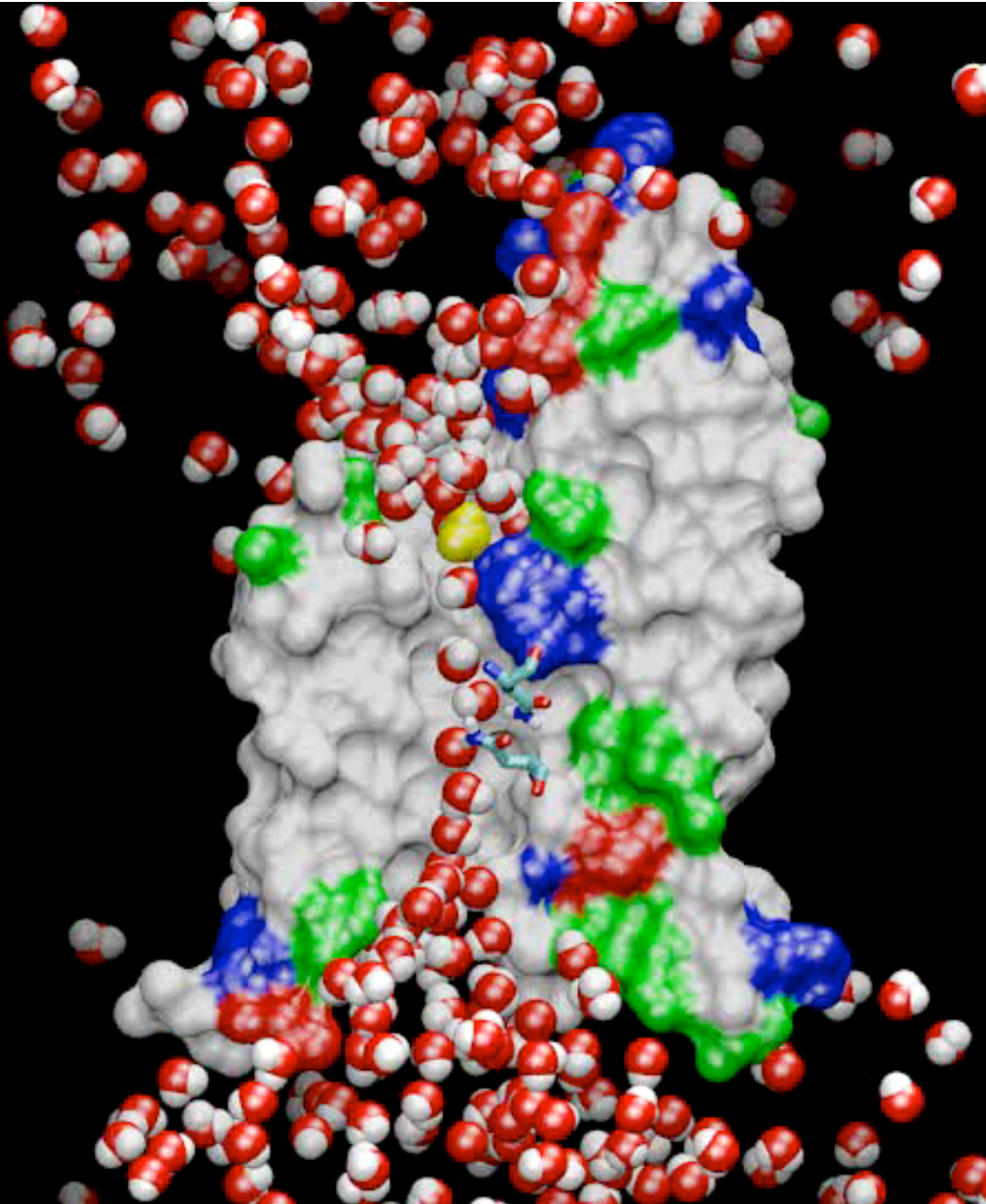


# Molecular Dynamics Simulations



Solving the Newtonian equations of motion for all particles at every time step

Major limitations:

- Time scale / sampling
- Force field approximations

Major advantage:

- Unparalleled spatial and temporal resolutions, simultaneously

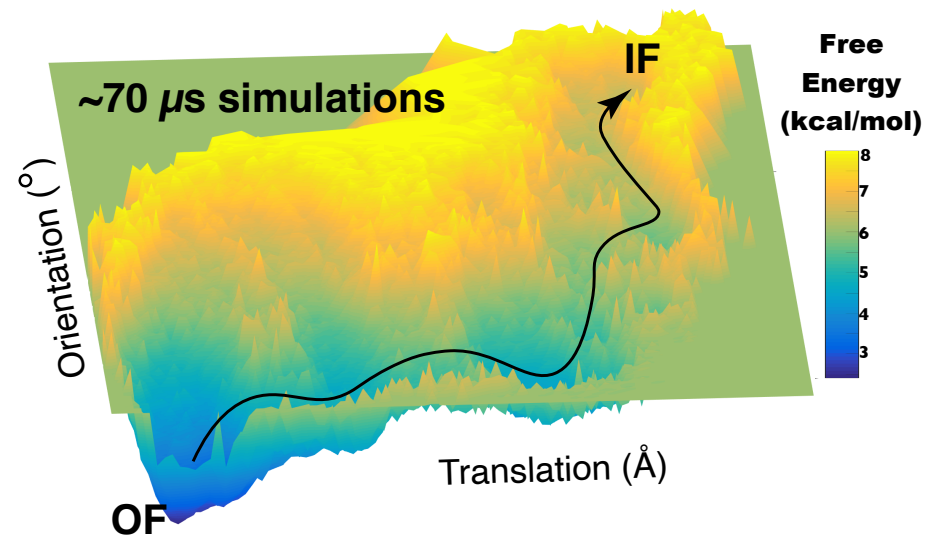
**SPEED  
LIMIT**

**1 fs**

# Overcoming Timescale limitation

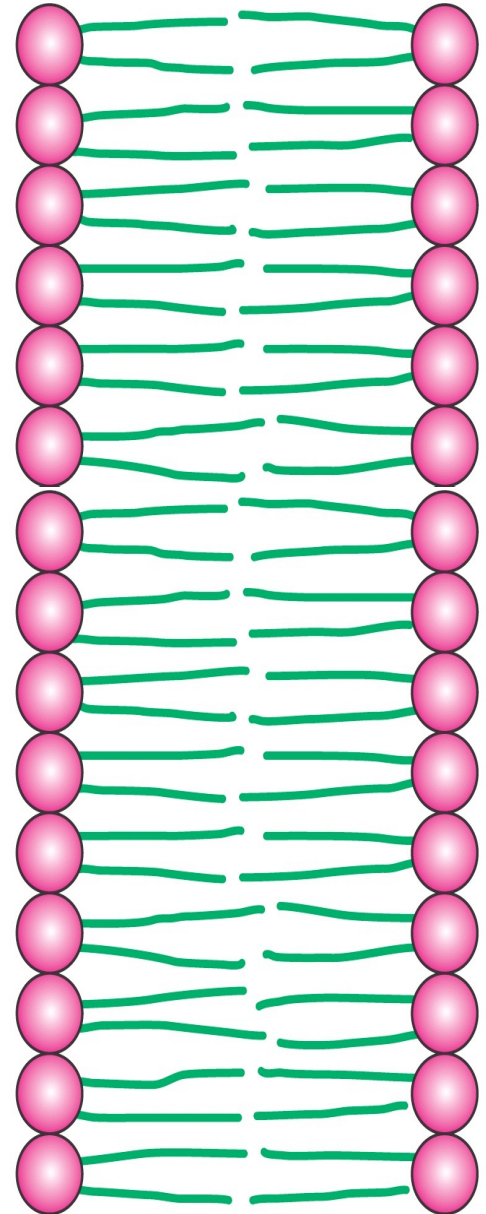
Visiting more regions in the Configuration Space

Enhanced Sampling

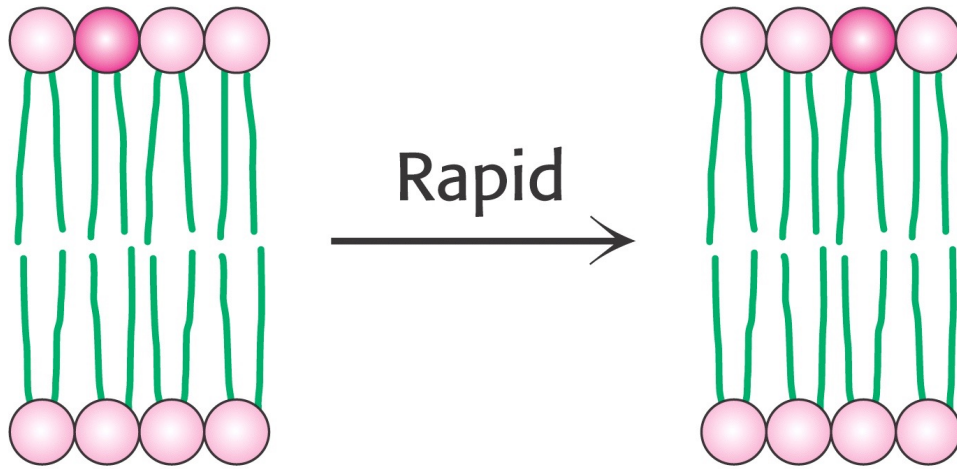


# Phospholipid Bilayers Are Excellent Materials For Cell Membranes

- Hydrophobic interaction is the driving force
- Self-assembly in water
- Tendency to close on themselves
- Self-sealing (a hole is unfavorable)
- Extensive: up to millimeters



# Lipid Diffusion in a Membrane



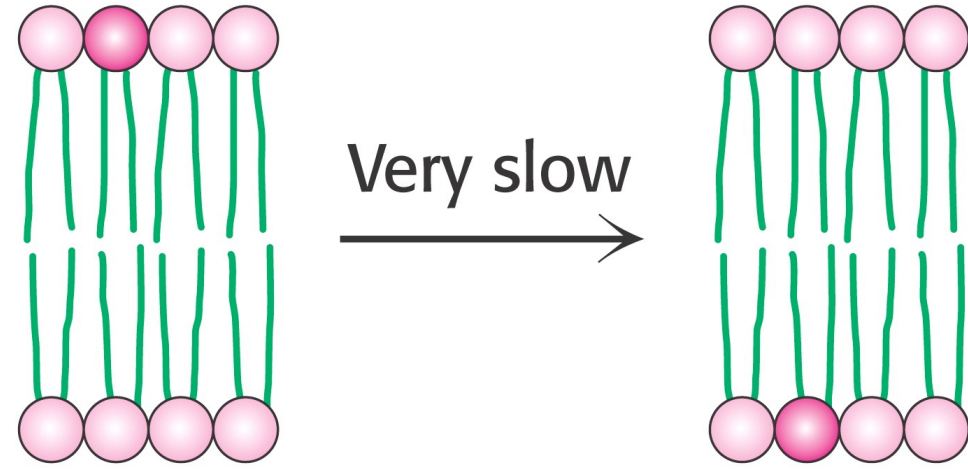
Lateral diffusion

$$D_{lip} = 10^{-8} \text{ cm}^2 \cdot \text{s}^{-1}$$

(50 Å in  $\sim 5 \times 10^{-6}$  s)

$$D_{wat} = 2.5 \times 10^{-5} \text{ cm}^2 \cdot \text{s}^{-1}$$

Modeling mixed lipid bilayers!



Transverse diffusion  
(flip-flop)

Once in several hours!

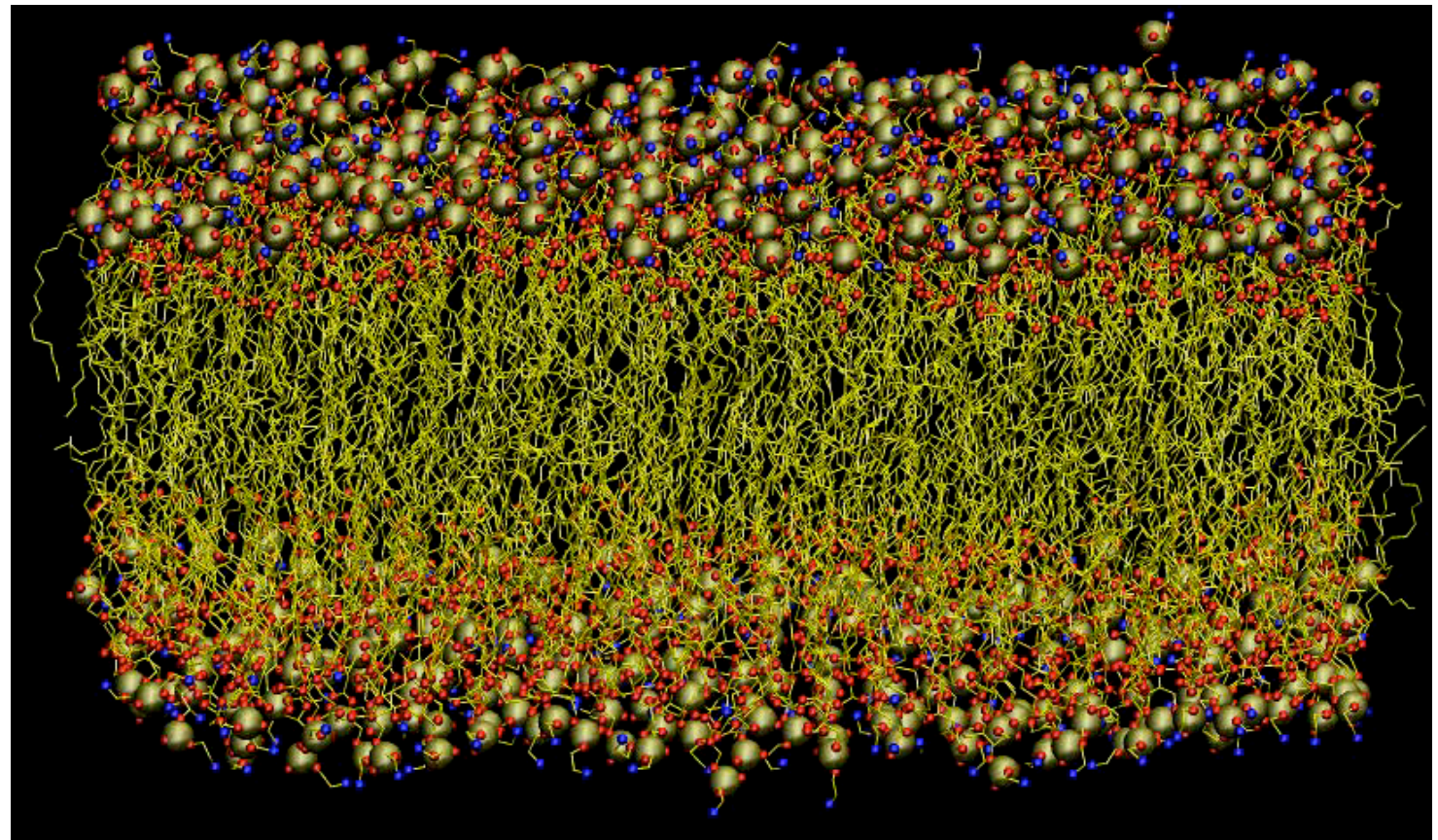
( $\sim 50$  Å in  $\sim 10^4$  s)

*$\sim 9$  orders of magnitude slower  
ensuring bilayer asymmetry*

# Technical difficulties in Simulations of Biological Membranes

- *Time scale*
- Heterogeneity of biological membranes ☹️

60 x 60 Å  
Pure POPE  
5 ns  
~100,000  
atoms



# Battling the Timescale - Case I

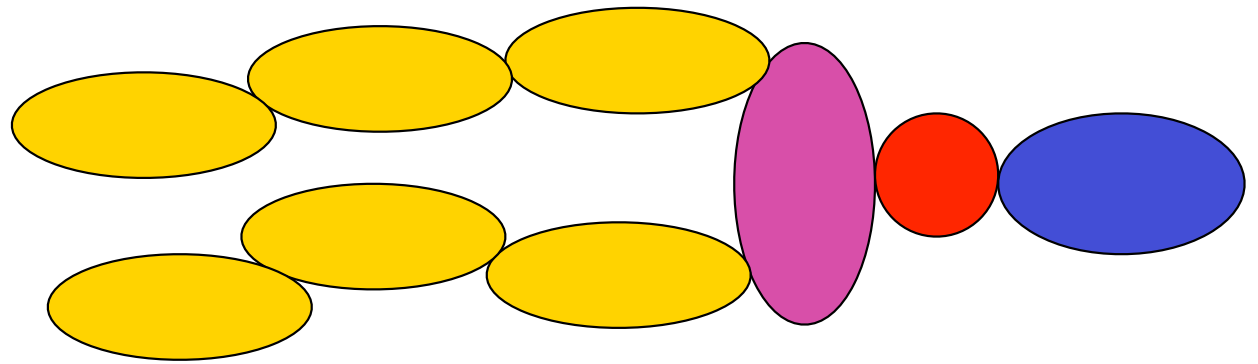
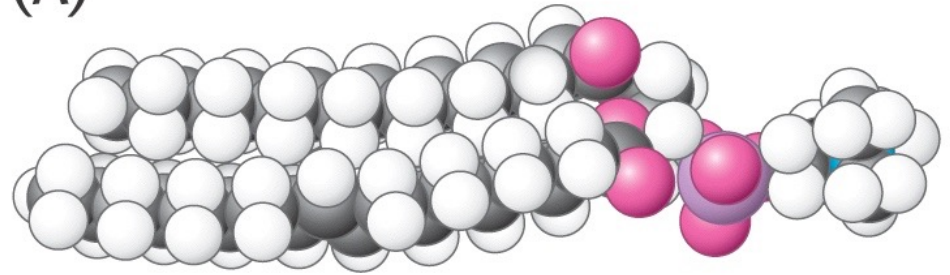
## Coarse-grained modeling of lipids

