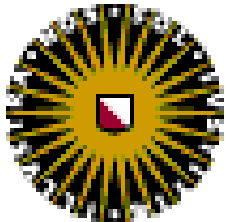


Varennna 2015

# Self-assembly from colloids to biology

Willem Kegel



**Universiteit Utrecht**



# The story line of my (4) lectures:

## Self – assembly onto templates:

- The grand ensemble in stat physics (1)
- Langmuir adsorption (1)
- template has  $> 1$  state : allostery / MWC model (1)
- multiple component adsorption onto templates with multiple sites: genetic regulation (2)

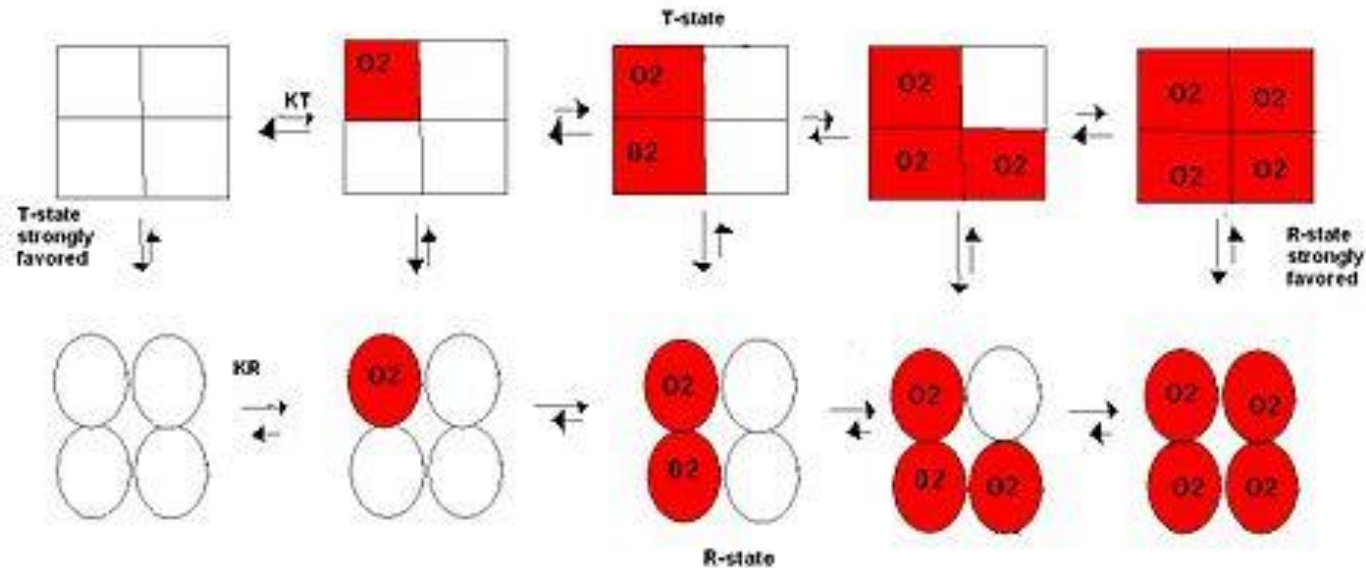
## Self – assembly without templates:

- (empty) virus capsids (3)
- colloid and protein clusters stabilized by (long-range) electrostatic interactions (4)

# Self-assembly on templates: reversible adsorption & allostery

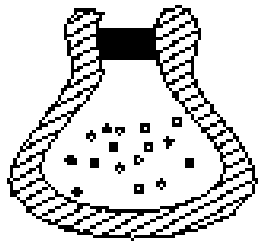


Part 1: 'simple' adsorption → template has single state



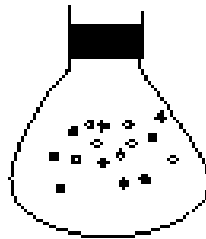
Part 2: allostery → template has >1 state

# Ensembles



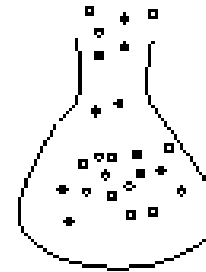
Microcanonical

$E, V, N$



Canonical

$T, V, N$



Grand Canonical

$T, V, \mu$

Ensembles: pick the one that is convenient for your problem –

$$Z(T, V, N) = \int_{E_0}^{\infty} e^{-\beta E} W(E, V, N) dE$$

in terms of constraints

Lagrange multiplier for E (total)

↑

Canonical partition function

↑

density of states

$$\Xi(T, V, \mu) = \sum_{N=0}^{\infty} e^{\beta \mu N} Z(T, V, N) = \sum_{N=0}^{\infty} \lambda^N Z(T, V, N)$$

Laplace transforms

Lagrange multiplier for N (total)

↑

Grand (canonical) partition function

↙

Lagrange multiplier for N (total)

Probability distribution of the # of particles

$$p(N) = \frac{\lambda^N Z(N, T, V)}{\Xi}$$

Average # of particles

$$\langle N \rangle = \sum N p(N) = \frac{1}{\Xi} \sum N \lambda^N Z(N, T, V) = \lambda \left( \frac{\partial \ln \Xi}{\partial \lambda} \right)_{T, V}$$

# THE COLLECTED WORKS

OF

J. WILLARD GIBBS, PH.D., LL.D.

FULLER HALL, YALE UNIVERSITY

IN TWO VOLUMES

VOLUME II

PART ONE

ELEMENTARY PRINCIPLES IN STATISTICAL MECHANICS

PART TWO

DYNAMICS

VECTOR ANALYSIS AND MULTIPLE ALGEBRA

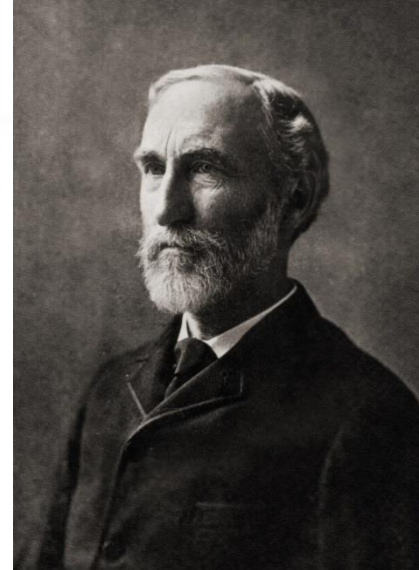
ELECTROMAGNETIC THEORY OF LIGHT

ETC.

LONGMANS, GREEN AND CO.

NEW YORK · LONDON · TORONTO

1902



... the most brilliant  
person most people  
have never heard of.

Bill Bryson

## CHAPTER XV.

### SYSTEMS COMPOSED OF MOLECULES.

Generic and specific definitions of a phase . . . . .	187-189
Statistical equilibrium with respect to phases generically defined and with respect to phases specifically defined . . . . .	189
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Comparison of indices . . . . .	203-206
When the number of particles in a system is to be treated as variable, the average index of probability for phases generically defined corresponds to entropy . . . . .	206

First published 1902

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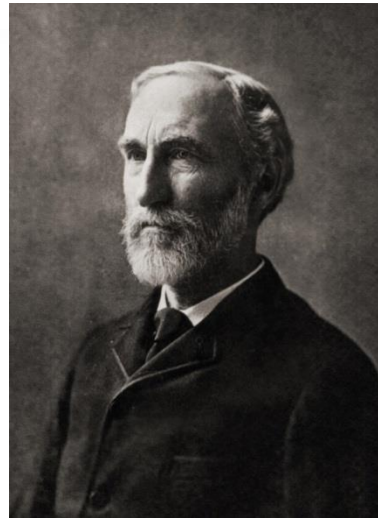
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1928



Grand ensemble is the ensemble of choice if fixed particle constraint(s) become awkward..

..such as in compartmentalization / multi – component demixing.

