A Model of Correct and Incorrect Dimer Contacts

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Protein Interactions and Networks

"The pain interactome: Connecting pain-specific protein interactions", Jamieson *et.al*. 2014 – 611 proteins with 1001 unique interactions.



Pain is communicated throughout the body using proteins involved in cellular signaling and signal transduction pathways

Sub-network for inflammatory pain



* NTRK1: Neurotrophic Kinase 1
 NGF: Nerve growth factor
 BDNF: Brain-derived neurotrophic
 growth factor

Specific protein Interactions are involved in communicating specific types of pain

 neuropathic (e.g., tingling and burning pain) and inflammatory (i.e., associated with tissue damage) pain networks contain 127 and 157 proteins, with 80 proteins appearing in both data sets.

With so many possible interactions, how can physical constraints ensure that "correct" interactions occur?

Idealized Network

With so many possible interactions, how can physical constraints ensure that "correct" interactions occur?

Say we have a network, where each **node** represents a subunit and each **edge** represents a possible interaction between subunits



All possible Interactions

*We take the network to be **fully connected**, each subunit can interact with any other subunit But let's say a single set of *N* connections are deemed to be "**correct edges**" for a particular process.



How can we study this system physically?

From Network to Physical Particles

To Study this System Physically:

Represent each node as a physical subunit, which can interact with any other subunit



"Correct Interactions" are represented by specific interactions in this network



Introducing Physics: "Correct" interactions occur with binding energy $-(E_0 + \Delta)$. All other interactions have binding energy $-E_0$.

e.g., Correct Bindings for 2N = 8 network



Energy =
$$-4(E_0 + \Delta)$$

Main Question:

What thermodynamic constraints ensure system will have correct interactions?

Building a Model





Correct dimers have binding energy





- 1. There are 2*N* distinguishable monomers denoted $\alpha_1, \alpha_2, \ldots, \alpha_{2N}$ which can exist alone or as dimers (i.e., in pairs).
- Each monomer has one other monomer to which it binds with energy -(E₀ + Δ). We call these pairings "correct" dimers, and they consist of α_k binding to α_{k+N} (or, if k > N, to α_{k-N}).
- For all pairings different from a "correct" pairing, the binding energy is −E₀. We call these pairings "incorrect" dimers.
- Dimers and monomers are otherwise non-interacting and point-like.
- Each monomer has mass m₀, and the system exists in a volume V at temperature T.



 $-E_0$

Implies the monomers and dimers have kinetic energy.





A Possible Microstate



Equilibrium Thermodynamics

To investigate the equilibrium thermodynamics of this system, we need to compute the partition function

$$\sum_{\text{states}} e^{-\beta \mathcal{E}(\text{state})}$$

Sum over states

- 1. Momenta: Sum over the momenta of monomers and dimers.
- 2. Positions: Sum over positions of monomers and dimers; with 1) this constitutes what is known as "phase space"
- 3. # of **Dimers:** Sum over all possible values of k
- 4. # of Correct Dimers: Sum over all possible values of m

We need two things: 1. Boltzmann factor Found this in previous slide. 2. Sum over states Physics problem: What is the partition function for an ideal gas of N distinguishable particles

with volume *V* and temp *T*?

$$\begin{split} Z &= \frac{1}{h^{3N}} \int_{V} d^{3}\mathbf{r}_{1} \dots d^{3}\mathbf{r}_{N} \int d^{3}\mathbf{p}_{1} \dots d^{3}\mathbf{p}_{N} e^{-\beta \sum_{i=1}^{N} \mathbf{p}_{i}^{2}/2m_{0}} \\ &= \left(\frac{V}{\lambda_{0}^{3}}\right)^{N} \qquad \text{with} \qquad \lambda_{0} \equiv \frac{h}{\sqrt{2\pi m_{0} k_{B} T}} \end{split}$$

Combinatorics problem: How many ways can we create k pairs and *m* correct pairs out of a set of 2N subunits?

$$\Omega_N(k,m) = {N \choose m} a_{N-m,k-m}$$
 with

$$a_{N,\ell} = \sum_{j=0}^{\ell} (-1)^j \binom{N}{j} \binom{2N-2j}{2\ell-2j} (2\ell-2j-1)!!.$$

