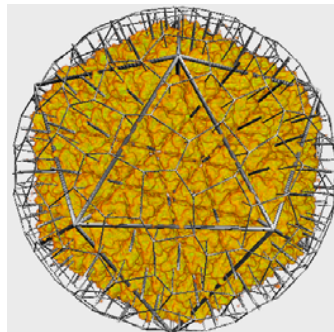
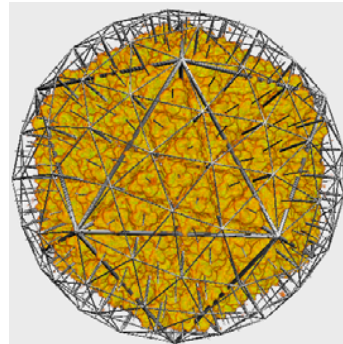
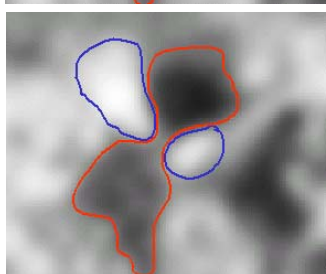
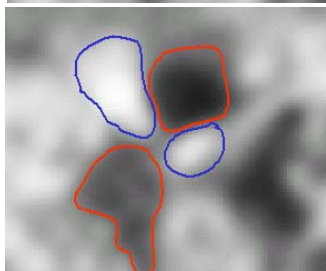
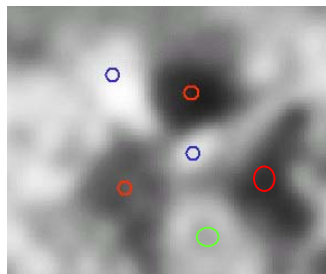


Anisotropic diffusion

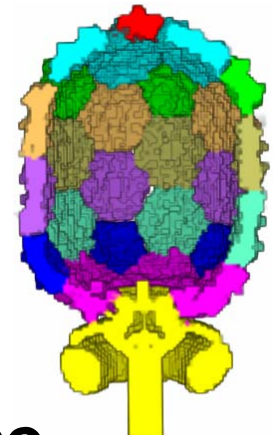
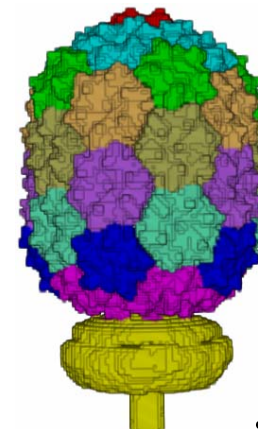
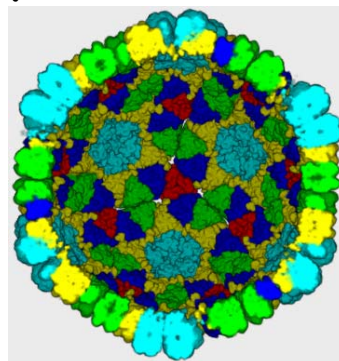
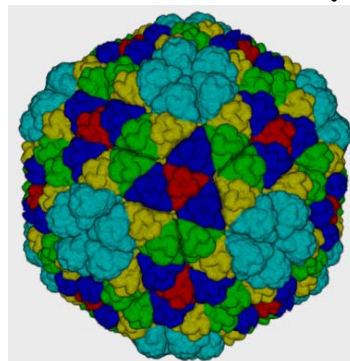


Structure Elucidation 1(B)

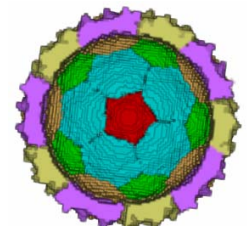
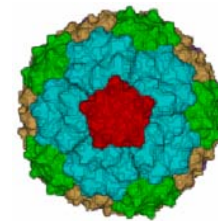
- Multi-seed Fast Marching Method
 - Classify map **critical points** as seeds based on local symmetry.
 - Each seed initializes a contour, with its group's membership.
 - Contours march simultaneously. Contours with same membership are merged, while contours with different membership stop each other.



RDV



Φ_{29}



Z. Yu, and C. Bajaj, IEEE Trans.on Image Process, 2005. 144(1-2), pp. 132-143.

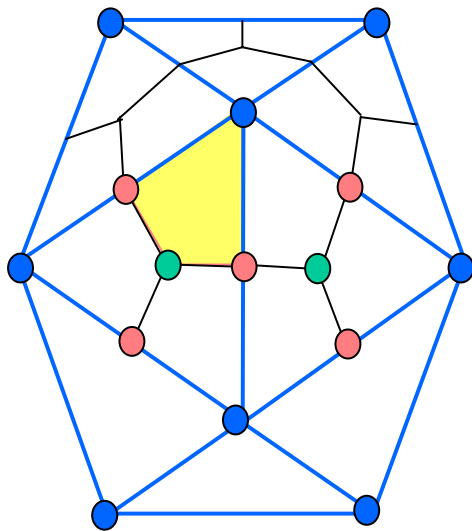
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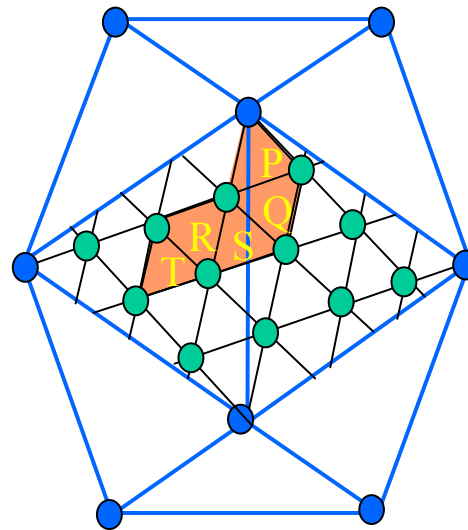
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Global and Local Symmetry

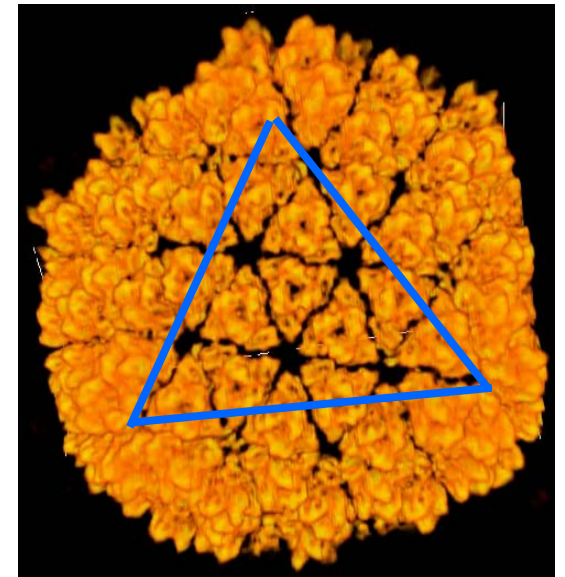
- Automatic structure unit identification in a 3D Map



- Two-fold vertices
- Three-fold vertices
- Five-fold vertices



Example: RDV



Symmetry Detection: Correlation Search

$$C(\theta, \varphi) = \sum_{\vec{r} \in V} f(\vec{r}) f(R_{(\theta, \varphi, 2\pi/5)} \cdot \vec{r})$$

- **Algorithm:** *detect 5-fold rotation symmetry*

- Compute the scoring function

- For every angular bin B_j , compute θ_j, φ_j {

- For every critical point C_i {

$$\vec{r}_k(C_i, B_j) = R_{(\theta_j, \varphi_j, 2k\pi/5)} \cdot C_i, \quad k = 0, 1, 2, 3, 4$$

$$Dev(C_i, B_j) = \frac{1}{5} \sum_{k=0}^4 (f(\vec{r}_k) - \bar{f}) \}$$

$$SF(B_j) = \frac{1}{p} \sum_{i=0}^p Dev(C_i, B_j) \}$$

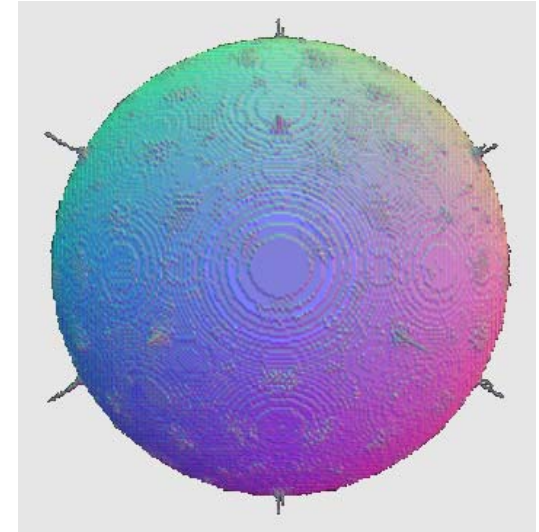
- Locate the symmetry axes

- The 12 peaks

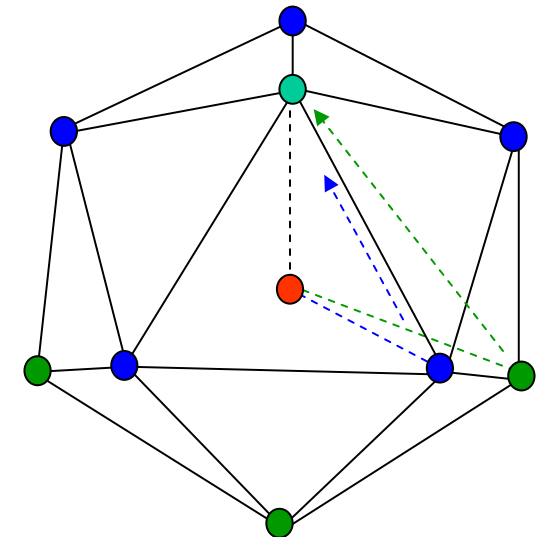
- Refine the symmetry axes

- In order to locate a perfect icosahedron

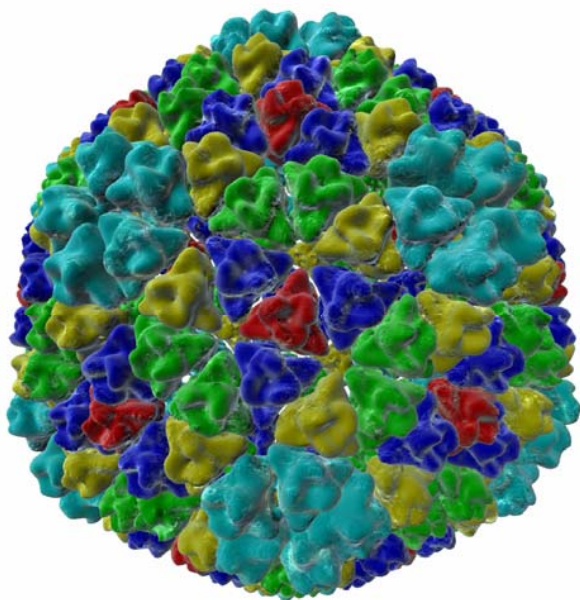
(rotate the axes by $0^\circ, 63.43^\circ, 116.57^\circ, 180^\circ$)