## CHAPTER XV.

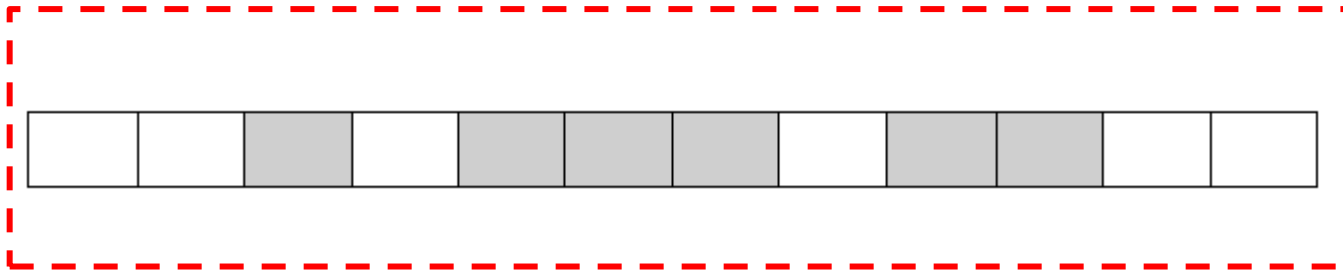
### SYSTEMS COMPOSED OF MOLECULES.

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First published 1902



# Self-assembly on templates



$\mu, n_{\max}, T$

uncorrelated adsorption on template with  $n_{\max}$  sites

$$\begin{aligned}\Xi_1 &= \sum_0^{n_{\max}} \lambda^n Z(n, n_{\max}, T) \\ &= \sum_0^{n_{\max}} \binom{n_{\max}}{n} \lambda^n e^{-\epsilon n/kT} \\ &= (1 + \lambda e^{-\epsilon/kT})^{n_{\max}}\end{aligned}$$

$$\lambda = e^{\mu/kT}$$

$$Z(n, n_{\max}, T) = \binom{n_{\max}}{n} e^{-\epsilon n/kT}$$

$$\binom{n_{\max}}{n} = \frac{n_{\max}!}{(n_{\max} - n)! n!}$$

... that's the [ weight of an empty site + weight of an occupied site ] <sup>$n_{\max}$</sup>



Take  $N_p$  of those templates

$$\Xi = \Xi_1^{N_p} = (1 + \lambda e^{-\epsilon/kT})^{N_p n_{max}}$$

In the case of uncorrelated adsorption, spatial distribution of lattice sites irrelevant. --> may as well take single lattice with  $N_p \times n_{max}$  sites.

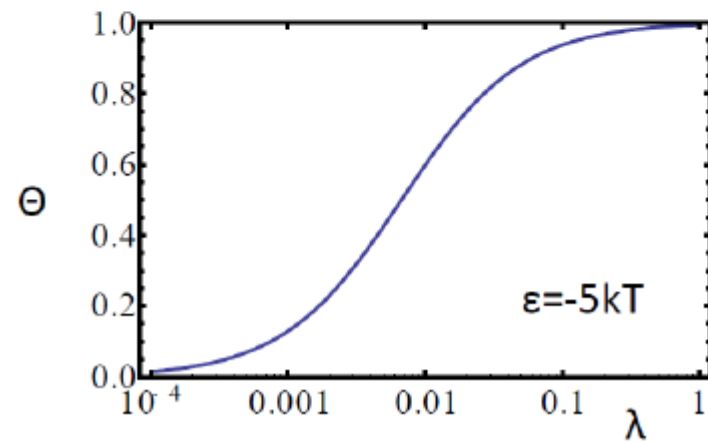
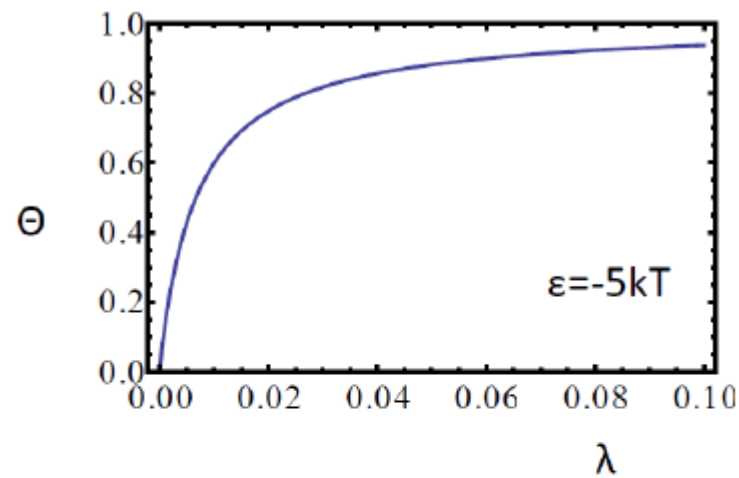
For a single template

$$\langle n \rangle = \lambda \frac{\partial \ln \Xi_1}{\partial \lambda} = n_{max} \frac{\lambda e^{-\epsilon/kT}}{1 + \lambda e^{-\epsilon/kT}}$$

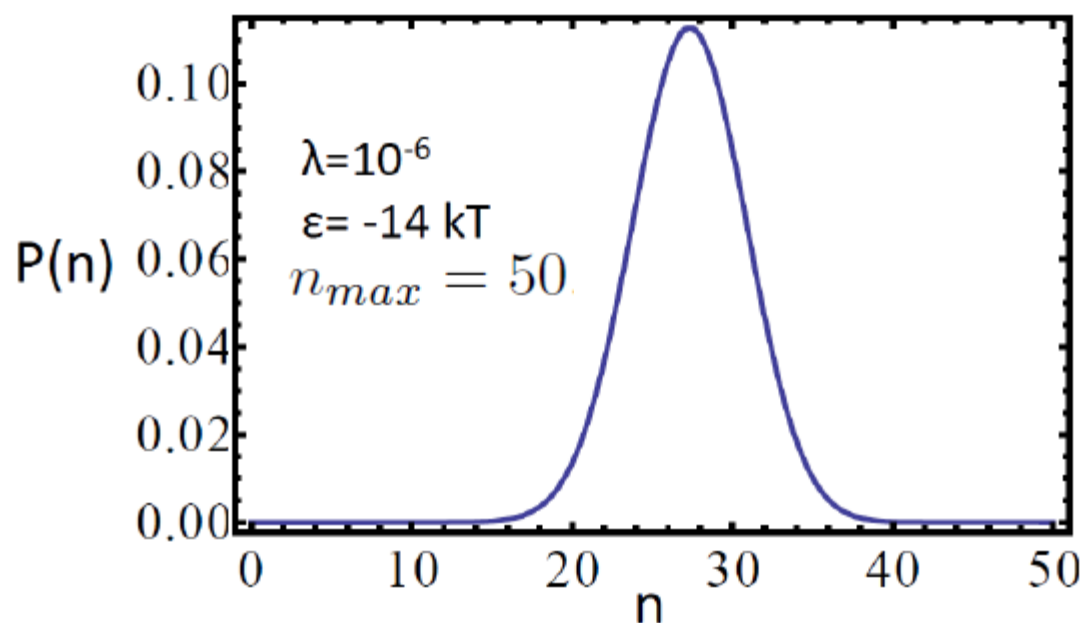
$$\theta = \frac{\langle n \rangle}{n_{max}} = \frac{\lambda e^{-\epsilon/kT}}{1 + \lambda e^{-\epsilon/kT}}$$

the Langmuir adsorption equation

# the Langmuir adsorption equation



size distribution  $P(n) = \Xi_1^{-1} \binom{n_{max}}{n} \lambda^n e^{-\epsilon n/kT}$



$\binom{n_{max}}{n}$  has a maximum at  $n^* = n_{max}/2$

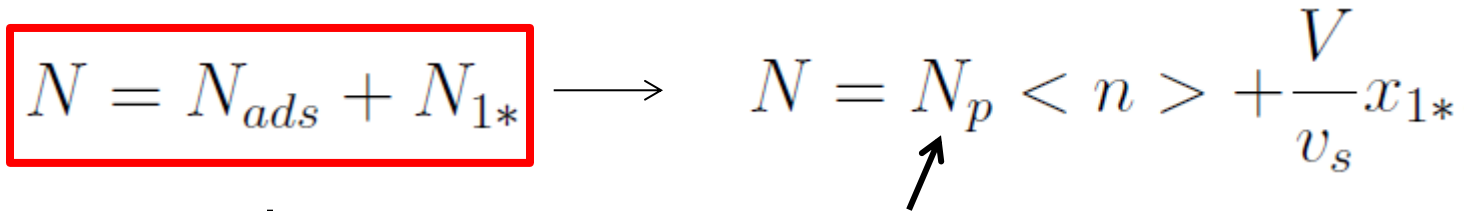
$n < n^*$  if  $(\lambda e^{-\epsilon/kT}) < 1$

