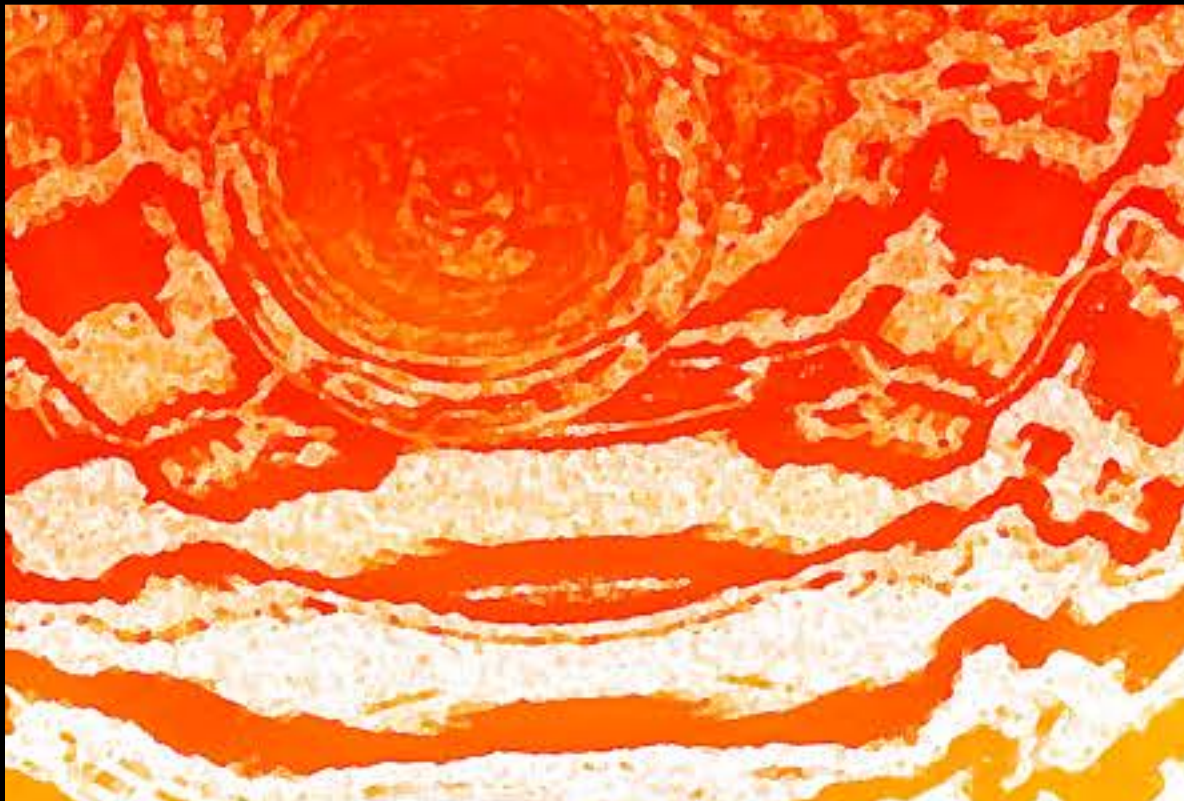
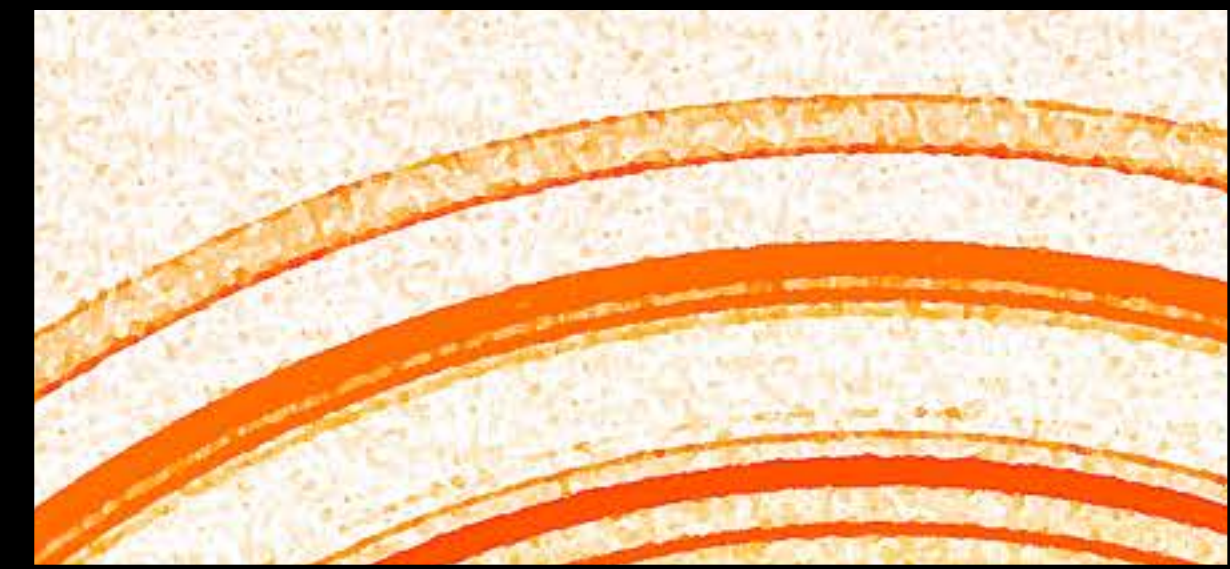
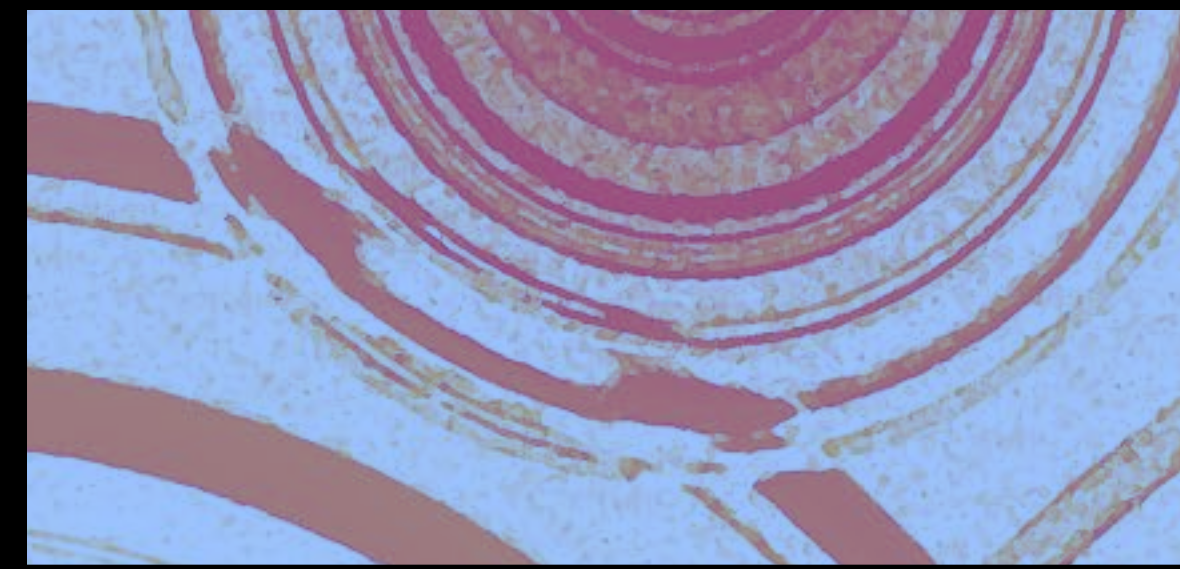
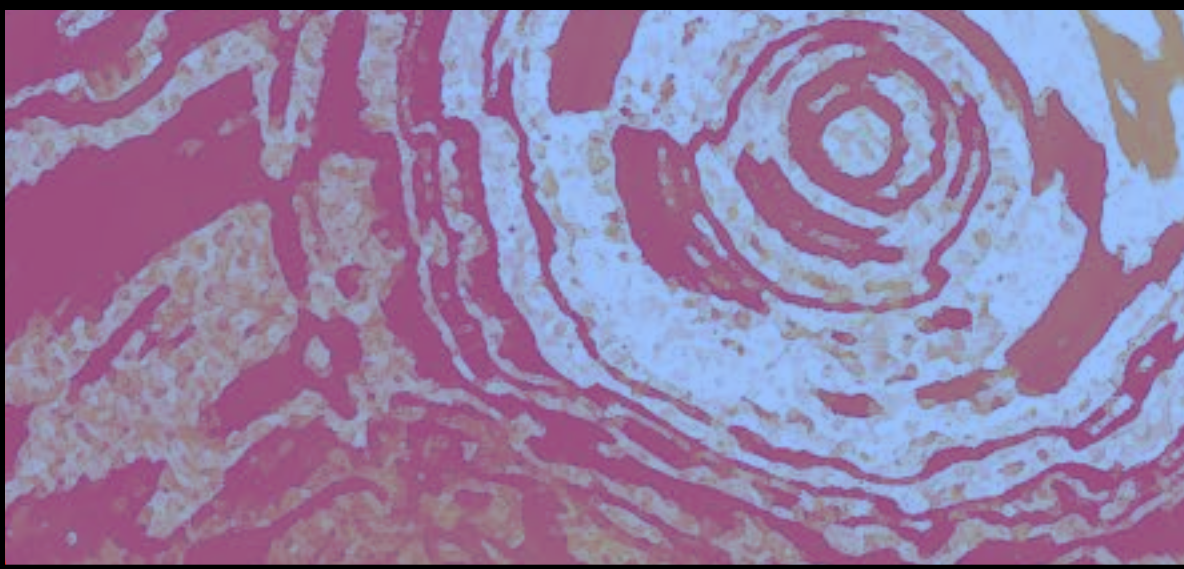


The Bacterial Brain: All-atom description of a bacterial chemoreceptor array.

*Blue Waters Symposium
14 May, 2014*

PI: Yann Chemla
Co-PI: Klaus Schulten
Presentation: Keith Cassidy

*Department of Physics
University of Illinois at Urbana-Champaign*



Overview

- Introduction.
- Bacterial chemotaxis primer: The case of *E. coli*.
- The Bacterial Brain: A naturally-evolved, mechanical computer.
- How computation and Blue Waters can help.
- Modeling and Simulation of the chemoreceptor array.

Chemotaxis: A fundamental sensory phenomenon.

How do sperm cells find eggs?

How do white blood cells find sites of inflammation?

How do bacteria find food and avoid poisons?

Chemotaxis - Any cell motion affected by a chemical gradient, resulting in net propagation along the gradient.



Neutrophil "chasing" a bacterium.
David Rogers, Vanderbilt U. (1950's)

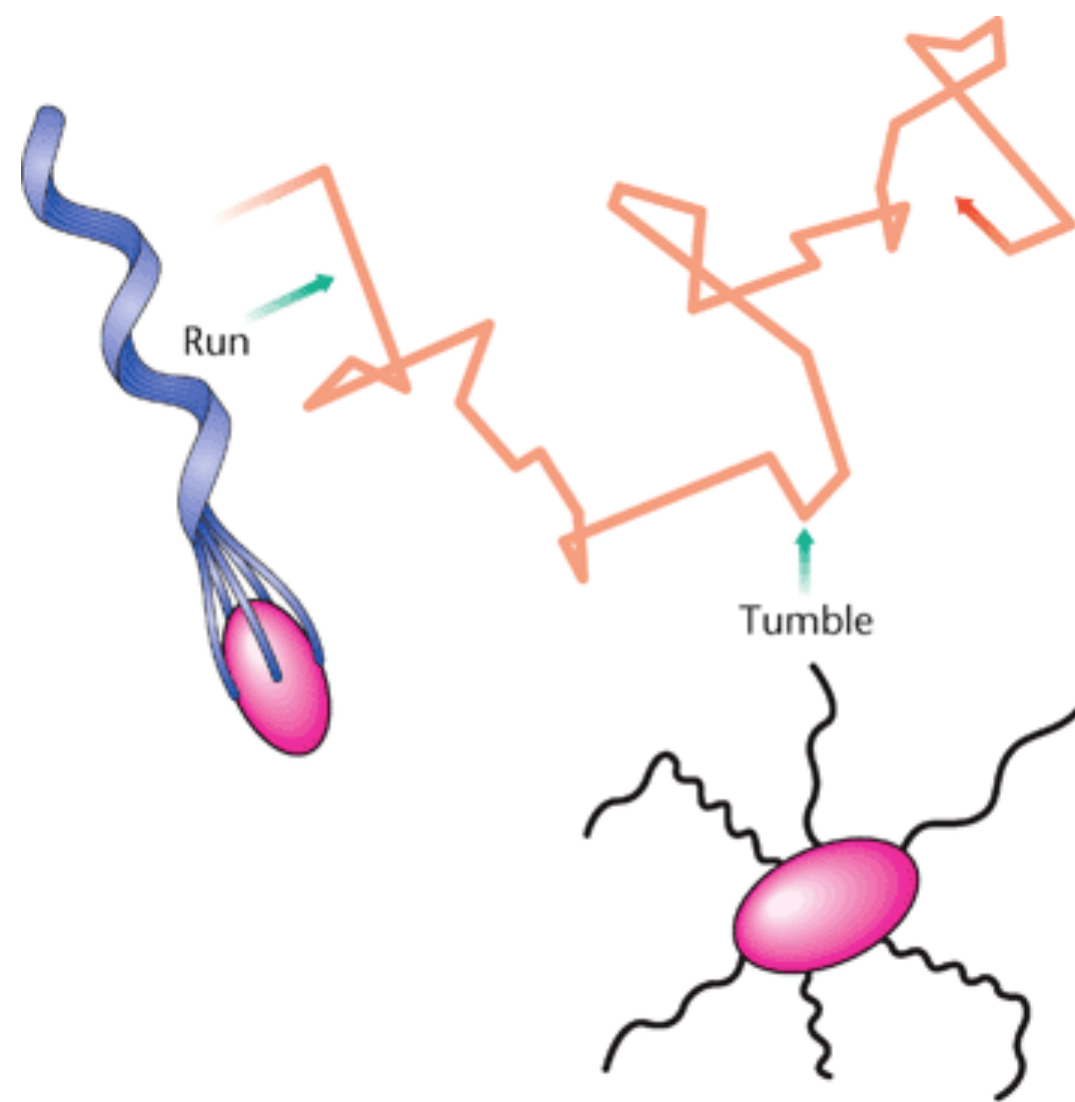
Bacterial chemotaxis primer: The case of *Escherichia coli*.

Bacteria sense a wide range of environmental chemicals.

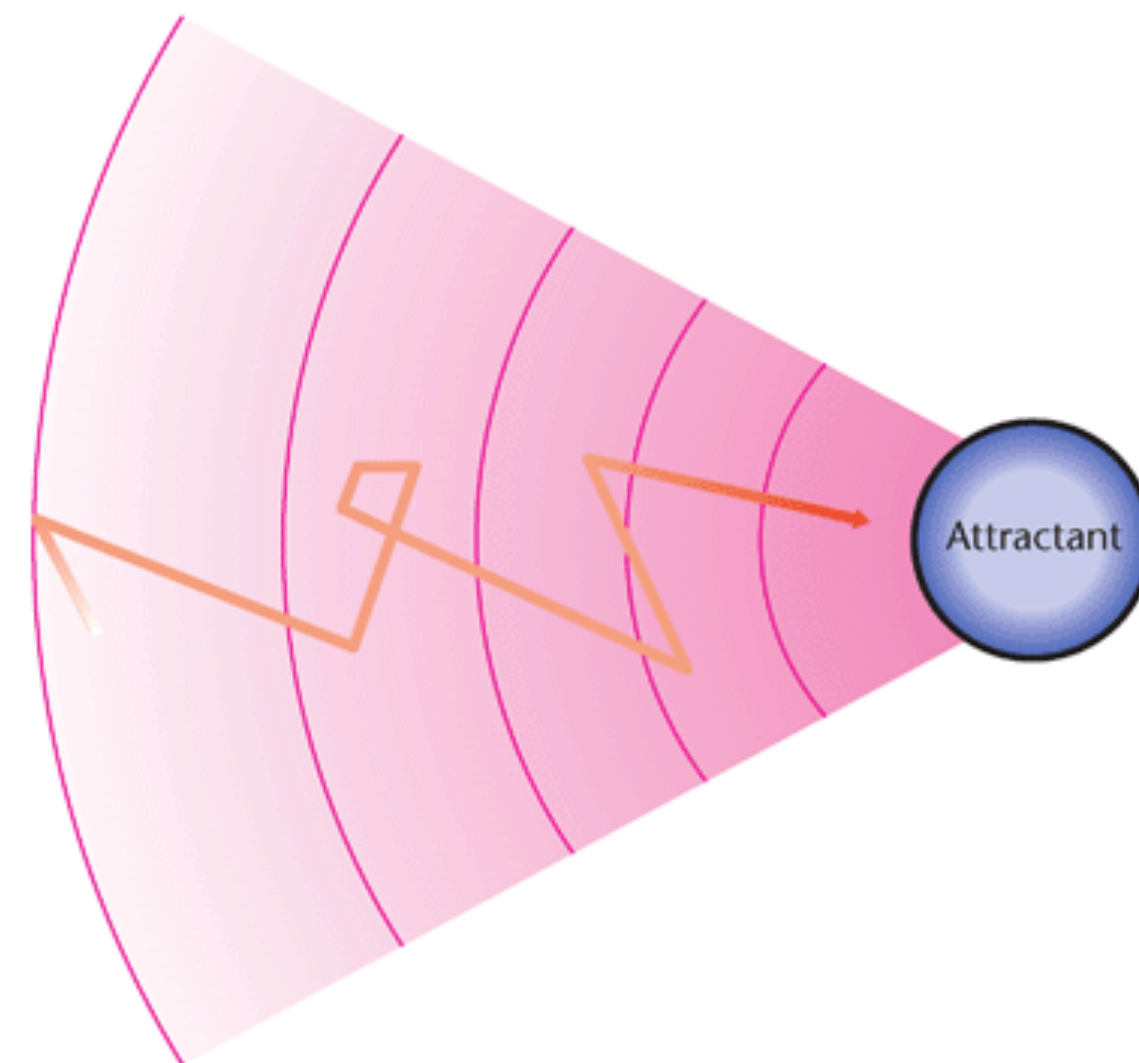
This information is used to generate motile responses that place cells in the optimal habitat.

