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### Physics of Memory and Learning – from the Perspective of Interacting Biomolecules

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## What is the biology of memory and learning?

"The new biology posits that consciousness is a biological process that will eventually be explained in terms of molecular signaling pathways used by interacting populations of nerve cells."

-- Eric R. Kandel, 2000 Nobel laureate



## How do neuron cells communicate? Neurons are in touch, without touching



"Synaptic contacts in the cerebellum" Santiago Ramón y Cajal, Nobel Laureate in 1906 Synaptic plasticity underscores learning --"Practice makes perfect" makes perfect sense



https://medical-dictionary.thefreedictionary.com/synaptic+transmission

## How does a neuron decode extracellular signals?

- Localized nature of calcium signals.
- Encoding tradefine signals by attaining proteins for calcium ions.
- Protein-mediated calcium signaling pathways.
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# Calcium influx activates calcium signaling pathways in a dendritic spine



## The protein calmodulin is crucial in the first second upon stimulation by neurotransmitters



CaM is structurally flexible and adopts distinct conformations when bound to different protein targets



CaM-target binding kinetics varies by the sequence of its target

CaM-CaMKI peptide



CaM-CaMKII peptide





KFNARRKLKGAILTTMLATRN 1 5 10

CaMKII peptide

CaMKI peptide

5

1

AKSKWKQAFNATAVVRHMRKLQ

10

14

9

A factor of two in binding rates can be significant in CaM's target selection and recognition.



Wang, Zhang.... Cheung, Waxham (PNAS 2013)

At 4 °C, experimental rates:

CaM-CaMKI	CaM-CaMKII
k <sub>on</sub> (10 <sup>8</sup> M <sup>-1</sup> s <sup>-1</sup> )	k <sub>on</sub> (10 <sup>8</sup> M <sup>-1</sup> s <sup>-1</sup> )
3.79	1.54

- A factor of 2 on-rates cannot be explained by solely a diffusioncontrolled mechanism
- The differences in on-rates must involve post-contact events.

Need computations and theories!

A coarse-grained side-chain Cα protein model for both CaM and target efficiently samples a broad conformational ensemble



Cheung, M.S., Finke, J.M., Callahan, B. & Onuchic, J.N. JPCB (2003)

The Hamiltonian for the CaM-target complex is not biased toward a specific complex structure

 $E = E_{CaM} + E_{target} + E_{CaM-target}$ 



# Compute association rates $(k_a)$ by running tens of thousands of Brownian dynamics simulations



(Cont.d) Compute association rates  $(k_a)$  by running tens of thousands of Brownian dynamics simulations

$$k_a = k_D(b) \left[ \frac{\beta}{1 - (1 - \beta)\Omega} \right]$$

 $\beta$ : the probability of successful events

 $\Omega = b/q = 0.20$ : the probability that a target at r=q will eventually return to r=b

 $k_D$  (b) =  $4\pi Db$ , the rate that a target achieve at *b*; D is diffusion coefficient.



Northrup, Allison, McCammon, JCP 1984 How to define a successful event? What is an encounter complex? Experiments guide the calculation of  $K_a$  from computer simulations by setting up a proper order parameter



CaM-CaMKI	CaM-CaMKII
(10 <sup>8</sup> M <sup>-1</sup> s <sup>-1</sup> )	(10 <sup>8</sup> M <sup>-1</sup> s <sup>-1</sup> )
3.79	1.54

Threshold $Z_{75}$	CaM-CaMKI (10 <sup>8</sup> M <sup>-1</sup> s <sup>-1</sup> )	CaM-CaMKII (10 <sup>8</sup> M <sup>-1</sup> s <sup>-1</sup> )
5	57.305	59.084
6	41.591	47.339
7	28.248	27.882
8	18.018	14.560
9	5.618	2.669
10	0.252	0.126

Wang, MSC... PNAS (2013)

Intermolecular contacts: Z<sub>75</sub> 15

The post-collisional events involve structural arrangement of both CaM and target, explaining the difference in  $K_a$ 



Wang, Zhang, MSC. PNAS (2013)



Z=Zn+Zc is the total no. of (normalized) side-chain contacts between CaM and targets

Tripathi, MSC et al J. Mol Reg. (2015)

## Distinctive charge distributions from the target peptides contribute to CaM's binding frustration



LS

1

4

2

0

0.2

0.4

0.6

Normalized Time

0.8

Tripathi, MSC J. Mol Reg. (2015)

