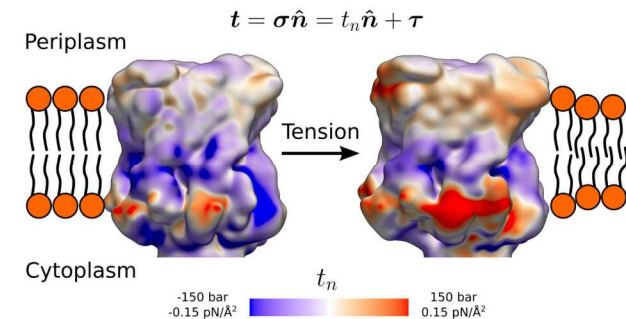
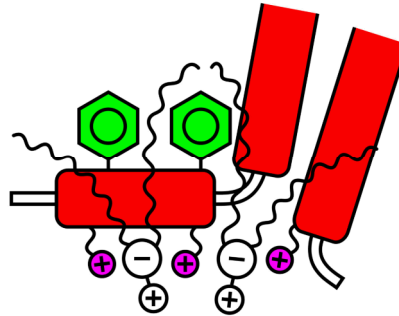
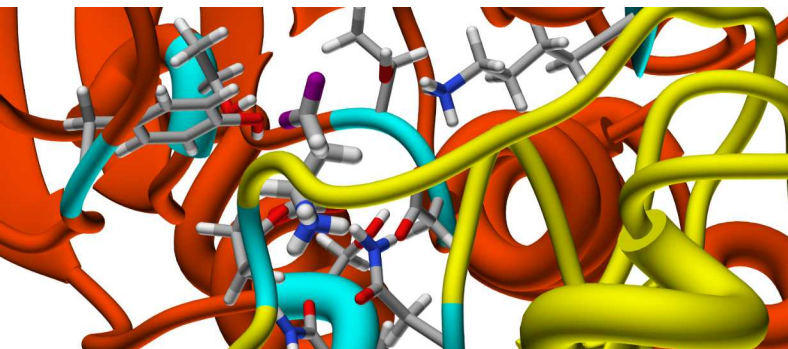


Exceptional service in the national interest



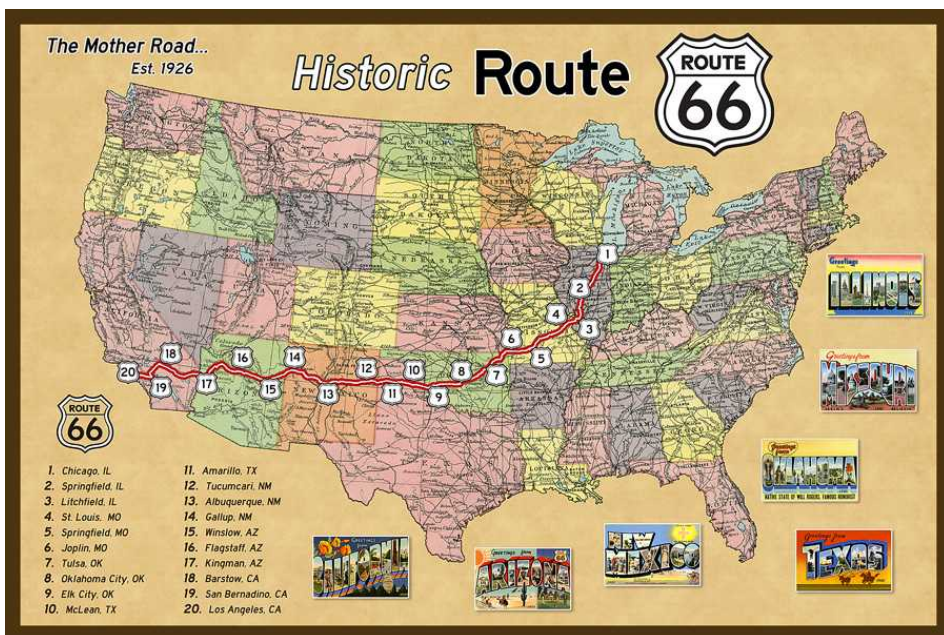
Computational “microscopy”: Probing sub-cellular function with molecular modeling

Juan Vanegas

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Center for Biological and Material Sciences

Sandia National Laboratories



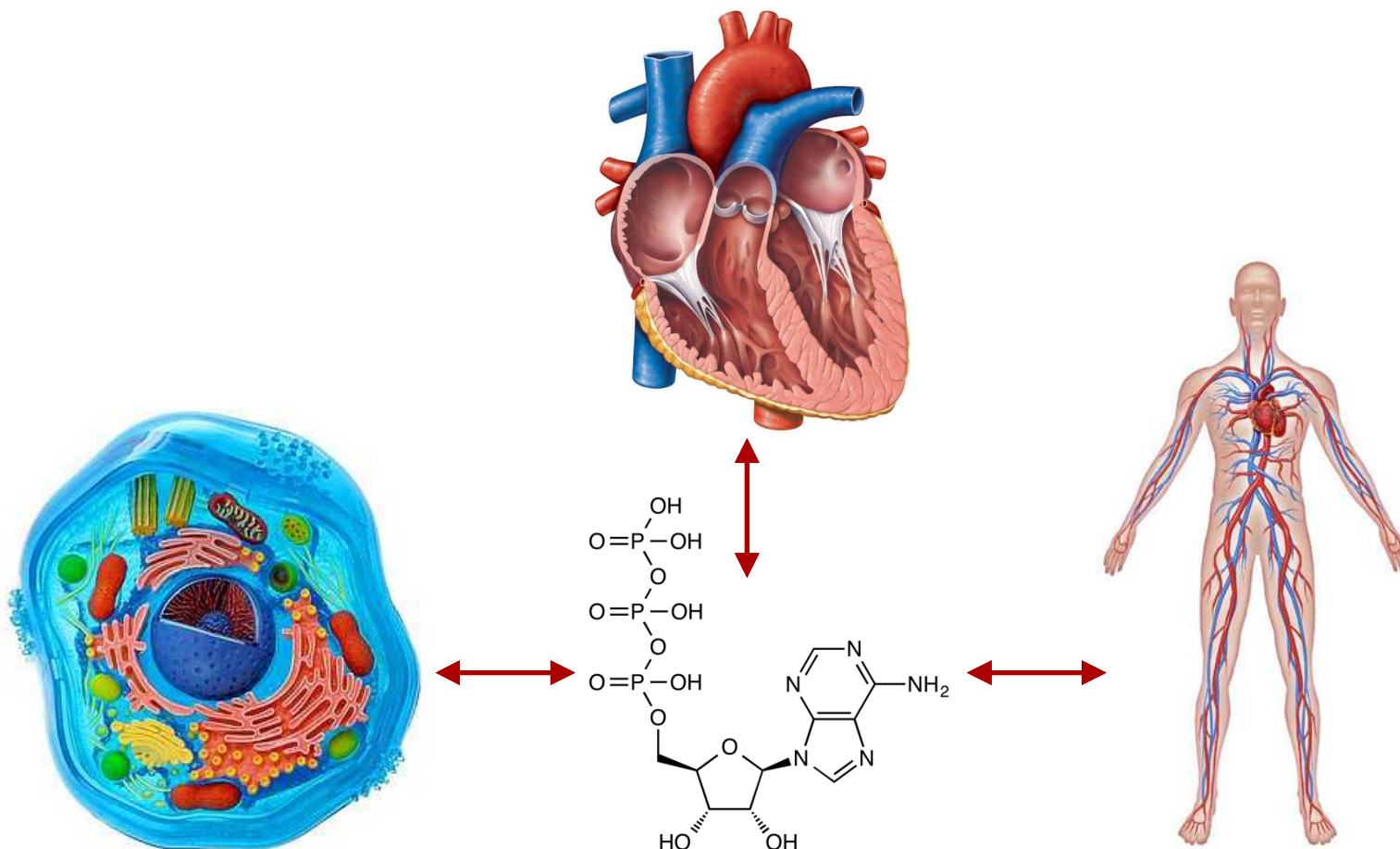
Sandia - New Mexico



Sandia - California

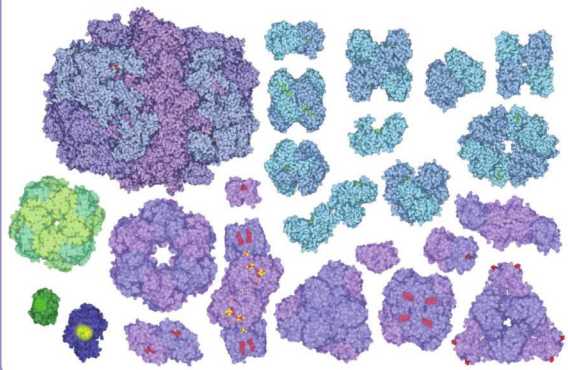
From molecules to organisms

- Biological function across the scales is intimately connected to the interaction of atoms and molecules at the nm level

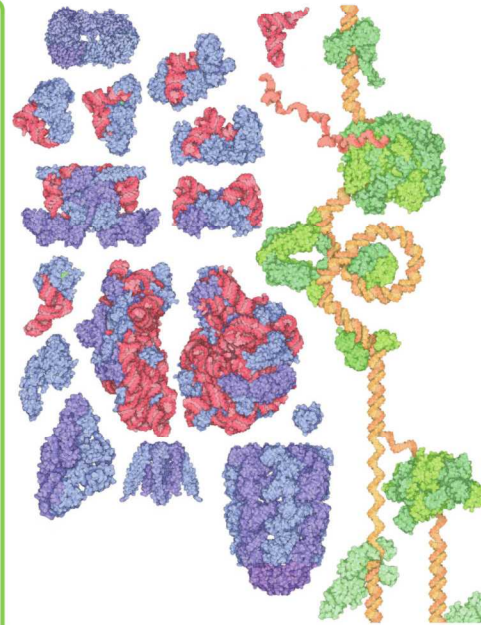


Molecular machines

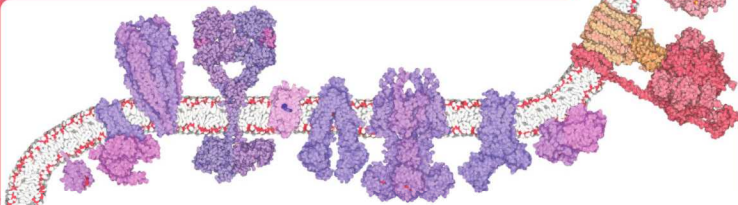
Enzymes



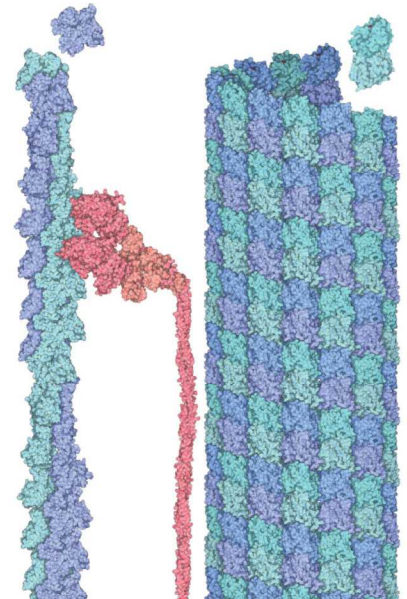
Protein synthesis -
nucleic acid processing



Lipid membrane -
membrane proteins



Cytoskeletal -
Structural proteins



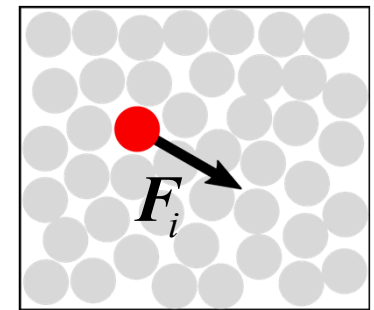
Computational “microscopy”

- How can we probe structure-function relationships in molecular systems with computational models?
- Molecular dynamics (MD) simulations

- Classical trajectories of interacting point particles

$$\mathbf{F}_i = m_i \ddot{\mathbf{r}}_i = -\nabla_{\mathbf{r}_i} V(\mathbf{r}_1, \dots, \mathbf{r}_N)$$

$$\mathbf{r}_i(t + \Delta t) = 2\mathbf{r}(t) - \mathbf{r}(t - \Delta t) + \ddot{\mathbf{r}}(t)\Delta t^2 + O(\Delta t^4)$$