E. coli, uses a run-tumble strategy, lengthening runs in “good” directions.

No gradient = random walk



Attractant gradient = biased random walk



Free-swimming *E. coli*

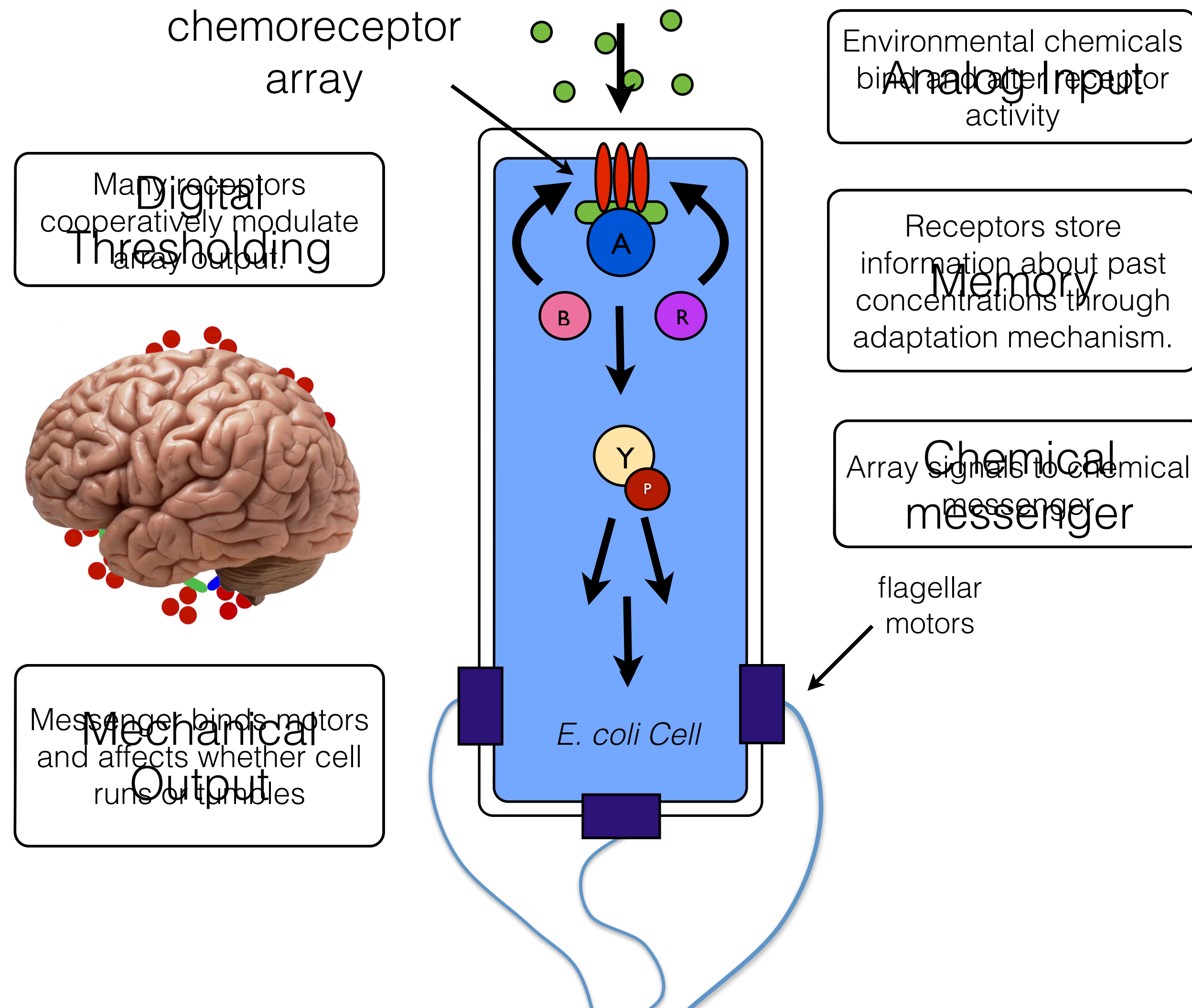
Figure: Eisenbach, Michael (Dec 2011) Bacterial Chemotaxis. In: eLS. John Wiley & Sons Ltd, Chichester. <http://www.els.net>

Video: Berg, Howard (Harvard U.) <http://www.rowland.harvard.edu/labs/bacteria/movies/ecoli.php>

To tumble, or not to tumble?

The *E. coli* chemotactic network.

Most thoroughly studied sensory signal transduction system in biology...

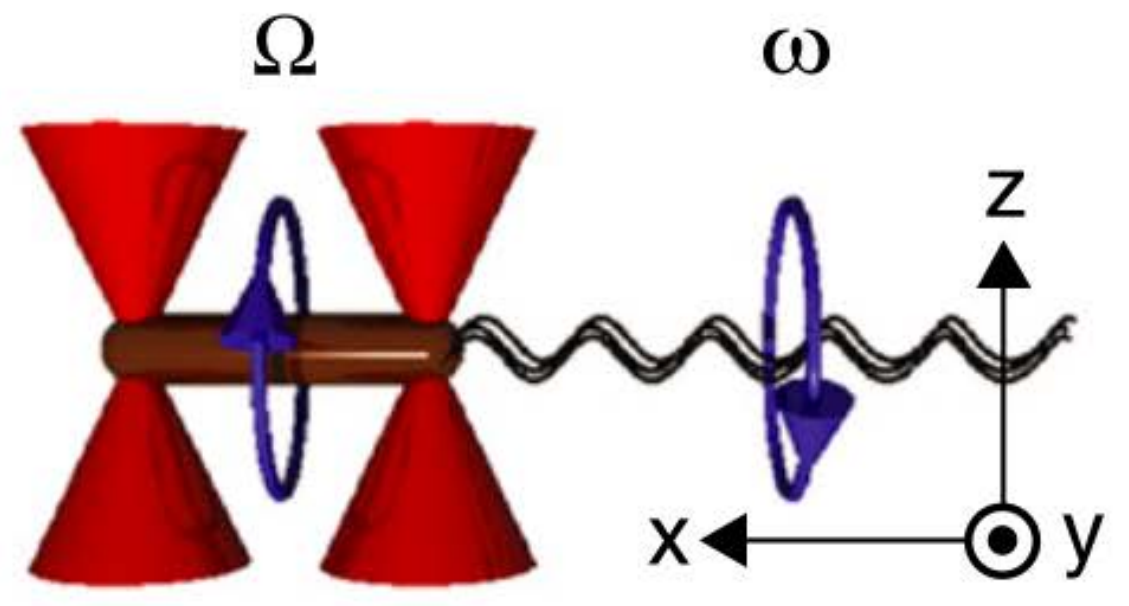


The network is sophisticated!

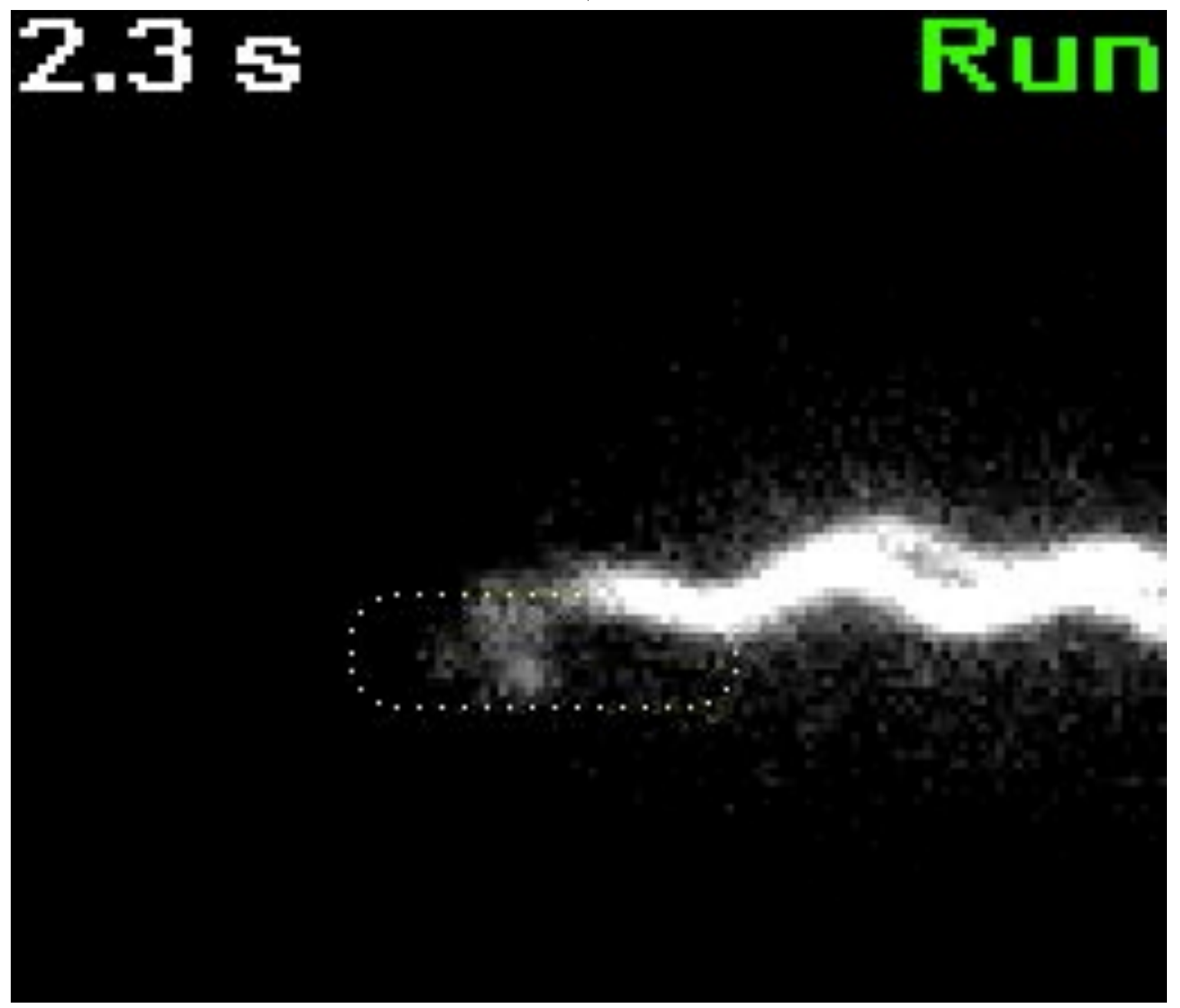
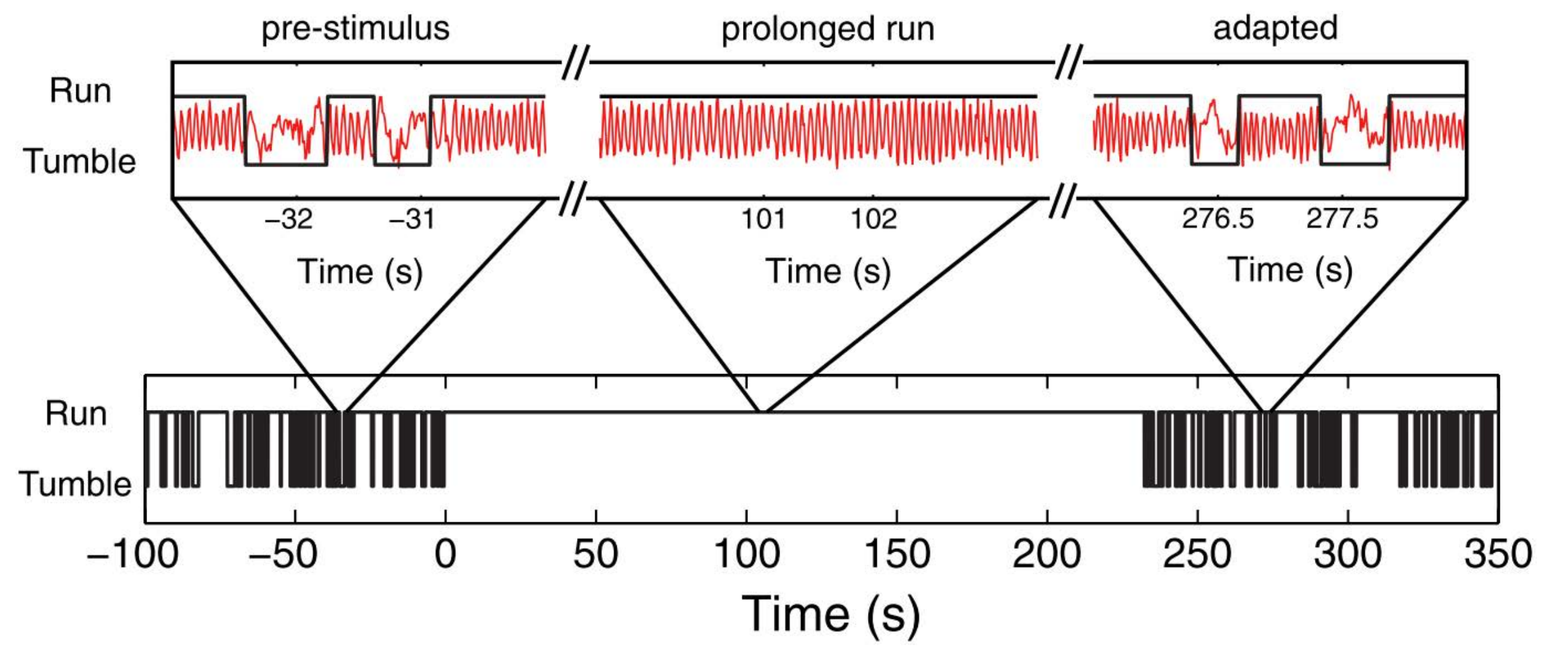
- (I) **Ultra-Sensitivity** - Detects gradients as little as three molecule change per cell volume.
- (II) **High Gain** - Cells can amplify stimuli over 50-fold.
- (III) **Precise adaptation** - Extends the range of concentrations that can be discriminated to five orders of magnitude.

Experiments and quantitative modeling studies point to receptor clustering within the array to explain enhanced signaling features.

Recent work from Chemla Group.



Optical traps characterize swimming behavior of single cells.



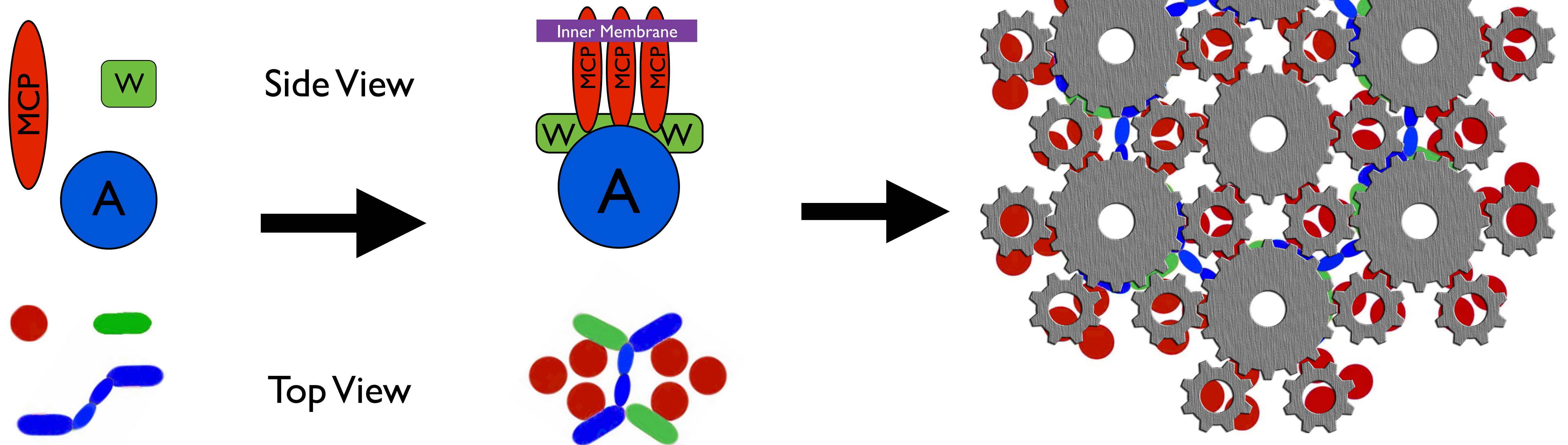
Individual run-tumble events are tracked revealing "abruptness" of adaptation.

