Refinement, Validation and more

Pavel Afonine



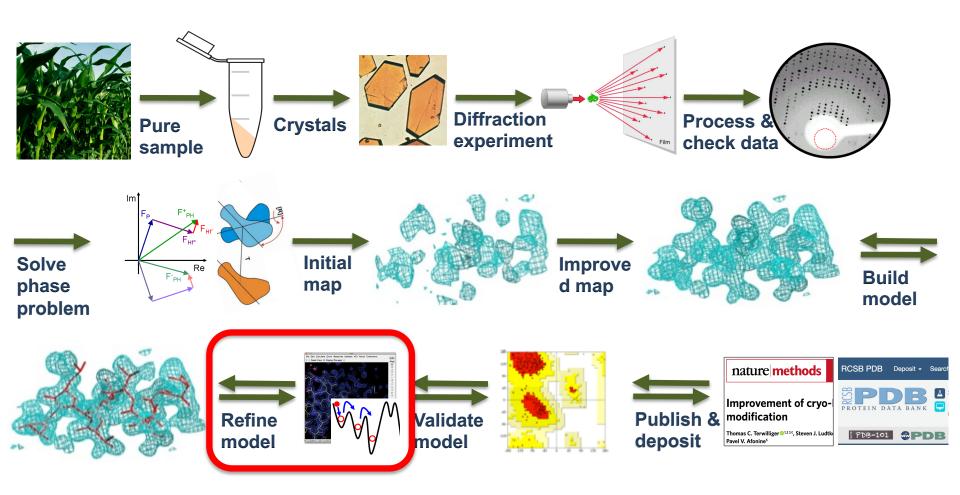


phenix-online.org

lbl.gov

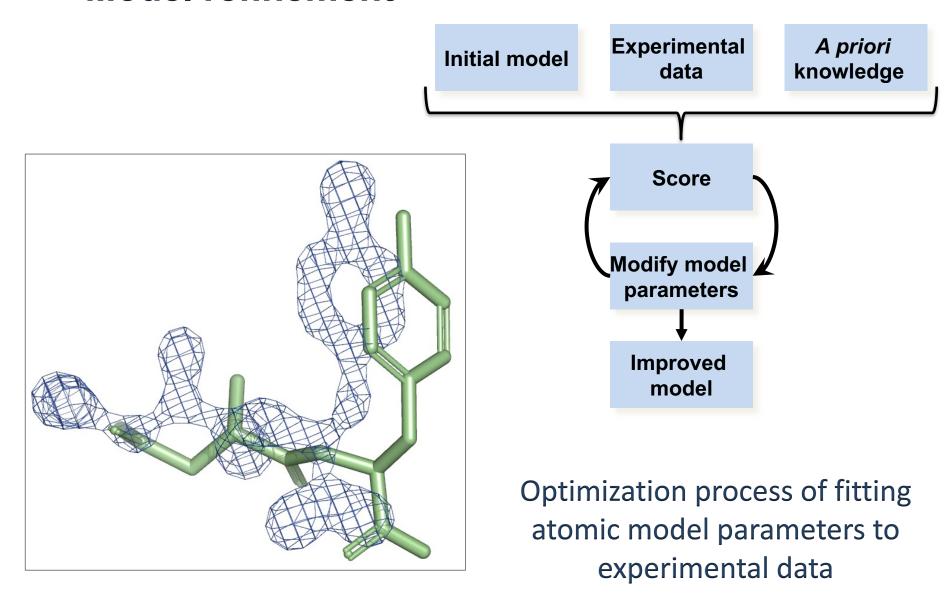
July 18th, 2025 ACA, Lombard, IL

Solving structure - crystallography

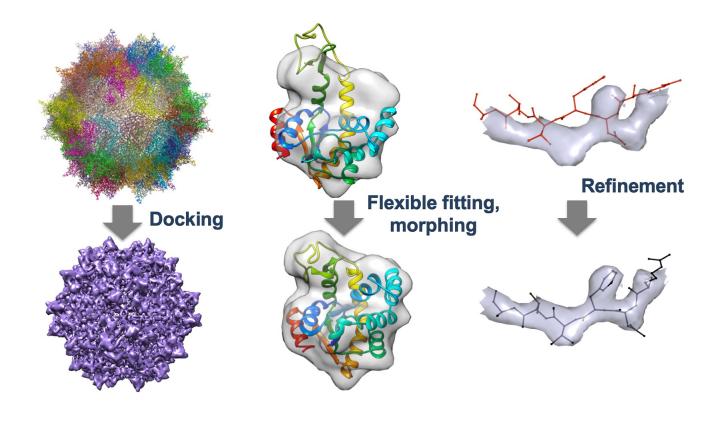


- Process is not as 'linear' as shown
- Each step has numerous sub-steps
- Crystals may not grow or exhibit pathologies
- Stuck solving phase problem

Model refinement

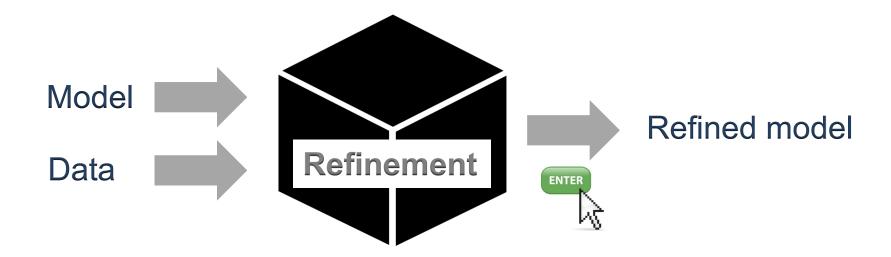


Not all model-to-data fitting is refinement

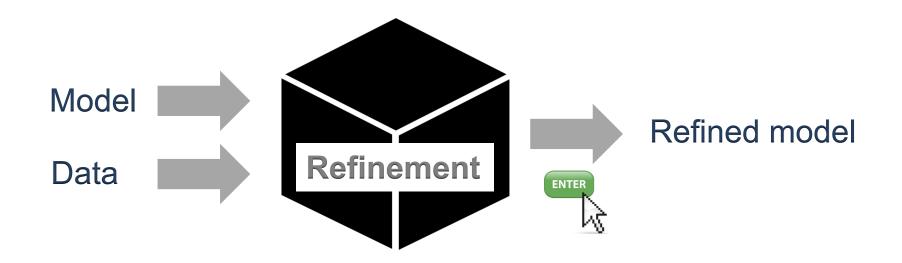


- Docking, flexible fitting, morphing are **not** refinement
- Refinement is to fine-tune an already ok atomic model
 - Refinement does only small changes to the model
 - Convergence radius of refinement ~ 1Å

Model refinement: black box



Model refinement: black box



- Does it always work?
- No.
 - Refinement parameterization isn't easy
 - Default settings suit most common scenario
 - Less typical situations need customizations

Model refinement: lot of stuff to know...

Rotamer fixing? TLS? Reference model? AltLocs? Group B vs individual? Local minima? ADP? NCS? IAS? Clashes? tNCS? Grid search? SA? CDL? Weights? Rama plot restraints? Minimization? Restraints? f' & f"? **Bulk-Solvent?** Hydrogens? Rama-Z? Anisotropy? Rigid body? Twinning? SS restraints? NQH flips?

Model refinement: black box

- What to do when the 'black box' does not work?
 - Your decision-making is needed (and it is not always easy!)
- Validation helps to know you are on the right track

Model refinement: decision-making variables

- Crystal
 - Disorder
 - Twining, tNCS
 - Solvent content
 - Symmetry

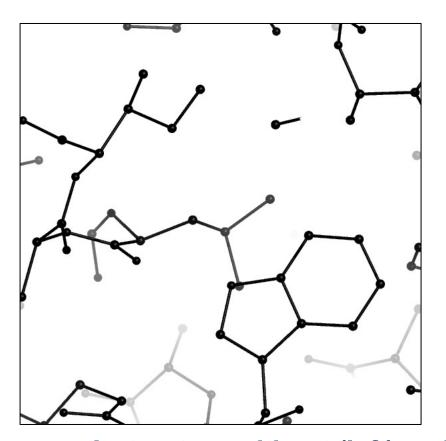
- Data
 - Resolution
 - Errors
 - Completeness
 - Processing

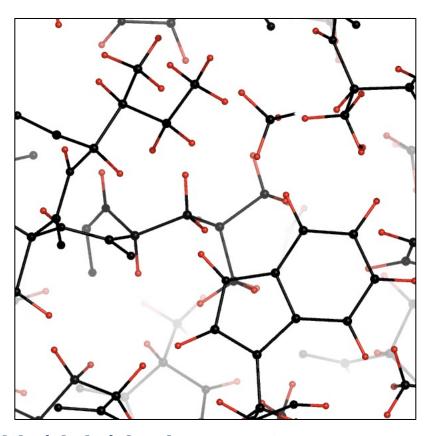
- Model
 - Stage
 - Source
 - Parameterization
 - Fit to data

Model refinement: random topics

Hydrogens

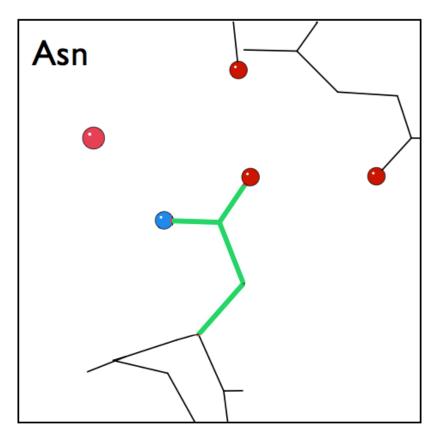
- Half of the atoms in a protein molecule
- Make most interatomic contacts
- Add to model towards the end, data resolution does not matter
- Once added, do not remove before the PDB deposition
- H do contribute to R-factors (expect 0.1-2% drop in R)

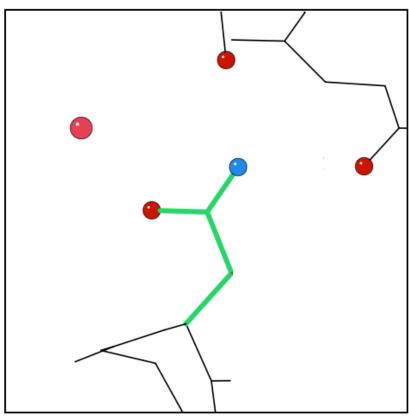




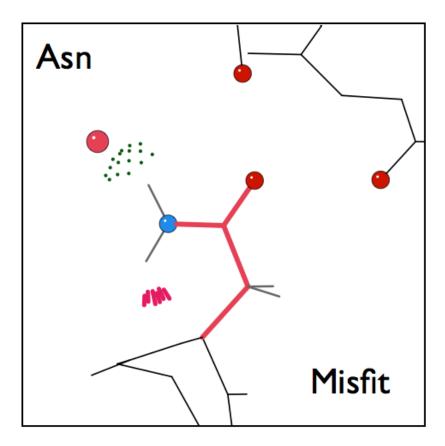
A structure without (left) and with (right) hydrogen atoms