$n > n^*$  if  $(\lambda e^{-\epsilon/kT}) > 1$

# Fluctuations

$$\begin{aligned}\sigma^2 &= \langle n^2 \rangle - \langle n \rangle^2 = \lambda \frac{\partial \langle n \rangle}{\partial \lambda} \\ &= n_{\max} \frac{\lambda e^{-\epsilon/kT}}{(1 + \lambda e^{-\epsilon/kT})^2}\end{aligned}$$

$\lambda$  is Lagrange multiplier coupled to conservation of adsorbing species

$$\boxed{N = N_{ads} + N_{1*}} \longrightarrow N = N_p \langle n \rangle + \frac{V}{v_s} x_{1*}$$


Here the # of templates enters the problem ... could also be a distribution of sizes.

Occupancy of a single template is coupled to all other ( $N_p$ ) templates.

Method of undetermined (Lagrange) multipliers is 'designed' for these kind of problems.

Express boundary condition in  $\lambda$  via  $\langle n \rangle$ ,  $x_{1*}$  and solve for  $\lambda$   
-> Can be generalized for any number of reservoirs (of arbitrary nature). <-

$\lambda$  is Lagrange multiplier coupled to conservation of adsorbing species

$$N = N_{ads} + N_{1*} \longrightarrow N = N_p \langle n \rangle + \frac{V}{v_s} x_{1*}$$

$$\mu = \mu_1^0 + kT \ln x_{1*} \longrightarrow \lambda = e^{\mu/kT} = x_{1*} e^{\mu_1^0/kT}$$

$$\lambda e^{-\epsilon/kT} = x_{1*} e^{-(\epsilon - \mu_1^0)/kT} \longrightarrow x_{1*} = \lambda e^{-\mu_1^0/kT}$$

$$\lambda = \frac{1}{2e^{-\epsilon/kT}} \left( e^{-\epsilon/kT} (x - x_P n_{max}) - 1 + \sqrt{h(x, x_P, \epsilon)} \right)$$

$$h(x, x_P, \epsilon) = 4xe^{-\epsilon/kT} + \left( 1 + e^{-\epsilon/kT} (x_P n_{max} - x) \right)^2$$

$$x = N v_s / V \approx N / N_s \quad x_P = N_p v_s / V \approx N_p / N_s$$

replace  $\epsilon$  by  $w = \epsilon - \mu_1^0 \longrightarrow \lambda = x_{1*}$

.. If  $x < e^{w/kT} \rightarrow x_{1*} \approx x$

.. If  $x > e^{w/kT} \rightarrow x_{1*} \approx e^{w/kT}$

..  $e^{w/kT}$  is the coexisting (with aggregates) concentration of monomers

.. analog of the 'cmc' for molecules / particles adsorbing onto templates

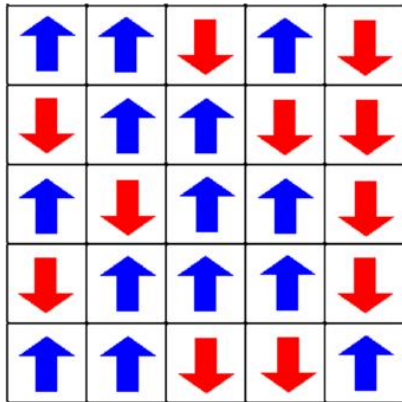
.. here,  $x_{1*}$  increases again once  $N > N_{\text{ads}}$

-> all association equilibria have a critical concentration below which there is no aggregation.

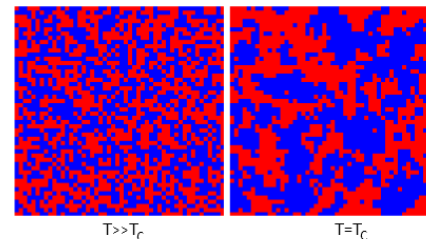
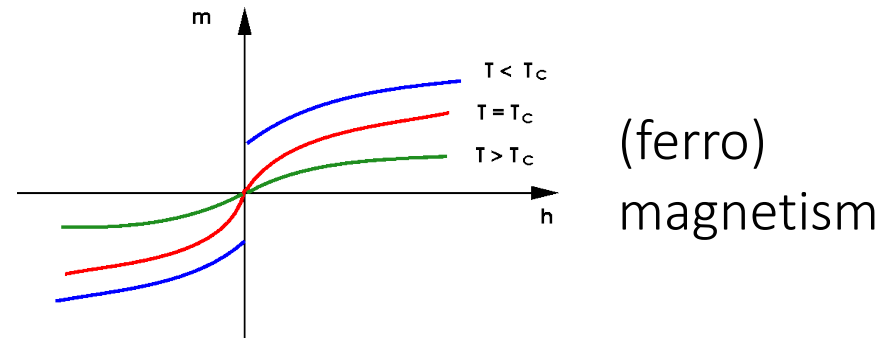
-> check, e.g. for dimer association [F. Sciortino lecture].



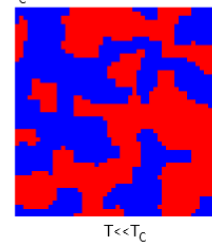
# Toy models in stat physics: The Ising model



Just two spin states  
coupling parameter  
on/off external field



phase transitions  
critical point  
(scaling)



scale invariance (RG)

... many, many more examples

# Toy models in molecular biology: MWC

*J. Mol. Biol.* (1965) 12, 88–118

It took a while before this paper was picked up ... Why?

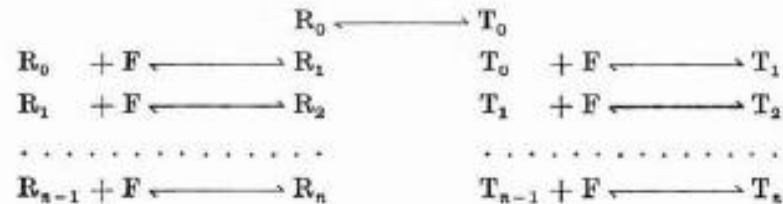
## **On the Nature of Allosteric Transitions: A Plausible Model**

JACQUES MONOD, JEFFRIES WYMAN AND JEAN-PIERRE CHANGEUX

*Service de Biochimie Cellulaire, Institut Pasteur, Paris, France  
and Istituto Regina Elena per lo Studio e la Cura dei Tumori, Rome, Italy*

The statistical mechanics of ‘all or nothing’  
(in small systems)

...  $T_n$ , to designate the complexes involving 0, 1, 2, ...  $n$  molecules of ligand, we may write the successive equilibria as follows:



Taking into account the probability factors for the dissociations of the  $R_1, R_2, \dots, R_n$  and  $T_1, T_2, \dots, T_n$  complexes, we may write the following equilibrium equations:

$$T_0 = LR_0$$

$$\begin{array}{ccc}
 R_1 = R_0 n \frac{F}{K_R} & T_1 = T_0 n \frac{F}{K_T} \\
 R_2 = R_1 \frac{n-1}{2} \frac{F}{K_R} & T_2 = T_1 \frac{n-1}{2} \frac{F}{K_T} \\
 \dots & \dots \\
 R_n = R_{n-1} \frac{1}{n} \frac{F}{K_R} & T_n = T_{n-1} \frac{1}{n} \frac{F}{K_T}
 \end{array}$$

Let us now define two functions corresponding respectively to:

(a) the fraction of protein in the R state:

$$\bar{R} = \frac{R_0 + R_1 + R_2 + \dots + R_n}{(R_0 + R_1 + R_2 + \dots + R_n) + (T_0 + T_1 + T_2 + \dots + T_n)}$$

