# Validation Methods

# Simons Electron Microscopy Center Winter EM Course 2018-19

## The dark side of single-particle EM

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

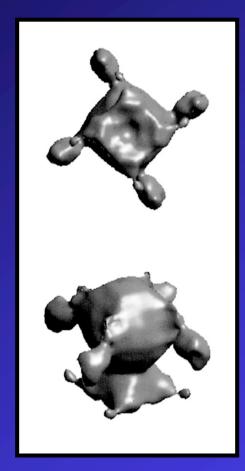
The <u>bad</u> thing about single-particle EM: Every data set and processing approach yields a 3D map!

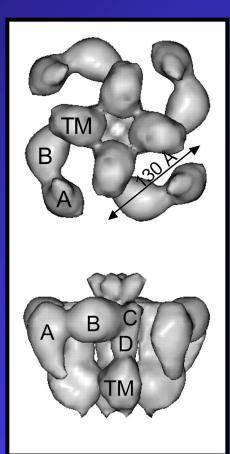
But is it correct ???

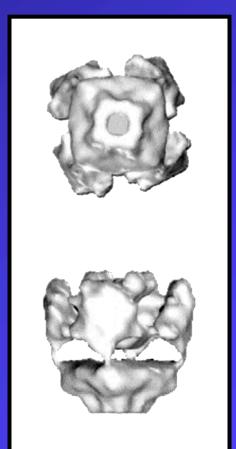


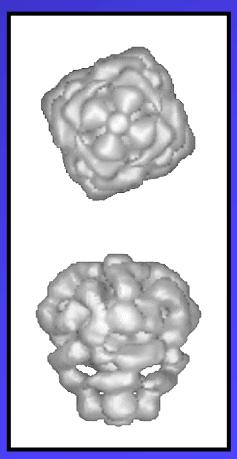
Particularly problematic for low-resolution maps

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







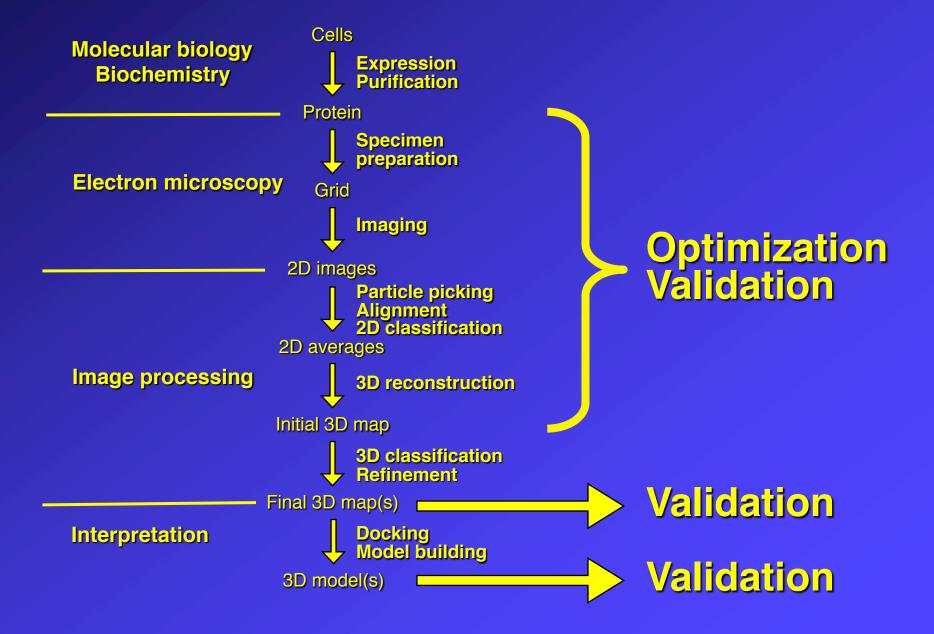


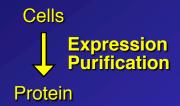
Jiang *et al.*, 2002

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

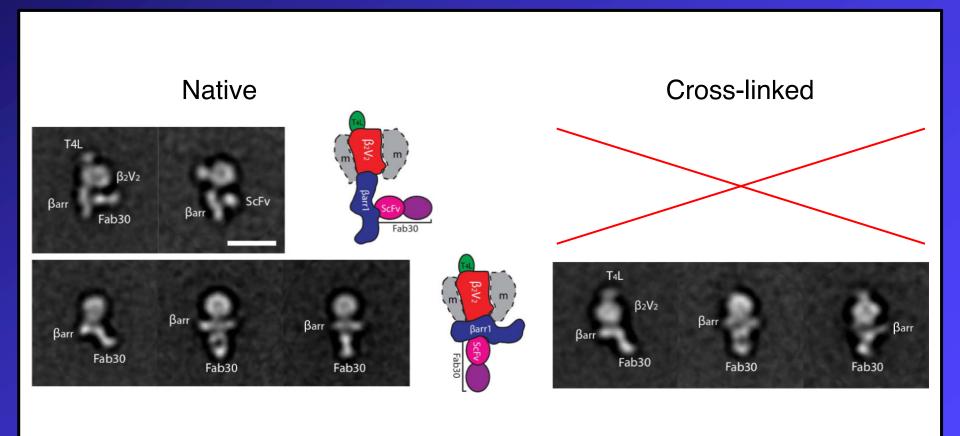
If particles look heterogeneous:
Calculate class averages
→ Assess type and degree of heterogeneity
→ Minimize heterogeneity by any means possible

If chemical fixation was used:

Look at unfixed sample to assess effect of cross-linking

→ Assess whether structure of cross-linked sample is meaningful

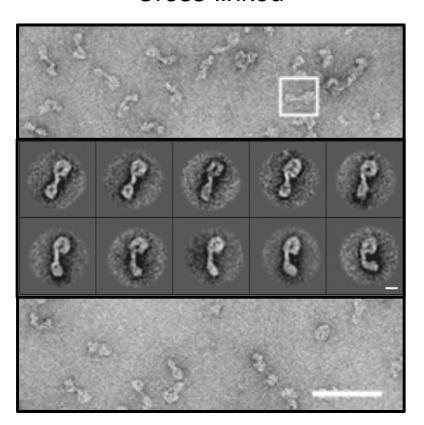
# Effect of cross-linking: The $\beta_2 V_2 R$ - $\beta_3 arrestin1$ -Fab30 complex



Shukla *et al.* (2014) *Nature* <u>512</u>: 218-222

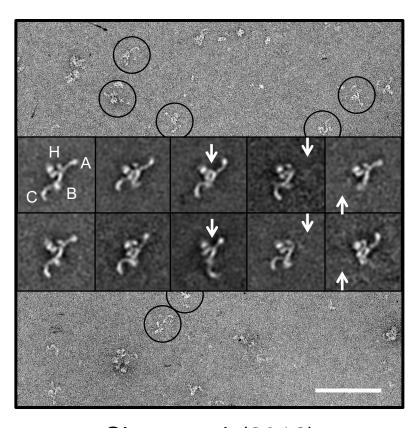
## Effect of cross-linking: The HOPS tethering complex

#### Cross-linked

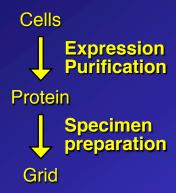


Bröcker *et al.* (2012) *PNAS* <u>109</u>: 1991-1996

#### **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)

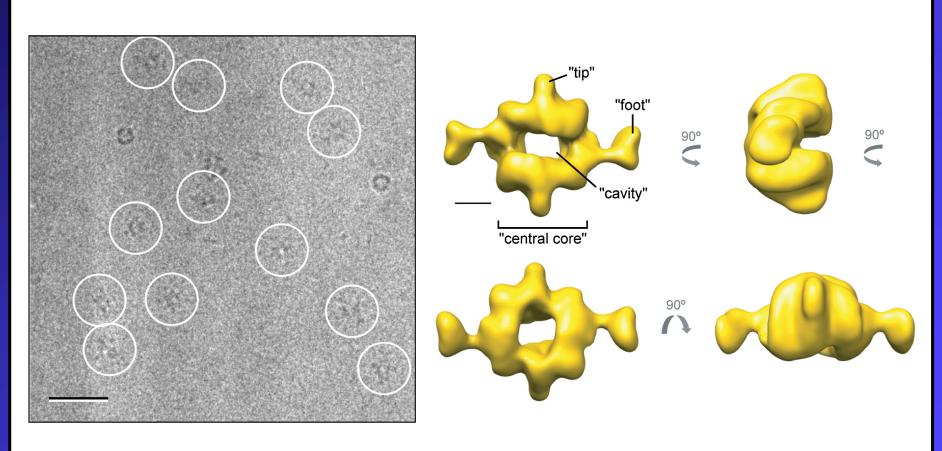
- Increase protein concentration
- Double blotting
- PEG treatment of grid
- Use different grids (gold, lacey carbon)
- Use thin carbon film

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)