150 particles

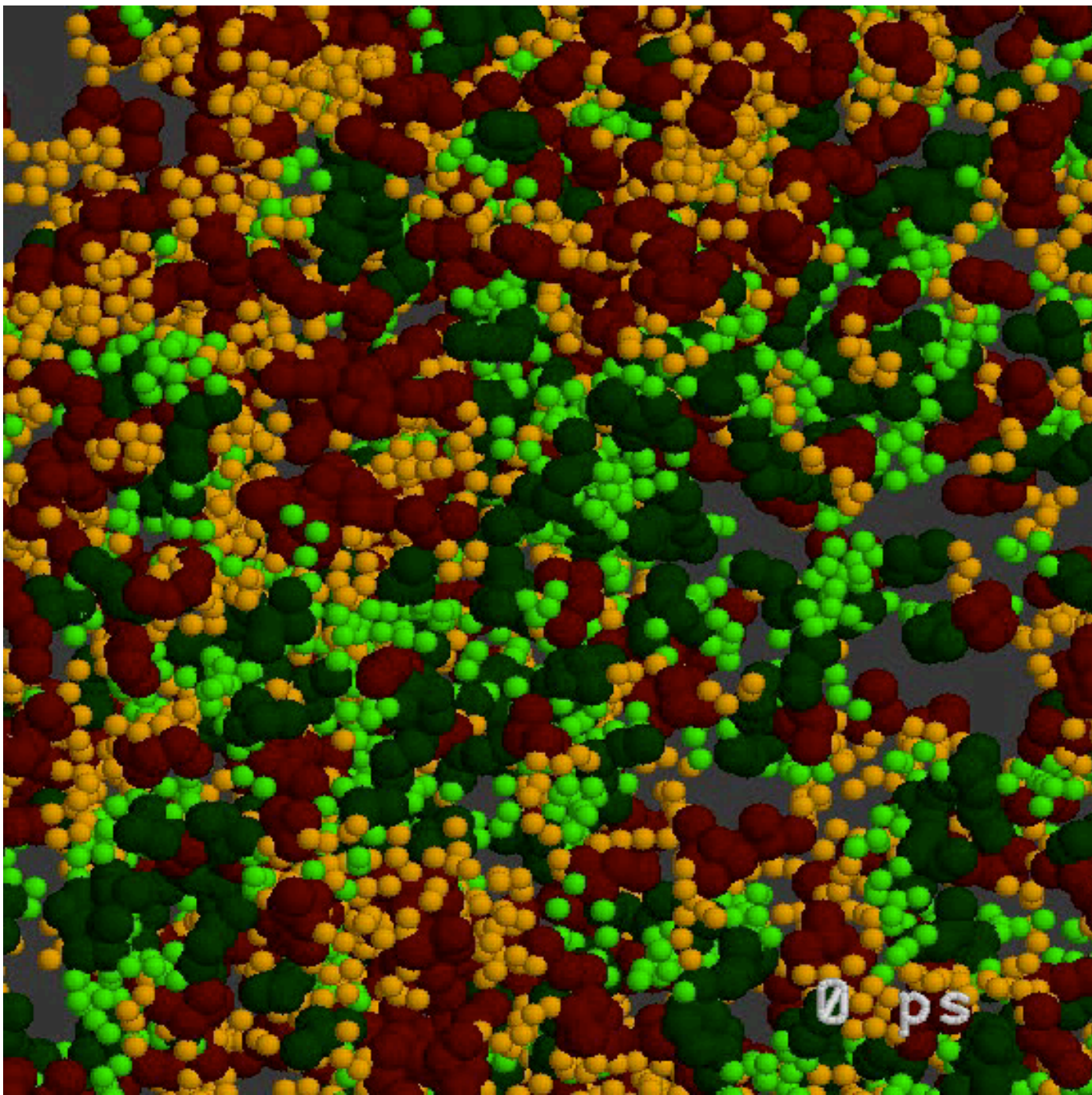


9 particles!

(A)



Also, increasing the time step by orders of magnitude.

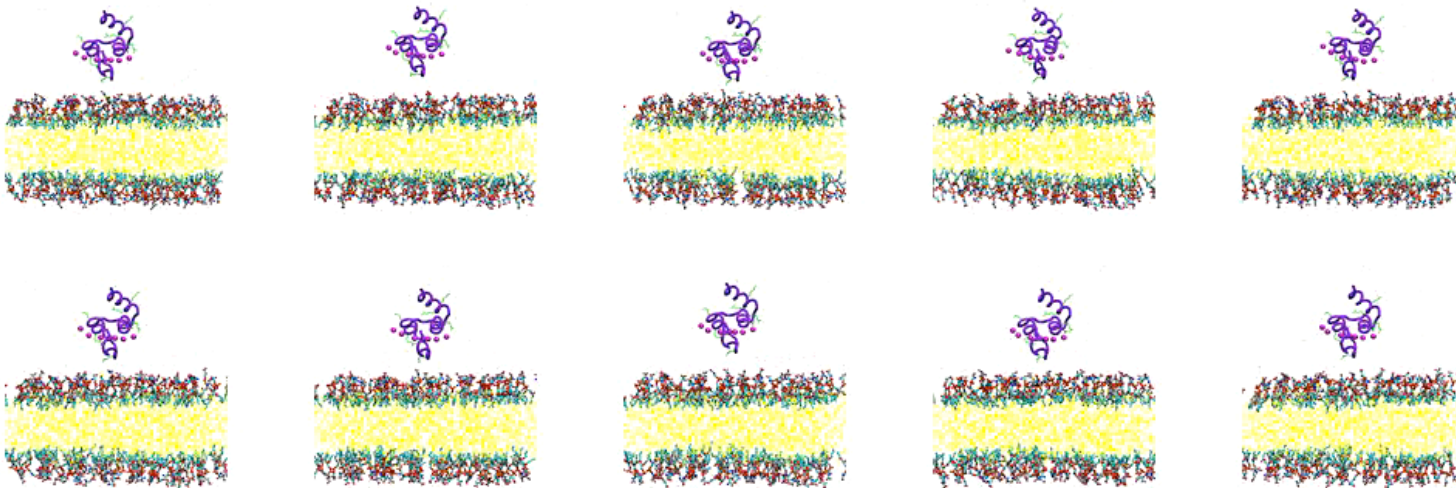
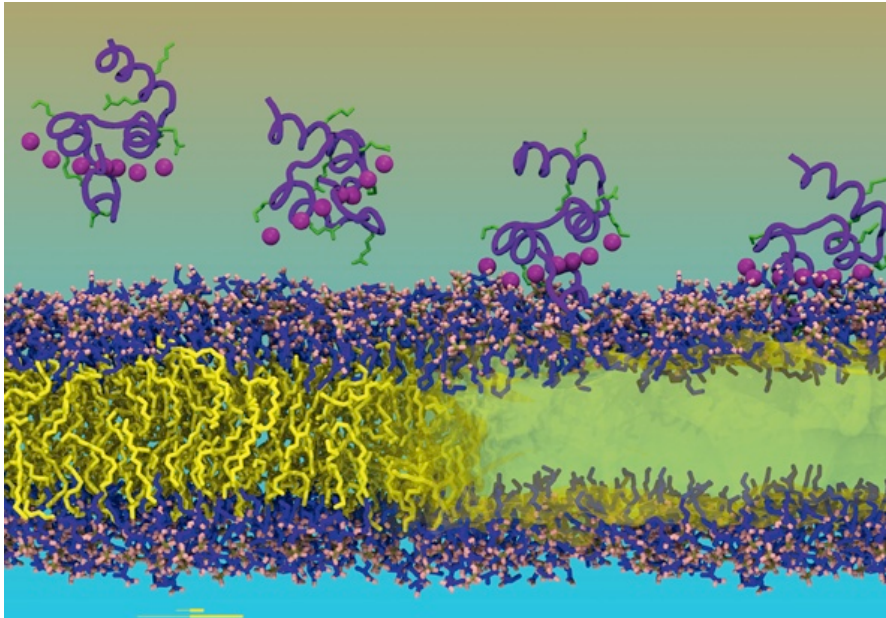


by: J. Siewert-Jan Marrink and Alan E. Mark, University of Groningen, The Netherlands

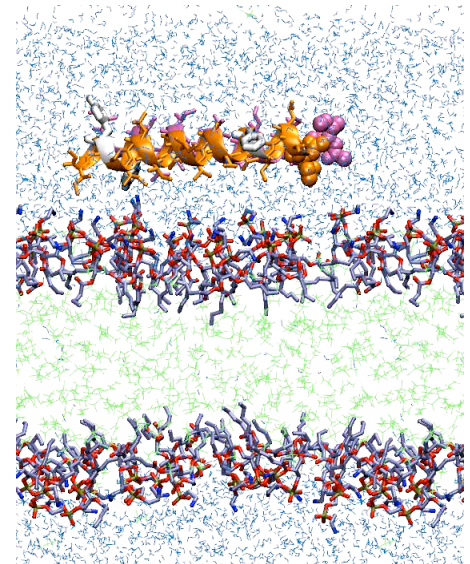
# Battling the Timescale - Case II

## Reduced Representations

Highly Mobile Membrane Mimetic model

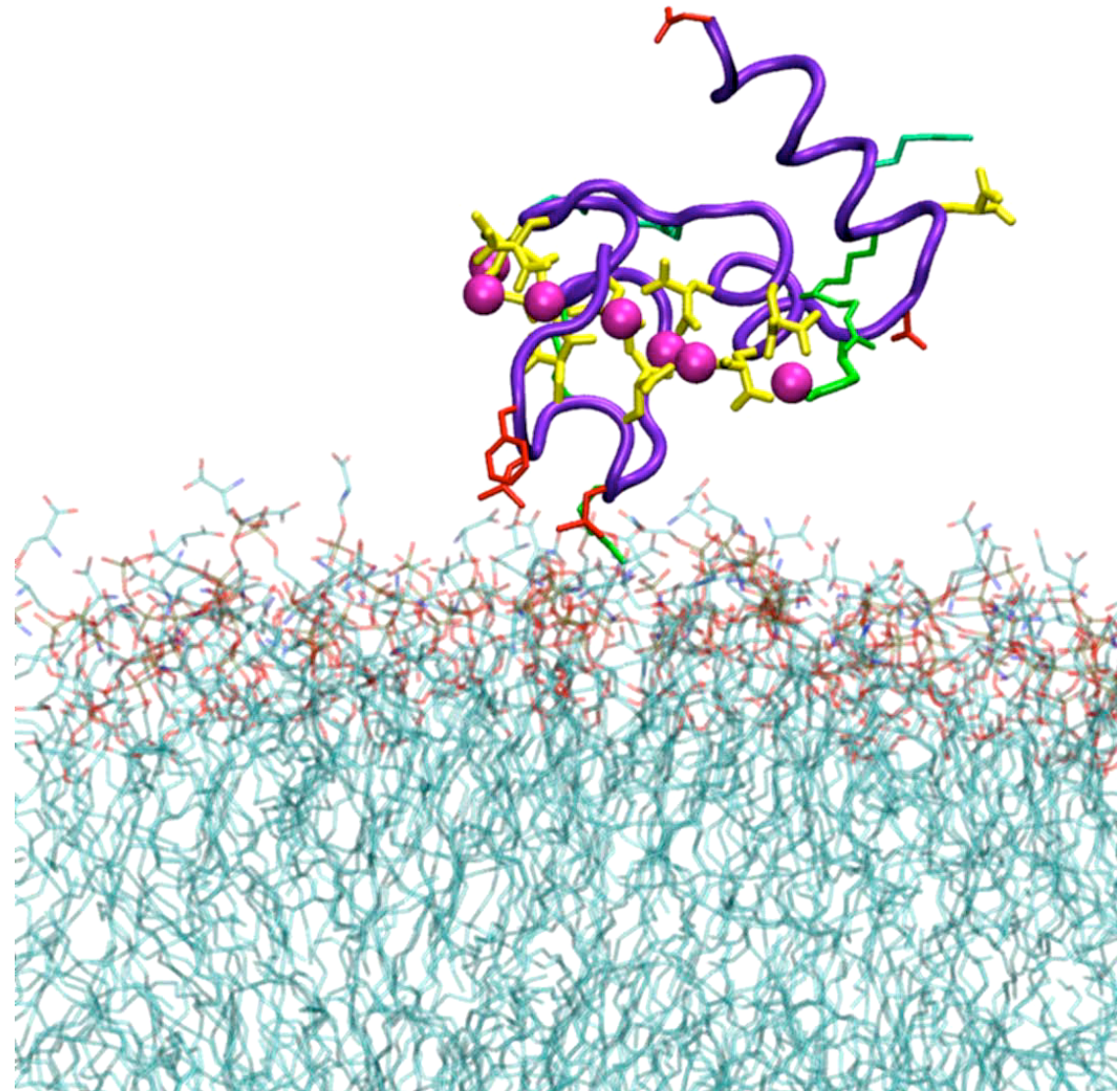
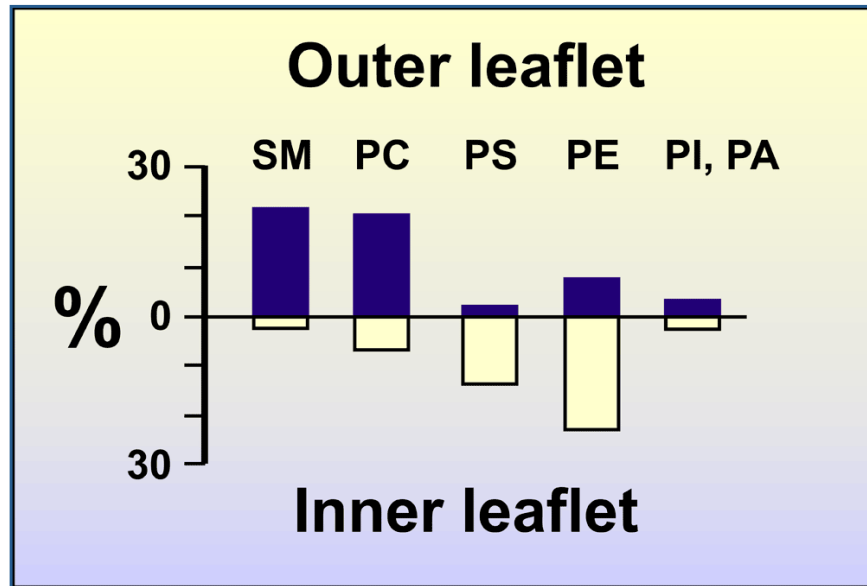


*GpA insertion  
in 12 ns*





# Simulation of Binding with Full Membrane Representation



## Partial list of technical problems:

- Biased simulations
- Unknown depth of insertion
- Single binding event
- Frequently failing
- **Minimal lipid reorganization**

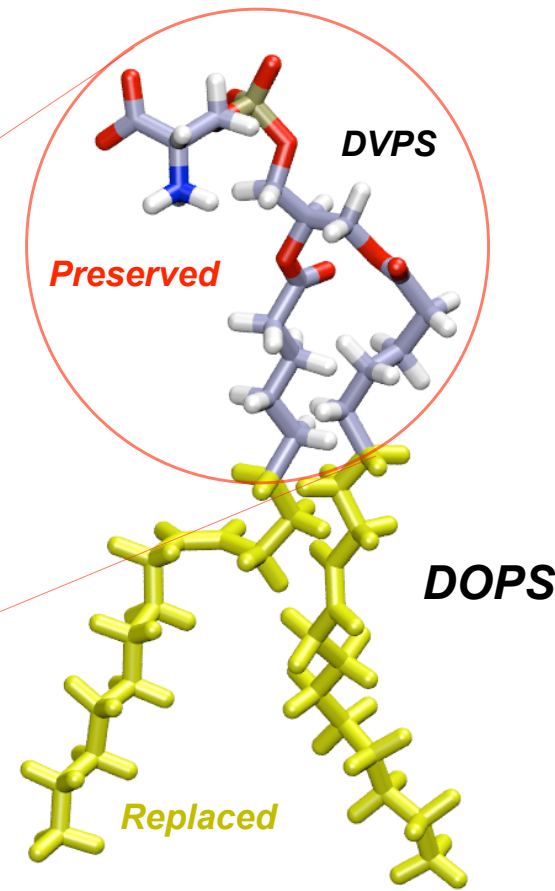
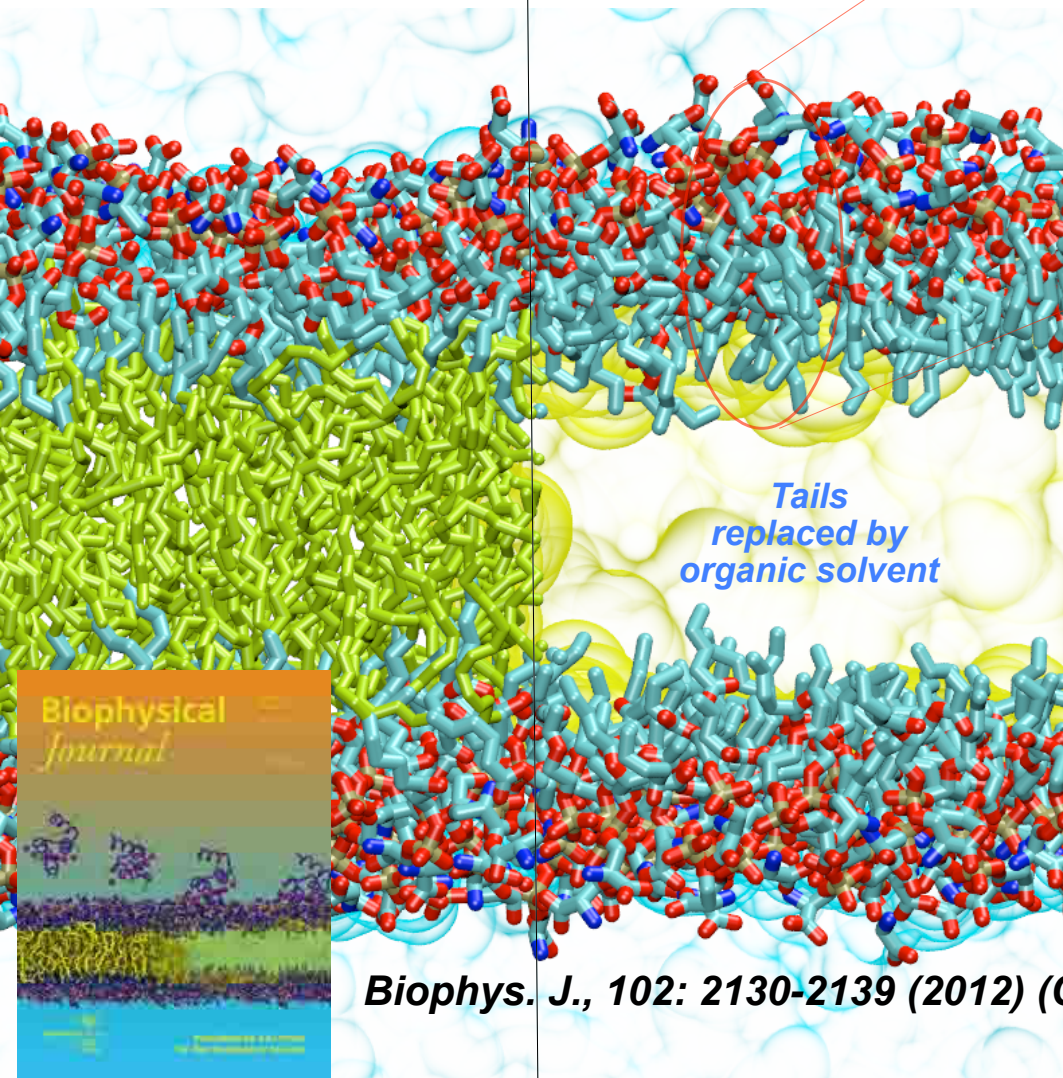
Z. Ohkubo and E. T., *Structure*, 16: 72-81 (2008)