Computing Partition Function

Assembling these pieces, we have the partition function

$$Z_N(\beta E_0,\beta \Delta) = \sum_{k=0}^N \sum_{m=0}^k \left(\frac{V}{\lambda_0^3}\right)^{2N-2k} \left(\frac{V}{(\lambda_0/\sqrt{2})^3}\right)^k e^{\beta E_0(k-m)} e^{\beta(E_0+\Delta)m} \binom{N}{m} a_{N-m,k-m}$$

There is a cleaner (but less intuitive) analytical form:

$$Z_N(\beta E_0, \beta \Delta) = \frac{1}{2\sqrt{\pi} \,\Gamma\left(N + \frac{1}{2}\right)} \left(\frac{V}{\lambda_0^3}\right)^{2N} \int_0^\infty dx \, dy \, \frac{e^{-(x+y)}}{\sqrt{xy}} \left(\mathcal{M}_+^{2N} + \mathcal{M}_-^{2N}\right)$$

where

$$\mathcal{M}_{\pm}(x,y;\beta E_0,\beta\Delta) \equiv \sqrt{x} \pm \left(\frac{2\sqrt{2}\,\lambda_0^3}{V}\right)^{1/2} e^{\beta E_0/2} \sqrt{y\,\Phi(x;\beta\Delta)},$$

and
$$* \lambda_0 \equiv \frac{h}{\sqrt{2\pi m_0 k_B T}}$$

$$\Phi(x;\beta\Delta) \equiv e^{\beta\Delta} + 2x - 1.$$

**Note*: This result is exact; No approximations have been made.

The continuous integrals come $N! = \int_0^\infty ds \, e^{-s} s^N$ from using identities like

What physical results can we extract from this result?

Physical Results from Partition Function

What physical results are contained in this partition function?

$$Z_N(\beta E_0, \beta \Delta) = \frac{1}{2\sqrt{\pi} \,\Gamma\left(N + \frac{1}{2}\right)} \left(\frac{V}{\lambda_0^3}\right)^{2N} \int_0^\infty dx \, dy \, \frac{e^{-(x+y)}}{\sqrt{xy}} \left(\mathcal{M}_+^{2N} + \mathcal{M}_-^{2N}\right)$$

Two Interesting Questions:

- 1. For what thermal conditions is the system composed **mostly of dimers?**
- 2. For what thermal conditions do these dimers consist mostly of correct contacts?





Partition function allows us to "easily" compute two relevant quantities:

- 1. The average number of **total dimers** as a function of temperature.
- 2. The average number of **correct dimers** as a function of temperature

Formal Definitions

$$\langle k
angle = rac{\partial}{\partial(eta E_0)} \ln Z_N(eta E_0, eta \Delta)$$
 $\langle m
angle = rac{\partial}{\partial(eta \Delta)} \ln Z_N(eta E_0, eta \Delta)$

Equilibrium Conditions

From the partition function

$$Z_N(\beta E_0, \beta \Delta) = \frac{1}{2\sqrt{\pi}\,\Gamma\left(N + \frac{1}{2}\right)} \left(\frac{V}{\lambda_0^3}\right)^{2N} \int_0^\infty dx \, dy \, \frac{e^{-(x+y)}}{\sqrt{xy}} \left(\mathcal{M}_+^{2N} + \mathcal{M}_-^{2N}\right)$$

We can compute:

1. Mean number of total dimers

$$\langle k
angle = rac{\partial}{\partial (eta E_0)} \ln Z_N(eta E_0,eta \Delta)$$

2. Mean number of correct dimers

$$\langle m
angle = rac{\partial}{\partial (eta \Delta)} \ln Z_N(eta E_0,eta \Delta)$$

Problem: Requires multiple numerical integrations for each quantity.

i.e., Too computationally expensive!

Simpler Approach:

1. Use Laplace's Method to Approximate Integral

$$\int_0^\infty dx\,dy\,e^{-\beta F(x,y)}\simeq e^{-\beta F(\overline{x},\overline{y})}$$

2. Find Conditions for the validity of the approximation

 $0 = \partial_x F(x,y) \Big|_{x = \overline{x}, y = \overline{y}} = \partial_y F(x,y) \Big|_{x = \overline{x}, y = \overline{y}}$

After *some* algebra

Equilibrium Conditions:

$$rac{de^{eta\Delta}}{2} \simeq \langle m
angle rac{N - \langle m
angle}{\langle k
angle - \langle m
angle}, \quad rac{4\sqrt{2}\,\lambda_0^3}{V}\,e^{eta E_0} \simeq rac{\langle k
angle - \langle m
angle}{\left(N - \langle k
angle
ight)^2}$$