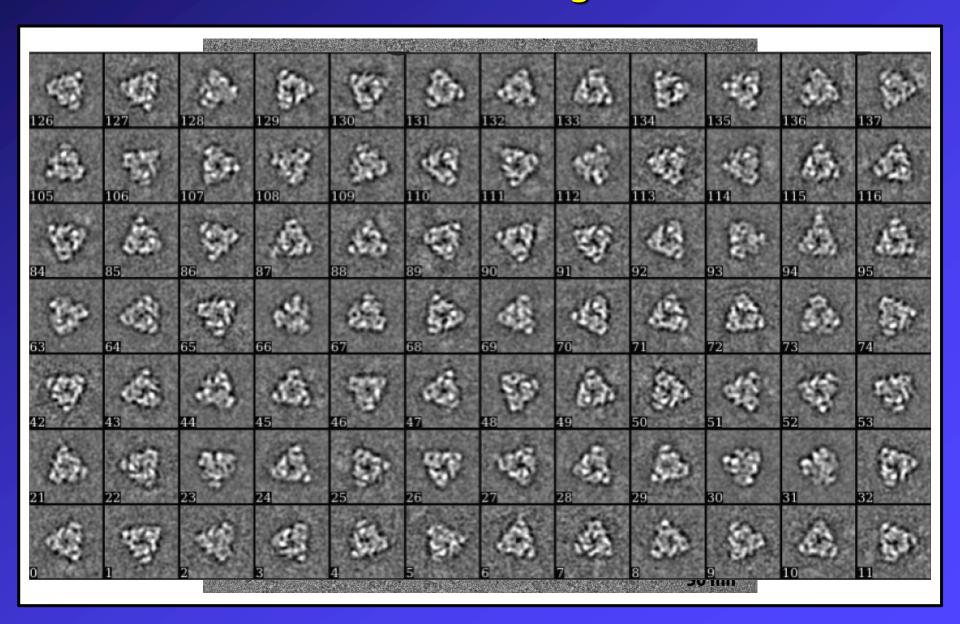
- Increase protein concentration
- Double blotting
- PEG treatment of grid
- Use thin carbon film

Preferred orientation (particles align at air/water interface)

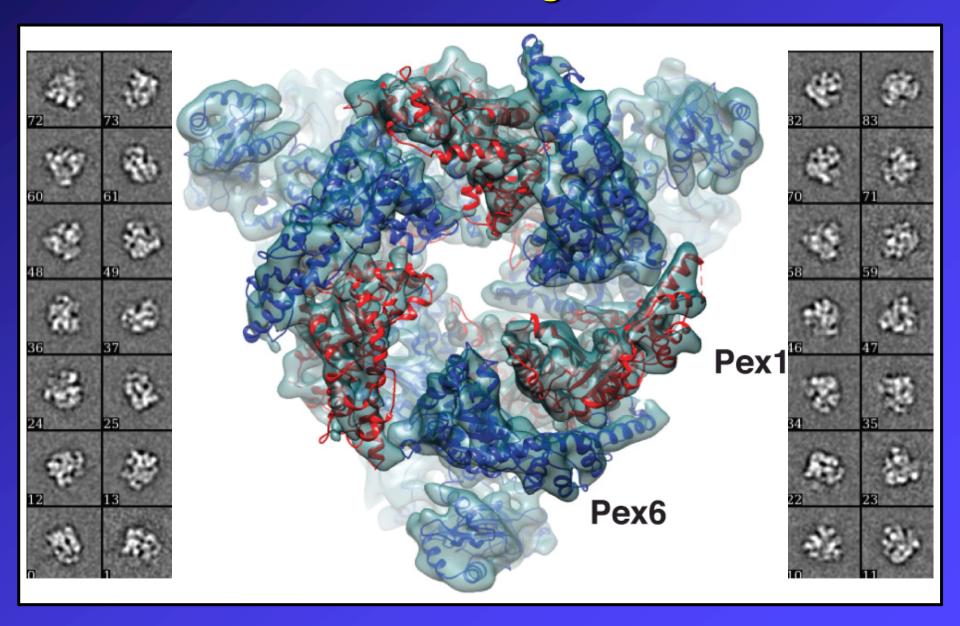
Lack of views will result in:

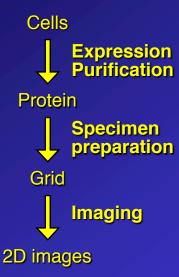
- non-isotropic resolution of the density map
- can potentially lead to an incorrect density map
- Use thicker (or thinner) ice
- Use low concentration of detergent (changes surface tension)
- Use thin carbon film (commonly used for ribosome samples)
- Use gold grids (Russo & Passmore (2014) Science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

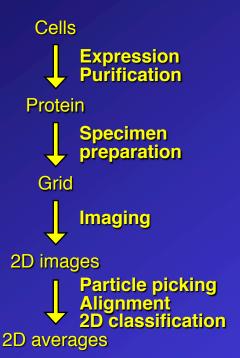
→ low electron dose

→ 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 (removes damaged high-resolution information retains low-resolution information for good SNR)



#### Potential issues:

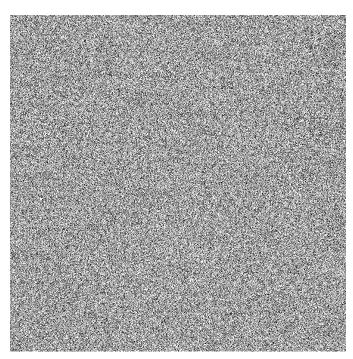
#### Particle picking:

Model/reference bias

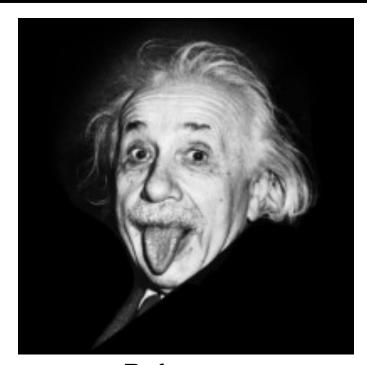
#### 2D classification:

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

#### Potential issues with particle picking



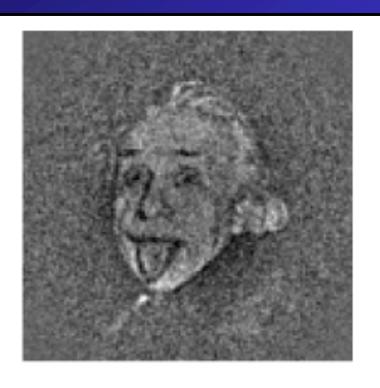
1,000 images containing pure white noise



Reference: Albert Einstein

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

#### Potential issues with particle picking



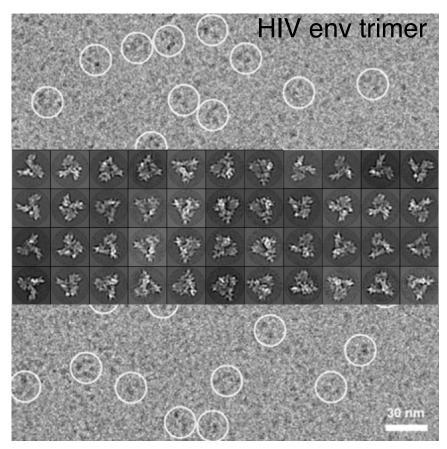
Model/reference bias

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

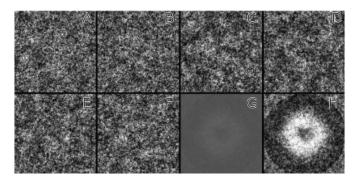
→ Einstein from noise

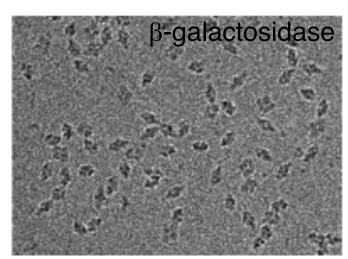
Shatsky *et al.* (2009) *J. Struct. Biol.* <u>166</u>: 67-78 Henderson (2013) *Proc. Natl. Acad. Sci. USA* <u>110</u>: 18037-18041

#### Potential issues with particle picking



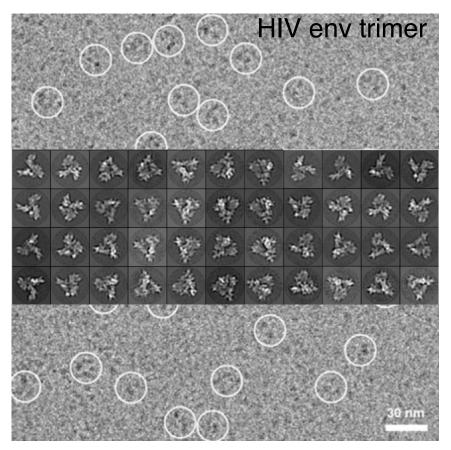
Mao *et al.* (2013) *PNAS* <u>110</u>: 12438-12443





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

#### Potential issues with particle picking



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

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

- → Averages will end up looking like templates used for particle picking
- → Better to first pick some images by hand and use resulting averages as templates for entire dataset

Henderson (2013) *PNAS* 110: 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

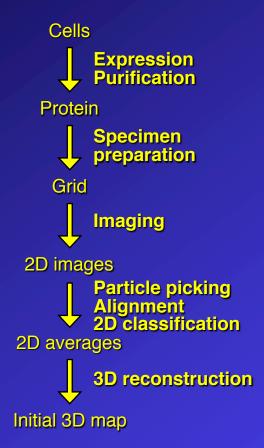
- the algorithm always converges, but not necessarily to the global optimum (the best possible solution)
- outliers (rare objects whose appearance is partially or entirely unrelated to that of the bulk of the data) have a very negative impact on the outcome
- problem of "group collapse", i.e., the possibility 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* <u>20</u>: 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

The latest version of ISAC (as implemented in SPHIRE) does not produce reliable classes anymore – use old SPARX version!



