Validation Methods

Simons Electron Microscopy Center Winter EM Course 2017-18

The dark side of single-particle EM

The great thing about single-particle EM: Every data set and processing approach yields a 3D map!

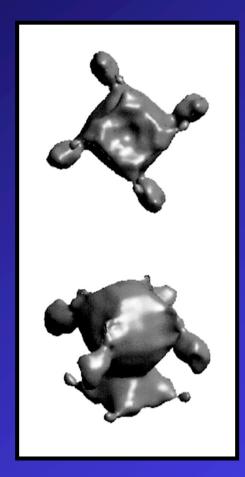
The <u>bad</u> thing about single-particle EM: Every data set and processing approach yields a 3D map!

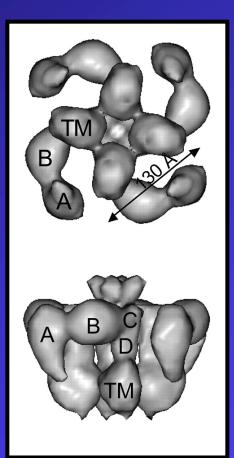
But is it correct???

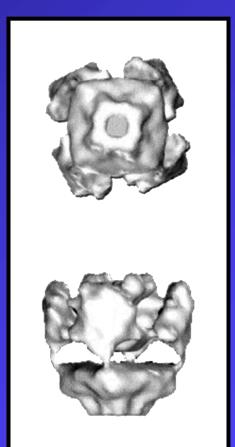


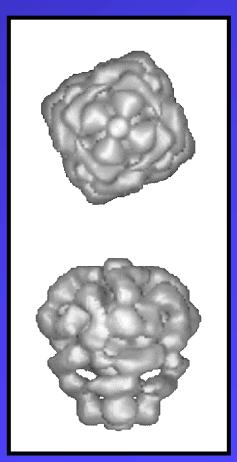
Particularly problematic for low-resolution maps

The issue: Structures of the IP3 receptor as determined by single-particle EM







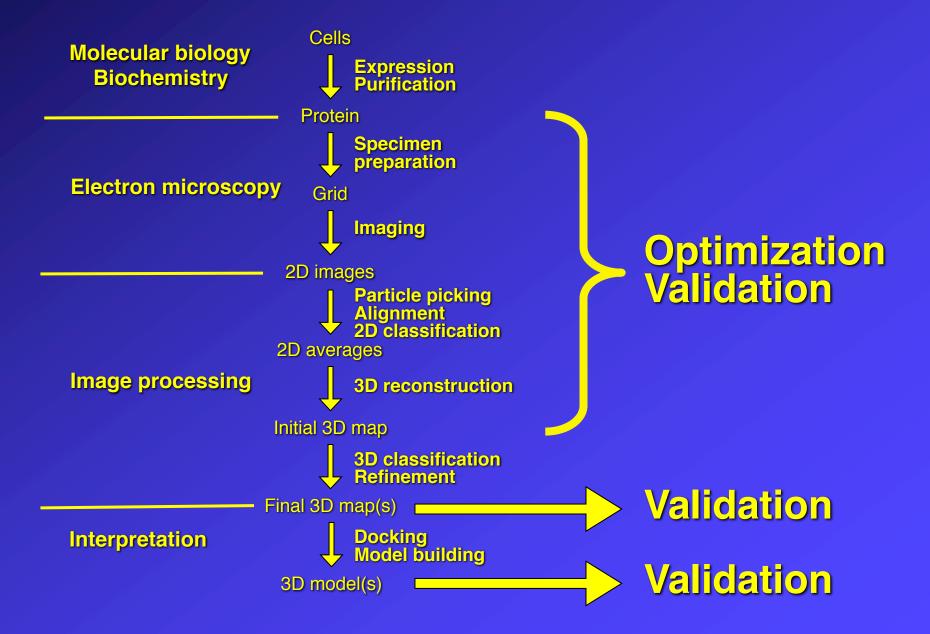


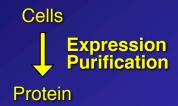
Jiang *et al.*, 2002

Serysheva *et al.*, 2003

Jiang *et al.*, 2003

Sato *et al.*, 2004





Potential issues:

Heterogeneity

- Compositional
- Conformational
 - Discrete states
 - Continuous movement

Effect of cross-linking

Potential issues with samples

Before attempting structure determination – Understand and optimize your sample!

Prepare negatively stained specimens:
Good contrast and preferred orientations

→ Easy to assess heterogeneity

If particles look heterogeneous:
Calculate class averages

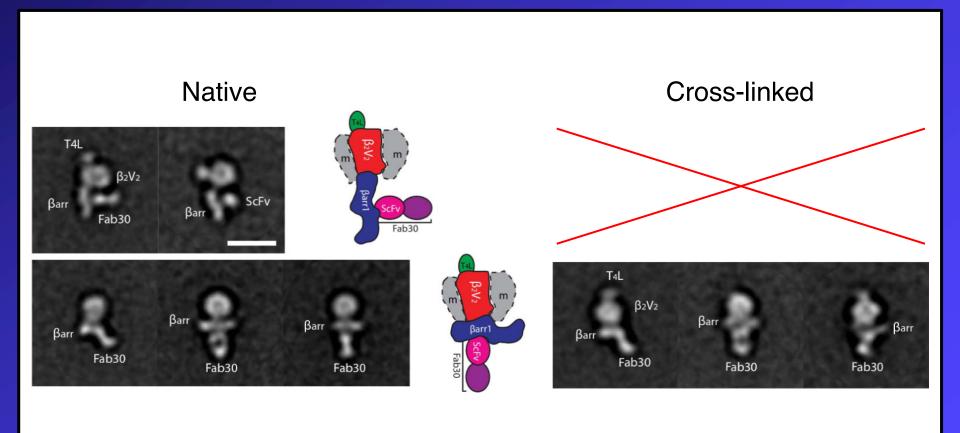
→ Assess type and degree of heterogeneity
Minimize heterogeneity by any means possible

If chemical fixation was used:

Look at unfixed sample to assess effect of cross-linking

→ Assess whether structure of cross-linked sample is meaningful

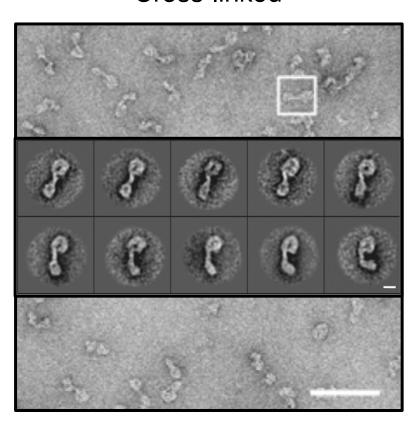
Effect of cross-linking: The $\beta_2 V_2 R$ - $\beta_3 arrestin1$ -Fab30 complex



Shukla et al. (2014) Nature 512: 218-222

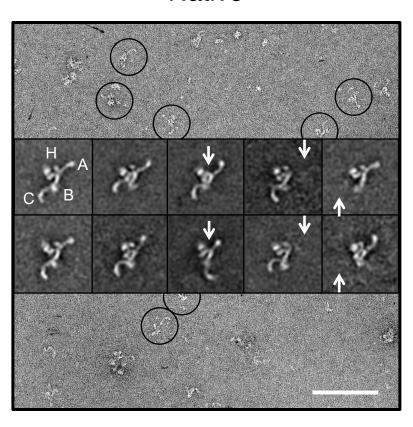
Effect of cross-linking: The HOPS tethering complex

Cross-linked

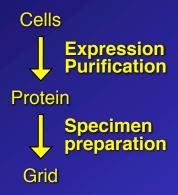


Bröcker *et al.* (2012) *PNAS* 109: 1991-1996

Native



Chou *et al.* (2016) *NSMB* <u>23</u>: 761-763



Potential issues:

- No particles
- Preferred orientations

Potential issues with grids

No particles (particles bind to carbon and avoid holes)

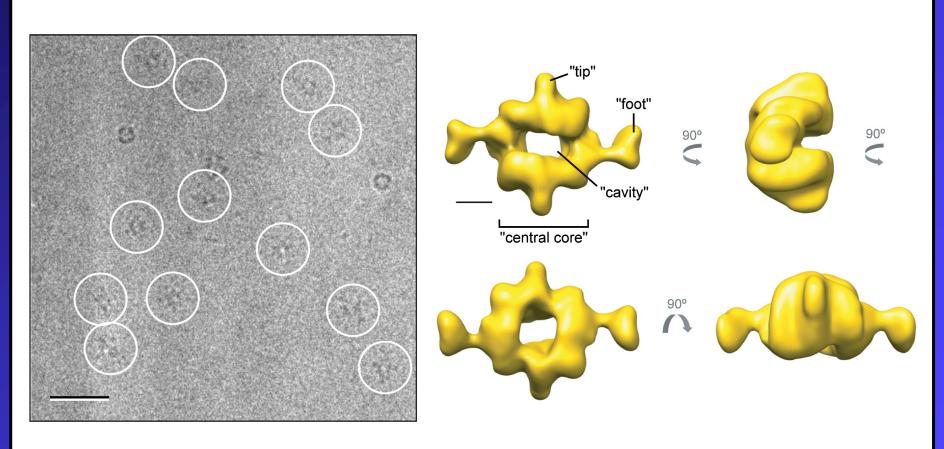
- Increase protein concentration
- Double blotting
- PEG treatment of grid
- Use thin carbon film

Preferred orientation (particles align at air/water interface)

Lack of views will result in:

non-isotropic resolution of the density map

The mTOR1 complex



Yip et al. (2010) Mol. Cell 38: 768-774

Potential issues with grids

No particles (particles bind to carbon and avoid holes)

