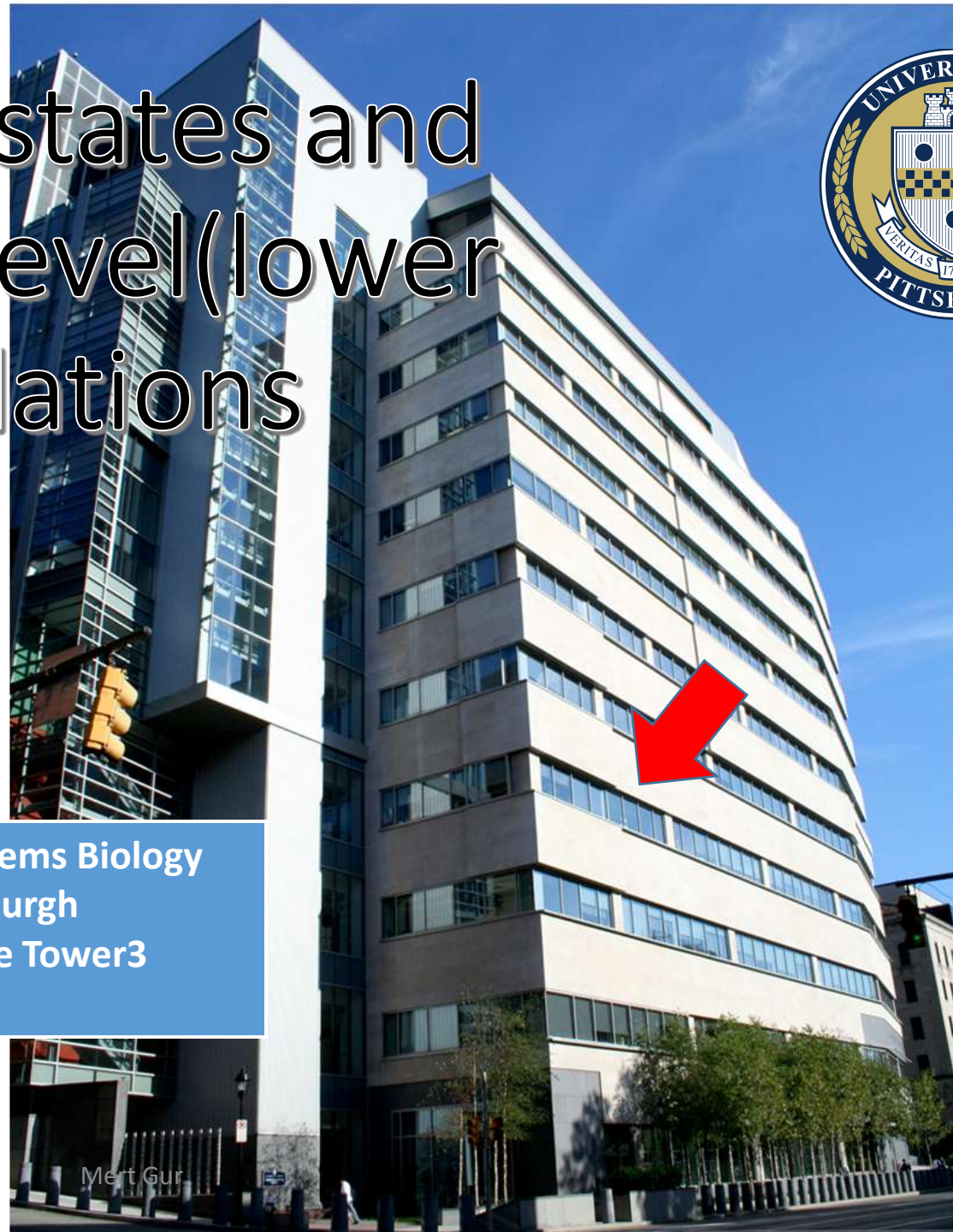


# Identification of states and rates for higher level (lower resolution) simulations



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## Introduction

- Neurotransmitter:sodium symporters (NSSs) are involved in many neurological disorders including epilepsy, depression, anxiety and Parkinson disease, and are targets of both clinical and illicit drugs, including stimulants such as cocaine and amphetamine and antidepressants such as fluoxetine.
- NSSs carry out their role by coupling the energetically unfavorable translocation of their substrate across the cell membrane to that of other ions, namely sodium.
- The sodium:leucine transporter from *Aquifex aeolicus* (LeuT), a bacterial NSS, has served as a model for NSSs due to its high-resolution crystal structures resolved in various functional states; It is widely used to predict/investigate the functional dynamics of the dopamine transporter



# Identification of States

**Sampled States and subStates in the Molecular Dynamics Simulations can be identified**

**Based on the conformations (via PCA)**

**Based on Binding States**

**Free Energy Surface**

# Part 1: Identification of States based on Conformations



## MD simulations of the LeuT

We have performed 20 $\mu$ s of conventional Molecular Dynamics simulations of the LeuT as a dimer and 1  $\mu$ s as a monomer.

run	conformer	LeuT	bound substrate/ions	duration ( $\mu$ s)
1	OF open	dimer	2 Na <sup>+</sup>	1.075
2			Ala, 2 Na <sup>+</sup>	0.55
3a-c			Leu, 2 Na <sup>+</sup>	(a) 1.94, (b) 1.51, (c)1.075
4	OF occluded		none	1.05
5			Ala, 2 Na <sup>+</sup>	2.63
6a-c			Leu, 2 Na <sup>+</sup>	(a) 3.365, (b) 3.03, (c)1.585
7a-b	IF open		none	(a) 1.07, (b) 1.065

### Anton simulations

Zomot, E., M. Gur, and I. Bahar. 2014. Microseconds simulations reveal a new sodium-binding site and the mechanism of sodium-coupled substrate uptake by LeuT. *Journal of Biological Chemistry* (Under revision).



## Identifying Principal Motions in the MD trajectories

A covariance matrix  $\mathbf{C}$  was constructed for the LeuT protomer using all conformers from MD simulations of the LeuT dimer and monomer as follows

$$\mathbf{C} = \left\langle \left( \mathbf{R} - \langle \mathbf{R} \rangle \right) \left( \mathbf{R} - \langle \mathbf{R} \rangle \right)^T \right\rangle$$

Here  $\mathbf{R}$  is the  $3N$ -dimensional configuration vector composed of the instantaneous  $C^\alpha$ -atom coordinates of the  $N$  residues of the protein.

Principal Components ( $\mathbf{PCs}$ ) are obtained by eigenvalue decomposition

$$\mathbf{C} = \sum_{i=1}^{3N} \sigma_i \mathbf{p}_i \mathbf{p}_i^T$$

Here  $\mathbf{p}_i$  is the  $i^{\text{th}}$  PC ( $i$ th eigenvector) and  $s_i$  is the corresponding variance (eigenvalue), ordered in descending order with respect to  $s_i$ .



