# **Employing Microsecond-Level Simulations of Membrane Proteins to Capture Their Millisecond-Level Behaviors Using Blue Waters**

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# **Outline**

- Using **molecular dynamics** (MD) to study protein **large-scale conformational changes**
- Is the so-called **unbiased MD** reliable?
- How can we use **biased MD** to study large-scale conformational changes?
- Developing **loosely-coupled multiple-copy** (LCMC) MD algorithms within NAMD
- Applications to proton-coupled oligopeptide transporter **GkPOT** and mechanosensitive channel of large conductance **MscL**

# **Large-Scale Conformational Changes in Membrane Transport Proteins**

• **Membrane transporters** rely on large-scale conformational changes between **inward-facing (IF)** and **outward-facing (OF)** states (**alternating access mechanism).**



• **Channels** may require large-scale conformational changes between their **open/active** and **closed/inactive** states.



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## **Large-Scale Conformational Changes in Membrane Transport Proteins**

- Large-scale conformational changes require **concerted motions of thousands of atoms** whose motions are coupled by direct or indirect/allosteric interactions.
- It typically takes **several to thousands of microseconds** for a process like those described above to take place.
- These conformational changes are typically triggered by certain **chemical/mechanical changes** in the protein/environment.





#### Lipid-Dependent Alternating Access Mechanism of a Bacterial **Multidrug ABC Exporter**

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### **Is the so-called unbiased MD reliable?**

### A Case Study: Proton-coupled Oligopeptide Transporters (POTs)



# **A Case Study: Proton-coupled Oligopeptide Transporters (POTs)**

**GkPOT** (PDB:4IKV, 1.9 Å) ~100,000 atoms Conventional unbiased MD simulations performed: **8 conditions (different protonation states, substrates)** × **400 ns** × **2 repeats**



K Immadisetty, J Hettige, and M Moradi, What Can and Cannot Be Learned from Molecular Dynamics Simulations of Bacterial Proton-Coupled Oligopeptide Transporter GkPOT? J. Phys. Chem. B, **121**[:3644-3656, 2017.](http://dx.doi.org/10.1021/acs.jpcb.6b09733)

#### **Monitoring Global Conformational Changes**



#### **Reproducibility Check**



#### **Reproducibility Check**



Although a common practice, statements made about millisecond-level biomolecular events based on **unbiased** sub-microsecond level simulations may not be reliable.

## **How can we use biased MD to study large-scale conformational changes?**



# **How can we use biased MD to study large-scale conformational changes?**





**Path-Finding Algorithms and Free Energy Calculations Based on Loosely-Coupled Multiple-Copy (LCMC) MD**

Path-finding algorithms:

**e.g., string method (SM or SMwST)**

- Start from an initial string of N images  $(\zeta_i)$
- Restrain M copies of each image for time  $\Delta t$

$$
U_i(\xi) = \frac{1}{2}k(\xi - \zeta_i)^2
$$

- Release the restraints and run for time  $\Delta t'$
- New string  $(\zeta_i)$  is determined from  $\langle \xi \rangle_i$ 's
- Iterate until converged
- Free energy calculations:

**e.g., umbrella sampling (US or BEUS):**

 $-$  Bias one or more (e.g., M) copies:  $U_i(\boldsymbol{\xi})=$ 1  $\frac{1}{2} k(\xi - \zeta_i)^2$ 

– Use a reweighting scheme to unbias the data:  $e^{-\beta E_i} = \left(\begin{array}{cc} e^{-\beta U_i(\xi^t)} & e^{-\beta U_i(\xi^t)} \end{array}\right)$ 

Shirts, Chodera, JCP*, 129*, 124105 (2008)



 $n_j e^{-\beta(U_j(\xi^t) - F_j)}$ 

*j*

∑

all samples

## **Riemannian Reformulation**

• Riemannian reformulation of path-finding algorithms and free energy calculations methods such as SMwST/BEUS provides solutions for the minimum free energy path and its free energy that are **invariant under coordinate transformation.**



• The Riemannian formulation allows for developing **more robust** free energy calculation methods and path-finding algorithms (due to the **"invariance"** feature).

Fakharzadeh & Moradi, *Effective Riemannian diffusion model for conformational dynamics of biomolecular systems*. **J Phys Chem Lett.** 2016;7(24):4980-4987.



Communications , 185, 908, 2014.



Iteration  $t+\delta t$ 

*Iteration*  $t$ - $\delta t$ 

Iteration t



pH-induced Activation of an Engineered Mechanosensitive Channel of Large Conductance (MscL)



PDB: 2OAR

TM Helices

MD Model









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