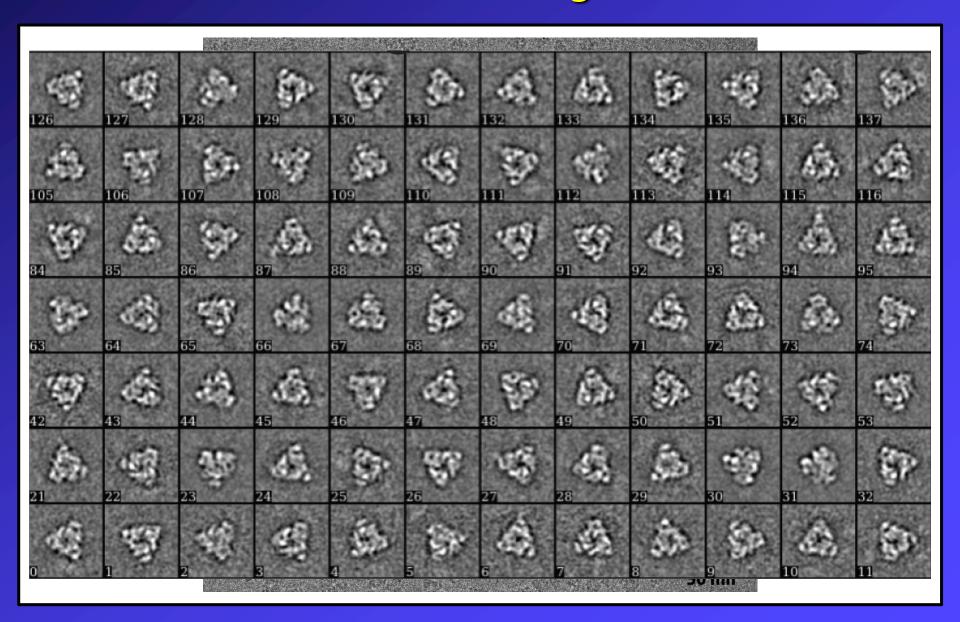
- Increase protein concentration
- Double blotting
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Preferred orientation (particles align at air/water interface)

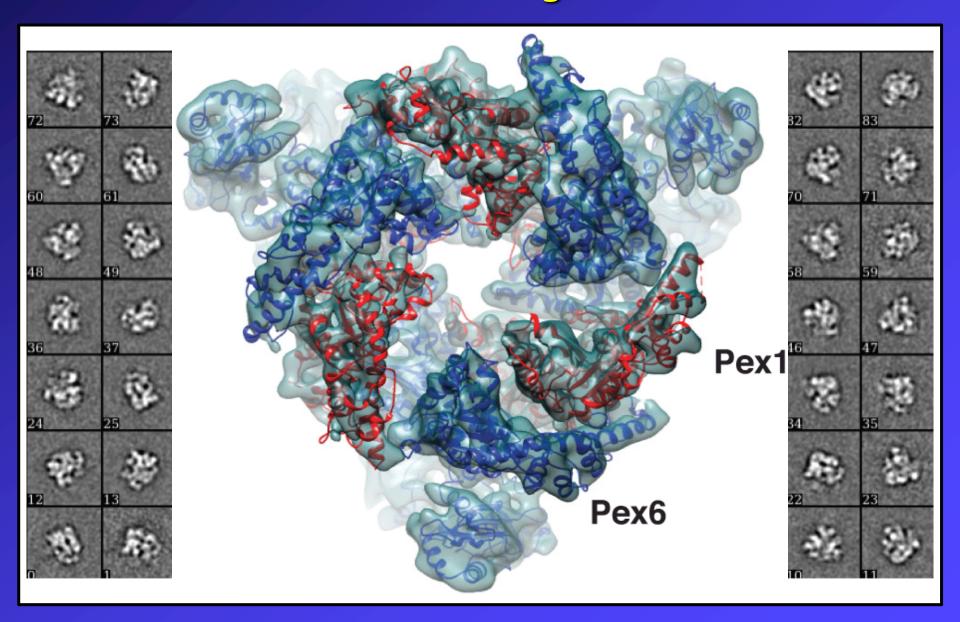
Lack of views will result in:

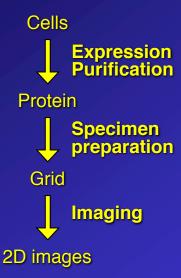
- non-isotropic resolution of the density map
- can potentially lead to an incorrect density map
- Use thicker (or thinner) ice
- Use low concentration of detergent (changes surface tension)
- Use thin carbon film (commonly used for ribosome samples)
- Use gold grids (Russo & Passmore (2014) Science 346: 1377-1380)

Preferred orientations: Pex1/6 complex Without detergent



Preferred orientations: Pex1/6 complex With detergent





Potential issues:

- Low contrast
- Beam damage

Potential issues with images

Poor electron scattering
→ high electron dose



Beam sensitivity

→ low electron dose

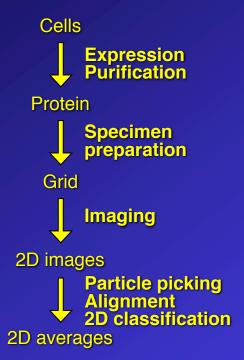
→ Poor SNR can be fixed by averaging

→ Loss of information cannot be fixed

- → Electron micrographs recorded with low electron doses
- > Particles hard too see, especially small ones

Problem fixed by DDD cameras

- → Collect long movies
- → Add frames with resolution filter



Potential issues:

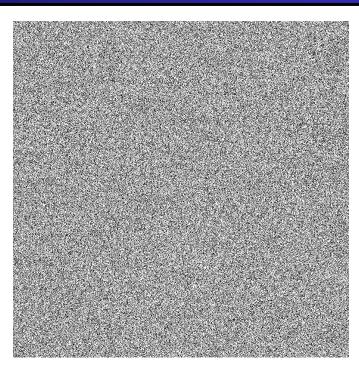
Particle picking:

Model/reference bias

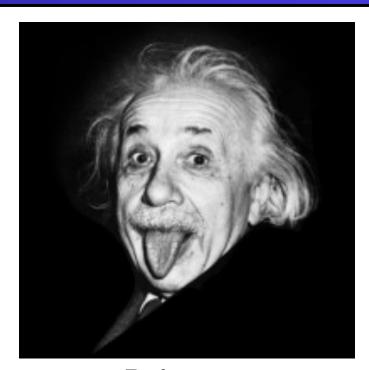
2D classification:

- Model/reference bias
- Number of classes
- Heterogeneous classes
- Disappearing classes

Potential issues with particle picking



1,000 images containing pure white noise



Reference:
Albert Einstein

Shatsky *et al.* (2009) *J. Struct. Biol.* <u>166</u>: 67-78 Henderson (2013) *Proc. Natl. Acad. Sci. USA* 110: 18037-18041

Potential issues with particle picking



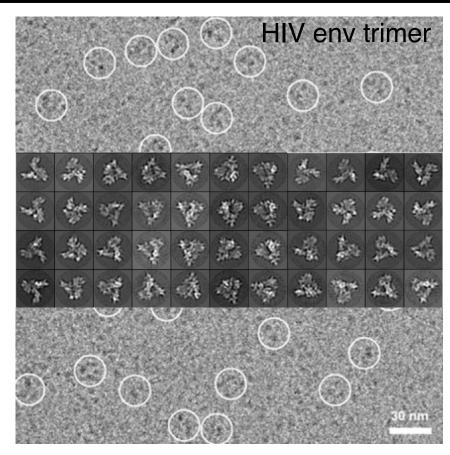
Model/reference bias

Average of 1,000 images containing pure white noise after alignment to an image of Albert Einstein

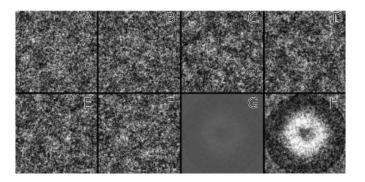
→ Einstein from noise

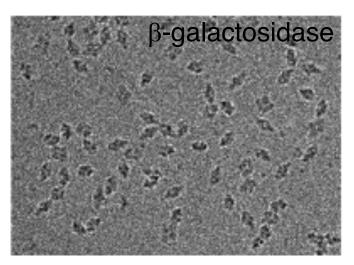
Shatsky *et al.* (2009) *J. Struct. Biol.* <u>166</u>: 67-78 Henderson (2013) *Proc. Natl. Acad. Sci. USA* <u>110</u>: 18037-18041

Potential issues with particle picking



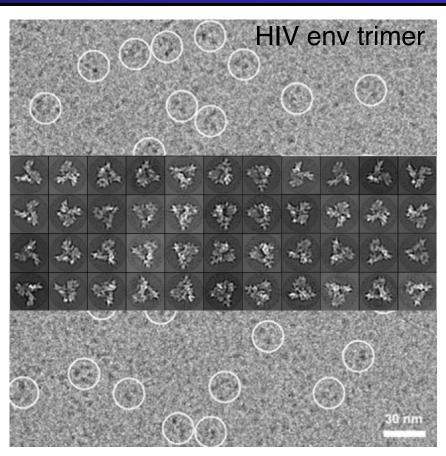
Mao *et al.* (2013) *PNAS* <u>110</u>: 12438-12443





Henderson (2013) *PNAS* <u>110</u>: 18037-18041

Potential issues with particle picking



Using template matching to pick particles from very noisy images is dangerous

→ Averages will end up looking like templates used for particle picking

Mao *et al.* (2013) *PNAS* 110: 12438-12443

Henderson (2013) *PNAS* <u>110</u>: 18037-18041

Potential issues with 2D classification (K-means)

K-means classification needs to be initialized with a number of classes K

- Deterministic initialization
 - K templates are provided
 (supervised classification, multi-reference classification)
 - → reference bias → Einstein from noise
- Random initialization
 - K images are randomly chosen and used as references
 - data set is randomly split into K classes and class averages are used
 - → results tend to be unstable (different results for different repeats)

Potential issues with 2D classification (K-means)

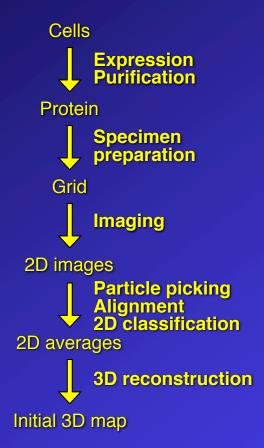
Properties / issues of *K*-means classification