- Interaction potentials

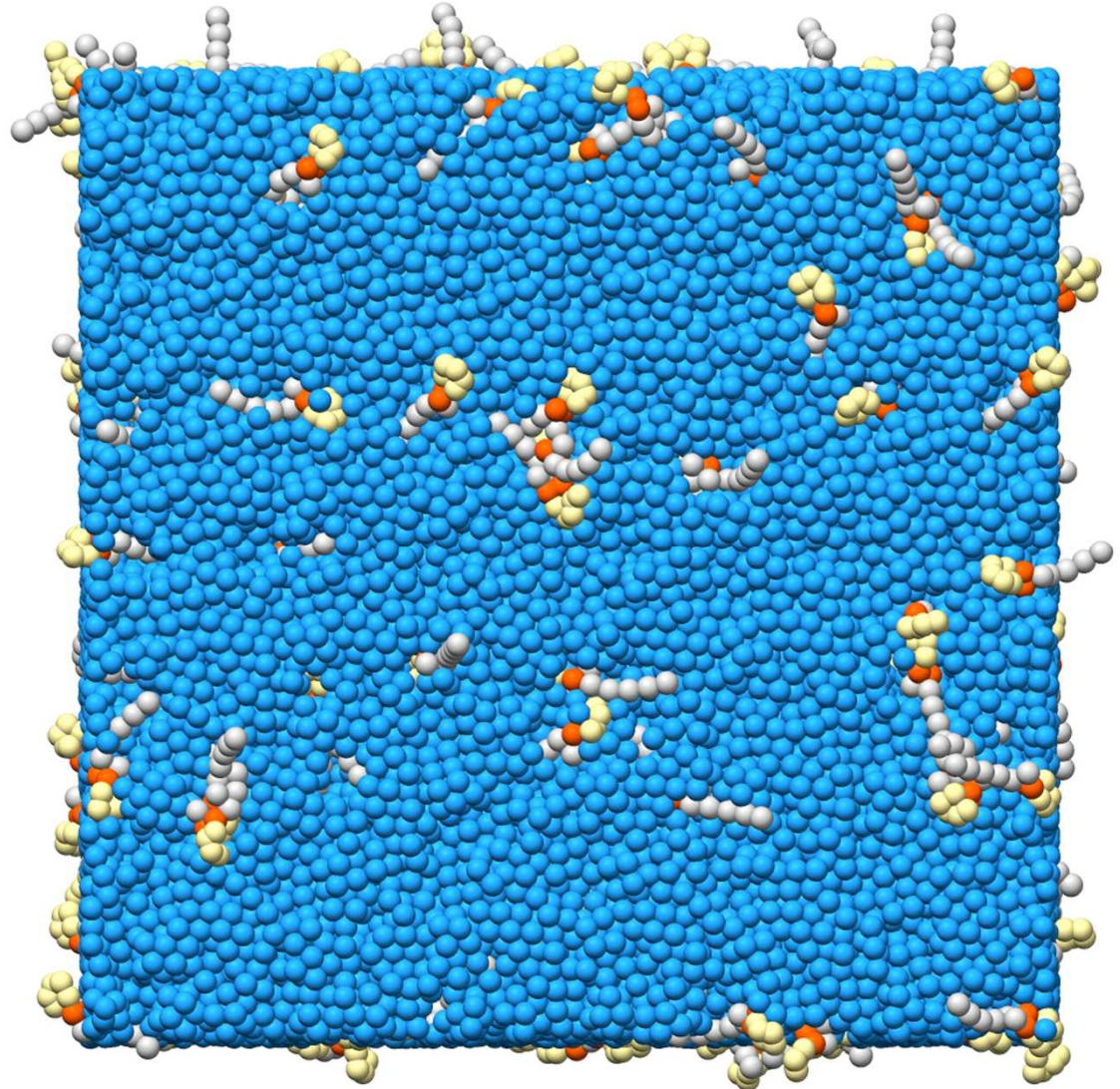
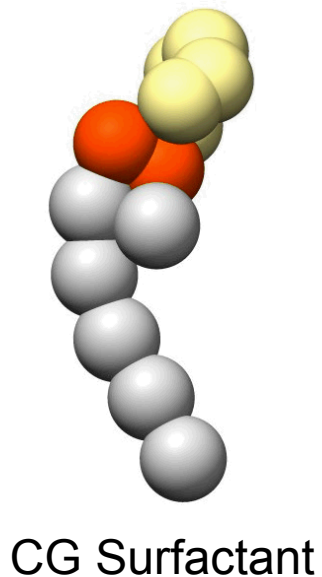
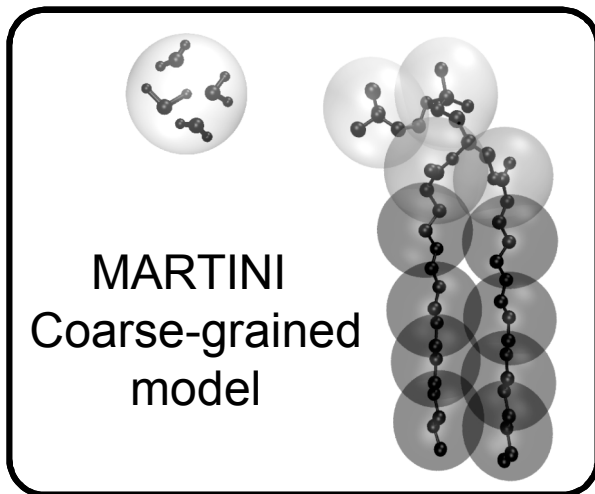
$$V(\mathbf{r}_1, \dots, \mathbf{r}_N) = V_{\text{VdW}} + V_{\text{Coul}} + V_{\text{bonds}} + V_{\text{angles}} + V_{\text{torsions}} + \dots$$

$$\sum_{i=1}^N \sum_{j=i+1}^N \left(4\epsilon_{ij} \left[\left(\frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left(\frac{\sigma_{ij}}{r_{ij}} \right)^6 \right] + \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}} \right)$$

Red arrows point from the terms in the potential energy equation to the corresponding terms in the expanded equation below:

- V_{VdW} points to the $\left(\frac{\sigma_{ij}}{r_{ij}} \right)^{12}$ and $\left(\frac{\sigma_{ij}}{r_{ij}} \right)^6$ terms.
- V_{Coul} points to the $\frac{q_i q_j}{4\pi\epsilon_0 r_{ij}}$ term.
- V_{bonds} points to the $\sum_{\text{bonds}} \frac{k_i}{2} (l_i - l_{i,0})^2$ term.
- V_{angles} points to the $\sum_{\text{angles}} \frac{u_i}{2} (\theta_i - \theta_{i,0})^2$ term.

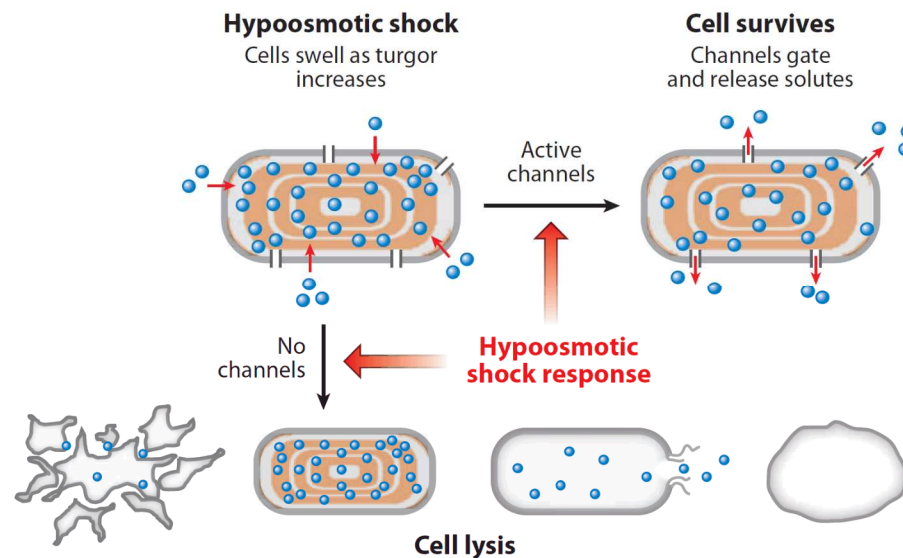
MD in action: Surfactant self-assembly



Mechanical signal transduction in the bacterial MscL channel

Mechanosensation in biology

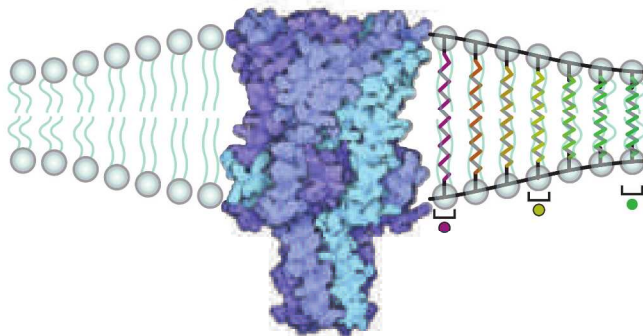
- Conversion of external/mechanical stimuli into electrochemical signals
 - Sensing touch, hearing (vibrations), movement (balance)
 - Sensing gravity (gravitropism)
 - Sensing changes in cell volume/shape (growth and development)
 - Vascular pressure control
 - Osmotic regulation



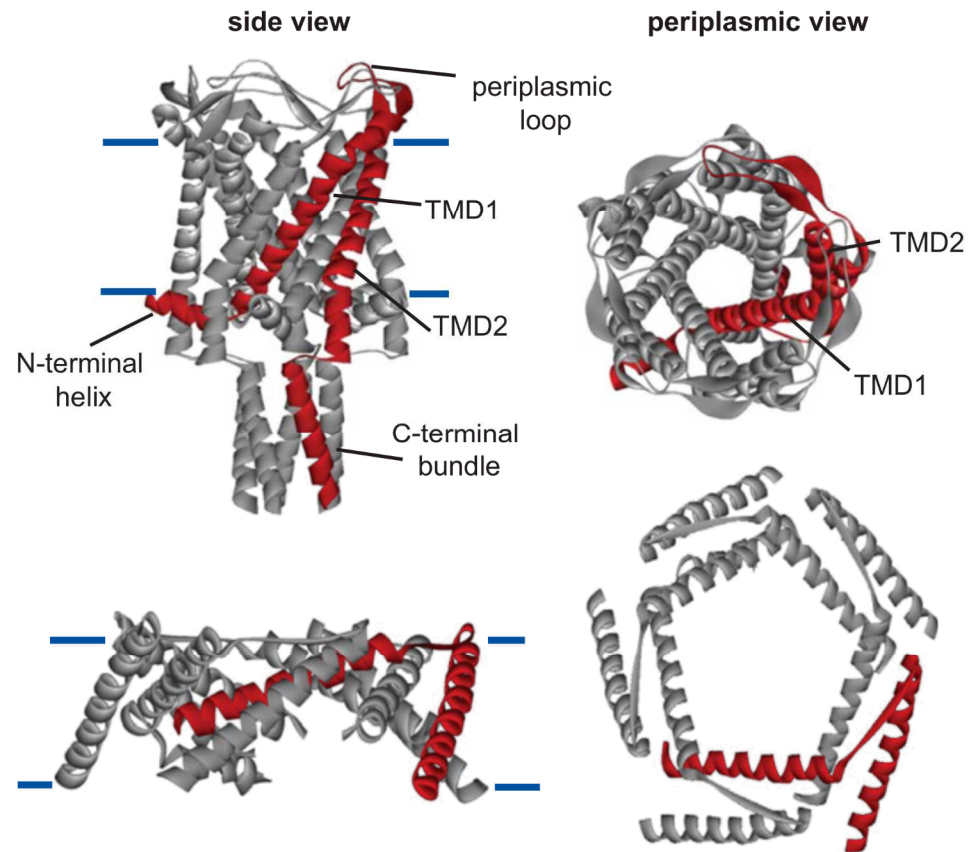
Naismith & Booth. *Annu. Rev. Biophys.* 41, 157–77 (2012)

Bacterial MscL channel

- Mechanosensitive channel of large conductance
 - Unselective channel with large opening – cell's last resort before lysis



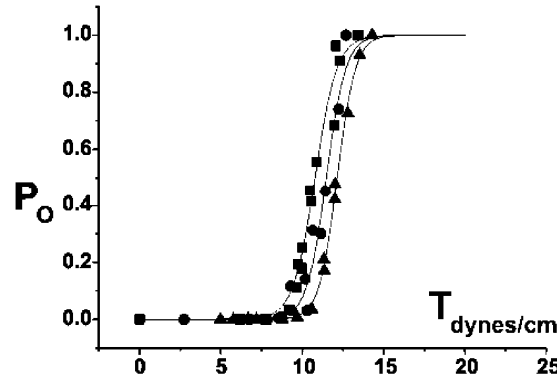
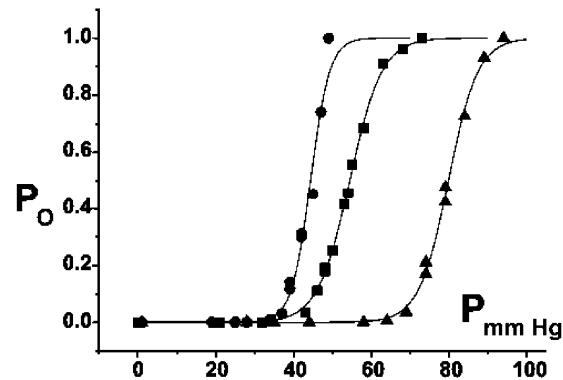
Phillips et al. *Nature*. 459, 379-385 (2009)