Mathematical modeling and stochastic simulations suggest this characteristic adaptation response originates from clusters of interacting receptors.

Min, T. L. et. al. *Chemotactic adaptation kinetics of individual Escherichia coli cells*. Proc. Natl. Acad. Sci. USA (2012), 109(25), 9869–74.
Mears, P. et. al. *Escherichia coli swimming is robust against variations in flagellar number*. eLife (2014), 1–18.

The Bacterial Brain: A naturally-evolved, mechanical computer.

Thousands of copies of Methyl-accepting chemotaxis proteins + histidine kinases + adaptor proteins cluster to form the chemoreceptor array.



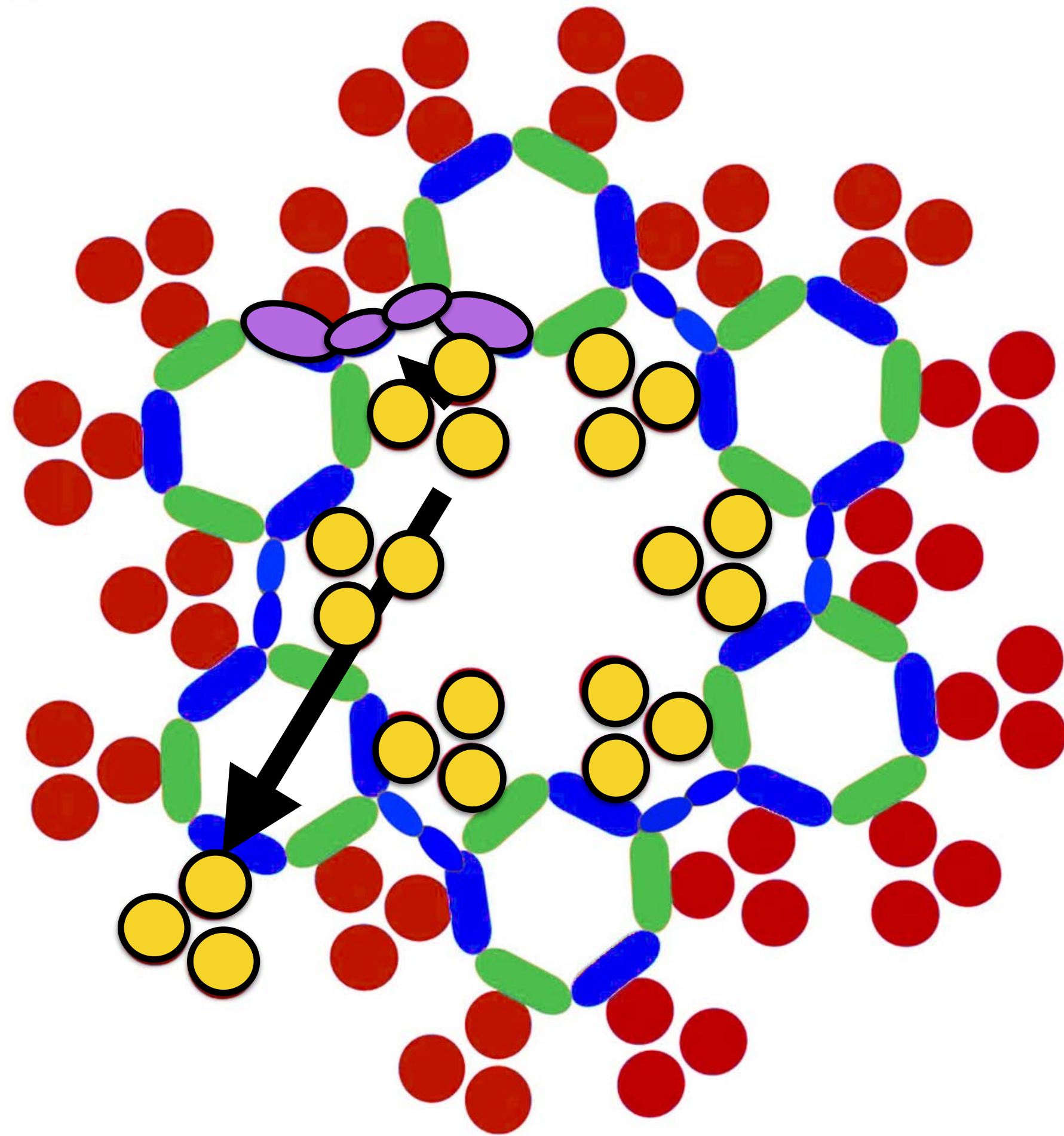
Main Point: Clustering = Complexity & Irreducibility
Average sized array contains ~15,000 proteins with surface area ~250x250 nm^{**2}.

The Bacterial Brain: A naturally-evolved, mechanical computer.

Key problem: What are the *molecular origins* of the enhanced information processing and distinctive signaling features of bacterial chemotaxis?

How does clustering lead to robust and cooperative signal transduction?

How does clustering lead to the characteristic signal regulation seen in Chemla experiments?



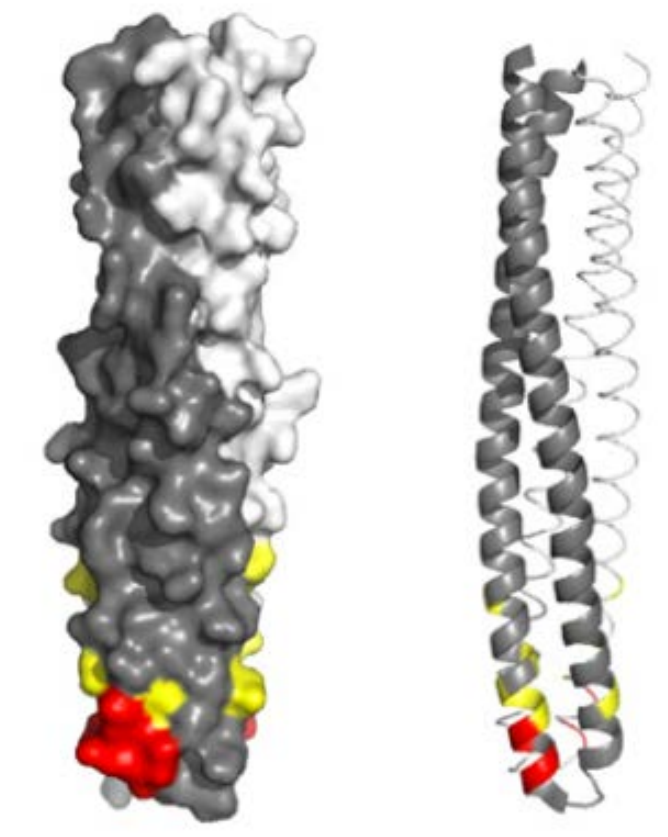
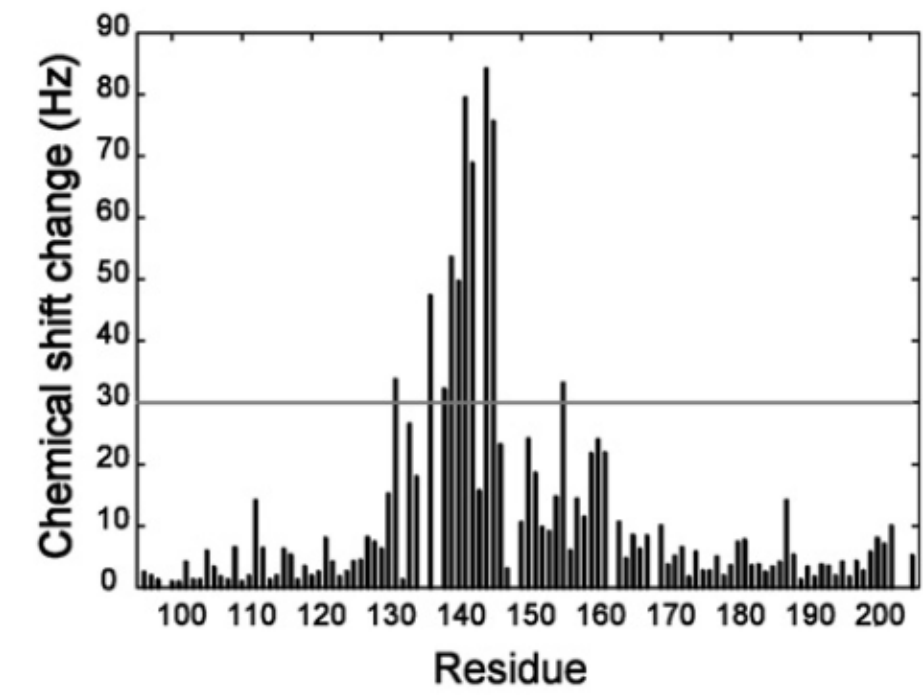
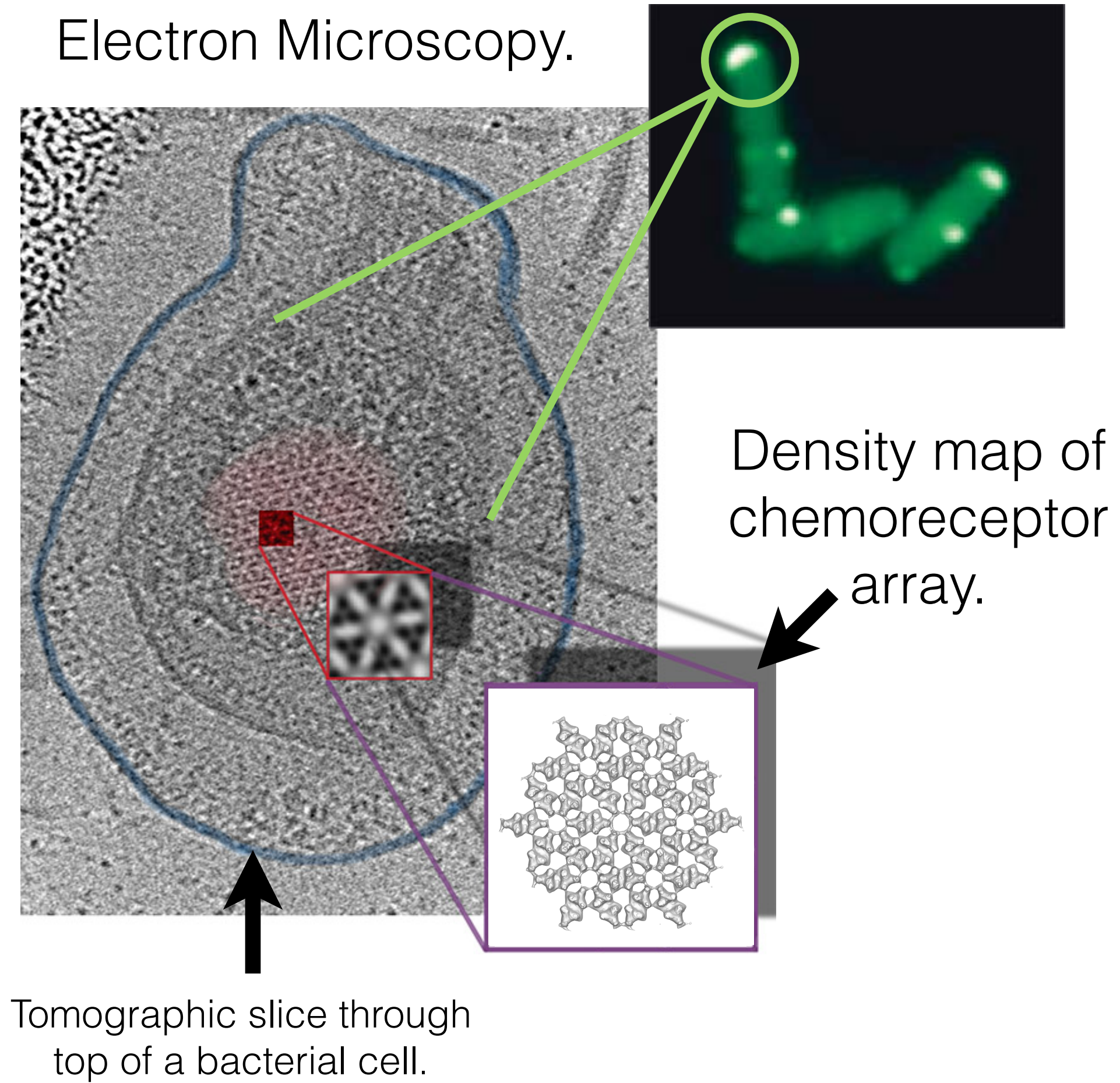
● “activated” chemoreceptor

● “activated” CheA

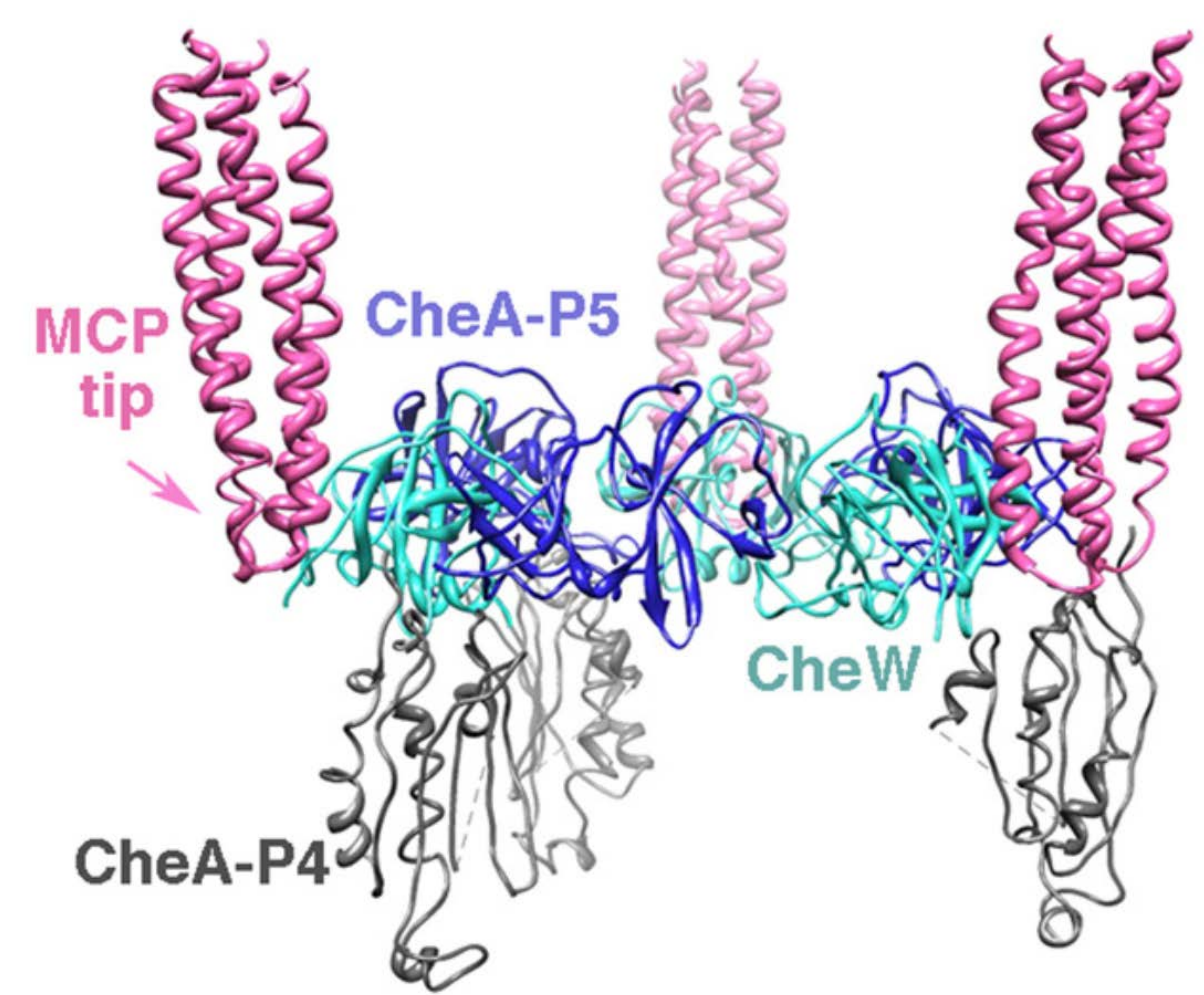
The Bacterial Brain: A naturally-evolved, mechanical computer.

Experiments have provided a lot of structural data...

Biochemical methods.



X-ray crystallography.



Such techniques alone do not currently provide the resolution needed to track structural changes essential to the array's computational ability

Vu, A. et. al. *The receptor-CheW binding interface in bacterial chemotaxis.* J. Mol. Bio. (2012), 415(4), 759–67.