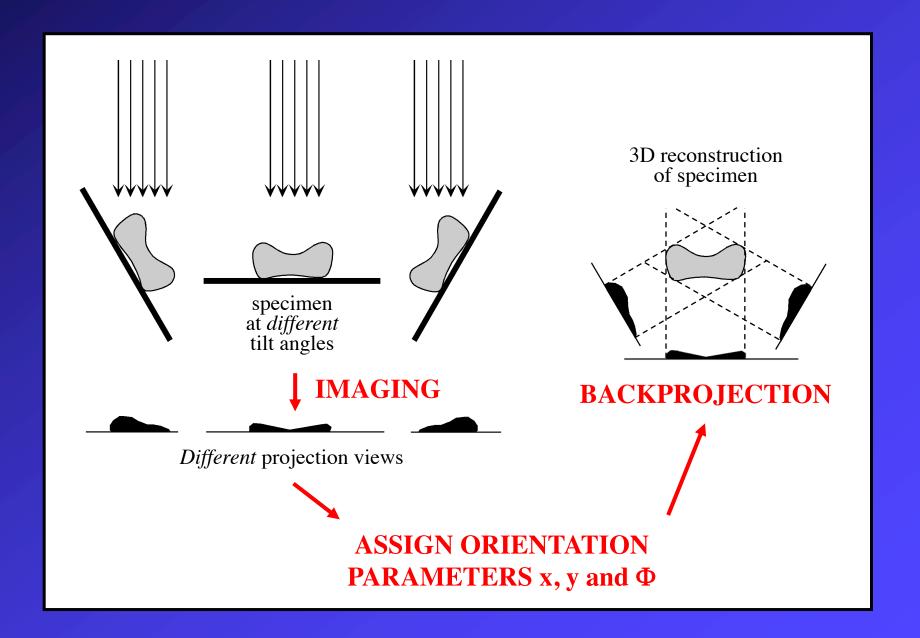
#### Potential issues:

Incorrect map

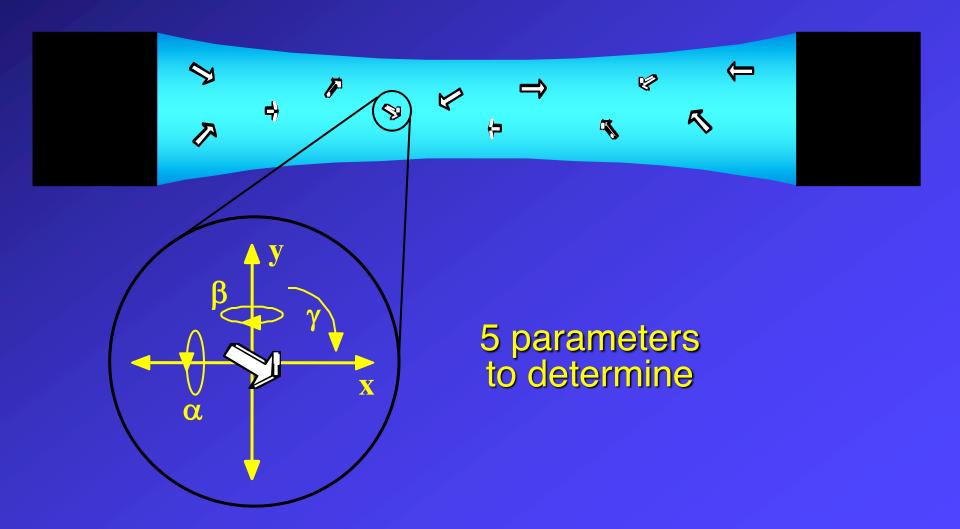
#### Because of:

- Heterogeneous sample
- Missing views
- Incorrect solution

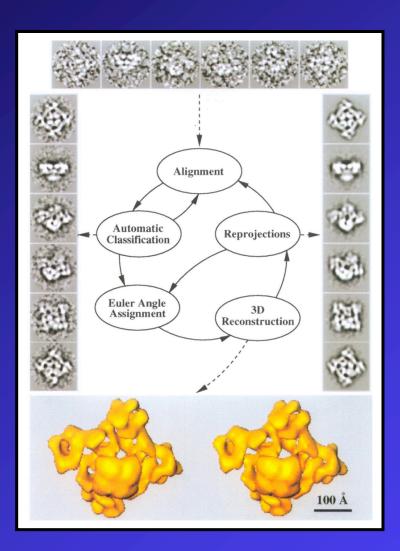
### Random conical tilt reconstruction



# Single particles in ice

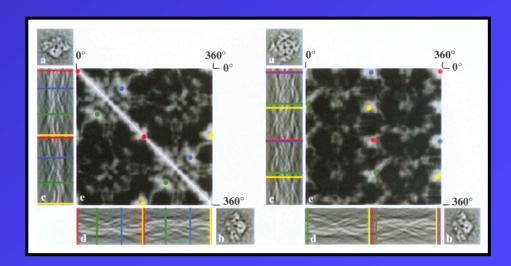


## Angular reconstitution

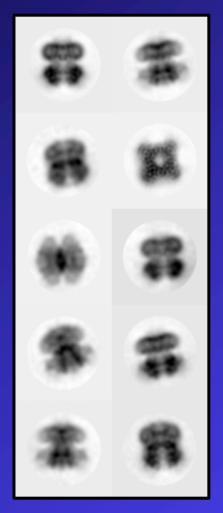


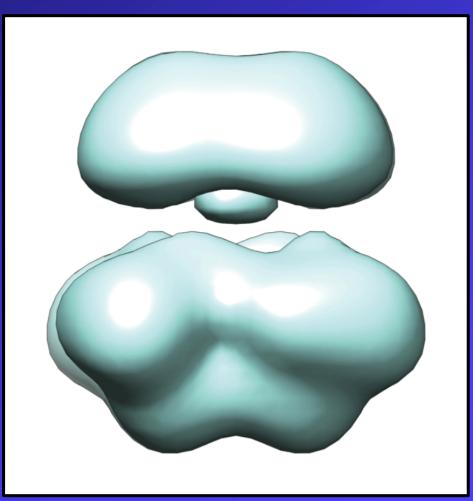
van Heel, 1987

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



## Chicken Slo2.2 in the absence of Nat





**VIPER** 

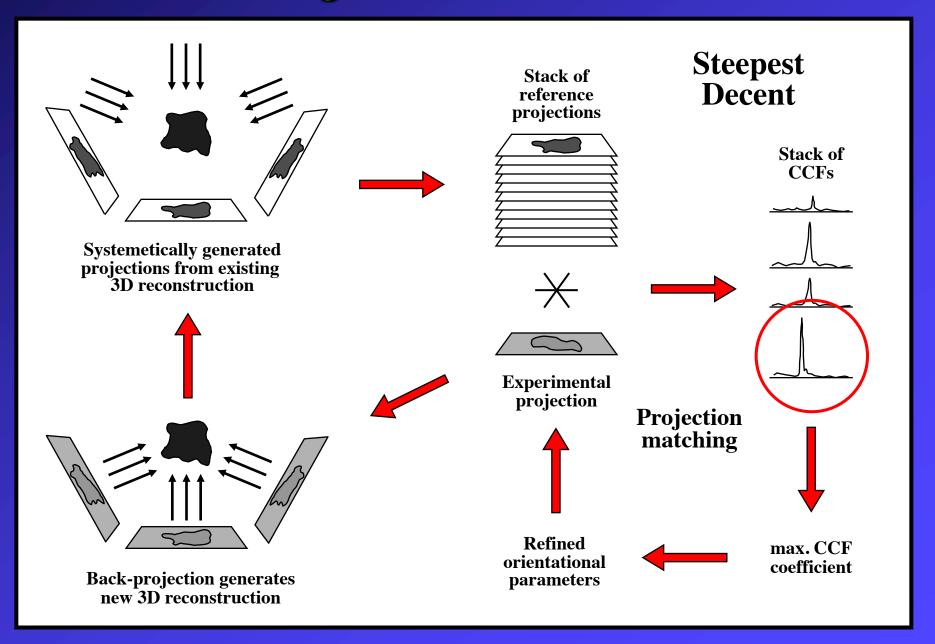
Stochastic Hill Climbing

(initially introduced in program SIMPLE)

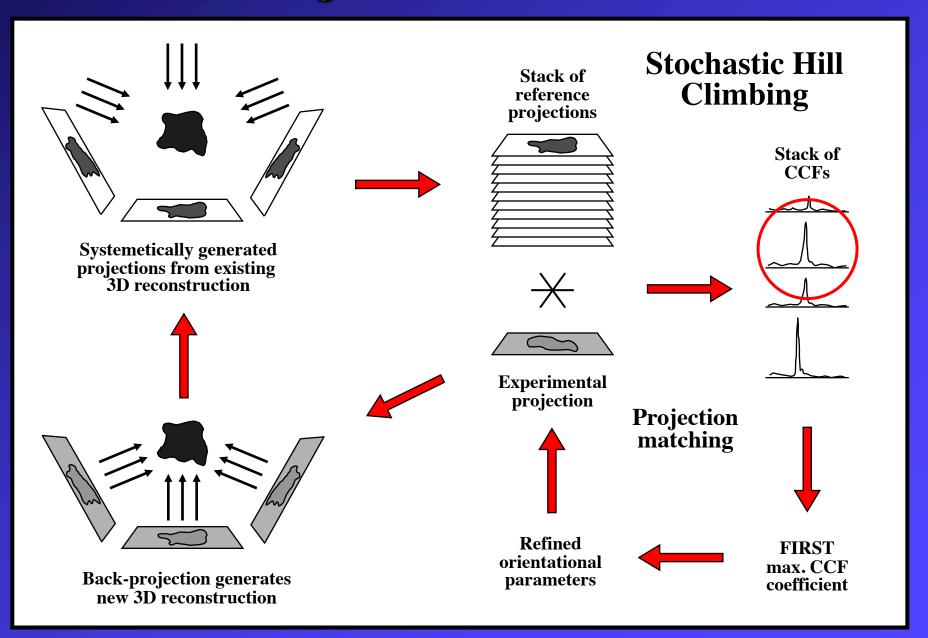
Class averages

Initial model (obtained with VIPER)