<u>*Much less</u> <u>computationally</u> <u>expensive!</u>

Equilibrium Conditions: Sanity Check #1



Equilibrium Conditions: Sanity Check #2



Solving Equilibrium Conditions Generally

To determine the equilibrium behavior more generally, we need to numerically solve the system of coupled quadratic equations.

$$rac{e^{eta\Delta}}{2}\simeq \langle m
angle rac{N-\langle m
angle}{\langle k
angle-\langle m
angle}, \quad rac{4\sqrt{2}\,\lambda_0^3}{V}\,e^{eta E_0}\simeq rac{\langle k
angle-\langle m
angle}{\left(N-\langle k
angle
ight)^2}$$

Doing so and exploring the solutions we find that the solutions fall into two general forms

As we increase *T*, the number of correct dimers decays away with the number of total dimers

"Soft Transition"

As we increase T, the number of correct dimers decays away <u>before</u> the number of total dimers

"Sharp Transition"

Type-I and Type-II Dimer Systems

Quantitatively, what distinguishes these two types of systems?

From the system of equations, we can compute two temperatures:

$$k_B T_m = \frac{\Delta}{\ln(2N)} \qquad (T_m: \text{Temperature at which } \langle m \rangle \simeq N)$$

$$k_B T_k = \frac{2}{3} (E_0 + \Delta) \left[W_0 \left(\frac{2}{3} \beta (E_0 + \Delta) \left(\frac{NV}{2\lambda_0^3 \sqrt{2}} \right)^{2/3} \right) \right]^{-1} \quad (T_k: \text{Temperature at which } \langle k \rangle \simeq N)$$

As we increase *T*, the number of correct dimers decays away with the number of total dimers

As we increase T, the number of correct dimers decays away <u>before</u> the number of total dimers

Phases of Dimer System

These systems are characterized by **four different phases**

which are themselves defined by temperatures

 $(T_m: \text{Temperature at which } \langle m \rangle \simeq N)$

As we increase T, the number of correct dimers decays away <u>before</u> the number of total dimers

$$T_m < T_k$$

As we increase *T*, the number of correct dimers decays away <u>with</u> the number of total dimers

$$T_k < T_m$$

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$$T_k < T_m$$

We can display these phases in a phase diagram.

These systems are characterized by **four different phases**

which are themselves defined by temperatures

(T_m : Temperature at which $\langle m \rangle \simeq N$)

(T_k : Temperature at which $\langle k \rangle \simeq N$)

Completely dimerized and completely correct	$T < T_m, T_k$
Partially dimerized and partially correct of Type I	$T_k < T, T_m$
Completely dimerized and partially correct of Type II	$T_m < T < T_m$
Partially dimerized and partially correct of Type II	$T_k < T_m < T$

 $\beta E_0 - \beta \Delta$ space (Fixed *N*, *V*, and *T*)

From $T_k = T_m$ condition

Conditions to be completely dimerized and completely correct

$$\beta \Delta \geq \begin{cases} -\beta E_0 + \ln \left[NV/2\sqrt{2}\lambda_0^3 \right] & \text{if } \beta E_0 < -\ln \left[4\sqrt{2}\,\lambda_0^3/V \right], \\ \ln(2N) & \text{if } \beta E_0 \geq -\ln \left[4\sqrt{2}\,\lambda_0^3/V \right], \end{cases}$$

From $T = T_m$ condition

$$(\beta \Delta)_{\min} = \ln(2N)$$

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Particle Number and Phase-Space Density

These systems are characterized by four different phases

- which are themselves defined by temperatures

 $(T_m: \text{Temperature at which } \langle m \rangle \simeq N)$

(T_k : Temperature at which $\langle k \rangle \simeq N$)

Completely dimerized and completely correct	$T < T_m, T_k$
Partially dimerized and partially correct of Type I	$T_k < T, T_m$
Completely dimerized and partially correct of Type II	$T_m < T < T_m$
Partially dimerized and partially correct of Type II	$T_k < T_m < T$

$$2N - \lambda_0^3/V$$
 space (Fixed E_0, Δ , and T)

$$\lambda_0 = \frac{h}{\sqrt{2\pi m_0 k_B T}}$$

 λ_0^3/V : represents the number of particles per unit phase space. Think of it as a dimensionless temperature-dependent

completely dimerized and completely correct

$$N \leq egin{cases} rac{4\sqrt{2}\lambda_0^3}{V} e^{eta(E_0+\Delta)} & ext{if } \lambda_0^3/V < e^{-eta E_0}/(4\sqrt{2}), \ e^{eta\Delta} & ext{if } \lambda_0^3/V \geq e^{-eta E_0}/(4\sqrt{2}) \end{cases}$$

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Biophysical Systems: Proteins in a Cell

The offset binding-energy determines maximum number of correctly interacting monomers you can have in a system.