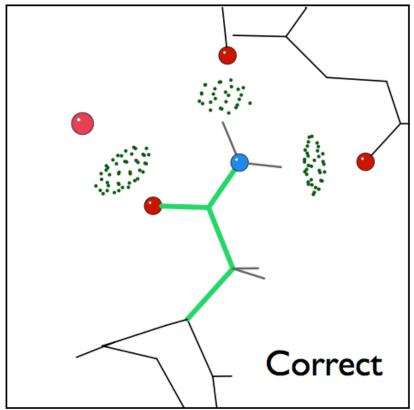
- N/Q/H flips (asparagine/glutamine/histidine)
 - Based on clash analysis
 - Requires H present





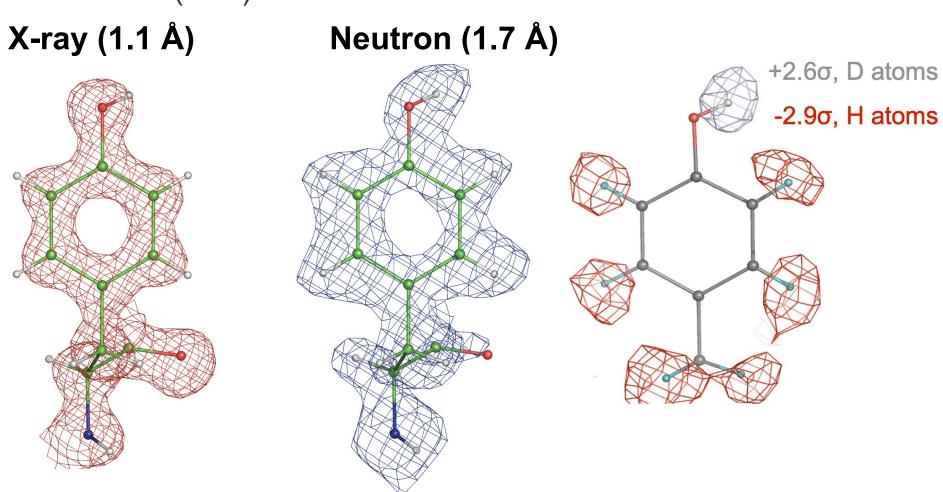
- N/Q/H flips
 - Based on clash analysis
 - Requires H present





Hydrogens are best revealed by neutrons!

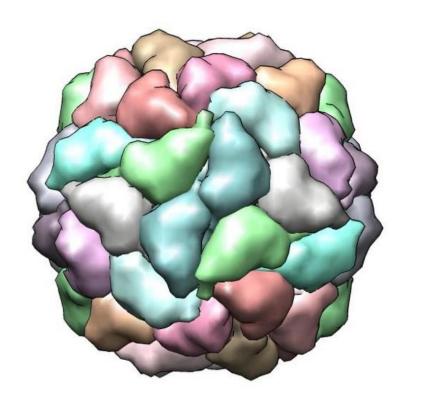
Nuclear density maps show H (D) at typical macromolecular resolutions (~2Å)

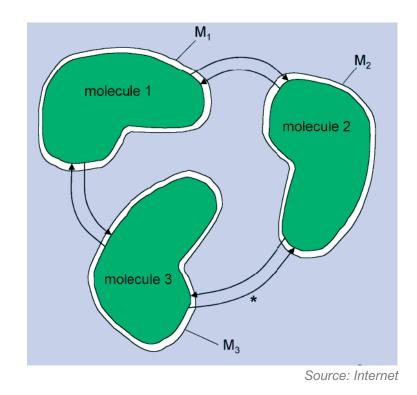


2mFo-DFc maps at 1.5σ (Rubredoxin, PDB code: 3KKY)

Constraints vs Restraints

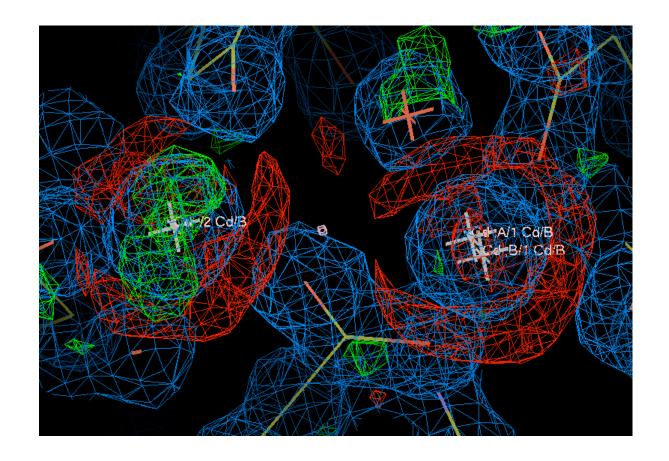
NCS: constraints vs restraints





- Constraints: molecules 1, 2 and 3 are required to be identical
- **Restraints**: molecules 1, 2 and 3 are required to be similar but not necessarily identical

Heavy atoms and map artifacts



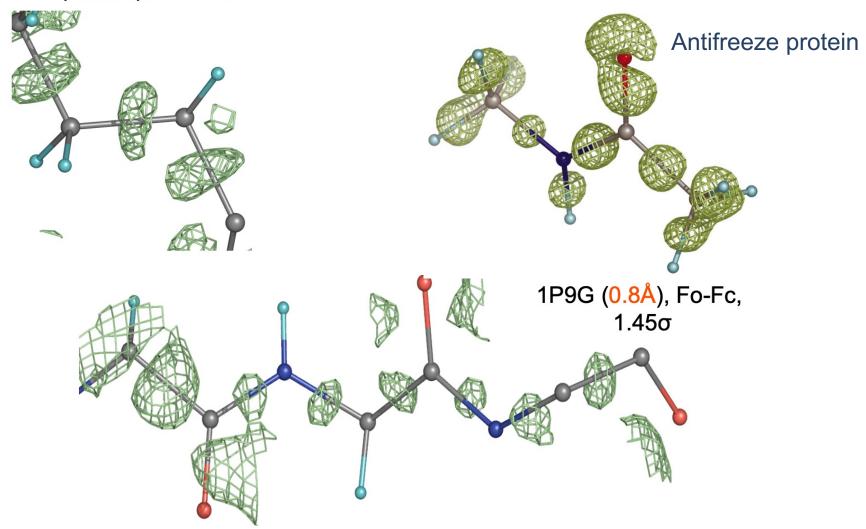
Reasons for +ve/-ve density:

- Suboptimal xyz, occupancy, ADP (isotropic vs anisotropic), anomalous f' & f", charge
- Refinement has not reached convergence
- Wrong atom



Ultra-high resolution: 1Å or better

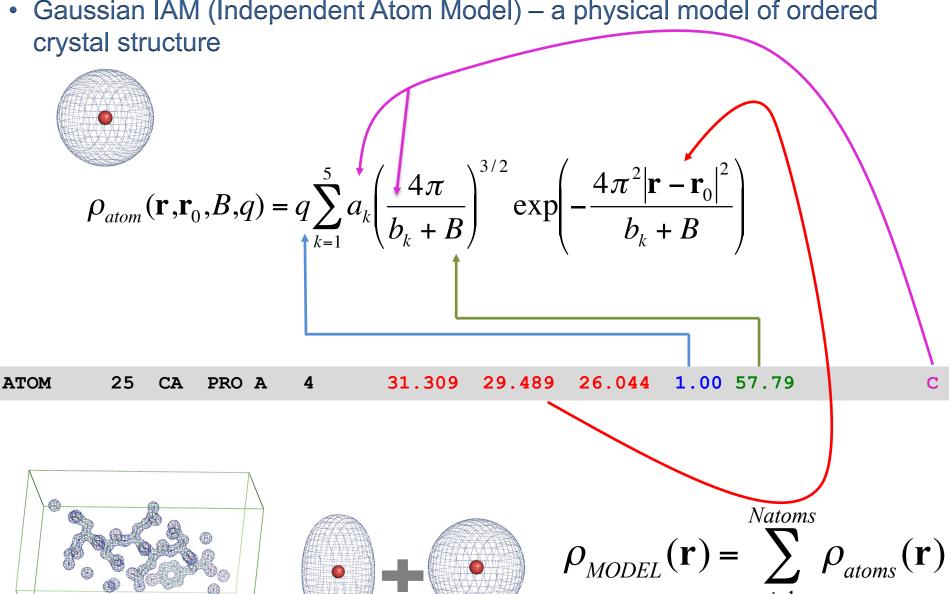
1UCS (0.62Å), Fo-Fc, 1.7σ



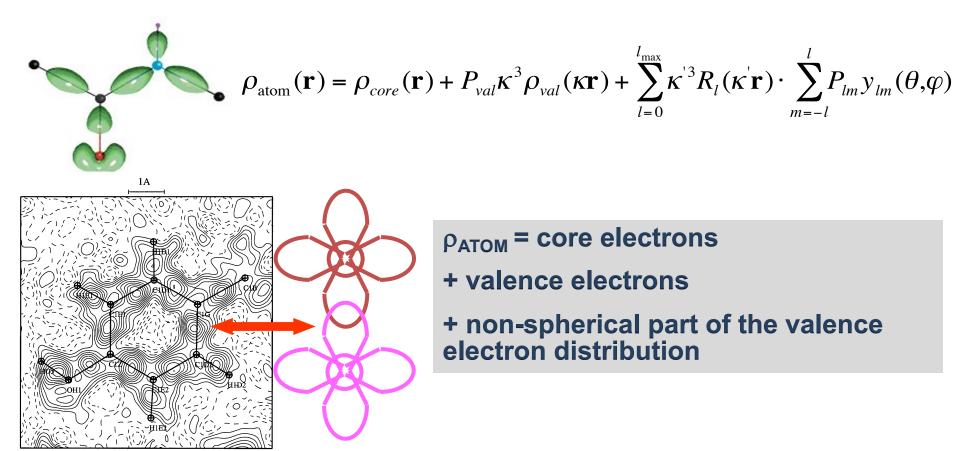
Multipolar refinement needs to be done. Will be available in Phenix later this year