# HMMM model

Highly Mobile Membrane Mimetic model

Full model

HMMM model



**Advantages**  
*Increased mobility of lipids*  
*Retain explicit headgroups allowing for atomic details*

*Biophys. J.*, 102: 2130-2139 (2012) (Cover Article)



Zenmei Ohkubo



Mark Arcario



Taras Pogorelov



Josh Vermaas



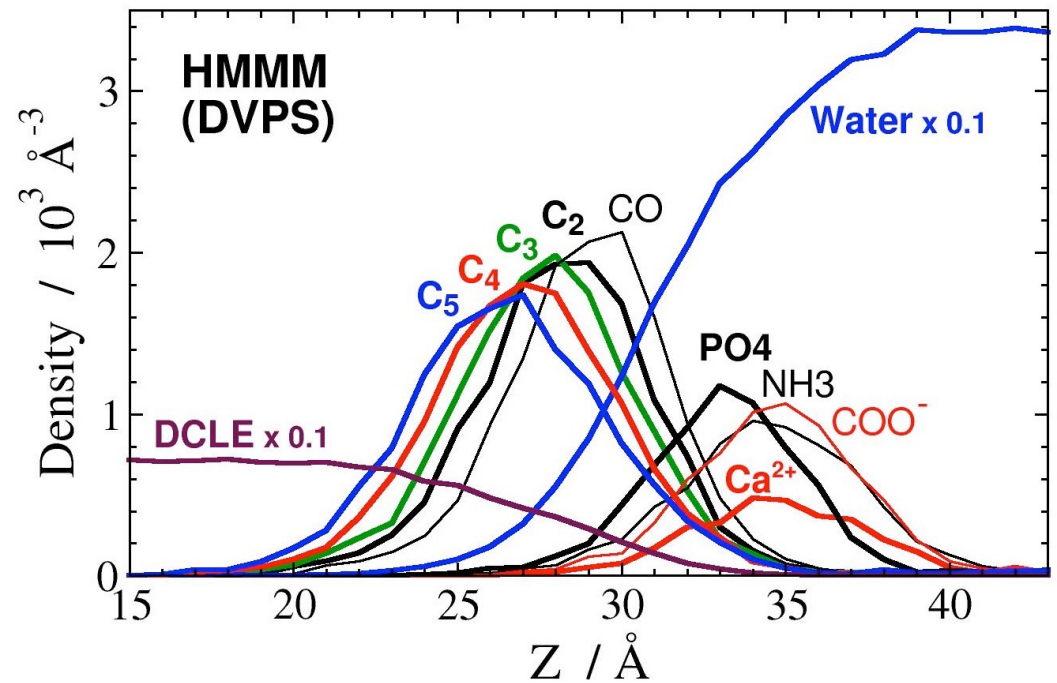
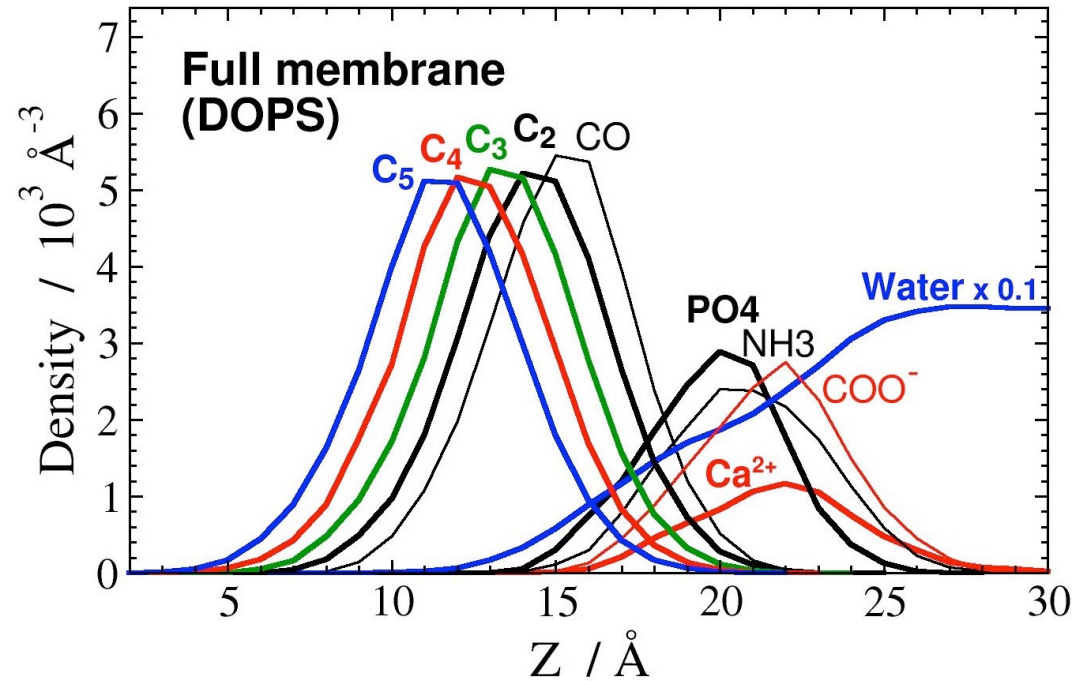
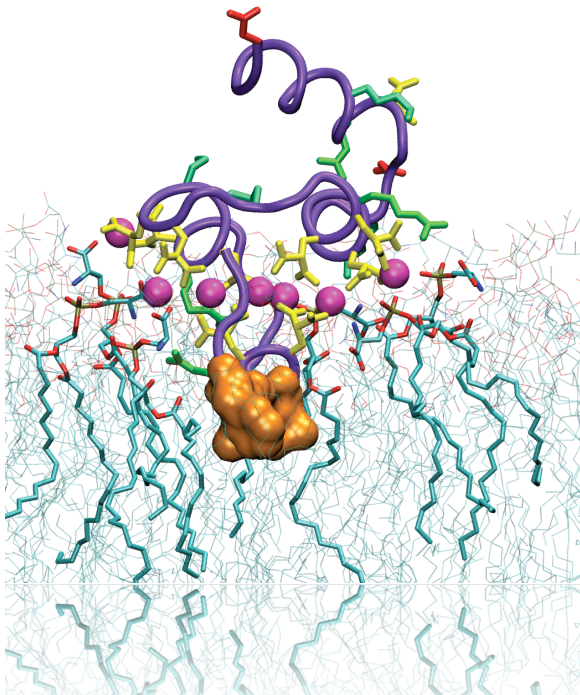
Javier Baylon



# HMMM- Preserving the “Face” of the Lipid Bilayer

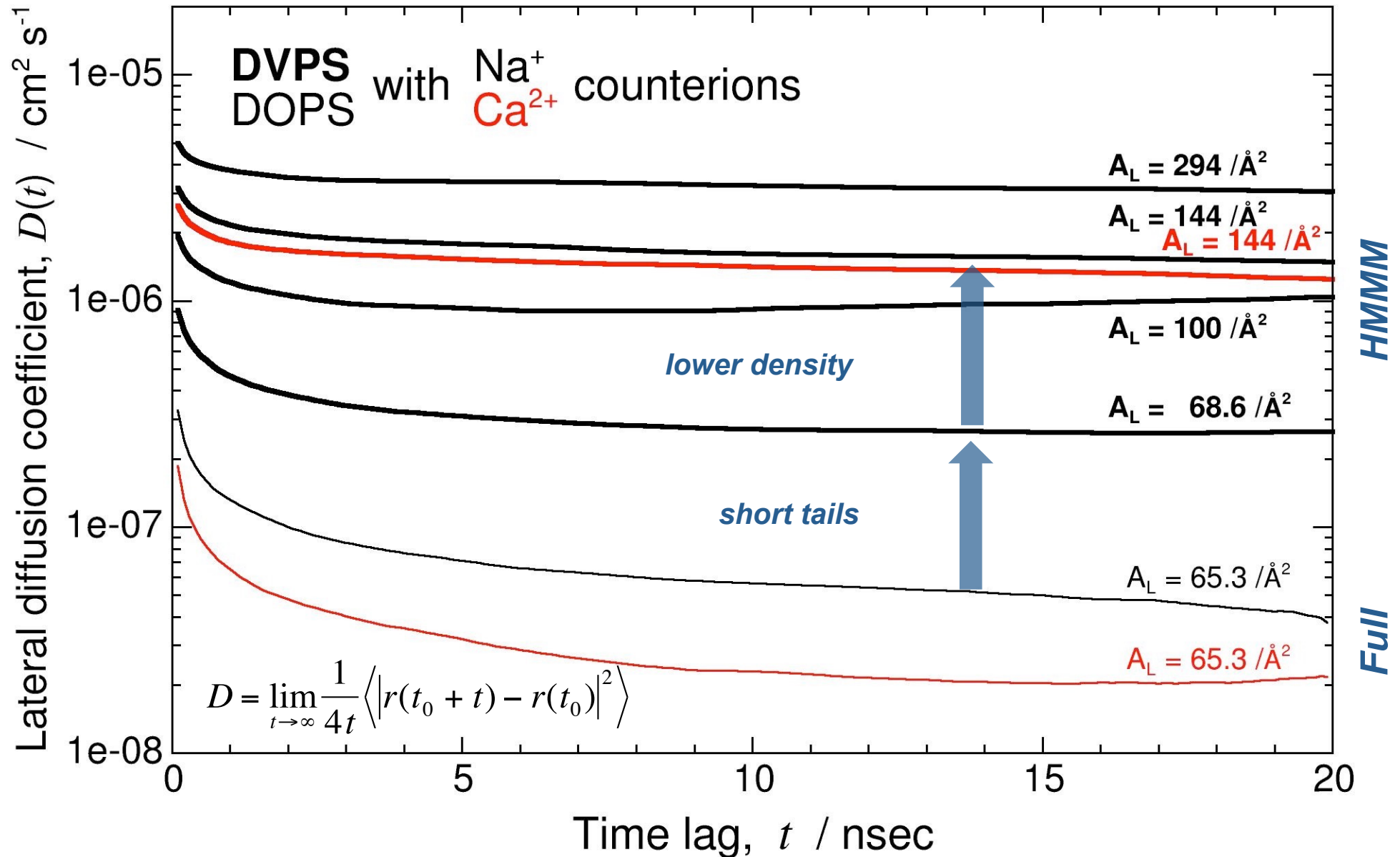
Perfect match in the membrane profile particularly in the head group region