- the algorithm always converges, but not necessarily to the global optimum (the best possible solution)
- outliers (rare objects whose appearance is partially or entirely unrelated to that of the bulk of the data) have a very negative impact on the outcome
- problem of "group collapse", i.e., the possibility of a group losing its members to the point of vanishing
- if the number of groups is not guessed correctly and the groups are not well separable (always the case for very noisy data), the result depends dramatically on the initialization

Potential issues with 2D classification (K-means)

Iterative stable alignment and clustering (ISAC) procedure Yang *et al.* (2012) *Structure* 20: 237-247

- Equal-size group K-means classification
 - → prevents group collapse
- Assessment that alignment parameters for images in a cluster are stable (below a pixel error threshold) in repetitions
- Assessment that classes are reproducible in repetitions
 - → classes are stable and reproducible
 - → classes are <u>homogeneous</u> = good for 3D reconstruction
 - Only a fraction of the data set is assigned to classes
 - Computationally very expensive



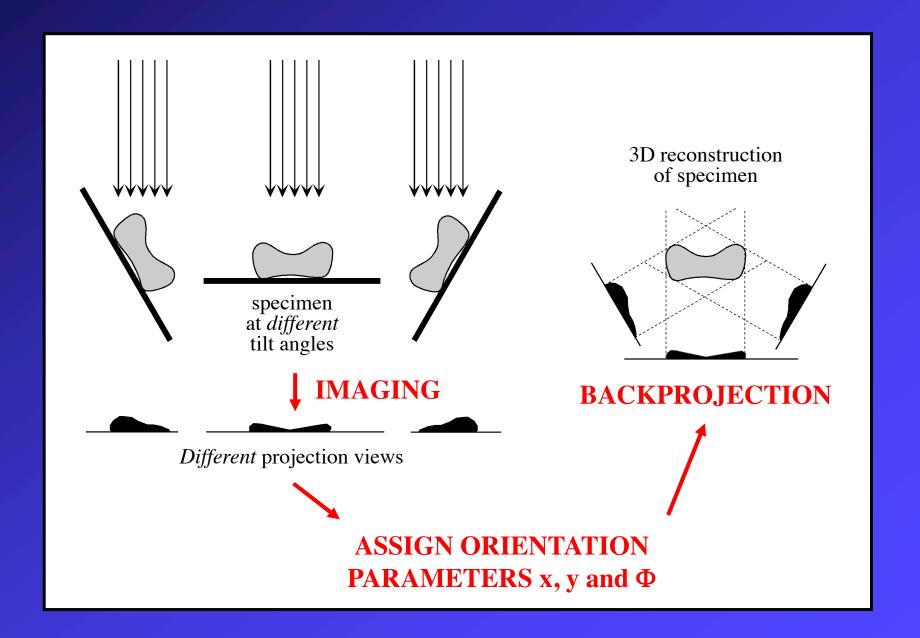
Potential issues:

Incorrect map

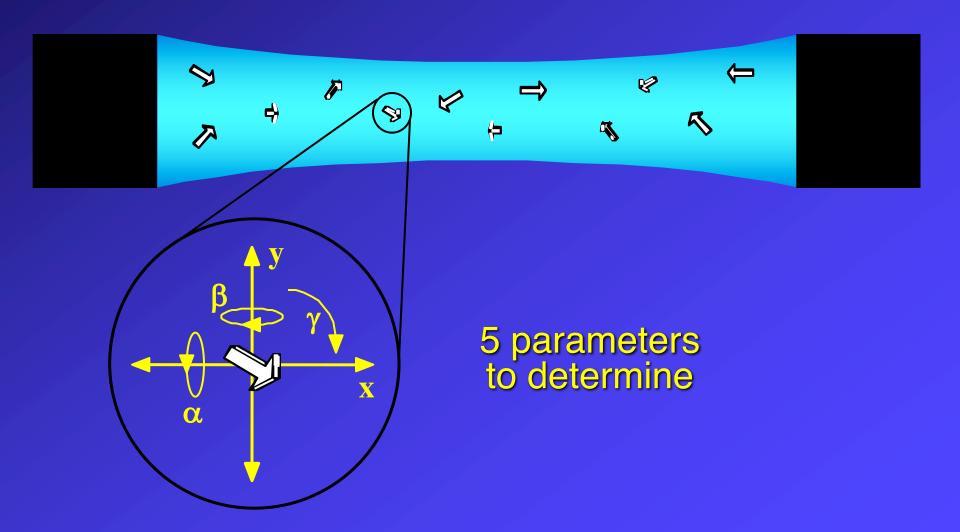
Because of:

- Heterogeneous sample
- Missing views
- Incorrect solution

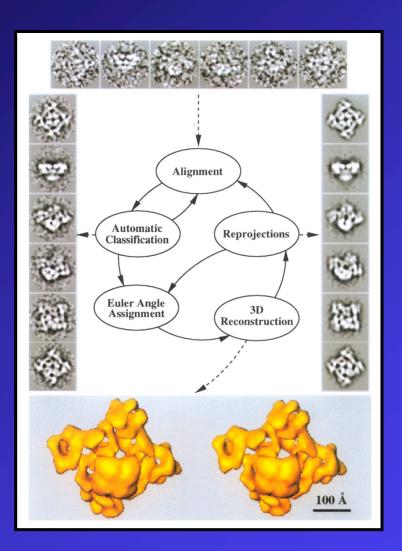
Random conical tilt reconstruction



Single particles in ice

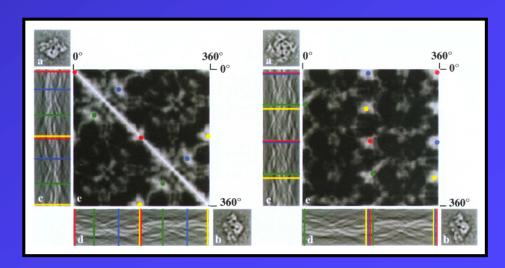


Angular reconstitution

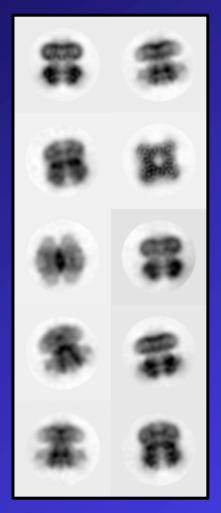


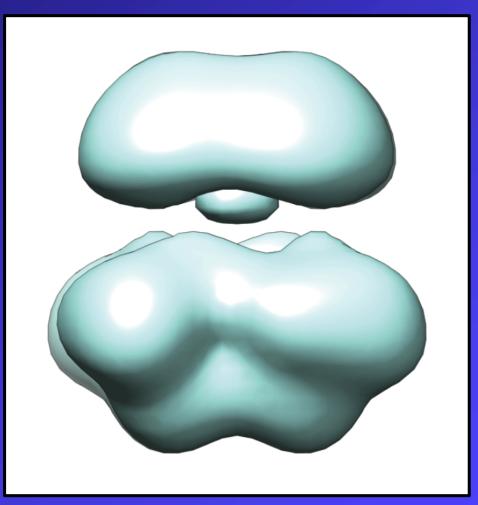
van Heel, 1987

- choose 3 projection images that are perpendicular views of the particle (anchor set)
- 2. add in further projections and keep refining



Chicken Slo2.2 in the absence of Nat





VIPER

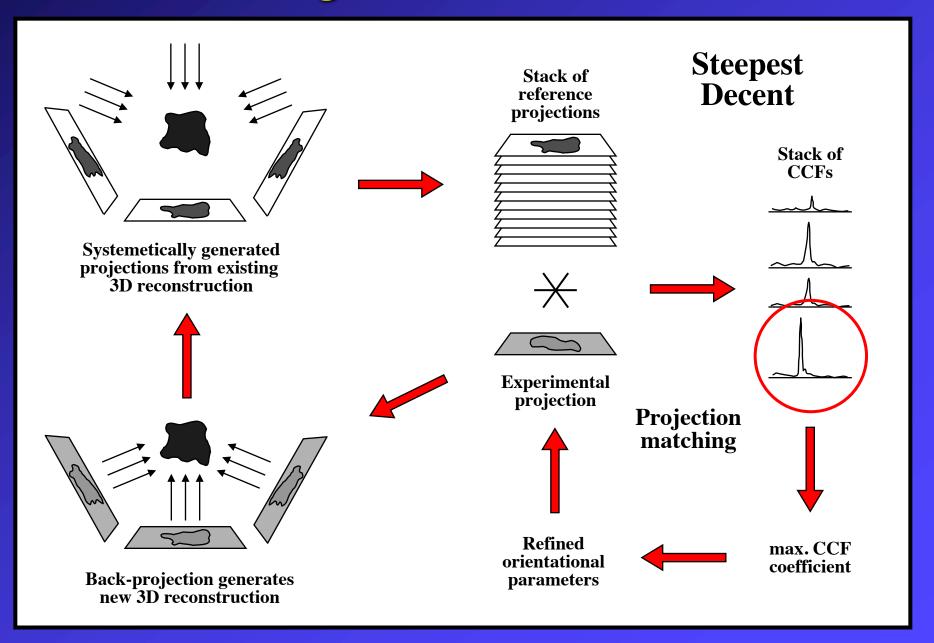
Stochastic Hill Climbing

(initially introduced in program SIMPLE)