Sourjik, V., Armitage, J.P., *Spatial organization in bacterial chemotaxis.* EMBO J. (2010), 29(16): 2724–2733.

Briegel, A. et. al. *Universal architecture of bacterial chemoreceptor arrays.* Proc. Natl. Acad. Sci. USA (2009), 106:17181-17186

Briegel, A. et. al. *Bacterial chemoreceptor arrays are hexagonally packed trimers of receptor dimers networked by rings of kinase and coupling proteins.* Proc. Natl. Acad. Sci. USA (2012). 109:3766–3771

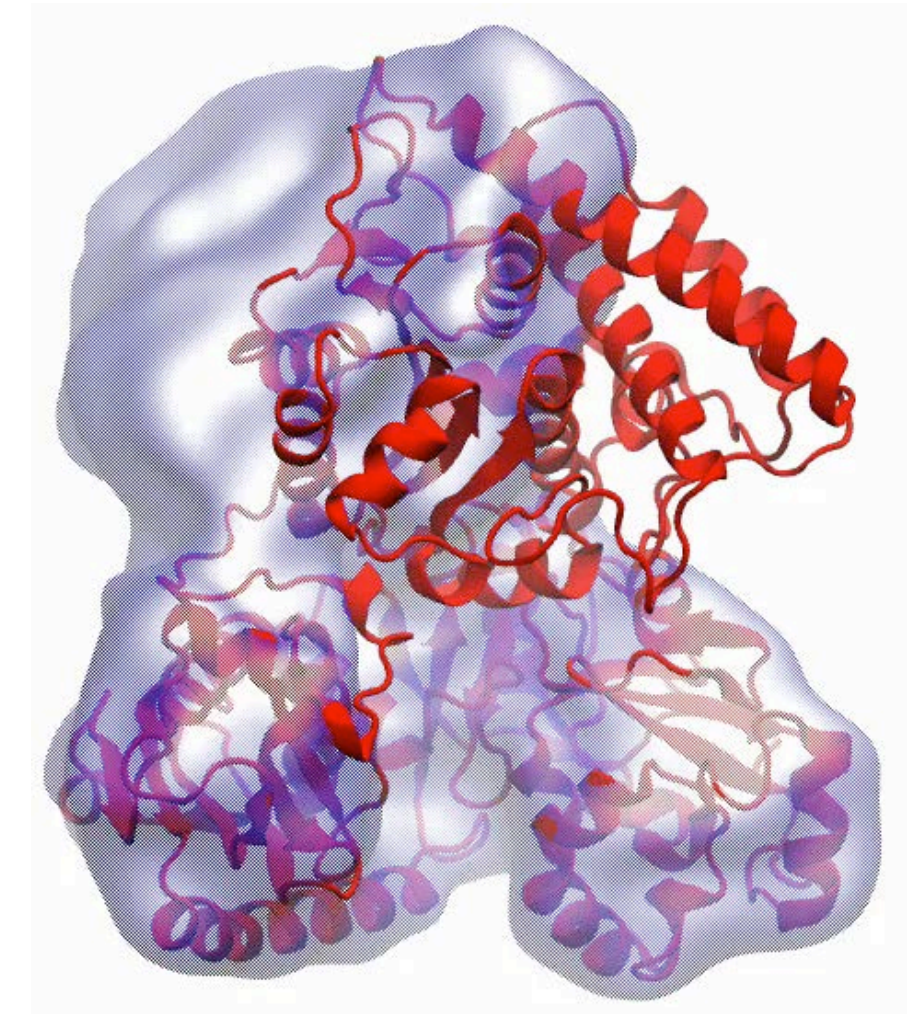
Why Computation?

Molecular dynamics (MD) simulations provide an excellent tool to investigate the *structural and dynamical properties* of biomolecules.



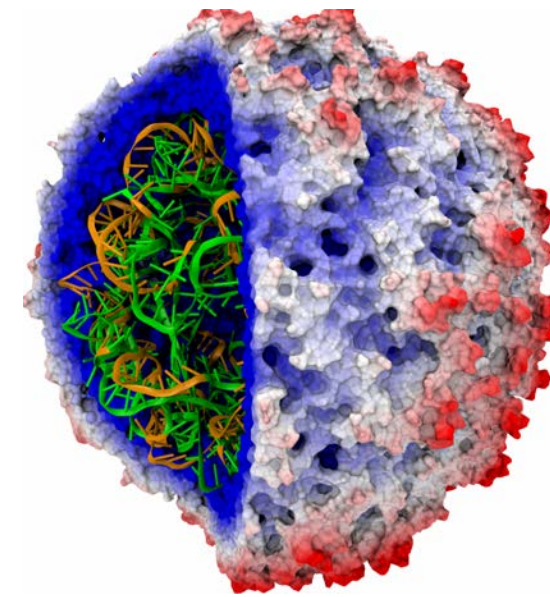
Computational modeling can *integrate multi-scale experimental data* into single model.

MDFF fitting of X-Ray structure into Cryo-EM map.

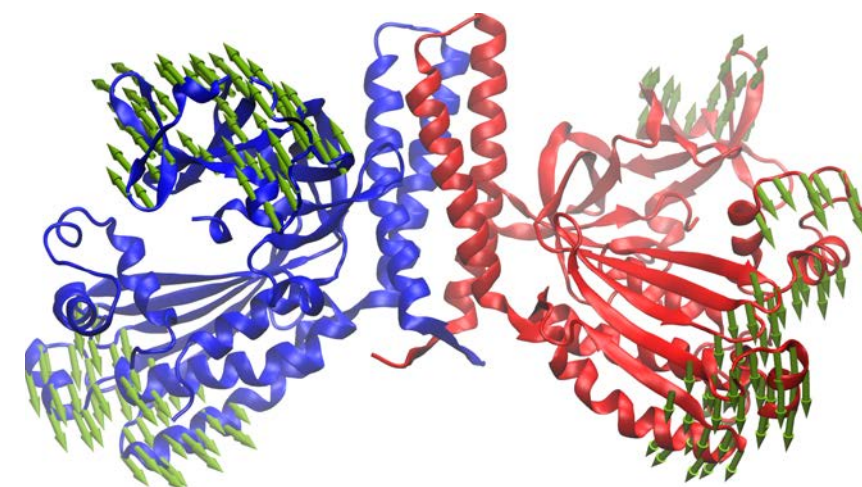


Analysis of MD trajectories allow the extraction of *important physical information* from the complex dynamics of biomolecules.

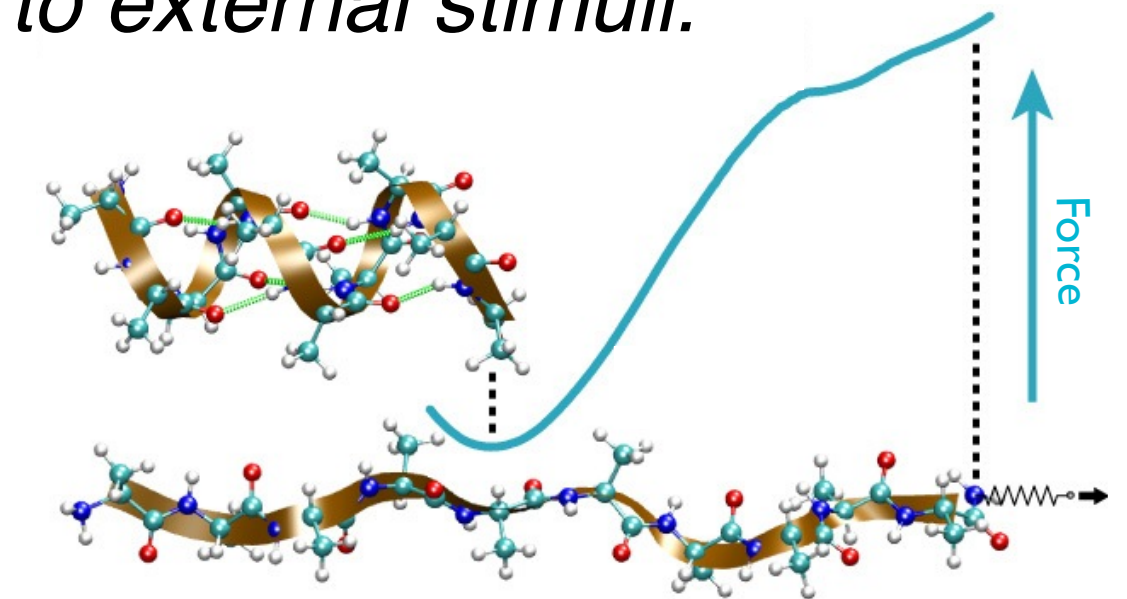
Electrostatic potential of STMV capsid.



Steered MD provides the ability to systematically exert forces on biomolecules to investigate *responses to external stimuli*.



Principal Component Analysis (PCA) of CheA protein.



“Steered” stretching of deca-alanine.

The “Computational Microscope”

Until recently it has been impractical to investigate such a large, multi-protein complex using available computational techniques and facilities....

Why Blue Waters?

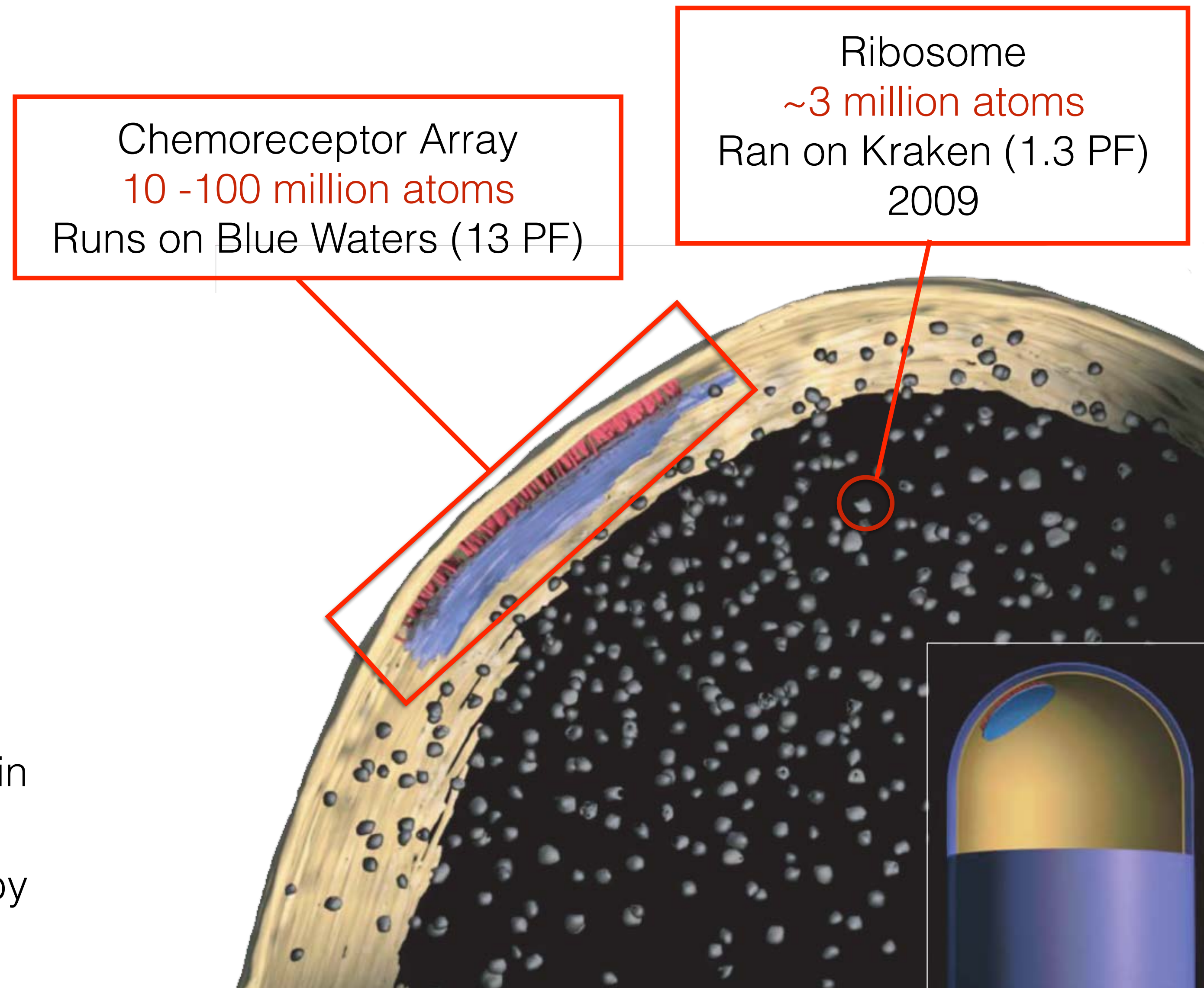
The Chemoreceptor array is a **petascale** system...

The array is **necessarily** large...

- The array's computational ability emerges from the collective interactions of its many parts.
- Faithfully representing the irreducible nature of the native array structure is essential.

...And needs **all-atom** detail.

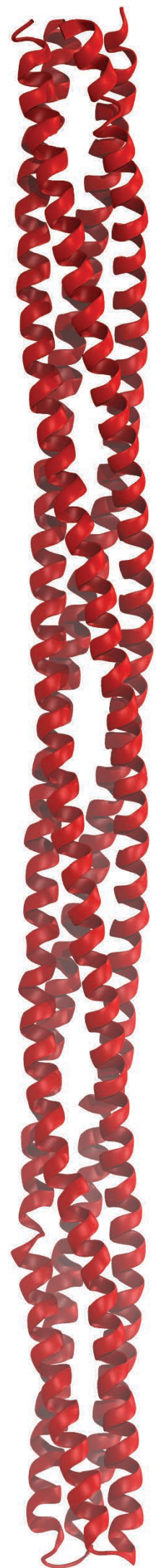
- Experiments point to minute, allosteric rearrangements (i.e., not large-scale changes in structure).
- Mechanisms are subtle and could be missed by CG model.



Computational Modeling of Chemoreceptor Array.

1 Begin with high-resolution crystal structures.
(Non-native environment)

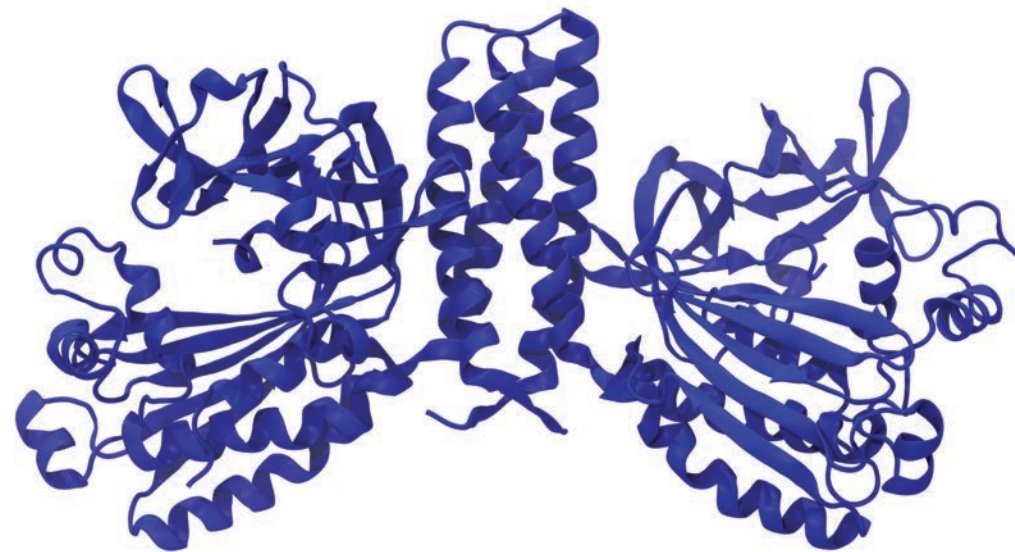
2 Computational modeling of array oligomers.