Critical for proper description of lipid protein interactions



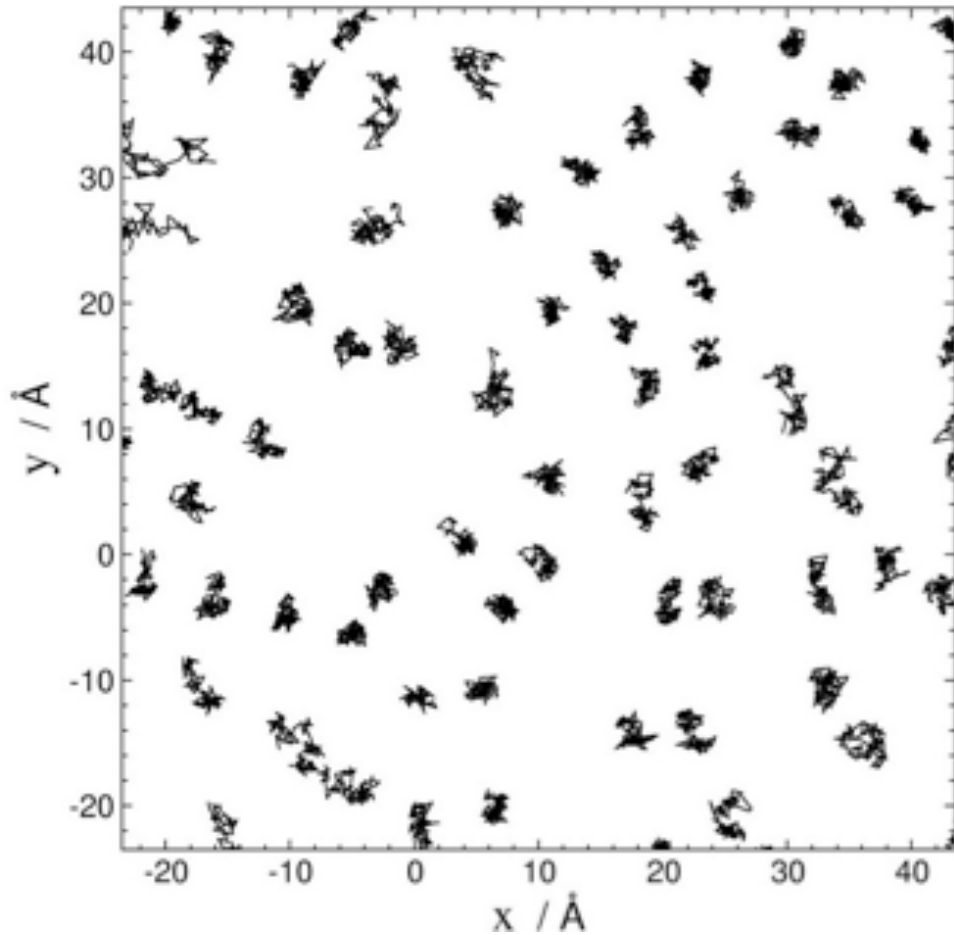
# Enhanced Lipid Lateral Diffusion

*Without Compromising Atomic Details of the Headgroups*

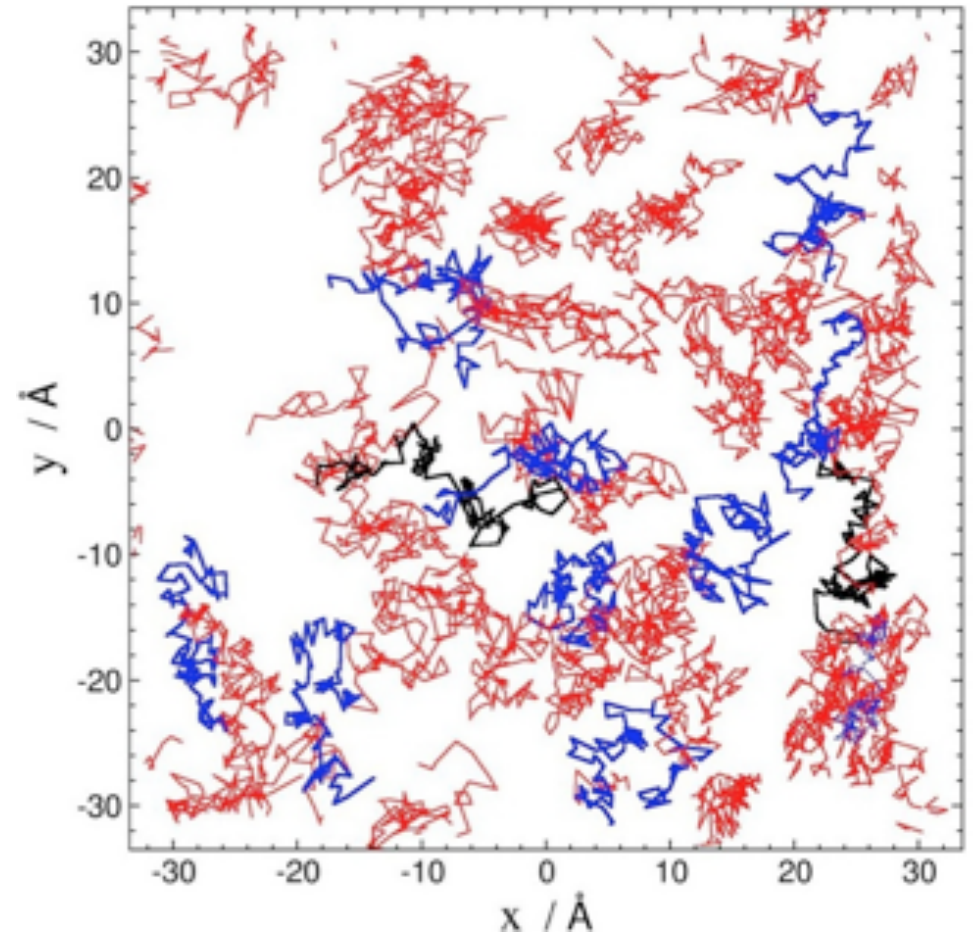


# Enhanced Lipid Lateral Diffusion

*Without Compromising Atomic Details of the Headgroups*



***Conventional membrane (10 ns)***

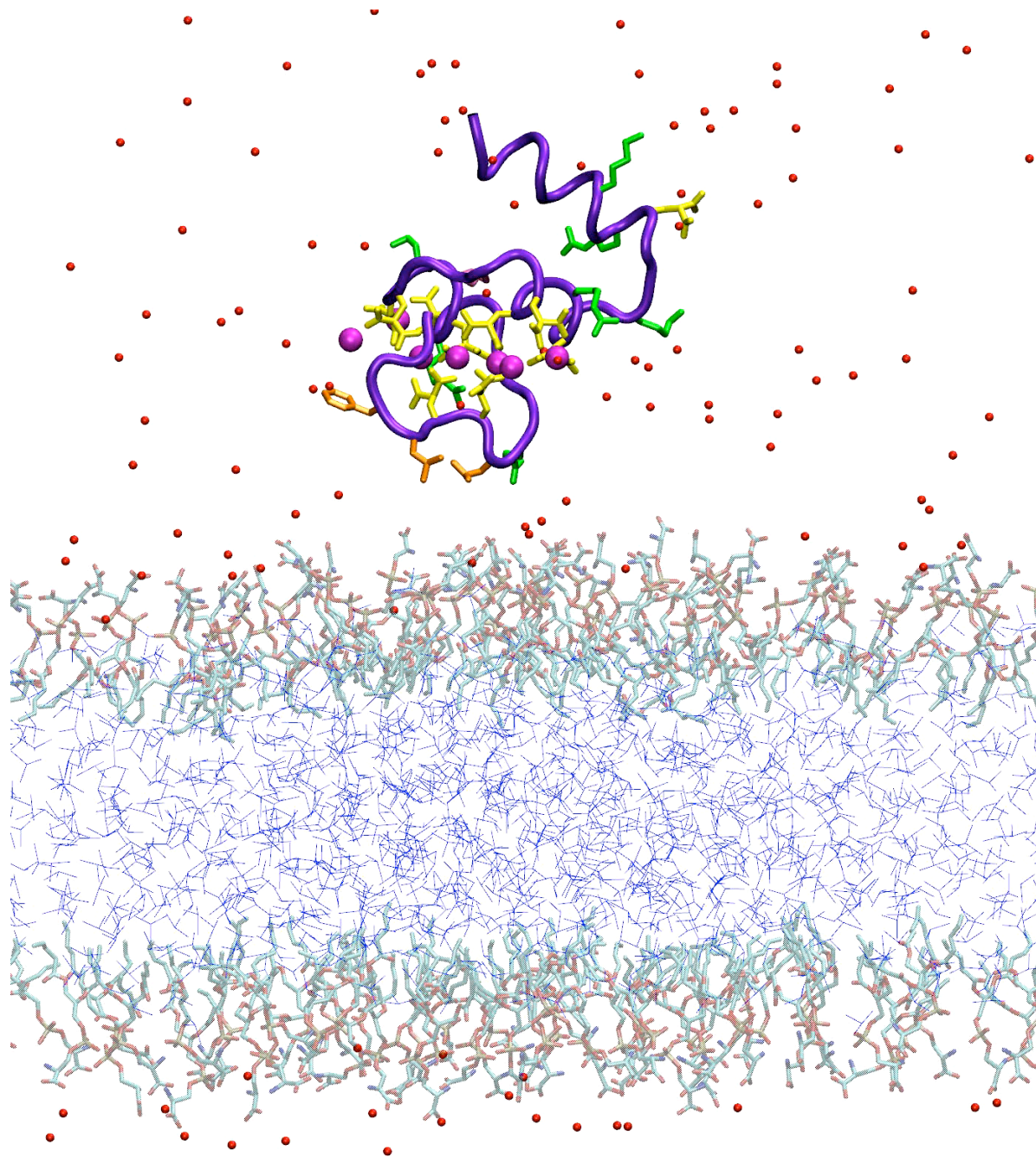


***HMMM membrane (1 ns)***

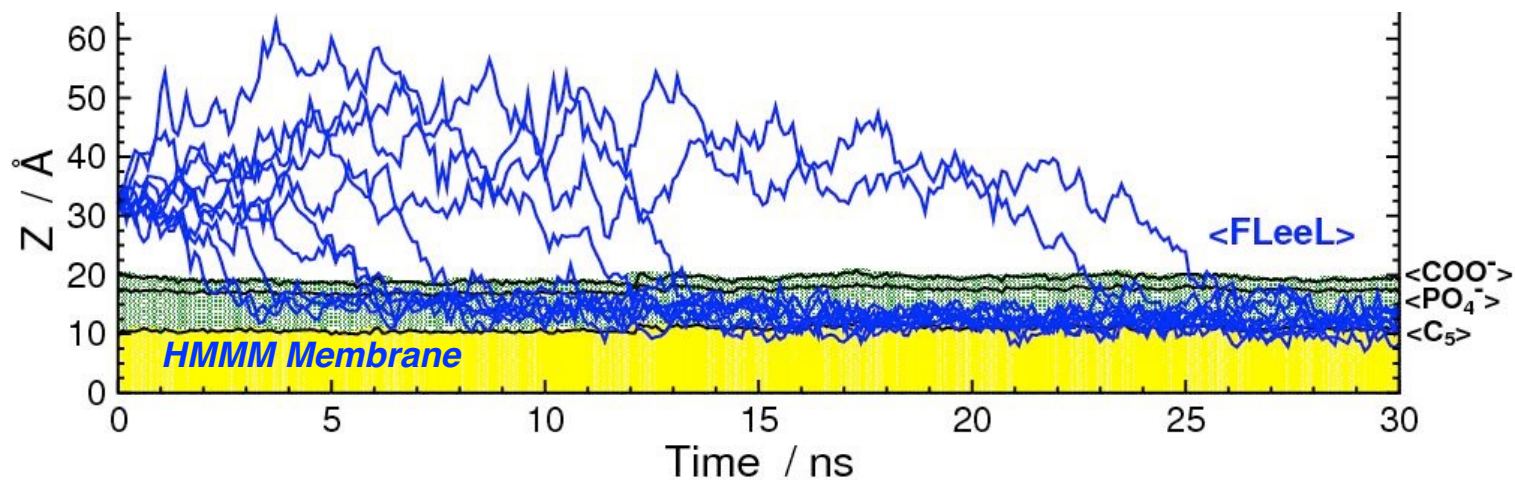
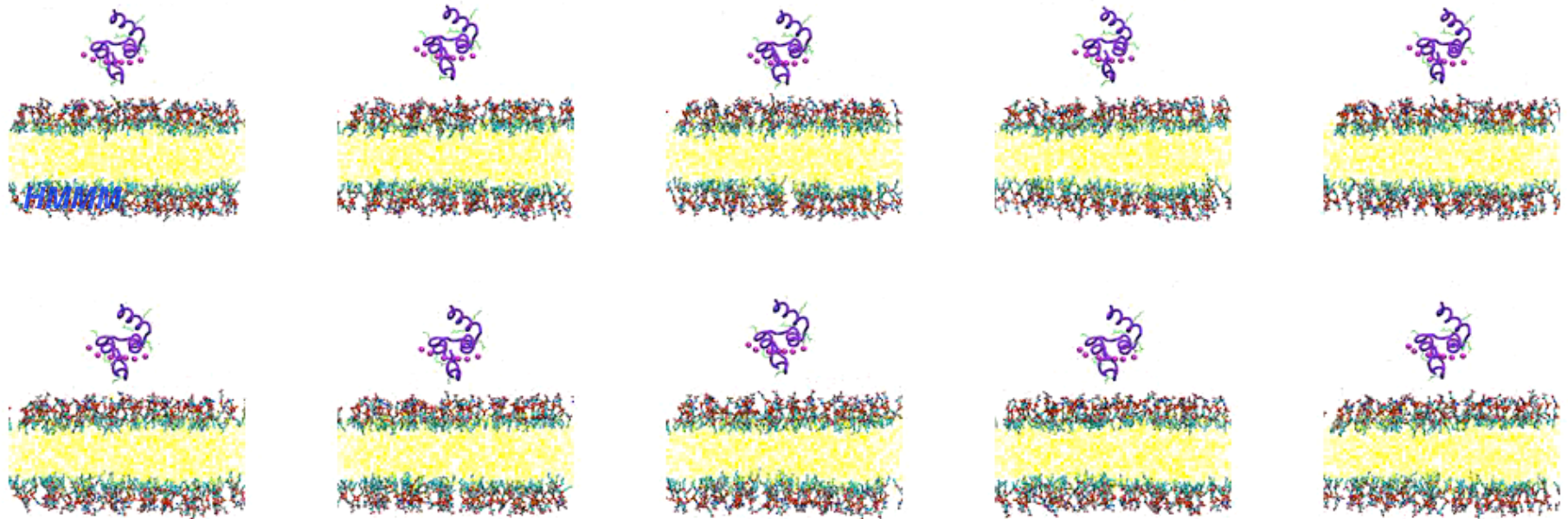
# PS-Dependent Spontaneous Insertion of FVII-GLA



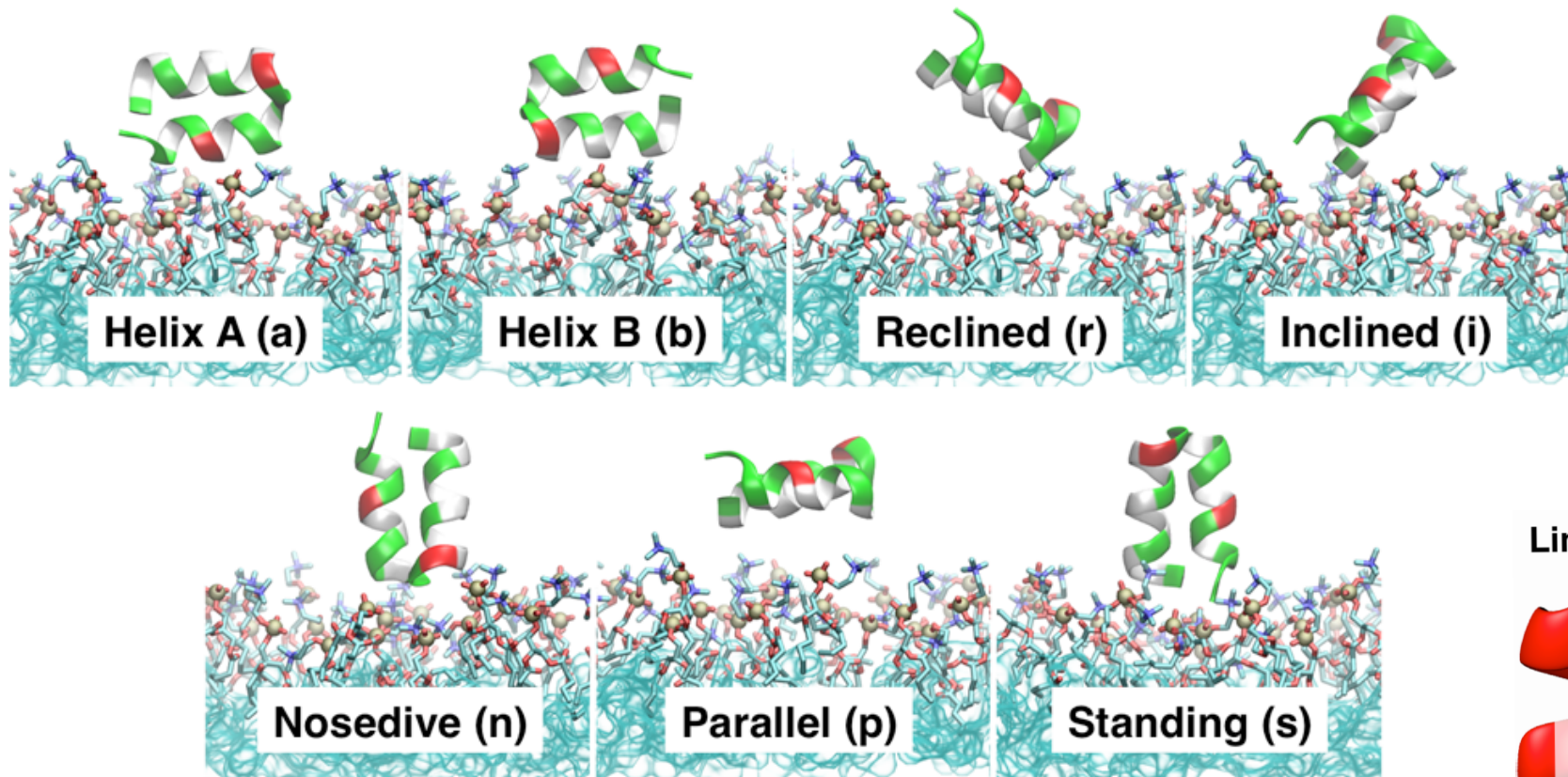
Zenmei Ohkubo



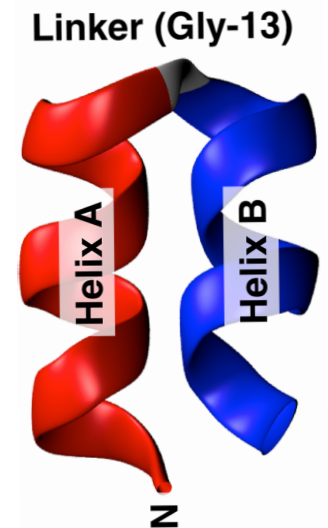
# Spontaneous, Unbiased Membrane Binding Accelerated Process Allows for better sampling ( $n = 10$ )



# Membrane Binding of Influenza Hemagglutinin Fusion Peptide



7 different initial orientation  
each simulated 3 times

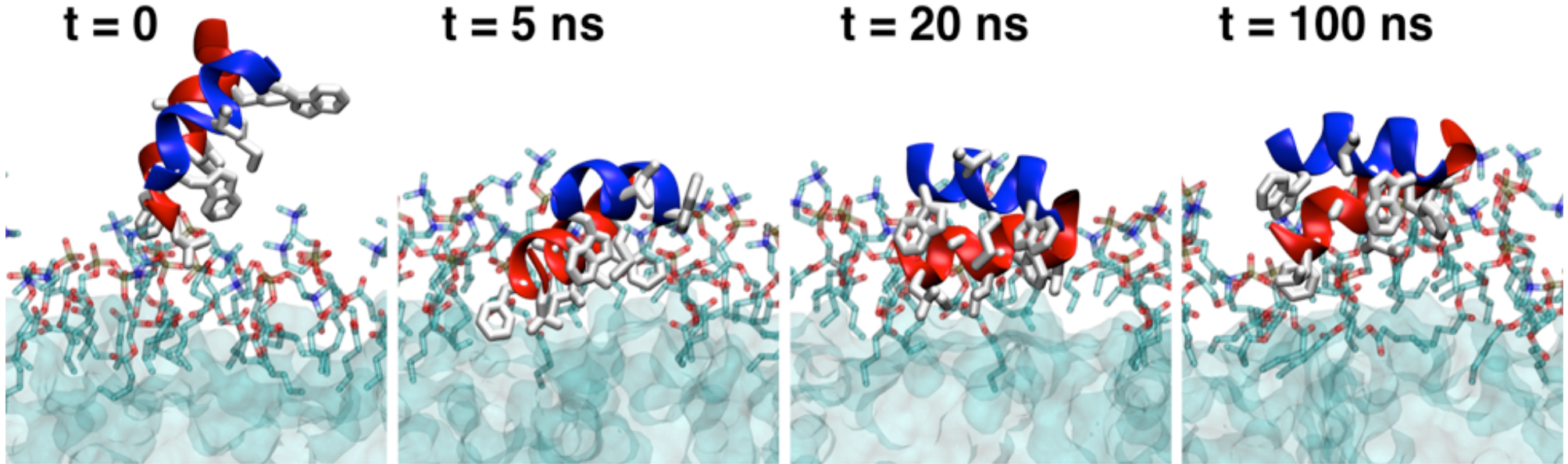


J. Baylon and E. T., *J. Phys. Chem.B*, 2015.



# Membrane Binding of Influenza Hemagglutinin Fusion Peptide

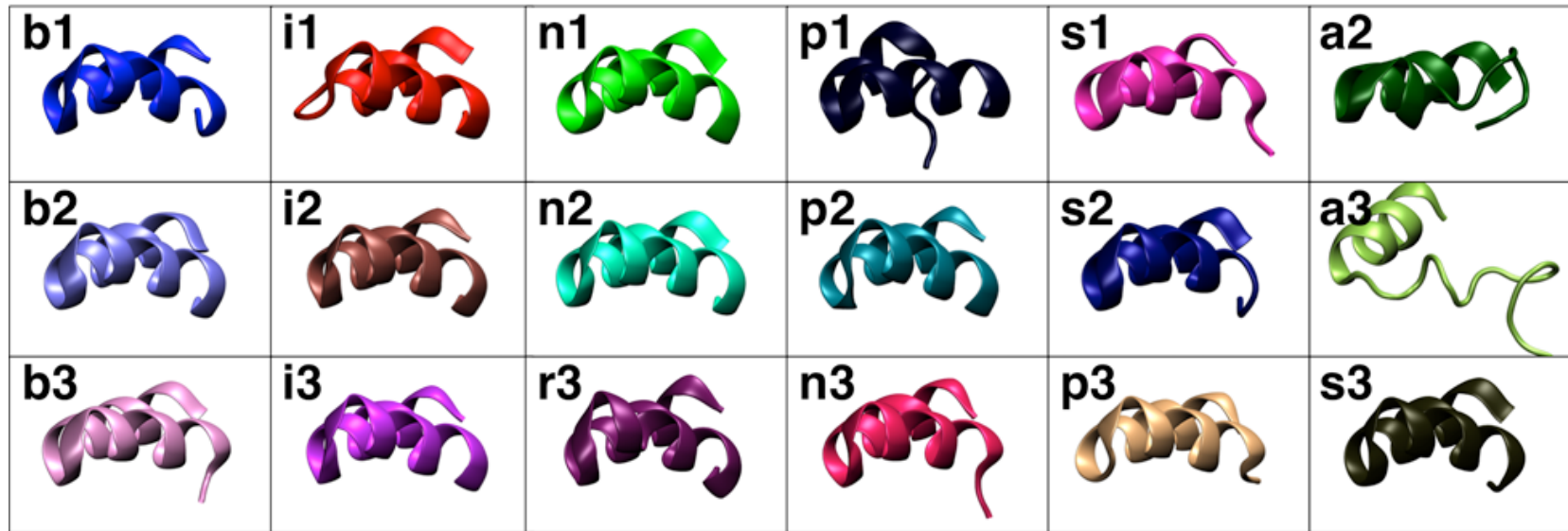
Spontaneous binding observed in the majority of the simulations:  
21 independent simulations starting from 7 different orientations



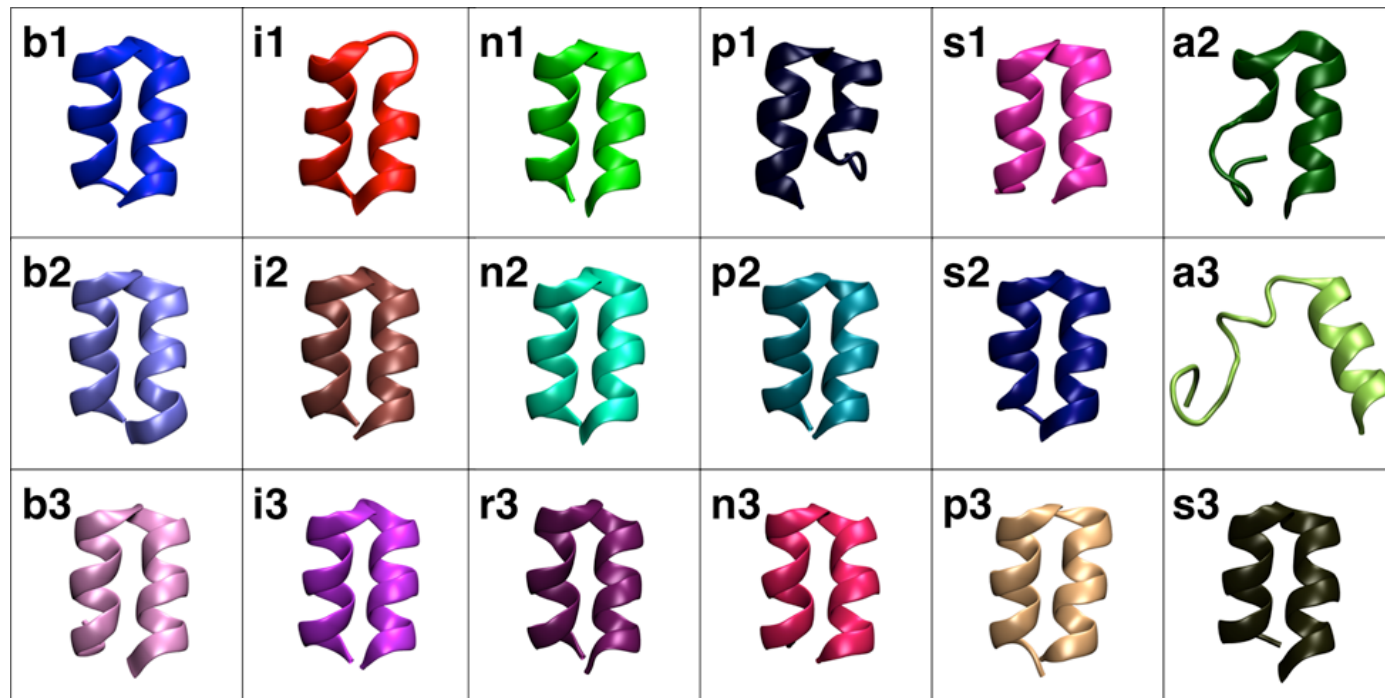
J. Baylon and E. T., *J. Phys. Chem.B*, 2015.