Atomic model

Gaussian IAM (Independent Atom Model) – a physical model of ordered



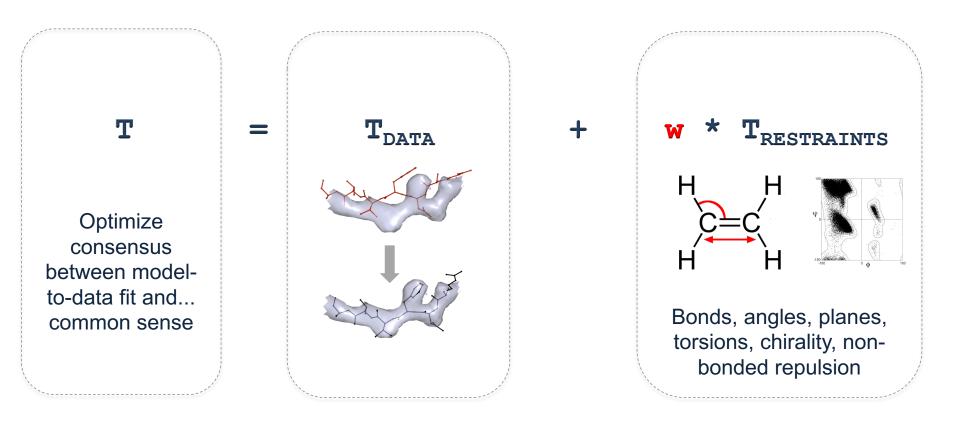
More accurate approximation assumes atoms are bonded: multipolar model



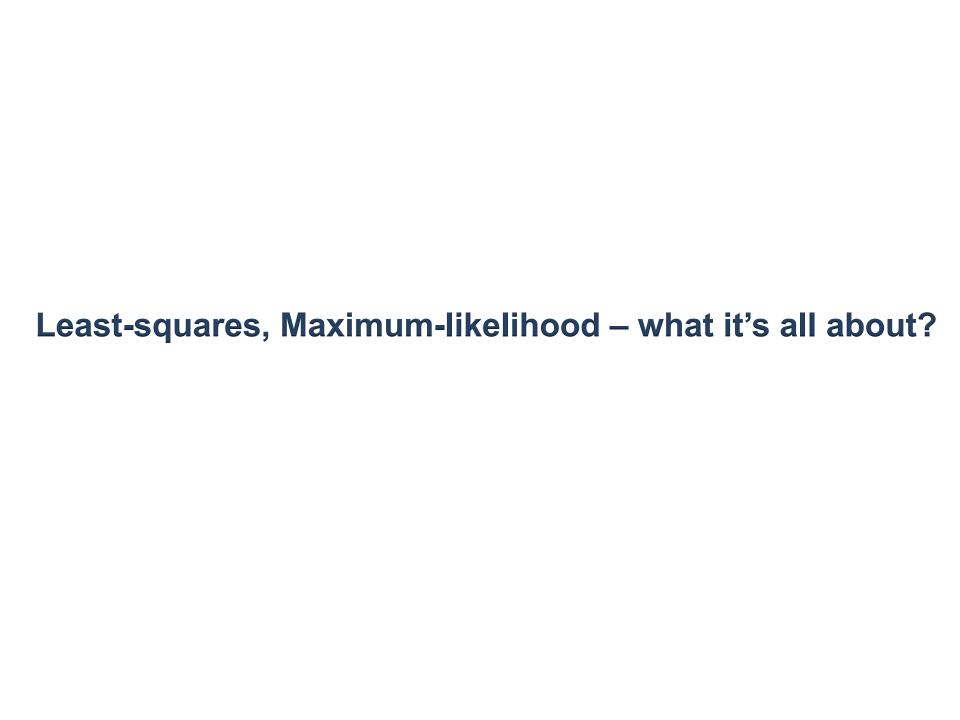
- Used at ultra-high resolution (better than 1Å)
- Coming soon in Phenix

Refinement (target function) weight

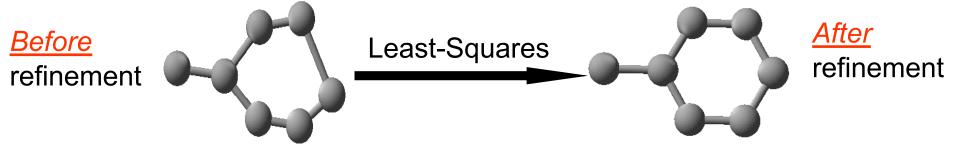
Refinement target (score)



Weight w doses helpful information such as restraints. The dose is very important!



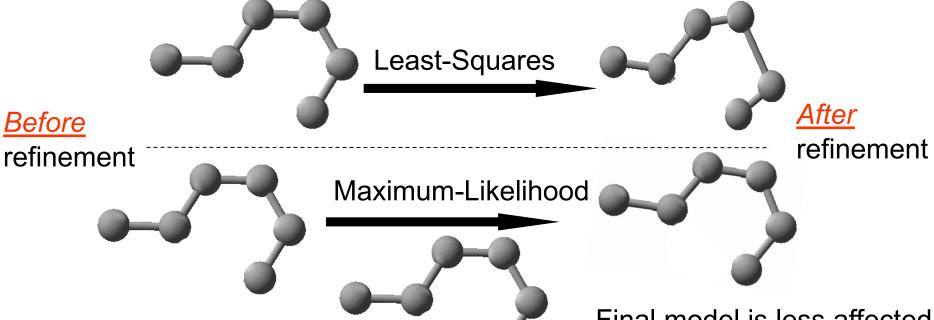
Complete model with errors



Partial model, no errors

Model is completed

statistically (implicitly)

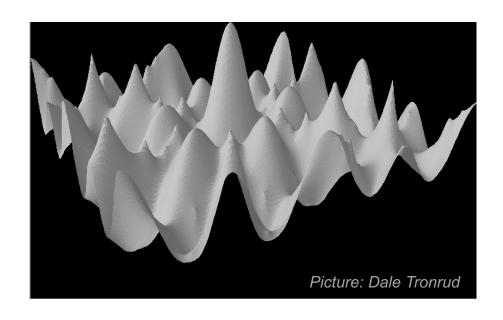


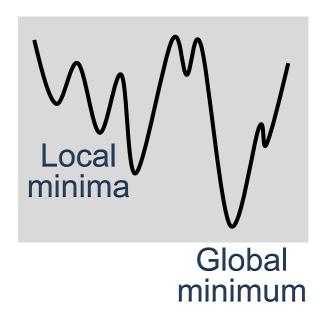
Final model is less affected by missing atoms



Complexity of refinement target

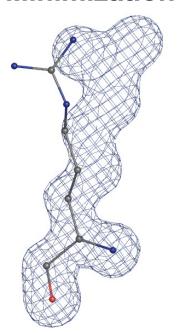
 Refinement target function (score) has very complex multidimensional profile





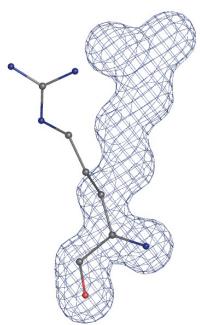
Refinement convergence

Minimization



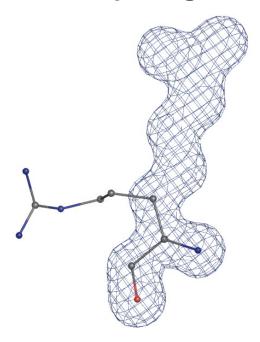
Minimization or SA can fix it

Simulated Annealing



Beyond convergence radius of minimization

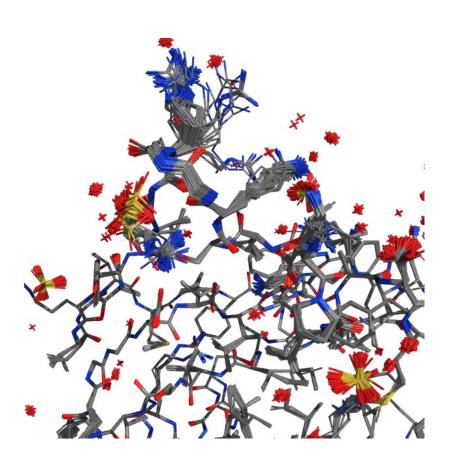
Real-space grid search

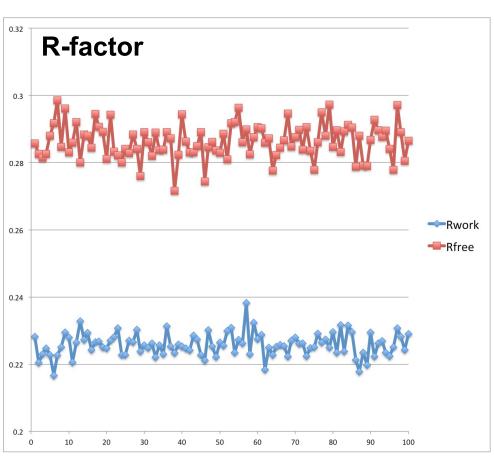


Beyond convergence radius of minimization and SA

Uncertainty

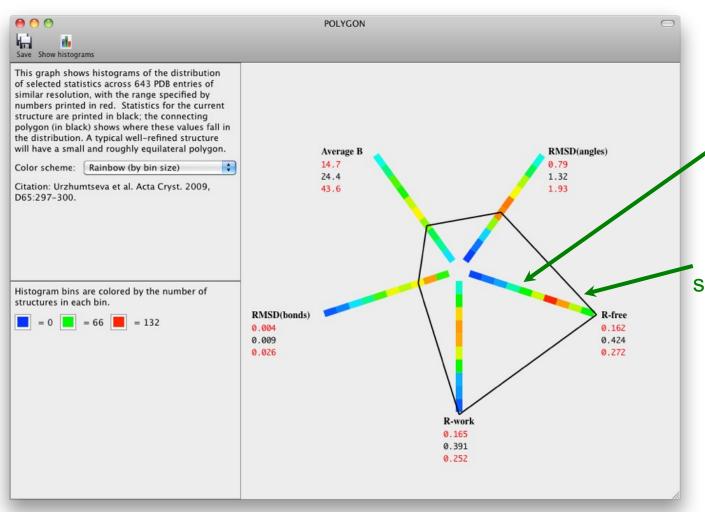
100 identical refinement runs each one starting with slightly perturbed model





Refinement run

When you call it done?



Colored bars are histograms showing distribution of values for structures at similar resolution

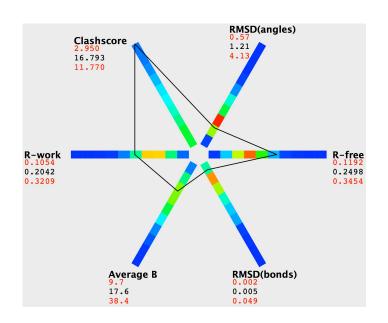
The black polygon shows where the statistics for the user's structure fall in each histogram

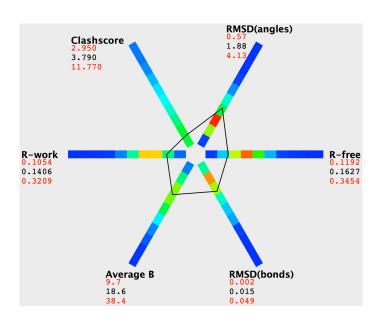
Crystallographic model quality at a glance.