## Free energy

The conformational space sampled by MD is divided into grids, which are suitably grouped into subspaces.  $N(\Phi_s)$  designates the number of conformers in each of these subspaces. The probability distribution function becomes;

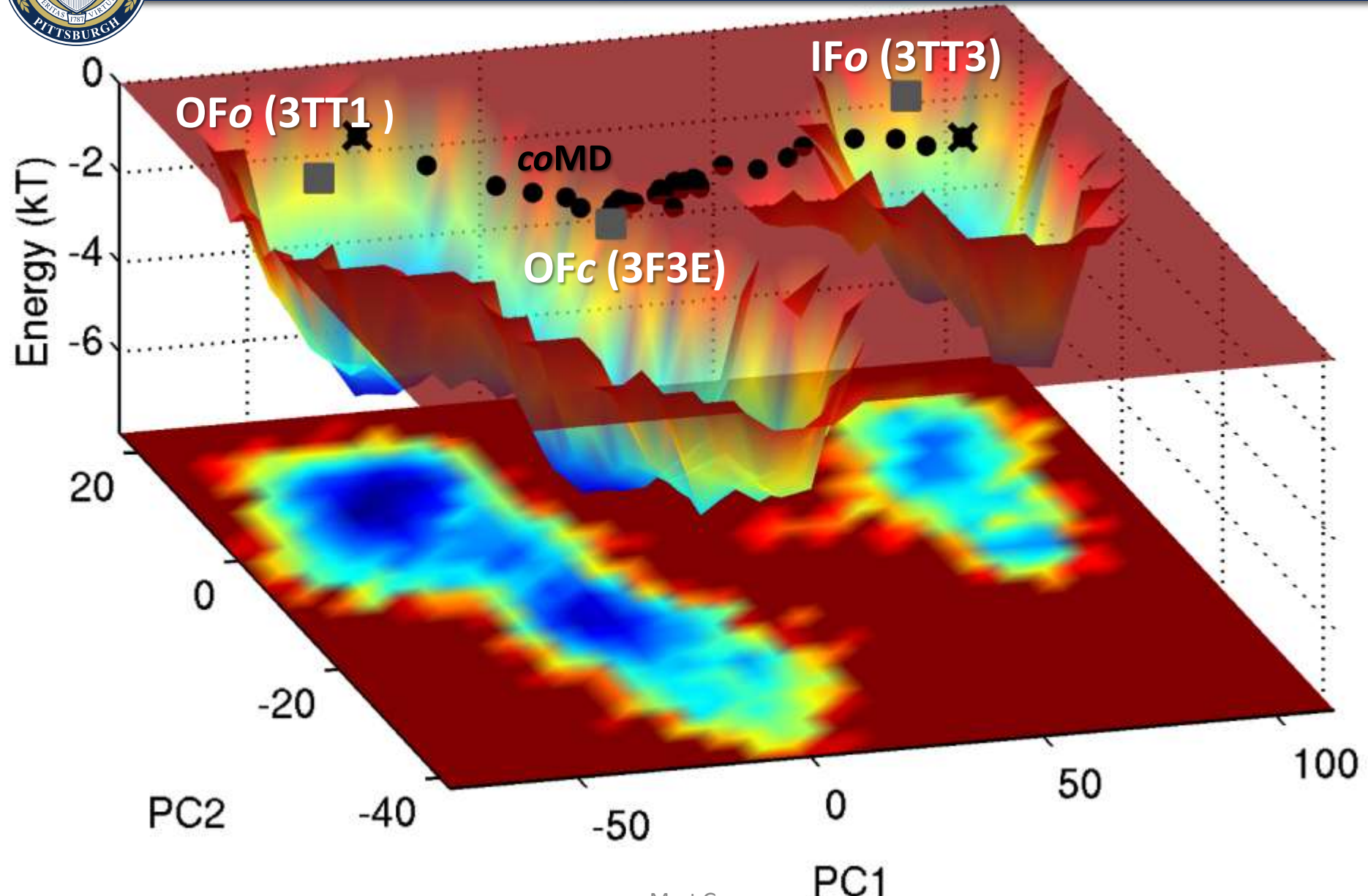
$$f(\mathbf{R}) = N(\Phi_s) / \sum_s N(\Phi_s)$$

The **free energy surface** is evaluated using this probability distribution function as