(b) the fraction of sites actually bound by the ligand:

$$\bar{Y}_F = \frac{(R_1 + 2R_2 + \dots + nR_n) + (T_1 + 2T_2 + \dots + nT_n)}{n[(R_0 + R_1 + R_2 + \dots + R_n) + (T_0 + T_1 + T_2 + \dots + T_n)]}$$

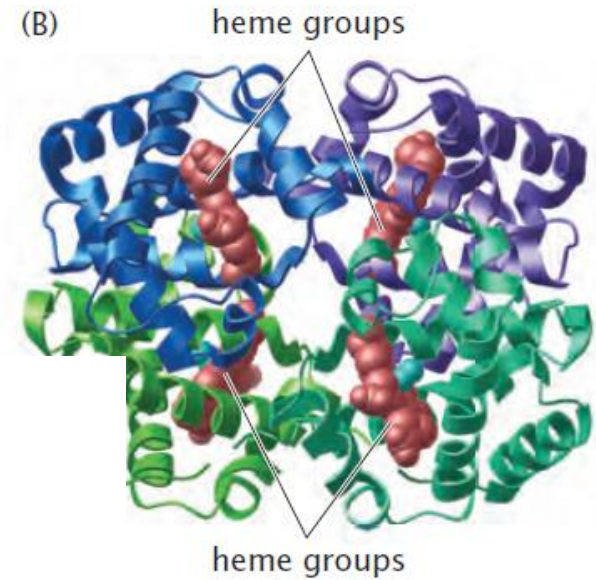
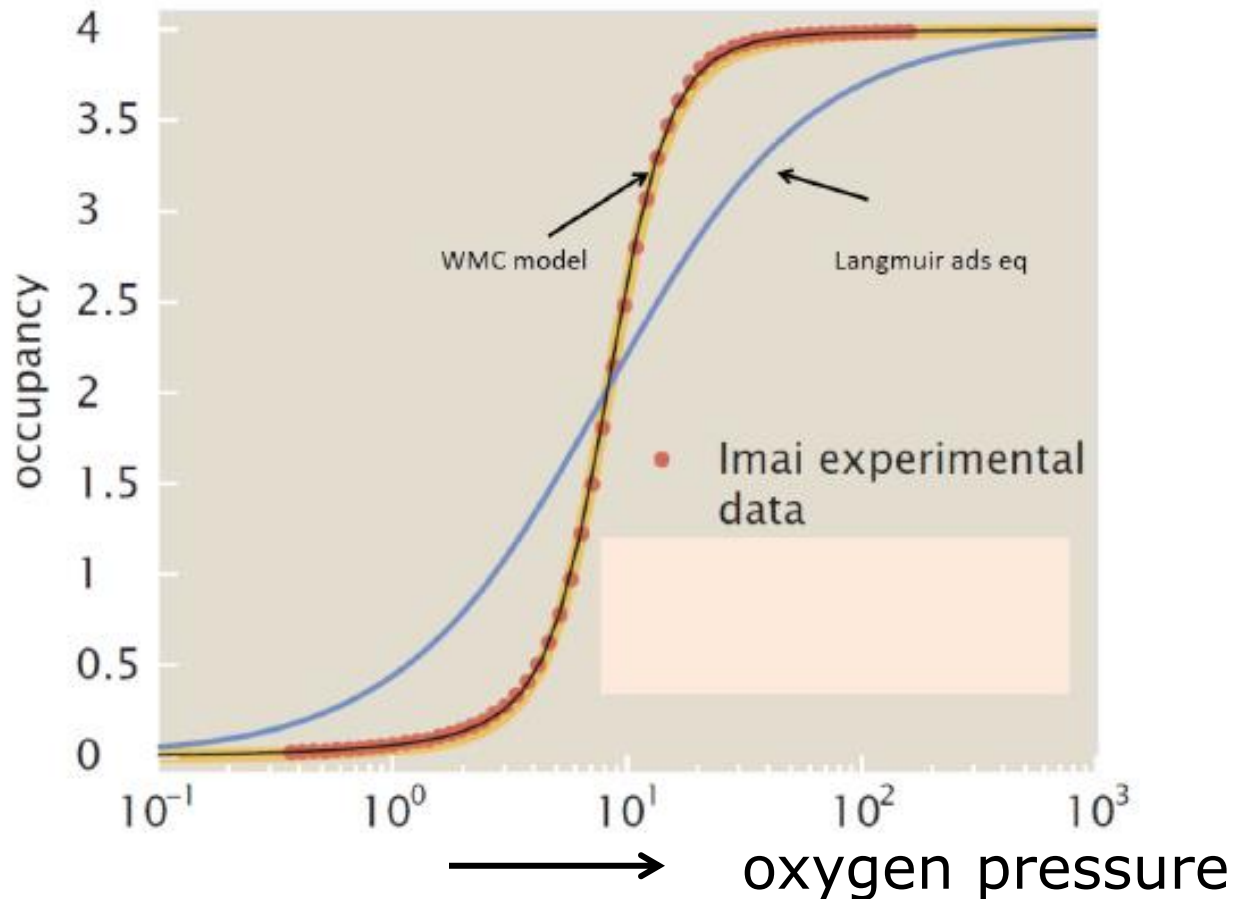
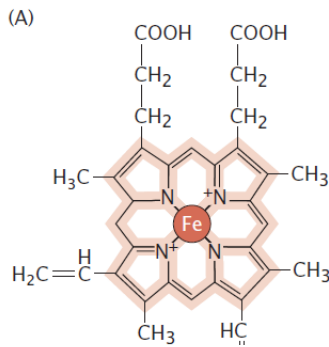
Using the equilibrium equations, and setting

$$\frac{F}{K_R} = \alpha \quad \text{and} \quad \frac{K_R}{K_T} = c$$

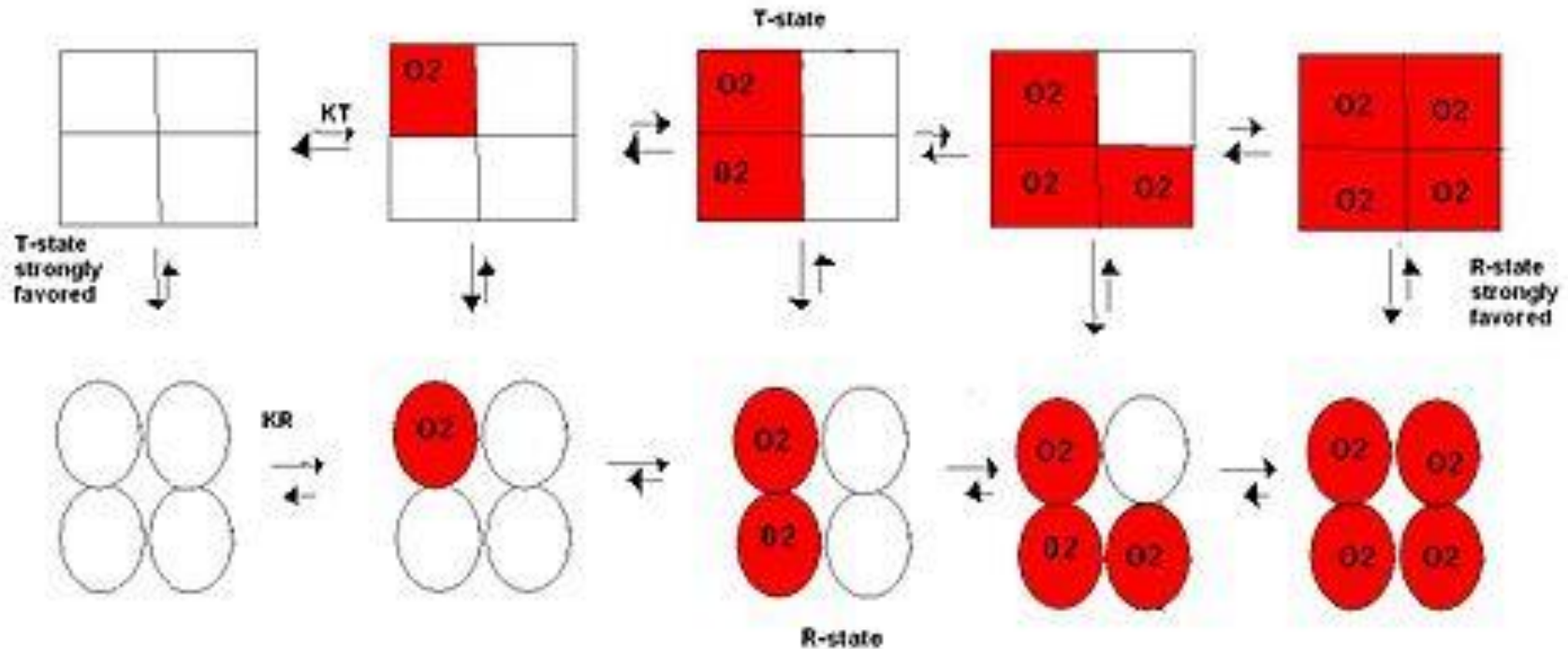
Original papers of new concepts are not always easy to read ...