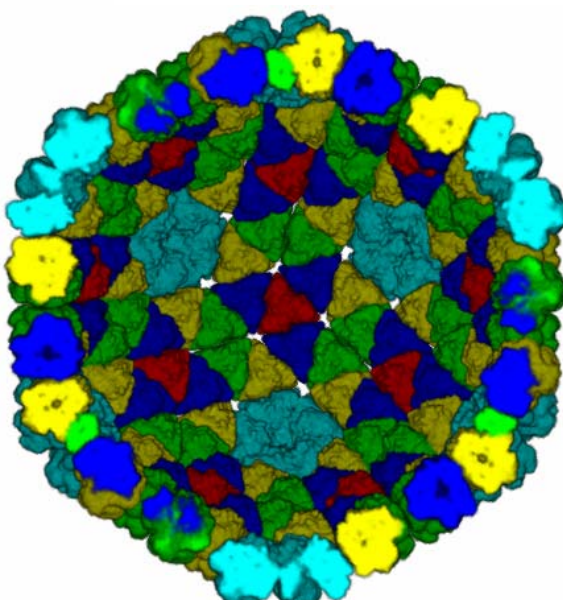
Inverted and normalized SF(Bj)



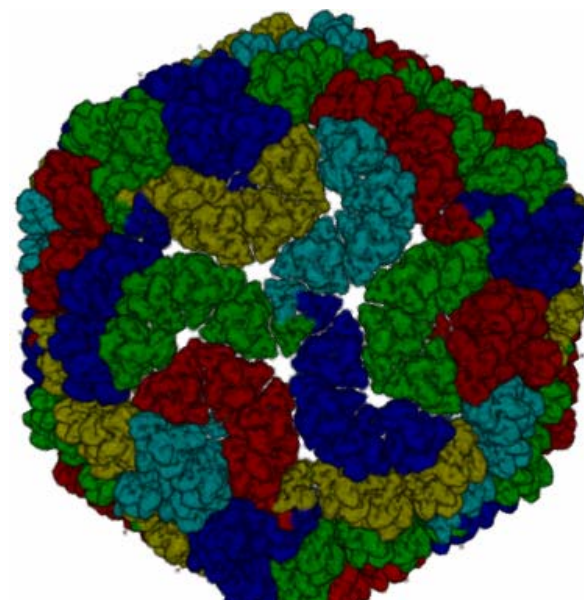
Structure Elucidation Results: RDV (Bakeoff)



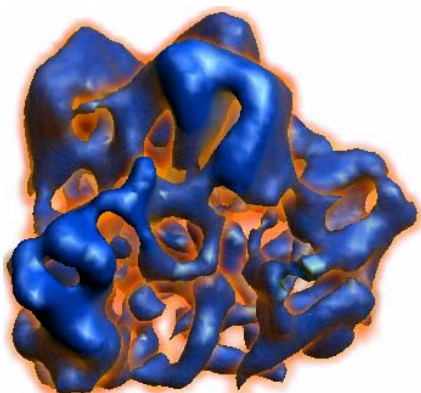
surface rendering (outside)



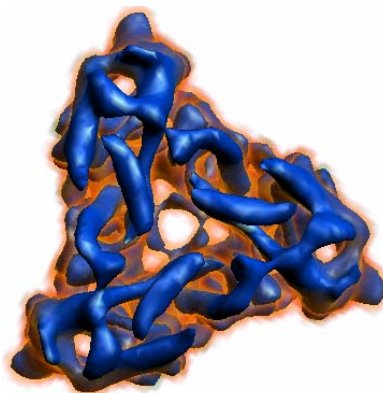
volume rendering (inside)



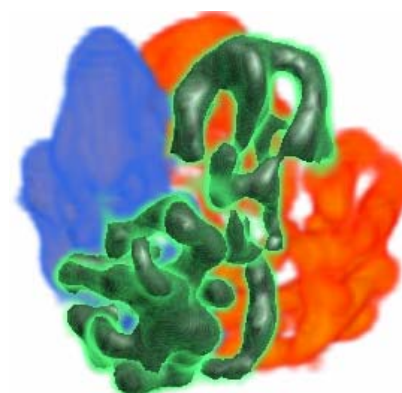
volume rendering (asymmetric unit)



averaged trimer (side)



averaged trimer (bottom)



segmented monomers

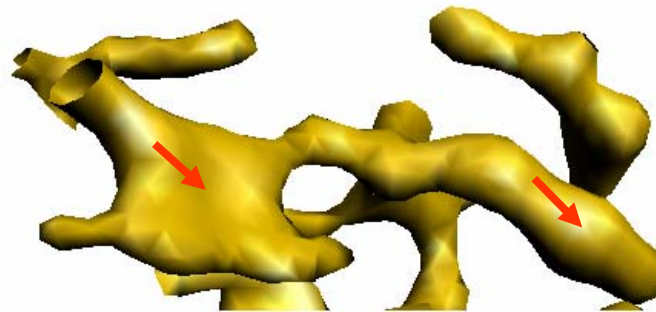
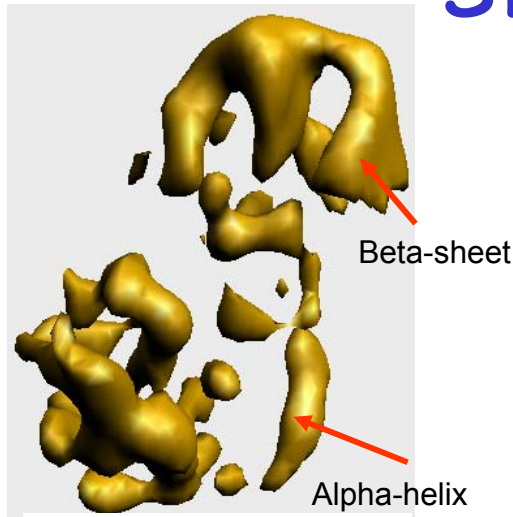


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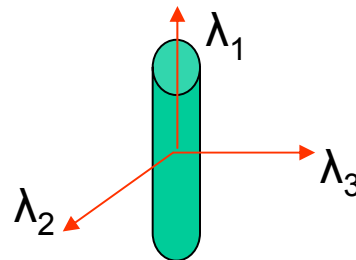
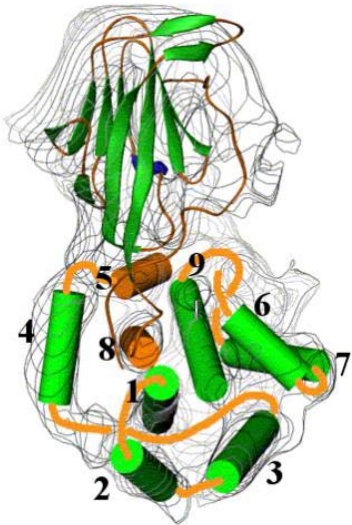
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Structure Elucidation 1(C): Secondary Structure Identification



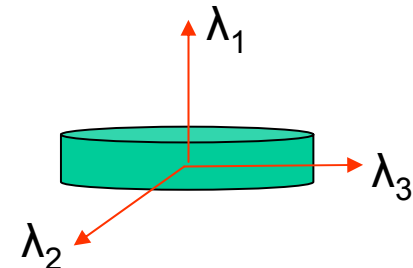
$$G_{\sigma} * \begin{pmatrix} I_x^2 & I_x I_y & I_x I_z \\ I_x I_y & I_y^2 & I_y I_z \\ I_x I_z & I_y I_z & I_z^2 \end{pmatrix}$$

The eigenvectors of the local structure tensor give the principal directions of the local features:



Line structure (alpha-helix)

$$\lambda_2 \approx \lambda_3 \gg \lambda_1 \approx 0$$

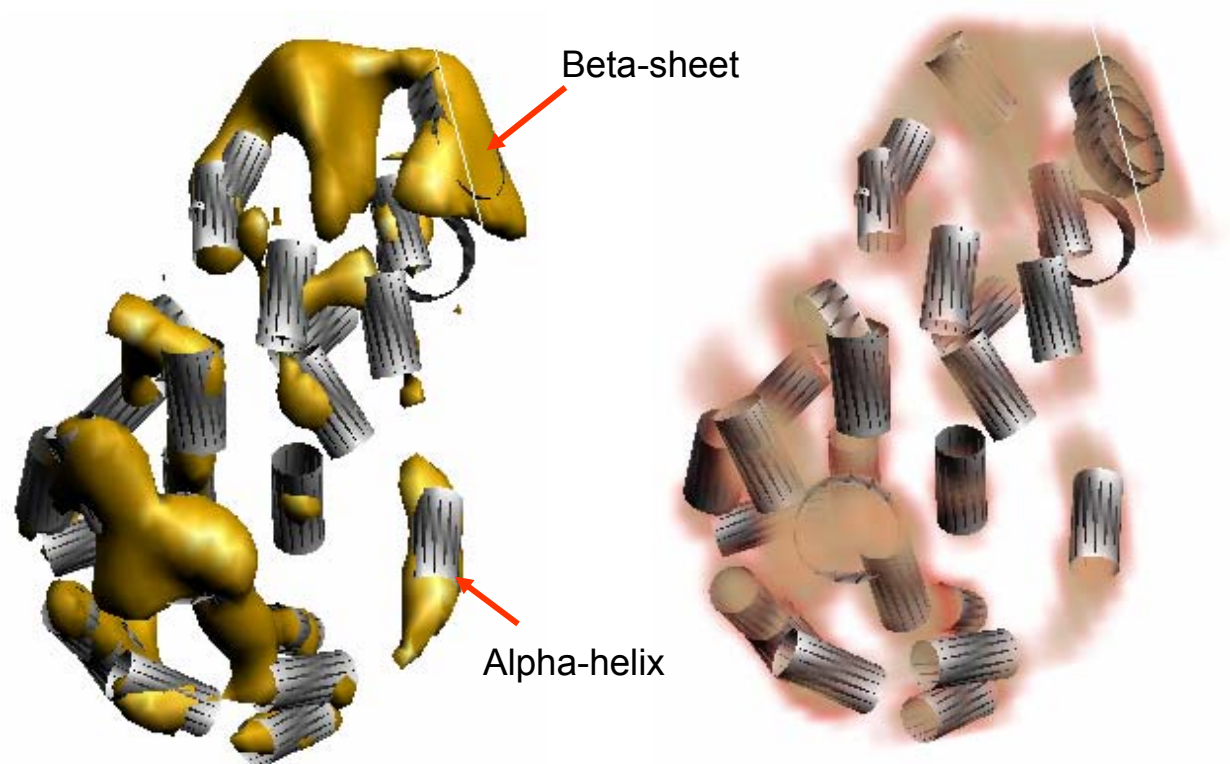
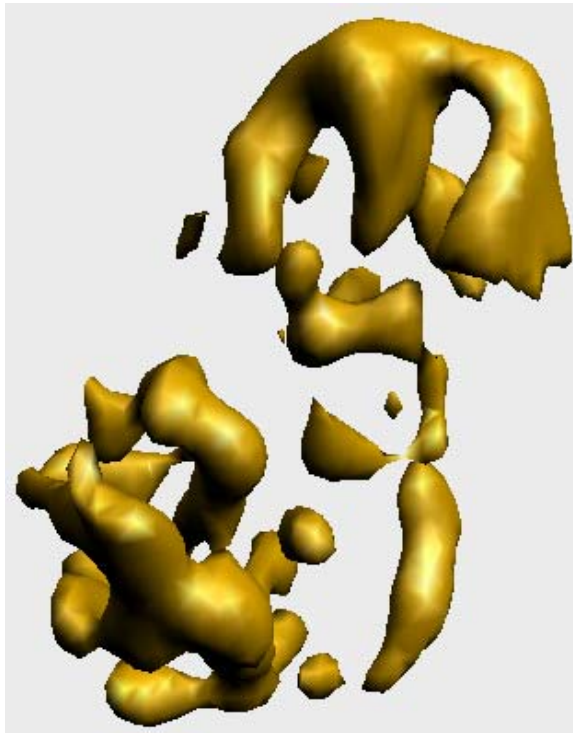


plane structure (beta-sheet)