L.Urzhumtseva, P.V.Afonine, P.D.Adams & A.Urzhumtsev. *Acta Cryst.* **D**65, 297-300 (2009)

Clearly there are problems

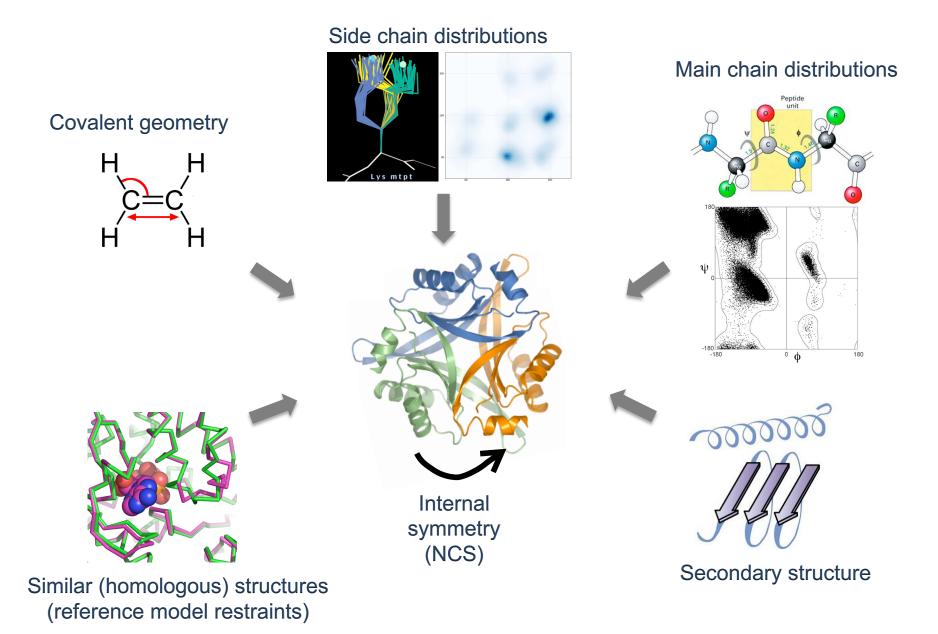
Likely overall good model





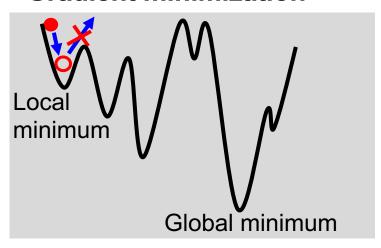
Low-resolution: things to consider

General idea: use all available information!

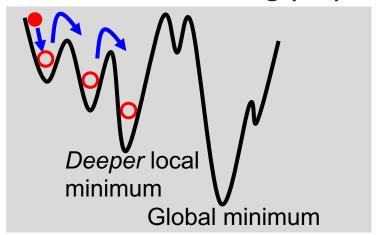


Simulated Annealing (SA)?

Gradient minimization



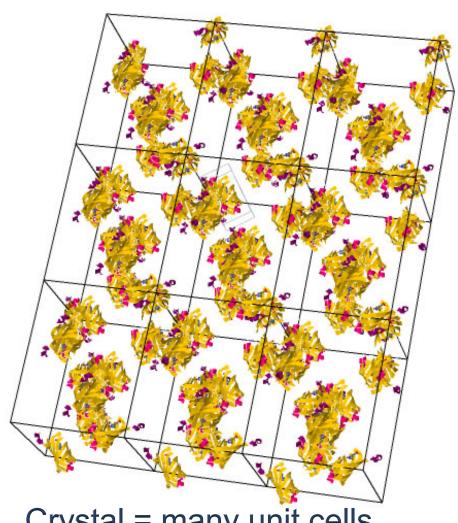
Simulated annealing (SA)



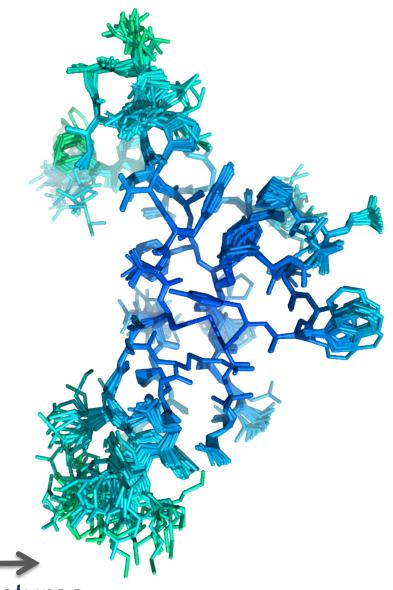
- Only use if model has gross errors (correction requires large movements)
- Do not use if model is relatively good and only needs small corrections

TLS

Disorder

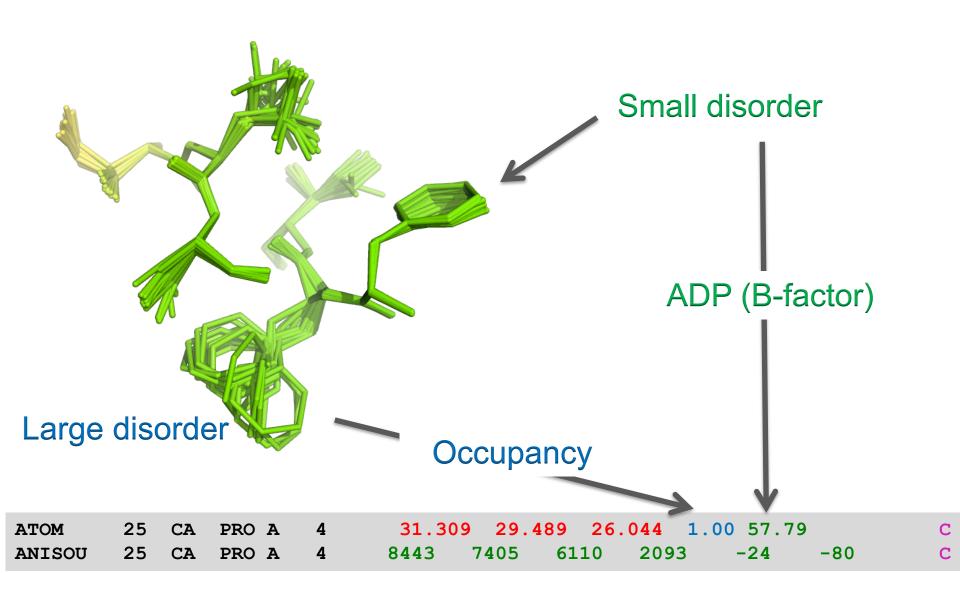


Crystal = many unit cells

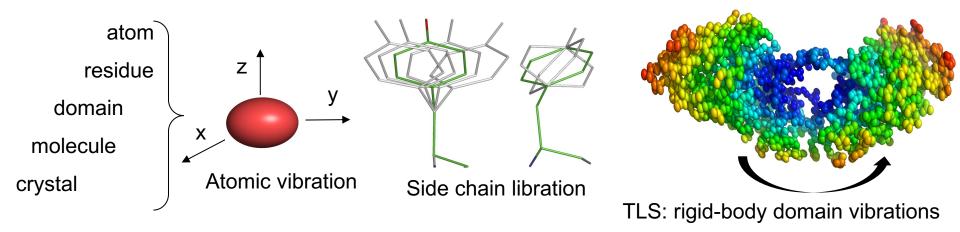


Superpose all structures from each unit cell

Disorder



Atomic Displacement Parameters (ADP, B-factors)

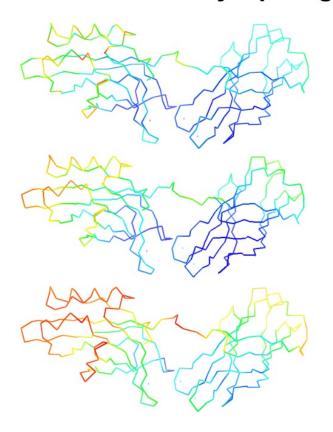


TLS: facts

- TLS assumes the atomic model consists of rigid domains that undergo anisotropic vibrations
- TLS uses 21 per rigid domain parameters to describe these vibrations
- TLS is not a way to reduce number of parameters
 - In fact, TLS adds more parameters!
- TLS offers more physically realistic model for atomic vibrations
- If correctly used may reduce R factors by up to 5%

TLS: example

Synaptotagmin refinement at 3.2 Å



Original refinement (PDB code: 1DQV)

R-free = **34** % R = **29** %

PHENIX – Isotropic restrained ADP

R-free = 28 % R = 23 %

PHENIX - TLS + Isotropic ADP

R-free = 25 % R = 20 %

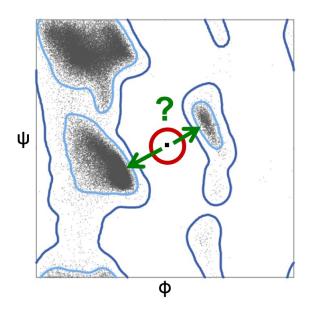
9% improvement in both Rwork and Rfree!

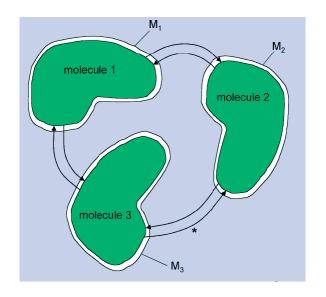


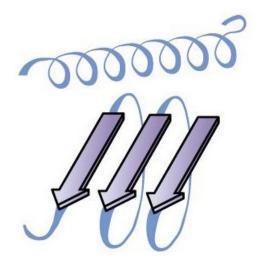
Refinement and validation conflict

- In low-resolution refinement we use extra restraints to compensate for lack of data:
 - Ramachandran plot restraints
 - Cβ deviation restraints
 - Secondary structure restraints
 - Restraints on χ angles of amino-acid side-chain rotamers
- These are standard validation tools... using them as restraints compromises their validation power
- Setting up extra restraints: manual work & very error-prone