Iscla & Blount. *Biophys. J.* 103, 169-174 (2012)

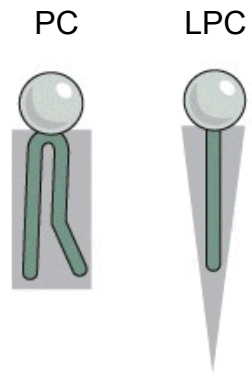
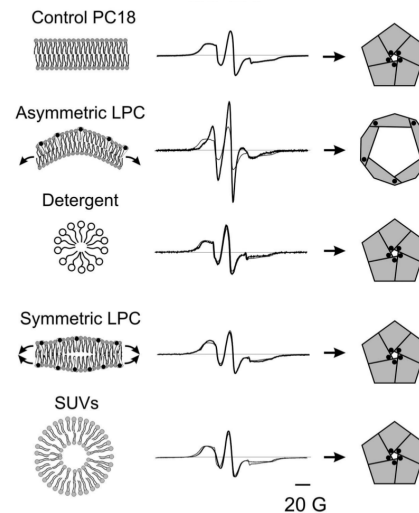
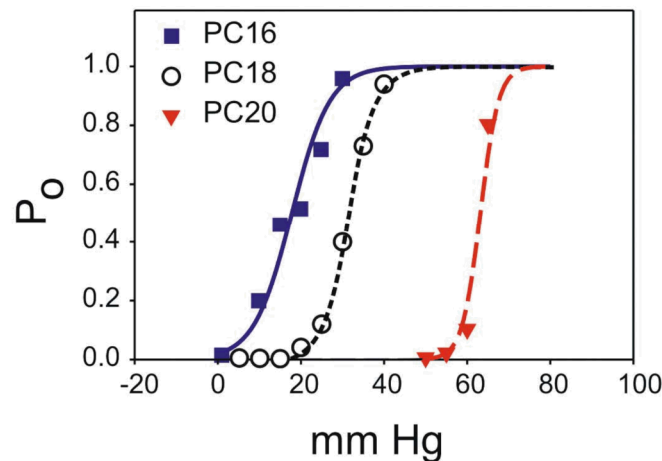
What actuates the channel?

- Channel senses tension in the membrane, not pressure differences



Moe & Blount. *Biochemistry*.
44, 12239-12244 (2005)

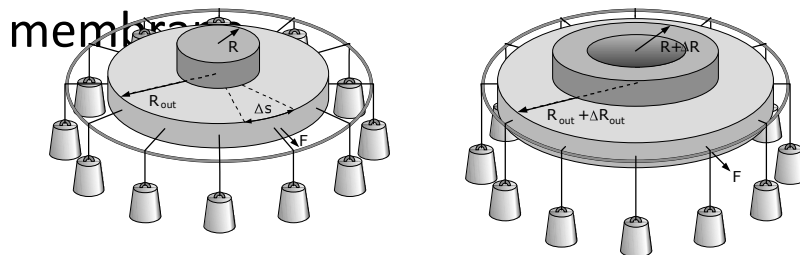
- Gating is sensitive to bilayer thickness and conical (lyso) lipids



Perozo et al. *Nat. Struct. Biol.* 9, 696-703 (2002)

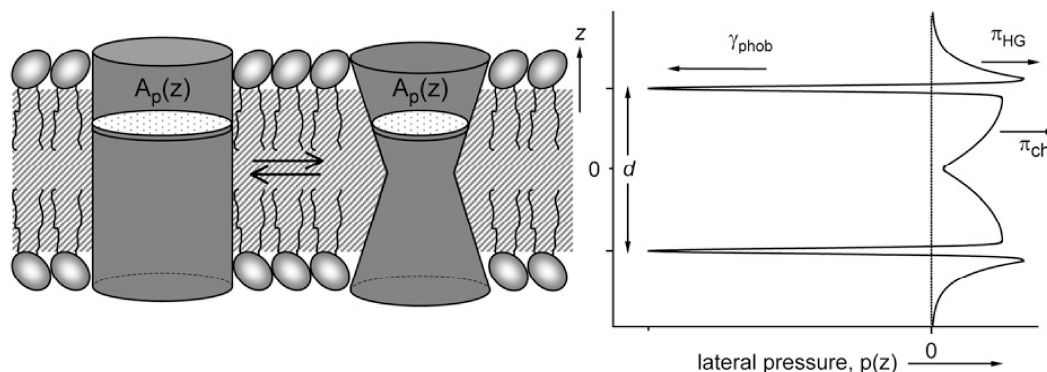
Local stress, elasticity and gating

- Gating energetics can be estimated by various models
 - Continuum models that characterize elastic deformation of membrane



Wiggins & Phillips. *Biophys. J.* 88, 880-902 (2005)
 Phillips et al. *Nature.* 459, 379-385 (2009)
 Reeves et al. *Phys. Rev. E* 78, 041901 (2008)

- Internal stress or “lateral pressure” in the membrane may modulate



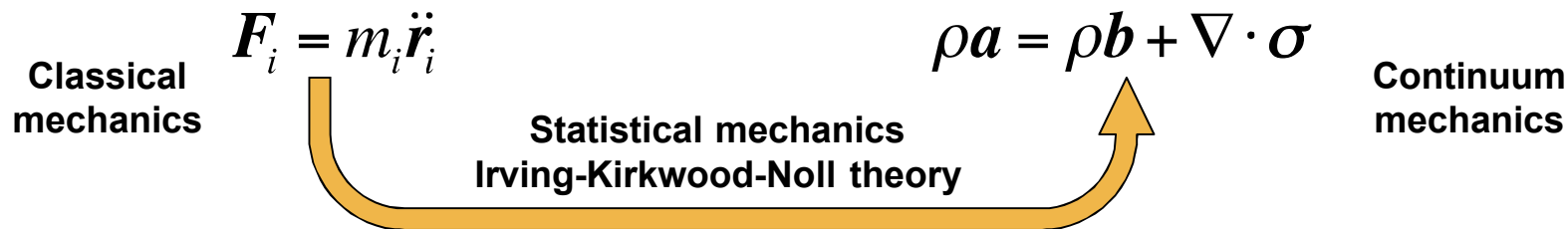
Marsh. *Biophys. J.* 93, 3884-3899 (2007)

- Changes in area due to pressure/surface tension

$$W = \int P(z) \Delta A(z) dz$$

Marshall et al. *Biophys. J.* 100, 1651-1659 (2011)
 Gullingsrud & Schulten. *Biophys. J.* 86, 3496-3509 (2004)

- Continuum fields can be obtained from particle-based MD simulations through ensemble averaging



$$\nabla \cdot \boldsymbol{\sigma} = \nabla \cdot \left(\sum_{i=1}^N \langle m_i \mathbf{v}_i \otimes \mathbf{v}_i \delta(\mathbf{r}_i - \mathbf{x}) \rangle \right) - \sum_{i=1}^N \langle \mathbf{F}_i \delta(\mathbf{r}_i - \mathbf{x}) \rangle$$

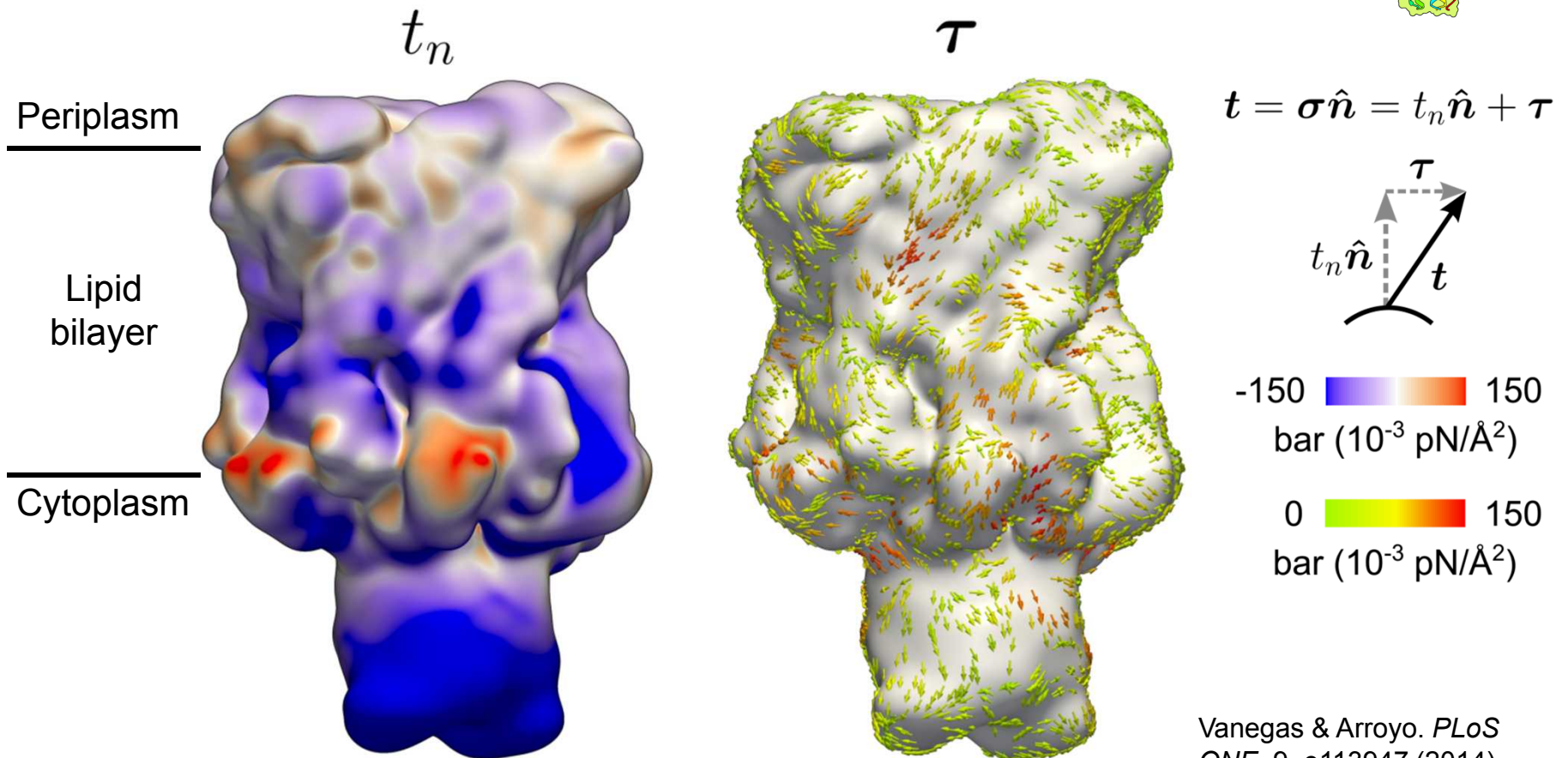
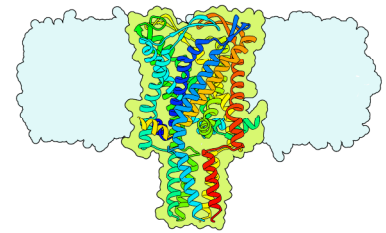
- Microscopic stress field (3D) from MD simulations (time avg)

$$\boldsymbol{\sigma} = \frac{1}{N_\tau} \sum_t \left[- \sum_i^N m_i \mathbf{v}_{i(t)} \otimes \mathbf{v}_{i(t)} w(\mathbf{r}_{i(t)} - \mathbf{x}) + \frac{1}{2} \sum_{\substack{i,j \\ i \neq j}}^N \mathbf{f}_{ij(t)} \otimes \mathbf{r}_{ij(t)} B(\mathbf{x}; \mathbf{r}_{i(t)}, \mathbf{r}_{j(t)}) \right]$$

Vanegas, Torres-Sanchez, & Arroyo. *J. Chem. Theory Comput.* 10, 691-702 (2014)
 Torres-Sanchez, Vanegas, & Arroyo. *Phys. Rev. Lett.* 114, 258102 (2015)