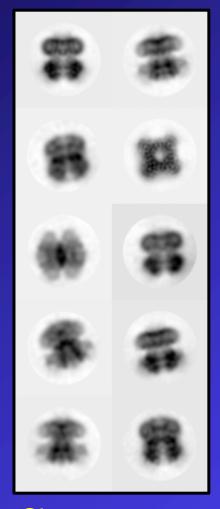
## Angular refinement

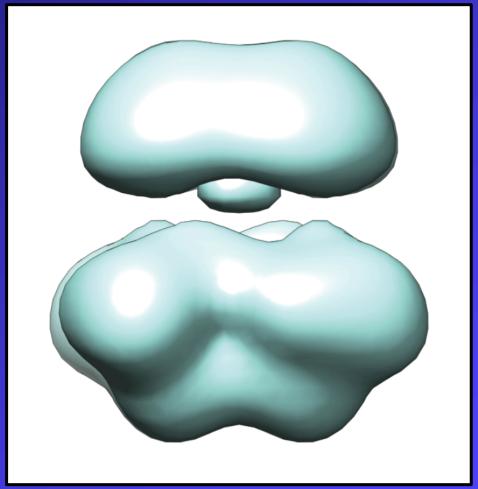


## Angular refinement



## Chicken Slo2.2 in the absence of Nat





**VIPER** 

Stochastic hill climbing

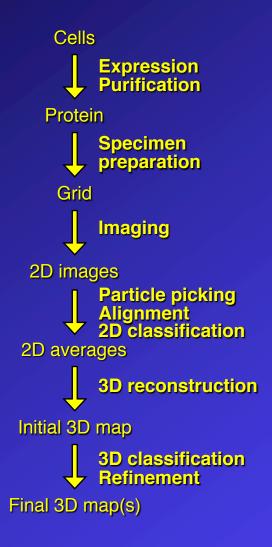
Similar principles as used in ISAC:

stability and reproducibility assessments

**cryoSPARC** 

Class averages

Initial model (obtained with VIPER)



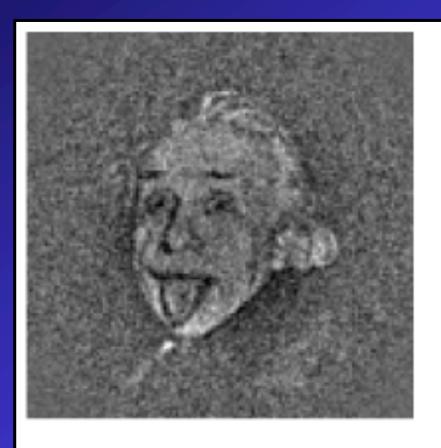
Potential issues:

Reference bias

**Overfitting** 

**Resolution assessment** 

#### Potential issues with density map



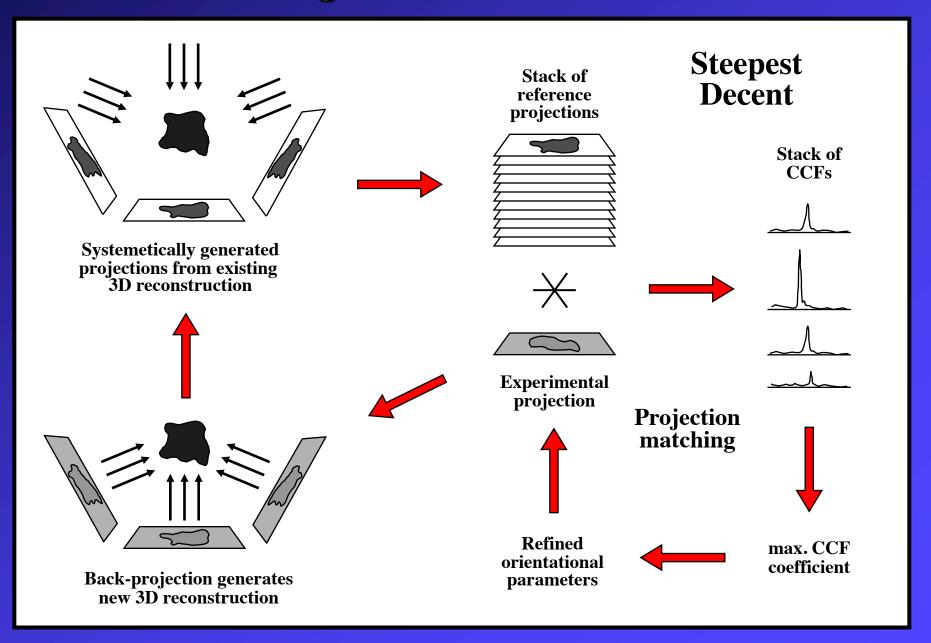
Model/reference bias

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

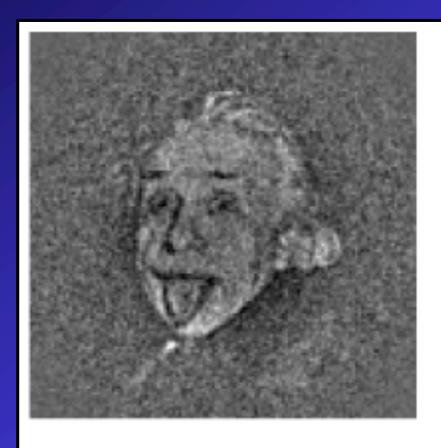
→ Einstein from noise

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

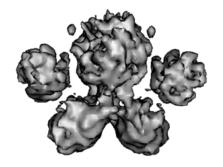
Average of 1,000 images containing pure white noise after alignment to an image of Albert Einstein

→ Einstein from noise

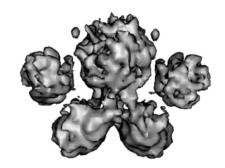
Over-fitting results in spurious highresolution features due to alignment of noise

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

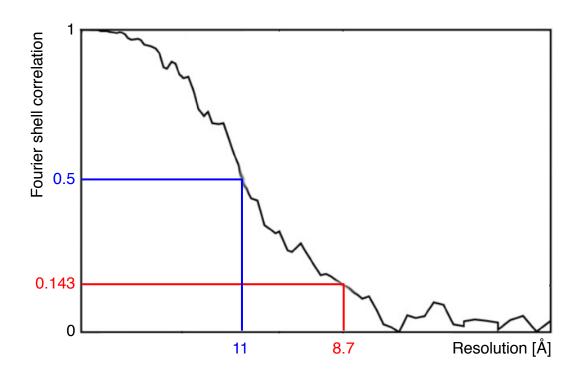
#### **Resolution assessment**



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



Maps have to be independent!



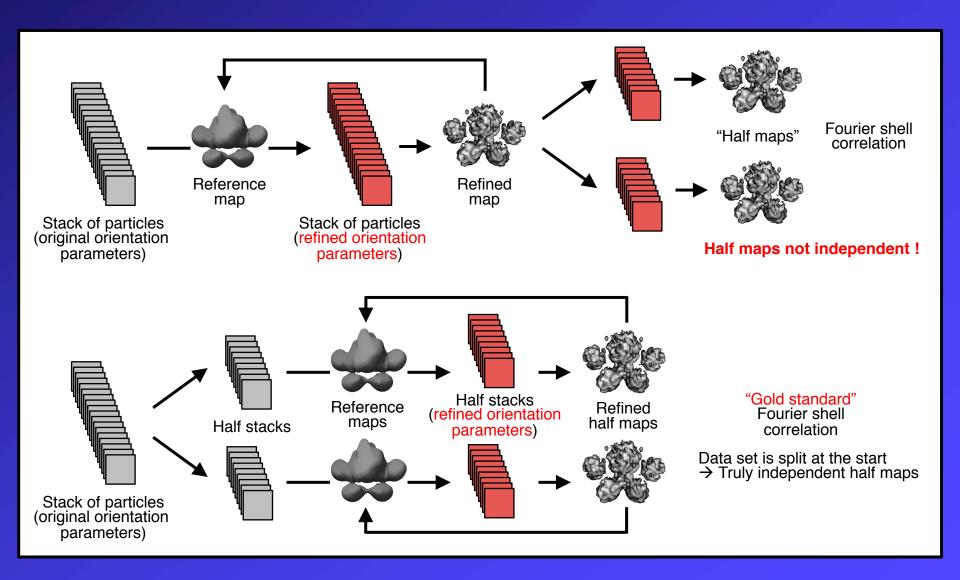
FSC = 0.5 Signal = Noise

Böttcher et al. (1997) Nature 386: 88-91

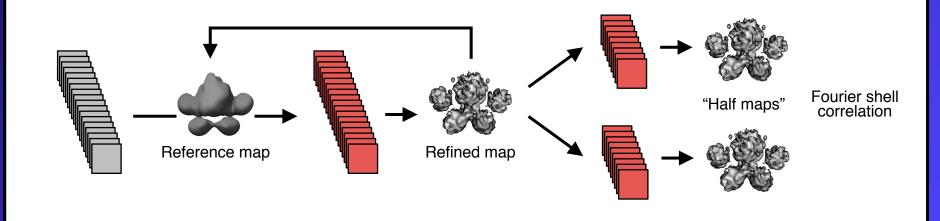
FSC = 0.143 Phase error =  $60^{\circ}$ 

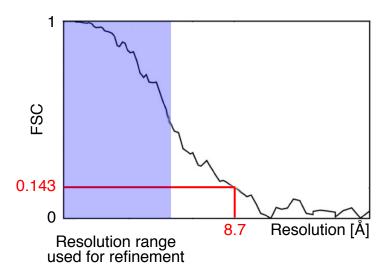
Rosenthal & Henderson (2003) J. Mol. Biol. 333: 721-745

#### **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**

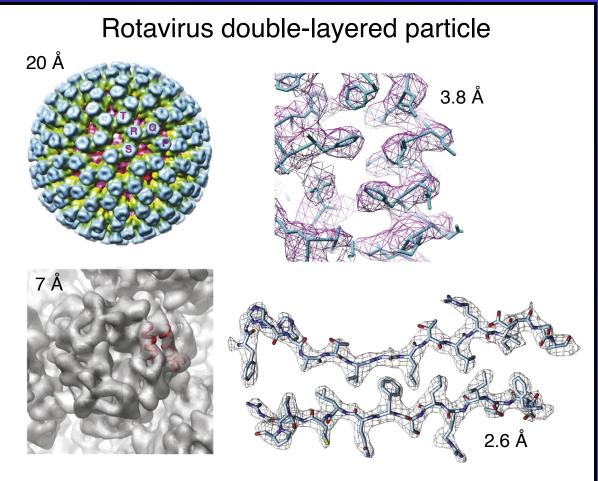
What should be resolved?