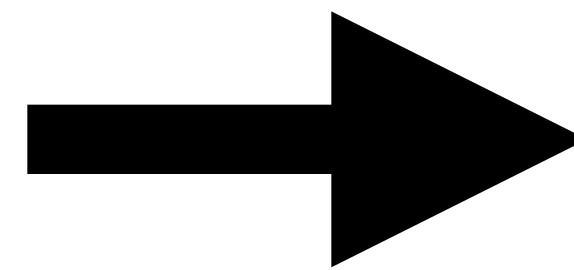
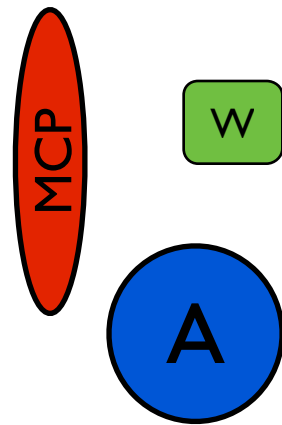
Chemoreceptor dimer
MCP
PDB: 2CH7



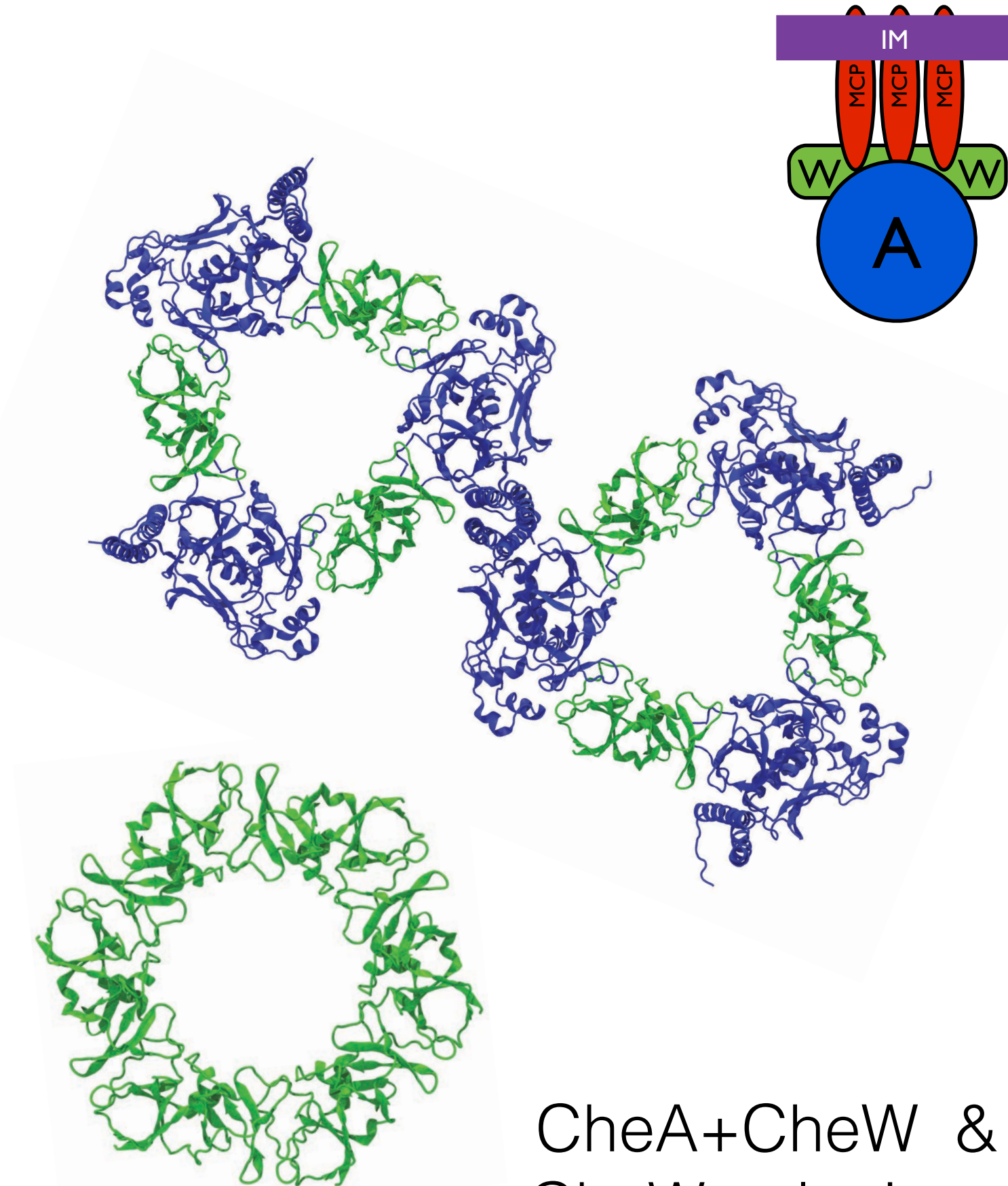
CheW
Adaptor protein
PDB: 3UR1



CheA
Histidine Kinase
PDB: 1B3Q



Trimers of chemoreceptor
dimers (TODs)
PDB: 1QU7



CheA+CheW &
CheW only rings
PDB: 3UR1

Chaperonin (GroEL) protein dimers

(700) million atoms

11 x GroEL dimer

9 x CpnA dimer

24 x CheW

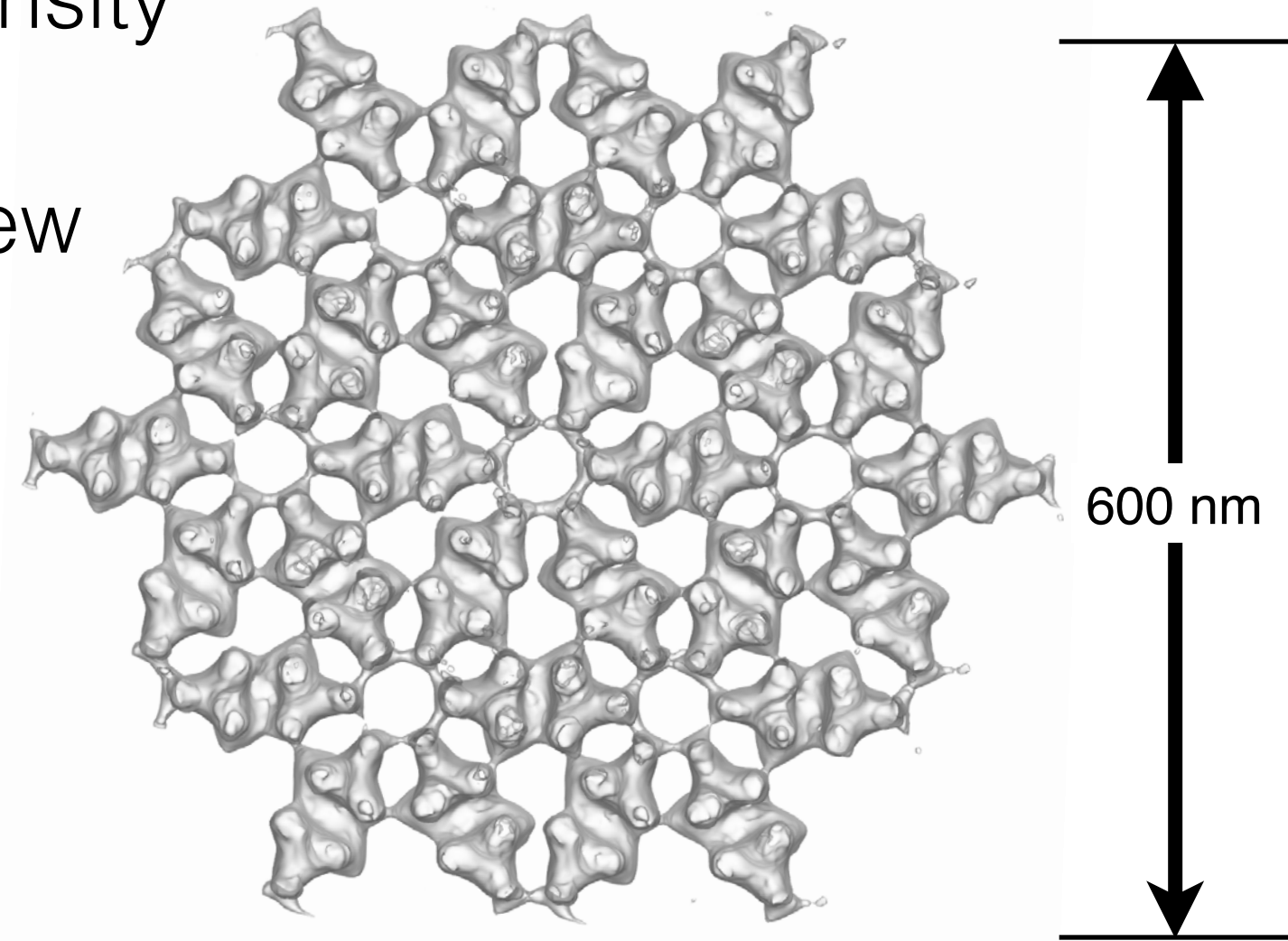


Computational Modeling of Chemoreceptor Array.

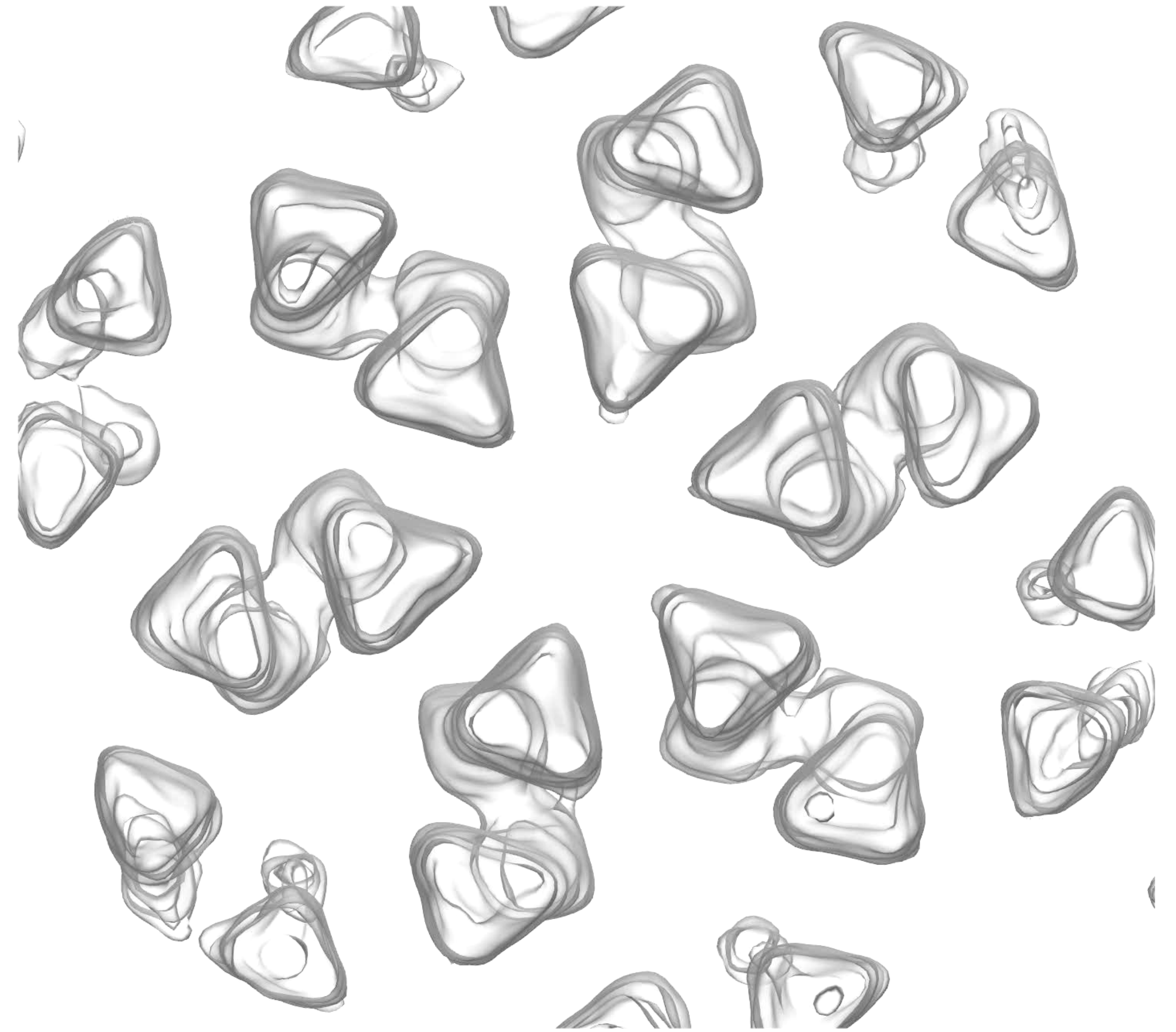
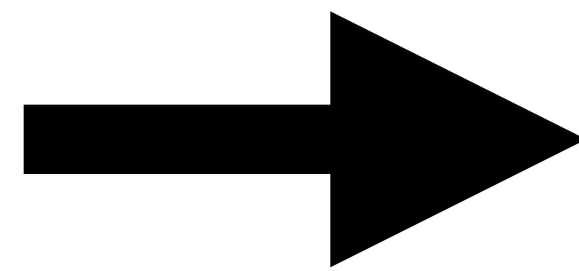
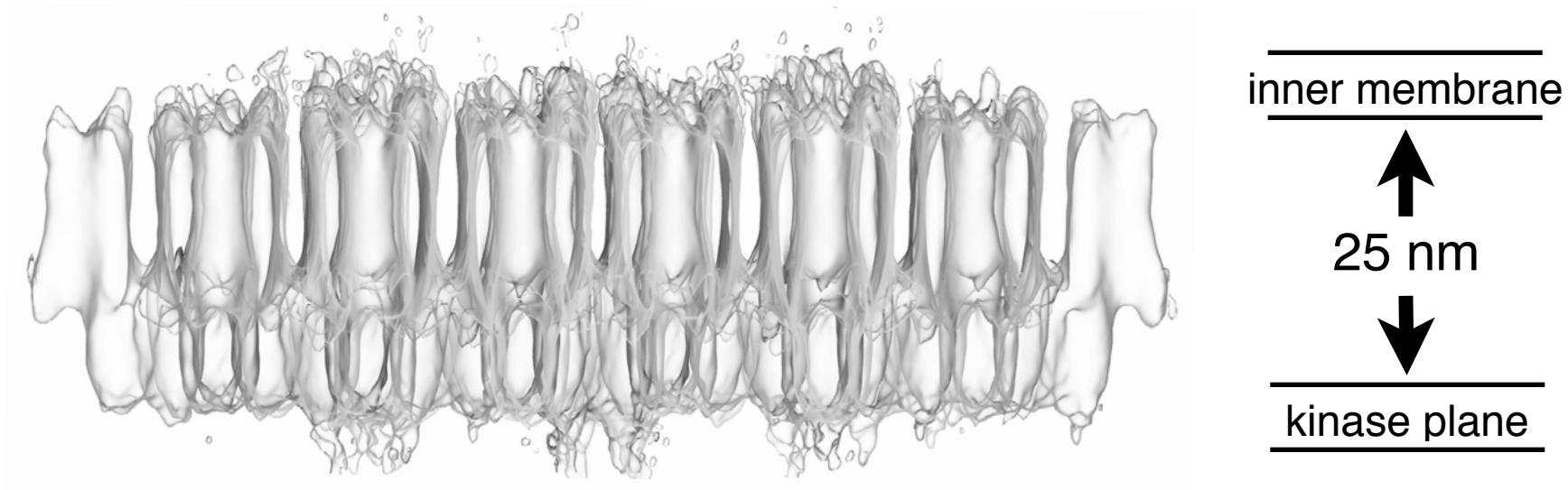
3 Electron Microscopy-guided modeling and refinement.
(Native environment)

EM Density

Top View



Side View

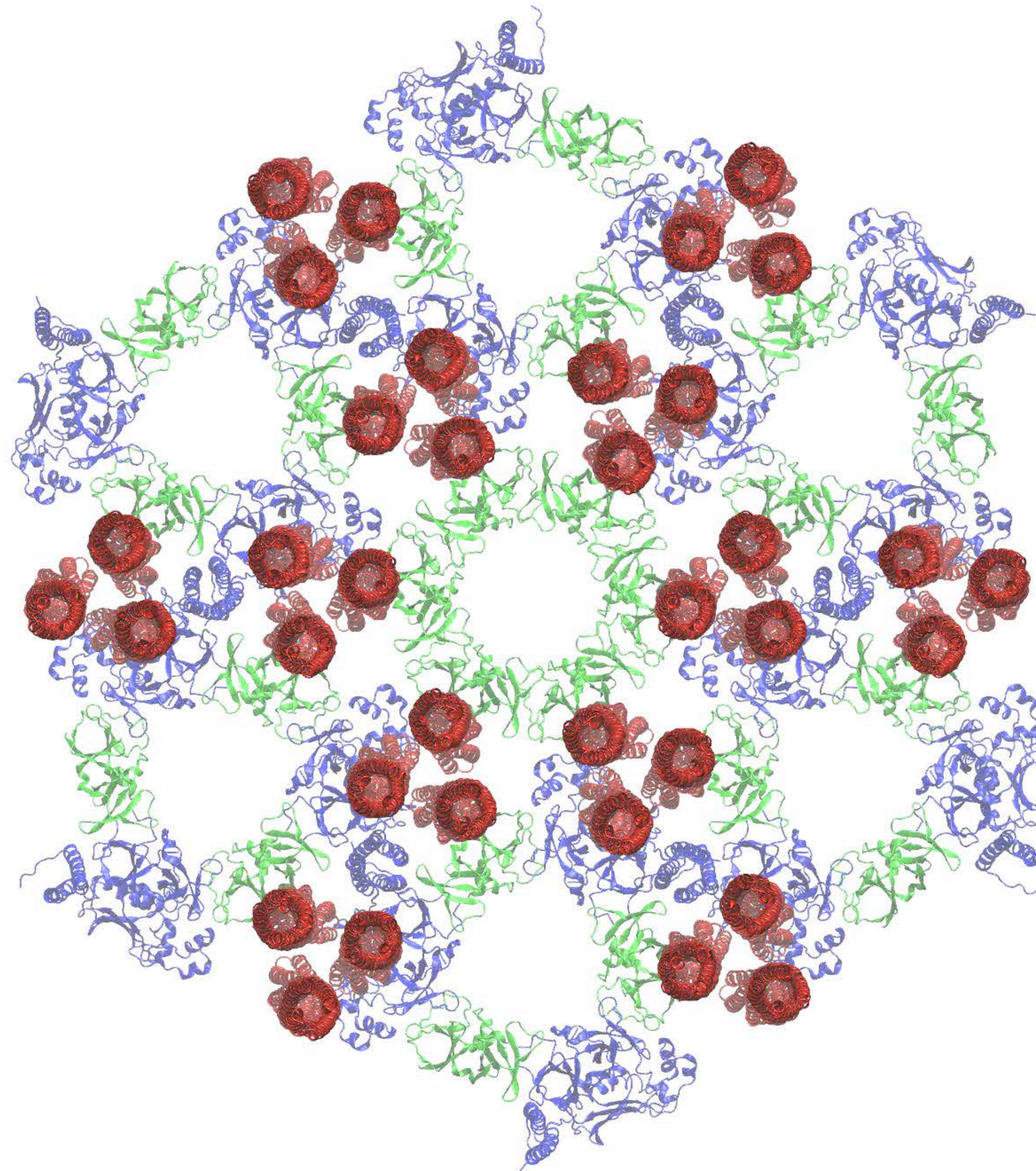


Lattice Model, *~50 million atoms*

An experimentally-guided, all-atom model of chemoreceptor array is now available.