# Remarkable convergence of membrane binding simulations

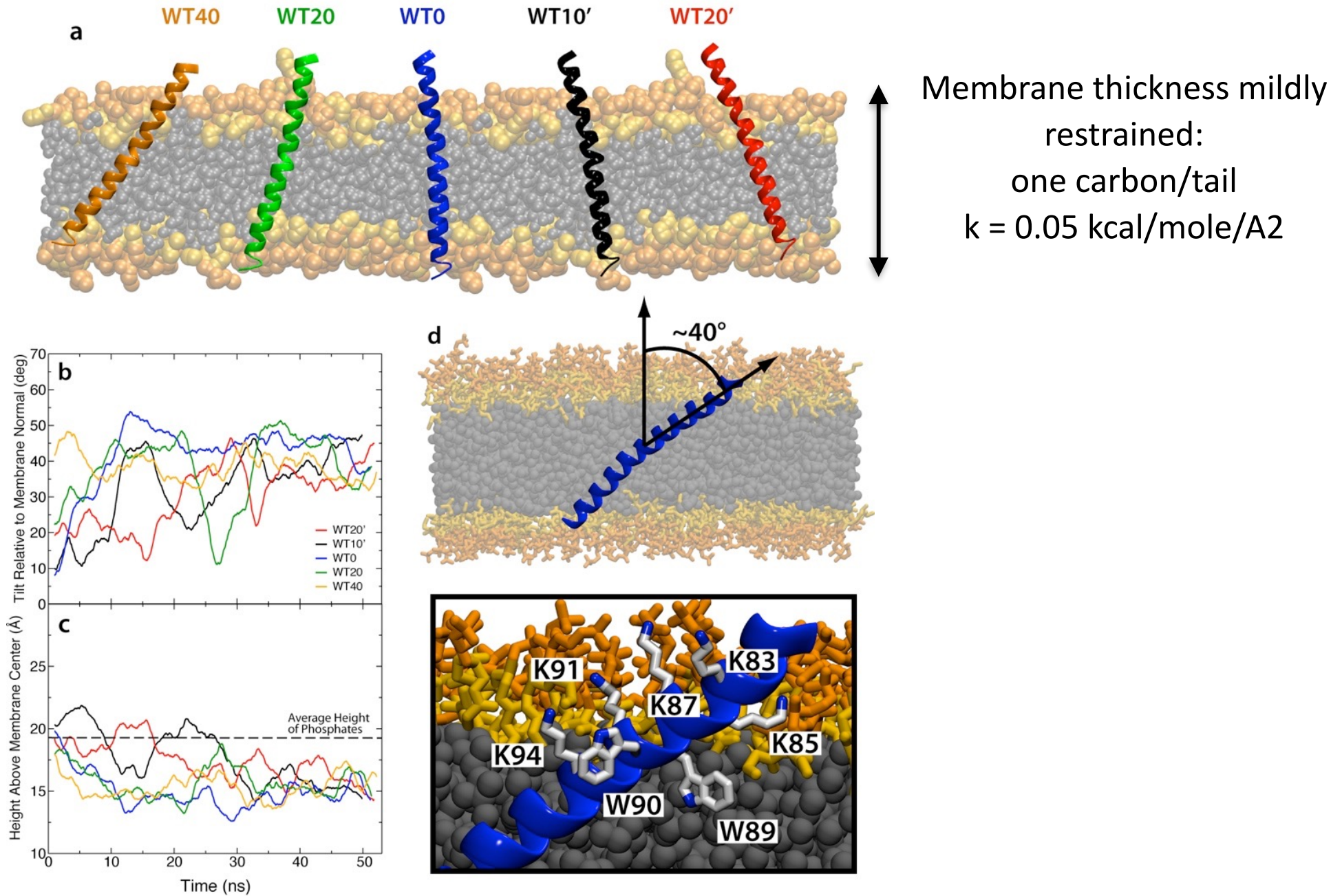
Side View



Top View



# Robust Tilt Observed in Synaptobrevin

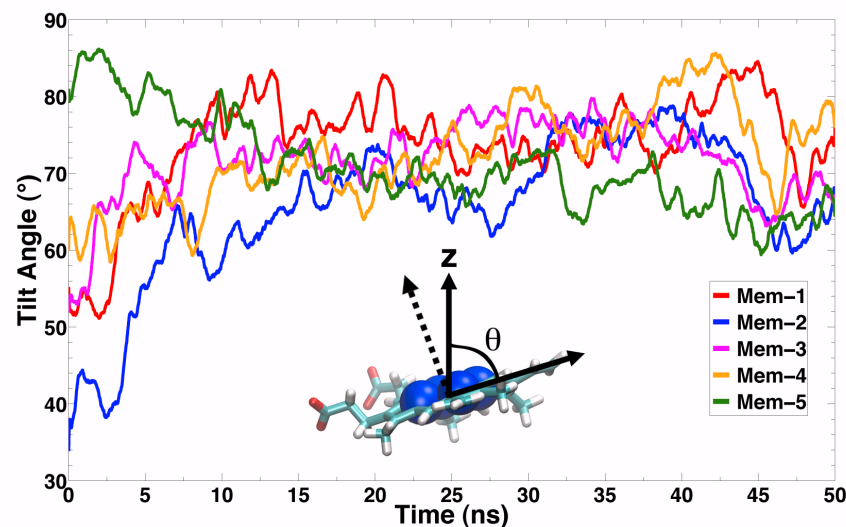
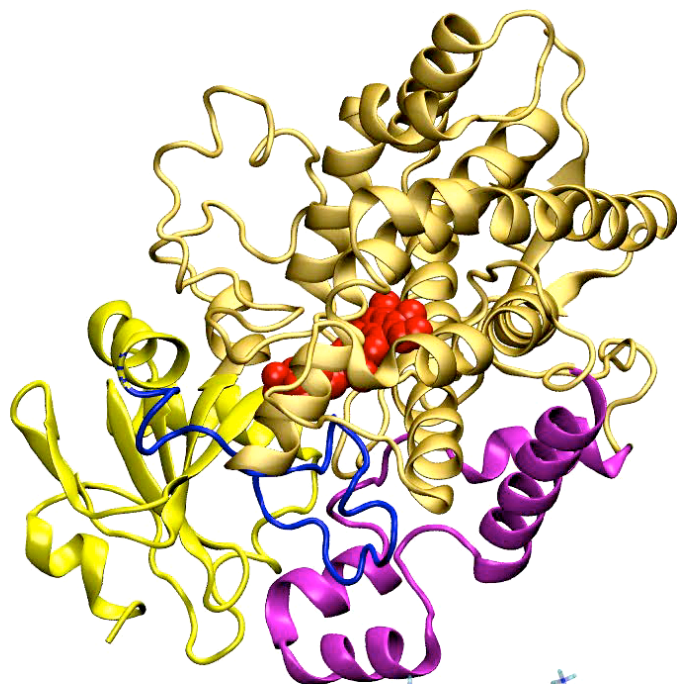


A. Blanchard\*, M. Arcario\*, K. Schulten, and ET, **Biophys. J.**, 107: 2112–21 (2014)

# Insertion and Membrane-Induced Conformational Change of Cytochrome P450



Javier Baylon



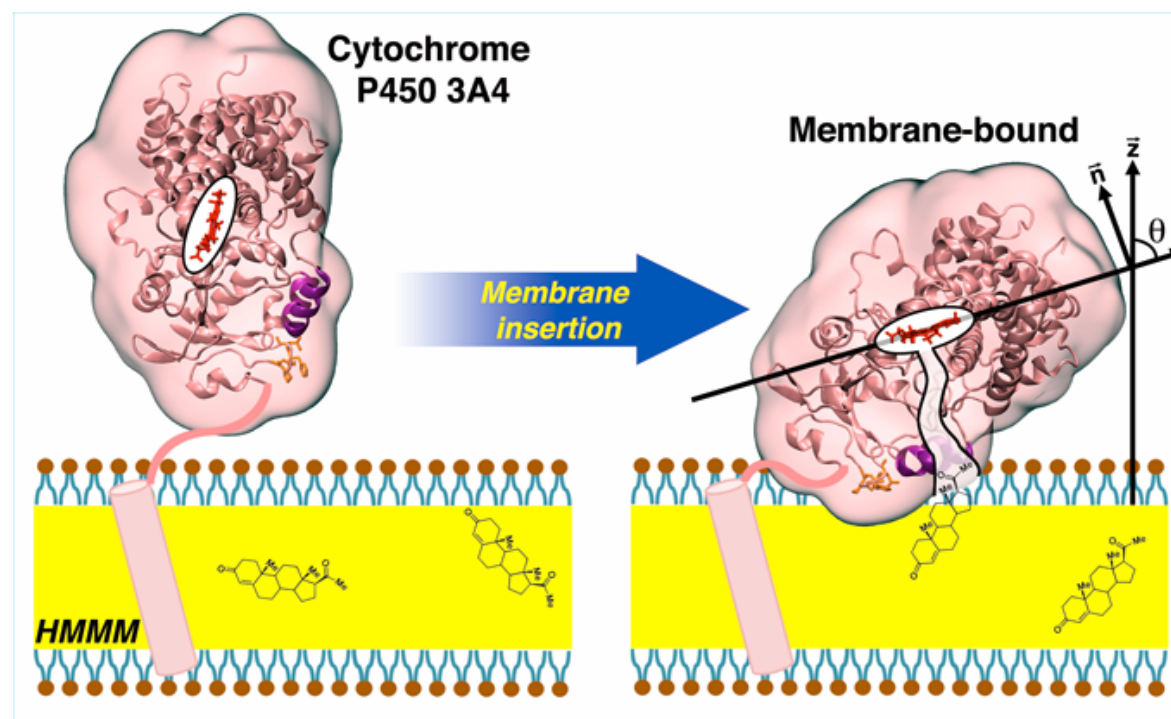
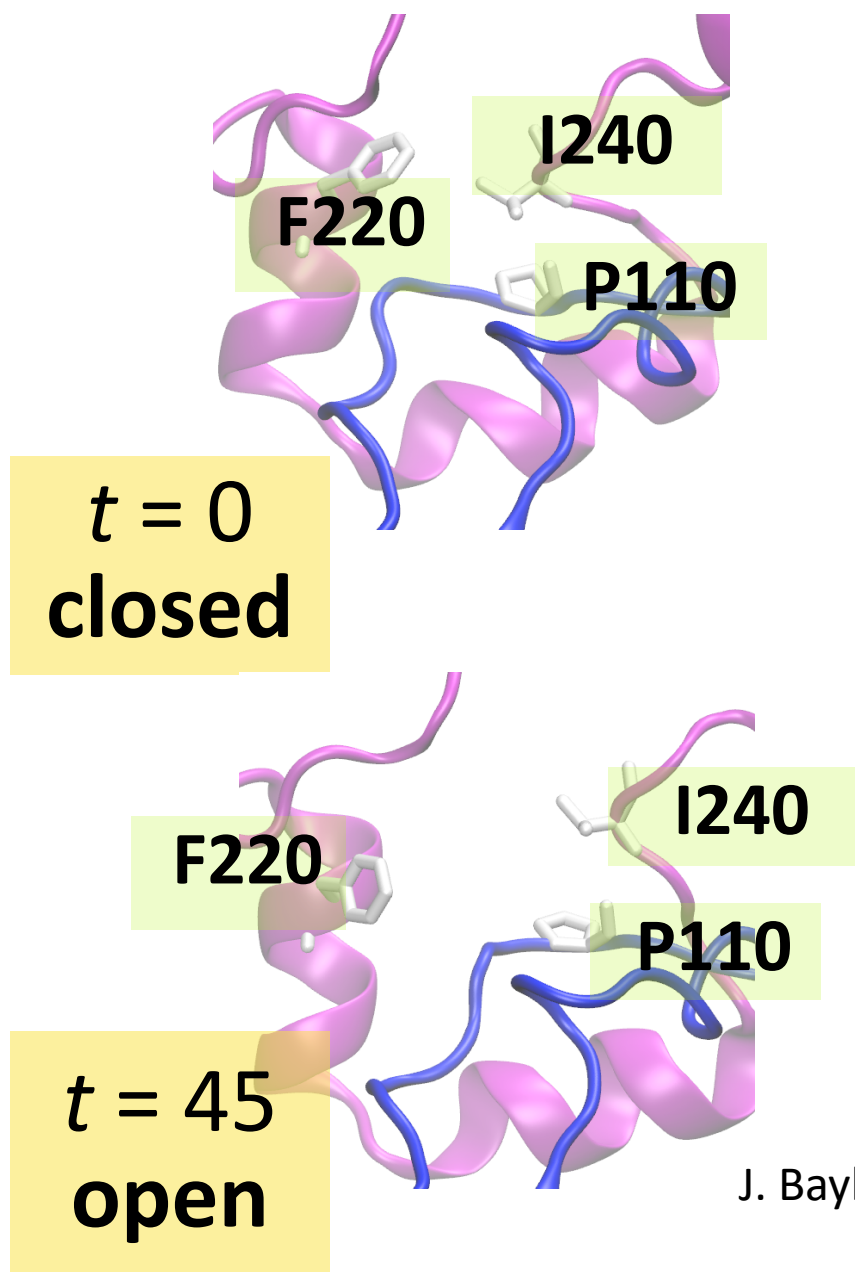
**Within 10 degrees of experimental measurement of the tilt angle (S. Sligar)**

J. Baylon, I. Lenov, S. Sligar and ET, JACS, 135: 8542–8551 (2013)

# Insertion and Membrane-Induced Conformational Change of Cytochrome P450



Javier Baylon



J. Baylon, I. Lenov, S. Sligar and ET, *JACS*, 135: 8542–8551 (2013)

# Battling the Timescale - Case III

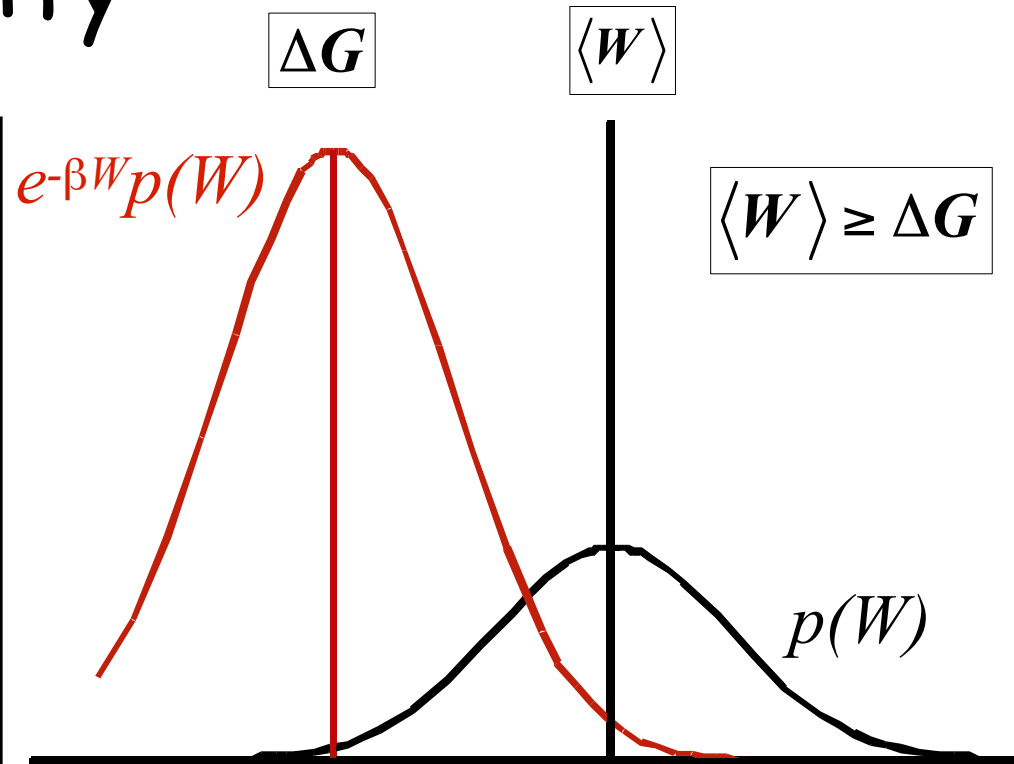
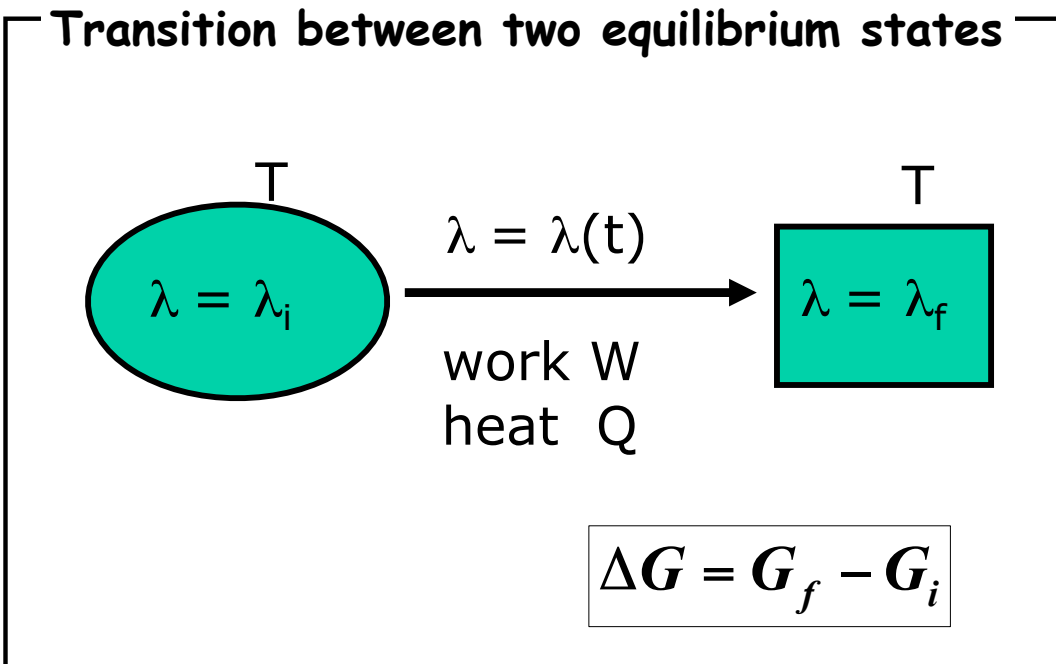
## Steered Molecular Dynamics is a non-equilibrium method by nature

- A wide variety of events that are inaccessible to conventional molecular dynamics simulations can be probed.
- The system will be driven, however, away from equilibrium, resulting in problems in describing the energy landscape associated with the event of interest.