$$A(\mathbf{R}) = -kT \ln \{ f(\mathbf{R}) \} + ct$$



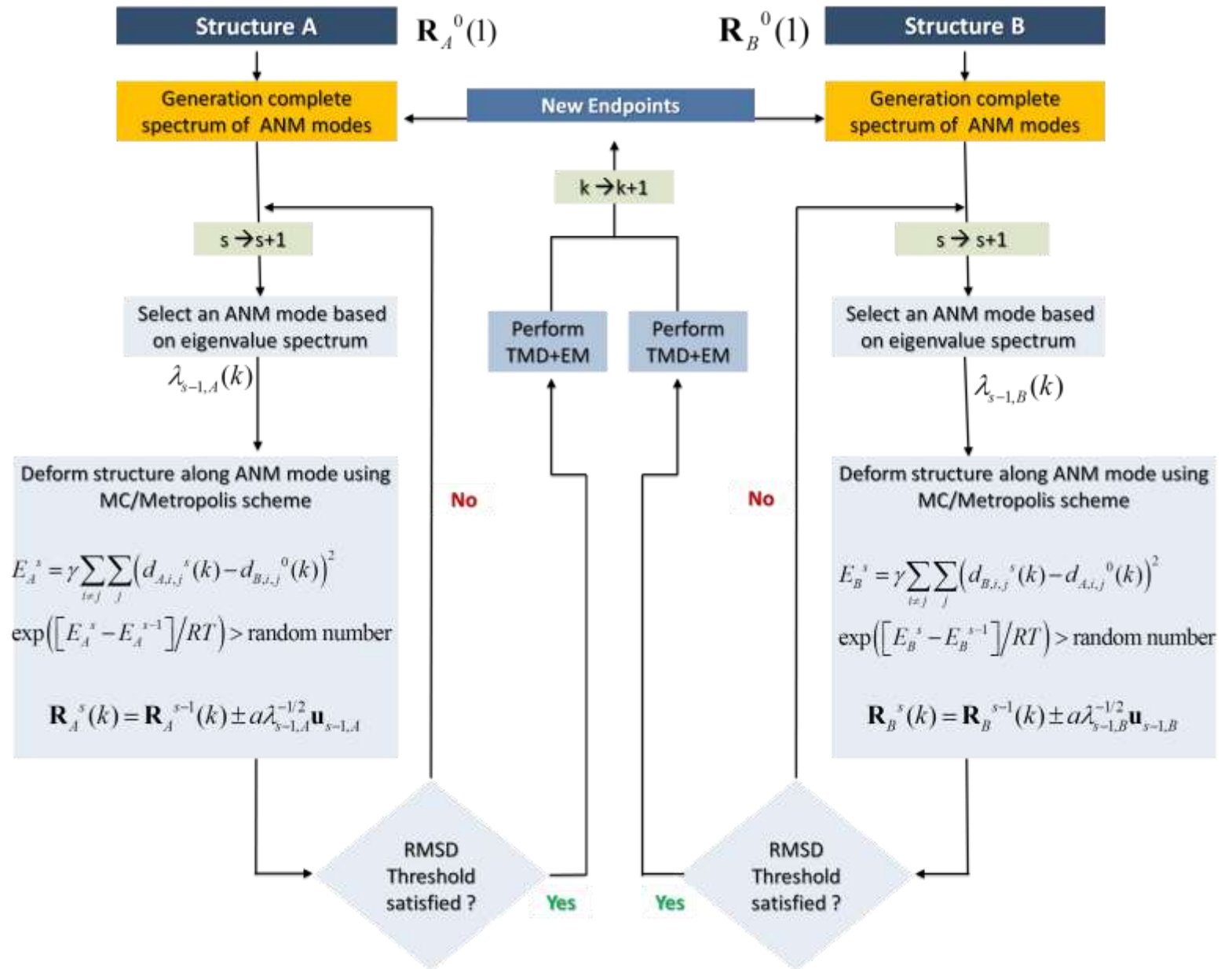
# Free energy surface along PCs







# coMD





# Incorporating coMD into ProDy

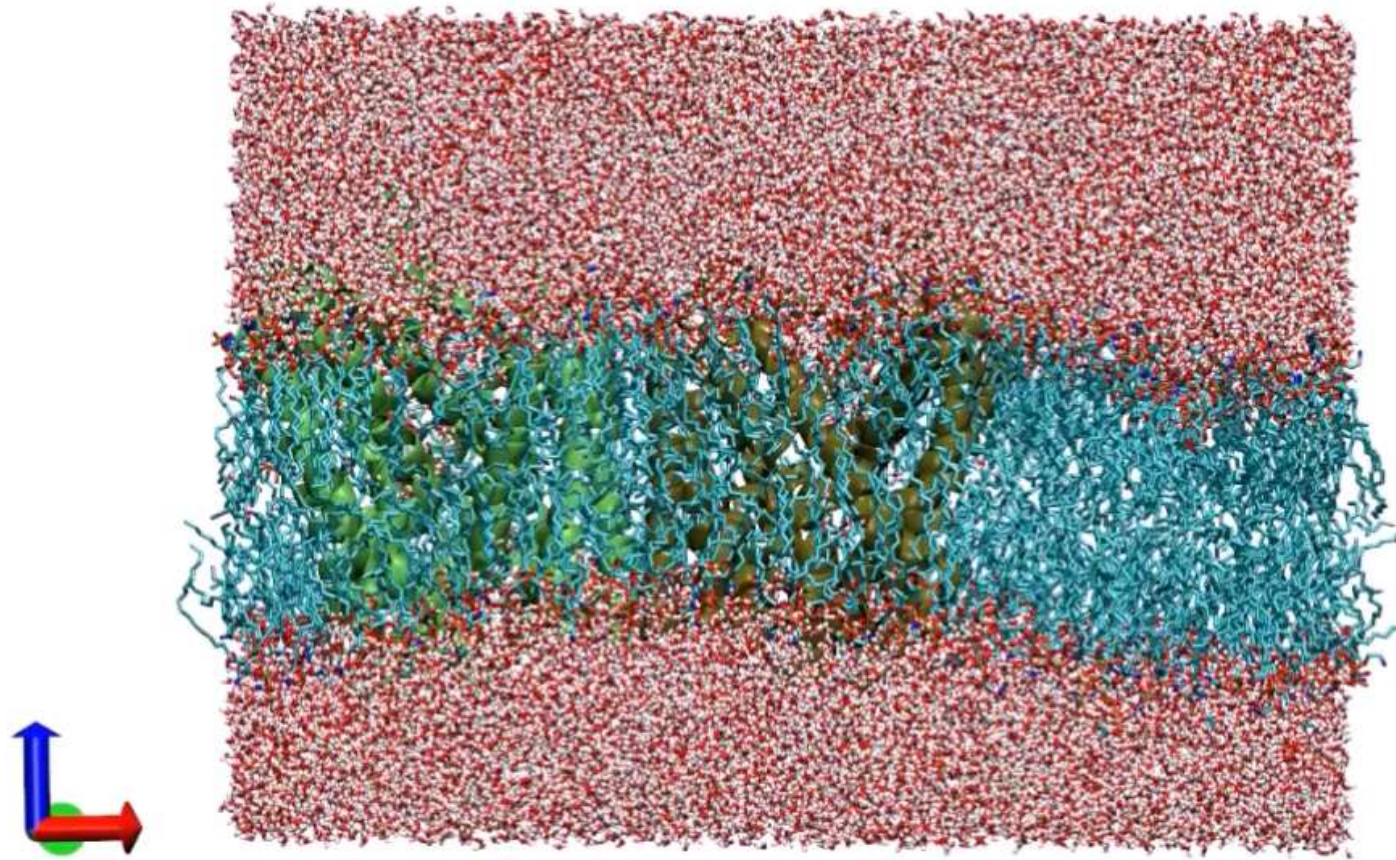
The screenshot displays the ProDy website interface. At the top, a banner features four protein structure models illustrating 'LID movement' and 'NMP movement'. Below this, the website header includes the ProDy logo and the text 'Protein Dynamics & Sequence Analysis'. The main content area is titled 'Collective Molecular' and provides a navigation menu with options like 'Introduction', 'Installation', 'How to Cite', 'Tutorial', and 'Credits'. A search bar is visible on the left side. The browser's address bar shows the URL 'prody.csb.pitt.edu/manual/about/citing.html'. The Windows taskbar at the bottom indicates the system time as 11:03 AM on 7/24/2014.

<http://www.csb.pitt.edu/comd/>

Bakan A,\* Dutta A,\* Mao W, Liu Y, Chennubhotla C, Lezon TR, Bahar I (2014) Evol and ProDy for Bridging Protein Sequence Evolution and Structural Dynamics