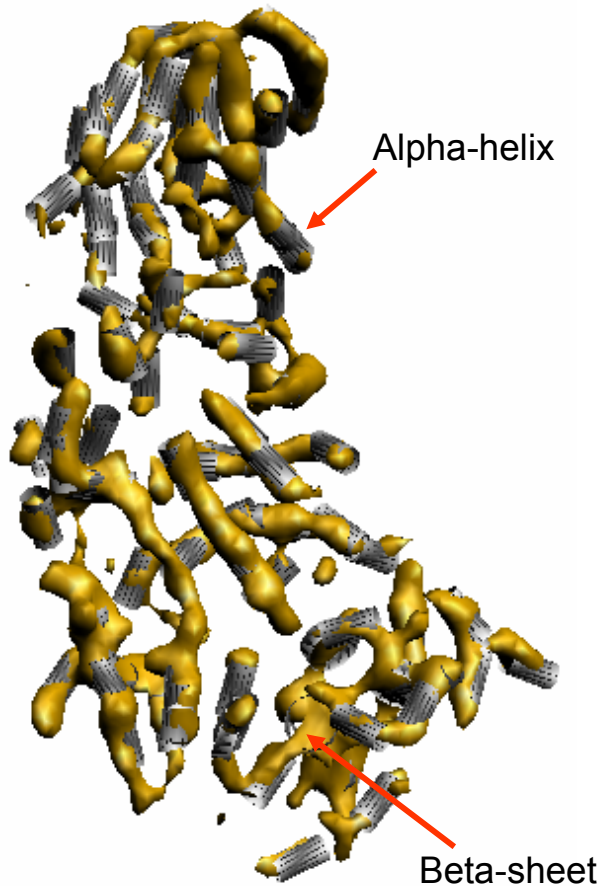
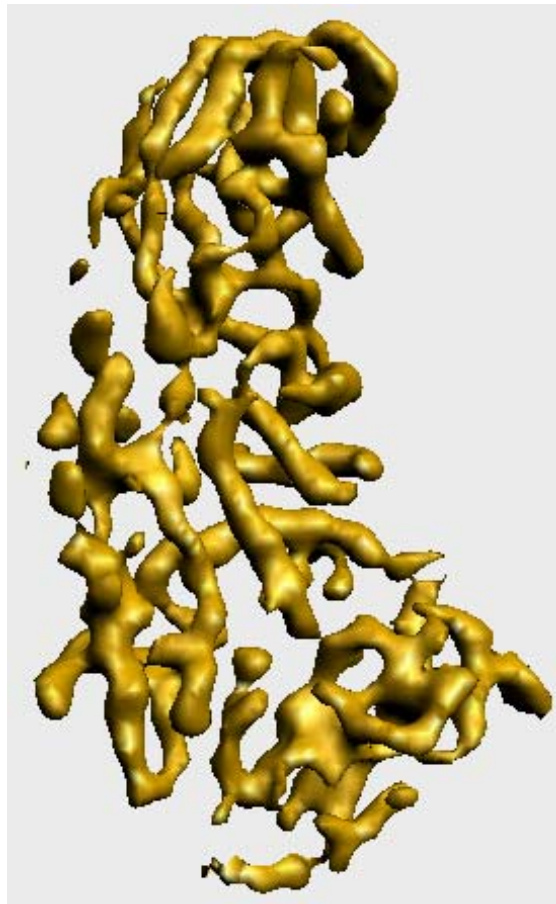
$$\lambda_1 \gg \lambda_2 \approx \lambda_3 \approx 0$$



Monomeric Unit of Outer Capsid of RDV

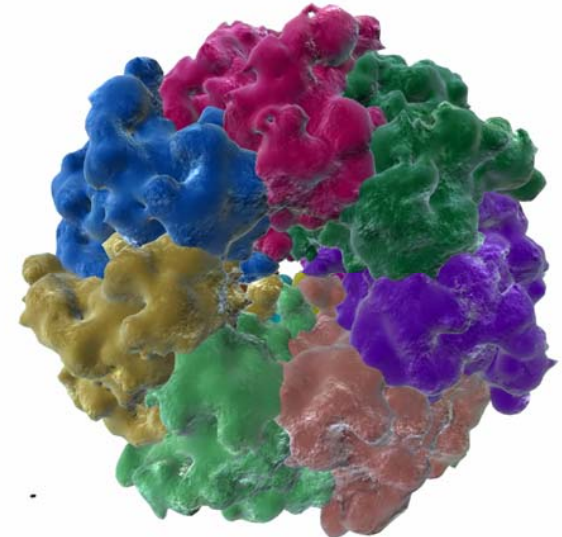
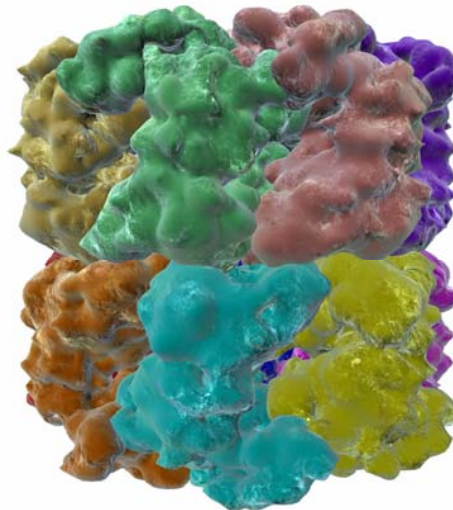
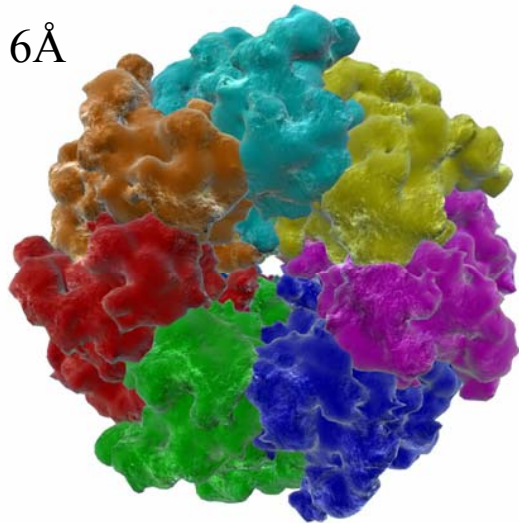


Monomeric Unit of Inner Capsid of RDV

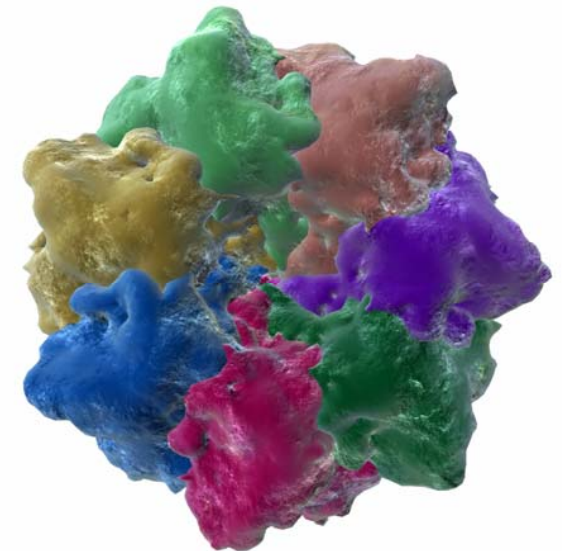
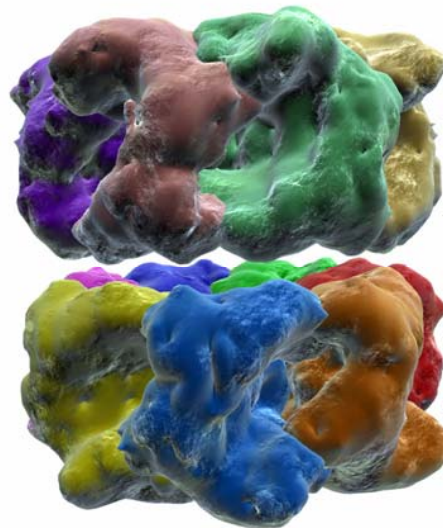
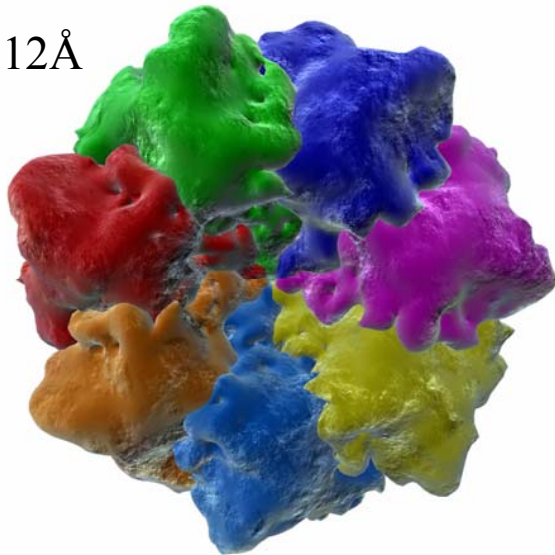