Second law of thermodynamics

$$\longrightarrow W \geq \Delta G$$

# Jarzynski's Equality



C. Jarzynski, *Phys. Rev. Lett.*, **78**, 2690 (1997)

C. Jarzynski, *Phys. Rev. E*, **56**, 5018 (1997)

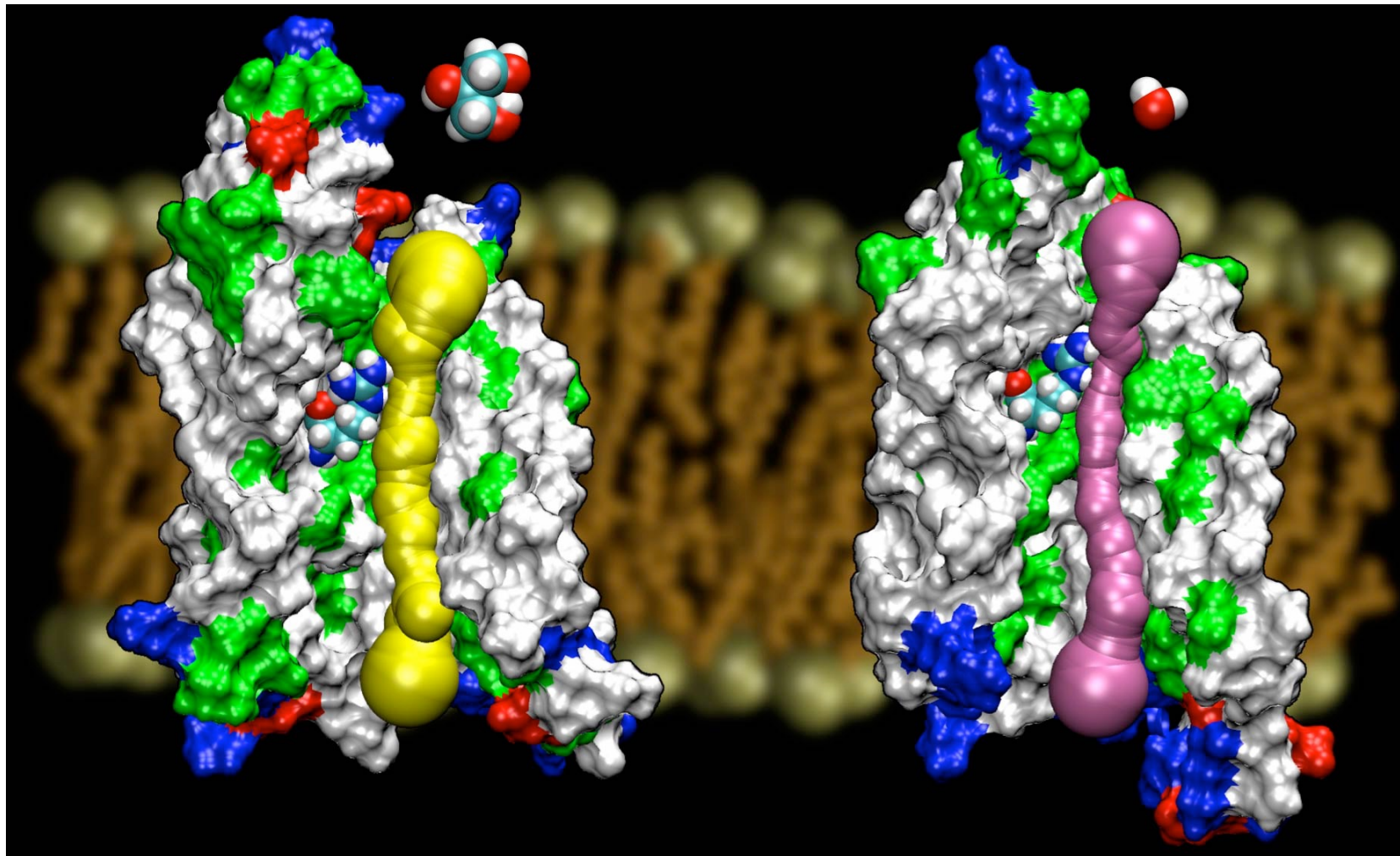
$$\langle e^{-\beta W} \rangle = e^{-\beta \Delta G}$$

$$\beta = \frac{1}{k_B T}$$

**In principle**, it is possible to obtain free energy surfaces from repeated **non-equilibrium** experiments.

# AqpZ vs. GlpF

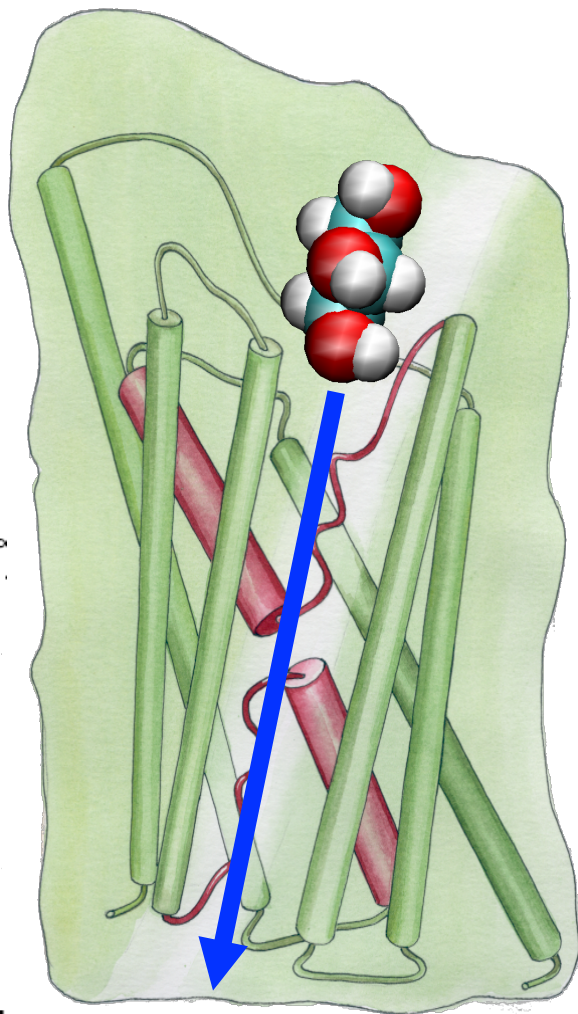
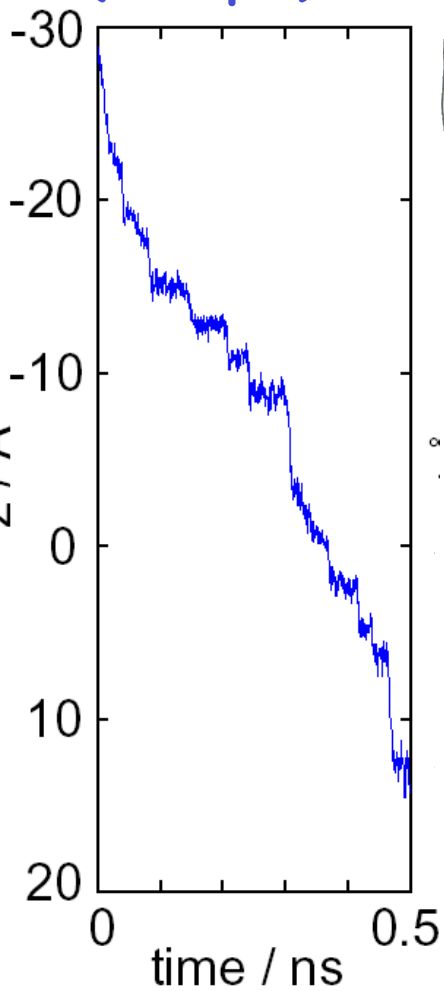
- Both from *E. coli*
- AqpZ is a pure water channel
- GlpF is a glycerol channel
- We have high resolution structures for both channels



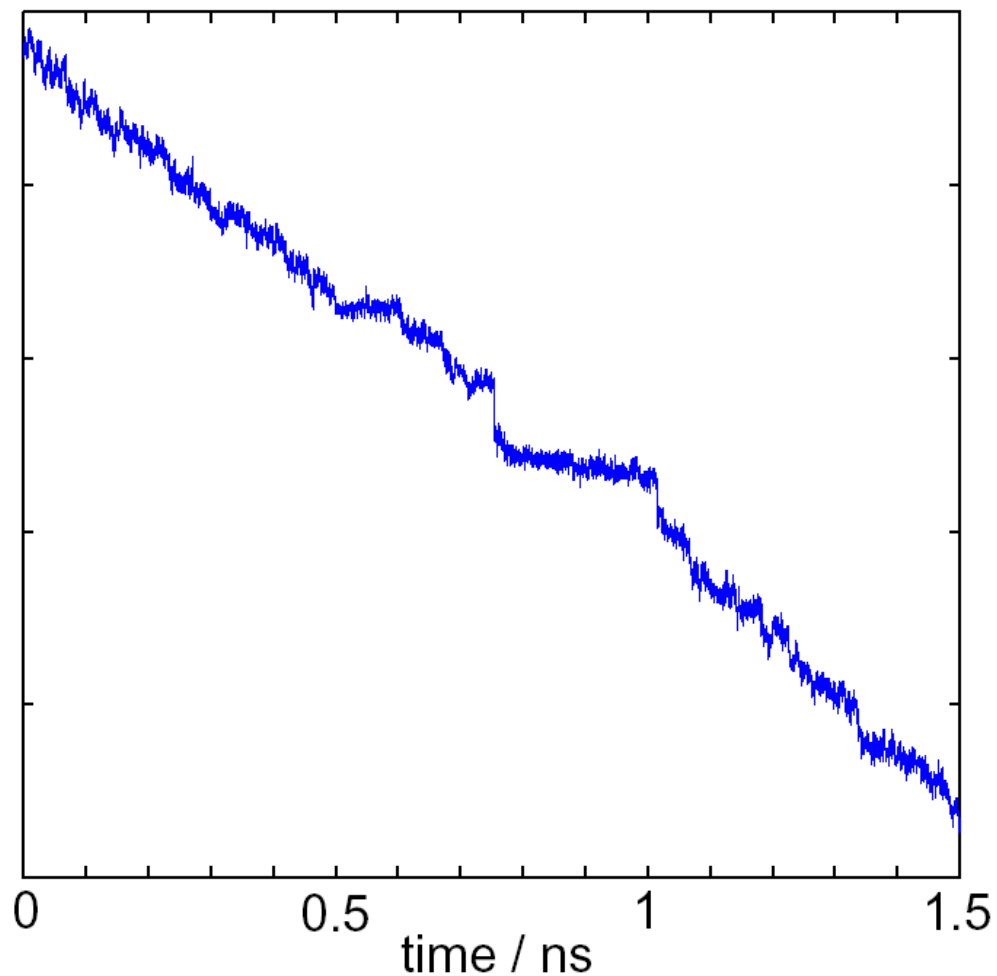


# Steered Molecular Dynamics

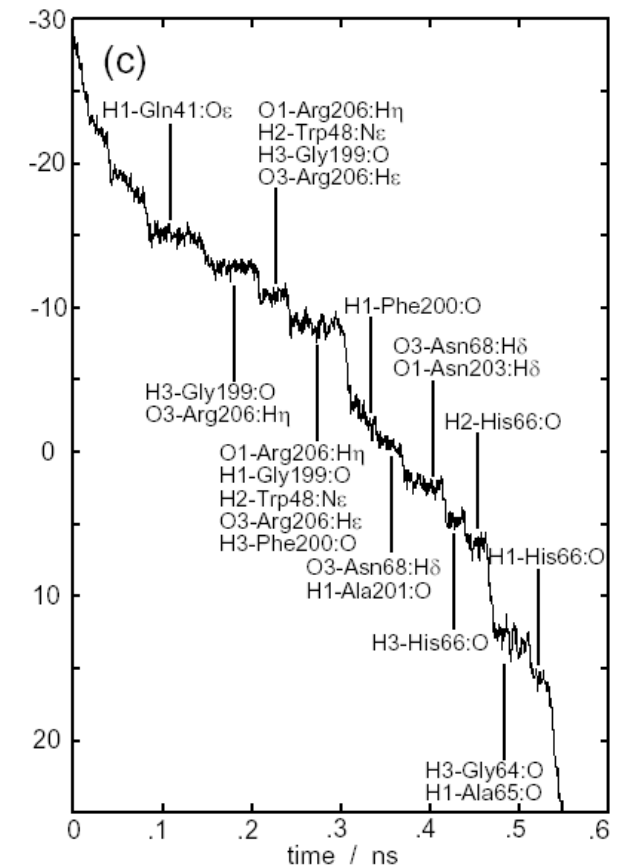
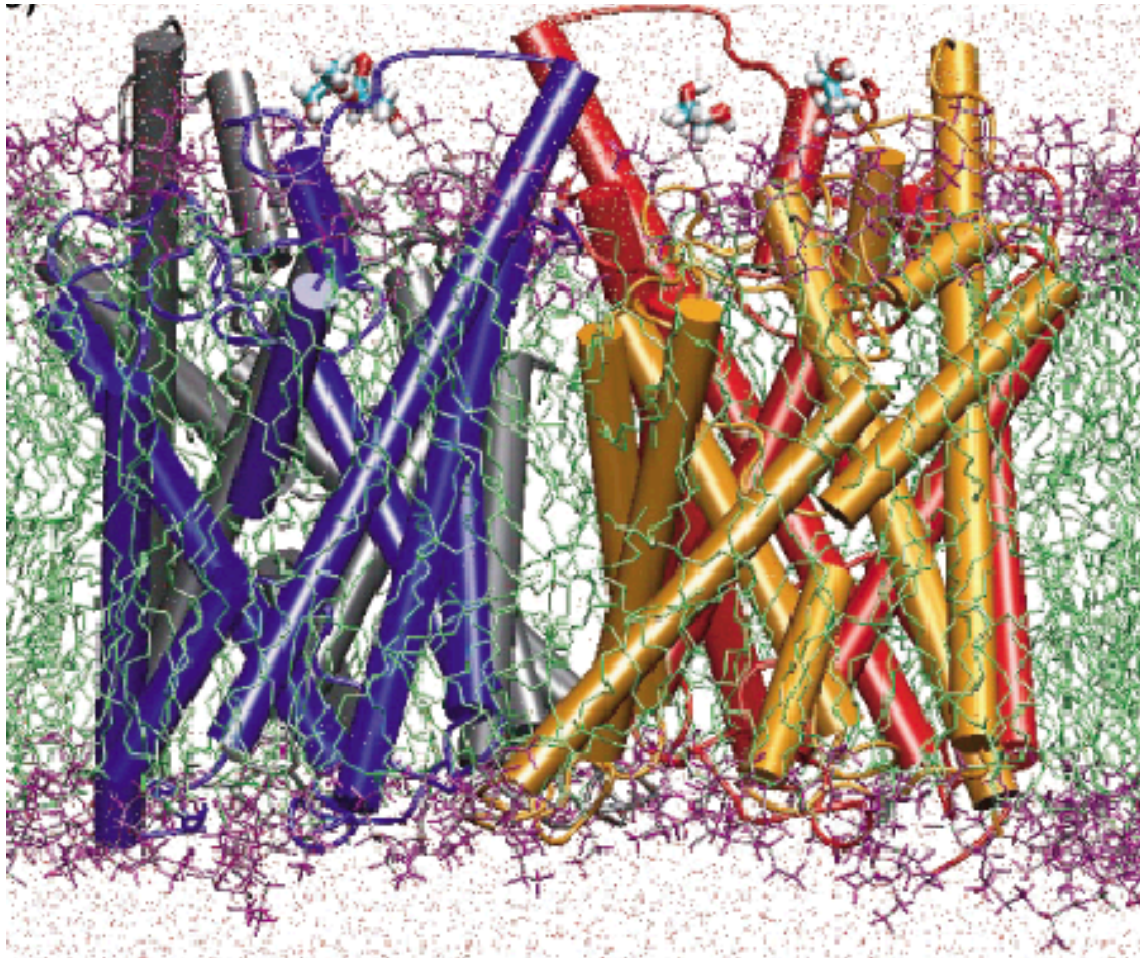
constant force  
(250 pN)



constant velocity  
(30 Å/ns)