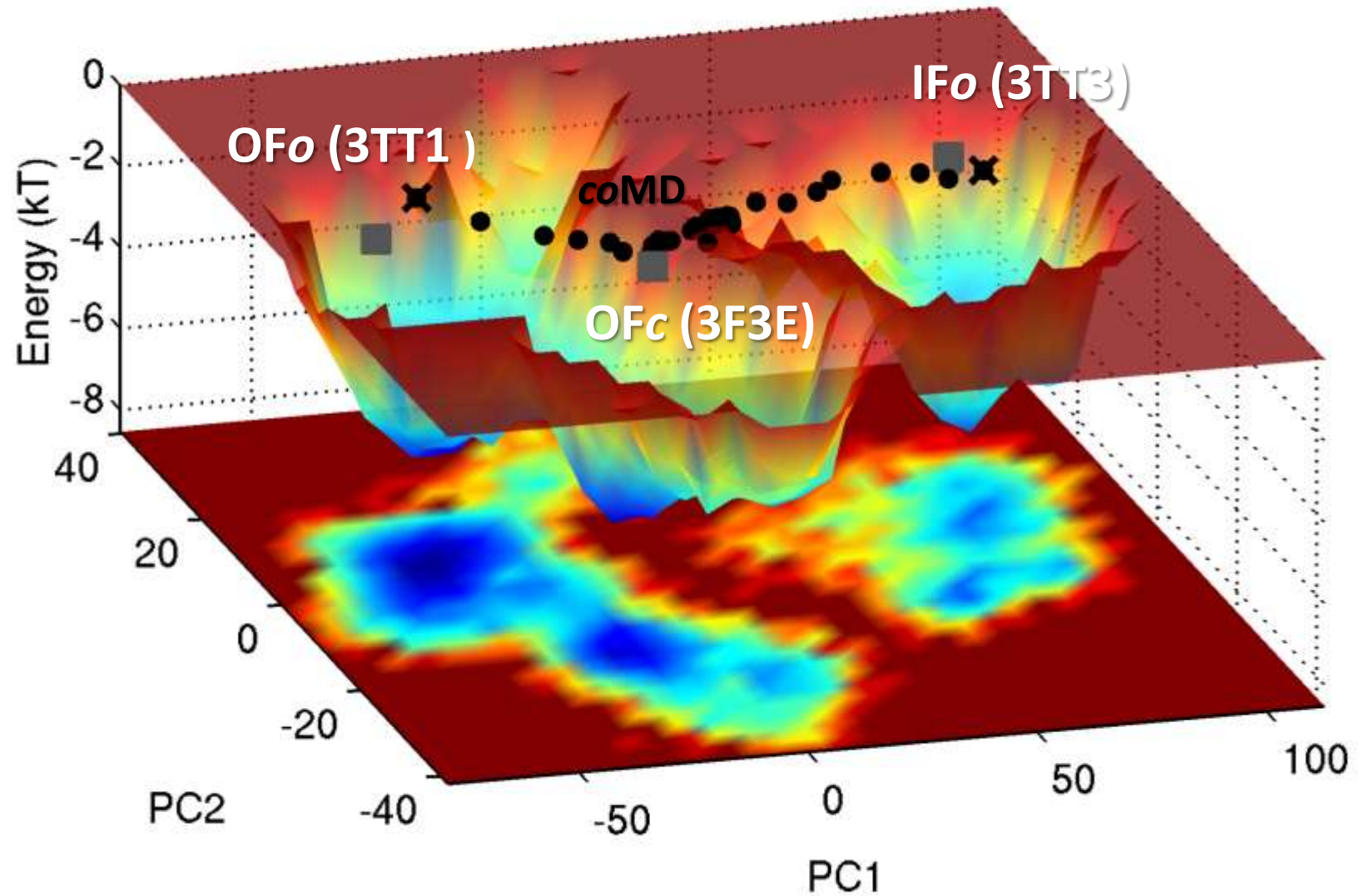


# Transition mechanism of the LeuT from coMD



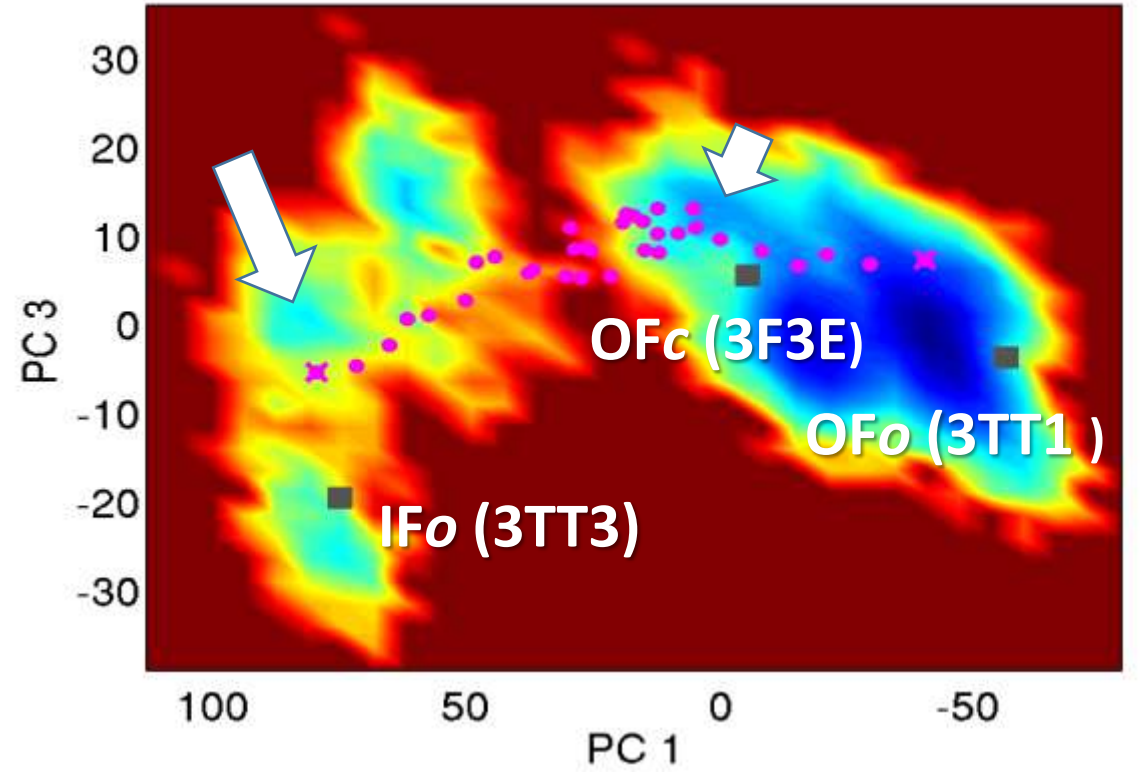
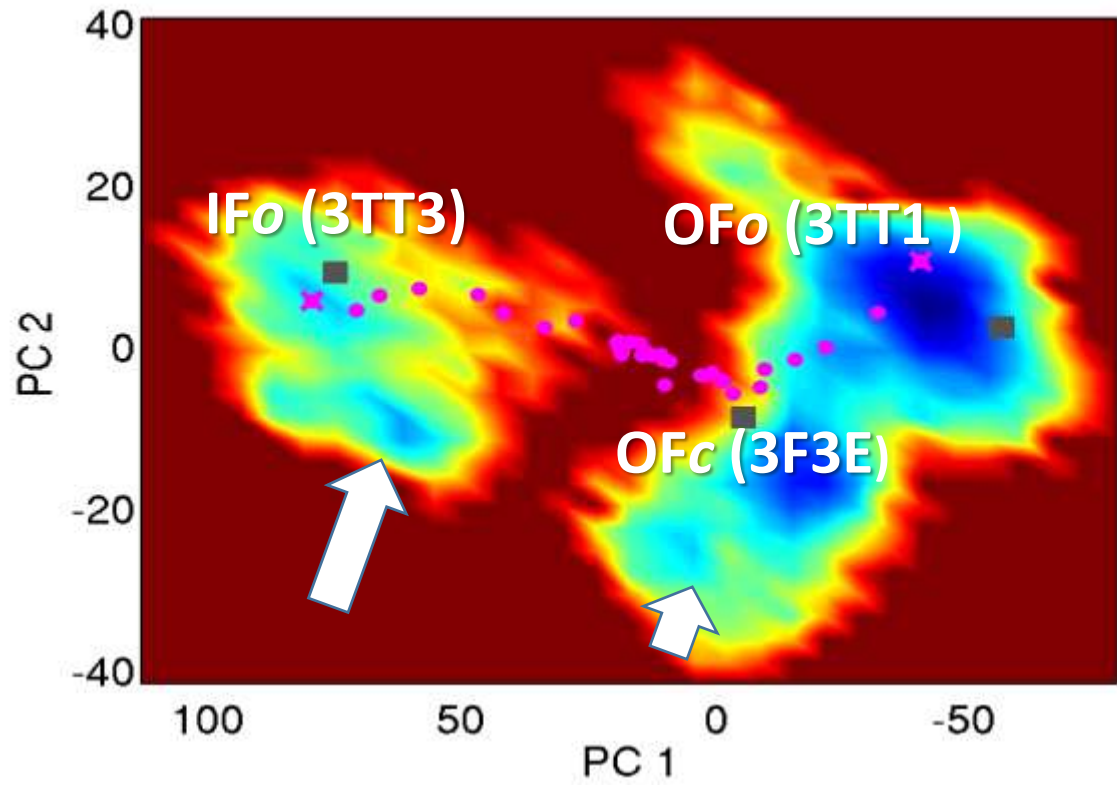