Structure Elucidation Results: GroEL

6Å



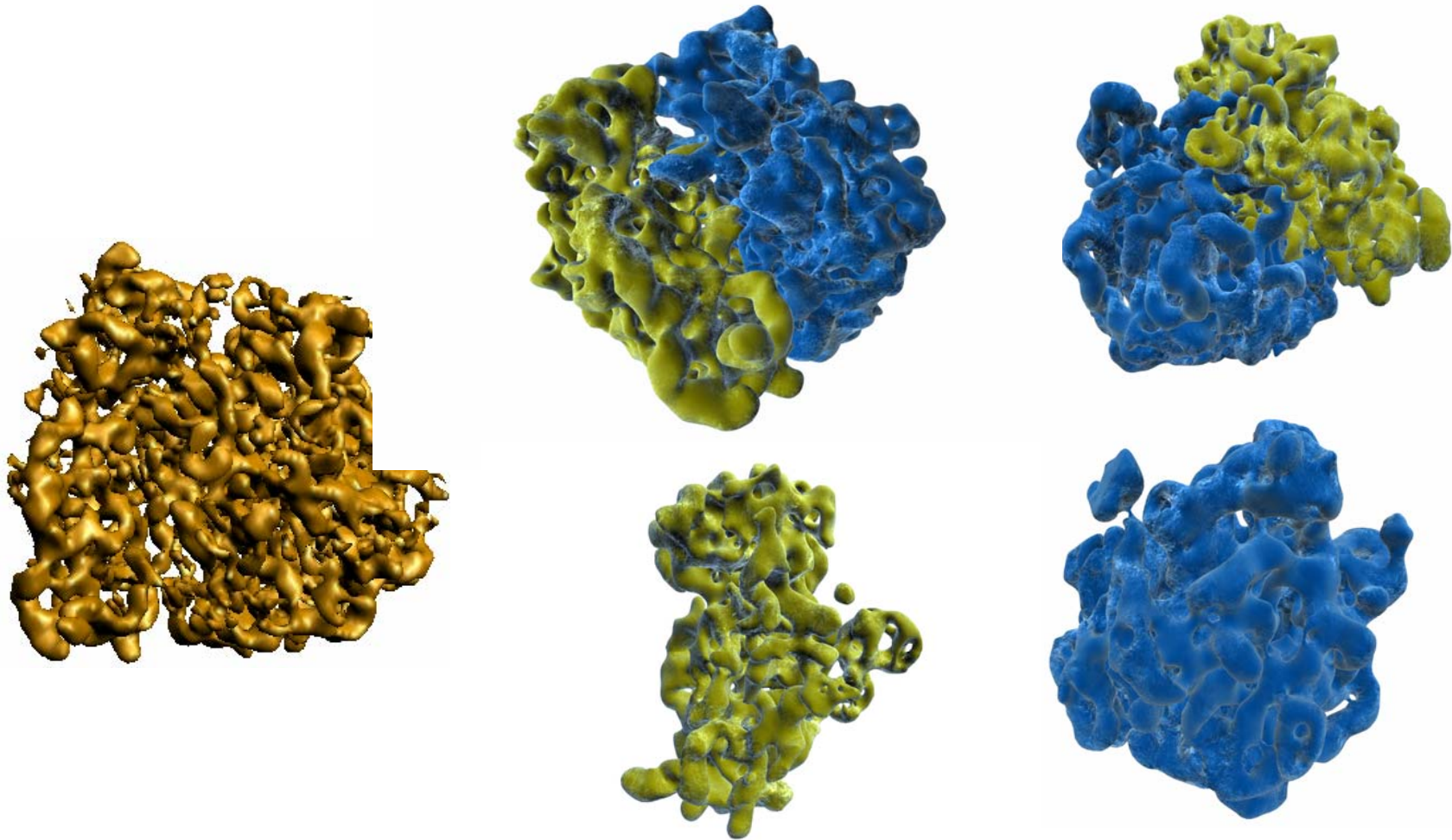
12Å



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Data courtesy: Dr. Wah Chiu
University of Texas at Austin
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Segmentation Results: Ribosome (Bakeoff)



70S ribosome from E. coli complex. 70S-tRNA^{fMet}-MF-tRNA^{Phe}. Data courtesy: EBI & J.Frank

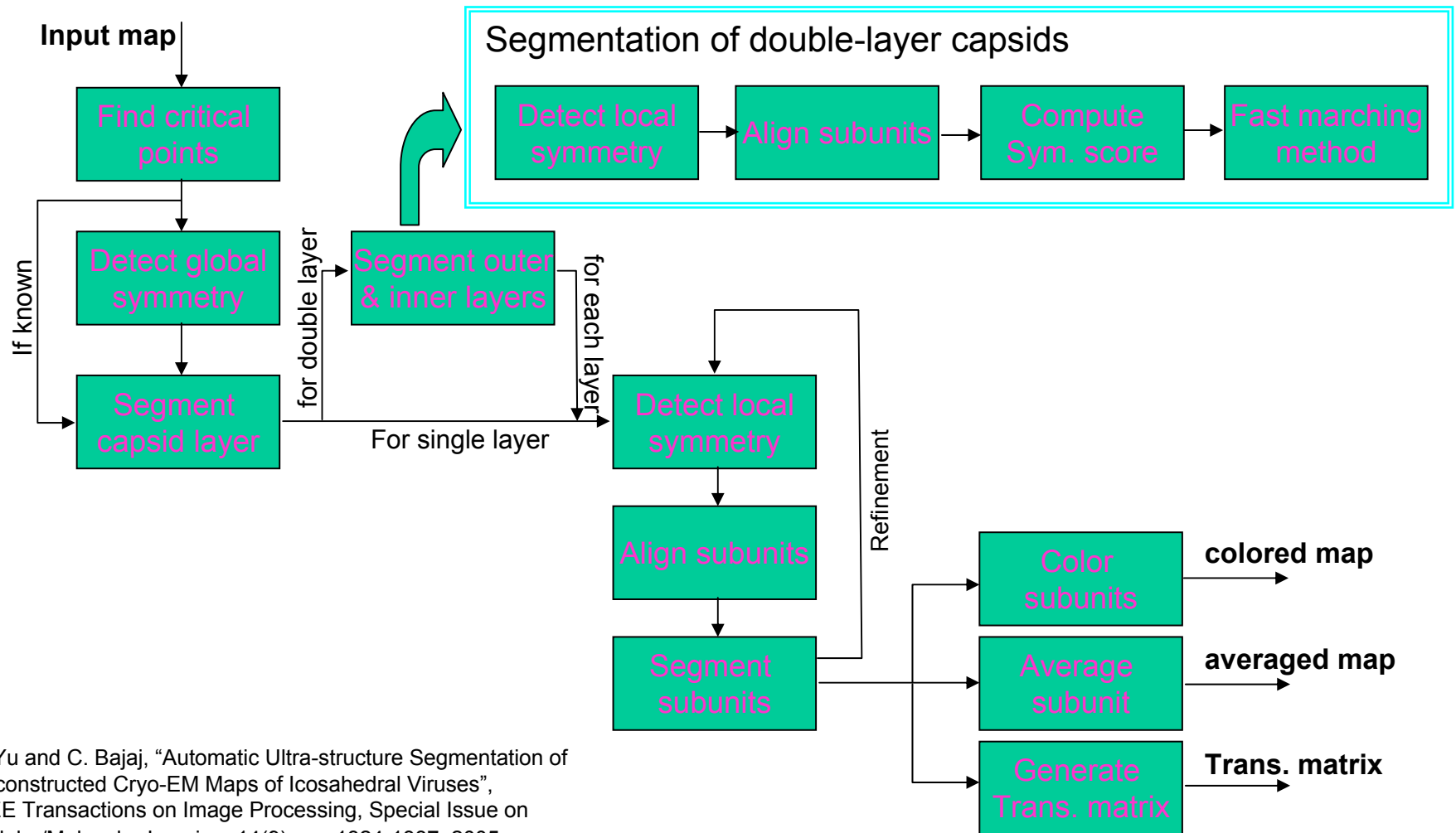


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Structure Elucidation for Symmetric Capsid Viruses



Z. Yu and C. Bajaj, "Automatic Ultra-structure Segmentation of Reconstructed Cryo-EM Maps of Icosahedral Viruses", IEEE Transactions on Image Processing, Special Issue on Cellular/Molecular Imaging, 14(9), pp. 1324-1337, 2005.



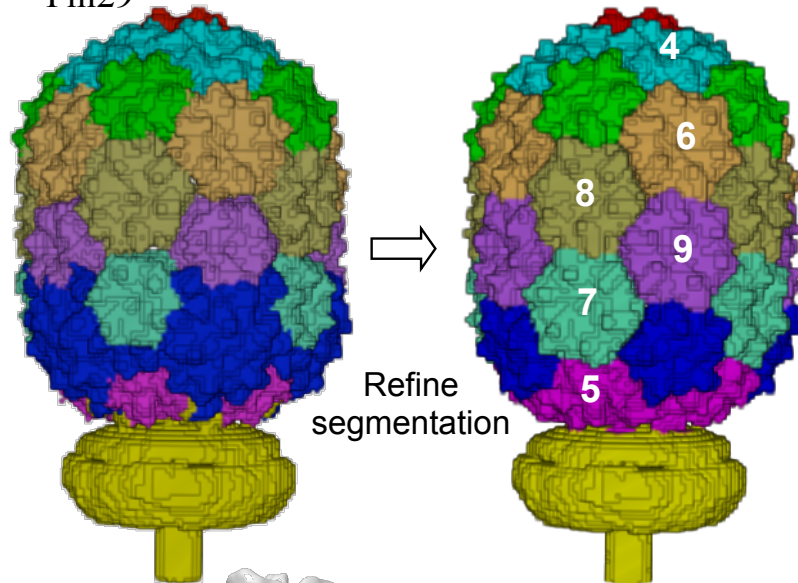
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Subunit Alignment (Simul. Structure Fitting)

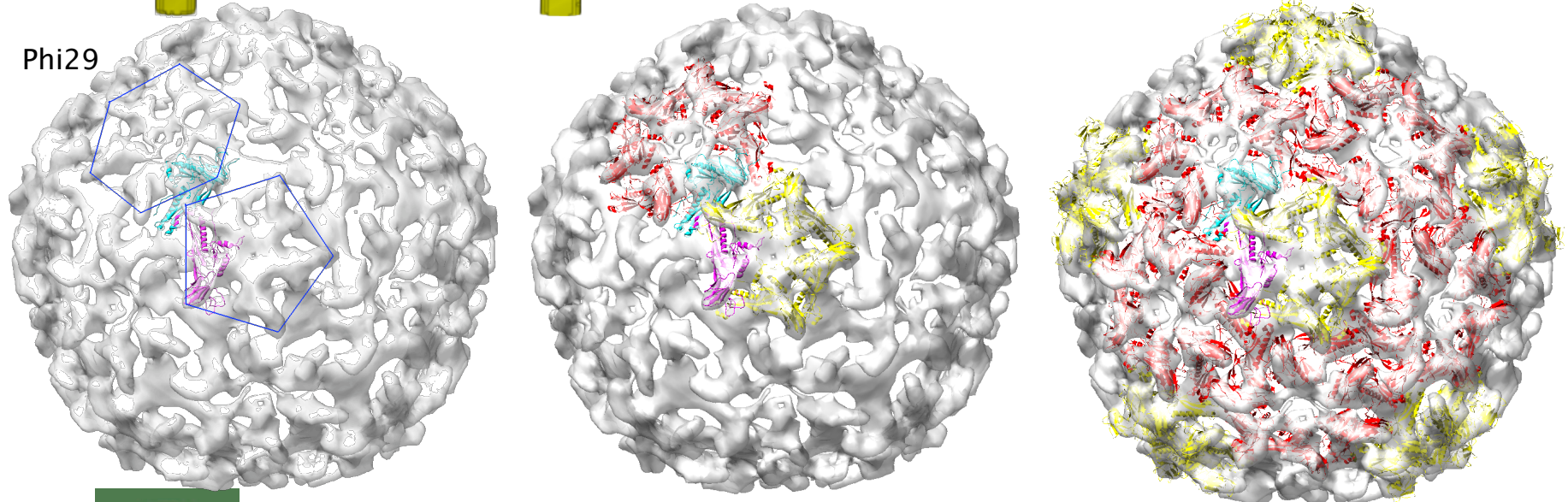
Phi29



Similarity table

	#4	#5	#6	#7	#8	#9
#4	0.97	0.79	0.95	0.94	0.87	0.88
#5		0.81	0.79	0.78	0.77	0.79
#6			0.98	0.96	0.88	0.88
#7				0.96	0.89	0.88
#8					0.87	0.94
#9						0.81