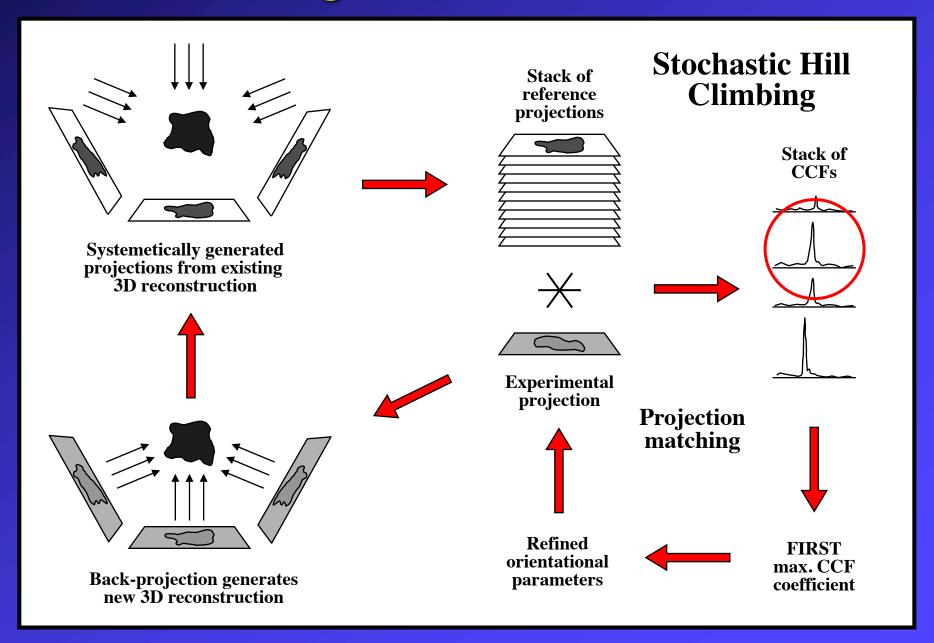
Class averages

Initial model (obtained with VIPER)

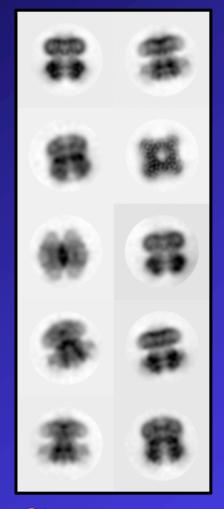
Angular refinement

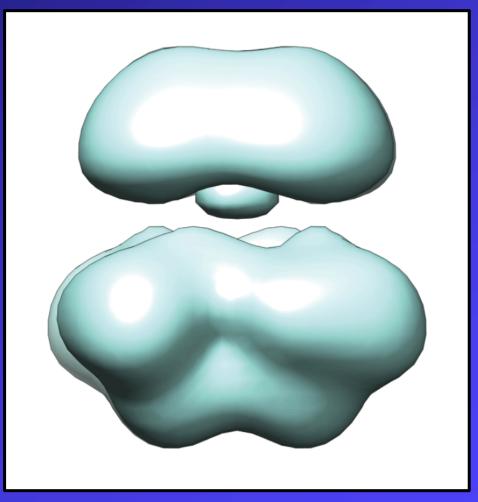


Angular refinement



Chicken Slo2.2 in the absence of Nat





VIPER

Stochastic hill climbing

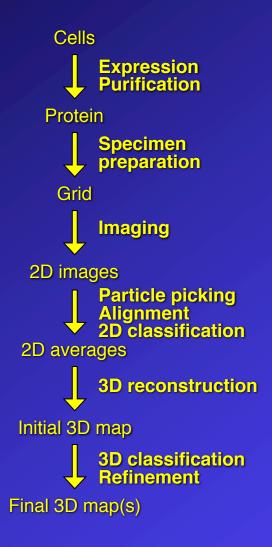
Similar principles as used in ISAC:

stability and reproducibility assessments

cryoSPARC

Class averages

Initial model (obtained with VIPER)



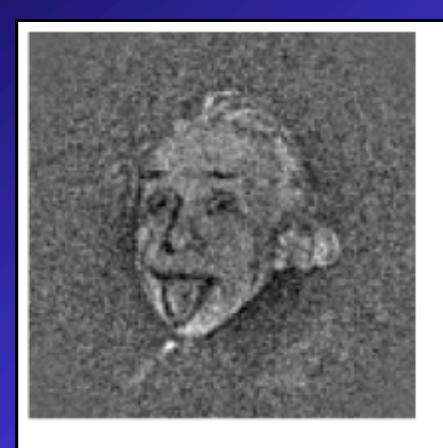
Potential issues:

Reference bias

Overfitting

Resolution assessment

Potential issues with density map



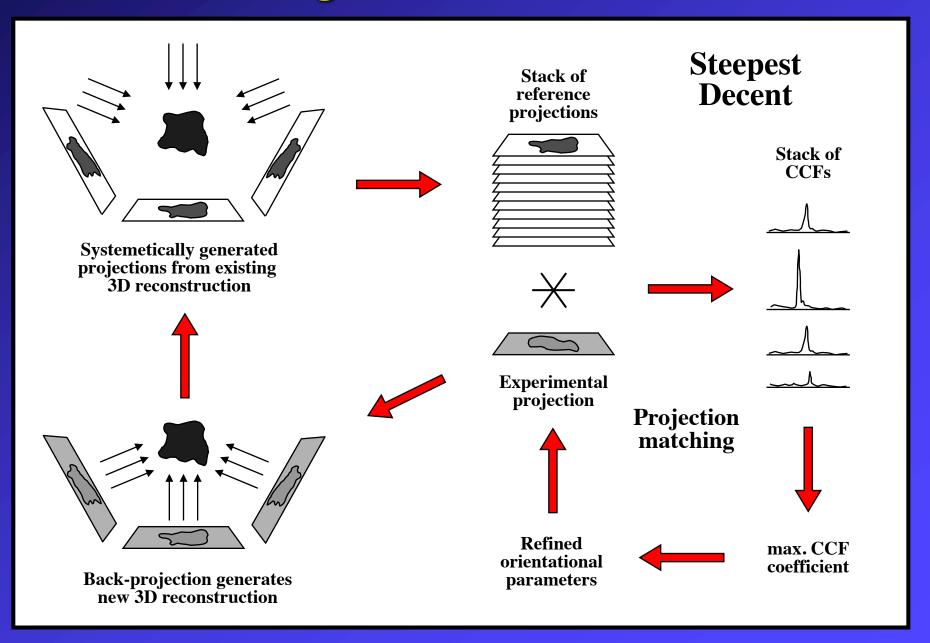
Model/reference bias

Average of 1,000 images containing pure white noise after alignment to an image of Albert Einstein

→ Einstein from noise

Shatsky *et al.* (2009) *J. Struct. Biol.* <u>166</u>: 67-78 Henderson (2013) *Proc. Natl. Acad. Sci. USA* <u>110</u>: 18037-18041

Angular refinement



Potential issues with density map



Model/reference bias

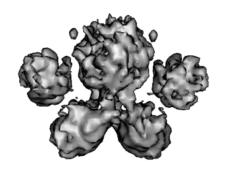
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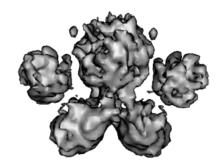
Over-fitting results in spurious highresolution features due to alignment of noise

Shatsky *et al.* (2009) *J. Struct. Biol.* <u>166</u>: 67-78 Henderson (2013) *Proc. Natl. Acad. Sci. USA* <u>110</u>: 18037-18041

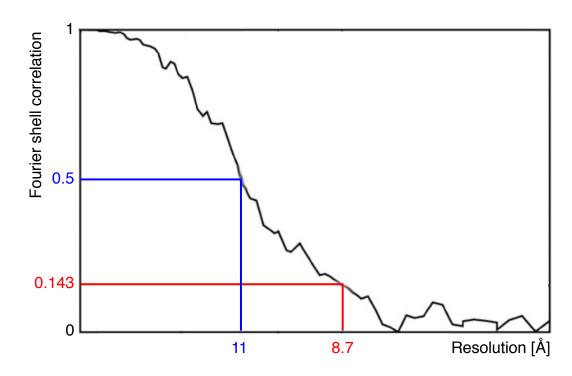
Resolution assessment



$$FSC = \frac{\sum_{F_1 \cdot F_2}^{*}}{\sqrt{\sum_{F_1|^2}^{*} \sum_{F_2|^2}^{*}}}$$



Maps have to be independent!

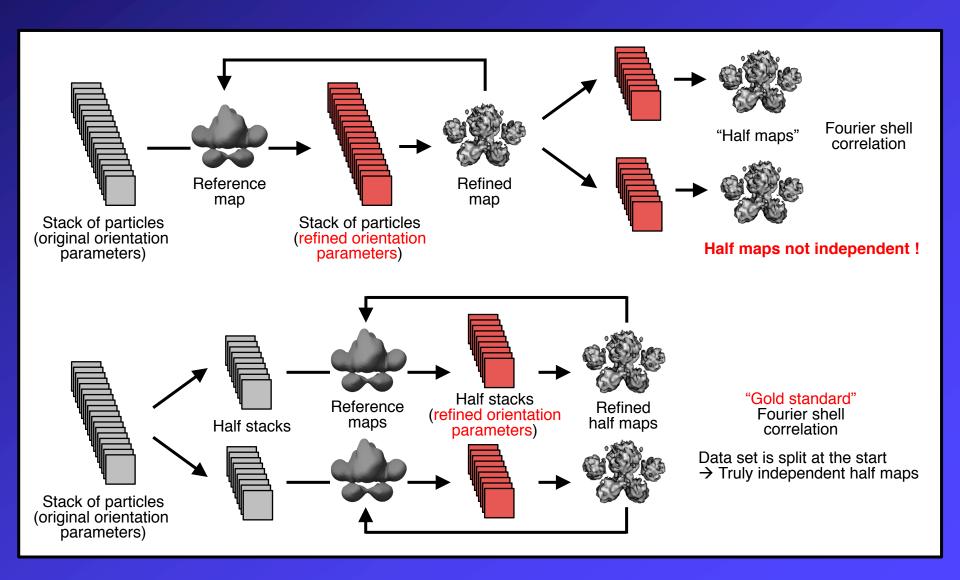


FSC = 0.5 Signal = Noise Böttcher *et al.* (1997) *Nature* 386: 88-91

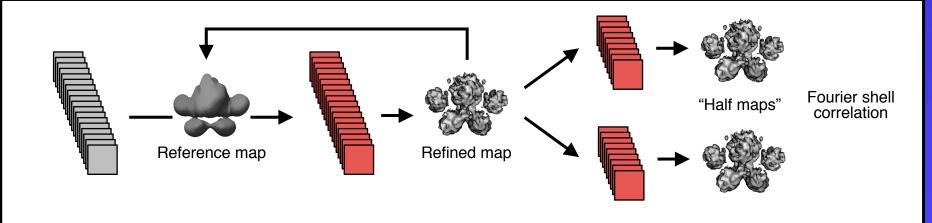
FSC = 0.143 Phase error = 60°

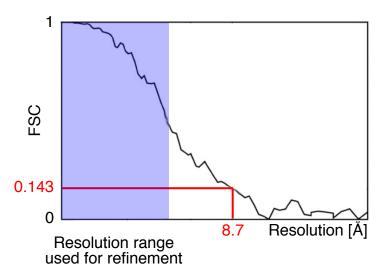
Rosenthal & Henderson (2003) J. Mol. Biol. 333: 721-745