> 20 Å protein envelope

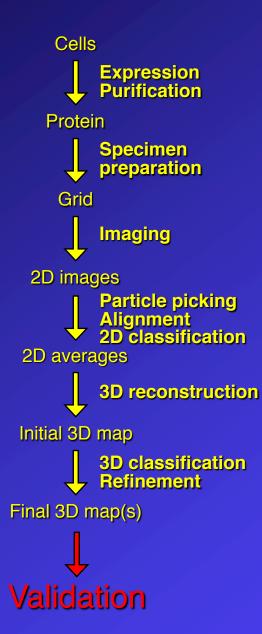
 $\sim$  9-10 Å  $\alpha$ -helices

< 4.8 Å  $\beta$ -sheets

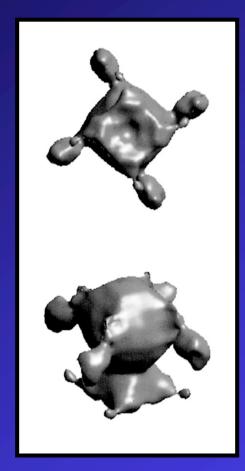
~ 4 Å bulky side chains

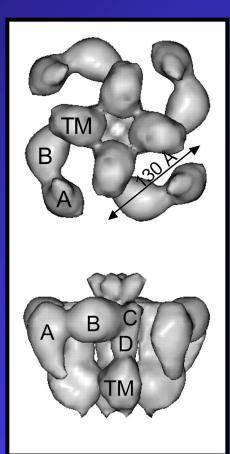


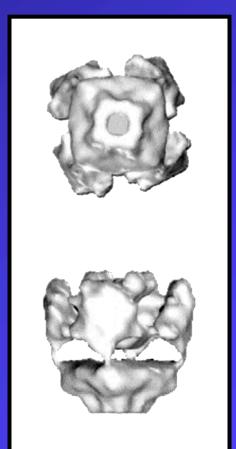
Rosenthal & Rubinstein (2015) Curr. Opin. Struct. Biol. 34: 135-144

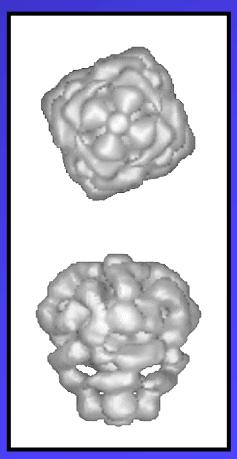


# The issue: Structures of the IP3 receptor as determined by single-particle EM









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

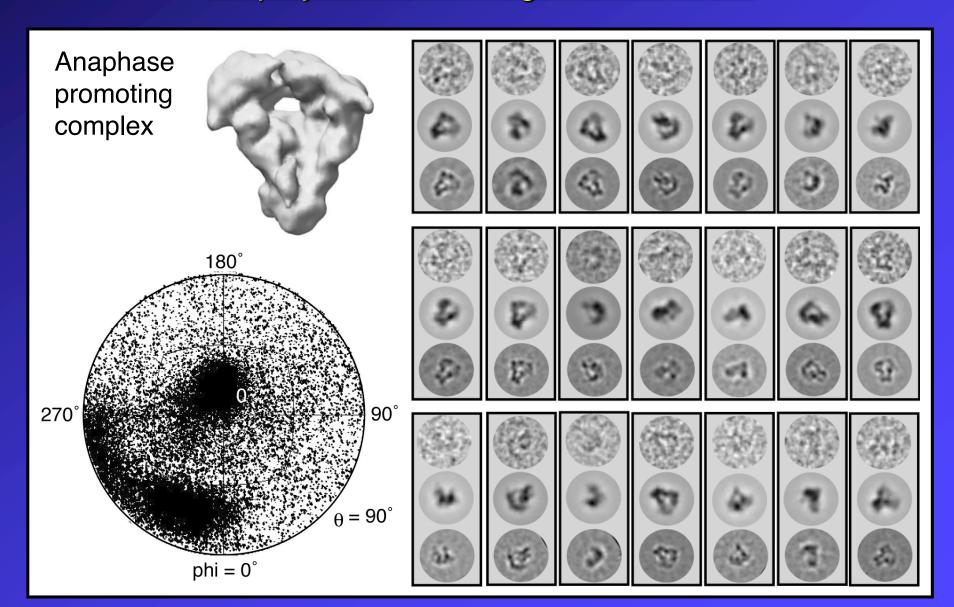
Richard Henderson,¹ Andrej Sali,² Matthew L. Baker,³ Bridget Carragher,⁴ Batsal Devkota,⁵ Kenneth H. Downing,⁶ Edward H. Egelman,² Zukang Feng,⁵ Joachim Frank,<sup>8,9</sup> Nikolaus Grigorieff,¹⁰ Wen Jiang,¹¹ Steven J. Ludtke,³ Ohad Medalia,¹²,²¹ Pawel A. Penczek,¹³ Peter B. Rosenthal,¹⁴ Michael G. Rossmann,¹⁵ Michael F. Schmid,³ Gunnar F. Schröder,¹⁶ Alasdair C. Steven,¹² 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,\*

Henderson et al. (2012) Structure 20: 205-214

- Compare reference-free averages with projections

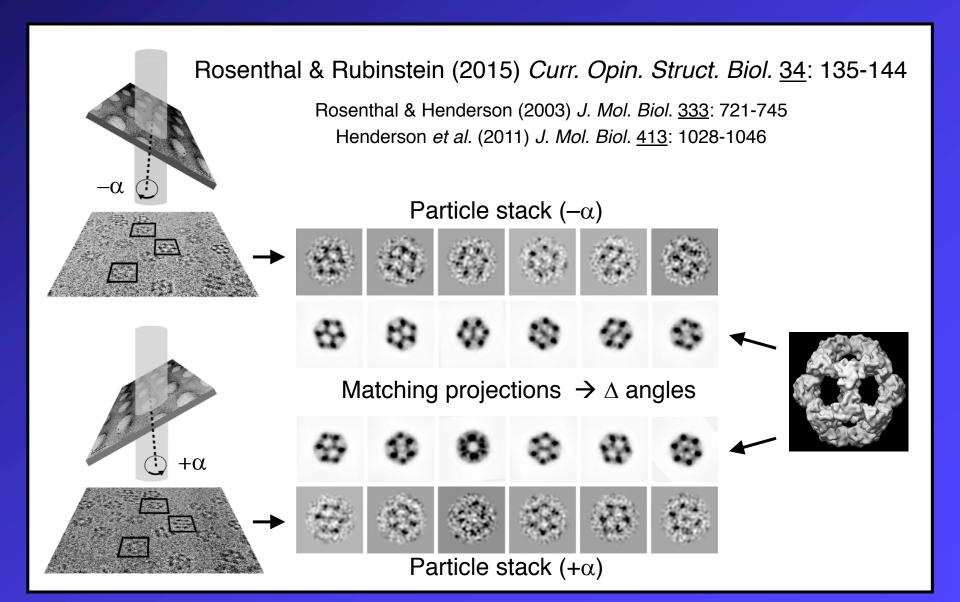
Henderson et al. (2012) Structure 20: 205-214

#### Re-projections and angular distribution



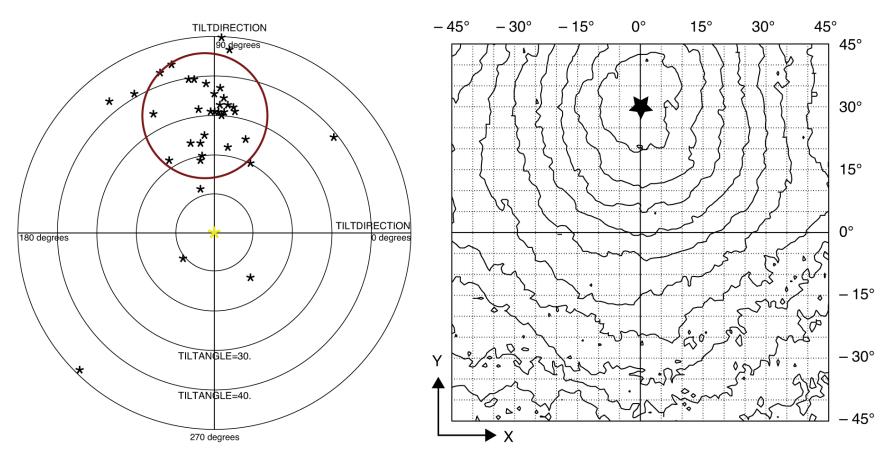
- Compare reference-free averages with projections
  - only checks consistency of 3D map with 2D data
  - also check angle distribution
- Tilt-pair analysis