Phi29

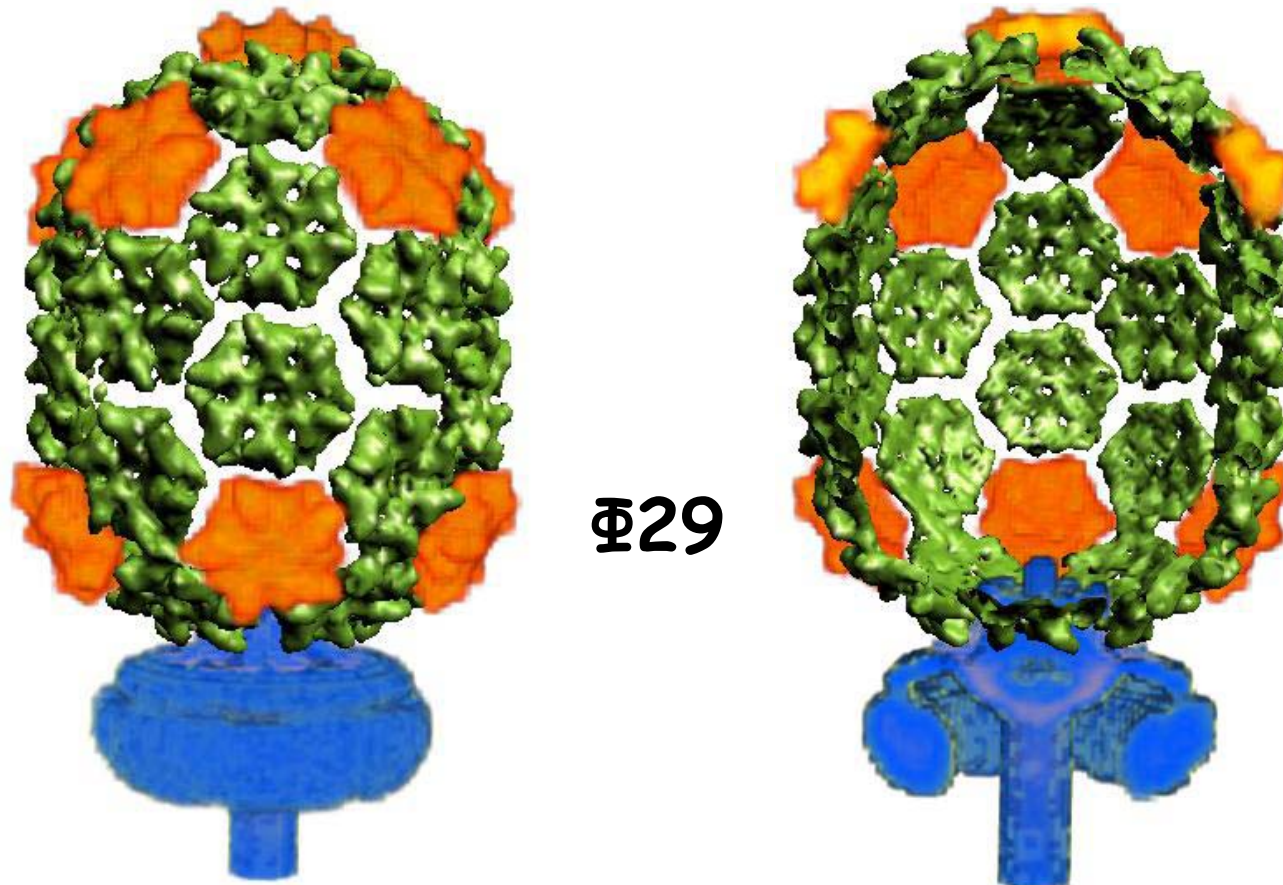


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August 2008

Subunit alignment (1): averaging



The above two pictures (left: outer; right: inner) show the averaged capsid layer, calculated from one 5-fold subunit (orange) and one 6-fold subunit (green). The tail structure (blue) is augmented after the averaging.



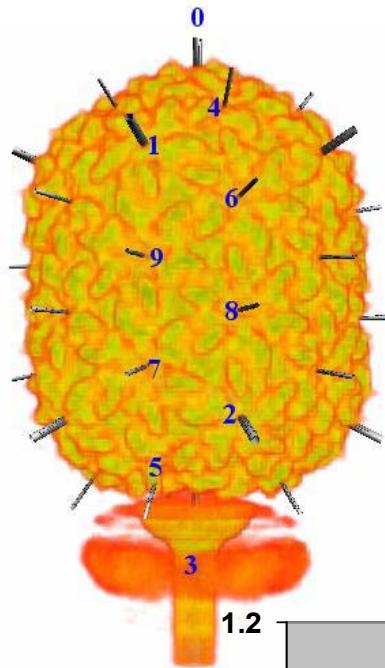
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Department of Computer Sciences

Data courtesy: Tim Baker

University of Texas at Austin

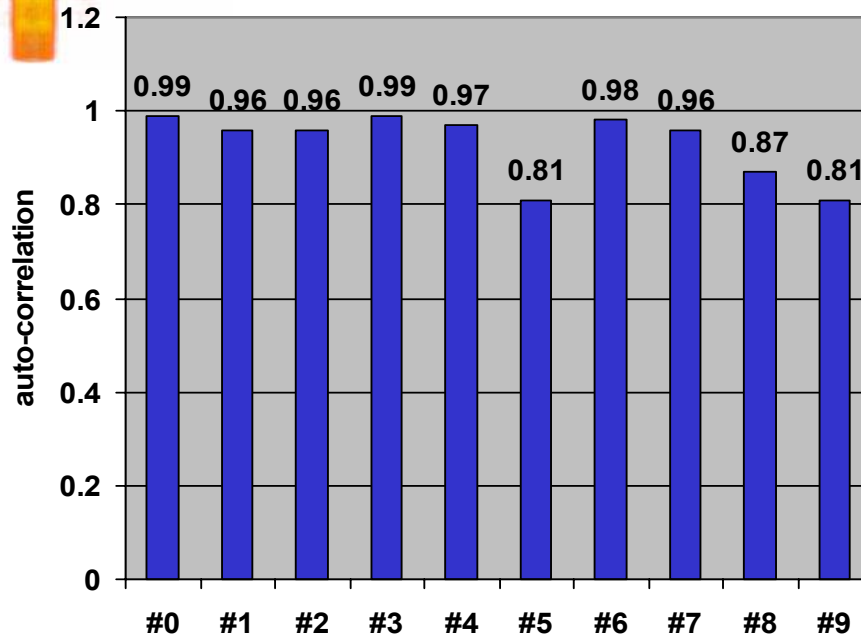
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Structure Elucidation 1(C): Subunit Alignment



- Symmetry score

Φ29



- Cross-correlation

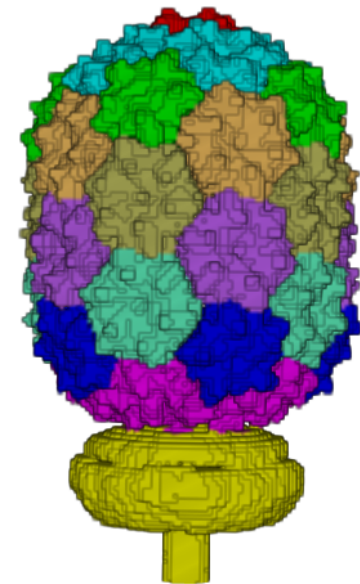
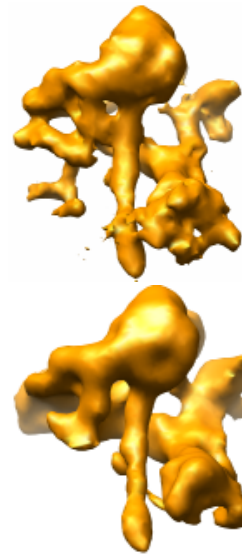
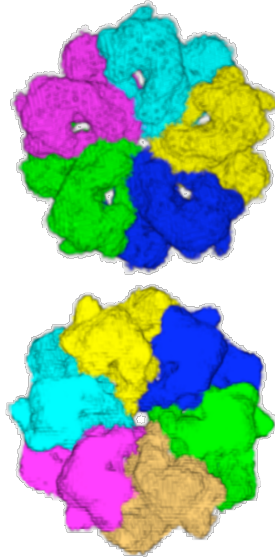
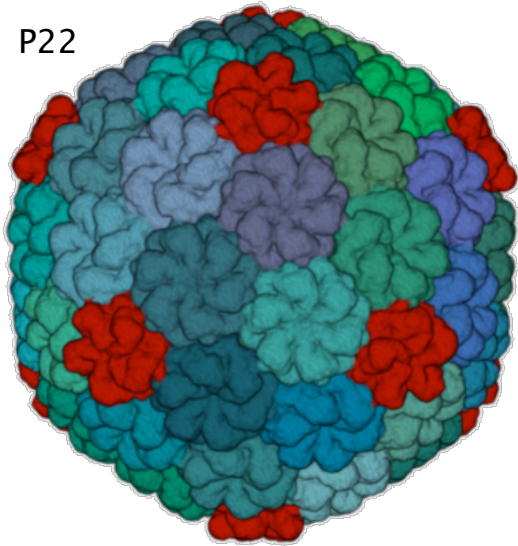
	#0	#1	#2	#3
#0	1	0.95	0.95	0.34
#1	0.95	1	0.96	0.31
#2	0.95	0.96	1	0.31
#3	0.35	0.31	0.32	1

	#4	#5	#6	#7	#8	#9
#4	1	0.79	0.95	0.94	0.87	0.88
#5	0.79	1	0.79	0.78	0.77	0.79
#6	0.95	0.79	1	0.96	0.88	0.88
#7	0.94	0.78	0.96	1	0.89	0.88
#8	0.87	0.77	0.88	0.89	1	0.94
#9	0.88	0.79	0.88	0.88	0.94	1



Subunit Segmentation

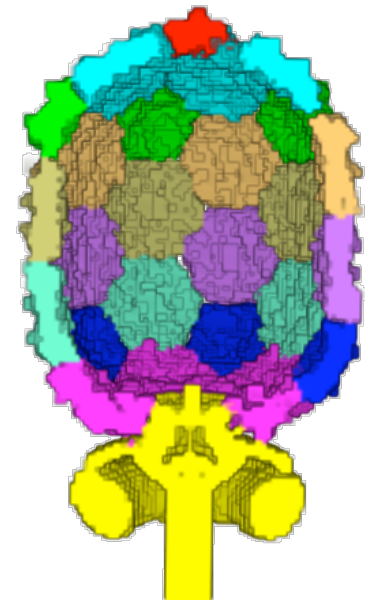
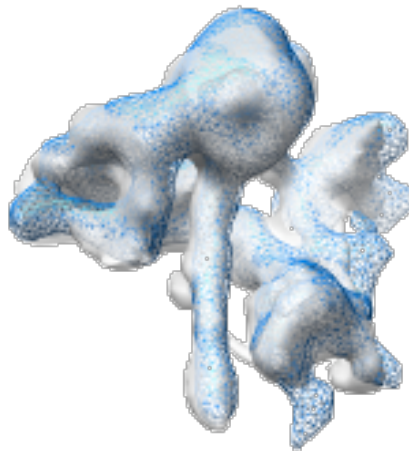
P22



Correlation Score with manually segmented subunits:

5-fold: **0.72**

6-fold: **0.79**

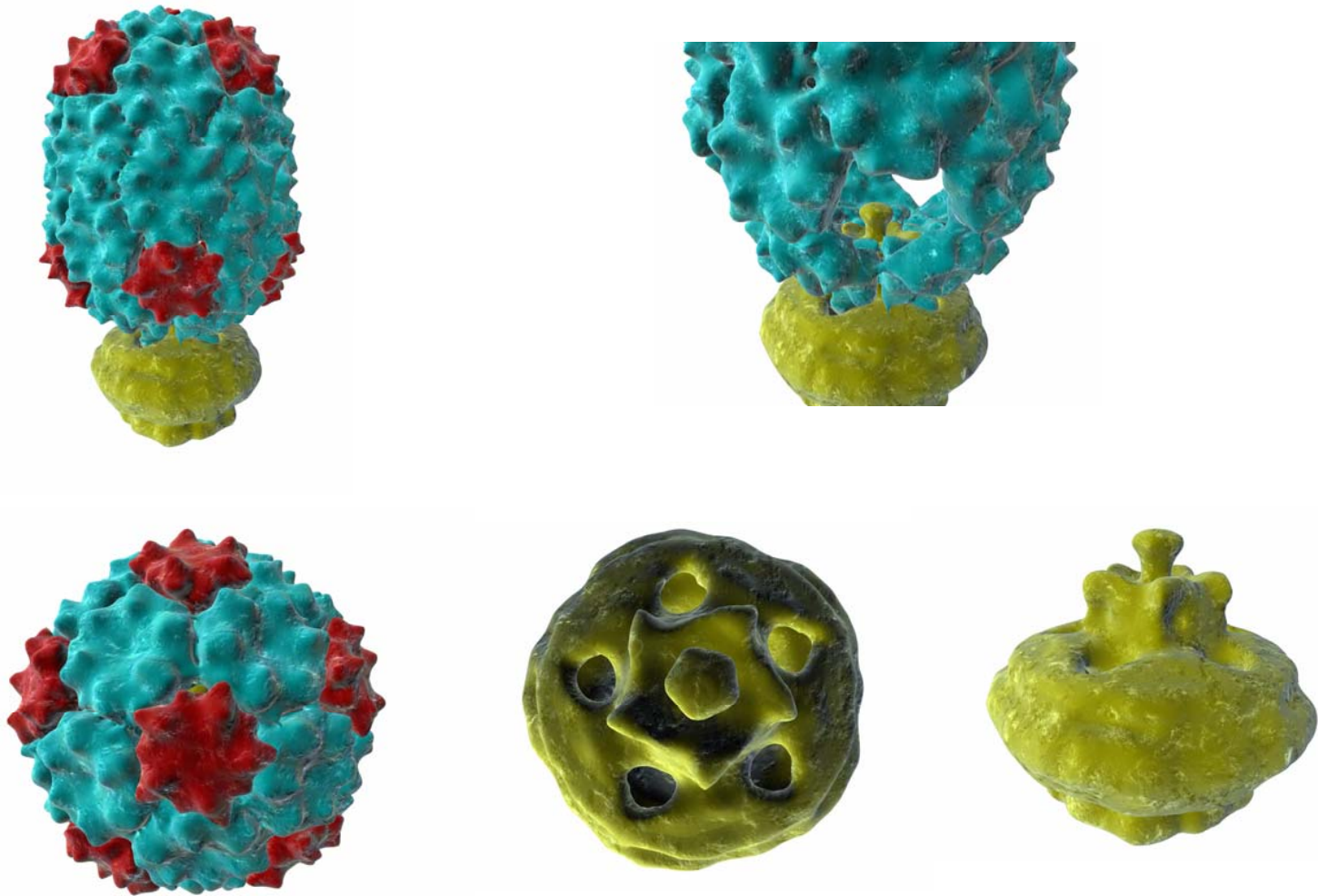


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University of Texas at Austin

August 2008

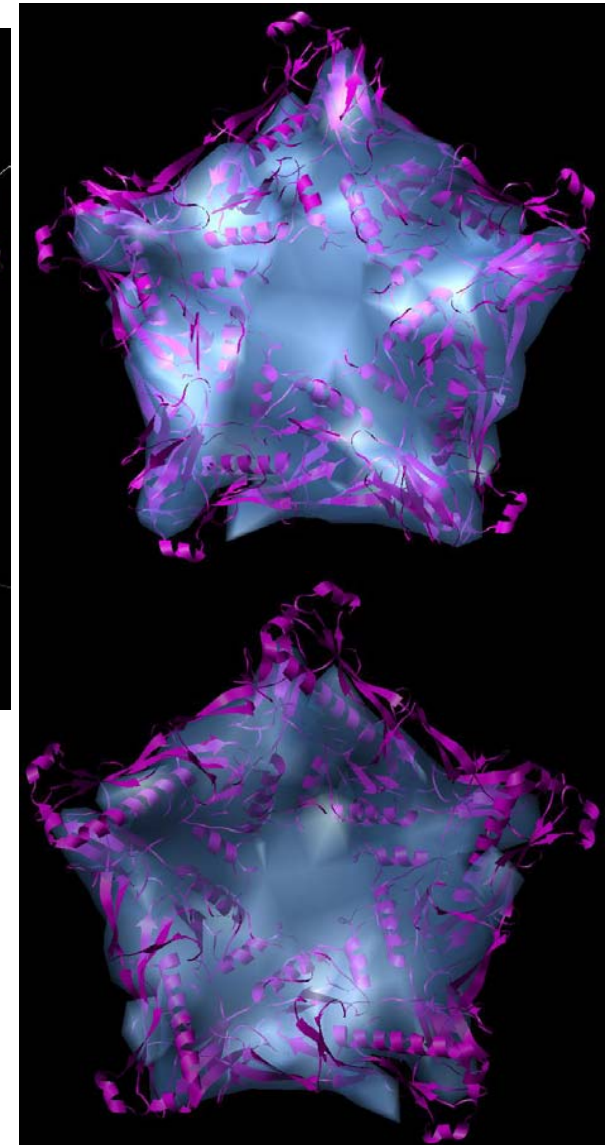
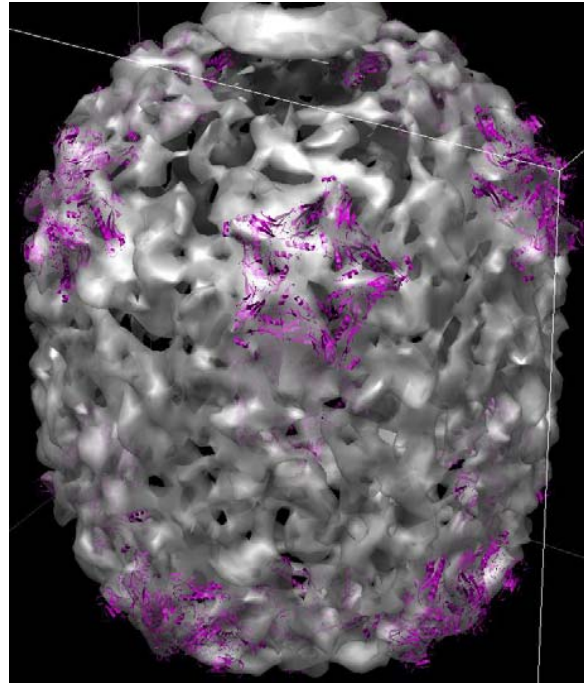
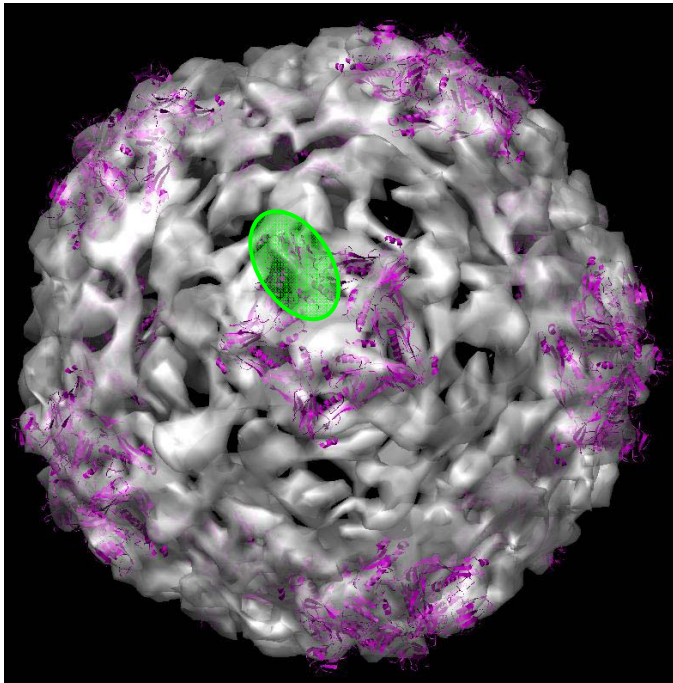
Structure Elucidation Results: $\Phi 29$



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Data courtesy: Tim Baker
University of Texas at Austin
September 2007