... but always fascinating!

# Oxygen binding by red blood cells: heme groups



Basic idea of MWC theory: ground state (**T**) has weak affinity for ligand, excited state (**R**) has strong(er) affinity: cooperativity



(T) == 'Tense' state

(R) == 'Relaxed' state

Translate these ideas in language of grand ensemble

-> easy(er) to generalize

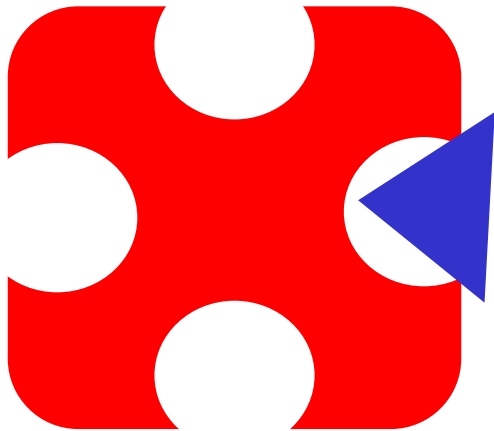
Translate these ideas in language of grand ensemble



(T) == 'Tense' state

self-energy: 0

binding-energy:  $\epsilon_T$



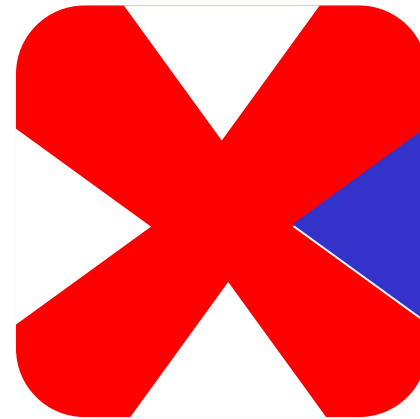
weight:  $\binom{4}{1} \lambda e^{-\epsilon_T/kT}$

Weight  
of 2 bound  
molecules  $\binom{4}{2} \lambda^2 e^{-2\epsilon_T/kT}$

(R) == 'Relaxed' state

self-energy:  $\epsilon$

binding-energy:  $\epsilon_R$



$\binom{4}{1} e^{-\epsilon/kT} \lambda e^{-\epsilon_R/kT}$

$\binom{4}{2} e^{-\epsilon/kT} \lambda^2 e^{-2\epsilon_R/kT}$

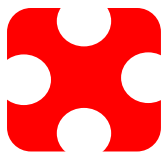
... etc

state

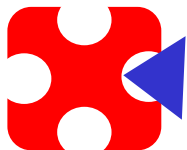
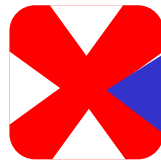
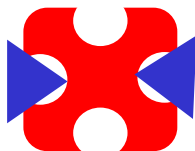
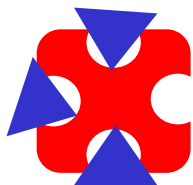
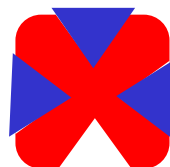
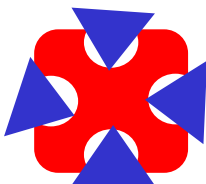
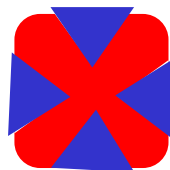
weight

state

weight



1

 $e^{-\beta\epsilon}$  $\binom{4}{1} \lambda e^{-\beta\epsilon_T}$  $\binom{4}{1} e^{-\beta\epsilon} \lambda e^{-\beta\epsilon_R}$  $\binom{4}{2} \lambda^2 e^{-2\beta\epsilon_T}$  $\binom{4}{2} e^{-\beta\epsilon} \lambda^2 e^{-2\beta\epsilon_R}$  $\binom{4}{3} \lambda^3 e^{-3\beta\epsilon_T}$  $\binom{4}{3} e^{-\beta\epsilon} \lambda^3 e^{-3\beta\epsilon_R}$  $\lambda^4 e^{-4\beta\epsilon_T}$  $e^{-\beta\epsilon} \lambda^4 e^{-4\beta\epsilon_R}$ 

---


$$\Xi_T = (1 + \lambda e^{-\epsilon_T/kT})^4$$

---


$$\Xi_R = e^{-\epsilon/kT} (1 + \lambda e^{-\epsilon_R/kT})^4$$



$$\Xi = \Xi_T + \Xi_R.$$

$$\Xi_T = \sum_0^4 \binom{4}{n} \lambda^n e^{-\epsilon_T n/kT} = (1 + \lambda e^{-\epsilon_T/kT})^4$$

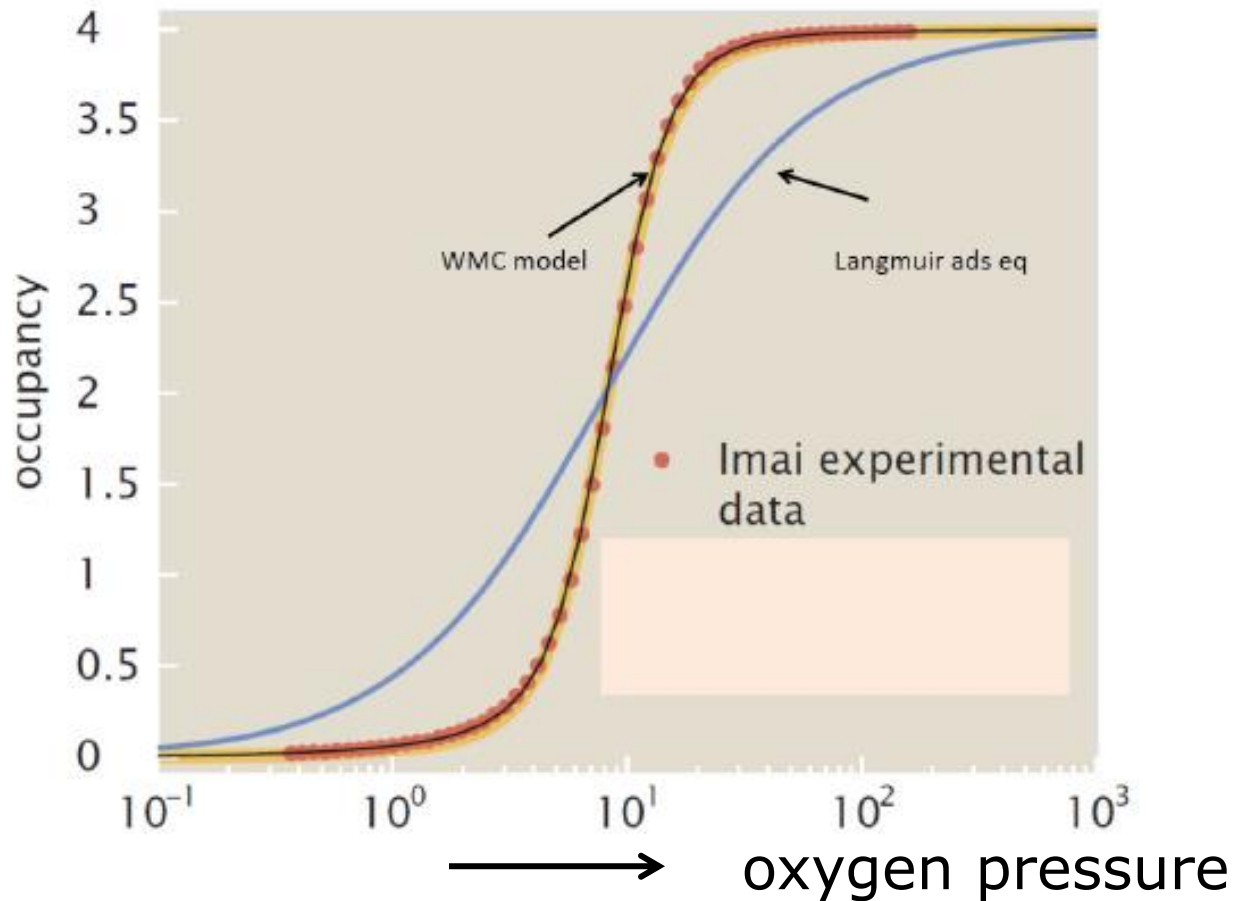
$$\Xi_R = e^{-\epsilon/kT} \sum_0^4 \binom{4}{n} \lambda^n e^{-\epsilon_R n/kT} = e^{-\epsilon/kT} (1 + \lambda e^{-\epsilon_R/kT})^4$$