## CaM-target recognition is mediated through conformational and mutually induced fit



# CaM needs another CaM-binding protein to tune its affinity for calcium



Kubota Y, Putkey JA, Shouval HZ, Waxham MN 2008, J. Neurophysiology

#### RC3/Neurogranin and Ca<sup>2+</sup>/Calmodulin-dependent Protein Kinase II Produce Opposing Effects on the Affinity of Calmodulin for Calcium\*

Received for publication, May 13, 2004, and in revised form, June 23, 2004 Published, JBC Papers in Press, July 15, 2004, DOI 10.1074/jbc.M405352200

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### Neurogranin (Ng) is abundant in neurons

- 1. Ng knock-out mice exhibited deficits in spatial learning (Pak, PNAS, 2000)
- 2. Ng has a slightly higher binding affinity for apoCaM than holoCaM by a factor of 2 (Kd~nM, Waxham, JBC, 2014)
- The acidic region and IQ domains (Ng<sub>13-49</sub>) are essential for function
   DDDILDIPLDDPGANAAAAKIQASFRGHMARKKIKSGECG IQ motif: IQXXXRXXXR (Waxham, JBC, 2014)
- 4. There is no structure of a CaM-Ng bound complex except with a tethered Ng
- 5. We modeled the bound CaM-Ng using additional information from NMR

### Hamiltonian of coarse-grained molecular simulations for CaM-Ng

Structural information from the target and the bound complex is absent



$$E = E_{CaM} + E_{CaM-target} + E_{target}$$
Sequence dependent
$$E_{target} = E_{structural} + E_{vdW/HB} + E_{Debye-Hückel}$$
Target: 
$$E_{structural} = E_{bond} + E_{angle} + E_{dihedral} + E_{chiral}$$

$$E_{CaM-target} = E_{vdW/HB} + E_{Debye-Hückel}$$
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The distribution of bound CaM-Ng conformations is broad (I=0.1M, pH = 6.3)



CaM is still structurally extended upon Ng binding, not wrapping around a kinked Ng

All-atom simulations: bound complexes determine affinity for Ca<sup>2+</sup>





Jarzynski equality nonequilibrium work (*w*)

 $exp(\beta \Delta G) = \langle exp(-w) \rangle_{paths}$  $\Delta G = G_B - G_U$ 

### CaM-CaMKII complex retains Ca<sup>2+</sup>; CaM-Ng did not



Zhang, Tripathi, Trinh, Cheung. Biophysical Journal 2017

### Distinctive bound complexes delineate the importance of CaM's progressive mechanism of target binding on its Ca<sup>2+</sup> binding affinities



## What is the biology of mind?

"The new biology of mind is potentially more disturbing because it suggests that not only the body, but also mind and the specific molecules that underlie our highest mental processes consciousness of self and of others, consciousness of the past and the future – have evolved from our animal ancestors."

In Search of Memory EMERGENCE OF A NEW SCIENCE OF MIND Eric R. Kandel

-- Eric R. Kandel, 2000 Nobel laureate CaM is found in eukaryotes and its primary amino acid sequence is highly conserved among eukaryotes (In fact, all 148 of the a.a. are conserved for vertebrates.....)

The function of CaM is essential for various pathways in almost all eukaryotes (*e.g.* calcium binding signal transducers is consistent throughout all eukaryotes)



Can dynamics (physics) be an evolutionary constraint?



Lichtarge JMB 2004 http://mammoth.bcm.tmc.edu/ Wolynes PNAS 2010 http://www.frustratometer.tk/



CaM becomes less hydrophobic throughout evolutionary history



Tripathi, Waxham, Cheung, Liu, Scientific Report 2015

Conclusions and outlook

- A "conformationally and mutually induced fit" as a mechanism for CaM to recognize targets that lack distinct structures
- CaM's progressive mechanism of target binding regulates its Ca<sup>2+</sup> binding affinities
- Acidic region of Ng is key to lessen binding affinity of CaM for calcium. Bidirectional binding of CaM-target is critical to the reciprocal relation to calcium affinity.
- Dynamics is an evolutionary driving force for promiscuous proteins to achieve their binding multispecificity and diverse biological functions.

- Need novel computational tools to simulate and characterize IDPs that explain the observations from experiments.
- Need to move beyond the peptide models for CaMbinding targets.
- Need novel models and force fields for Ca<sup>2+</sup>-binding proteins.
- Need novel theoretical approaches to connect timevarying calcium signals to the molecular mechanism of CaM binding for target selection.

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