# Free energy surface along PCs





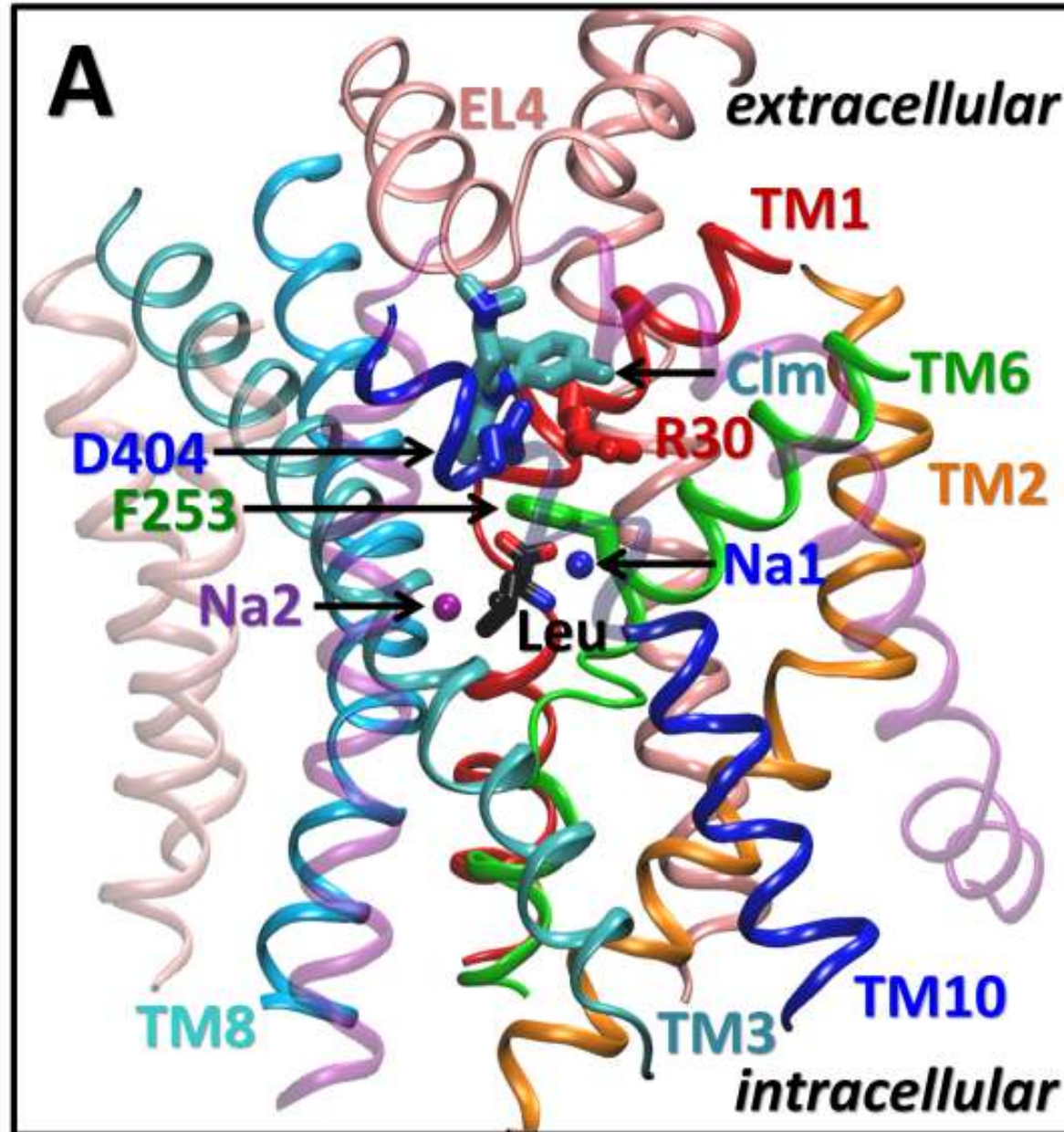
# Free energy surface along PCs



## **Part 2: Identification of States based on Binding States**



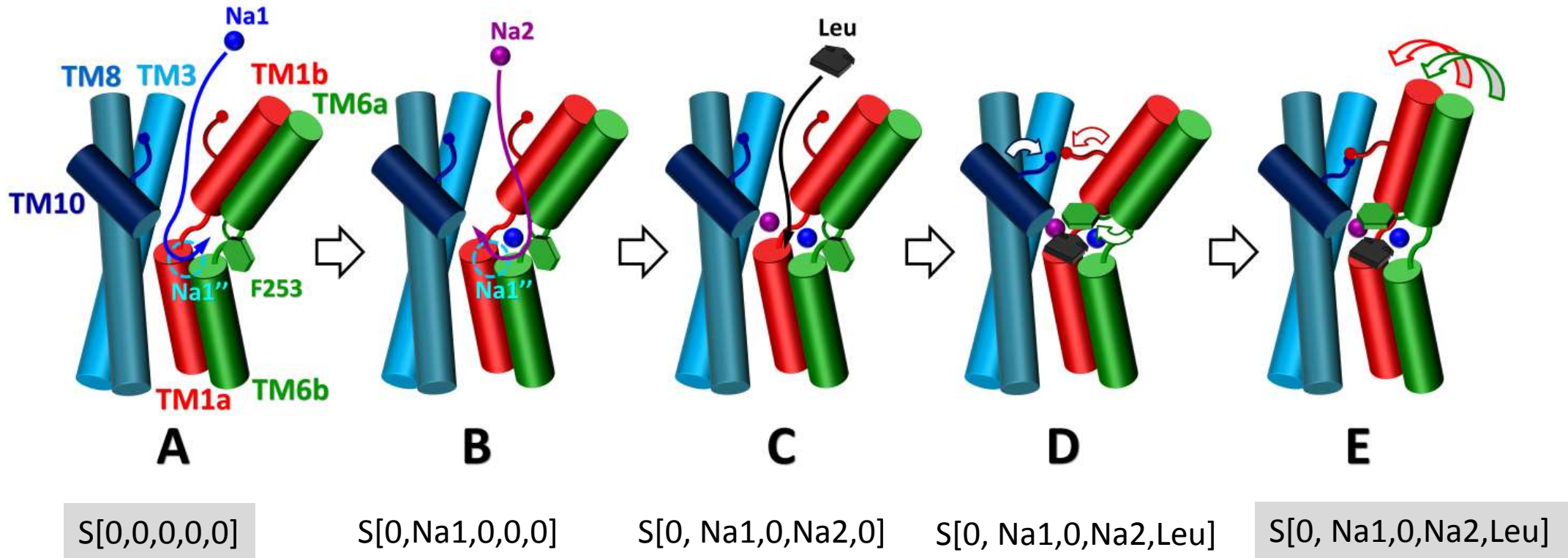
## Binding Sites



Zomot, E., M. Gur, and I. Bahar. 2014. Microseconds simulations reveal a new sodium-binding site and the mechanism of sodium-coupled substrate uptake by LeuT. *Journal of Biological Chemistry* (Under revision).