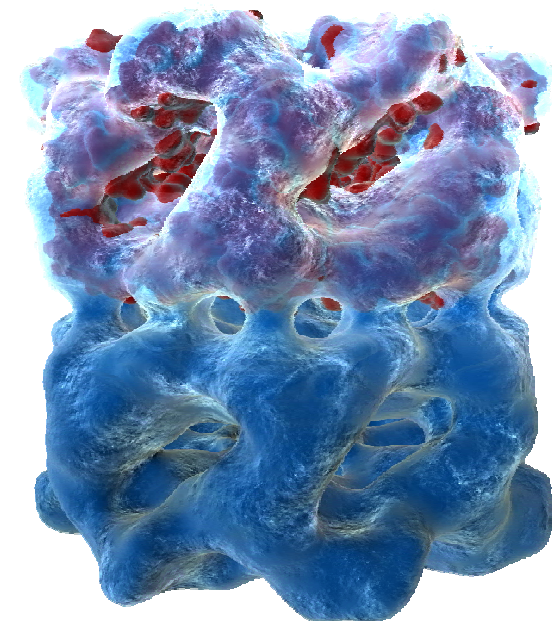
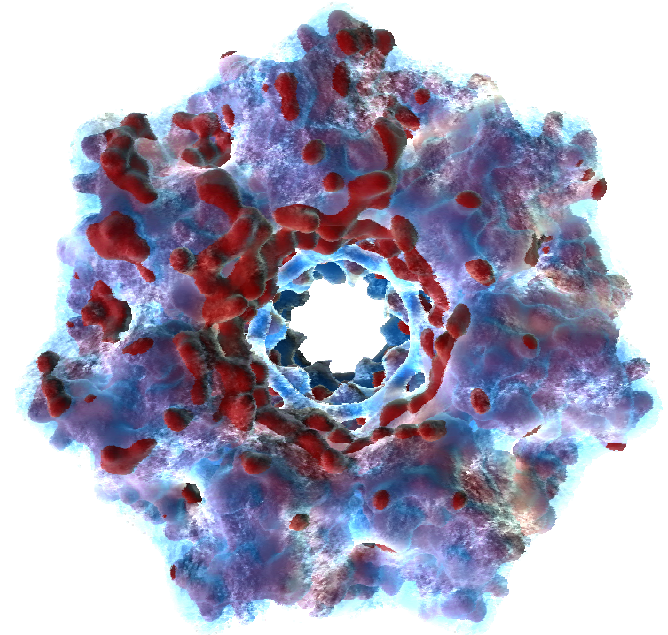
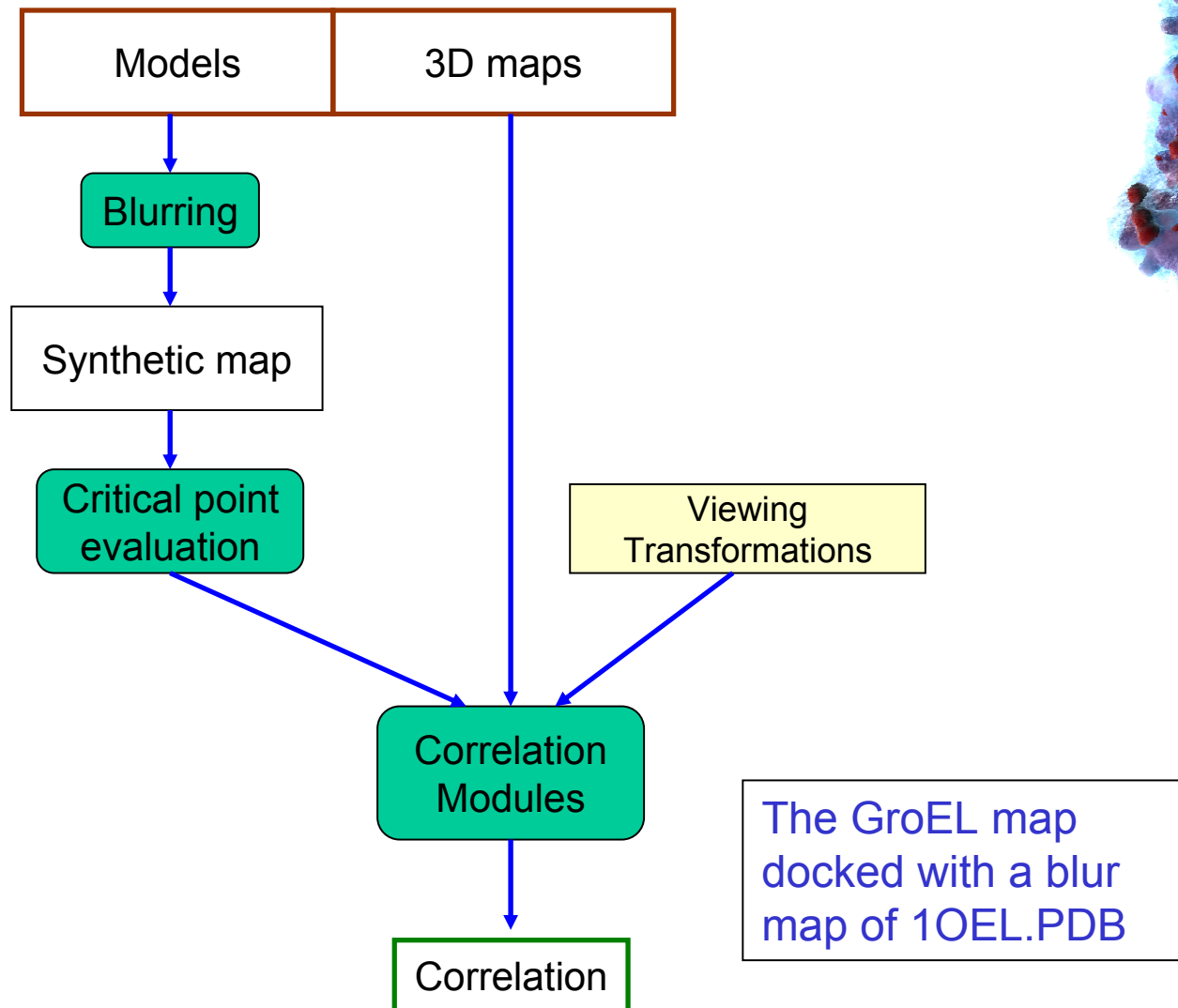
Subunit alignment (2): Fitting



The PDB structure of one monomer is matched & fit into the cryo-EM map (as shaded in green in the left figure). Then all the quasi-symmetric 5-fold subunits are computationally fit with the PDB structure using the transform matrices obtained in subunit alignment. Similar procedure can be applied to all 6-fold subunits.



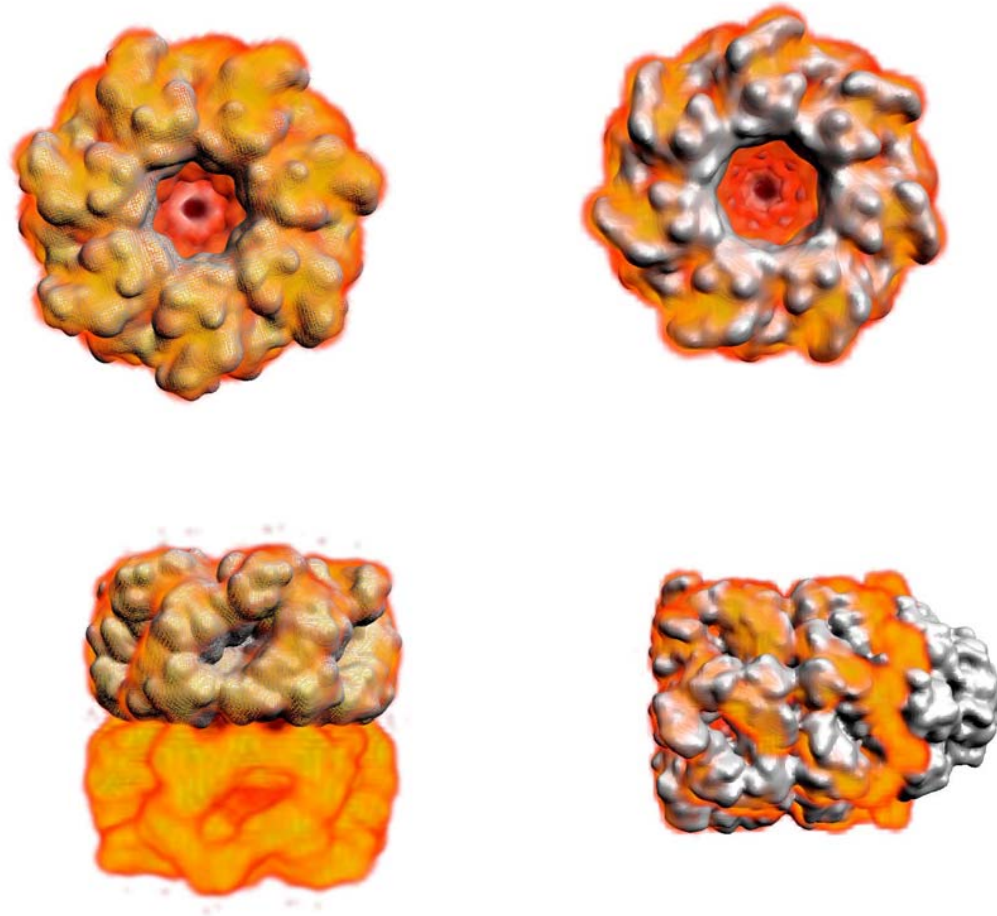
“Interactive” Fitting



The GroEL map
docked with a blur
map of 1OEL.PDB

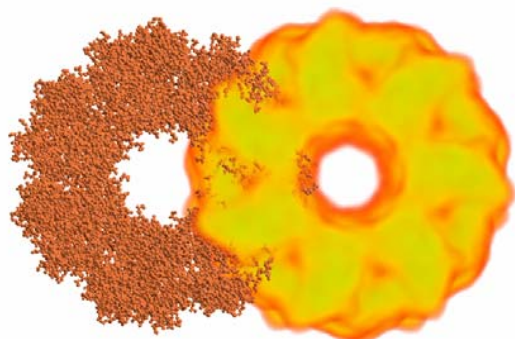


Gro-EL: X-ray structures docked in Cryo-EM

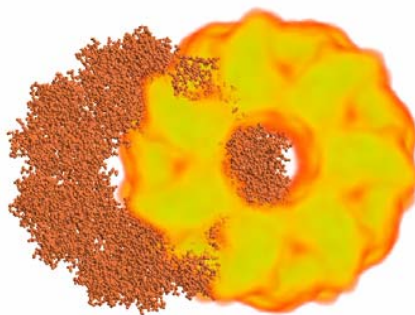


Interactive Correlation Analysis

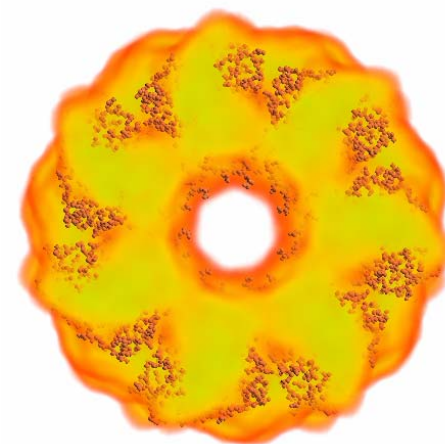
$C = 0.2235$



$C = 0.269$

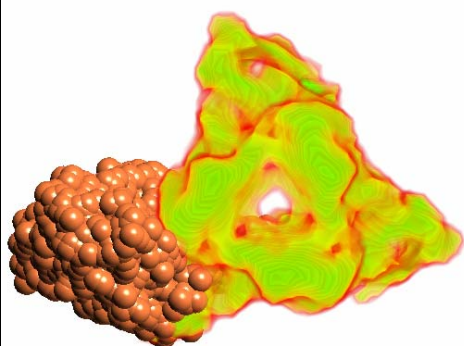


$C = 0.593$

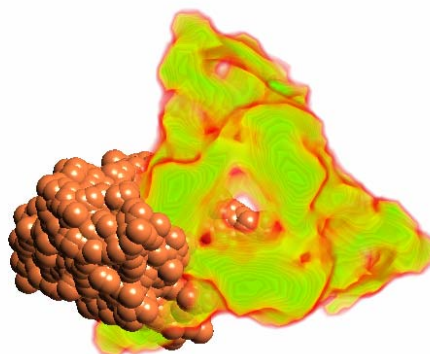


12A GroEL map and 1OEL.pdb

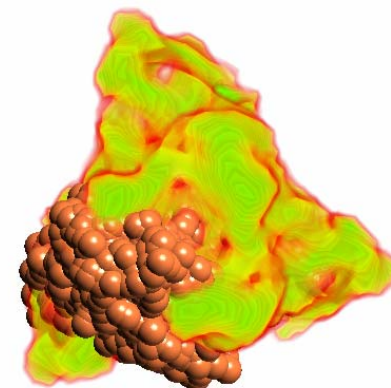
$C = 0.208$



$C = 0.387$



$C = 0.542$



6.8A RDV map and 1UF2.pdb



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Approximate Correlation Analysis