Resolution assessment



Resolution assessment





"Gold standard" FSC is not the only valid resolution assessment

Even "gold standard" FSC can give overestimated resolution

Resolution is just a number

Local resolution

Resolution assessment

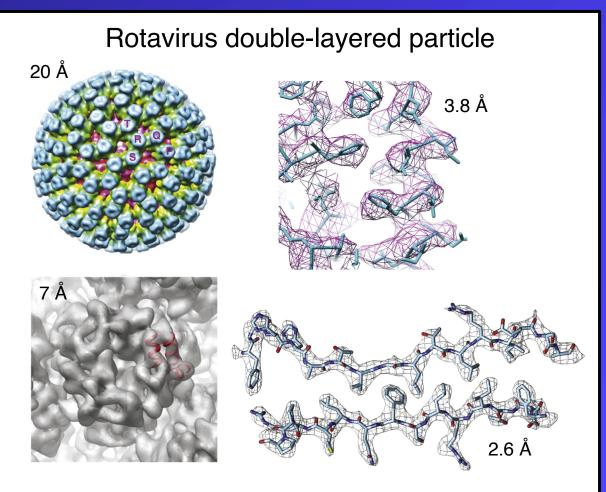
What should be resolved?

> 20 Å protein envelope

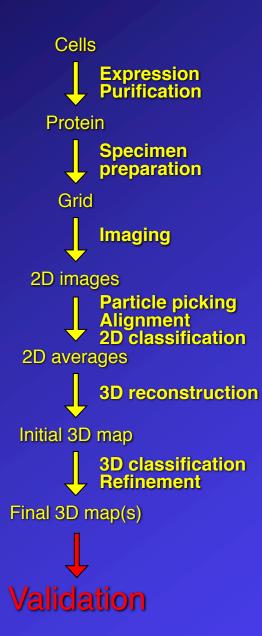
 \sim 9-10 Å α -helices

< 4.8 Å β -sheets

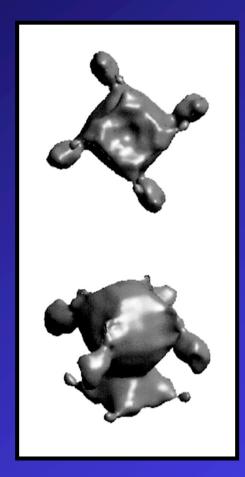
~ 4 Å bulky side chains

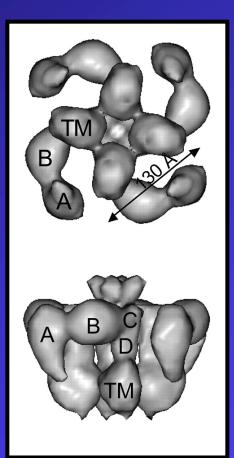


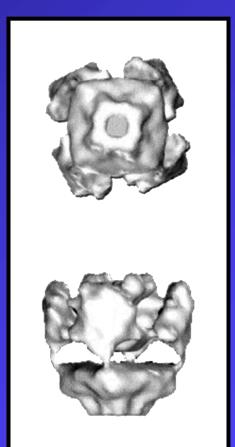
Rosenthal & Rubinstein (2015) Curr. Opin. Struct. Biol. 34: 135-144

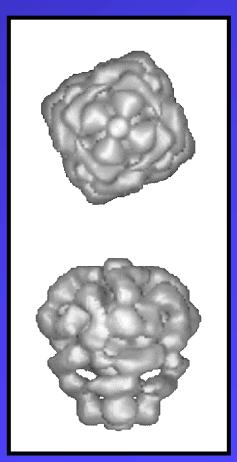


The issue: Structures of the IP3 receptor as determined by single-particle EM









Jiang *et al.*, 2002

Serysheva *et al.*, 2003

Jiang *et al.*, 2003

Sato *et al.*, 2004

Meeting of experts in 2010 to come up with standards for map validation

Outcome summarized in 2012:

Structure

Meeting Review

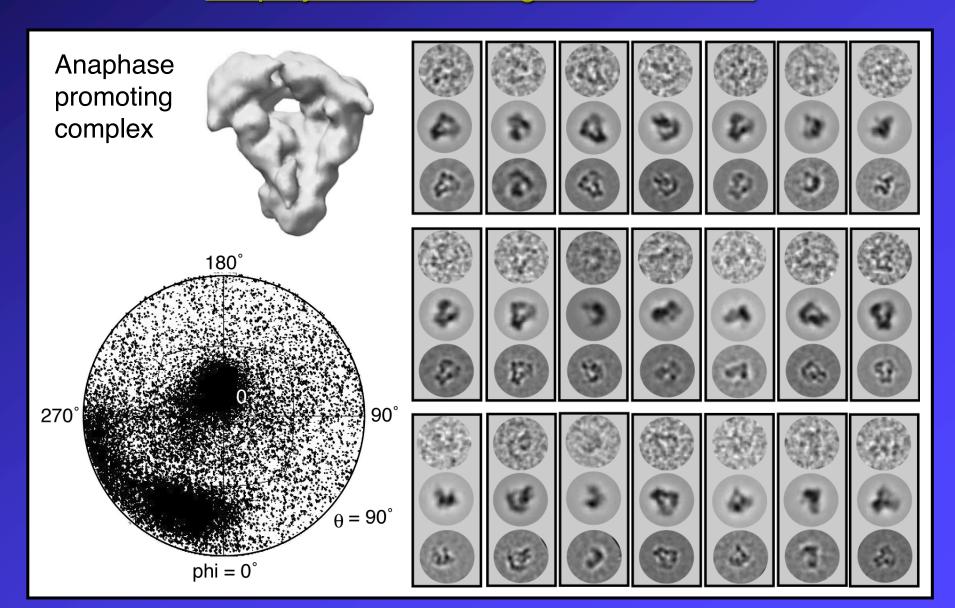


Outcome of the First Electron Microscopy Validation Task Force Meeting

Richard Henderson,¹ Andrej Sali,² Matthew L. Baker,³ Bridget Carragher,⁴ Batsal Devkota,⁵ Kenneth H. Downing,⁶ Edward H. Egelman,⁻ Zukang Feng,⁵ Joachim Frank,^{8,9} Nikolaus Grigorieff,¹⁰ Wen Jiang,¹¹ Steven J. Ludtke,³ Ohad Medalia,¹²,²¹ Pawel A. Penczek,¹³ Peter B. Rosenthal,¹⁴ Michael G. Rossmann,¹⁵ Michael F. Schmid,³ Gunnar F. Schröder,¹⁶ Alasdair C. Steven,¹ⁿ David L. Stokes,¹³ John D. Westbrook,⁵ Willy Wriggers,¹⁰ Huanwang Yang,⁵ Jasmine Young,⁵ Helen M. Berman,⁵ Wah Chiu,³ Gerard J. Kleywegt,²⁰ and Catherine L. Lawson⁵,⁺

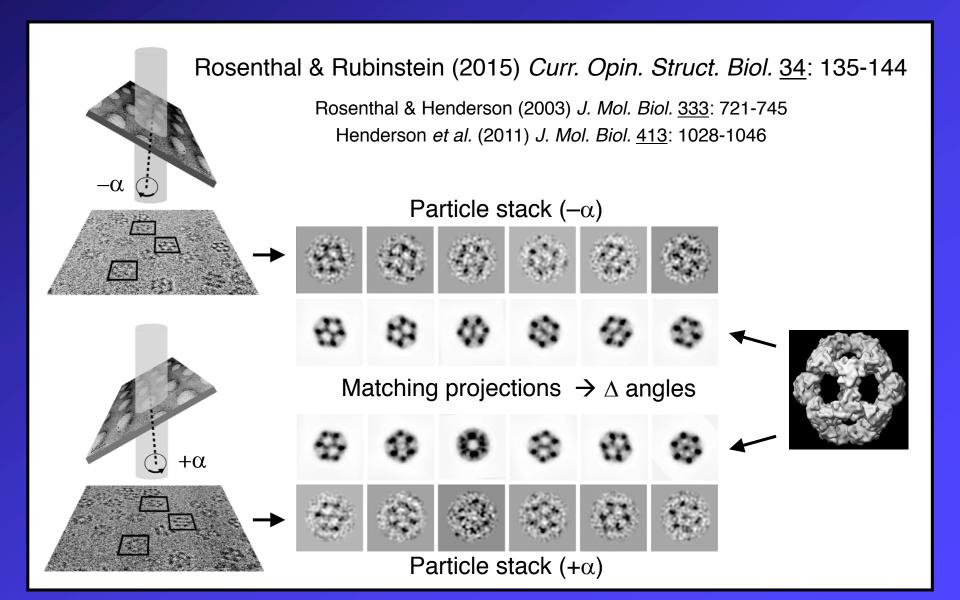
Compare reference-free averages with projections