With this model, Blue Waters is allowing us to explore the chemoreceptor array as never before.

Simulations have already offered great insight!

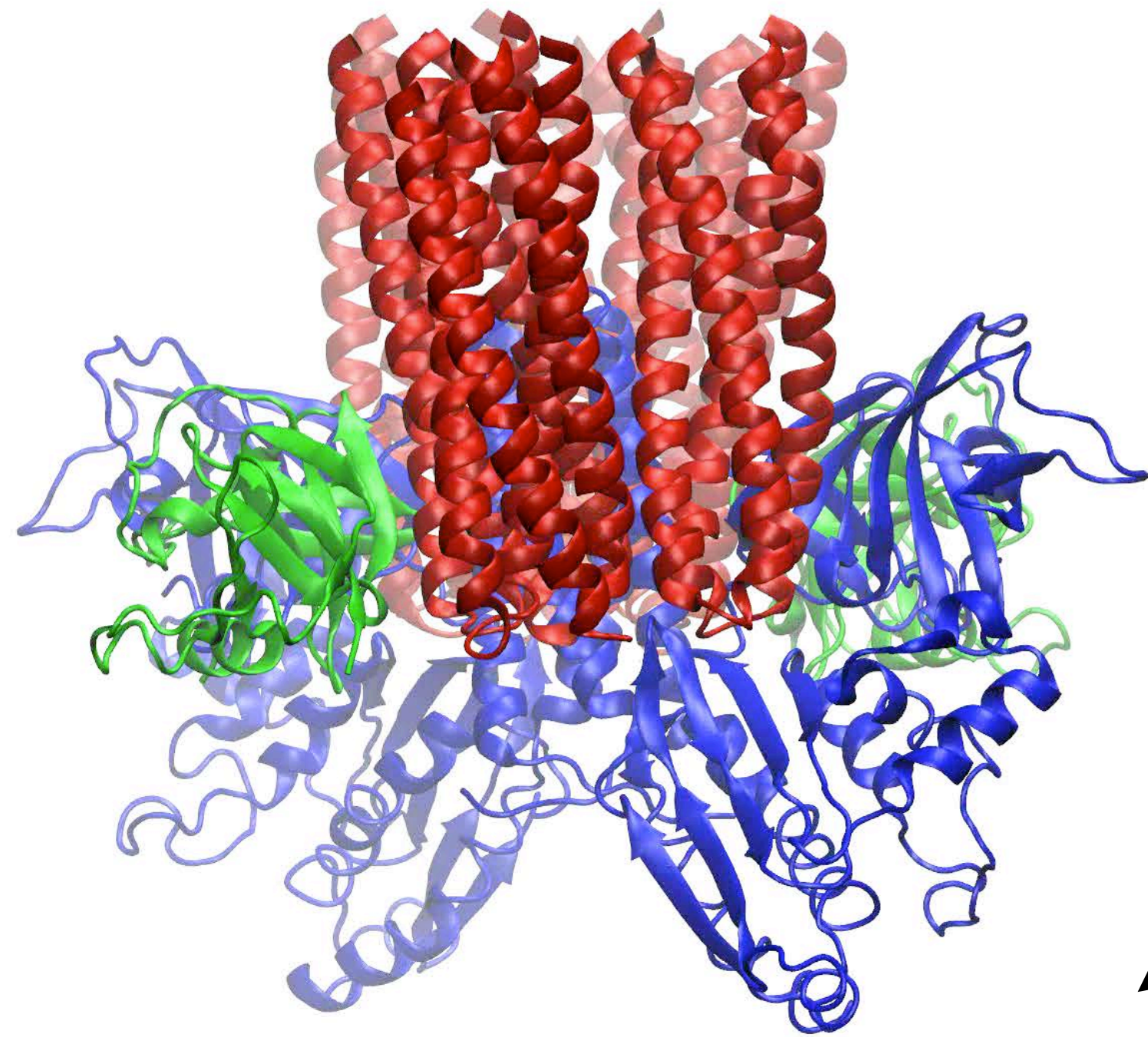


Simulation of Chemoreceptor Array.

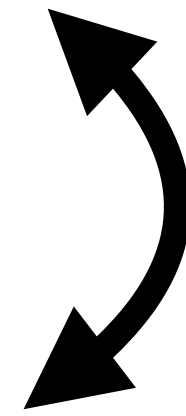
1. How is receptor activity physically transducer to CheA?

2. How are the activities of different receptors coupled?

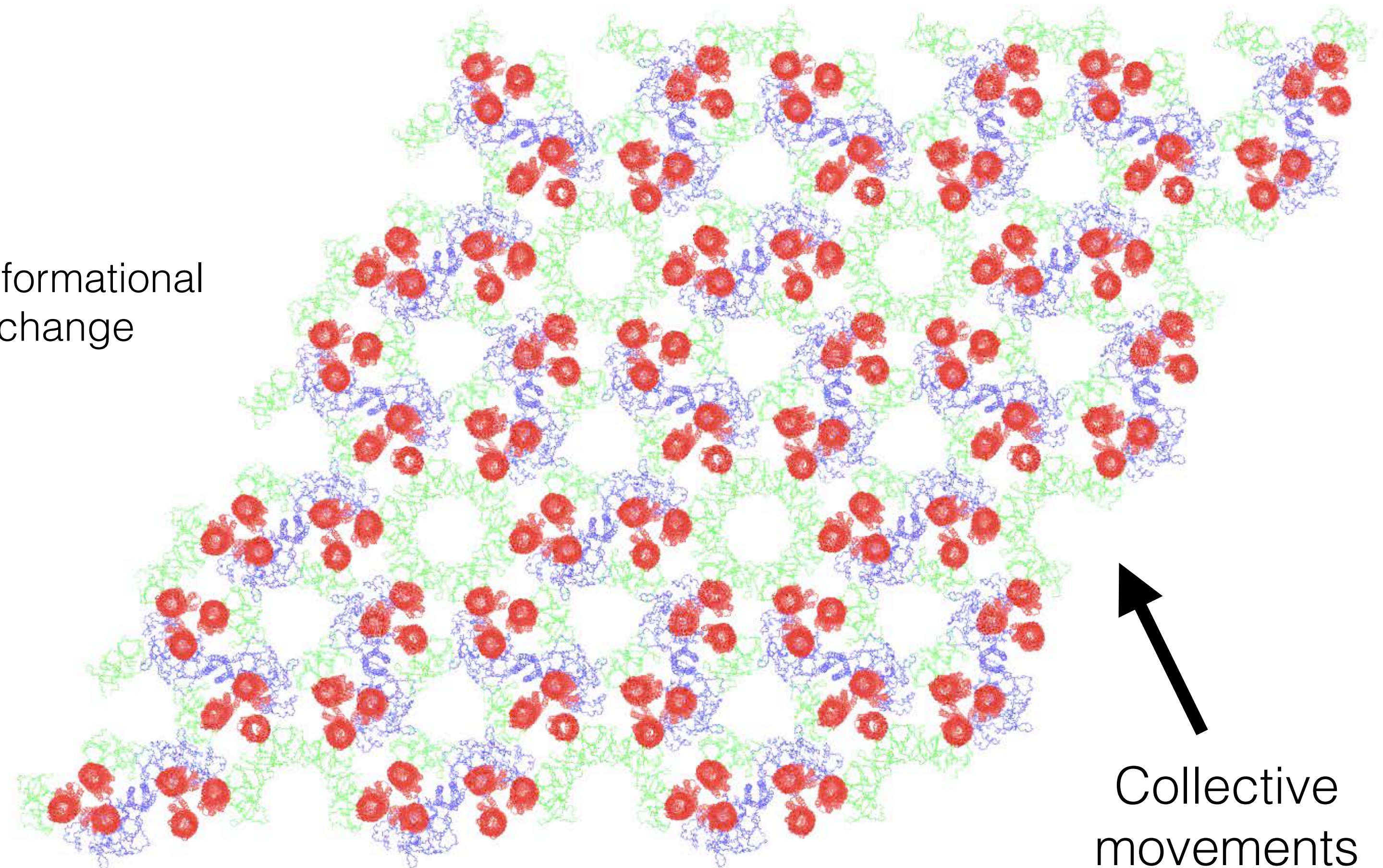
Modes extracted from simulation trajectories using PCA establish routes of communication between proteins.



Conformational change



“Dip” in CheA domain possibly modulates kinase activity and is regulated by interactions with chemoreceptors.



Collective movements

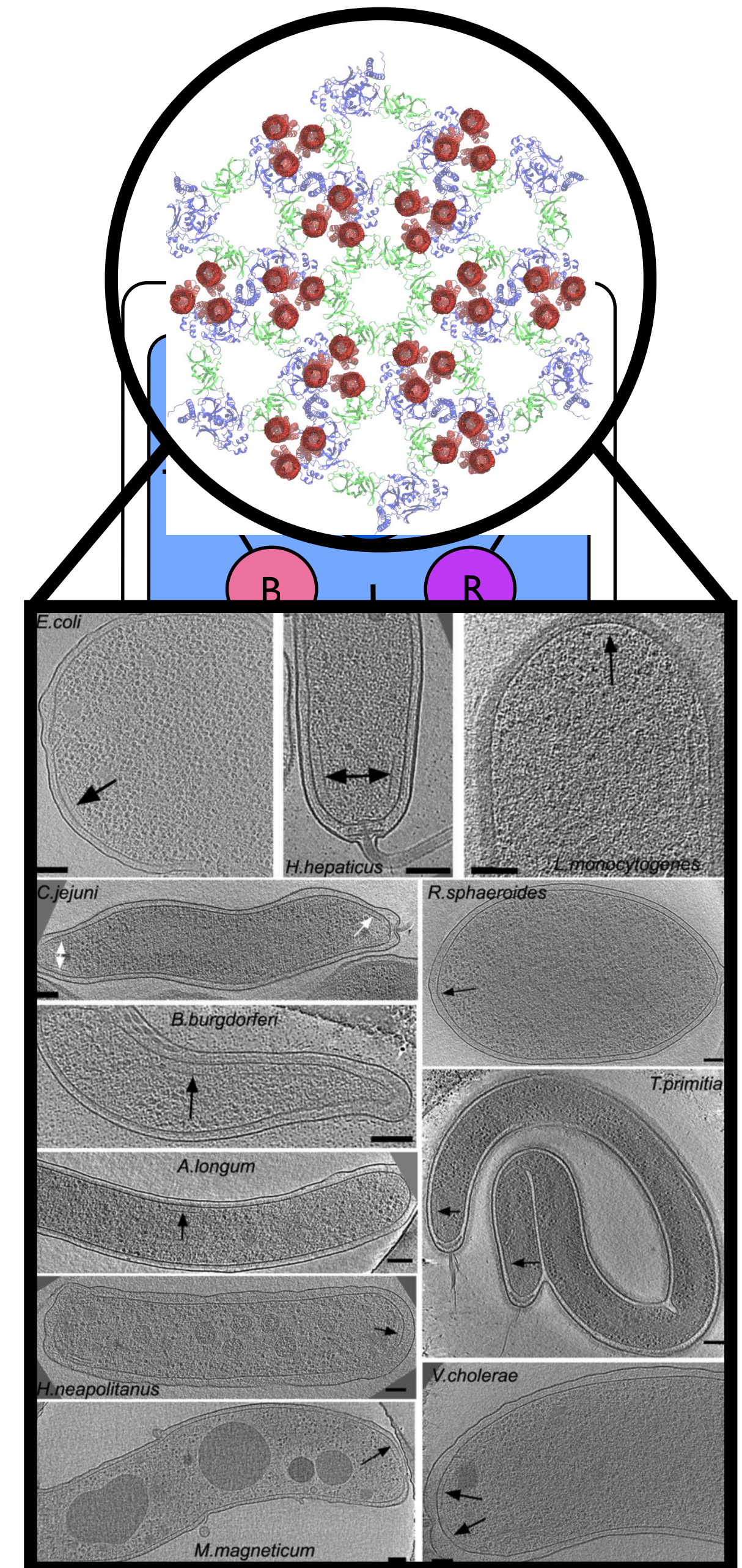
Scientific Significance.

Represents the first theoretical study of sensory signal transduction in a basic biological computer and sheds light on the fundamental mechanisms by which biological systems process information in general.

Provides a generalization of functional architecture between a wide range of bacterial chemotactic systems.

Combined with the diversity of function that in natural organisms of array function could provide *mass reprogramming* and the development of novel antibiotics and fungicides.

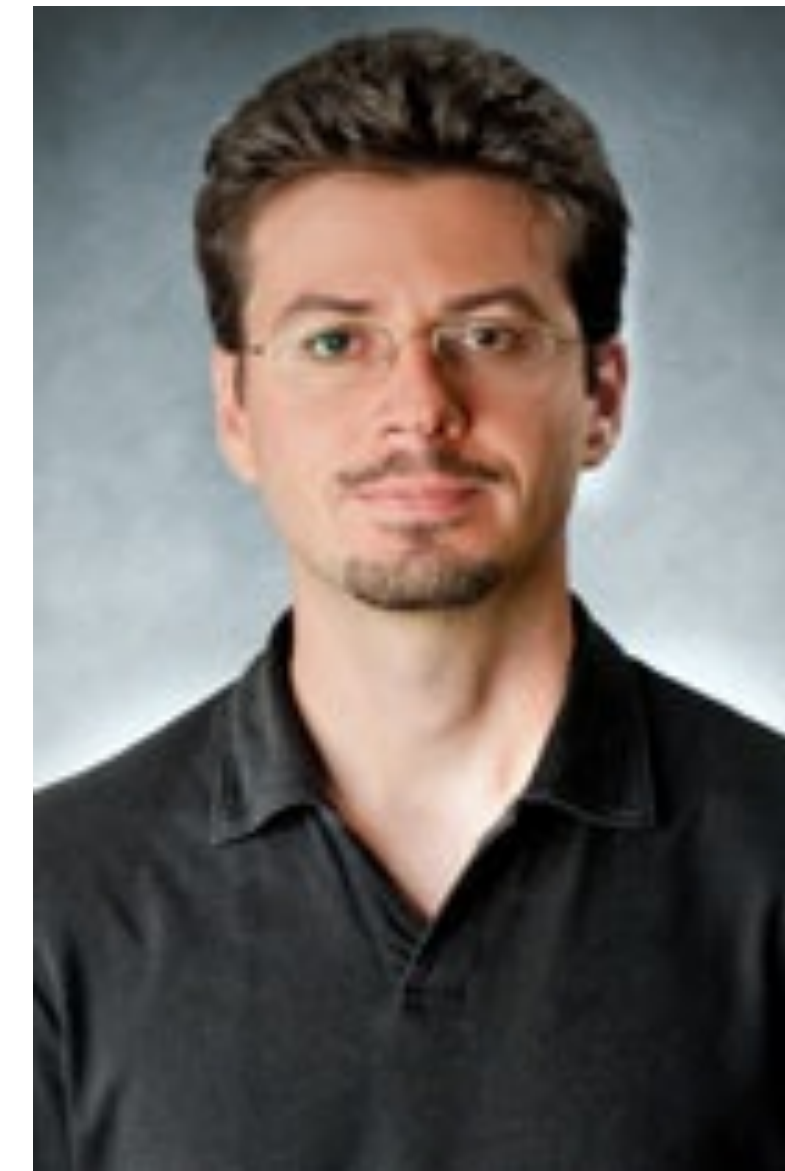
Main point: Blue Waters is providing the unique, atomistic perspective needed to tackle a fundamental and previously inaccessible problem in biological information processing.



Acknowledgements.