Local stress on the surface of MscL

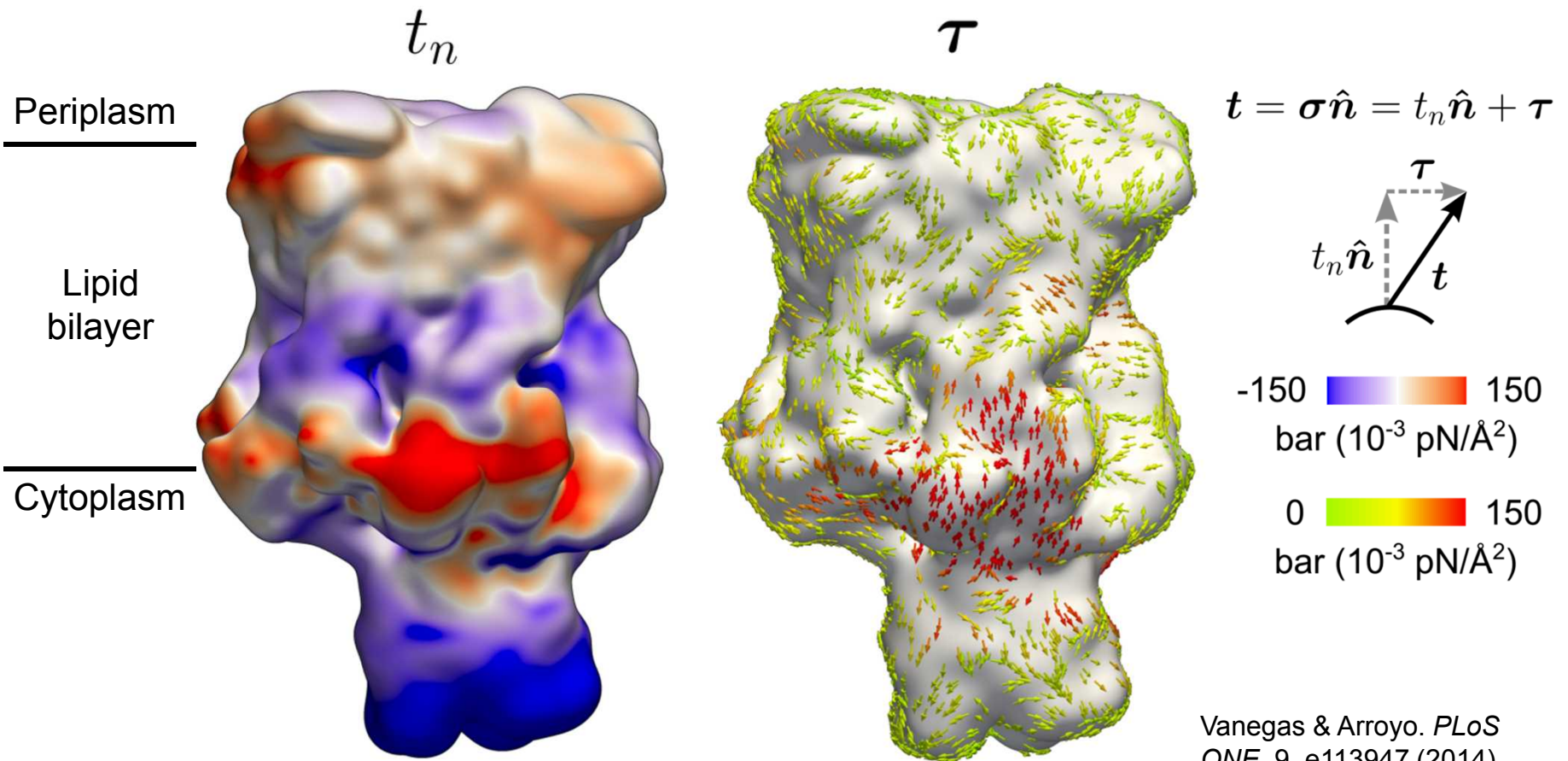
- MscL simulated in a membrane patch (~500 lipids)
- 3D stress visualized as traction vector on surface



Vanegas & Arroyo. *PLoS ONE*. 9, e113947 (2014)

Stress “hot-spots” under tension

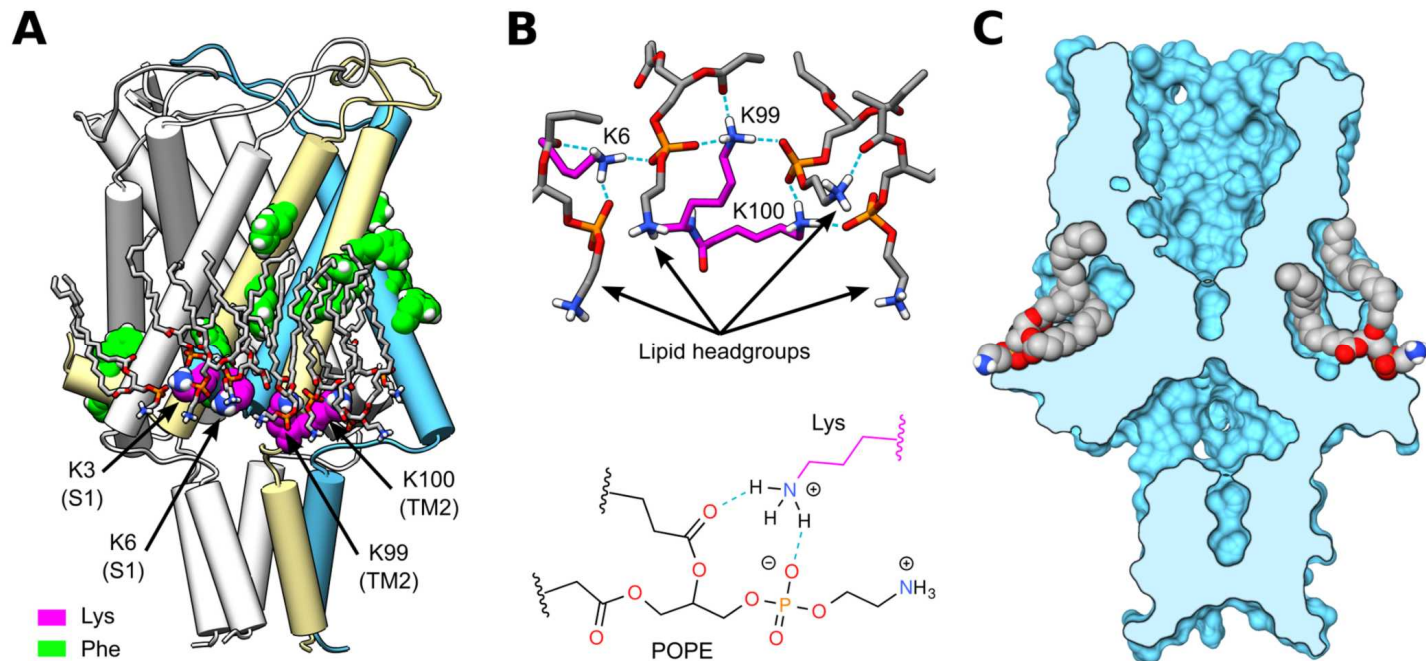
- Membrane under tension ($P_L = -20$ bar, $\sim 6\%$ lateral stretch)
- Channel remains in closed quasi-equilibrium state



Vanegas & Arroyo. *PLoS ONE*. 9, e113947 (2014)

Lipid binding on the cytoplasmic side

- Two lipids associate with each MscL monomer at specific sites
 - Locations match stress hot-spots**
 - + Charged lysines on C-terminus and TM2 (K3, K6, K99, K100) interact with electronegative oxygens on the POPE lipid headgroup
 - Lipid tails accommodate in hydrophobic cavities – preference for 16 vs 18 carbon tail (8 out of 10) of POPE



Vanegas & Arroyo.
PLoS ONE. 9,
e113947 (2014)

Energetics of lipid unbinding

- What is the interaction energy between bound lipids and MscL?
 - Lipid unbinding kinetics under a pulling force

$$d\phi/dt = (1-\phi)k_d \Rightarrow \phi(t) = 1 - e^{-k_d t}$$

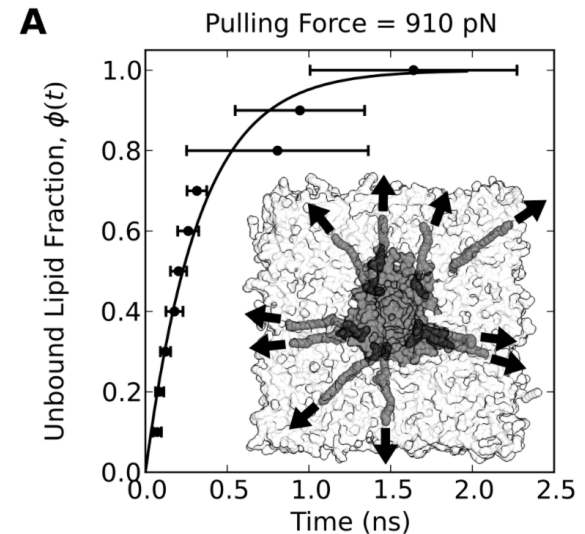
- Simple Arrhenius-Bell model (assuming electrostatic interaction dominates)

$$E_b(f) = E_0 - fx_b$$

$$k_d(f) = 1/t_d e^{-(E_0 - fx_b)/k_B T}$$

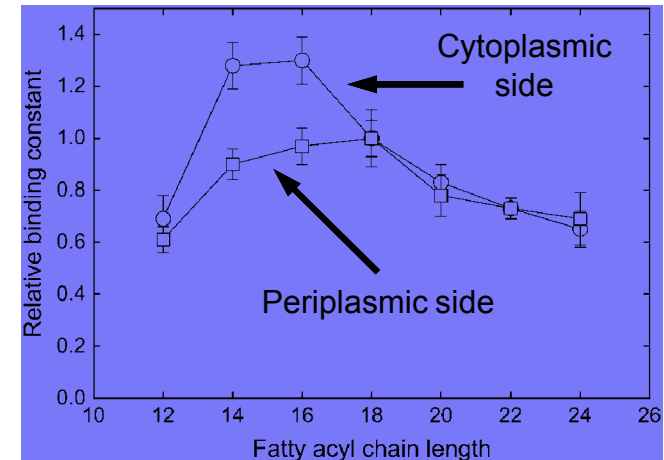
$$k_d(f) = 1/t_{off} e^{fx_b/k_B T}$$

- Energy barrier in range of 10-13 $k_B T$

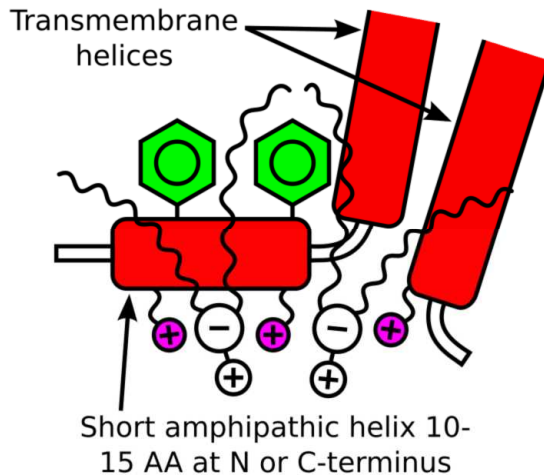


A resilient association

- Association of lipids with MscL observed experimentally
 - Higher affinity for cytoplasmic side and 16 carbon tails
- Lipid binding to MscL is simple and robust
 - Charged interactions + geometric confinement (lipid tail)