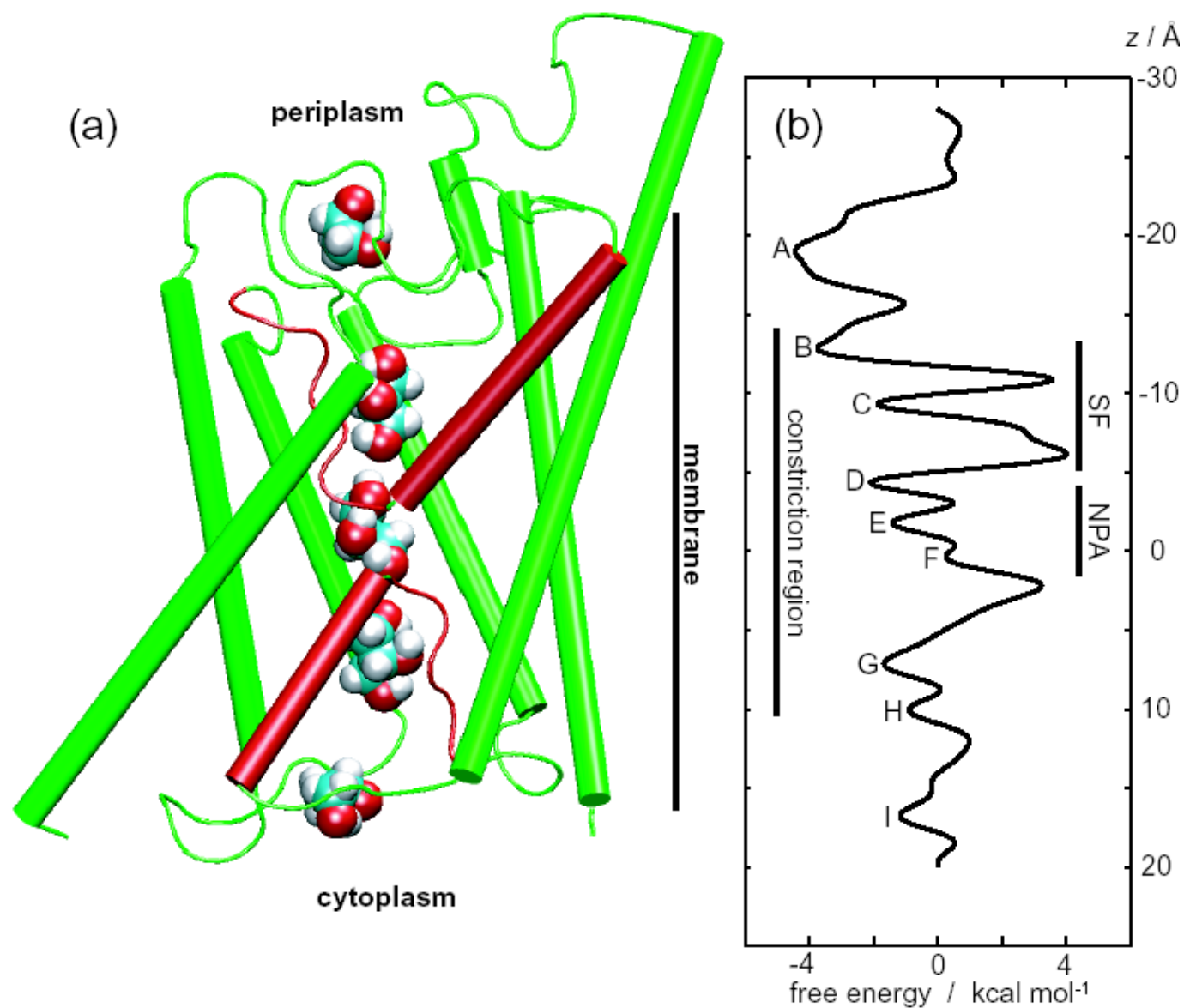


# SMD Simulation of Glycerol Passage



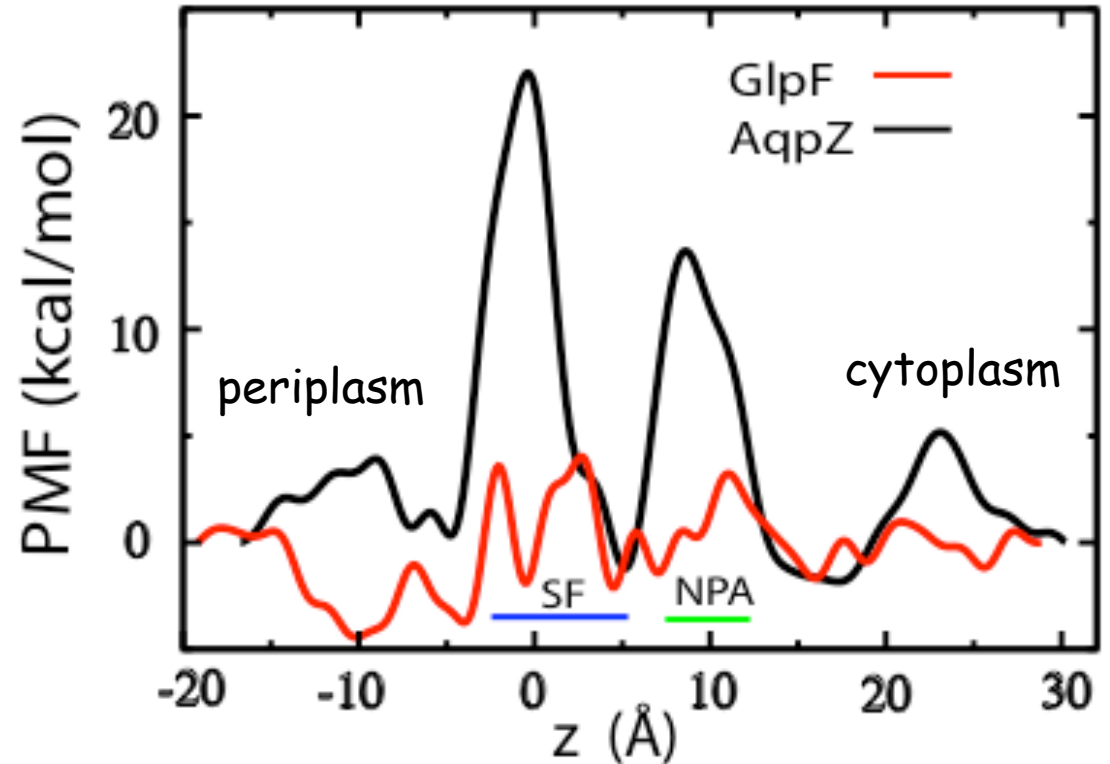
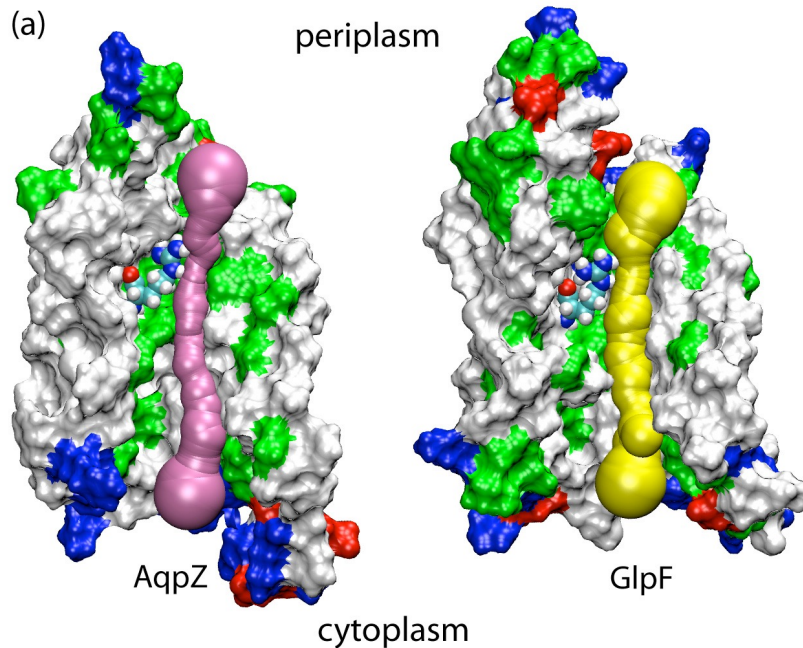
Trajectory of glycerol pulled by **constant force**

# Features of the Potential of Mean Force



- Captures major features of the channel
- The largest barrier  $\approx 7.3$  kcal/mol; exp.:  $9.6 \pm 1.5$  kcal/mol

# Three fold higher barriers

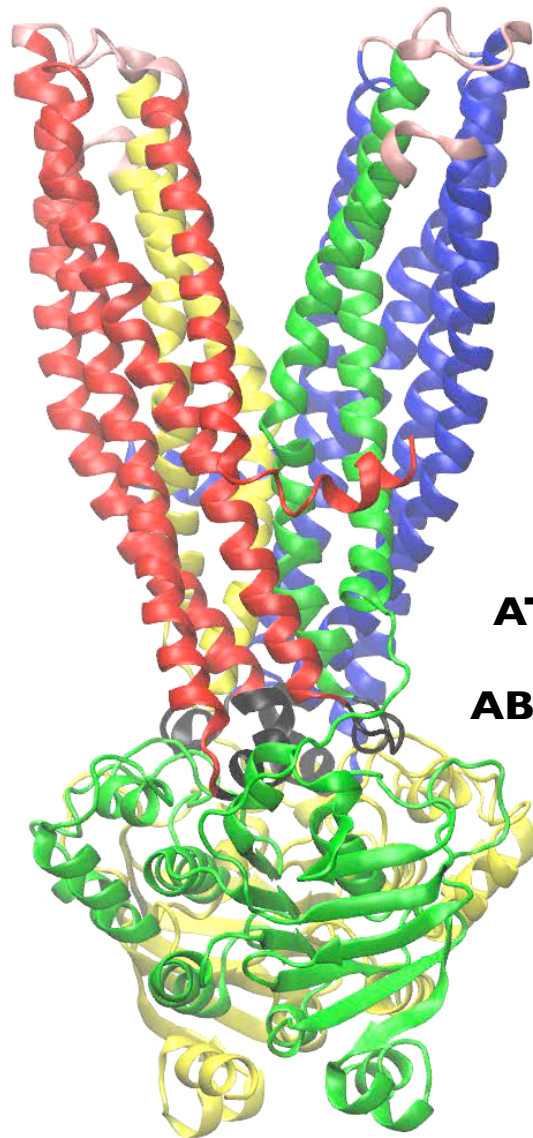


AqpZ 22.8 kcal/mol

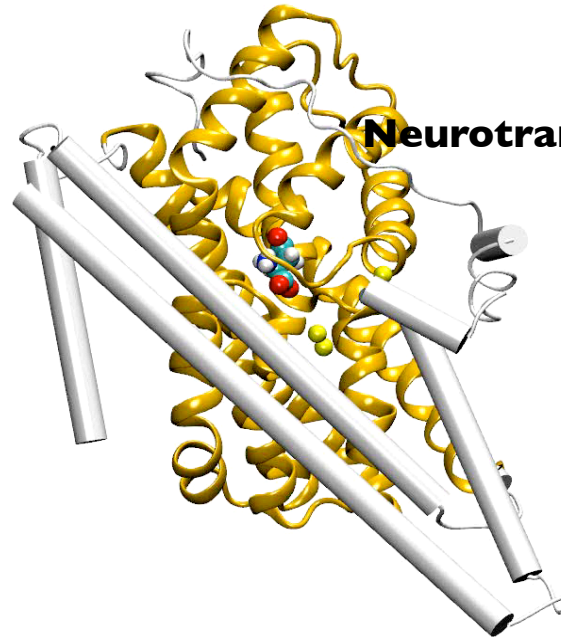
GlpF 7.3 kcal/mol

# Battling the Timescale - Case IV

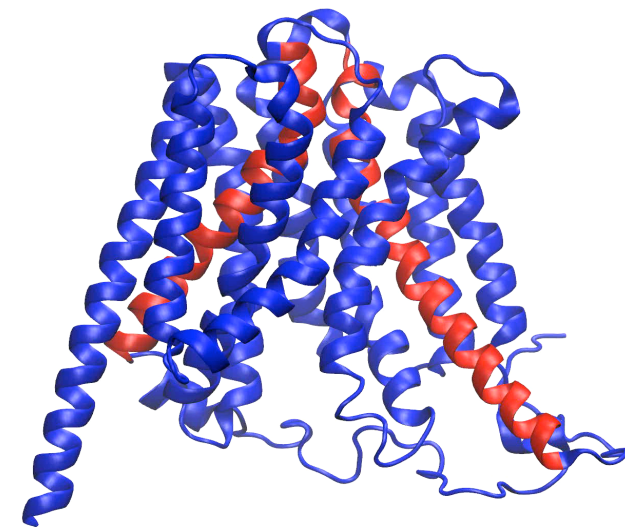
Biased (nonequilibrium) simulations along more complex reaction coordinates (COLVARS)



**ATP-Driven  
Primary  
ABC Exporter**



**Na-coupled  
Secondary  
Neurotransmitter Transporter**



**Secondary  
Phosphate  
Antiporter**

# Complex Processes Require Complex Treatments

## I.1 Defining Practical Collective Variables

Empirical search for practical collective variables for inducing the conformational changes involved in the transition.

## I.2 Optimizing the Biasing Protocols

Systematic search for a practical biasing protocol by using different combinations of collective variables.

## II. Optimizing the Transition Pathway

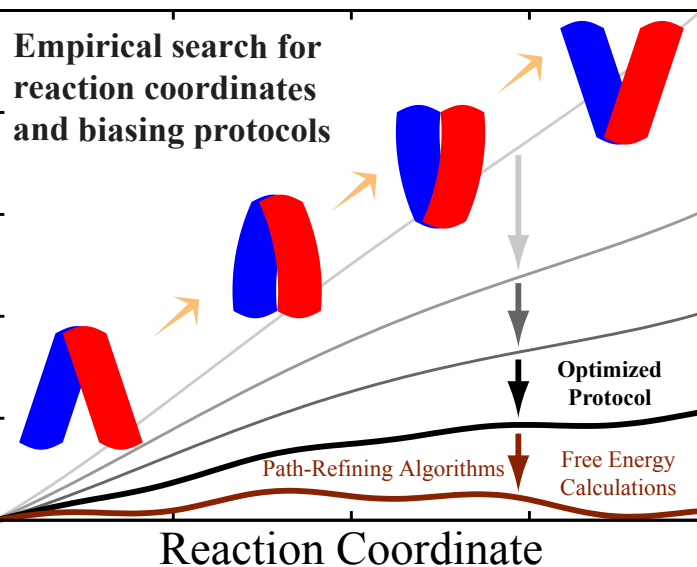
Use all of the conformations available to generate the most reliable transition pathway:  
1. Bayesian approach for combining the data  
2. Post-hoc string method (analysis tool)  
3. String method with swarms of trajectories

## III.1 Free Energy Calculations

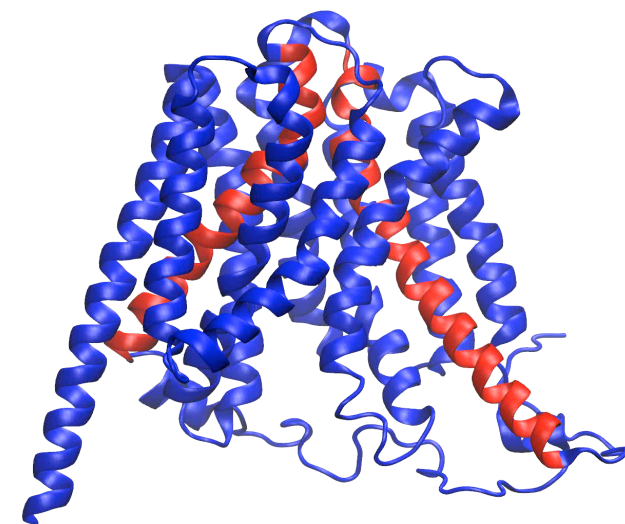
Using the most relevant collective variables (from I.1), biasing protocol (from I.2), and initial conformations (from I.2).

## III.2 Assessing the Sampling Efficiency

Detecting the poorly sampled, but potentially important regions, e.g., by using PCA.