 $(2N)_{\max} = e^{\beta \Delta}$

What do these results tell us about biophysical systems?

Proteins in a Cell

number of

cell volume

proteins per

Cell signaling pathways require proteins to find and distinguish their correct partners from a sea of incorrect partners

how many proteins are in a cell? protein mass per volume (≈ 0.2 g/ml) **Inference**? Of similar order of magnitude. Protein density/volume constraints approximately match combinatorial constraints. aa per protein ($\approx 300 \frac{aa}{protein}$ Avogadro's number **Estimation Caveats** $\frac{0.2 \text{ [g/ml]} \times 6 \times 10^{23} \left[\frac{\text{Da}}{\text{g}}\right] \times 10^{-12} \left[\frac{\text{ml}}{\mu\text{m}^3}\right]}{300 \left[\frac{\text{aa}}{\text{g}}\right] \times 100 \left[\frac{\text{Da}}{\text{g}}\right]}$ Proteins have a spectrum of binding energies 3×10^6 proteins - Cell has 1000s of different types of proteins with different abundances

number of proteins

 $\approx 3 \times 10^6$

 $\approx 100 \times 10^{6}$

 $\approx 10 \times 10^9$

 Not all proteins form transient and non-obligate dimers

Estimate offset binding-energy: $\Delta \approx 10$ kcal/mol

Maximum number of proteins: $(2N)_{max} \approx 2 \times 10^7$

Proteins are spatially localized within a cell

...last but not least...

- Cellular environments are not in equilibrium

 $1 \, \mu m^3$

 $\approx 30 \, \mu m^3$

≈ 3,000 µm³

characteristic volume

organism

budding yeast

HeLa cell line

E. coli

Biophysical Systems: Abundance and Stability

Biophysical Systems: Cellular Death

The offset binding-energy determines maximum number of correctly interacting monomers you can have in a system.

Proteins and Cellular Death

 $(2N)_{\max} = e^{\beta \Delta}$

What do these results tell us

about biophysical systems?

Biophysical Systems: Self Assembly

The system we've studied bears some of the features of self-assembly

Model of Correct and Incorrect Dimers

System of many **monomers** coming together in **correct dimers/contacts**

Self-Assembly

System of many different subunits coming together in correct contacts to form some larger structure.

Icosahedron "virus capsid" from math.wikia.com

The similarity suggests some questions we can ask about Self-Assembly systems:

- Subunits Limit: Is the number of subunits (and hence the size of the object) constrained by the energies of the contacts?

- Energy-Scales of Self-Assembly: Is there an energy scale at which the structure disassembles different from the energy scale at which incorrect contacts dominate?

- Phases of Self-Assembly: How can we quantitatively categorize the various stages toward self-assembly in phases?

What's Next?

Future Possible Theoretical Work:

- 1. Non-Ideal Gas: We assumed that the subunits did not have volume and did not interact with one another. What results would we get for more realistic assumptions?
- 2. Gendered/Typed Model: What if subunits came in two-types, and dimers were formed by one of each kind?
- 3. **Complexes:** Can we consider models where more than two subunits bind together?
- 4. **Simulations:** This system should be simple to simulate. Can we compare the results with those of a simulations?
- 6. Analytical Model of Self-Assembly: Using this system as a motivation can we develop a soluble analytical model of self-assembly?

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Ending Remarks

Physicists make terrible parents.

SMBC, 2013-11-26

END

Supplementary Slides

Supplementary Figures

Type-I and Type-II dimer systems, with the number of correct dimers <m> normalized by the total number of dimers <k>.

(Type-II dimer system)

Supplementary Figures

Explicit Phase Boundary Conditions for

Energy–Offset Energy Space

Supplementary Figures

Explicit Phase Boundary Conditions for

Number-Phase Density Space