Prof. Klaus Schulten
Department of Physics
CPLC



Prof. Yann Chemla
Department of Physics
CPLC



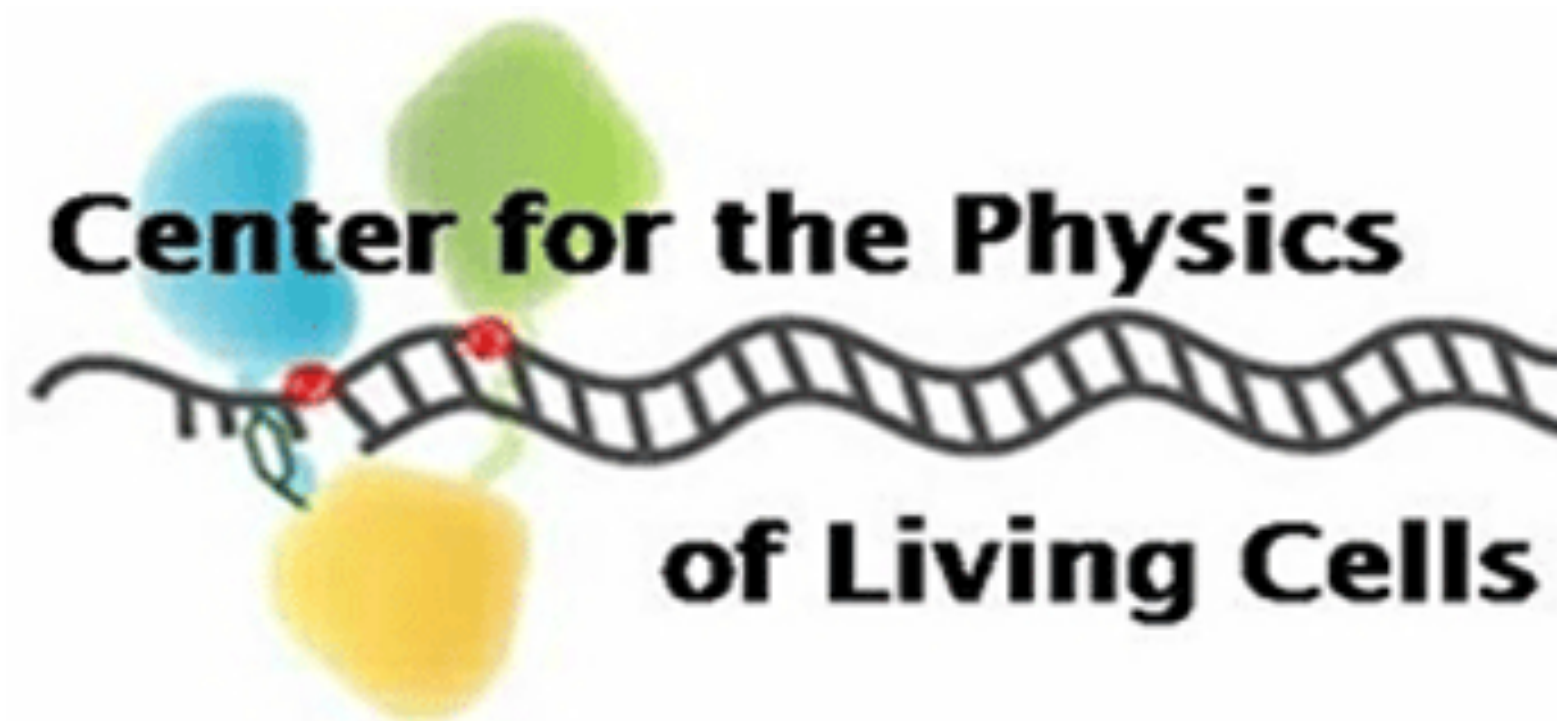
Dr. Juan Perilla
Beckman Institute
UIUC



Blue Waters sustained-petascale computing project



National Center for Supercomputing Applications



Center for the Physics of Living Cells
NSF Physics Frontier Center, UIUC



UIUC

Thanks for listening!

Questions?

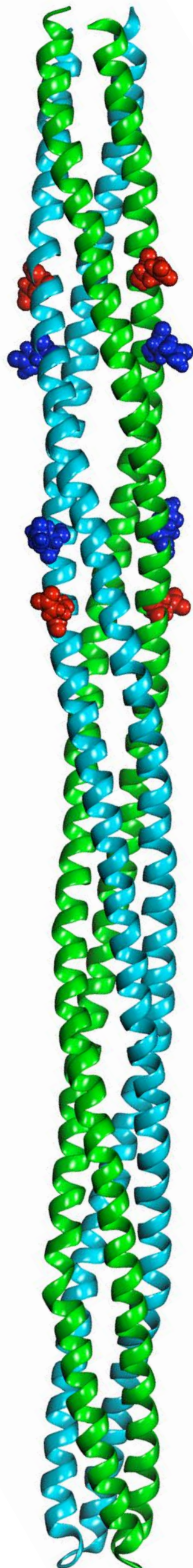
- How is receptor activity physically coupled to kinase activity?
- How are the activities of different receptors physically coupled?

- How does overall architecture of the array lead to distinctive cell-scale regulation of CheA activity observed in Chemla experiments?

Mathematical modeling and stochastic simulations suggest this characteristic adaptation response originates from clusters of interacting receptors. These studies have

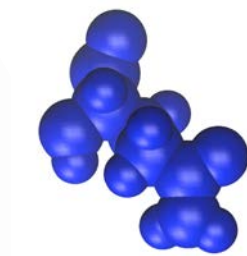
revealed a characteristic

“all or none” single-cell swimming behavior. Experiments and quantitative modeling studies point to receptor clustering within the array to explain enhanced signaling features.



4-5 methylation sites per MCP
Wild-type (QEQE)

Glutamic Acid (E)



Glutamine (Q)

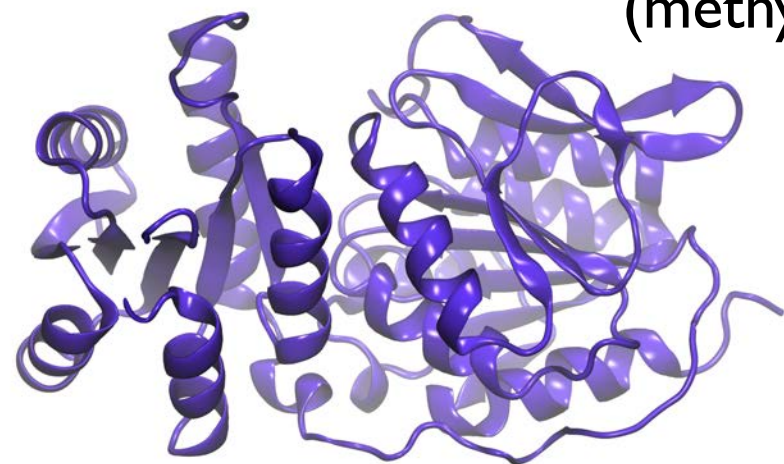
Gln (Q) mimics methylated Glu (E),
encoding median level of activity

The cell remembers!

Bacterial cells temporally compare
chemoeffector concentrations
through receptor methylation levels

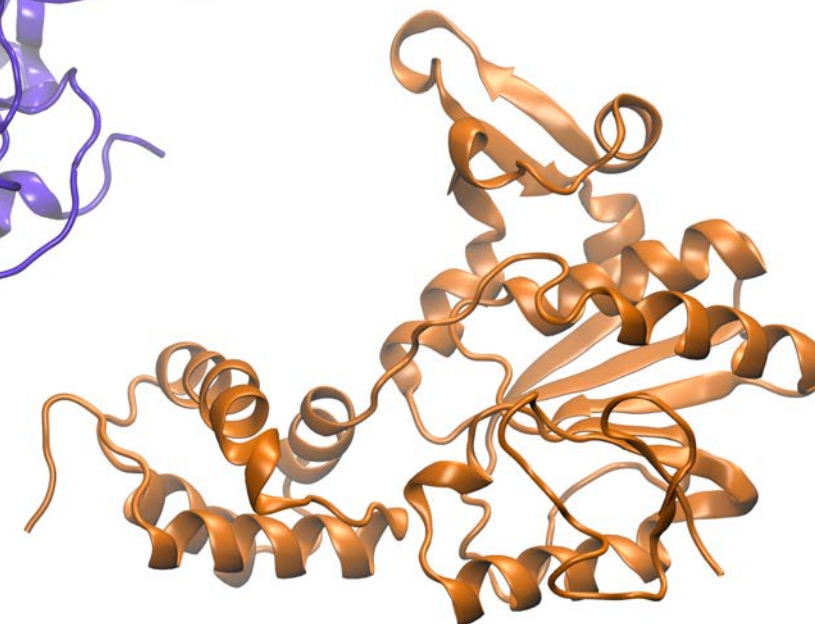
CheR

(methyltransferase)



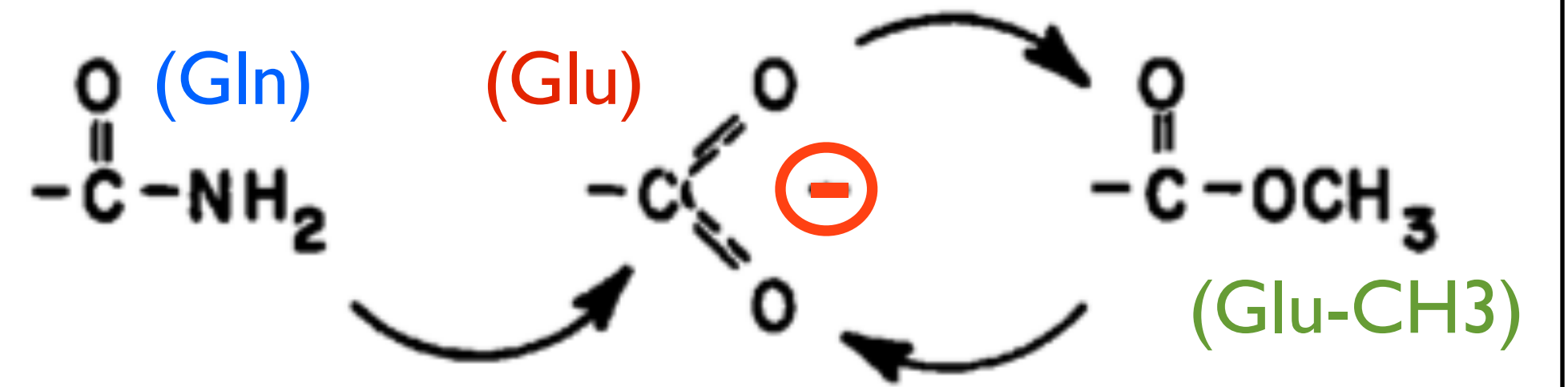
CheB

(methyl-esterase)



Adaptation methylation

CheR methylates Glu

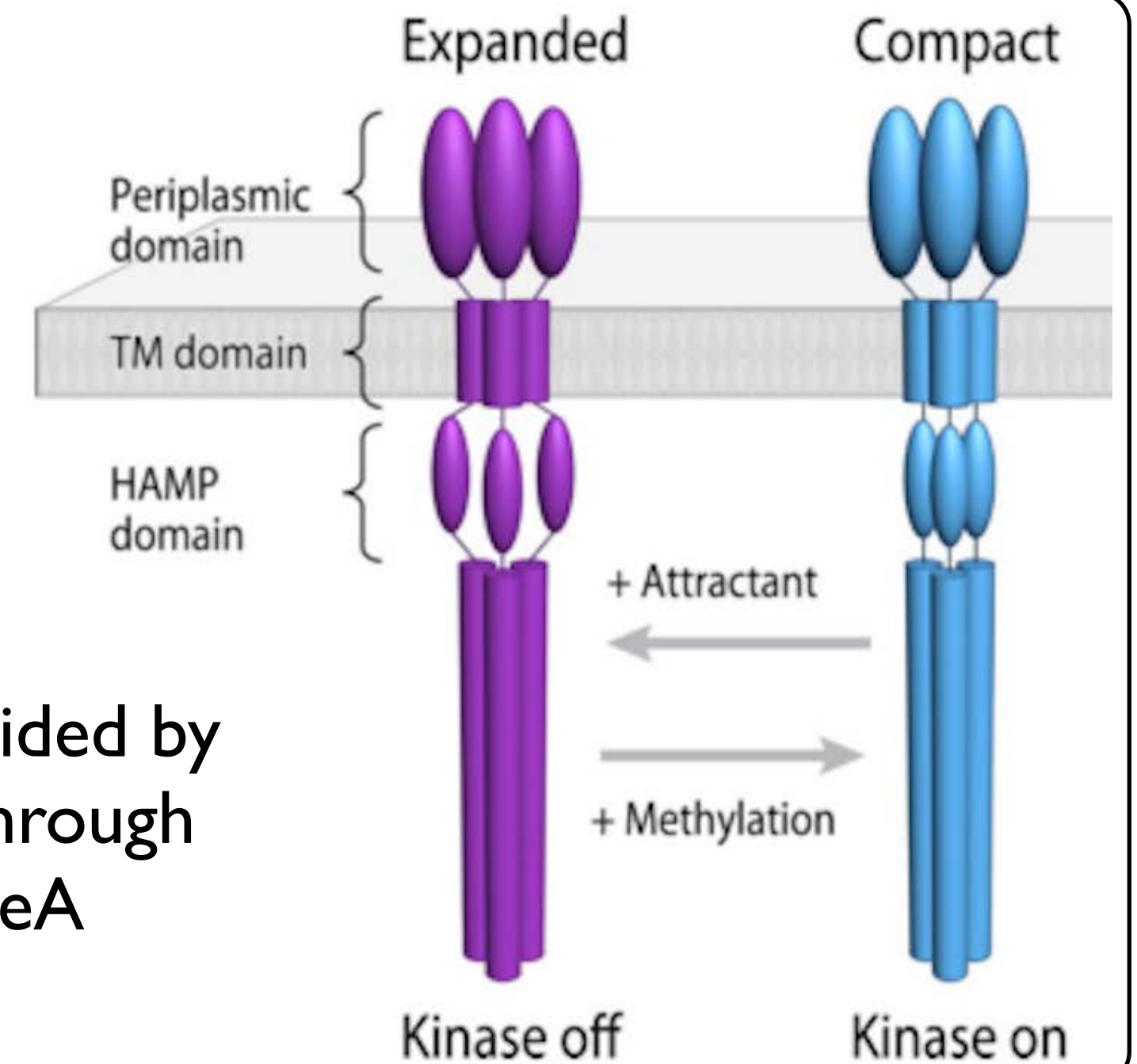


Gln is deamidated by
CheB to participate
in adaptation process

CheB demethylates
Glu-CH3

Receptor methylation alters
distribution of receptor
trimer-of-dimers
conformations and CheA
activity

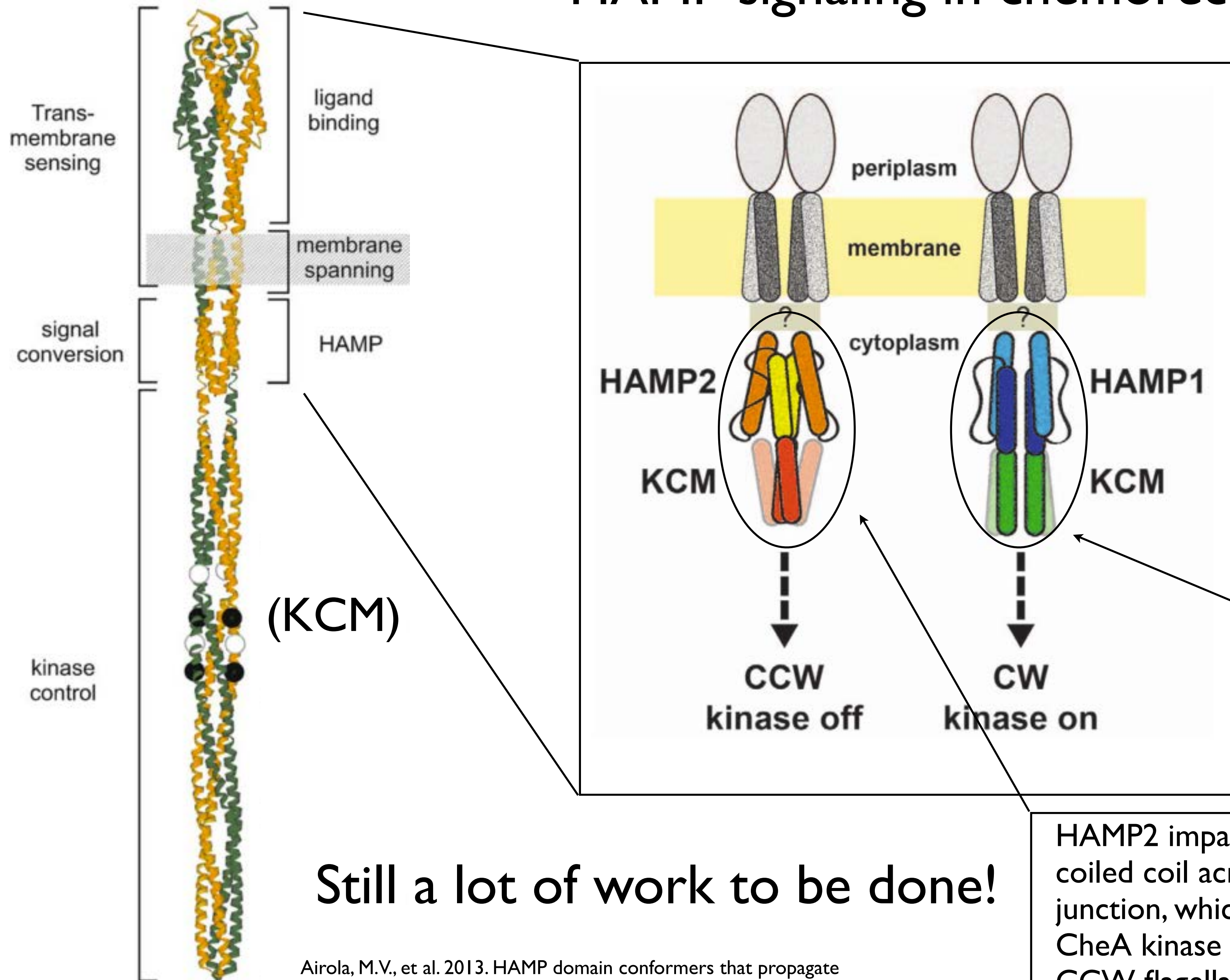
Feedback mechanism provided by
increased CheB activity through
phosphorylation by CheA



HAMP signaling in chemoreceptors

Current Opinion

1. Stimulus-induced conformational changes are conveyed to HAMP domains through piston or rotary motions from adjoining transmembrane helices
2. Input stimuli modulate HAMP signaling by shifting the relative stabilities of two alternative HAMP structural states to regulate bacterial chemotaxis.
3. HAMP domains probably control the output activity by modulating the packing stabilities of the output helices through oppositional structural coupling.