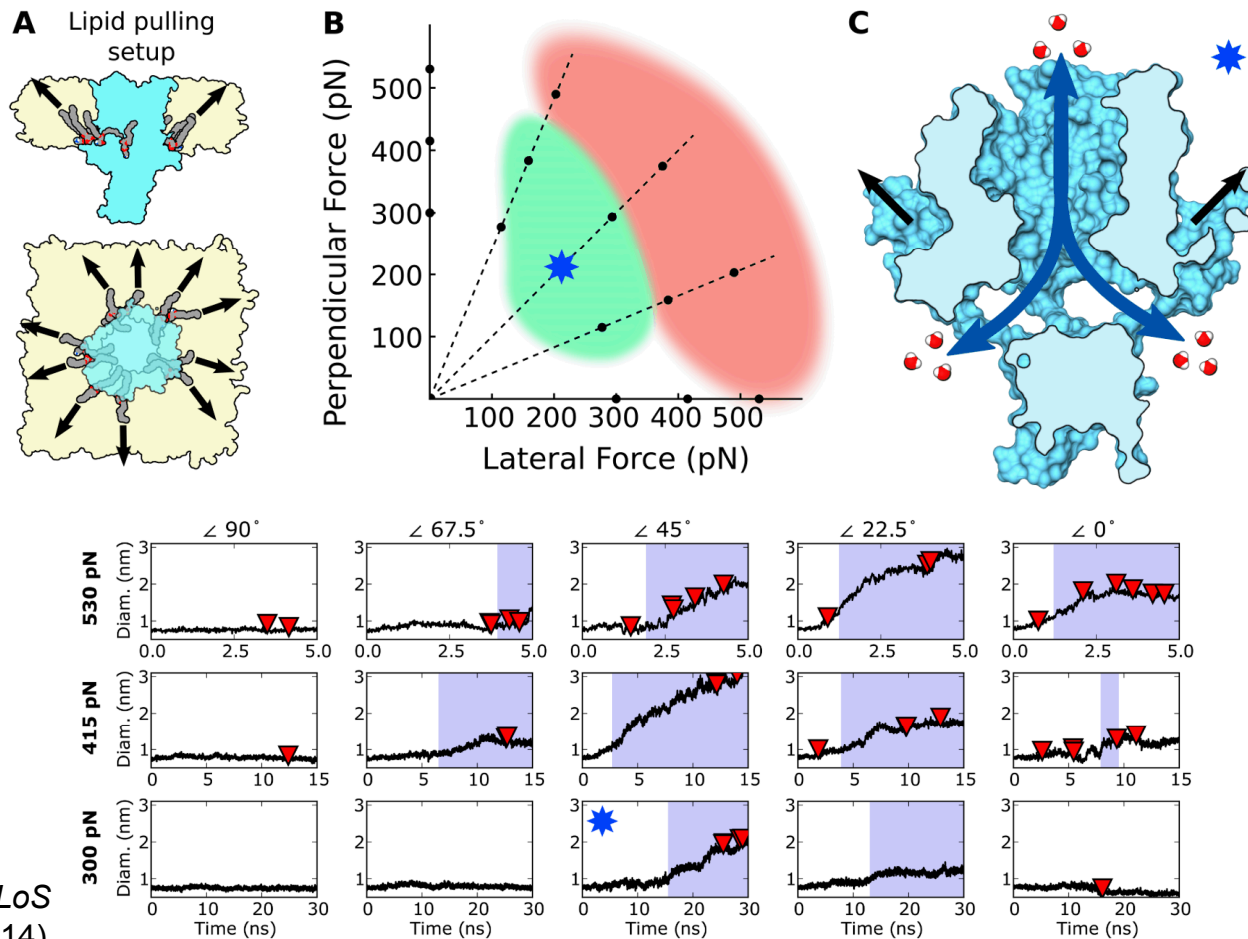
Powl et al. *Biophys. J.* 93, 113-122 (2007)



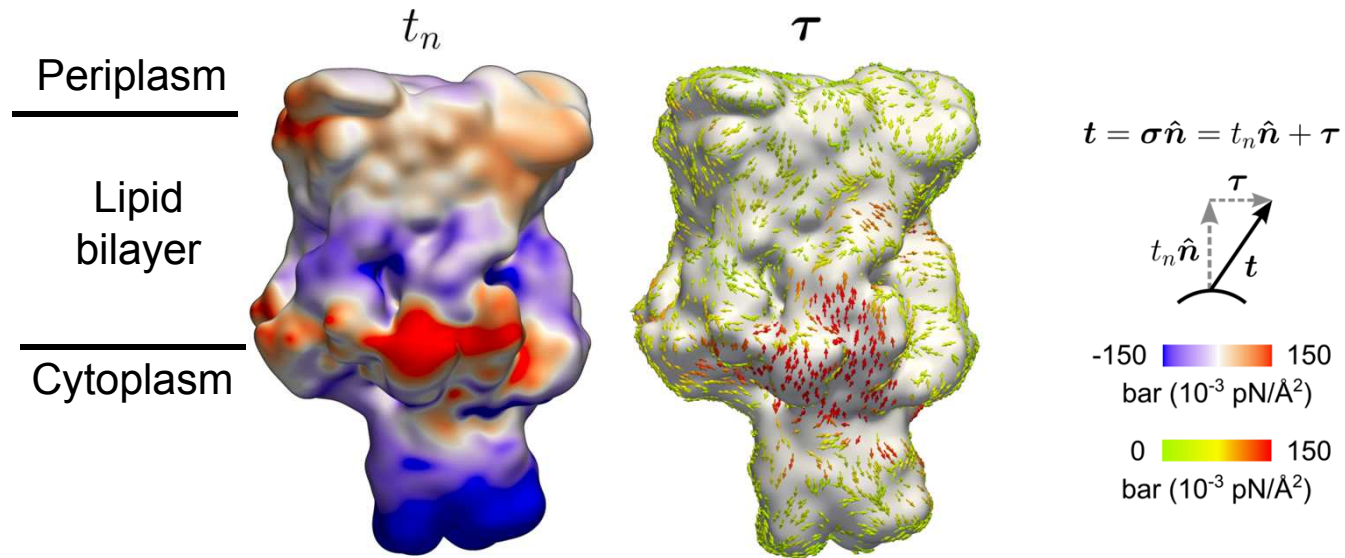
Vanegas & Arroyo.
PLoS ONE. 9,
e113947 (2014)

Actuating the channel in steered MD

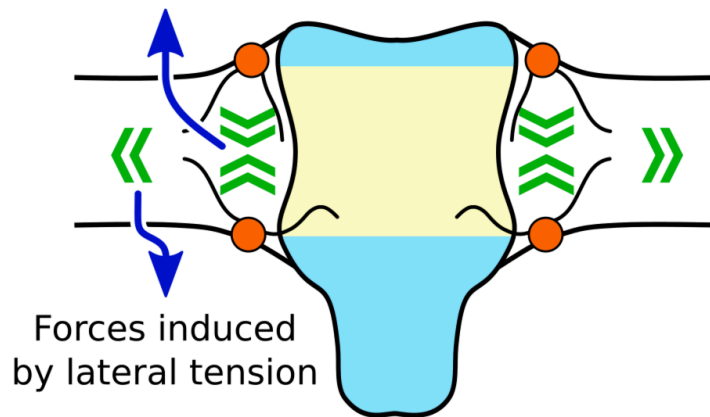
- MscL gating by membrane tension is slow (microseconds)
 - Can the channel be actuated by pulling on the tightly-bound lipids?



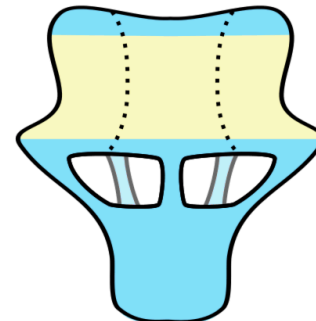
A framework for force transduction



Forces induced by
hydrophobic mismatch



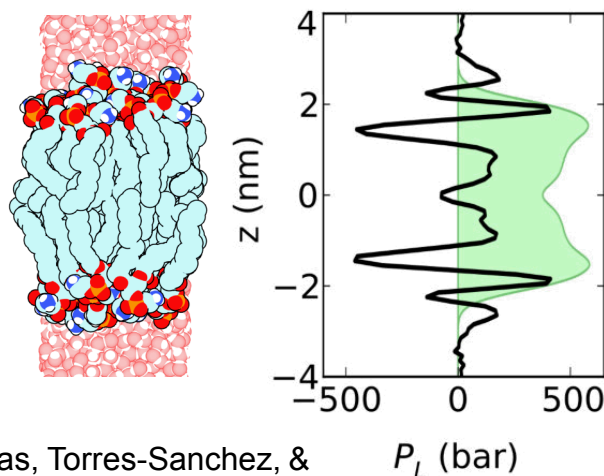
Open channel



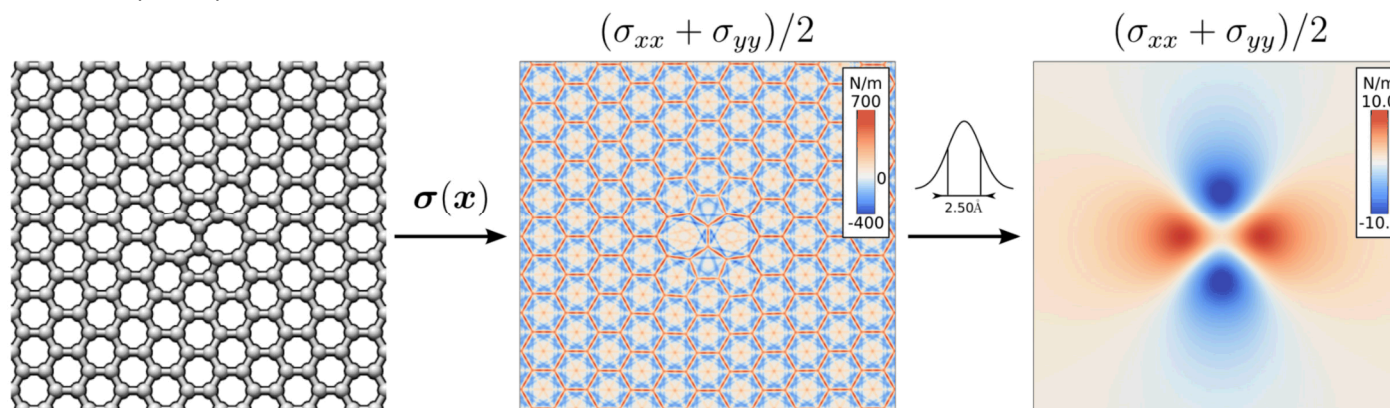
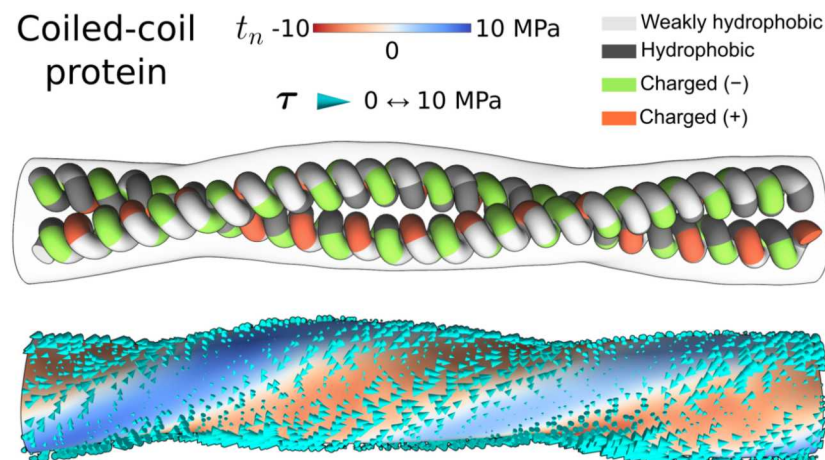
Vanegas & Arroyo.
PLoS ONE. 9,
e113947 (2014)

Other applications of local stress

- More info/code available at mdstress.org



Vanegas, Torres-Sanchez, & Arroyo. *J. Chem. Theory Comput.* 10, 691-702 (2014)

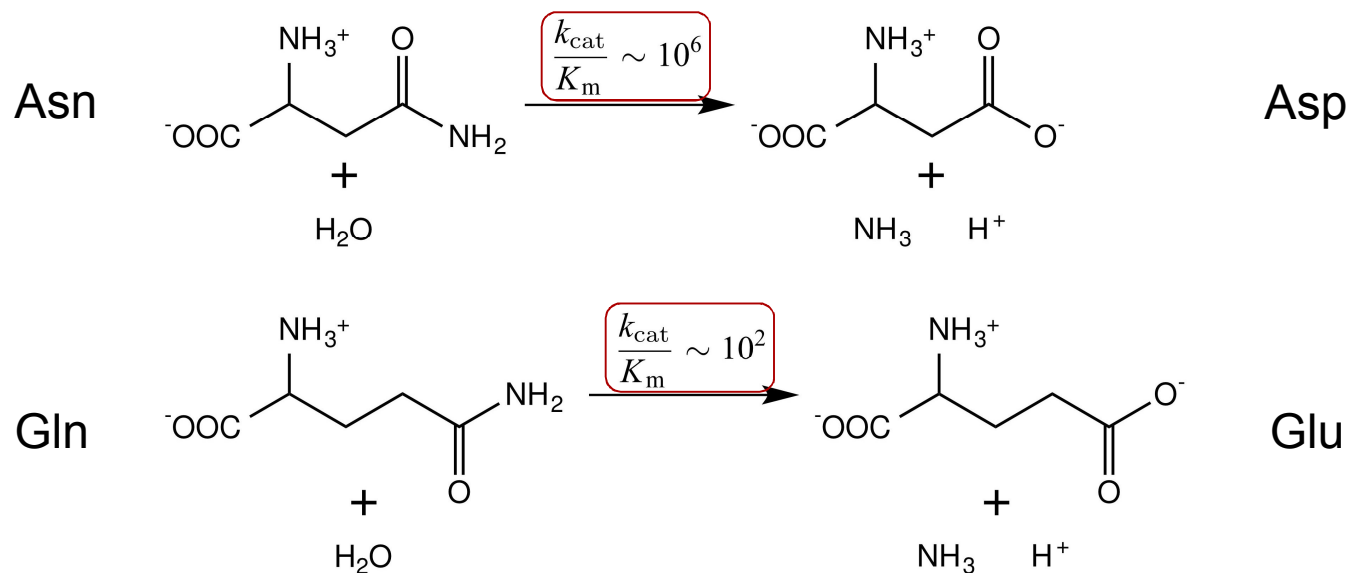


Torres-Sanchez, Vanegas, & Arroyo. *Phys. Rev. Lett.* 114, 258102 (2015)