Re-projections and angular distribution



- Compare reference-free averages with projections
 - only checks consistency of 3D map with 2D data
 - also check angle distribution
- Tilt-pair analysis

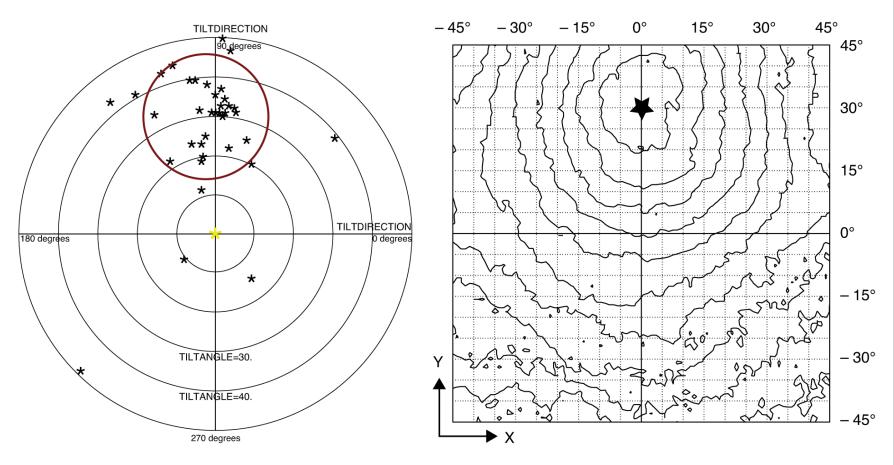
Map validation <u>Tilt-pair analysis</u>



Map validation Tilt-pair analysis

Tilt-pair parameter plot

Tilt-pair phase residual plot



Rosenthal & Rubinstein (2015) Curr. Opin. Struct. Biol. 34: 135-144

Map validation <u>Tilt-pair analysis</u>

Henderson et al. (2011) J. Mol. Biol. 413: 1028-1046

Table 1. Overview of tilt-pair statistics

		Particle size	Molecular mass	Number of	Number of	Successful	Angular error (°)	
Specimen	Symmetry	(Å)	(MDa)	tilt pairs	particles	alignment (%)	Mean	Maximum
Rotavirus DLP	I2	700	50	10	95	100/100	0.25	1.0
CAV	I2	255	2.7	1	45	62/82	2.5	3.5
70S ribosomes	C1	270×260	2.6	12	220	45/75	4.0	5.0
FAS	D3	260×220	2.6	2	44	59/95	4.0	6.0
PDH-E2CD	I1	280	1.6	1	50	62/94	3.0	4.0
Thermus V-ATPase	C1	250×140	0.6	1	50	54/80	10.0	16.0
Bovine F-ATPase	C1	250×140	0.6	1	29	52/79	20.0	25.0
DNA-PKcs	C1	150×120	0.47	14	108	44/81	15.0	17.0
β-Galactosidase	D2	$180\!\times\!130\!\times\!95$	0.45	2	119	74/91	10.0	14.0

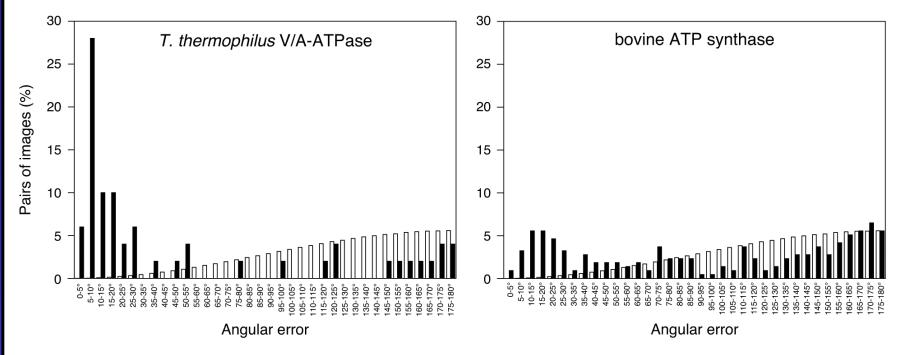
- determines whether overall 3D map is correct at 15-20 Å resolution (but not high-resolution features)
- allows determination of handedness
- can be used to refine parameters used for orientation determination
 can thus be used to improve the map
- validates orientation parameters
 (but not microscope parameters, i.e., defocus, magnification)

"If less than 60% of particles show a single cluster, the basis for poor orientation parameters should be investigated"

Map validation <u>Tilt-pair analysis</u>

Tilt-pair alignment test

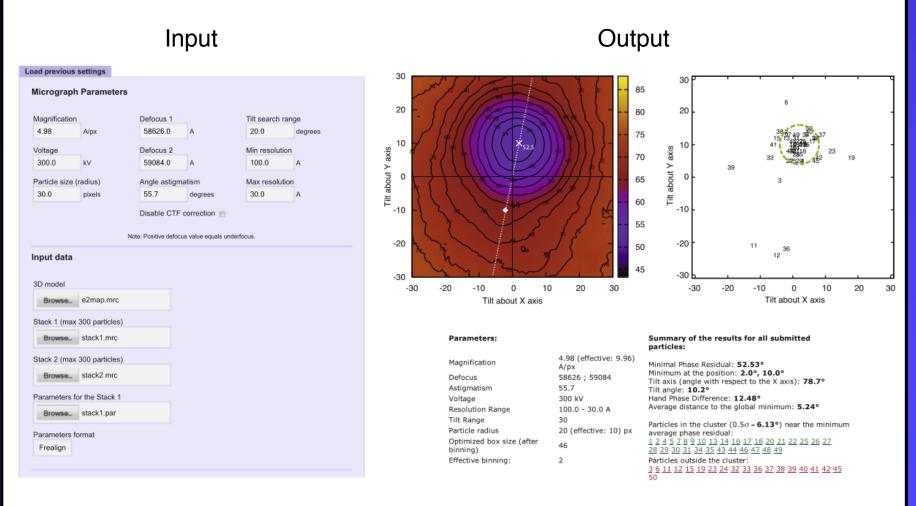
- angular errors for determination of the tilt transformation of each particle pair
- expected for random orientations



Rosenthal & Rubinstein (2015) *Curr. Opin. Struct. Biol.* <u>34</u>: 135-144 Baker *et al.* (2012) *Proc. Natl Acad. Sci. USA* <u>109</u>: 11675-11680

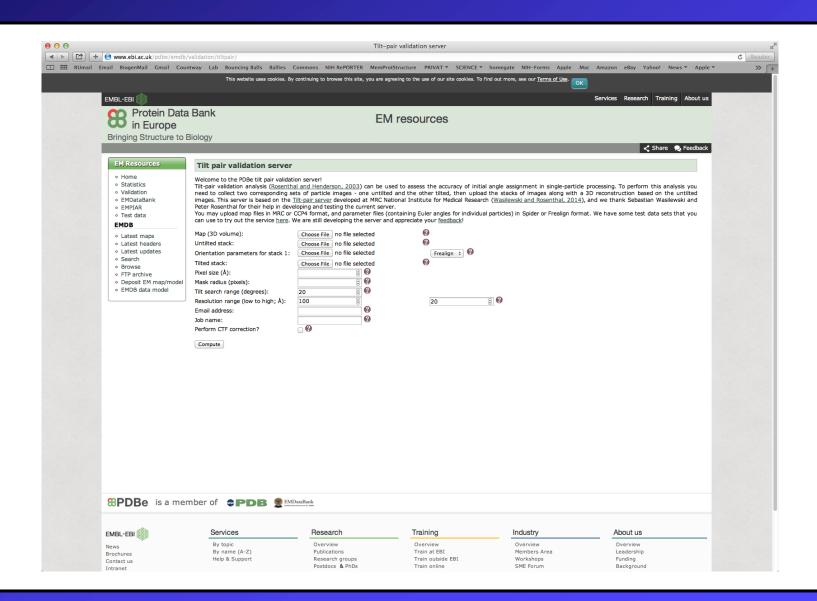
Russo & Passmore (2014) J. Struct. Biol. 187: 112-118

Map validation <u>Tilt-pair web server</u>



Wasilewski & Rosenthal (2014) J. Struct. Biol. 186: 122-131

http://www.ebi.ac.uk/pdbe/emdb/validation/tiltpair/



- Compare reference-free averages with projections
 - only checks consistency of 3D map with 2D data
 - also check angle distribution
- Tilt-pair analysis
 - excellent, also establishes handedness
- "Gold standard" FSC
 - not necessarily needed (but certainly not bad)
- Randomize phases

Map validation Randomize phases

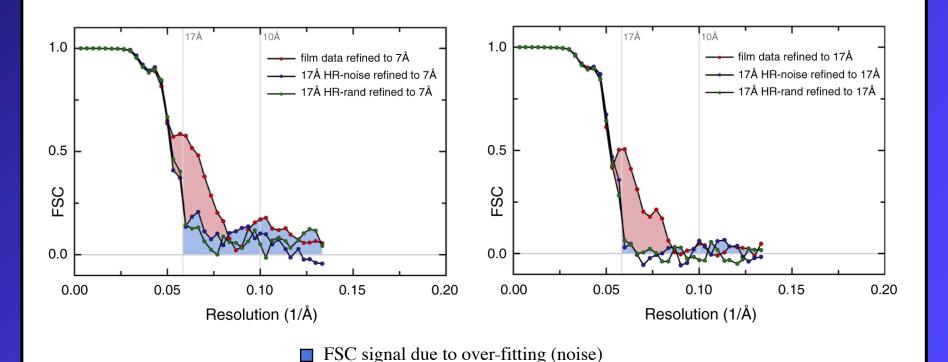
Rosenthal & Rubinstein (2015) *Curr. Opin. Struct. Biol.* 34: 135-144 Chen *et al.* (2013) *Ultramicroscopy* 135: 24-35

- Do single-particle reconstruction / refinement
- Determine resolution (FSC)
- Take raw data, randomize phases beyond which FSC_T falls below a threshold (75 or 80%)
- Redo the same analysis and recalculate FSC curve
- Any signal in region of randomized phases indicates issues with noise alignment in that region
- Can be implemented in any package