Setting up extra restraints: manual work & very error-prone

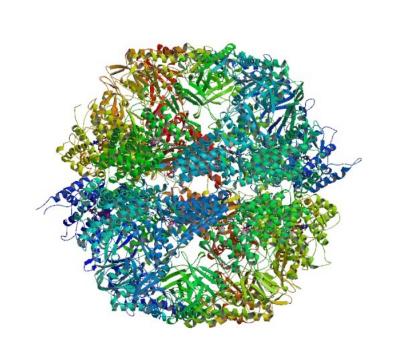






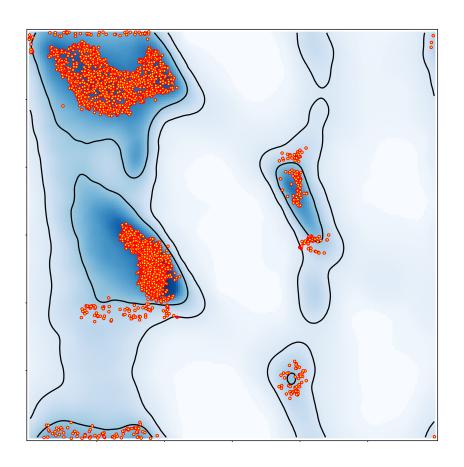
Model validation

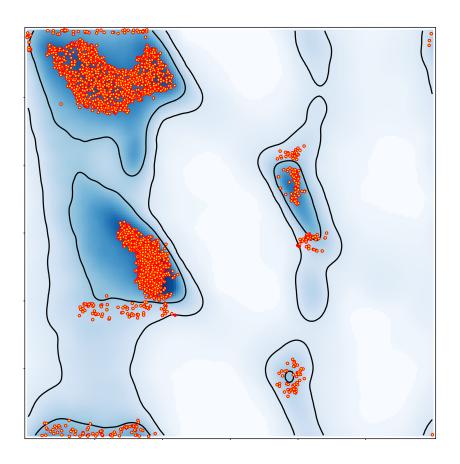
PNAS, 2019 116 (39) 19513-19522



Metric / PDB code			6KS6
Clashscore			7.7
Rama. (%)		favored	96.4
		outliers	0.2
Rotamer outliers (%)			0
C_{β} deviations			0
	Bon	d (Å)	0.001
RMS Ang		gle (°)	0.396
Resolution (Å)			3.0

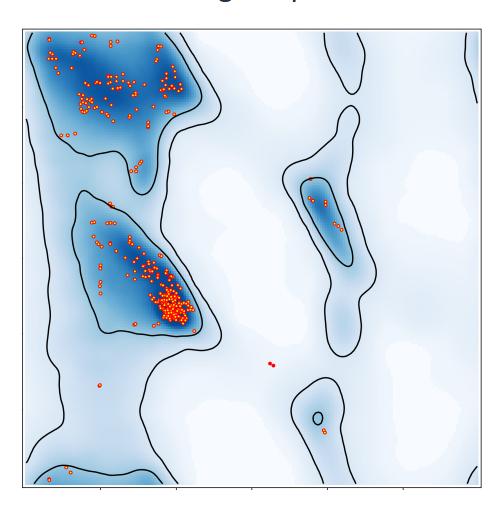
Perfect statistics! All looks just great!





- Two questions:
 - How we know the plot is poor?
 - How did this happen?

We know how good plot looks like!



Ramachandran plot Z-score

CABIOS

Vol. 13 no. 4 1997 Pages 425-430

Objectively judging the quality of a protein structure from a Ramachandran plot

Rob W.W.Hooft, Chris Sander and Gerrit Vriend

- Good at spotting odd plots
- One number, simple criteria:
 - Poor: |Z| > 3 Suspicious: 2 < |Z| < 3 Good: |Z| < 2

Structure

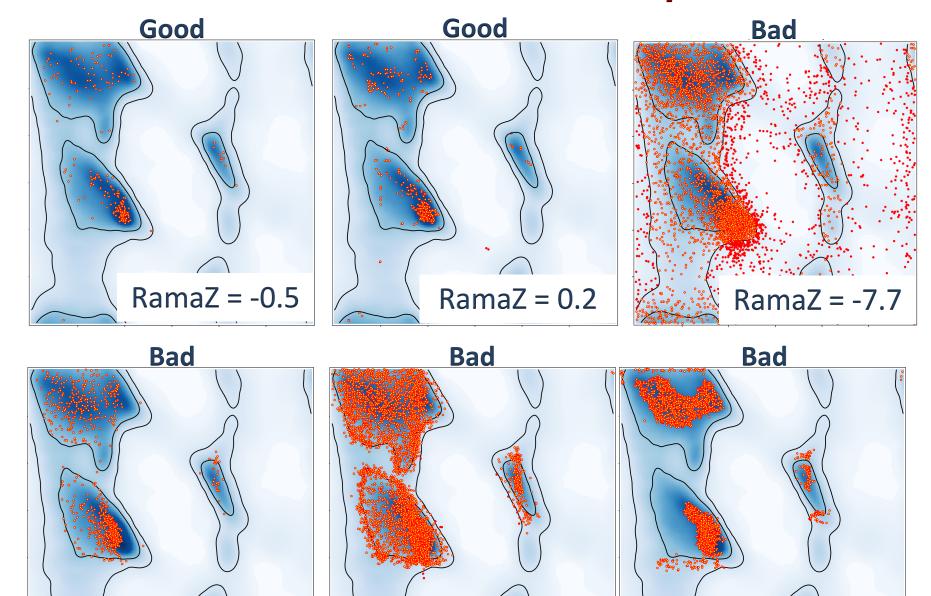


Resource

A Global Ramachandran Score Identifies Protein Structures with Unlikely Stereochemistry

Oleg V. Sobolev, 1,5,* Pavel V. Afonine, 1 Nigel W. Moriarty, 1 Maarten L. Hekkelman, 2,3 Robbie P. Joosten, 2,3,* Anastassis Perrakis, 2,3 and Paul D. Adams 1,4

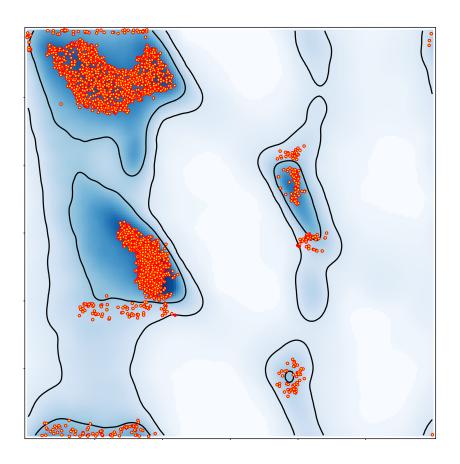
Model validation: Ramachandran plot Z-score



RamaZ = -5.3

RamaZ = -4.1

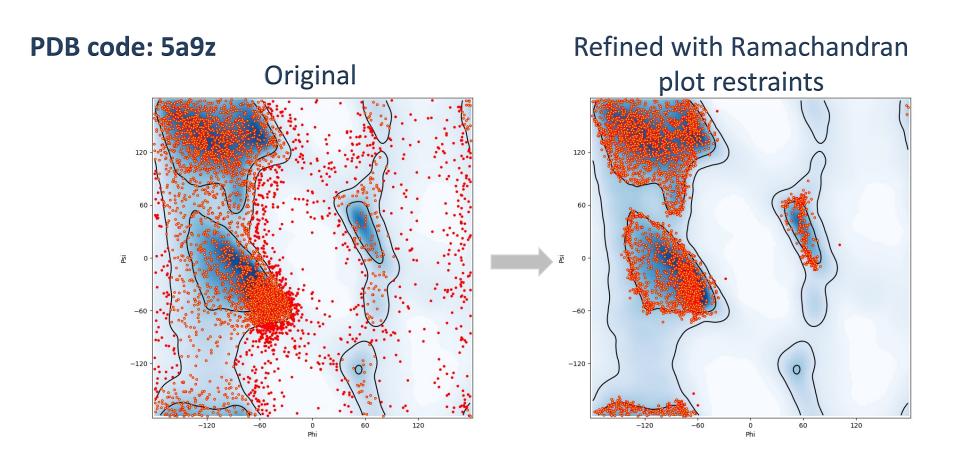
RamaZ = -3.3



- Two questions:
 - How we know the plot is poor?
 - How did this happen?

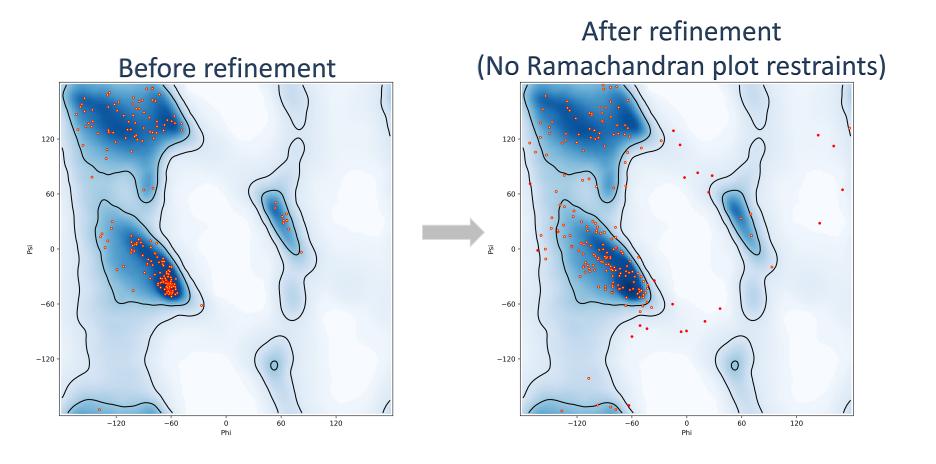
Ramachandran plot restraints

- Always use at low resolution
- Do not use to fix existing outliers



Ramachandran plot restraints

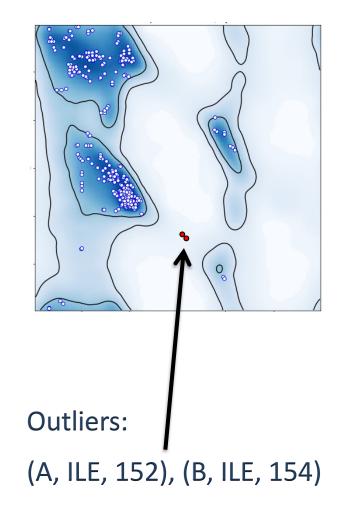
- Ramachandran plot restraints
 - Use to stop outliers from occurring



Validation: outliers are not always wrong

A Ramachandran plot outlier ≠ wrong

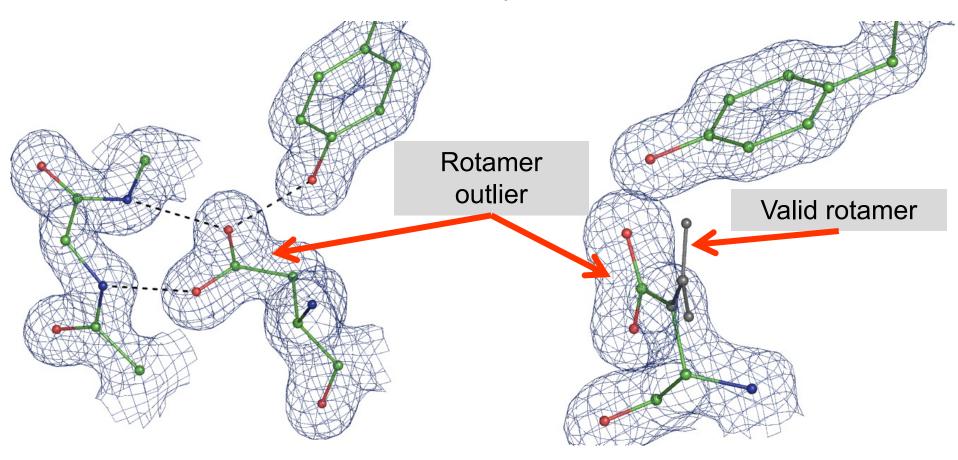
PDB code: 3NOQ (A, ILE, 152)



All outliers need to be explained (supported by the data)

Validation: outliers are not always wrong

- An outlier ≠ wrong
 - However, each outlier has to be explained



Refinement and validation conflict

Aren't we confused now?