Self-energy  $\epsilon > 0$

binding energies  $|\epsilon_R| > |\epsilon_T|$

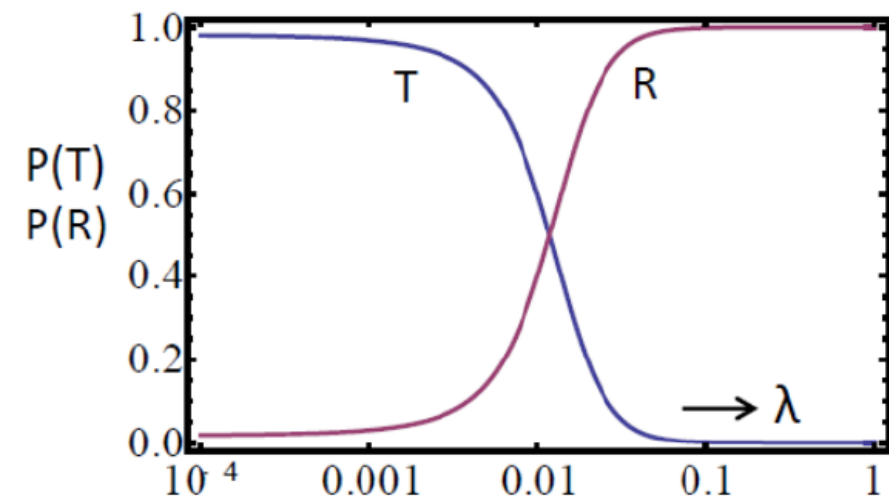
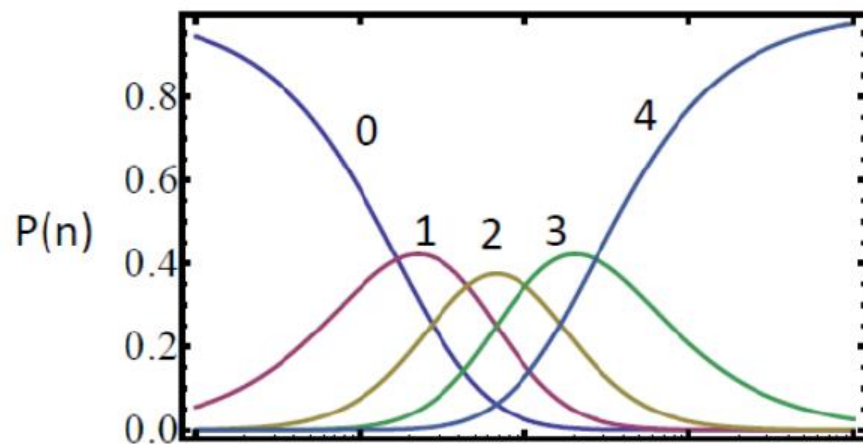
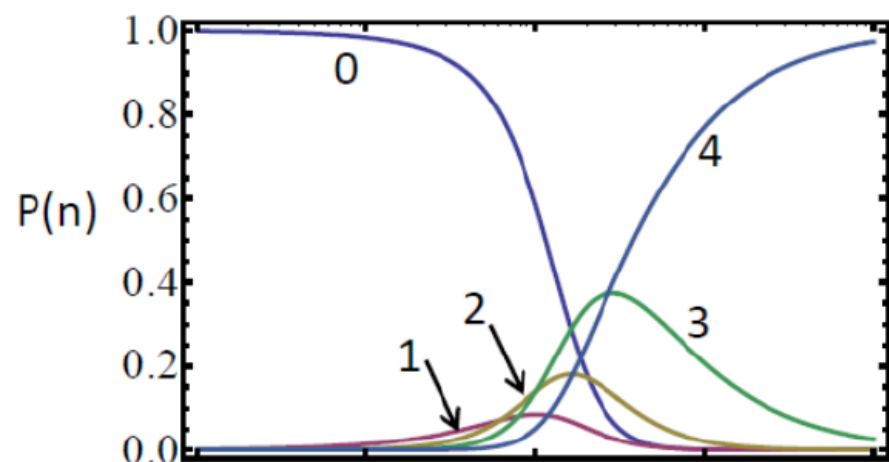
$$\Theta = \frac{\langle n \rangle}{4} = \frac{1}{4} \frac{\lambda}{\Xi} \frac{\partial \Xi}{\partial \lambda}$$

$$= \Xi^{-1} \left[ \lambda e^{-\epsilon_T/kT} \left( 1 + \lambda e^{-\epsilon_T/kT} \right)^3 + e^{-\epsilon/kT} \lambda e^{-\epsilon_R/kT} \left( 1 + \lambda e^{-\epsilon_R/kT} \right)^3 \right]$$



$$P(n) = \Xi^{-1} \left[ \binom{4}{n} \lambda^n e^{-\epsilon_T n/kT} + e^{-\epsilon/kT} \binom{4}{n} \lambda^n e^{-\epsilon_R n/kT} \right]$$