**Mahmoud Moradi**

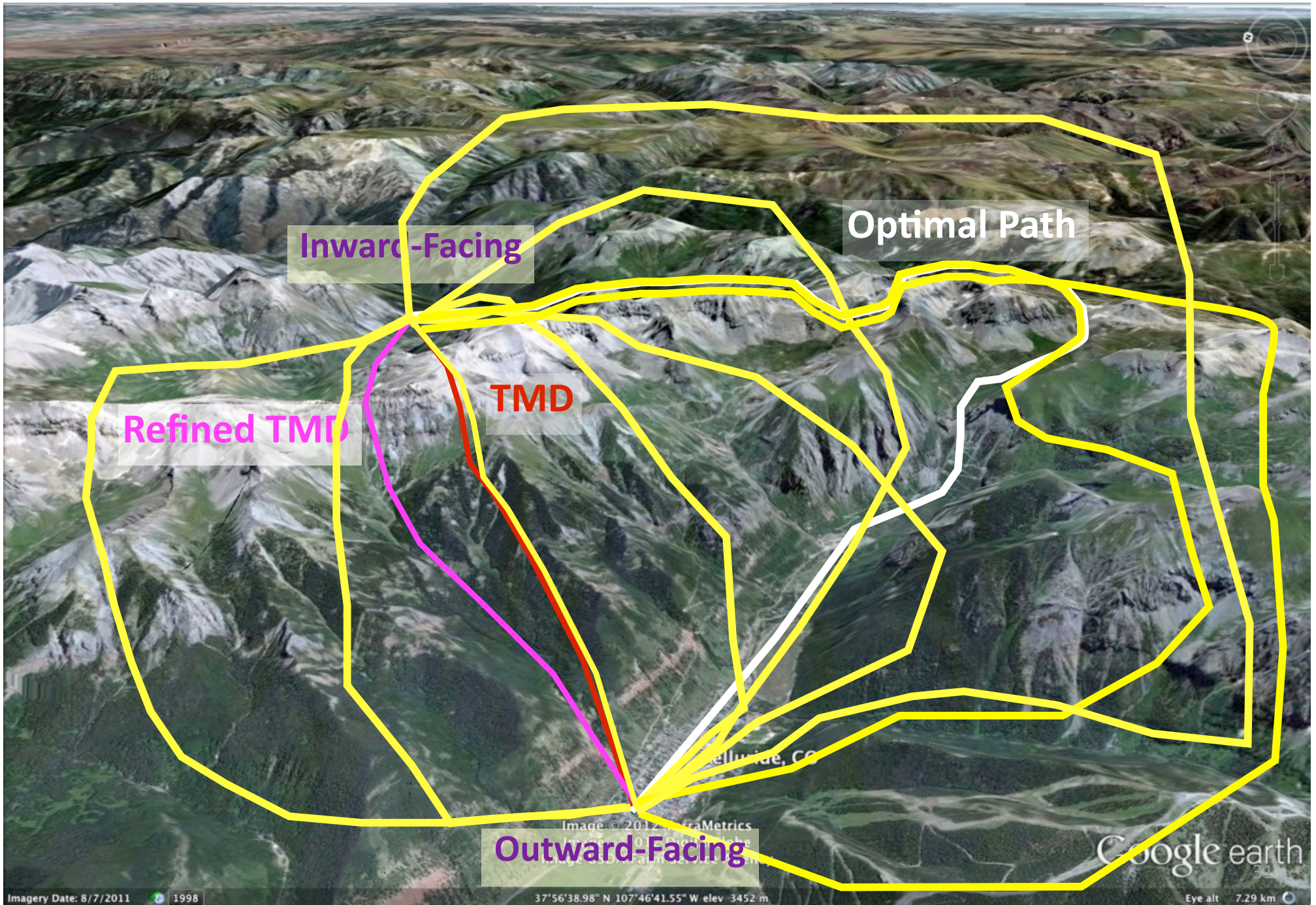


M. Moradi and ET (2013) *PNAS*, 110:18916–18921.

M. Moradi and ET (2014) *JCTC*, 10: 2866–2880.

M. Moradi, G. Enkavi, and ET (2015) *Nature Comm.*, 6:8393.

# Aggressive Search of the Space



# Non-equilibrium Driven Molecular Dynamics:

Applying a time-dependent external force to induce the transition

Along various pathways/mechanisms (collective variables)

Harmonic constant      Initial state

$$U_{dr}(\mathbf{x}, t) = \frac{1}{2}k \left( \xi(\mathbf{x}) - \xi_A + (\xi_B - \xi_A) \frac{t}{T} \right)^2$$

Biassing potential      Final state      Total simulation time

**Collective variables:  
RMSD, distance,  
 $R_g$ , angle, ...  
orientation quaternion**

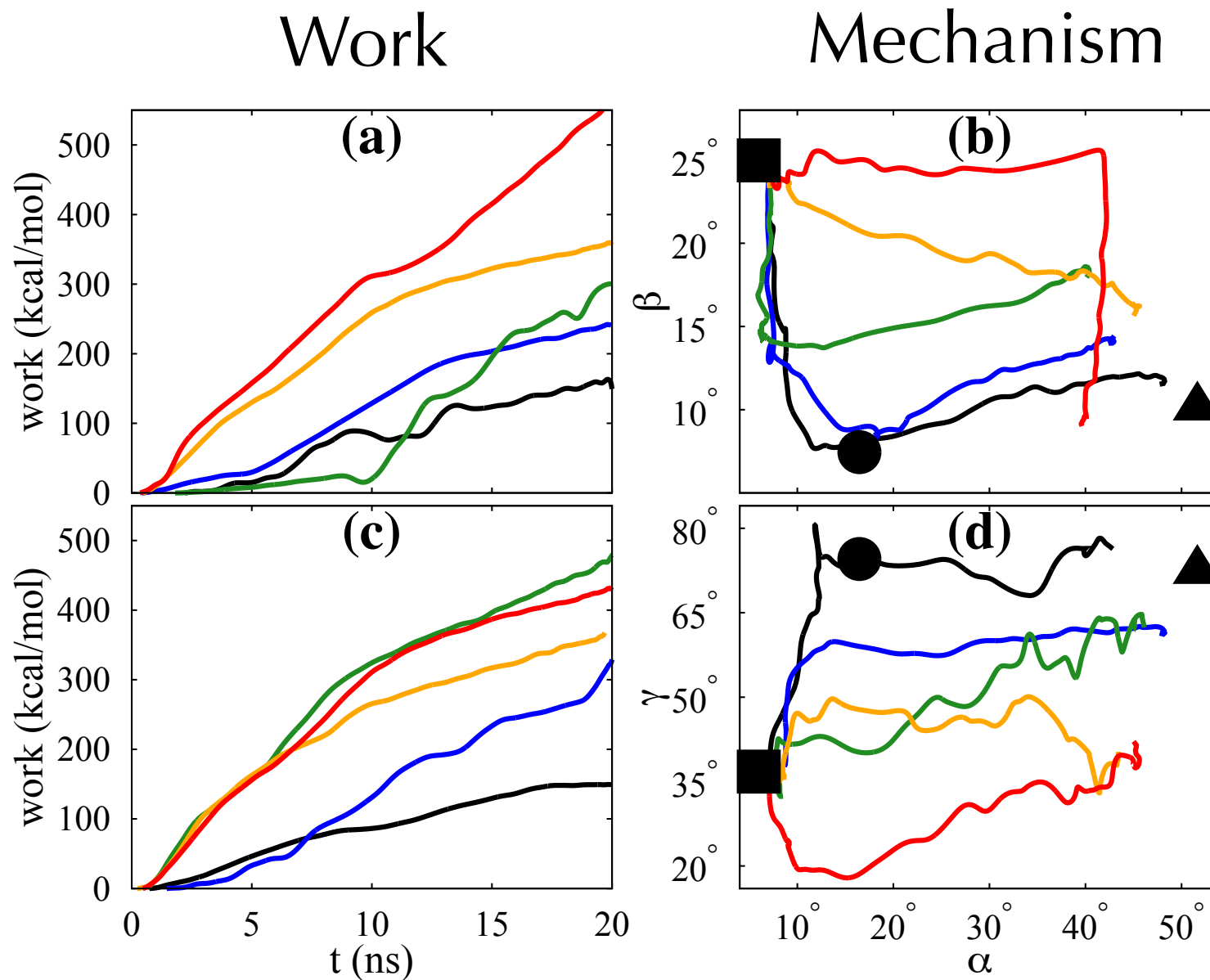
M. Moradi and ET (2013) **PNAS**, 110:18916–18921.

M. Moradi and ET (2014) **JCTC**, 10: 2866–2880.

M. Moradi, G. Enkavi, and ET (2015) **Nature Comm.**, 6:8393.

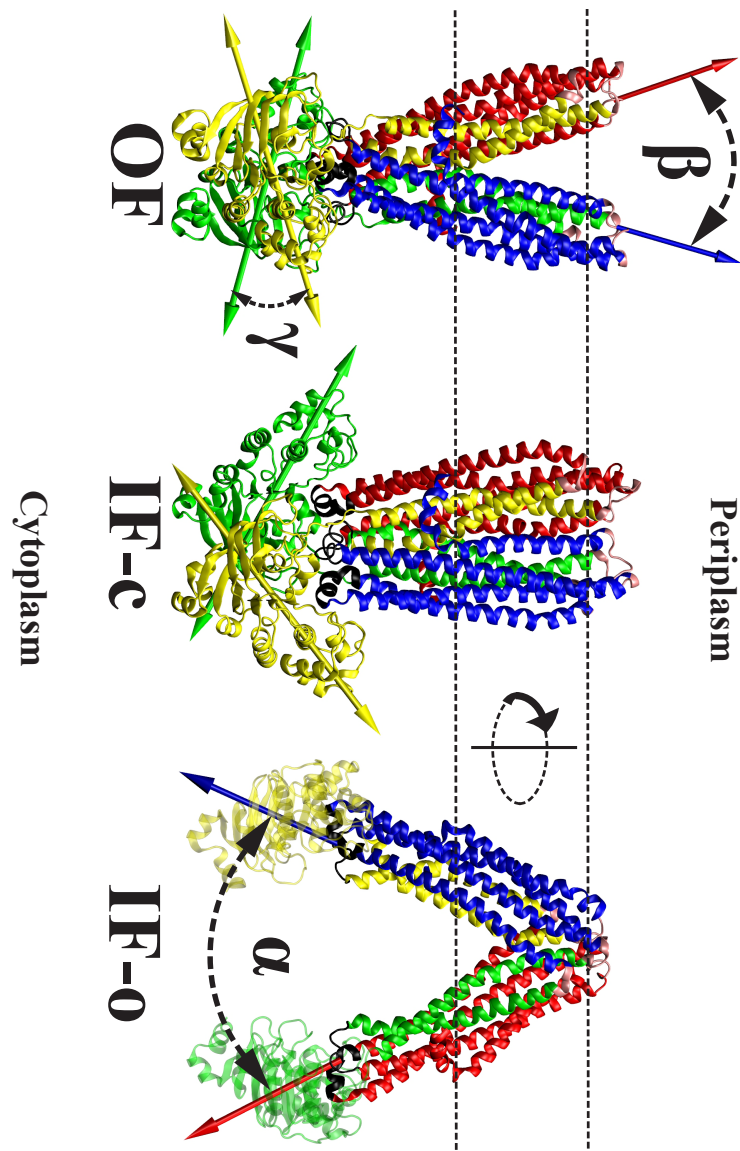
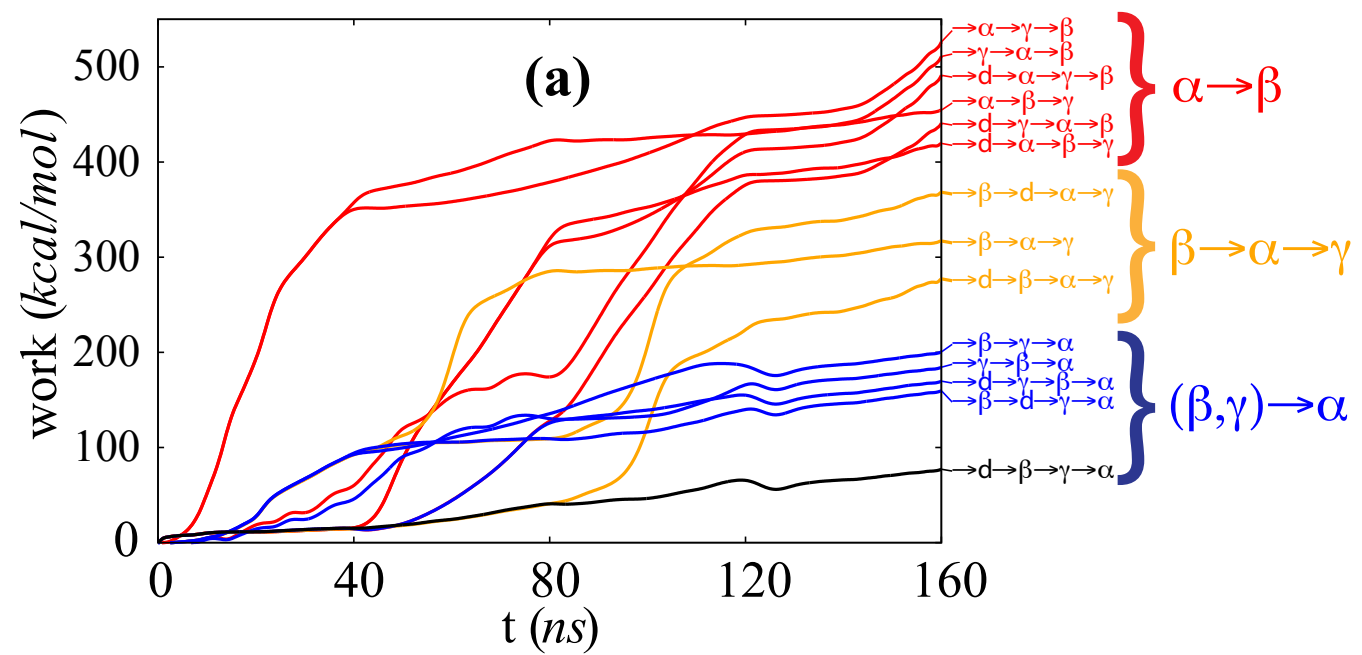


# Progressively Optimizing the Biasing Protocol/Collective Variable using non-Equilibrium Work as a Measure of the Path Quality



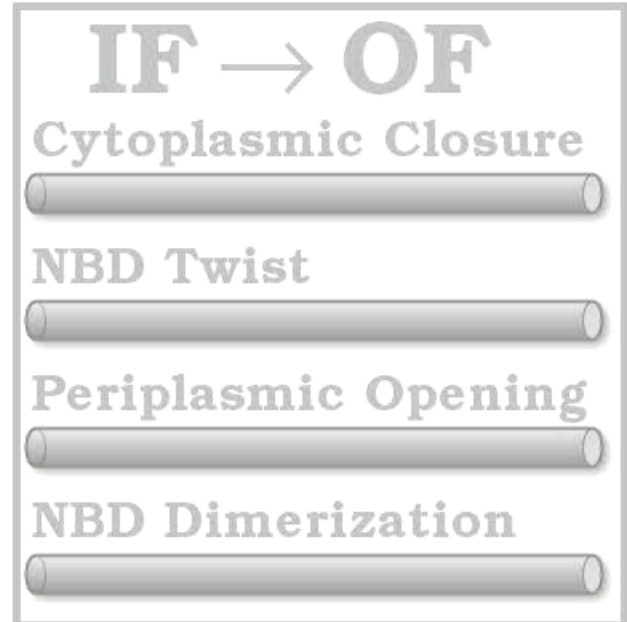
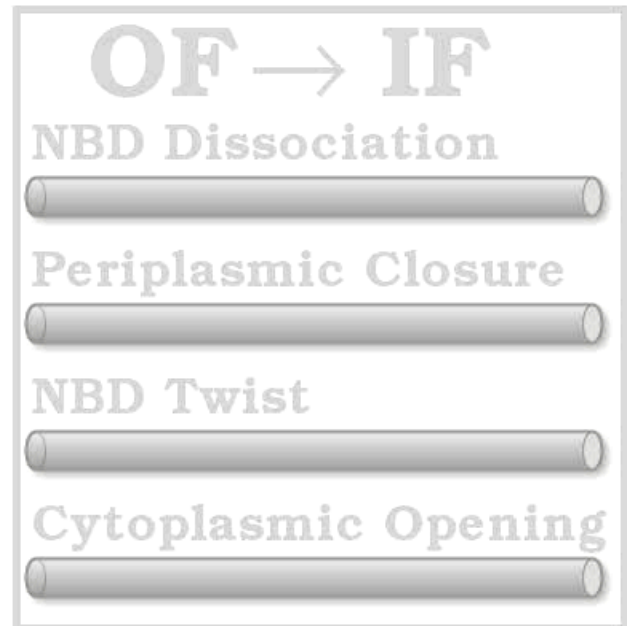
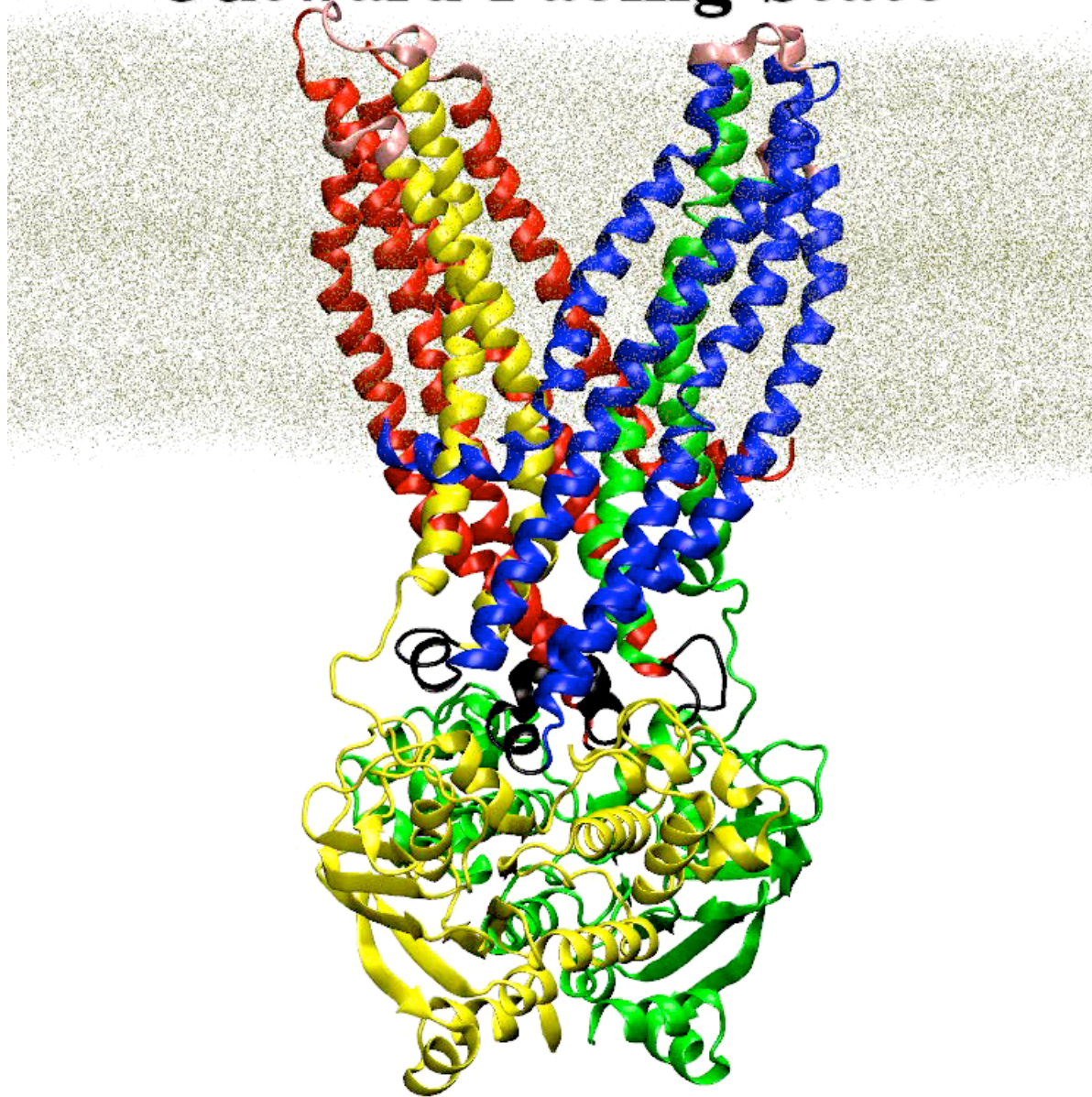
Example set taken from a subset of 20 ns biased simulations

# Mechanistic Insight From Transition Pathways in ABC exporters from Non-Equilibrium Simulations



M. Moradi and ET (2013) **PNAS**, 110:18916–18921.  
 M. Moradi and ET (2014) **JCTC**, 10: 2866–2880.

# Outward-Facing State



## NBD Doorknob Mechanism

M. Moradi and ET (2013) *PNAS*, 110:18916–18921.

# Describing a Complete Cycle (Adding Substrate) Requiring a Combination of **Multiple Collective Variables**