Catalysis and specificity in L-Asparaginase, an anticancer enzyme

L-Asparaginase: Starving cancer cells

- Drug treatment against acute lymphoblastic leukemia
- L-ASP degrades amino acids Asn and Gln – starves certain cancer cells that can't synthesize these



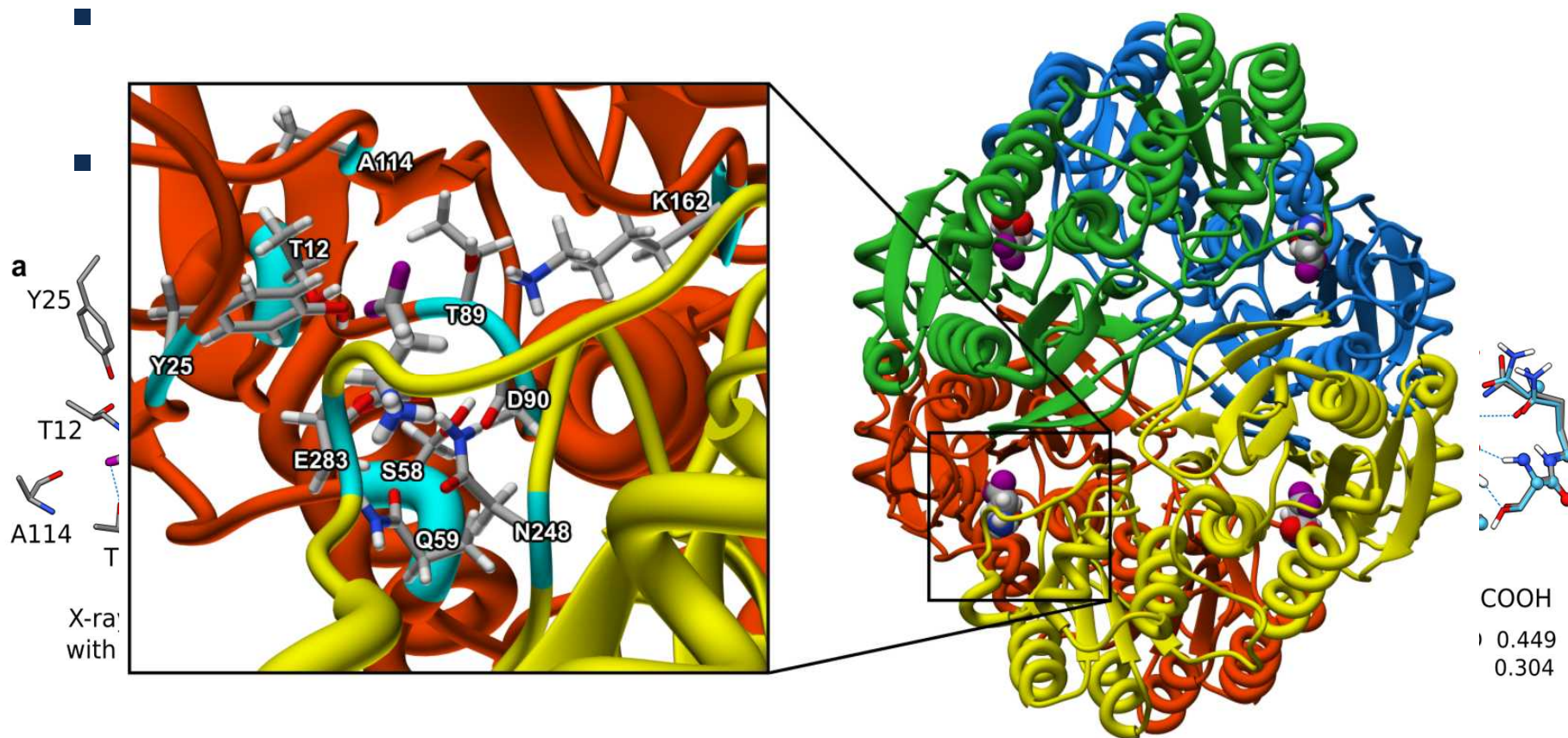
- L-ASP type II from *E. coli* (Elspar[®]) is most widely used clinically

Improving L-ASP's anticancer properties

- *E. coli* L-ASP has low catalytic rate – needs high doses for effective treatment (toxic side effects)
- Secondary glutaminase activity is also problematic
 - Linked to toxic side effects – precludes completion of treatment
 - Some cancers require degradation of both Asn and Gln
- How to optimize L-ASP for cancer treatment?
 - Tune substrate specificity – modulate glutaminase activity
 - Improve catalytic rate
- Despite 40+ years of clinical use, complete reaction mechanism remains unknown – limits rational engineering

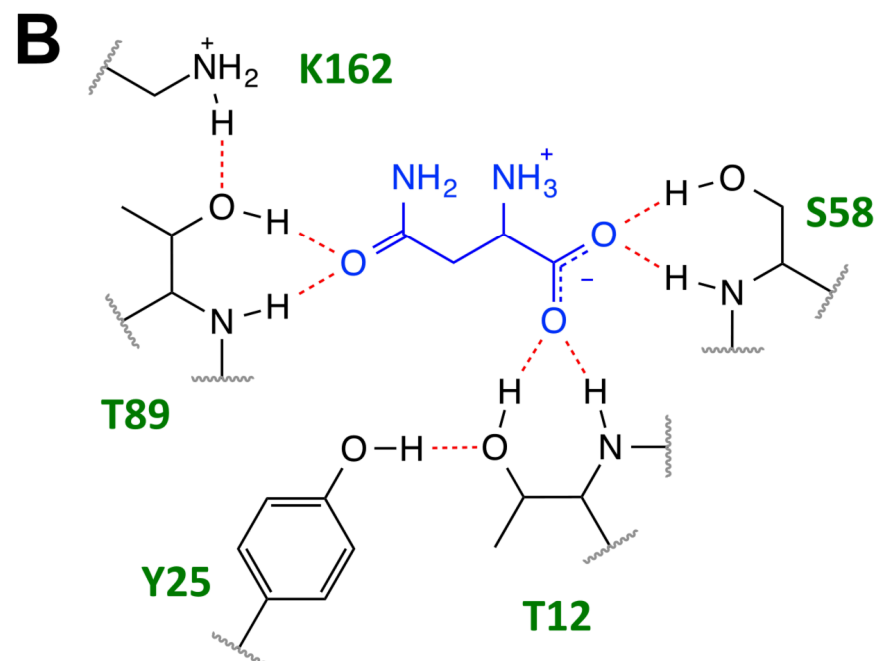
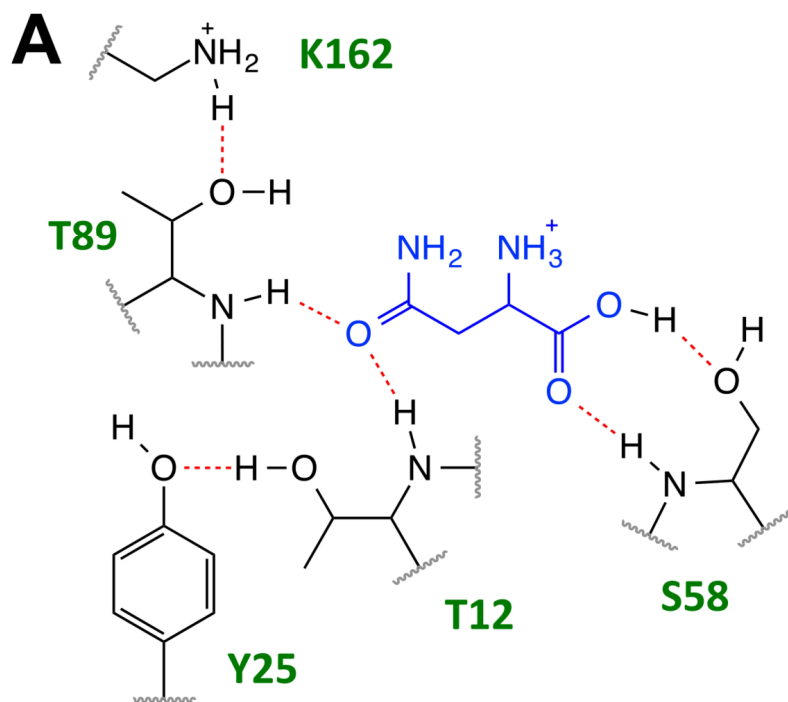
Hidden proton in L-ASP's product

- Deamidation mechanisms rely heavily on crystal structure (PDB 1NNS) of L-ASP with the **reaction product Asp**



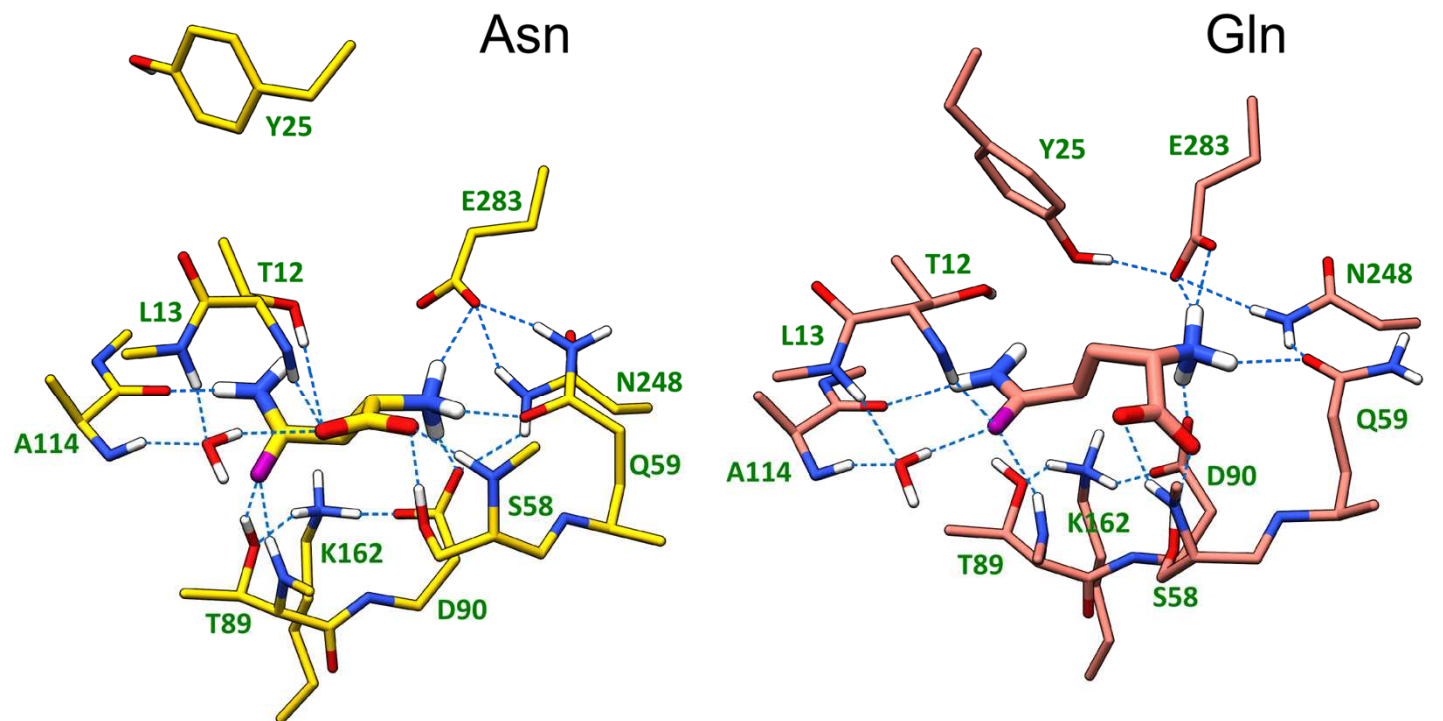
Substrate vs product conformations

- Asn substrate quickly rearranges in L-ASP active site
 - Unprotonated α -COO⁻ in Asn substrate induces large reorientation
 - T12, S58 and T89 “clamp” onto oxygens of Asn



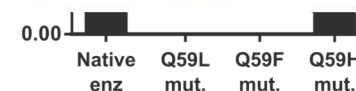
Asn vs Gln: Tuning L-ASP's activity

- Can we alter L-ASP's active site to eliminate Gln degradation?
- Additional methylene in Gln affects substrate orientation



Enzyme active site - **differences in contacts with substrates**

T89-NH \cdots O $_{\gamma(\delta)}$	0.89	0.86	0.82	0.50	0.00	0.69	0.56	0.00
D90-O \cdots HN $_{\alpha}$	0.99	0.99	0.99	0.98	0.99	0.91	0.99	0.97
E283-O $_{\delta 1}$ \cdots HN $_{\alpha}$	0.95	0.82	0.74	0.72	0.28	0.00	0.00	0.66



L-ASP's mechanism puzzle

- Experiments strongly support double displacement mechanism with an acyl-enzyme covalent intermediate

kinetic experiments were performed with the asparagine analog β -hydroxamate (AHA) as the substrate. The activities of toward its natural substrate, L-asparagine, and AHA are comparable. The latter substrate was preferred for the sensitive and reliable assay of its product, hydroxylamine (NH_2OH), with 8-hydroxy-
[8].
initial burst' experiments, the time course of the appearance of

G.J. Palm et al./FEBS Letters 390 (1996) 211-216

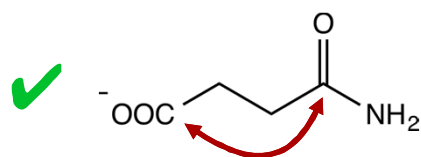
Palm et al. FEBS Lett. 390, 211-216 (1996)

lar size (determined by analytical gel filtration and SDS-acrylamide gel electrophoresis), and thermodynamical stabilities (derived from denaturation curves in guanidinium hydrochloride solutions) were almost the same as those of wild-type EcA (data not shown).