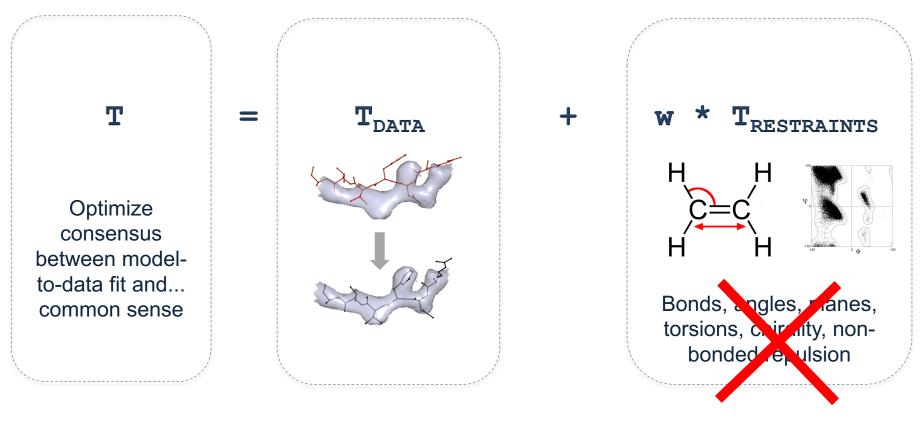
Restraints and limitations

$$T = T_{DATA} + w * T_{RESTRAINTS}$$

$$T_{RESTRAINTS} = T_{BOND} + T_{ANGLE} + T_{DIHEDRAL} + T_{PLANE} + T_{REPULSION} + T_{CHIRALITY}$$

- Restraints are too limited:
 - No attraction terms (electrostatics, etc)
 - Not using information about protein structure (secondary structure, rotamers)
 - Limited to tabulated entities in the libraries (e.g., Monomer Library, GeoStd)

A better solution: restraints from QM



Replace with energies/gradients from QM calculations

NEW: AQuaRef – QM based refinement in *Phenix*

History of progress



2010

QM Calculations

Impossible for proteins.
Limited to small molecules only





2012

GPU Accelerated QM

Limited to peptides and very small proteins (~hundreds of atoms)

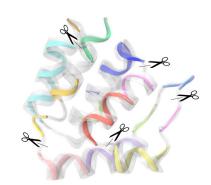




2017

Q|R with Fragmentation

QM-based protein refinement. Slow, resource-intensive, no inherent size limit

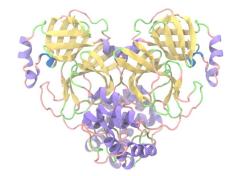




2024

ML Potentials

Fast, rivaling classical force fields, with QM-level accuracy and no fragmentation required



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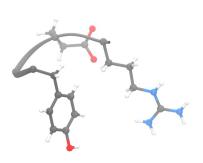
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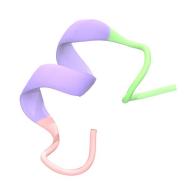


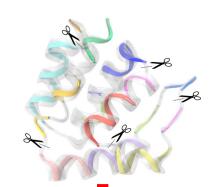
2024

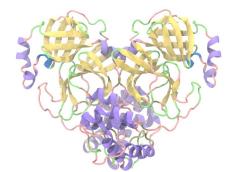
ML Potentials

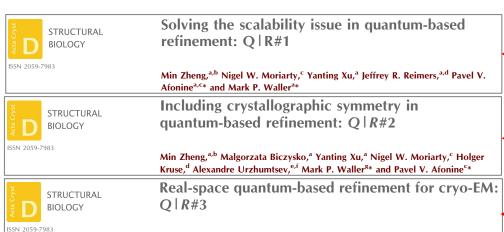
Fast, rivaling classical force fields, with QM-level accuracy and no fragmentation required











Lum Wang, Holger Kruse, Oleg V. Sobolev, Nigel W. Moriarty, Mark P.

Waller, d* Pavel V. Afonine and Malgorzata Biczysko a*

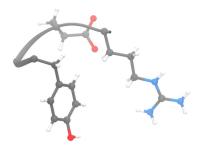
History of progress





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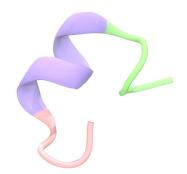




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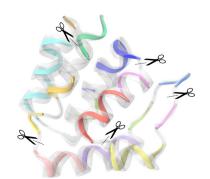




2017

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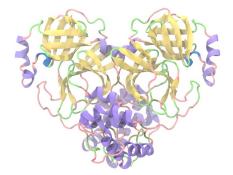




2024

ML Potentials

Fast, rivaling classical force fields, with QM-level accuracy and no fragmentation required



AQuaRef: Machine learning accelerated quantum refinement of protein structures

Roman Zubatyuk, Malgorzata Biczysko, Kavindri Ranasinghe, Nigel W. Moriarty, Hatice Gokcan, Holger Kruse, Billy K. Poon, Paul D. Adams, Mark P. Waller, Adrian E. Roitberg, Olexandr Isayev, Pavel V. Afonine doi: https://doi.org/10.1101/2024.07.21.604493



Machine Learning potential (AIMNet2)

Standard amino-acids

- Generate all possible 1-, 2-, 3-, and 4-peptides (including S-S bridges)
 - Torsion and non-equilibrium sampling

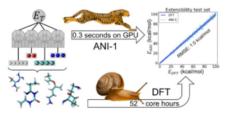
Large Dataset

DFT calculations

Calculation time:

About a week on one of big national computing resources

ML



Smith, Justin S.; Isayev, Olexandr; Roitberg, Adrian E.

ANI-1: an extensible neural network potential with DFT accuracy at force field computational cost

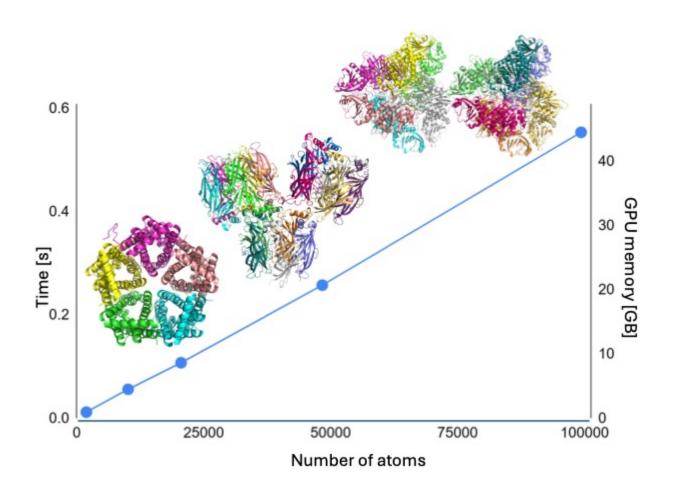
Journal Article

In: Chemical Science, iss. 8, pp. 3192-3203, 2017.

Abstract | **Links** | BibTeX | Tags: <u>ANI</u>, <u>Machine</u>

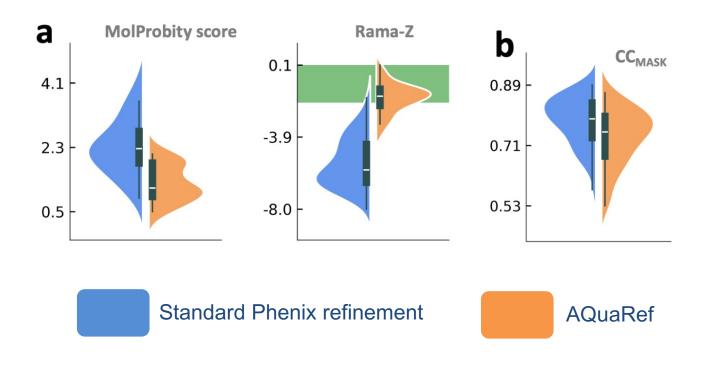
learning potential

Time & Memory Scaling: single energy calculation



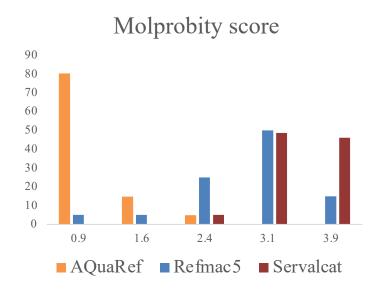
AQuaRef vs standard Phenix refinement

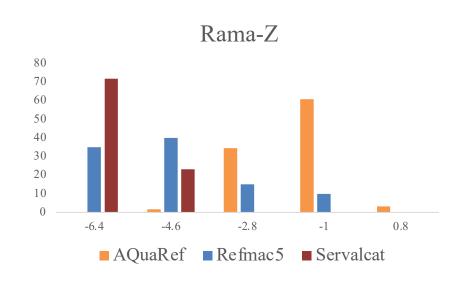
40 cryo-EM low resolution models (3Å or worse)



Testing: AQuaRef vs others

40 cryo-EM low resolution models (3Å or worse)





AQuaRef facts

- Refined models have superior geometry, same or better fit to the data
- Proteins only. Including other types of molecules is work in progress
- No alternative conformations
- Intolerant to nonsense: no severely distorted geometry, atom-complete models
- Same runtime as standard refinement
- GPU laptop or a workstation, CUDA 11/12 on Linux
- Available in nightly builds of Phenix

Validation (again!)