$$P(T) = \Xi_T/\Xi \quad ; \quad P(R) = \Xi_R/\Xi$$

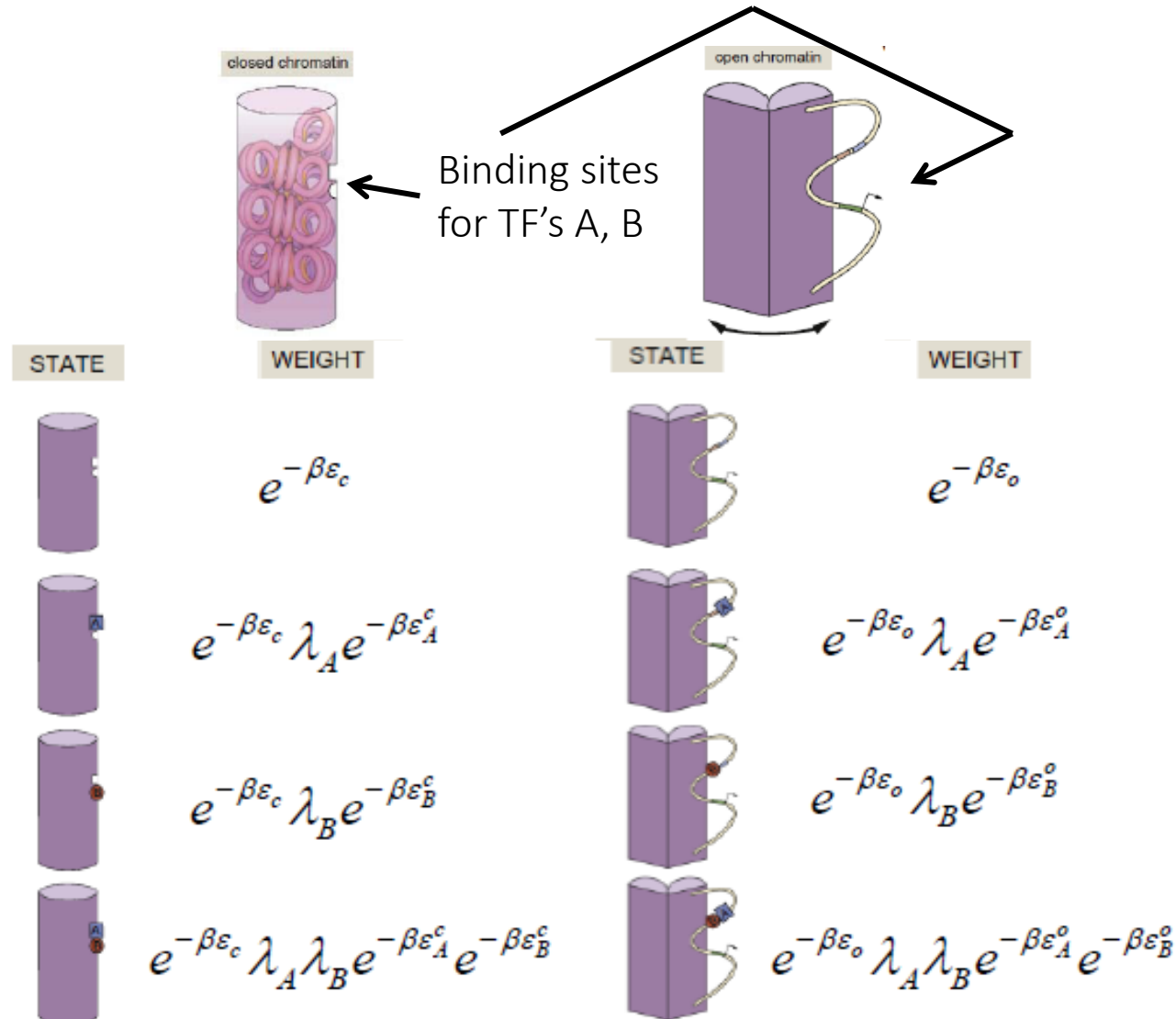


MWC

Langmuir

# MWC and genome accessibility

Genomic DNA can be in a compact state with (effectively) low affinity for transcription factors (TF) and an 'open' state with high(er) affinity :



closed chromatin



STATE

WEIGHT



$$e^{-\beta\epsilon_c}$$



$$e^{-\beta\epsilon_c} \lambda_A e^{-\beta\epsilon_A^c}$$



$$e^{-\beta\epsilon_c} \lambda_B e^{-\beta\epsilon_B^c}$$



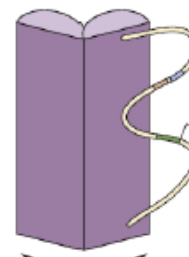
$$e^{-\beta\epsilon_c} \lambda_A \lambda_B e^{-\beta\epsilon_A^c} e^{-\beta\epsilon_B^c}$$

+

$$\Xi_c = e^{-\epsilon_c/kT} \times$$

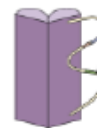
$$(1 + \lambda_A e^{-\epsilon_A^c/kT} + \lambda_B e^{-\epsilon_B^c/kT} + \lambda_A \lambda_B e^{-(\epsilon_A^c + \epsilon_B^c)/kT})$$

open chromatin

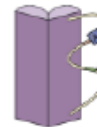


STATE

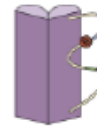
WEIGHT



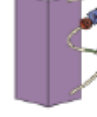
$$e^{-\beta\epsilon_o}$$



$$e^{-\beta\epsilon_o} \lambda_A e^{-\beta\epsilon_A^o}$$



$$e^{-\beta\epsilon_o} \lambda_B e^{-\beta\epsilon_B^o}$$



$$e^{-\beta\epsilon_o} \lambda_A \lambda_B e^{-\beta\epsilon_A^o} e^{-\beta\epsilon_B^o}$$

+

$$\Xi_o = e^{-\epsilon_o/kT} \times$$

$$(1 + \lambda_A e^{-\epsilon_A^o/kT} + \lambda_B e^{-\epsilon_B^o/kT} + \lambda_A \lambda_B e^{-(\epsilon_A^o + \epsilon_B^o)/kT})$$

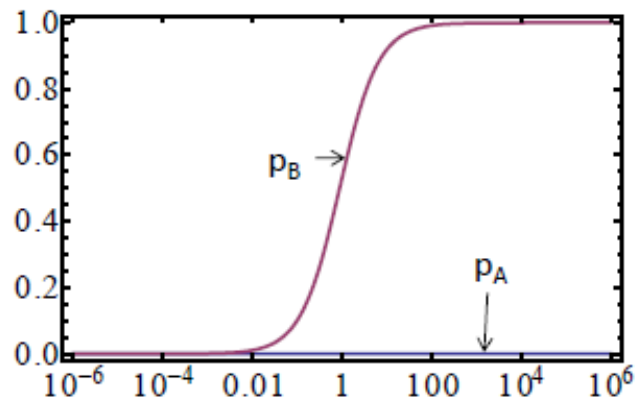
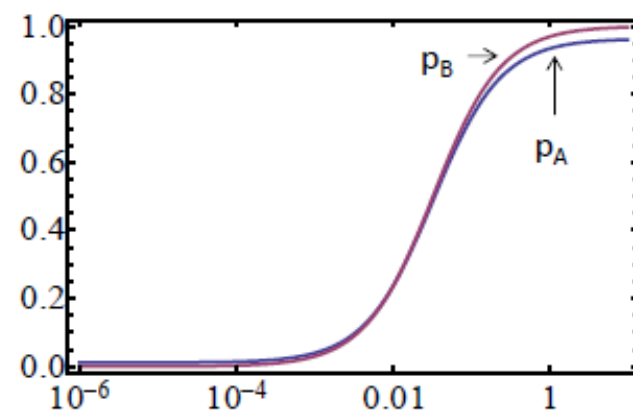
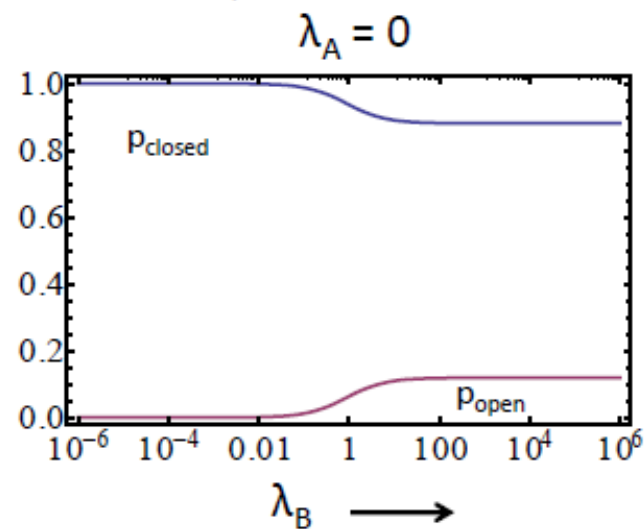
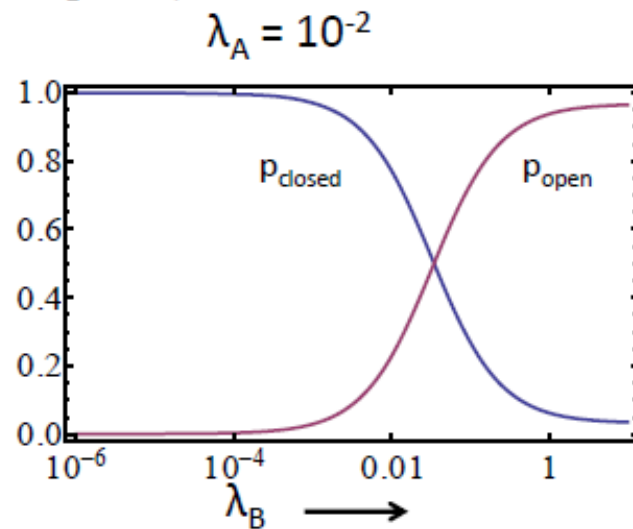
$$\Xi = \Xi_c + \Xi_o$$