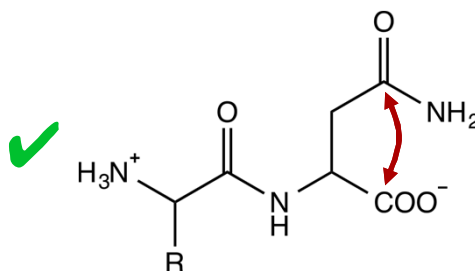
Despite the different crystal forms (P2₁2₁2₁ vs. P2₁)

- L-ASP's threonine T12 and T89 are possible nucleophiles
 - T89V and T12A single mutants both reduce k_{cat} $\sim 100,000$ fold
- Absolute requirement of carboxyl group 2-3 carbons from amide

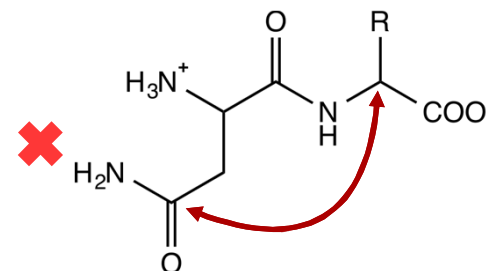
succinamate



$\text{NH}_3^+-\text{Xxx}-\text{Asn}-\text{COO}^-$

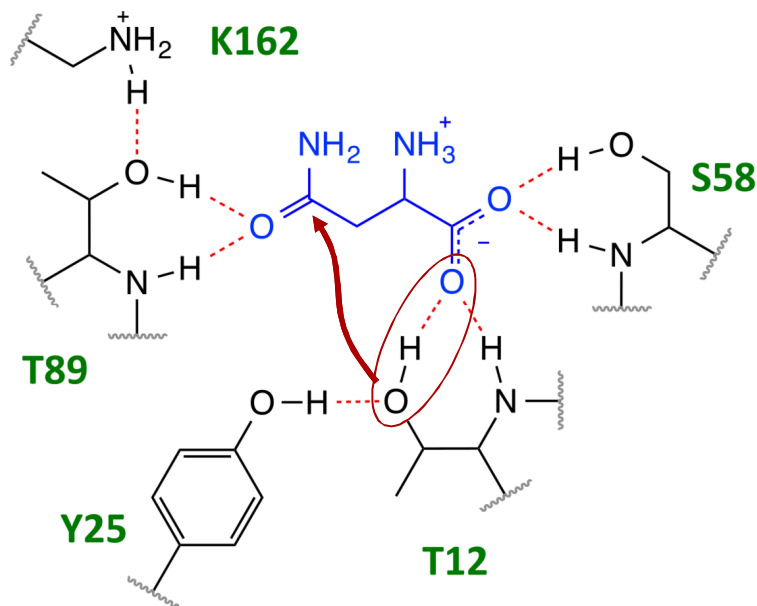


$\text{NH}_3^+-\text{Asn}-\text{Xxx}-\text{COO}^-$



Initial stages of the reaction

- Focus on nucleophilic attack by T12 onto γ -carbon of Asn



- Where does T12-OH proton go? Can substrate α -COO $^-$ accept it?
- Is the acyl-enzyme intermediate stable?

Probing the reaction with QM

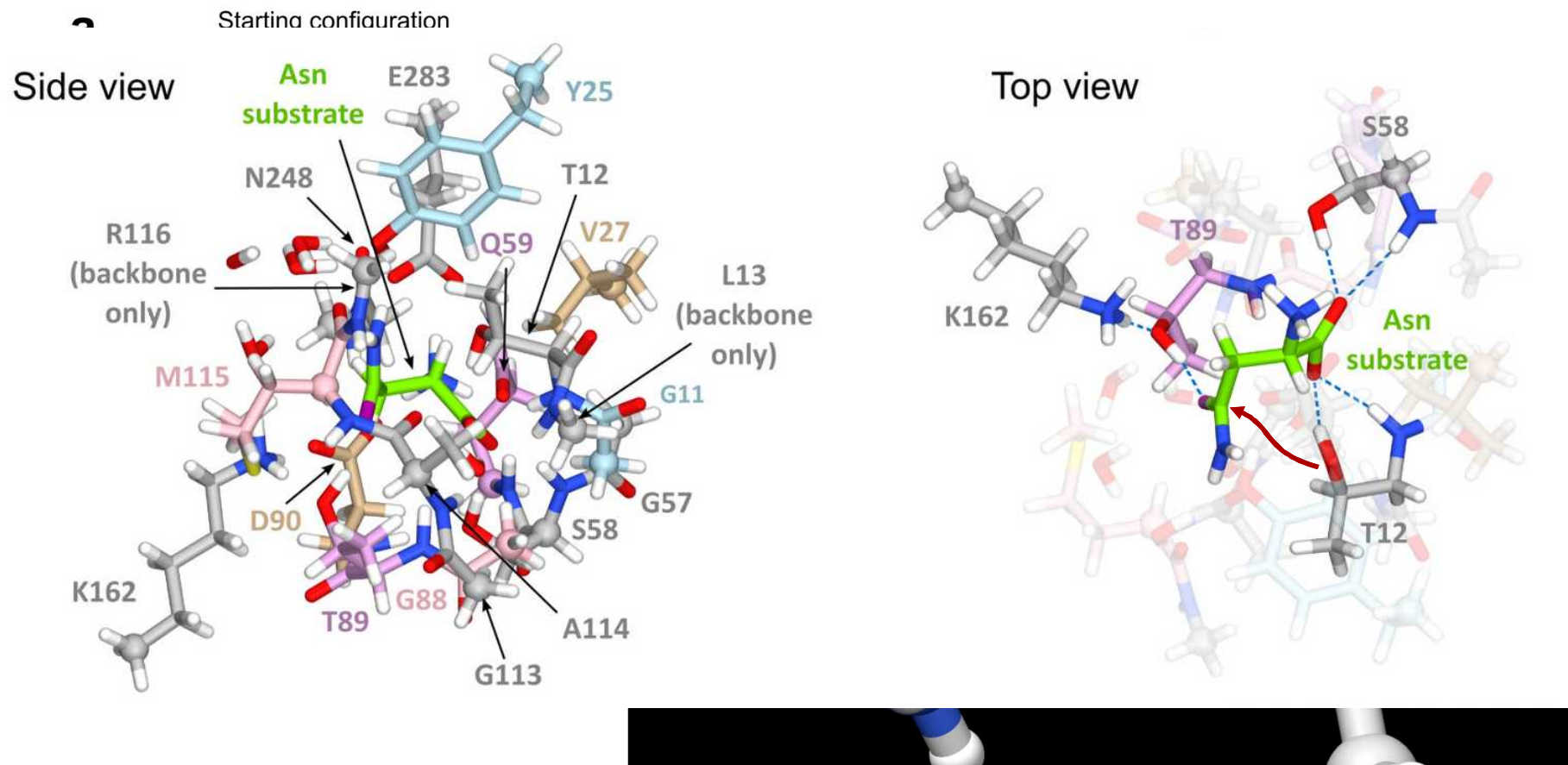
- Classical MD simulations not suitable to follow chemical rxns
- Use QM self-consistent field methods (Hartree-Fock, density functional theory)
 - Born-Oppenheimer approx. – separate wavefunction into nuclear and electronic components
 - Treat heavy nuclei as fixed point particles – focus on electrons
 - Iteratively solve time-independent Schrödinger eqtn. $H_{elec} \Psi_0 = E_{elec} \Psi_0$
 - *Ab initio* MD – classical trajectories of nuclei in quantum potential

$$\mathbf{F}_I = M_I \ddot{\mathbf{R}}_I = -\nabla_I V^{BO}(\mathbf{R}_I) = -\nabla_I \min_{\Psi_0} \left\{ \langle \Psi_0 | H_{elec} | \Psi_0 \rangle \right\}$$

- Explore kinetics with *ab initio* MD based on regular MD results
- Calculate relative energies from stationary structures at various steps of reaction

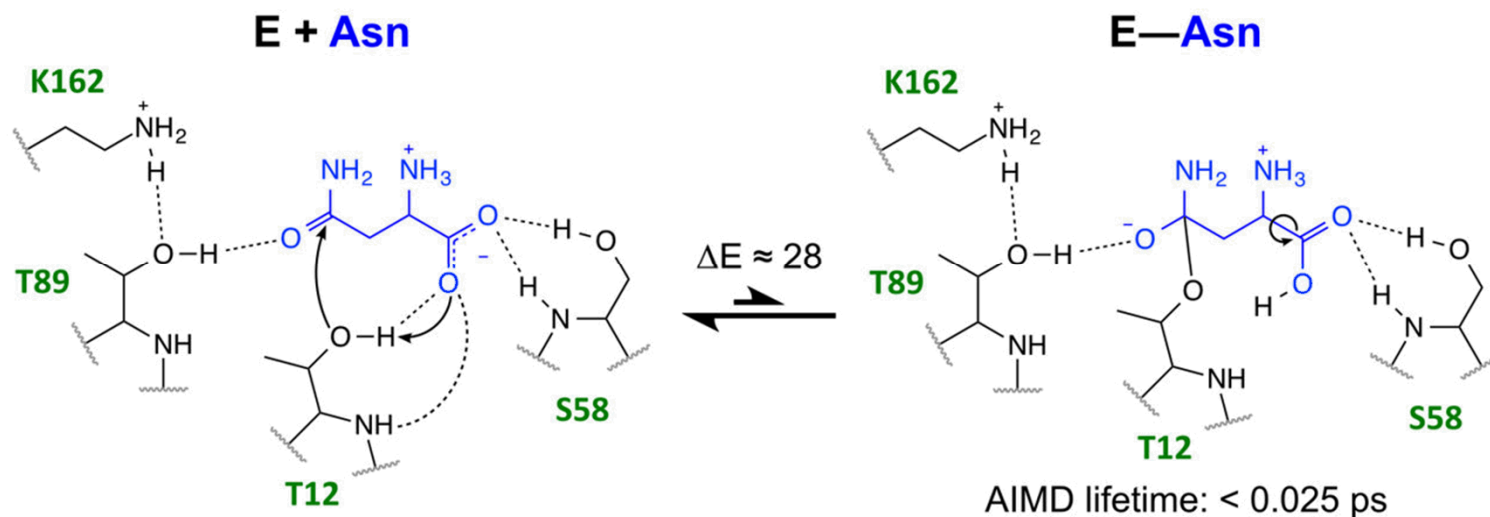
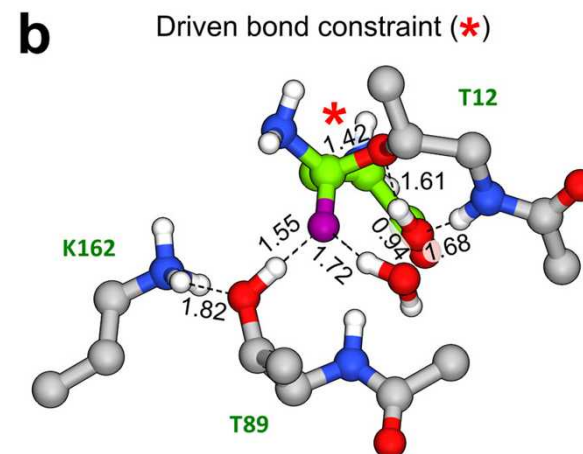
Direct nucleophilic attack by T12