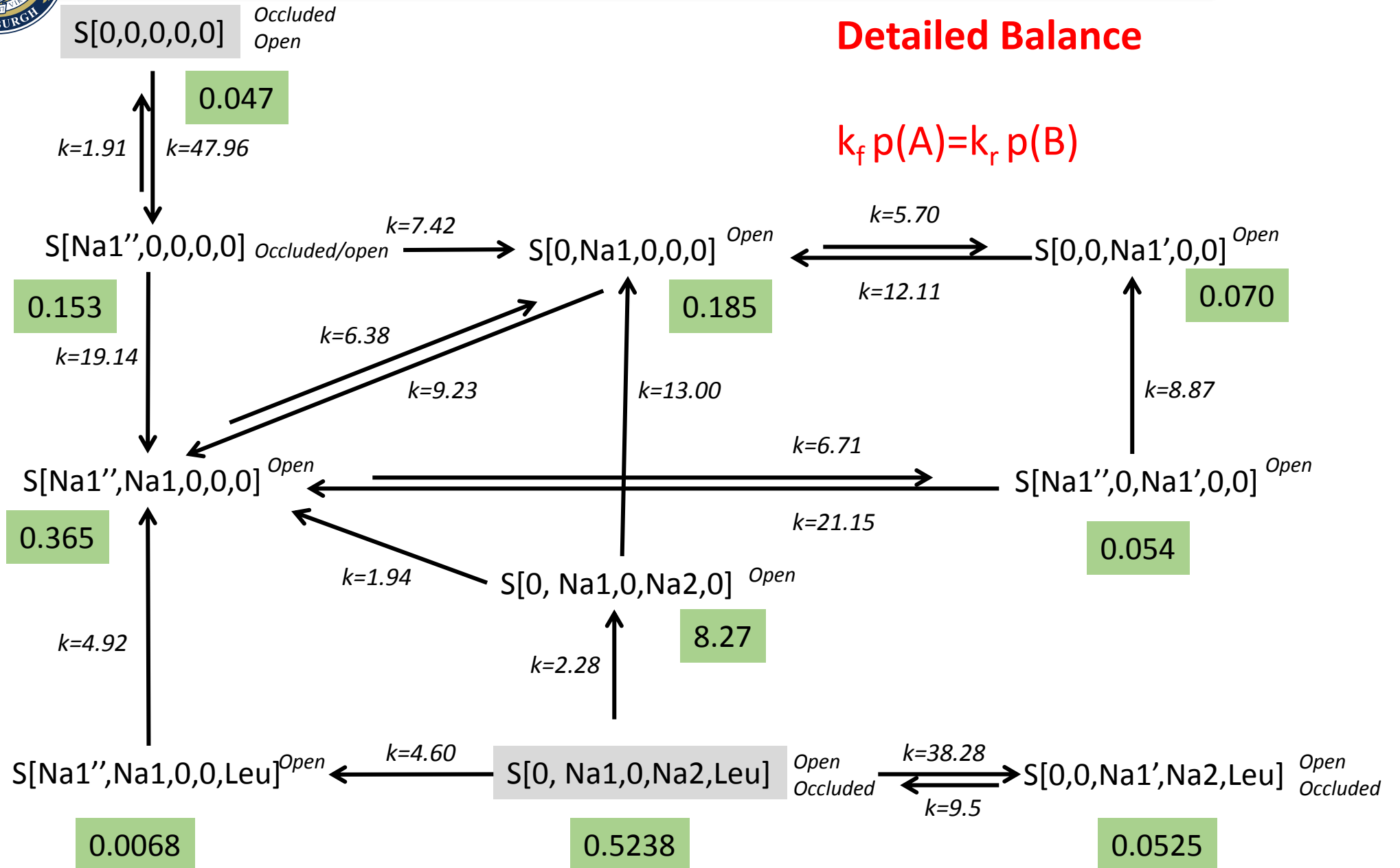
# Binding Sites







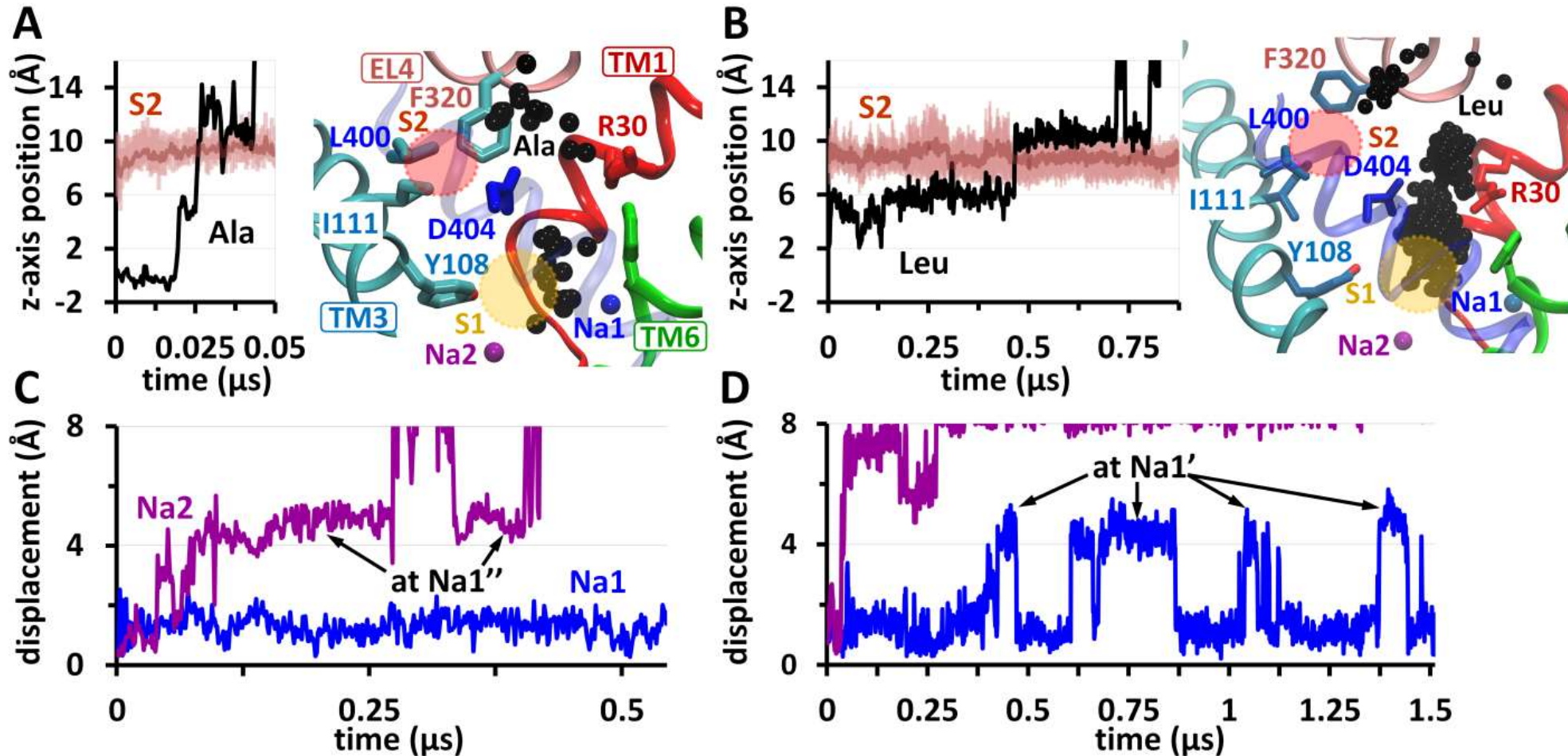
# Summary of all Transitions





# Summary of all Transitions

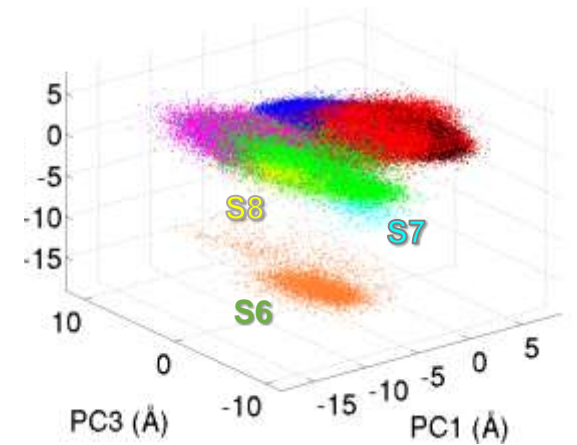
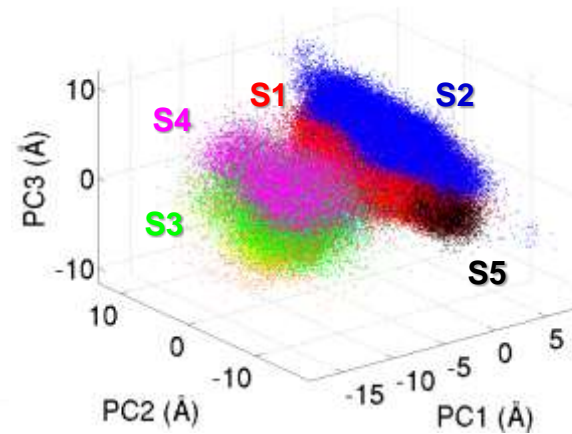
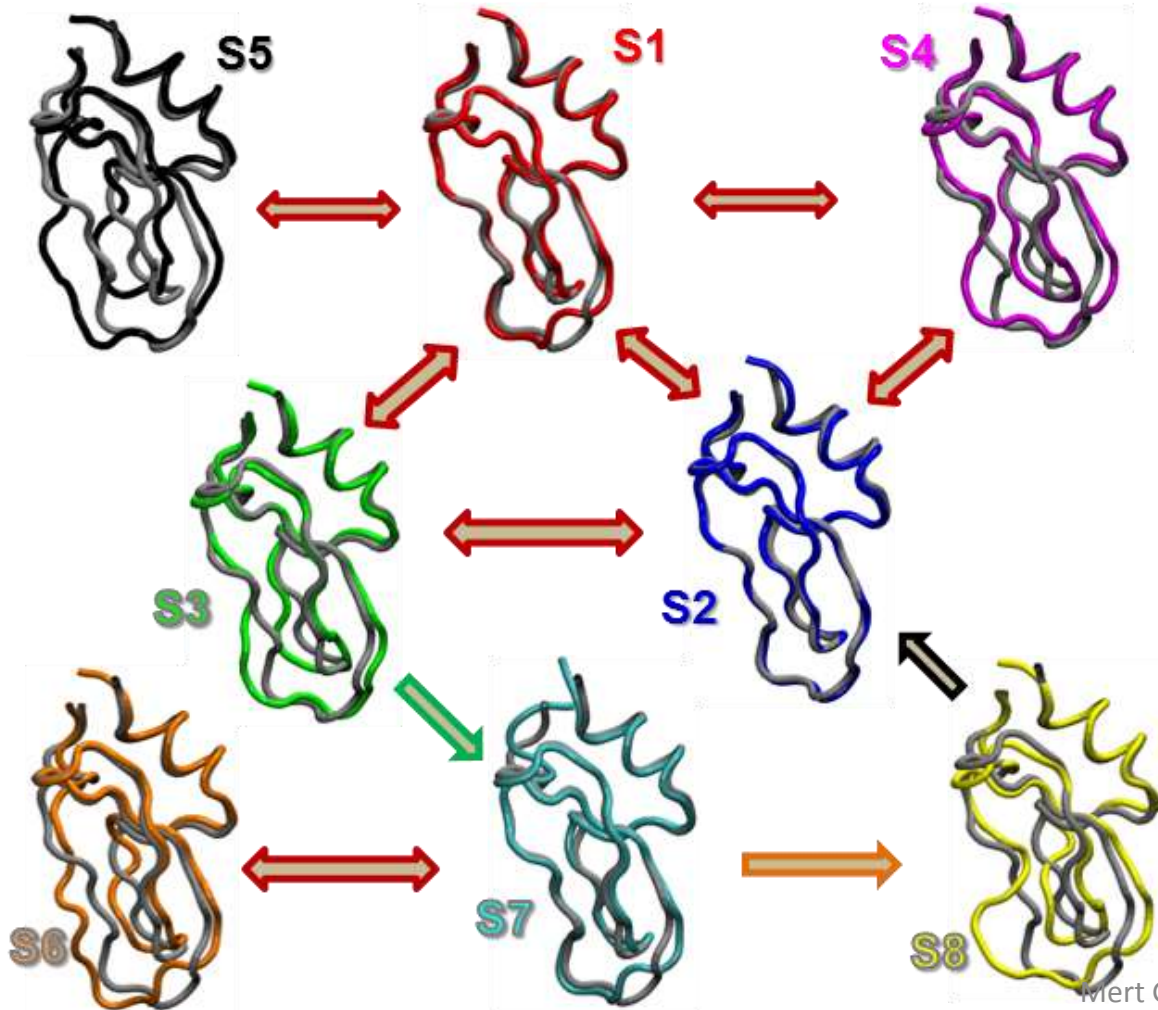
Longer simulations are needed for such a detailed mapping but only a few binding-states of Na<sup>+</sup> may be statistically/reliably quantified.