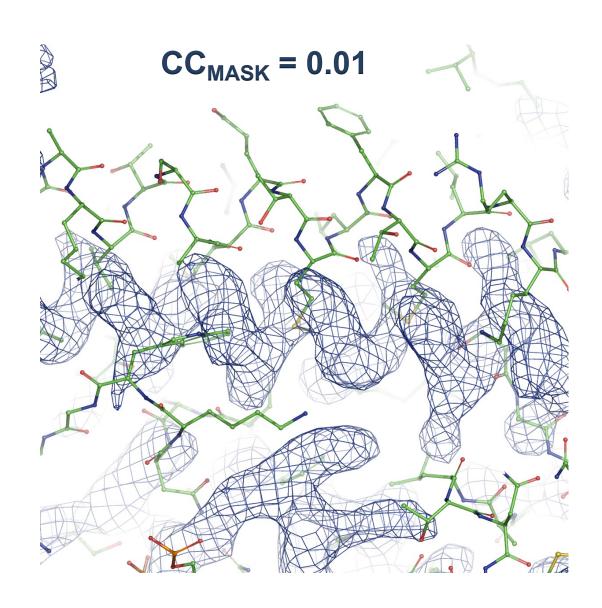
Despite efforts to promote and enforce validation, poorly scoring models are still being deposited into databases

Examples (recent years)

Model does not fit the map

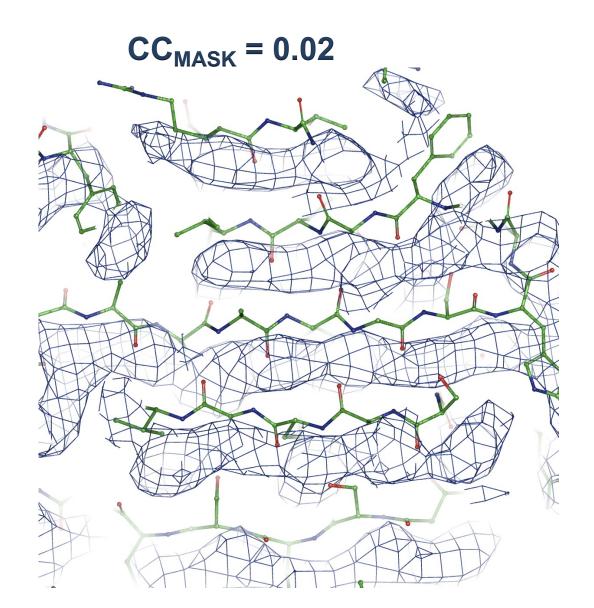
PDB: 8gwb | EMDB: 34308 | 2.8 Å | Cell (2022) 185: 4347-4360

Chain	CC _{MASK}
A	0.01
В	0.02
C	0
D	0.01
I	0.04
J	0
F	0.12
E	0.08
G	0.1
M	0.16
A	0
F	-0.13
E	0.16
A	0.1
G	0.15
M	0.19



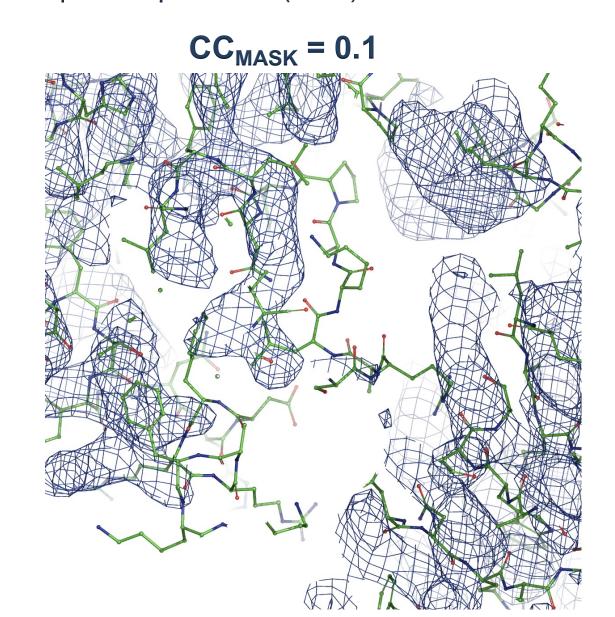
PDB: 7xov | EMDB: 33360 | 3 Å | Cell Discov (2022) 8: 55-55

Chain		CCM	ASK
A		0.04	
В		-0.01	
G		0.18	
N		0.06	
R		0.03	
R		-0.02	



PDB: 7w6p | EMDB: 32331 | 3.5 Å | Science (2022) 377: 7065-7065

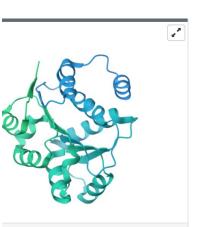
Chain	CC _{MASK}
A	0.09
В	0.11
G	0.12
Н	0.07
R	0.16
R	-0.08



PDB: 8V85 | EMDB: 43023 | 2.9 Å | Nat Commun (2024) 15: 3296-3296

wwP[

Ramach



Nore in 3D: Structure | Sequence ations | Electron Density | tion Report

I Symmetry: Asymmetric - C1 I Stoichiometry: Monomer - A1

imilar Assemblies

■ 8V85 | pdb_000

60S ribosome biogenesis intermediate pass filtered locally refined map)

PDB DOI: https://doi.org/10.2210/pdb8V85/pdb I

Classification: RNA BINDING PROTEIN

Organism(s): Saccharomyces cerevisiae BY4741

Mutation(s): No

Deposited: 2023-12-04 Released: 2024-05-01 Deposition Author(s): Cruz, V.E., Weirich, C.S., P€ Funding Organization(s): National Institutes of H€ (NIH/NIGMS), Robert A. Welch Foundation, Cancel (CPRIT)

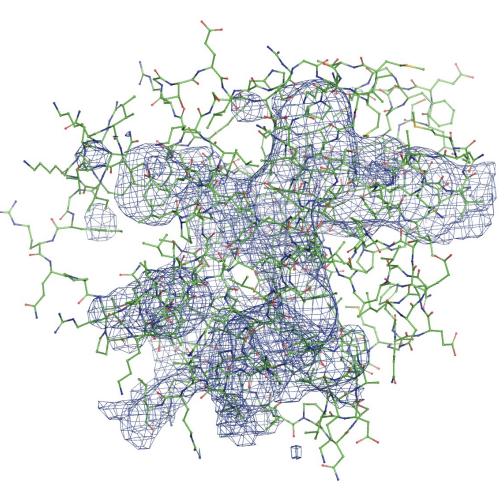
Experimental Data Snapshot

Method: ELECTRON MICROSCOPY

Resolution: 2.90 Å

Aggregation State: PARTICLE Reconstruction Method: SINGLE

PARTICLE



PDB: 8SZ7 | EMDB: 40902 | 2.8 Å | Dev Cell (2024) 59: 1783



ore in 3D: Structure | Sequence tions | Electron Density | on Report

Symmetry: Asymmetric - C1 **Stoichiometry**: Monomer - A1

milar Assemblies

■ 8SZ7 | pdb_00

Cryo-EM of the GDP-bound human membrane in the super constricted:

PDB DOI: https://doi.org/10.2210/pdb8SZ7/pdk

Classification: HYDROLASE Organism(s): Homo sapiens

Expression System: Escherichia coli 'BL21-Go

Mutation(s): Yes

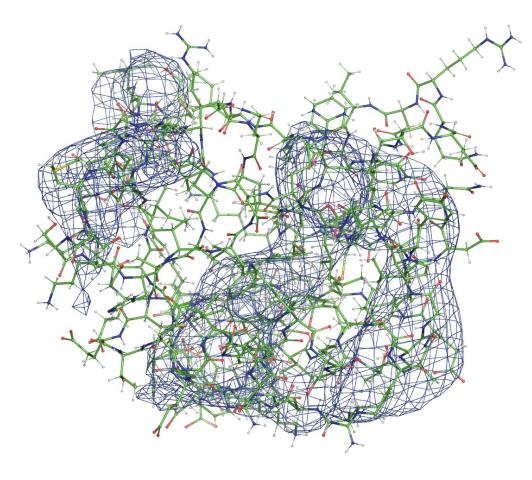
Deposited: 2023-05-27 Released: 2024-05-01 Deposition Author(s): Jimah, J.R., Canagarajal Funding Organization(s): National Institutes of and Kidney Disease (NIH/NIDDK), National Institutes (Sciences (NIH/NIGMS)

Experimental Data Snapshot

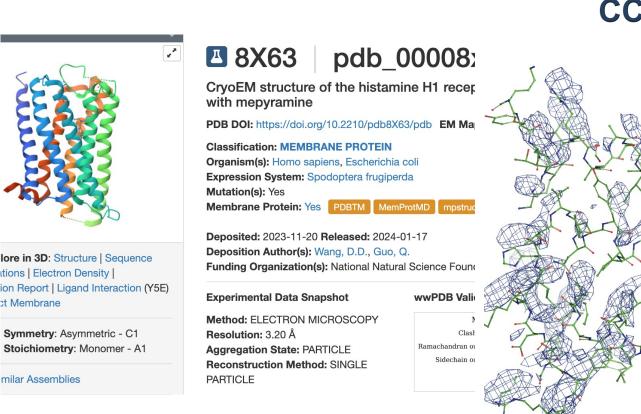
Method: ELECTRON MICROSCOPY

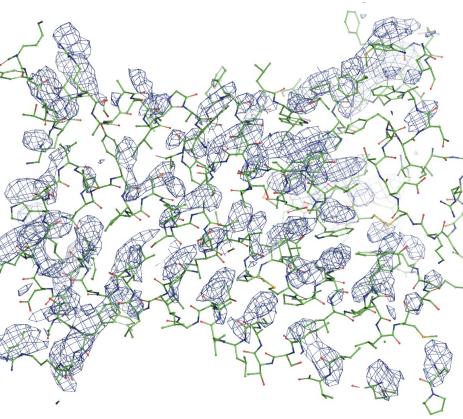
Resolution: 2.84 Å

Aggregation State: FILAMENT Reconstruction Method: HELICAL

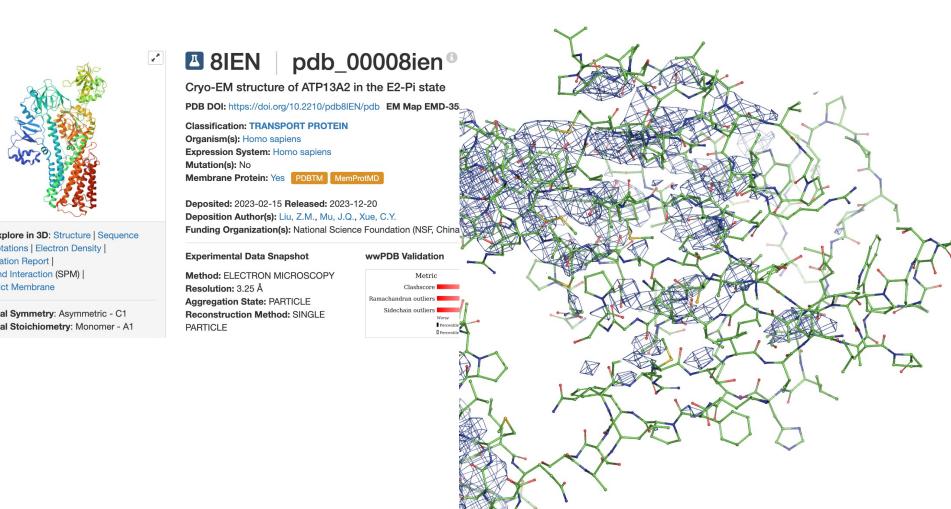


PDB: 8x63 | EMDB: 38078 | 3.2 Å | Nat Commun (2024) 15: 84-84





PDB: 8iEN | EMDB: 35387 | 3.25 Å | Nat Commun (2023) 14: 1978-1978



PDB: 9c91 | EMDB: 45359 | 2.78 Å | Nat Commun (2025) 16: 2955

$CC_{MASK} = 0.0$



Electron Density

metry: Asymmetric - C1

chiometry: Hetero 2-mer -

leport | raction (SRM) ■ 9C91 | pdb_00

Assimilatory NADPH-dependent sulf

PDB DOI: https://doi.org/10.2210/pdb9C91/pdk

Classification: FLAVOPROTEIN
Organism(s): Escherichia coli
Expression System: Escherichia coli

Mutation(s): No

Deposited: 2024-06-13 **Released:** 2025-02-12 **Deposition Author(s):** Ghazi Esfahani, B., Walia

Mendez, J.H., Stroupe, M.E.