Still a lot of work to be done!

Airola, M.V., et al. 2013. HAMP domain conformers that propagate opposite signals in bacterial chemoreceptors. *PLoS Biol* 11(2)

HAMP2 imparts a two-helix coiled coil across KCM junction, which results in CheA kinase inhibition and CCW flagella rotation.

A dynamic HAMP1 forms a continuous four-helix coiled coil across the junction to generate kinase activation and CW flagella rotation.

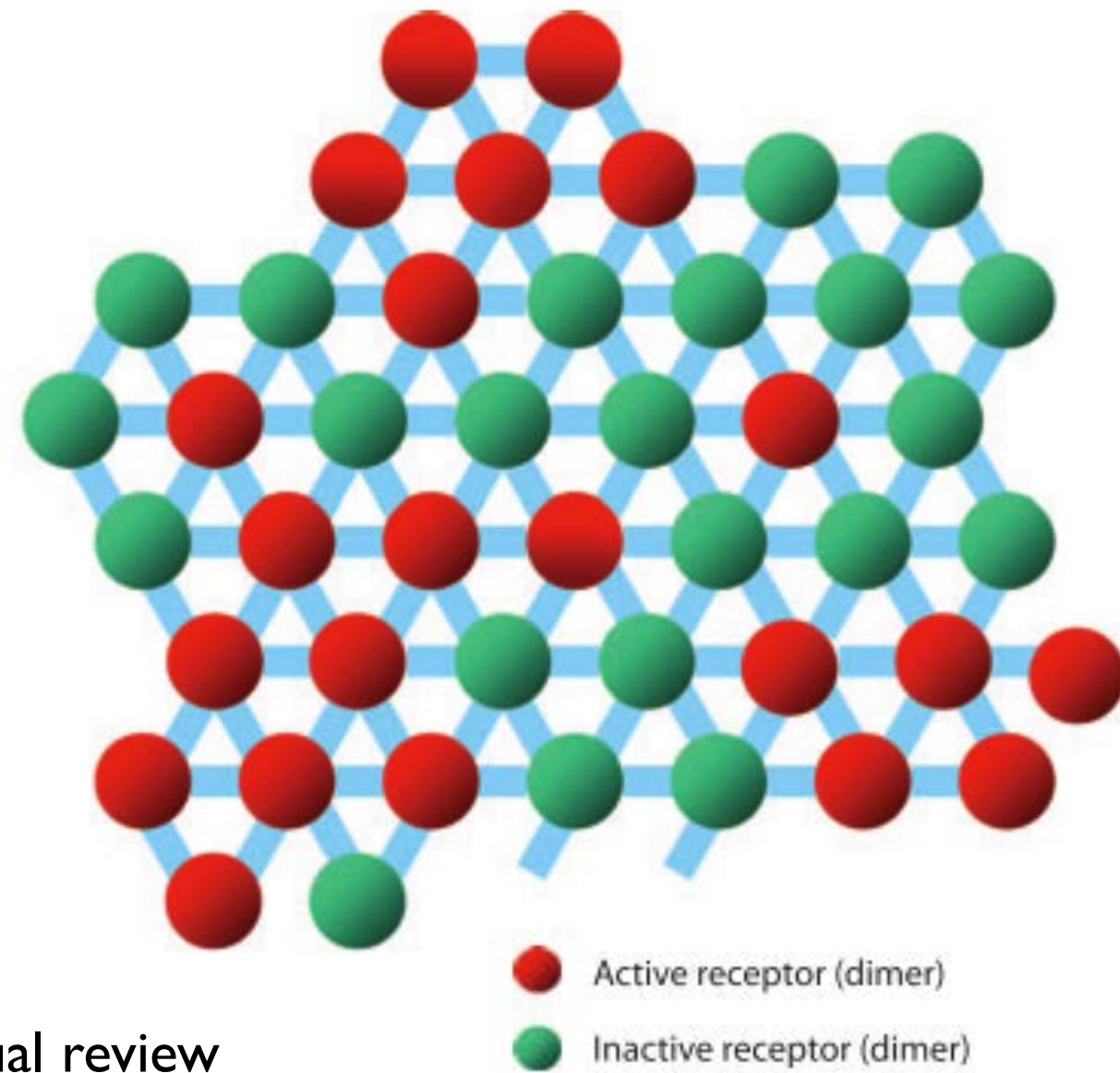
Theoretical Insights

Gain & Sensitivity

The Ising model is often used to model two-state nature of chemoreceptor signaling

$$\langle a \rangle = \frac{e^{-f_m(m)}(1 + [L]/K_a)}{1 + [L]/K_i + e^{-f_m(m)}(1 + [L]/K_a)}$$

The Ising model



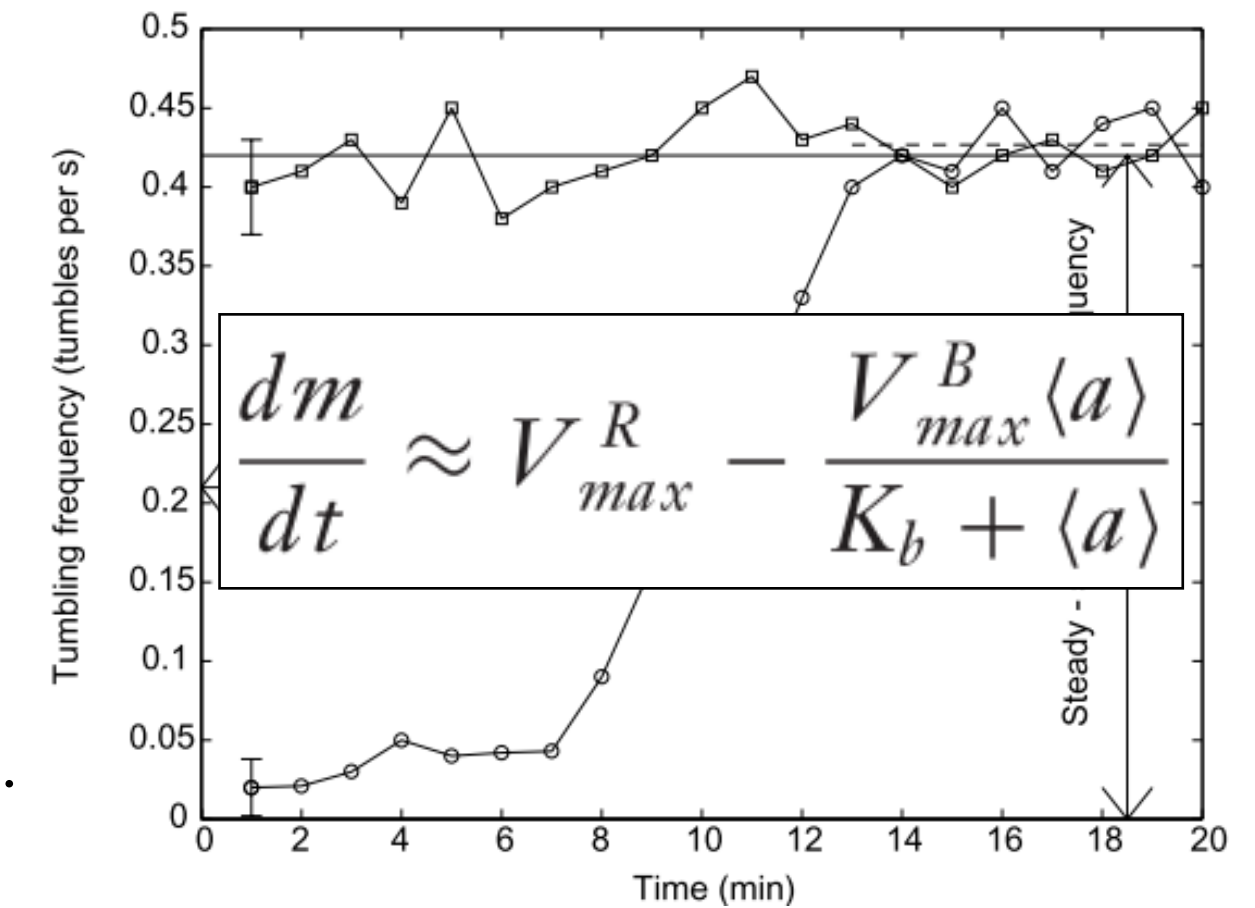
Tu, Y., 2013. Annual review of biophysics. 42, 337-359.

Tindall, M. J., Maini, P. K., Porter, S. L., & Armitage, J. P., 2008. Bulletin of mathematical biology. 70(6), 1570-1607.

Adaptation

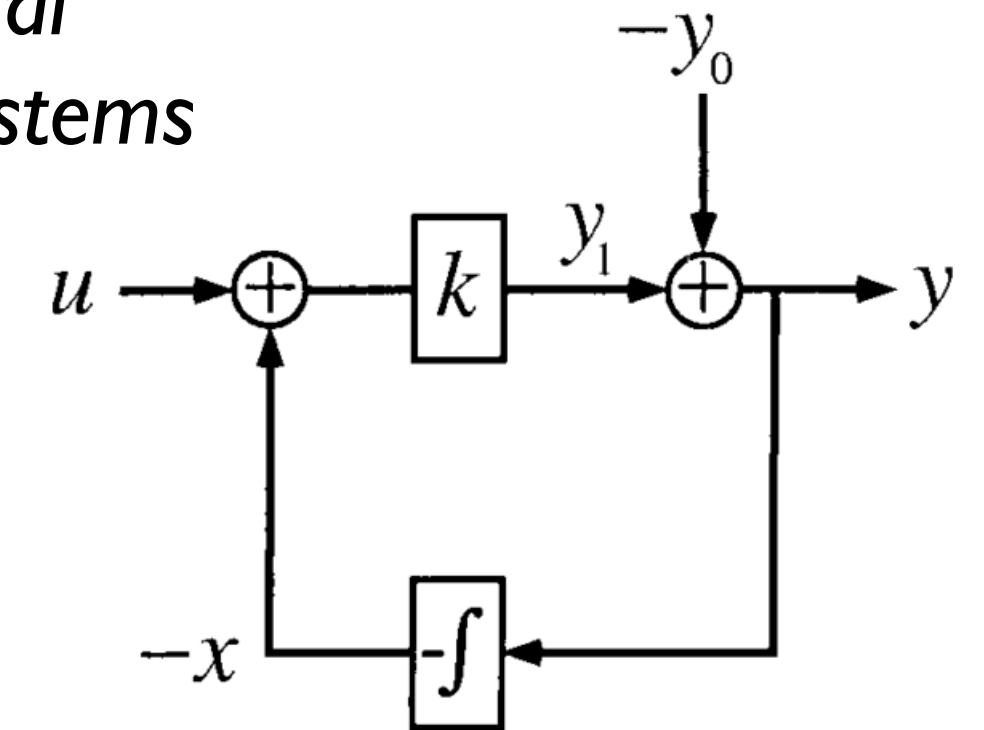
The bacterial chemotaxis network exhibits precise adaptation that is robust against variation in biochemical parameters

Alon, U., Surette, M. G., Barkai, N. & Leibler, S., 1998. Nature. 397, 168-171.



Such coarse-grained approaches can be tuned to match experiment, but do not allow investigation of the underlying molecular details giving rise to such systems-level features

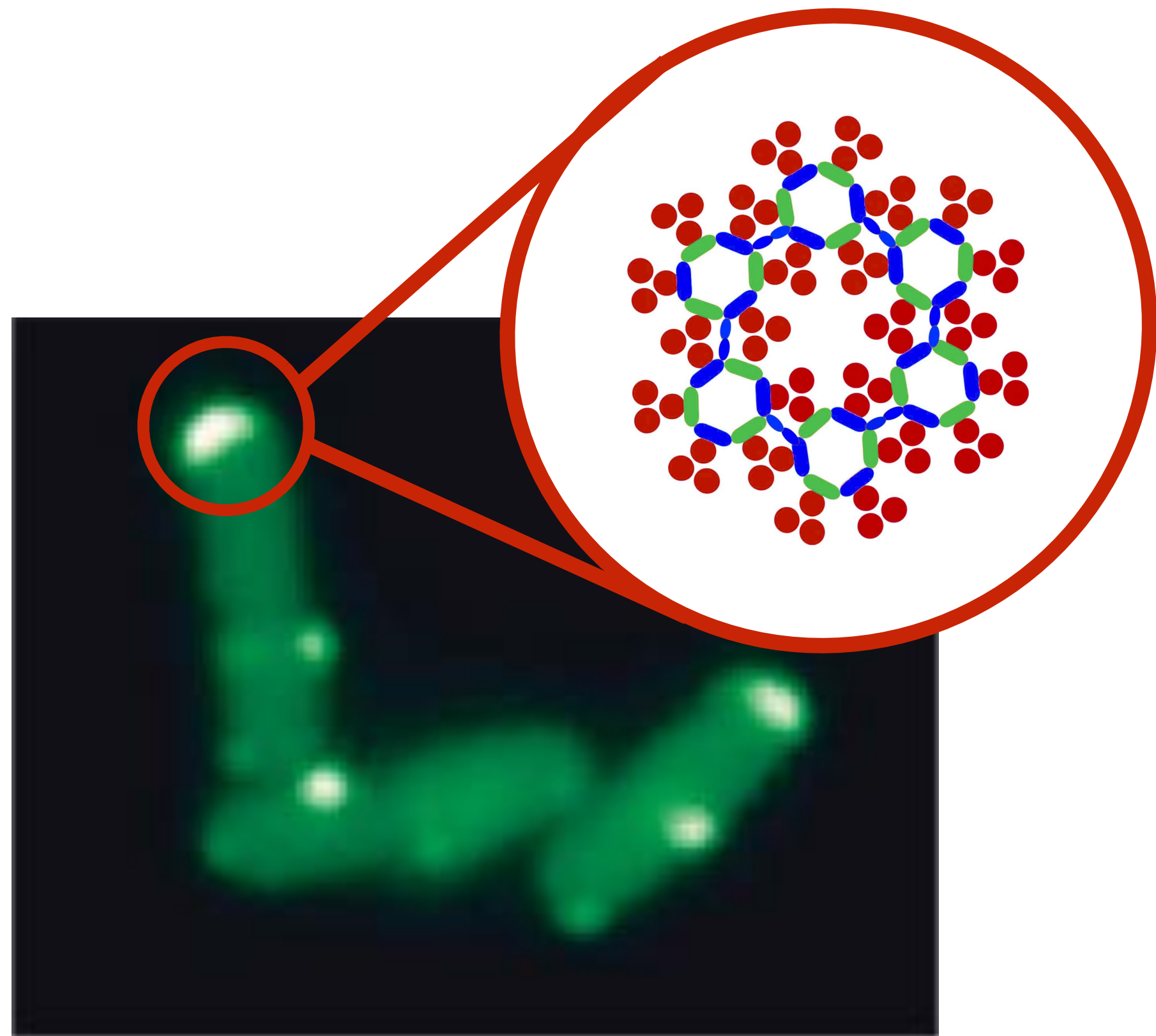
Robustness is an innate feature of integral feedback control systems



Yi, T., Huang, Y., Simon, M., Doyle, J., 2000. Proc. Natl. Acad. Sci. 97(9), 4649-4653.

The Bacterial Brain: A naturally-evolved, mechanical computer.

RECEPTOR CLUSTERING within the chemoreceptor array has been proposed to explain enhanced signaling features.



Fluorescence images of receptor clusters in whole *E. coli* cells.