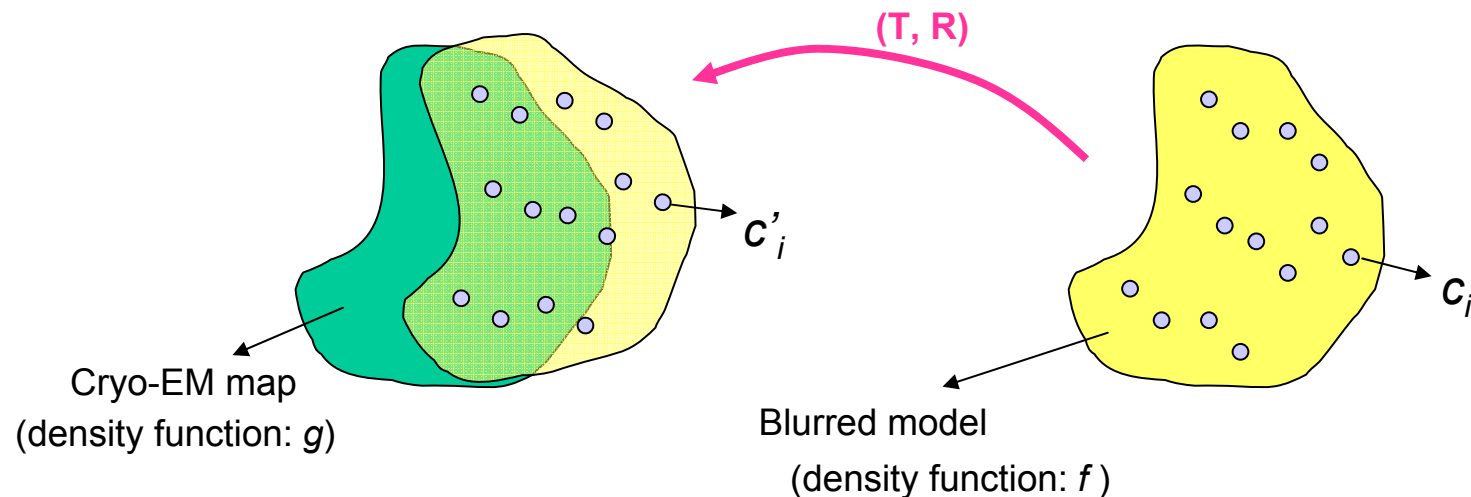
$$score = 1 - \frac{\sum_{i=1}^N |f(c_i) - g(c'_i)|}{\sum_{i=1}^N \max(f(c_i), g(c'_i))}$$

Where f is the normalized density function of the blurred crystal structure;

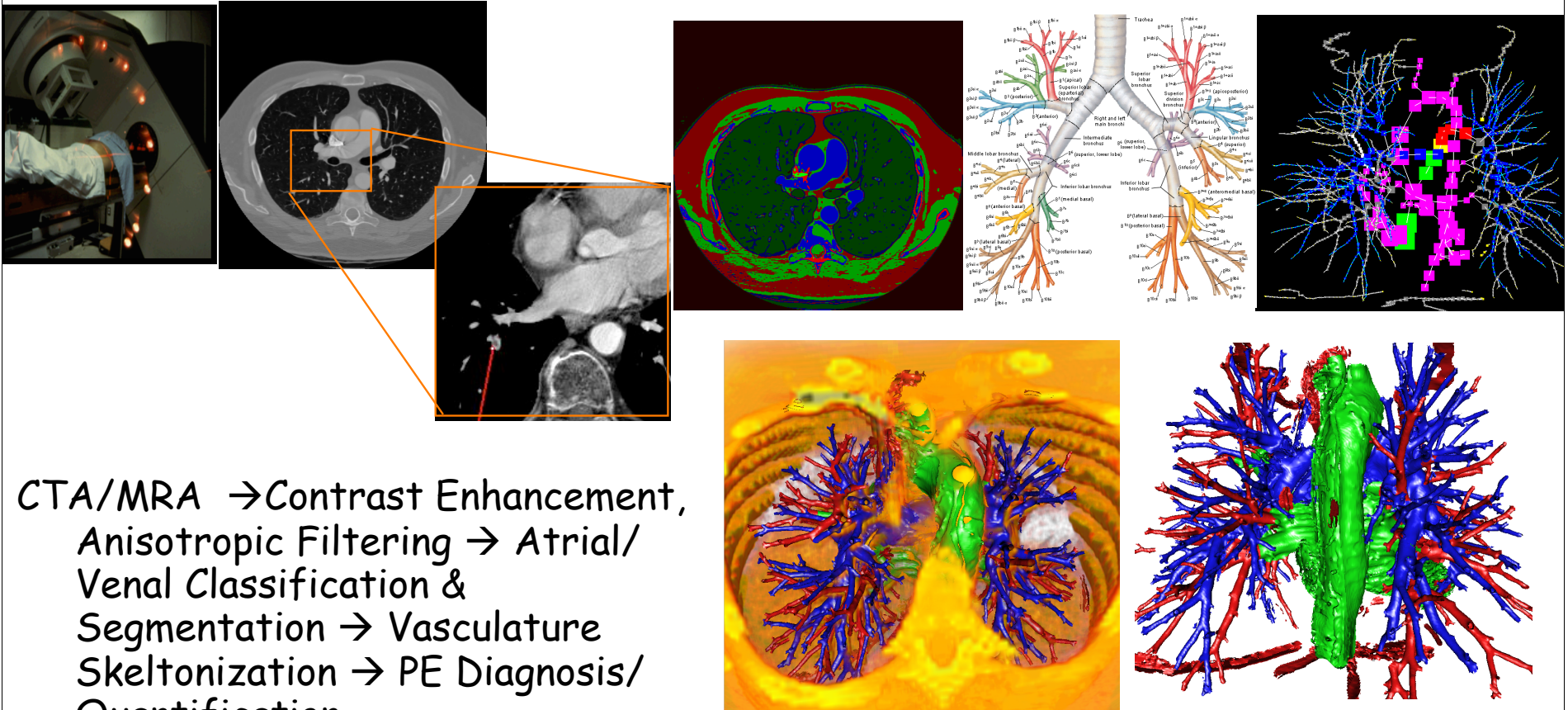
g is the normalized density function of the cryo-EM map;

c_i , $i=1,2,\dots,N$, are the critical points of the blurred crystal structure;

c'_i , $i=1,2,\dots,N$, are the transformations of the critical points.



Computer Assisted Radiology: Pulmonary Embolus Cancer Detection



CTA/MRA → Contrast Enhancement,
Anisotropic Filtering → Atrial/
Venal Classification &
Segmentation → Vasculature
Skeltonization → PE Diagnosis/
Quantification

S. Park, CS, Ph.D.

(Collaborator: Dr. Gregory Gladish : MD Anderson
Cancer Center)

****Sponsored by Whitaker
Foundation**

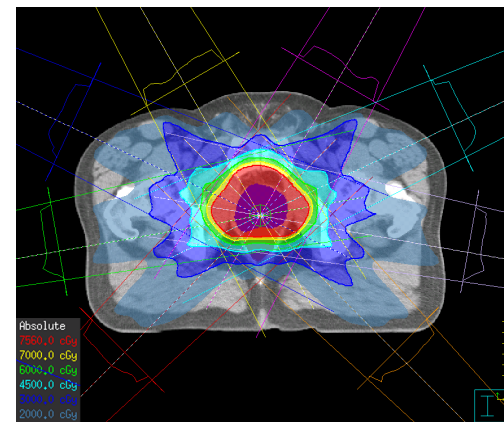
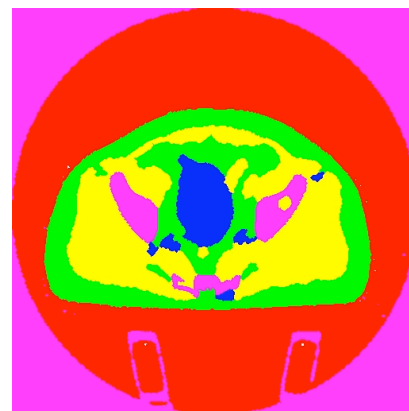
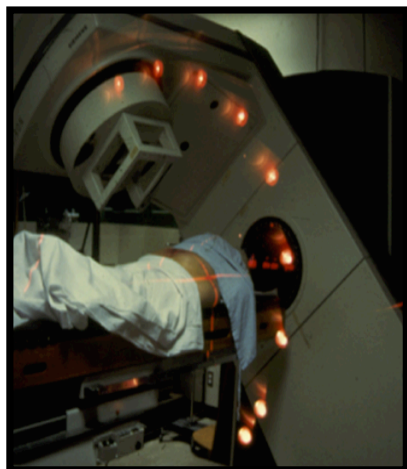


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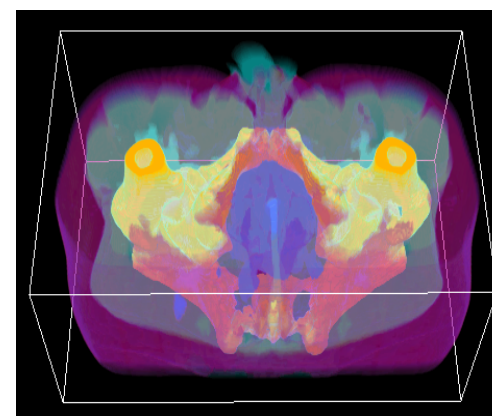
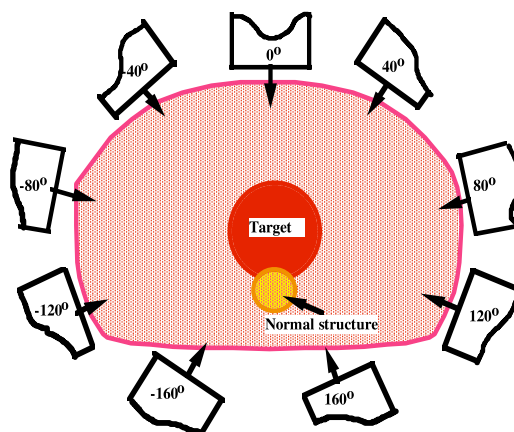
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4DRT: Radiation Treatment Planning



CT/MRI → Anisotropic and
Vector Diffusion Filtering
→ Classification &
Segmentation → Radiation
Dosage Estimation →
Treatment Plan → 4DRT
(mapping)



(Collaborators: Dr. Radhe Mohan, Dr. Lei Dong,
Dr. John Hazle : MD Anderson Cancer Center)

****Sponsored by NSF-DDDAS**



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Additional Reading

- The references given below include the ones cited in the lecture slides. Please check for pdf's of these references on university computers from <http://cvcweb.ices.utexas.edu/cvc/papers/papers.php>

- C. Bajaj, S. Goswami
Multi-Component Heart Reconstruction from Volumetric Imaging
Proc. of the ACM Solid and Physical Modeling Symposium, Stony Brook, NY, 2008,
- Z. Yu, C. Bajaj
Computational Approaches for Automatic Structural Analysis of Large Bio-molecular Complexes
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- S. Park, C. Bajaj
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Handbook of Computational Molecular Biology, Edited by S. Aluru, Chapman & Hall/CRC Press, Computer and Information Science Series, December 21, 2005, ISBN: 1584884061.
- Z. Yu, C. Bajaj
A Fast and Adaptive Algorithm for Image Contrast Enhancement
Proceedings of 2004 IEEE International Conference on Image Processing (ICIP'04), Volume 2, Oct. 24-27 2004, Pages 1001-1004, Singapore.



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