Funding Organization(s): National Science Fou

Experimental Data Snapshot

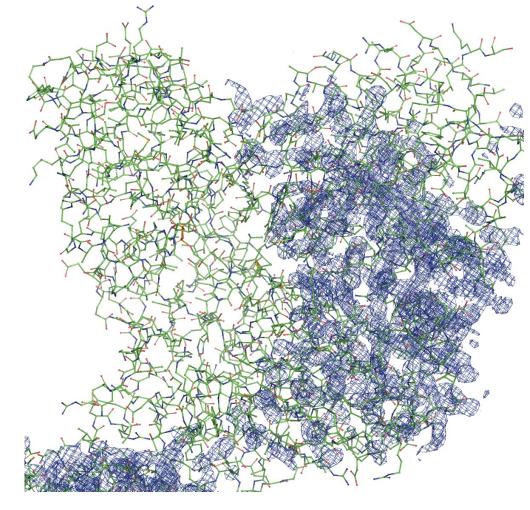
Method: ELECTRON MICROSCOPY

ww

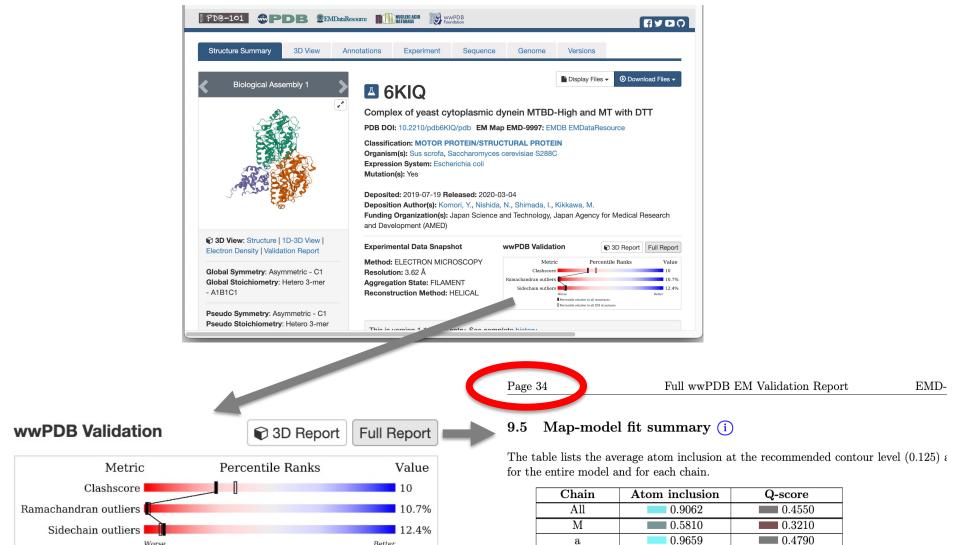
Resolution: 2.78 Å

Aggregation State: PARTICLE
Reconstruction Method: SINGLE

PARTICLE



Validation reports (RCSB)



Lack of (useful) model-to-map fit statistics!

h

0.9656

0.4730

Better

Percentile relative to all structures Percentile relative to all EM structures

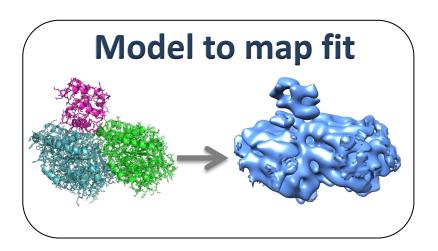
Atom inclusion

- Atom inclusion: fraction of atoms inside molecular envelope contoured at a given level
 - Contouring threshold: Arbitrarily? What is optimal level?
 - No use of atomic model parameters such as ADP, occupancy, atom type, ...
 - Does not compare shape of density:
 - How SER placed into PHE density is going to score?
 - How water O placed into Mg peak will score?
 - Does not account for missing atoms
 - Partially occupied atoms (alternative conformations):
 - Chosen level for fully occupied atoms needs to be scaled by occupancy for partially occupied atoms

Q-Score

- **Q-score**: measure the resolvability of individual atoms in a cryo-EM map, using an atomic model fitted to or built into the map
 - No use of atomic model parameters such as ADP, occupancy, atom type, ...
 - Shape of density is not used:
 - How SER placed into PHE density is going to score?
 - How water O placed into Mg peak will score?
 - Does not account for missing atoms (it shouldn't given the definition)
 - Alternative conformations are not handled
 - Anisotropic atoms are not handled

Model-to-map fit validation: CC_{MASK}



$$CC_{MASK} = \frac{\sum \rho_{obs} \rho_{calc}}{(\sum \rho_{obs}^2 \sum \rho_{calc}^2)^{1/2}}$$

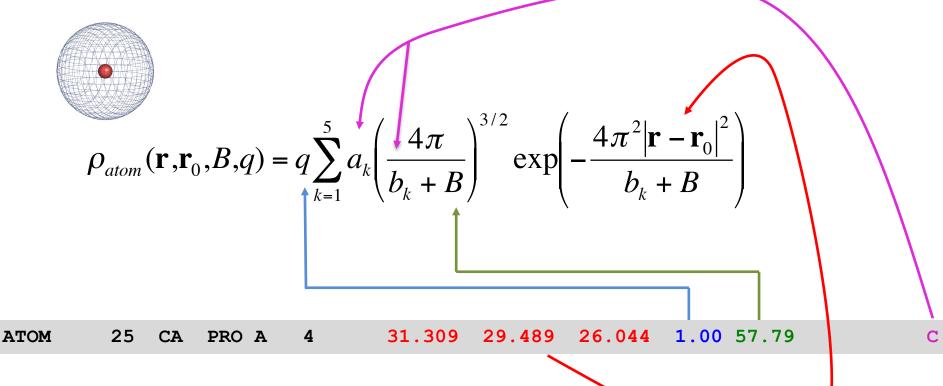
 ρ_{obs} = experimental map ρ_{calc} = model calculated map

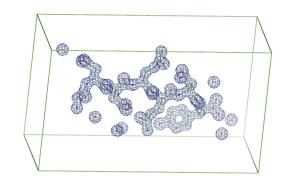
- Easy interpretation: -1: anticorrelation, 0: no correlation, 1: perfect correlation
- Uses all atomic model parameters (XYZ, B-factors, occ, atom type)
- Not specific to map type (any map: x-ray, neutron, electron, cryo-EM, ...)
- Can be calculated locally (per atom, residue, chain, molecule, whole box, ...)
 - Local resolution can be trivially taken into account

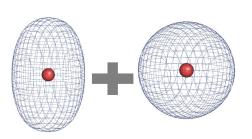
Metric	Expected value
CC _{MASK}	Poor: < 0.3 So-so: 0.3-0.6 Good: > 0.6

Model-to-map fit validation: CC_{MASK}

Gaussian IAM (Independent Atom Model)



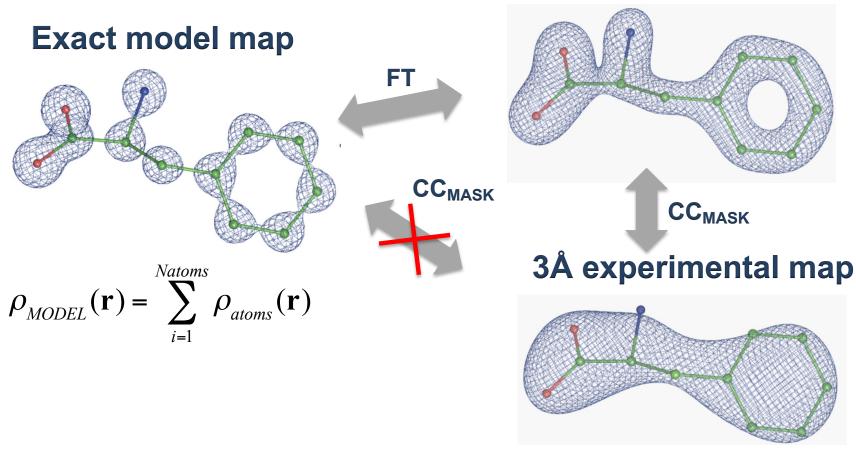




$$\rho_{MODEL}(\mathbf{r}) = \sum_{i=1}^{Natoms} \rho_{atoms}(\mathbf{r})$$

Model-to-map fit validation: CC_{MASK}

3Å model-calculated map

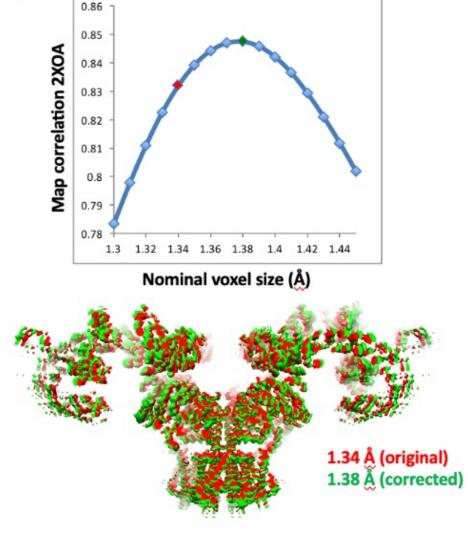


- FT exact model map
- Remove terms up to specified resolution
- FT back to real space to get a Fourier image = "Model map"

Voxel size (magnification) calibration

Using UCSF Chimera for voxel size calibration (of your map and others)

- Voxel size generally requires calibration against a crystal structure.
- Once calibrated, generally stable between samples/datasets at same magnification.
- Can calibrate by fitting in Chimera at range of nominal voxel sizes and measuring correlation.
- Incorrect voxel sizes are common in deposited maps - be aware of this when comparing structures. E.g. here there is a 3% difference – affects structural alignment, reported resolution (3.8 vs 3.9Å).



phenix.magref map.mrc model.pdb resolution=3.4