- QM system = active site amino acids + 4 waters – 239 atoms (α -carbons fixed)



Direct nucleophilic attack by T12

- T12-OH proton spontaneously transfers to substrate α -COO⁻
- Enzyme-substrate covalent intermediate unstable (<0.025 ps)
- Relative energy of optimized end states ~28 kcal/mol

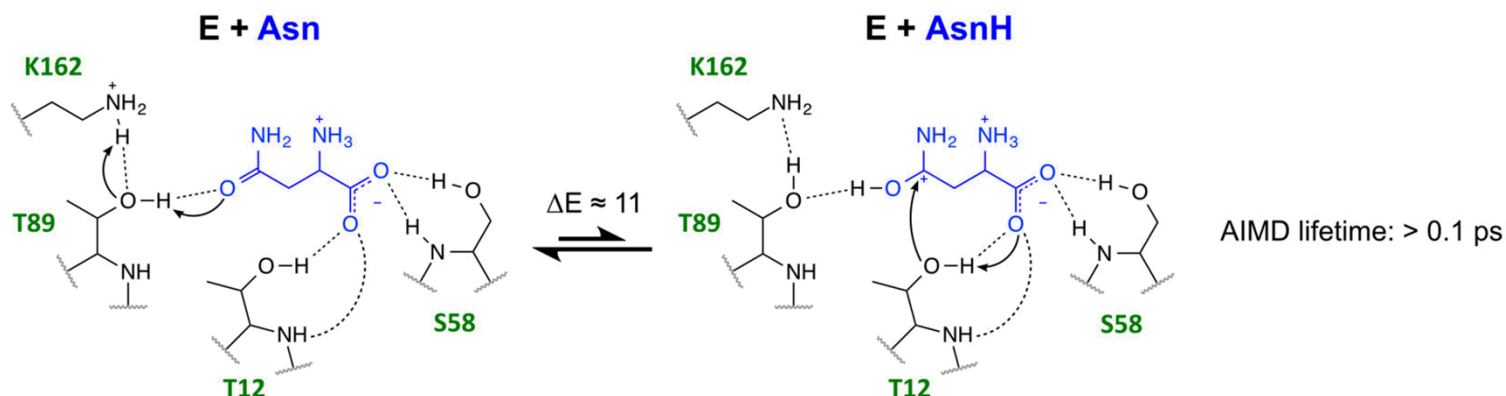


Anishkin, Vanegas et al. *J. Mol. Biol.* 427, 2867-2885 (2015)

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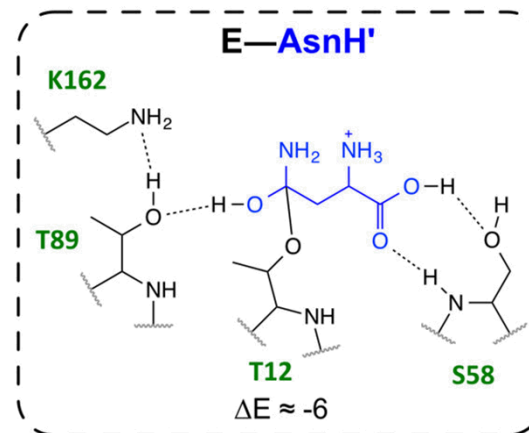
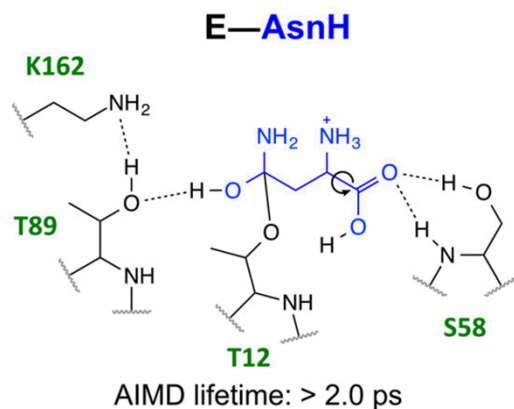
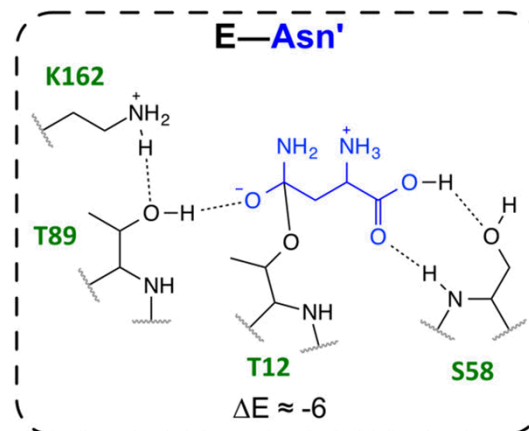
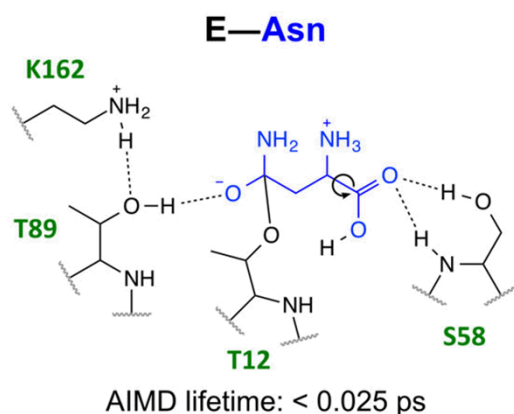
Pre-protonation stabilizes reaction

- Two-step attack by T12 is more kinetically favorable
 - Amide oxygen is first protonated by K162-T89 proton bridge



α -COOH prefers paired H-bonding

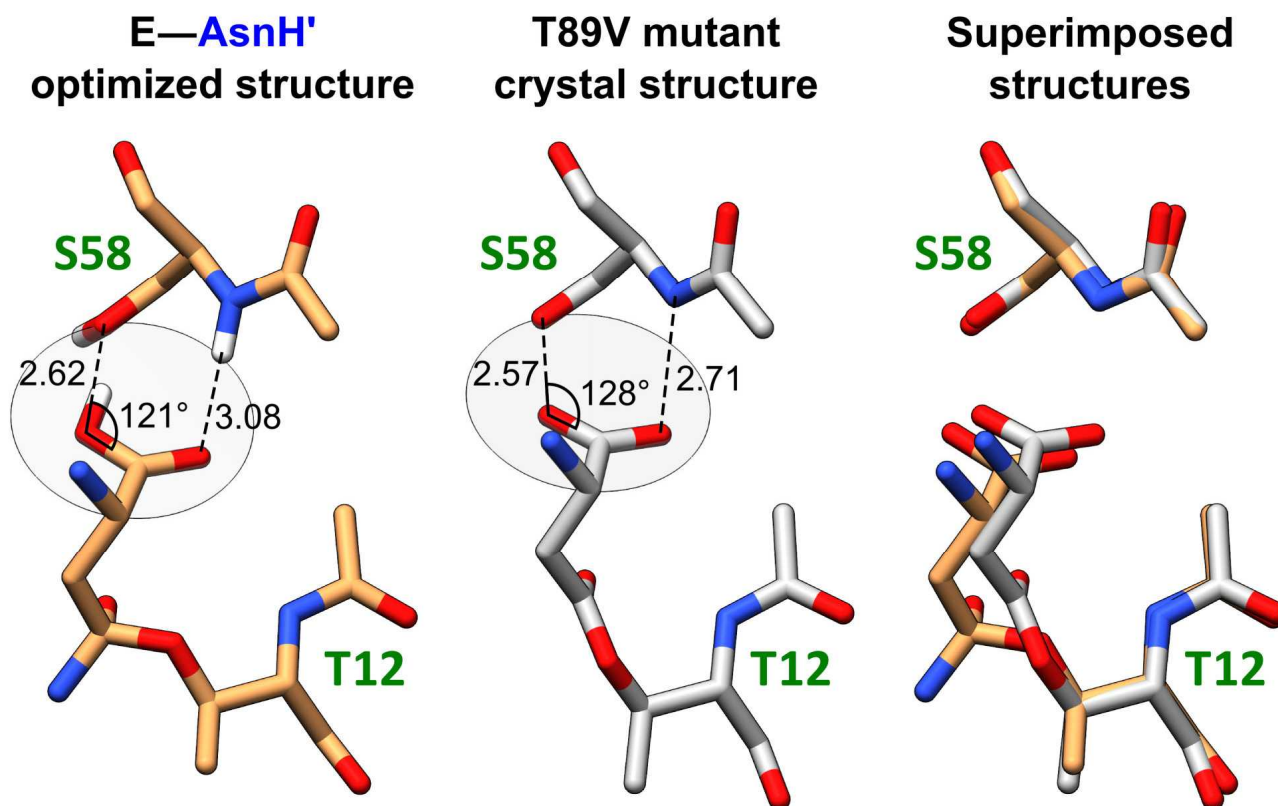
- Protonated α -COOH prefers a “paired” H-bonding pattern with S58 instead of being “clamped”



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QM structure similar to T89V mut.

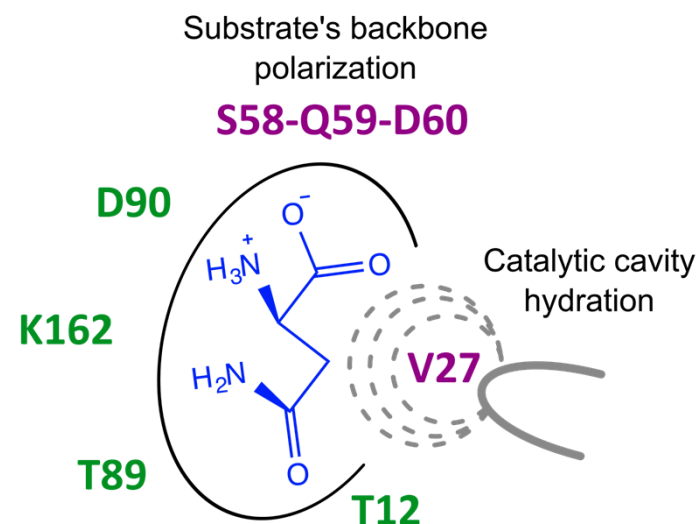
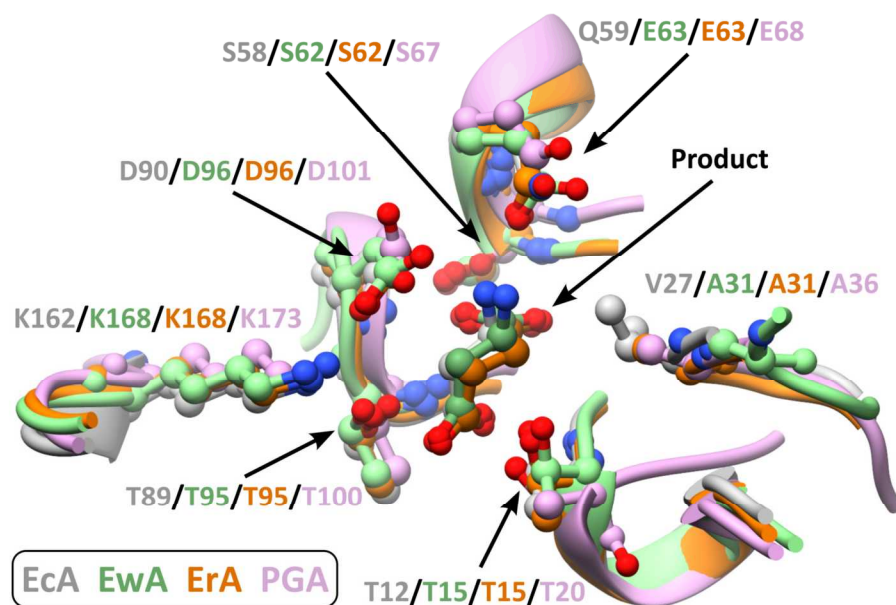
- E-AsnH' configuration similar to acyl-enzyme intermediate in T89V crystal structure (PDB 4ECA)
 - WT + mutant structures resemble intermediates, not initial state



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Ongoing work/future directions

- Increasing catalytic rate of L-ASP requires knowledge of complete reaction mechanism
 - Mapping all reactions including energy barriers with QM/MM
- Comparison of *E. coli* L-ASP's structural features with enzymes from homologs (*Erwinia*, *Pseudomonas*, *Helicobacter*)



Acknowledgments



Dr. Marino Arroyo
UPC-BarcelonaTech



Alejandro Torres
UPC-BarcelonaTech



Dr. Susan Rempe
Sandia Natl. Labs



Dr. Philip Lorenzi
MD Anderson
Cancer Center (UT)



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