Henderson et al. (2012) Structure 20: 205-214



#### Tilt-pair parameter plot

#### Tilt-pair phase residual plot



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

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

Table 1. Overview of tilt-pair statistics

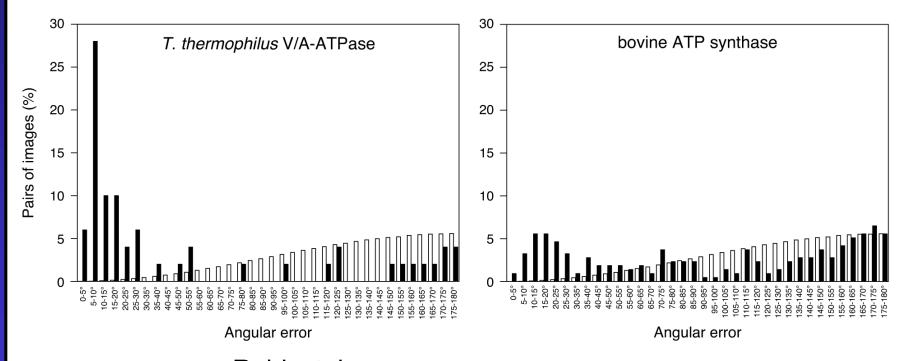
		Particle size	Molecular mass	Number of	Number of	Successful	Angular error (°)	
Specimen	Symmetry	(Å)	(MDa)	tilt pairs	particles	alignment (%)	Mean	Maximum
Rotavirus DLP	I2	700	50	10	95	100/100	0.25	1.0
CAV	I2	255	2.7	1	45	62/82	2.5	3.5
70S ribosomes	C1	$270 \times 260$	2.6	12	220	45/75	4.0	5.0
FAS	D3	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	$250 \times 140$	0.6	1	50	54/80	10.0	16.0
Bovine F-ATPase	C1	$250 \times 140$	0.6	1	29	52/79	20.0	25.0
DNA-PKcs	C1	$150 \times 120$	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"

#### Tilt-pair alignment test

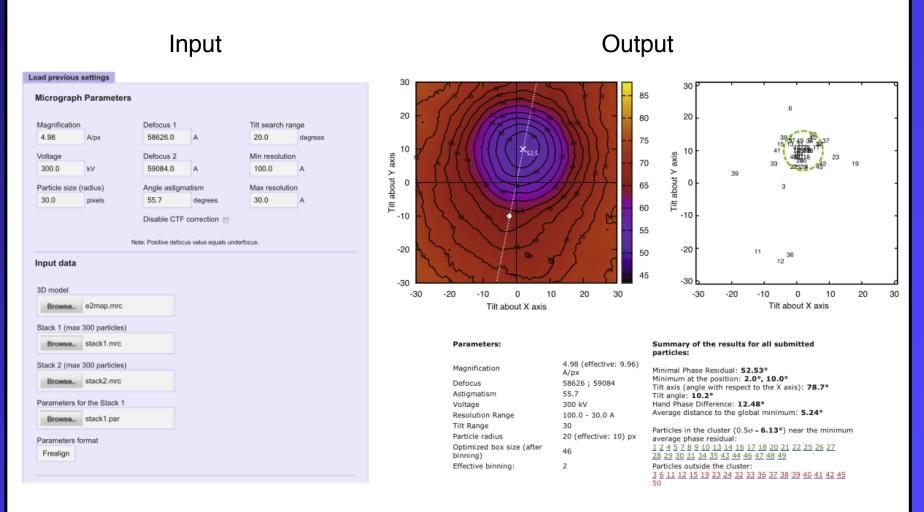
- angular errors for determination of the tilt transformation of each particle pair
- expected for random orientations



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

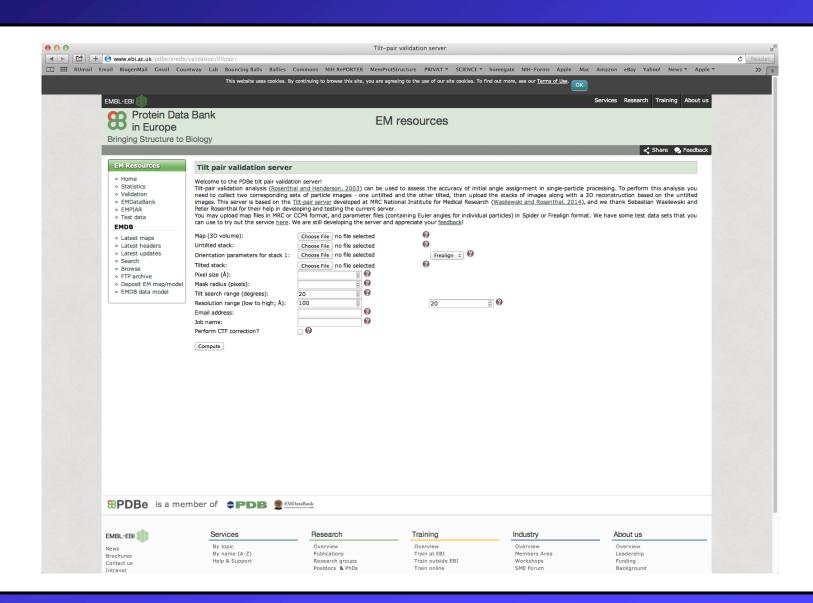
Baker *et al.* (2012) *Proc. Natl Acad. Sci. USA* <u>109</u>: 11675-11680 Russo & Passmore (2014) *J. Struct. Biol.* <u>187</u>: 112-118

# 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

Henderson et al. (2012) Structure 20: 205-214

# Map validation Randomize phases

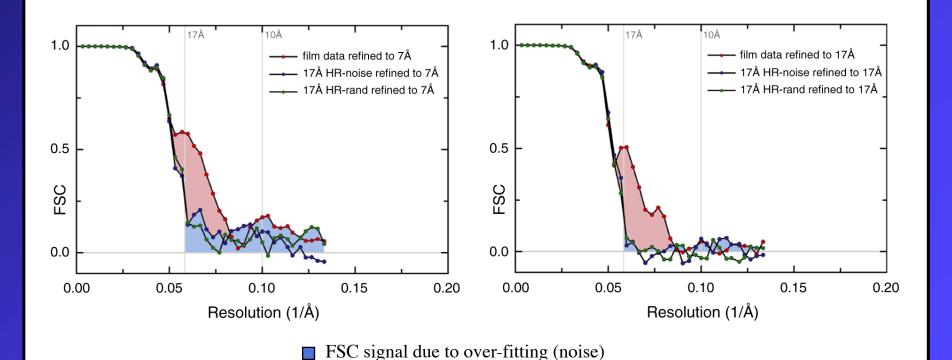
Rosenthal & Rubinstein (2015) *Curr. Opin. Struct. Biol.* 34: 135-144 Chen *et al.* (2013) *Ultramicroscopy* 135: 24-35

- Do single-particle reconstruction / refinement
- Determine resolution (FSC)
- Take raw data, randomize phases beyond which FSC<sub>T</sub> 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

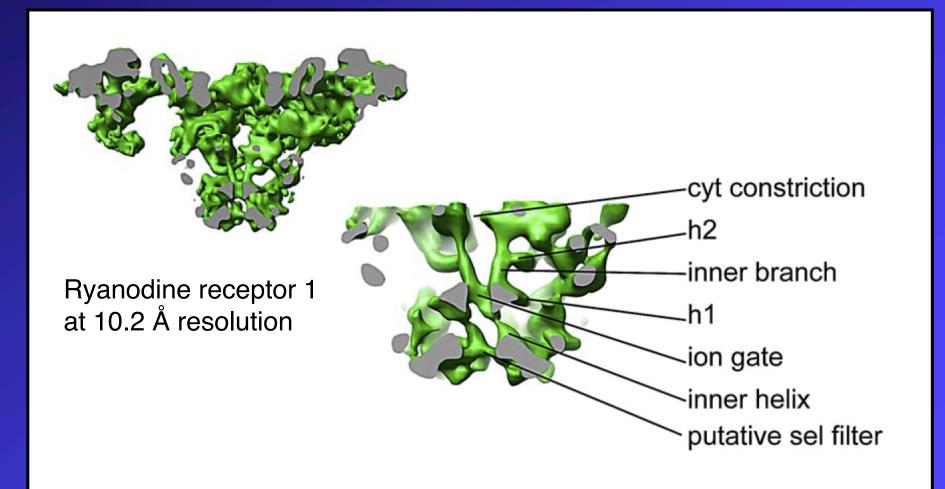


FSC signal due to true structural information

- 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

Henderson et al. (2012) Structure 20: 205-214

#### Expected secondary structure

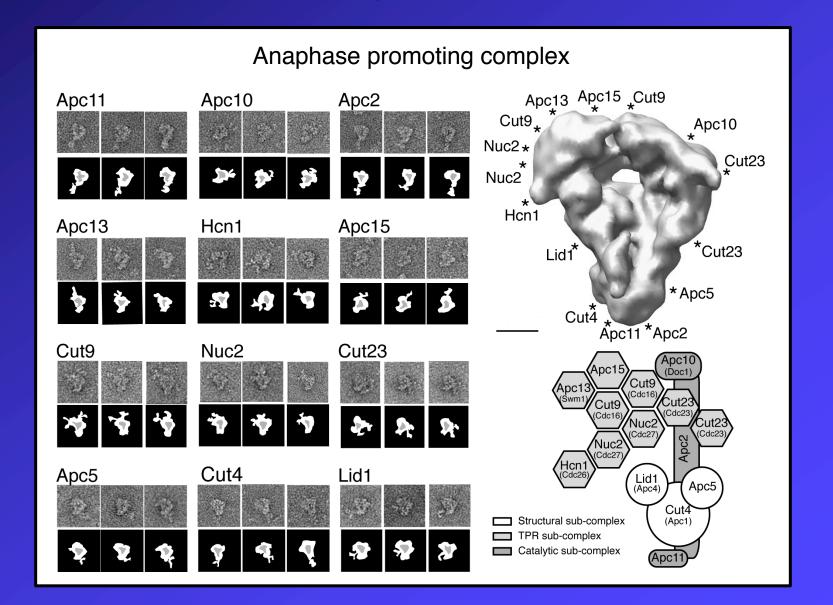


Samso *et al.* (2009) *PLoS Biol.* <u>7</u>: e1000085

- 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
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- Evaluate with published information