Map validation Randomize phases

Rosenthal & Rubinstein (2015) Curr. Opin. Struct. Biol. 34: 135-144

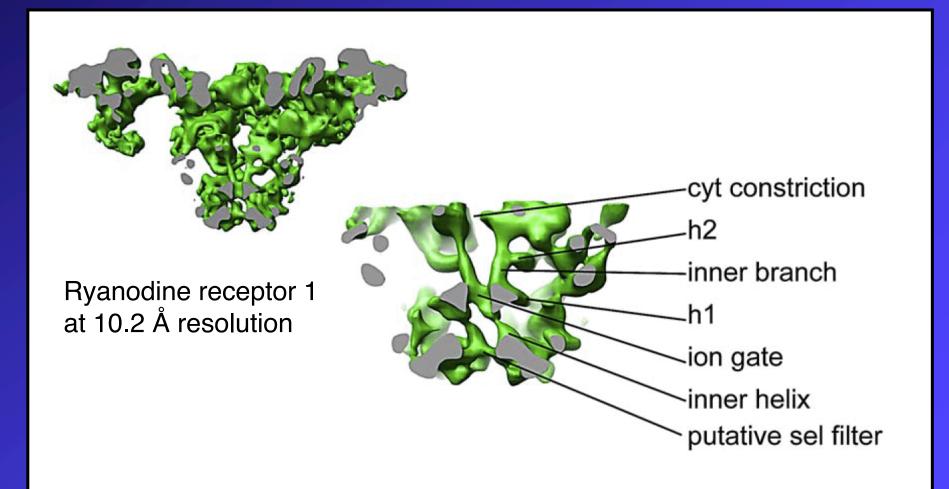
Chen et al. (2013) Ultramicroscopy <u>135</u>: 24-35



FSC signal due to true structural information

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- Tilt-pair analysis
 - excellent, also establishes handedness
- "Gold standard" FSC
 - not necessarily (but certainly not bad)
- Randomize phases
 - excellent, but not commonly used
- Appearance of expected secondary structure elements

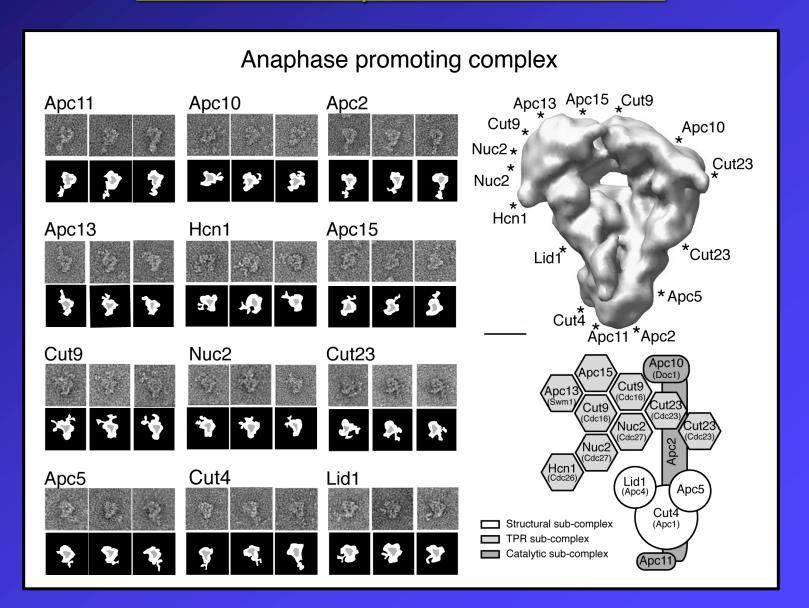
Expected secondary structure



Samso *et al.* (2009) *PLoS Biol.* 7: e1000085

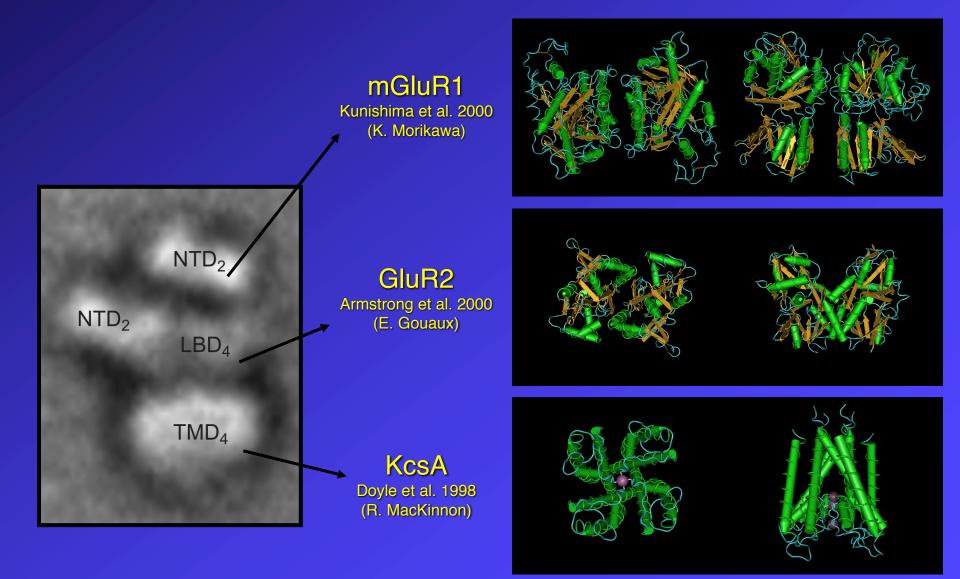
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- Appearance of expected secondary structure elements
- Evaluate with published information

Evaluation with published information

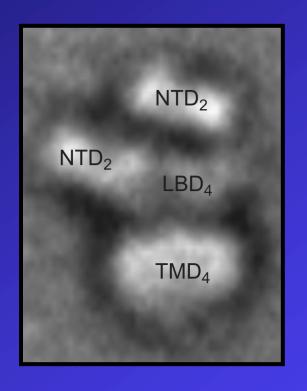


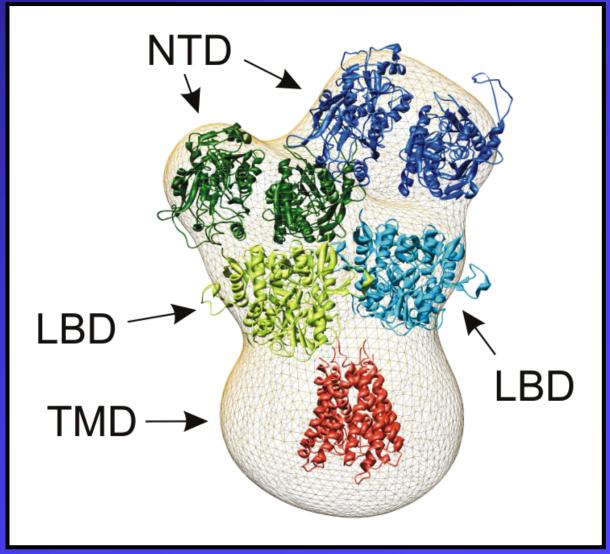
- Compare reference-free averages with projections
 - only checks consistency of 3D map with 2D data
 - also check angle distribution
- Tilt-pair analysis
 - excellent, also establishes handedness
- "Gold standard" FSC
 - not necessarily (but certainly not bad)
- Randomize phases
 - excellent, but not commonly used
- Appearance of expected secondary structure elements
- yeast two-hybrid analysis
 Evaluate with published information
 pull-down experiments
 - cross-link mass spectrometry
- Dock known atomic structures into map