# Smaller Protein: BPTI

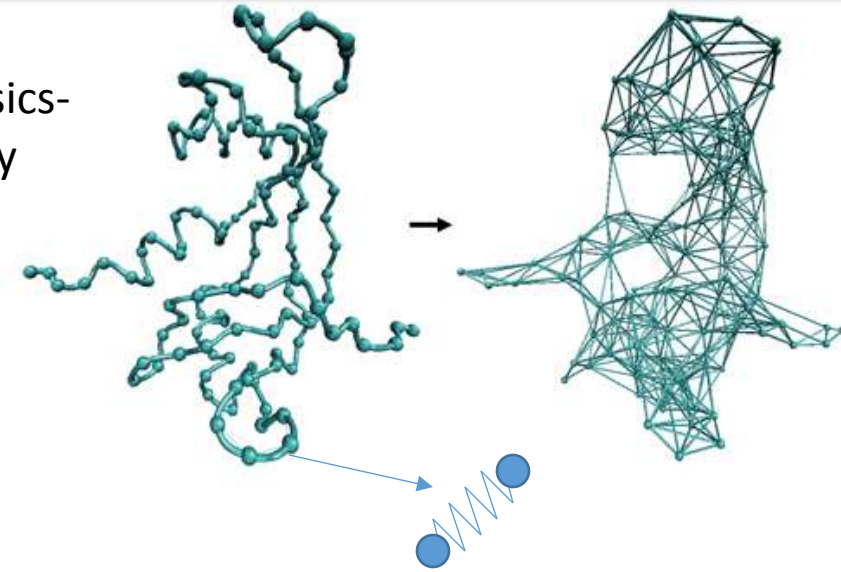
1.013 millisecond on the native state dynamics of bovine pancreatic trypsin inhibitor (BPTI).





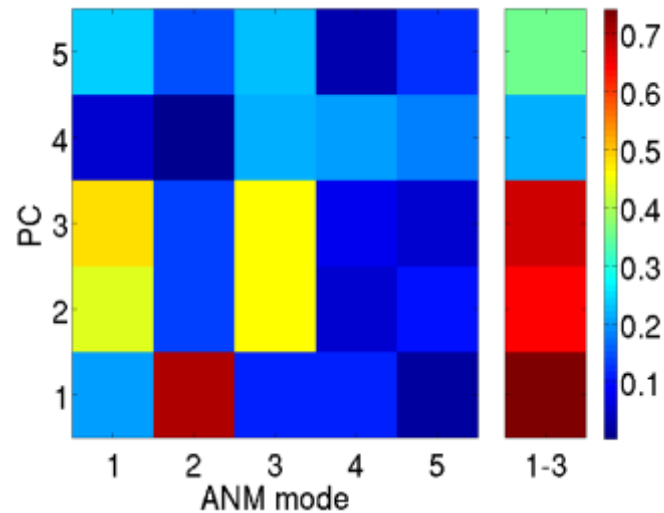
# Comparison with a simple physics based model

**Anisotropic Network Model (ANM)** is a simple physics-based model of beads and springs, which exclusively depends on inter-residue contact topology;