Henderson et al. (2012) Structure 20: 205-214

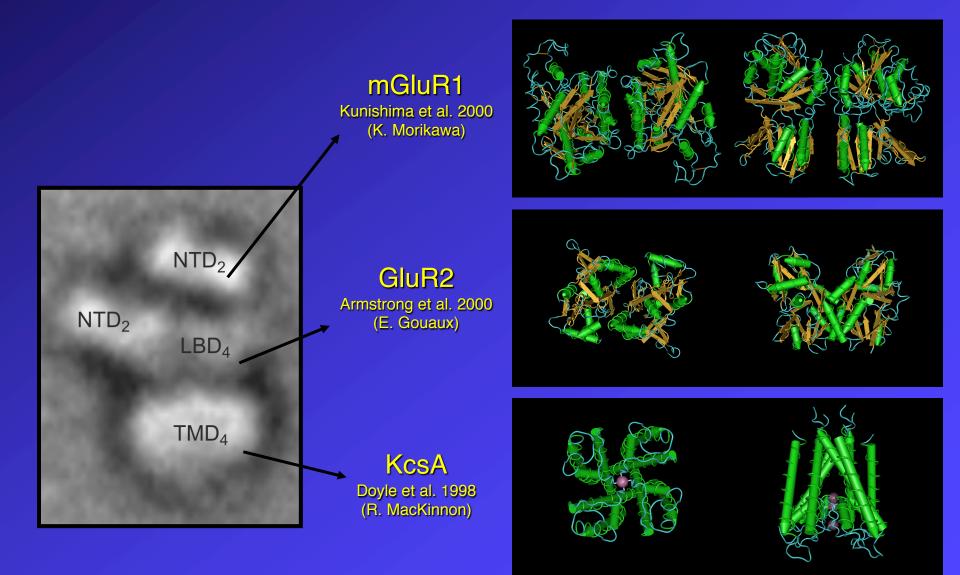
# Map validation Evaluation with published information



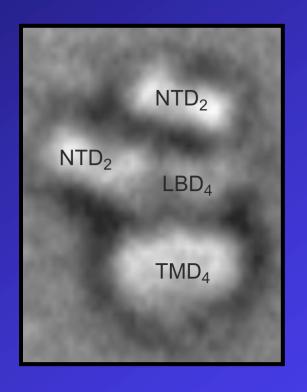
- Compare reference-free averages with projections
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  - excellent, but not commonly used
- Appearance of expected secondary structure elements
- Evaluate with published information
   yeast two-hybrid analysis
   pull-down experiments
  - cross-link mass spectrometry
- Dock known atomic structures into map

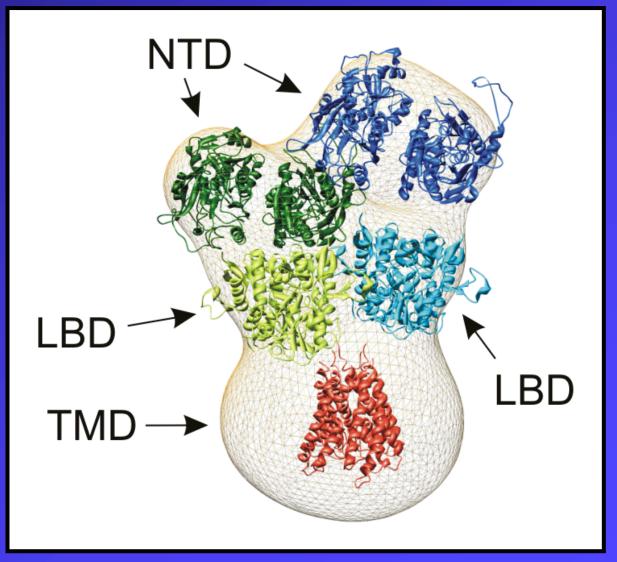
Henderson et al. (2012) Structure 20: 205-214

# Map validation Docking of atomic models

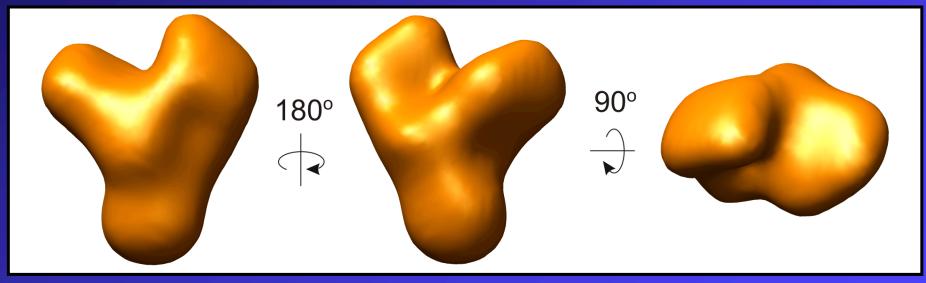


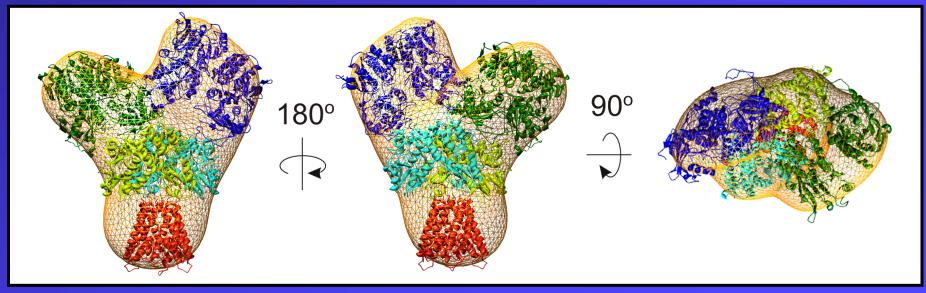
# Map validation Docking of atomic models



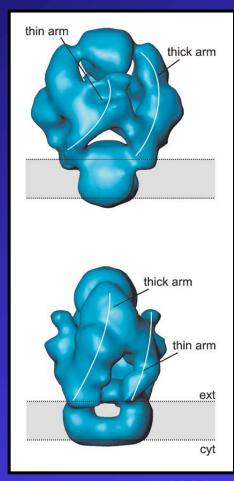


# Map validation Docking of atomic models

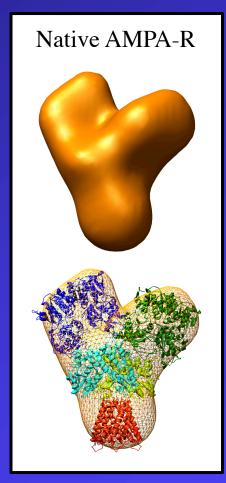




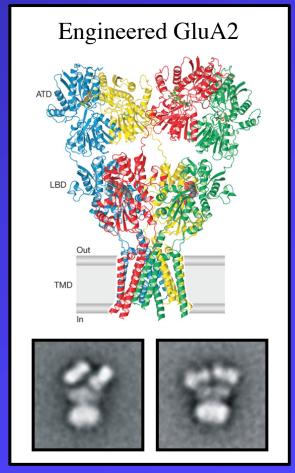
#### **Docking of atomic models**



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

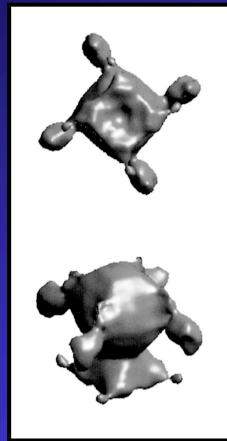


Nakagawa *et al*. (2006) *Biol. Chem*. <u>387</u>: 179-187

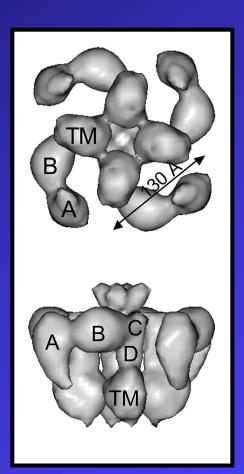


Sobolevsky *et al.* (2009) *Nature* <u>462</u>: 745-758

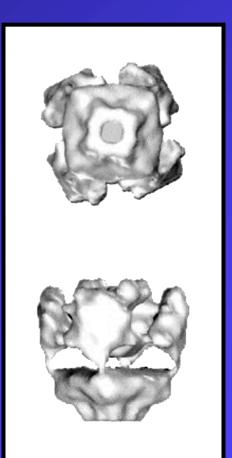
<u>Different maps of the IP3 receptor</u>