Map validation Docking of atomic models

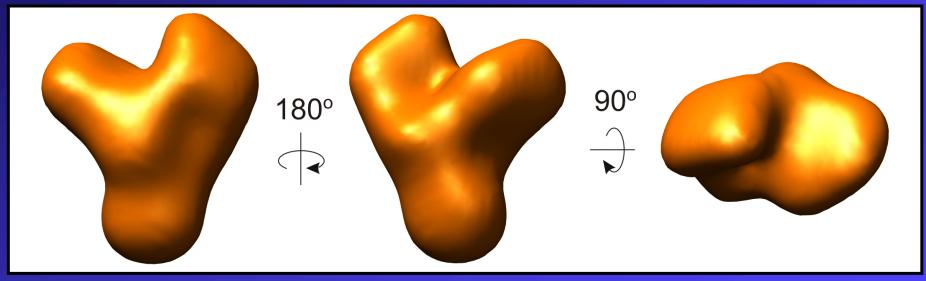


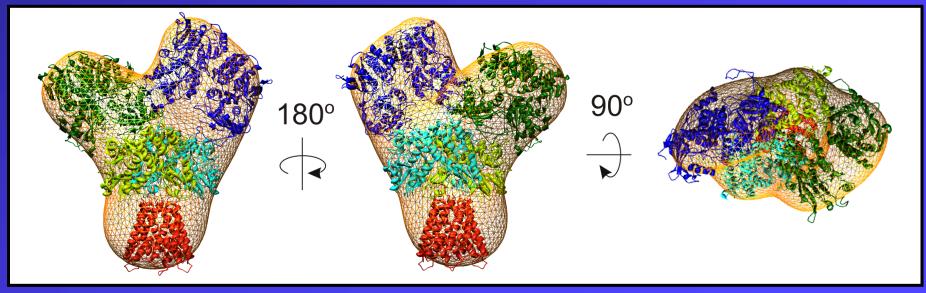
Map validation Docking of atomic models



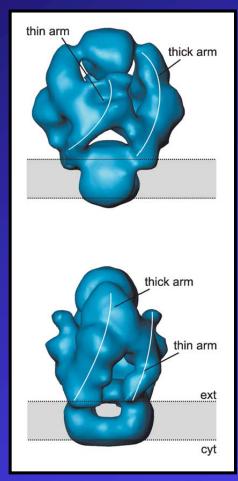


Map validation Docking of atomic models

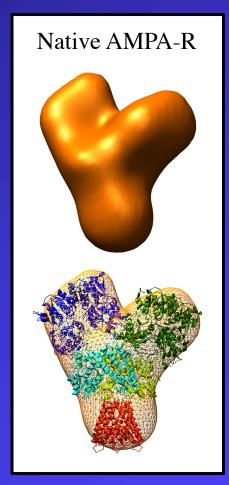




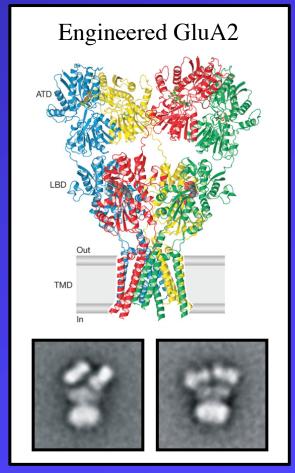
Docking of atomic models



Tichelaar *et al*. (2004) *JMB* <u>344</u>: 435-442

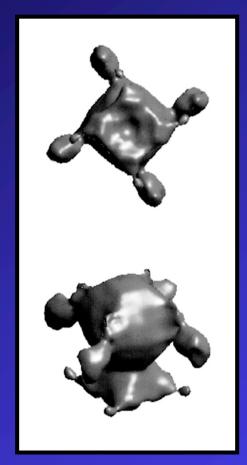


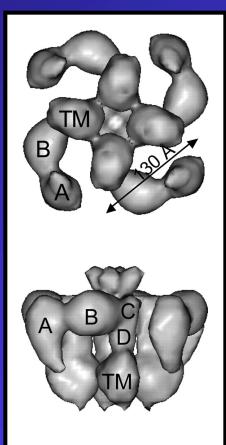
Nakagawa *et al.* (2006) *Biol. Chem.* <u>387</u>: 179-187

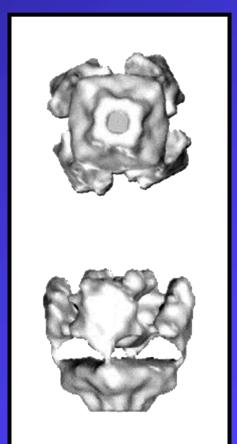


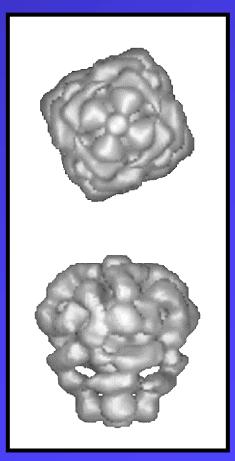
Sobolevsky *et al.* (2009) *Nature* <u>462</u>: 745-758

Different maps of the IP3 receptor









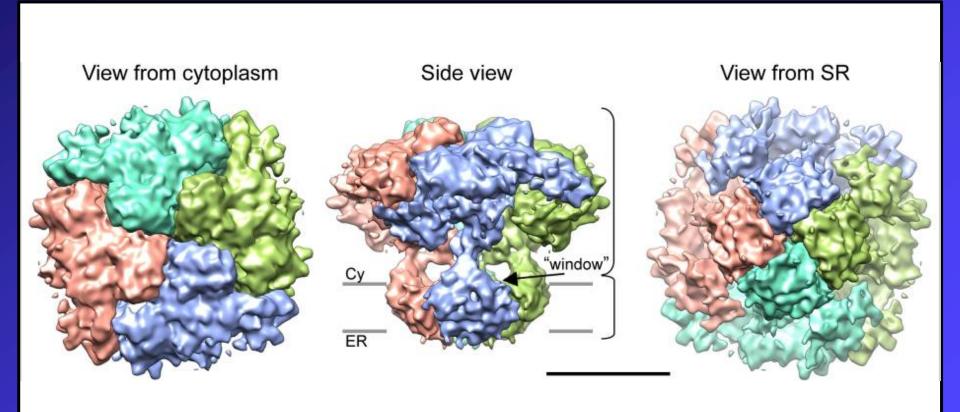
Jiang *et al.*, 2002

Serysheva *et al.*, 2003

Jiang *et al.*, 2003

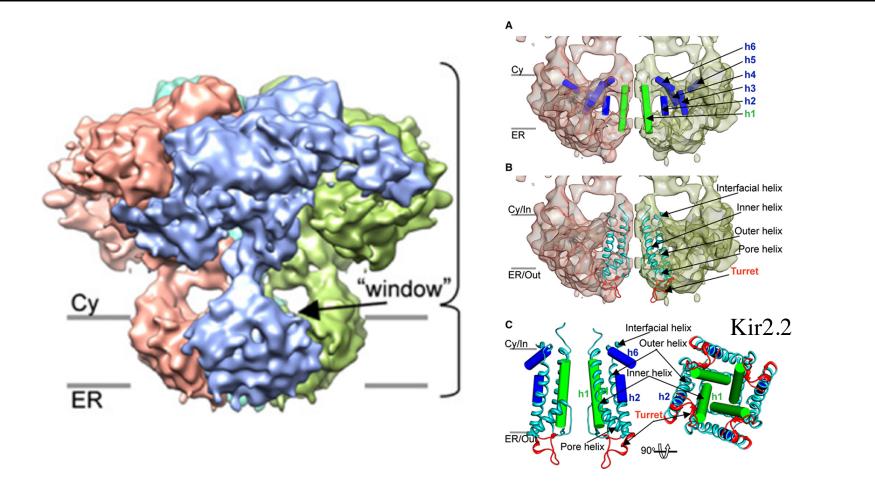
Sato *et al.*, 2004

New density map in 2011 at 11 Å resolution



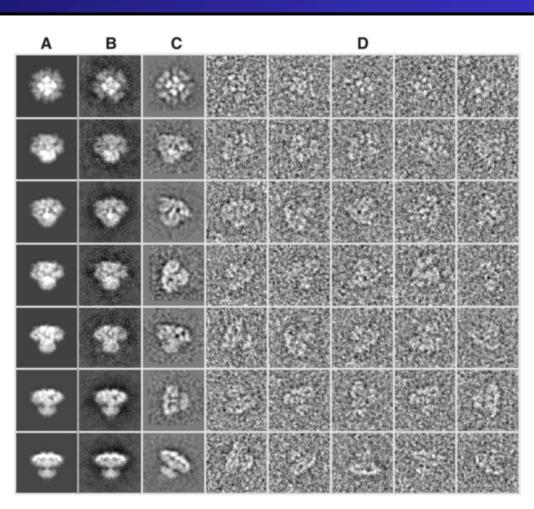
Ludtke et al. (2011) Structure 19: 1192-1199

Expected secondary structure elements



Ludtke et al. (2011) Structure 19: 1192-1199

Comparison of reference-free averages with projections



A: Map projection

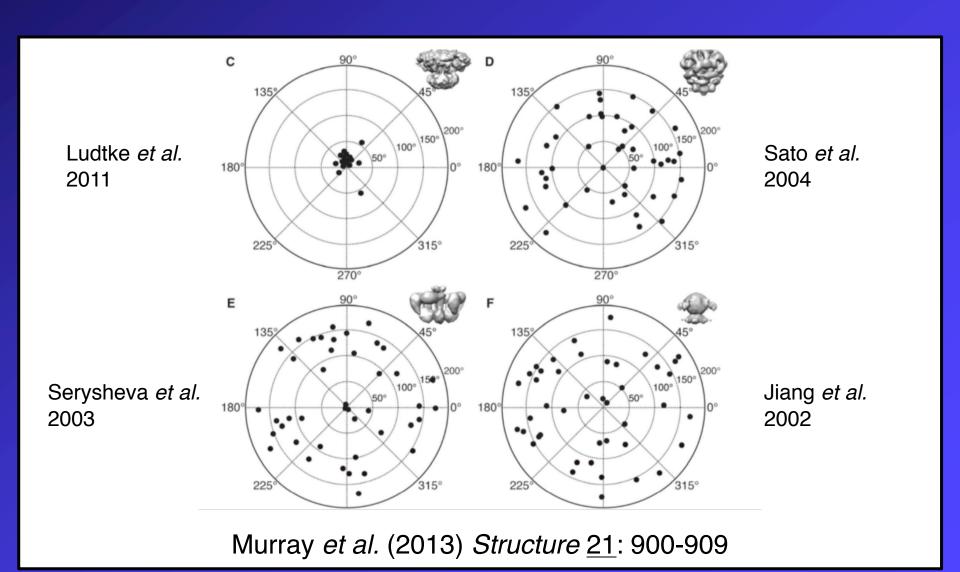
B: Reference-based class average

C: Reference-free class average

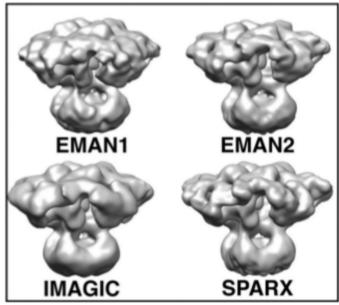
D: Selected particles

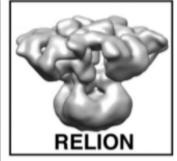
Murray et al. (2013) Structure 21: 900-909

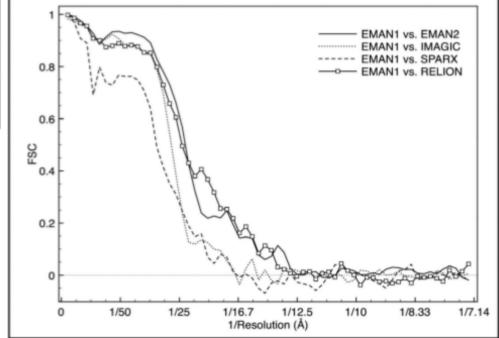
Tilt pair test



Comparison of maps from different programs







Murray *et al.* (2013) *Structure* 21: 900-909

4.7 Å resolution structure