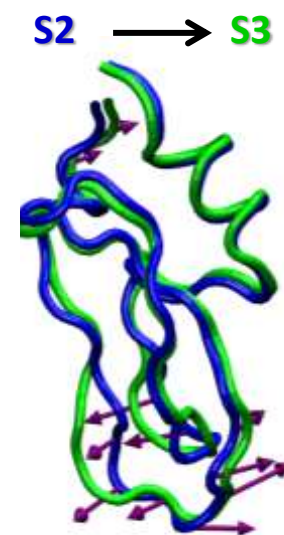
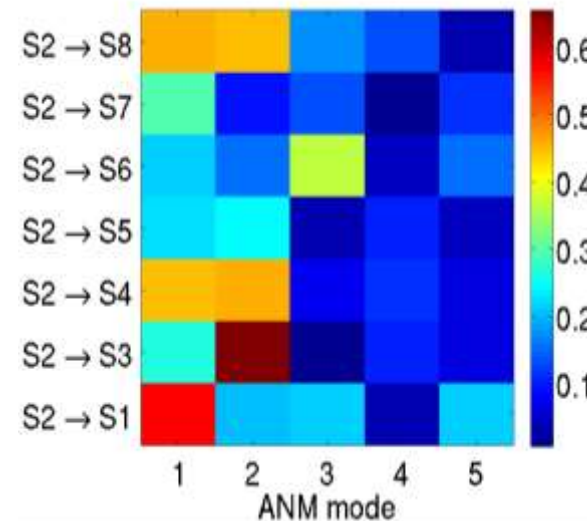
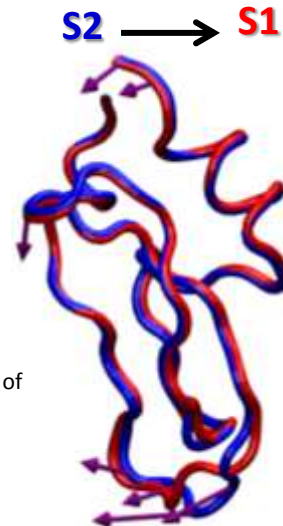


<http://mmb.pcb.ub.es/FlexServ/help/NMA.php>

**Global Motions from MD and ANM are similar**



**ANM modes predict transitions between substates**

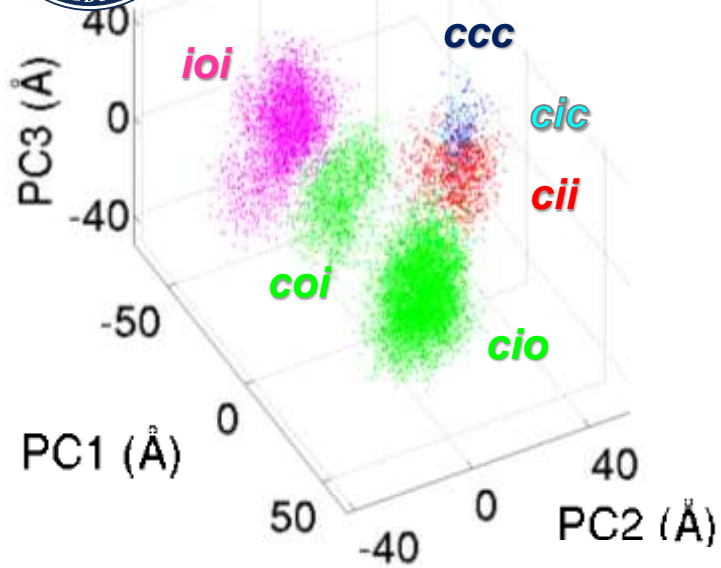


Atilgan, A. R., S. R. Durell, R. L. Jernigan, M. C. Demirel, O. Keskin, and I. Bahar. 2001. Anisotropy of fluctuation dynamics of proteins with an elastic network model. *Biophys. J* 80: 505-515.  
M. Gur, E. Zomot and I. Bahar. 2013. Global Motions Exhibited by Proteins in Micro- to Milliseconds Simulations Concur with Anisotropic Network Model Predictions . *J. Chem.Phys.* 139:121912

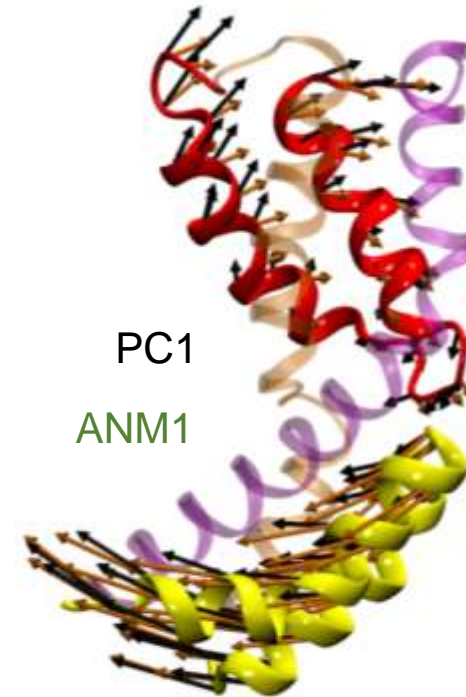
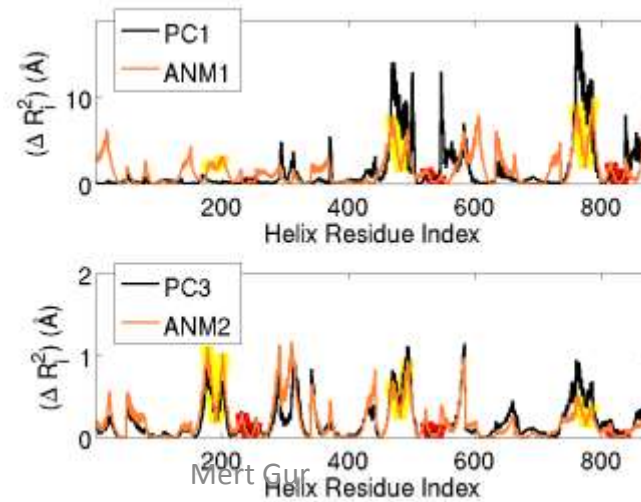
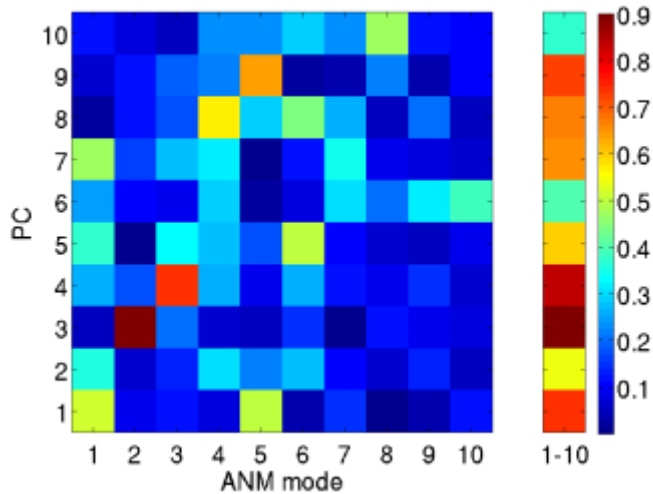


# Gating mechanism of GltPh can be mapped by a few ANM modes

Substates are characterized by the degree of opening of the binding site



Global Motions from MD and ANM exhibit strong overlaps





## Conclusion

- Molecular Dynamic simulations cannot provide unambiguous information on the complete conformational space and its energetics unless the simulations are performed for long time scales (e.g. milliseconds or longer), and even then, we obtain information on relatively localized events, not cooperative ones that involve entire multimeric structures.
- Results from simulations provide 'estimates' on accessible states and relative rates, along with insights into mechanisms, e.g. order of binding and unbinding events, relative rates of some of the steps along the transport cycle. Those binding or transport characteristics can be encoded into higher level simulations.
- There is a need to use hybrid methods (e.g. coMD that combine MD and ENM, WE, accelerated MD, ENMs) for accurate sampling of conformational space. The major challenge is then to recalibrate the results to extract quantitative information on transition rates and populations of substates