Probability of open / closed state  $p_{\text{open}} = \Xi_o / \Xi$        $p_{\text{closed}} = \Xi_c / \Xi$

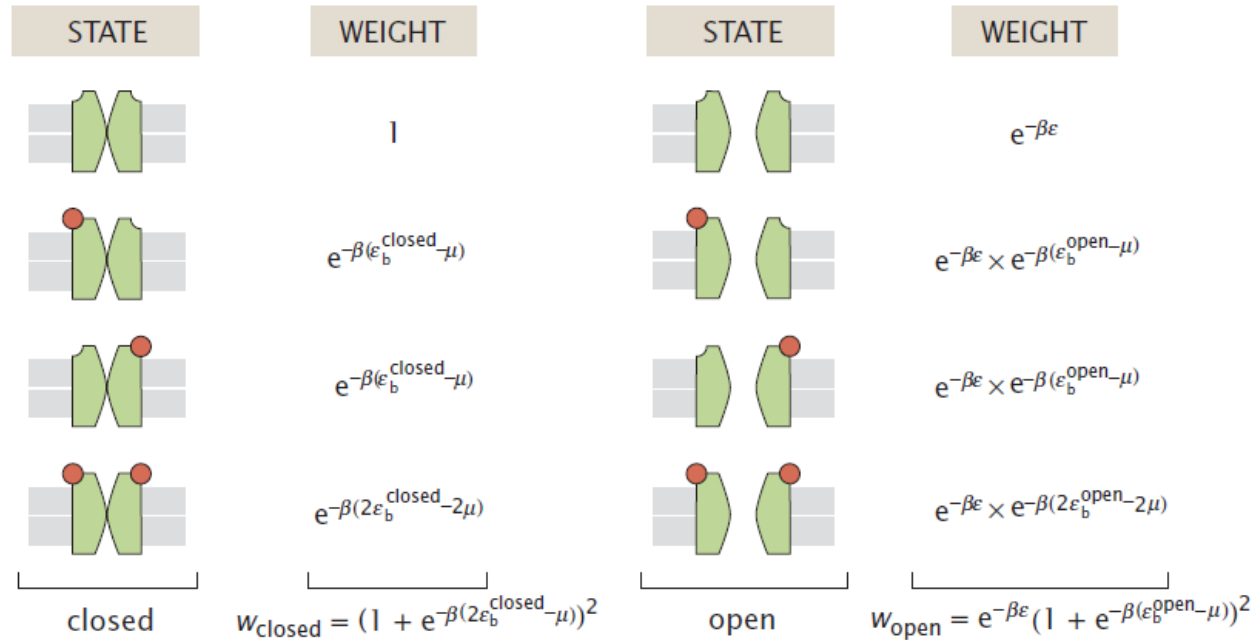
Probability of occupied A, B sites:

$$p_A = \Xi^{-1} \left[ \lambda_A \left( e^{-\beta(\epsilon_o + \epsilon_A^o)} + e^{-\beta(\epsilon_c + \epsilon_A^c)} \right) + \lambda_A \lambda_B \left( e^{-\beta(\epsilon_o + \epsilon_A^o + \epsilon_B^o)} + e^{-\beta(\epsilon_c + \epsilon_A^c + \epsilon_B^c)} \right) \right],$$

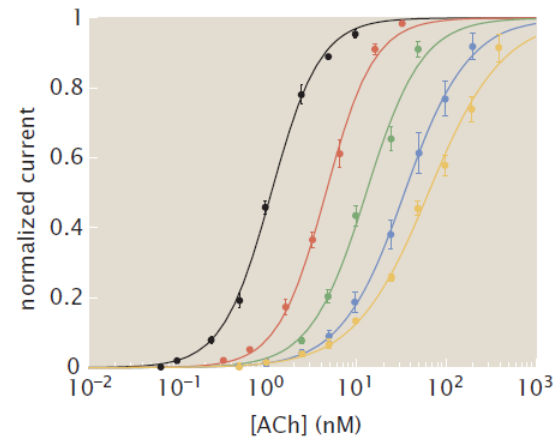
$$p_B = \Xi^{-1} \left[ \lambda_B \left( e^{-\beta(\epsilon_o + \epsilon_B^o)} + e^{-\beta(\epsilon_c + \epsilon_B^c)} \right) + \lambda_A \lambda_B \left( e^{-\beta(\epsilon_o + \epsilon_A^o + \epsilon_B^o)} + e^{-\beta(\epsilon_c + \epsilon_A^c + \epsilon_B^c)} \right) \right].$$



# Ligand - gated ion channels



(B)



tryptophan at position 149:

- Trp ( wild type )
- 5,6,7-F3-Trp
- 5-F-Trp
- 5,7-F2-Trp
- 4,5,6,7-F4-Trp

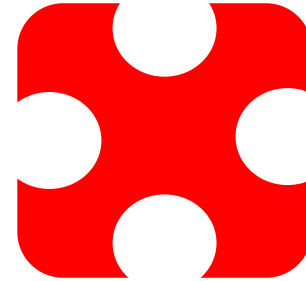


dream line

Outlook : allostery in soft matter – e.g.,



$\epsilon_0$

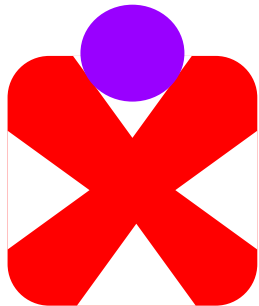


$\epsilon_1 > \epsilon_0$

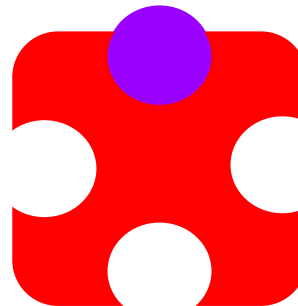
+



+ depletion interaction



$\epsilon_b^{(0)}$



$\epsilon_b^{(1)} < \epsilon_b^{(0)}$



## Legendre transforms & thermodynamic potentials

$$U(S, V, N) = TS - pV + \mu N$$

$$\Omega(T, V, \mu) = -kT \ln \Xi(T, V, \mu) = U - TS - \mu N$$



Thermodynamics – internal energy

$$dU = TdS - pdV + \mu dN$$

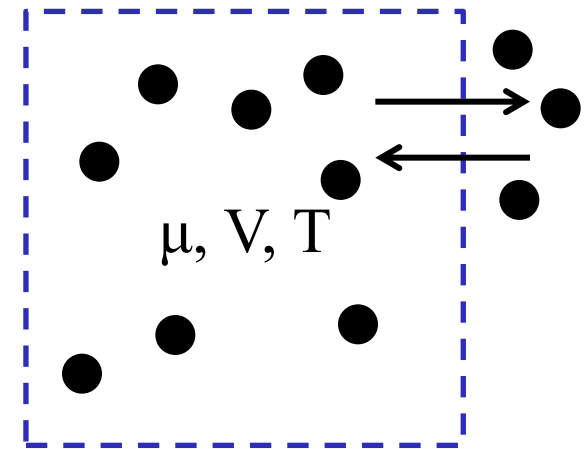
Combine with definition of the grand potential

$$d\Omega = -kTd \ln \Xi = d(U - TS - \mu N) = -SdT - pdV - Nd\mu$$

$$N \equiv \langle N \rangle = - \left( \frac{\partial \Omega}{\partial \mu} \right)_{T,V} = kT \left( \frac{\partial \ln \Xi}{\partial \mu} \right)_{T,V}$$

In terms of fugacity

$$\mu = kT \ln \lambda$$



$$\rightarrow \langle N \rangle = \left( \frac{\partial \ln \Xi}{\partial \ln \lambda} \right)_{T,V} = \lambda \left( \frac{\partial \ln \Xi}{\partial \lambda} \right)_{T,V}$$

Can (and will) generalize  
to multiple components /  
reservoirs