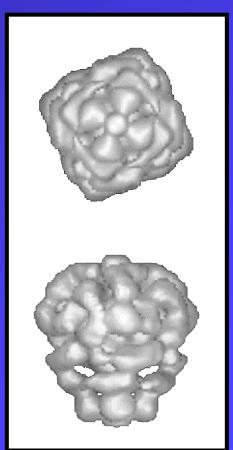
Jiang *et al.*, 2002



Serysheva *et al.*, 2003

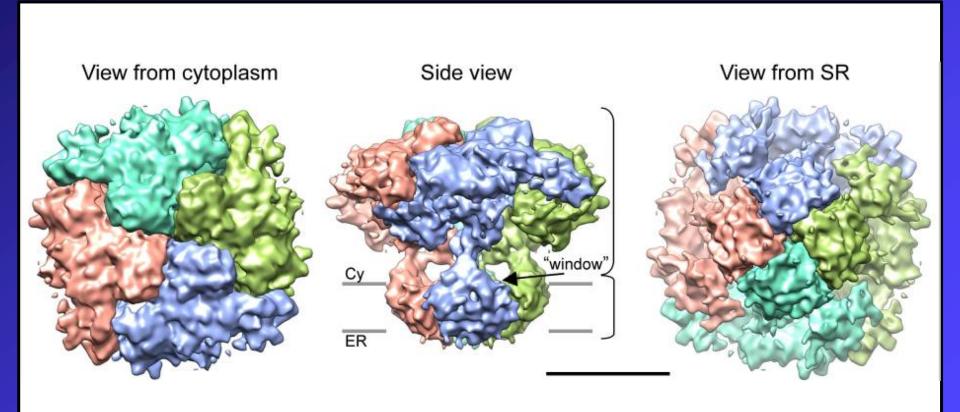


Jiang *et al.*, 2003



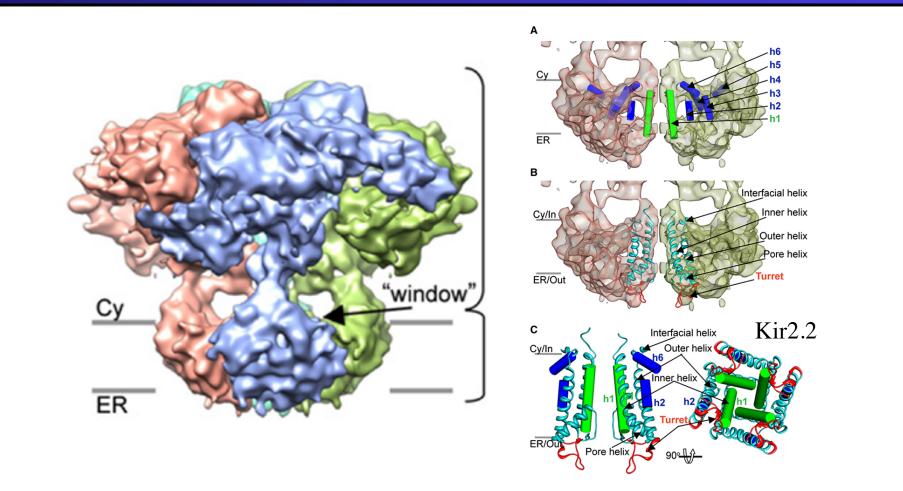
Sato *et al.*, 2004

# Map validation - IP3 receptor New density map in 2011 at 11 Å resolution



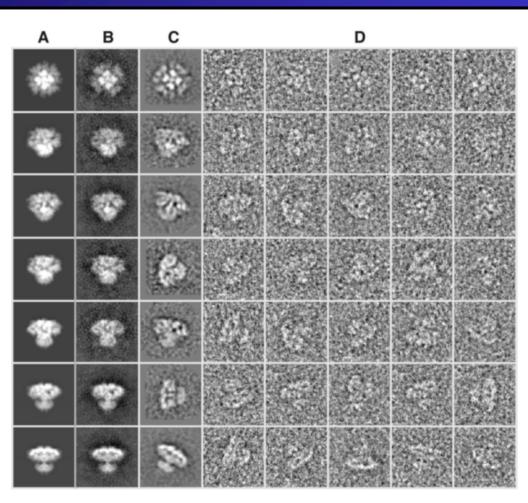
Ludtke et al. (2011) Structure 19: 1192-1199

**Expected secondary structure elements** 



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

#### Comparison of reference-free averages with projections



A: Map projection

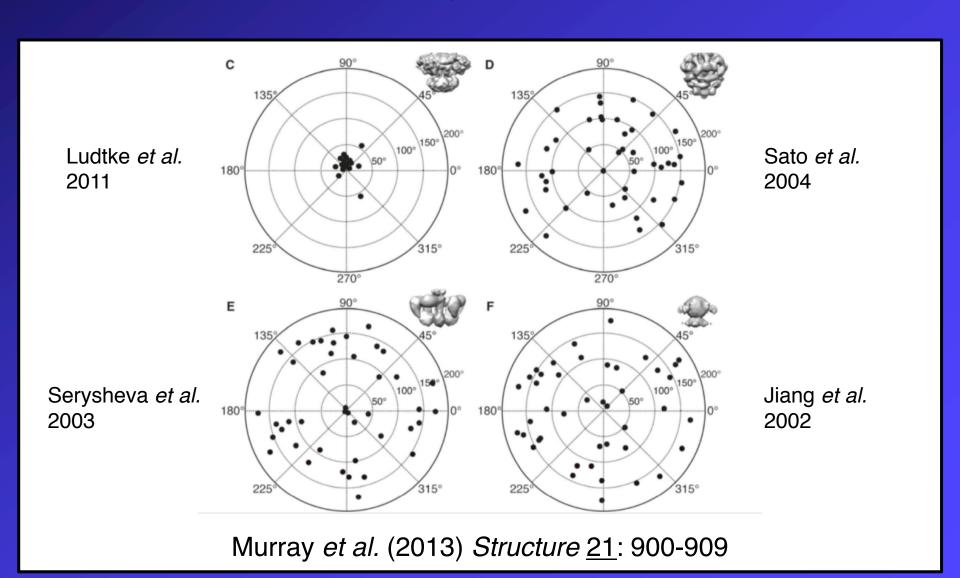
B: Reference-based class average

C: Reference-free class average

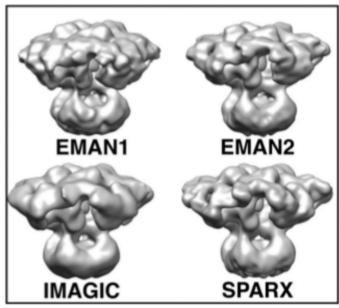
D: Selected particles

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

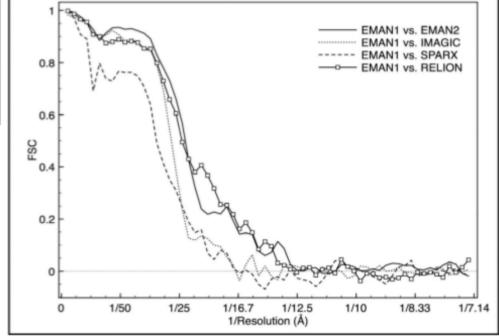
#### Tilt pair test



Comparison of maps from different programs

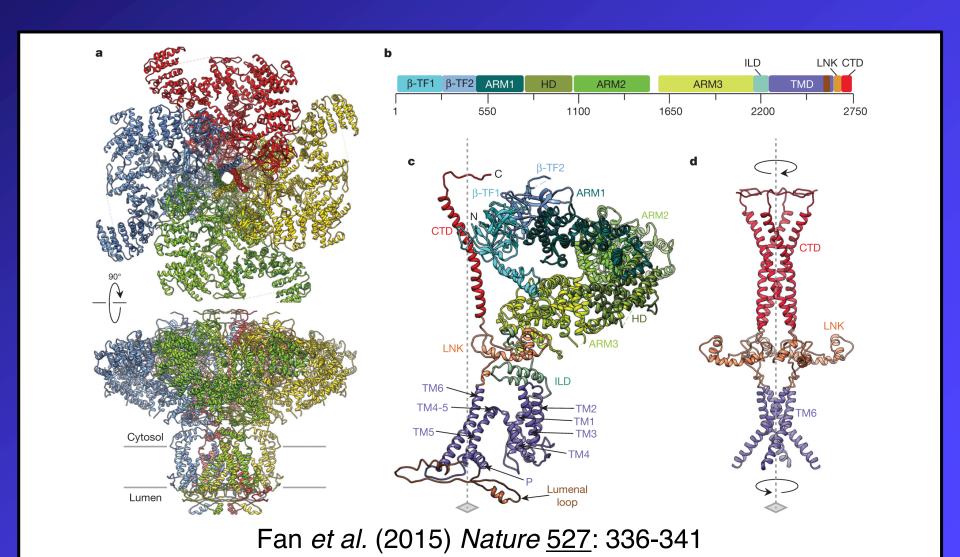




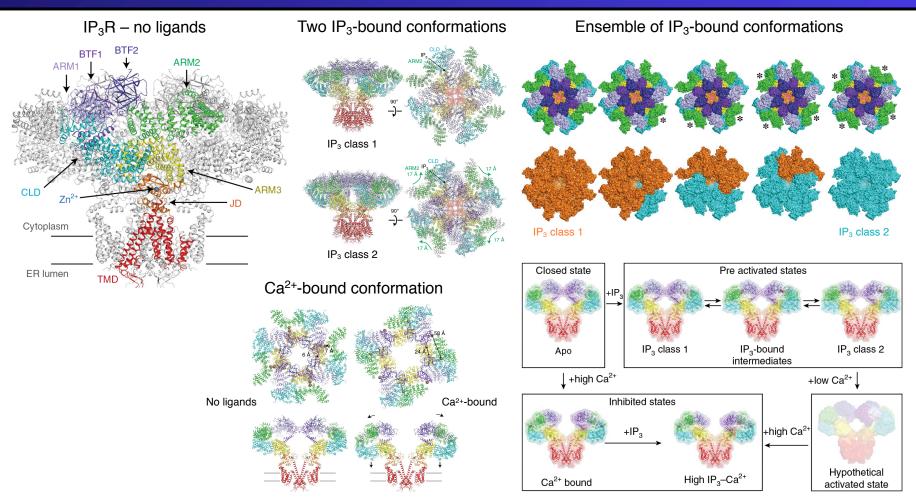


Murray *et al.* (2013) *Structure* <u>21</u>: 900-909

4.7 Å resolution structure (2015)



# Map validation - IP3 receptor 3.5 Å resolution structure (2018)



Paknejad & Hite (2018) Nat. Struct. Mol. Biol. 25: 660-668