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INNOVATION LECTURES (INNOIEC) www.muni.cz

Binding and Kinetics for Experimental Biologists

Lecture 4
Equilibrium Binding: Case Study

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Tento projekt je spolufinancován Evropským sociálním fondem a státním rozpočtem České republiky.






INVESTICE DO ROZVOJE VZDĚLÁVÁNÍ




Lecture outline

- **Topics:**
 - generalized numerical model for equilibrium binding data
 - *PREVIEW*: model discrimination analysis (Akaike Information Criterion, AIC)
 - representing equilibrium binding mechanisms in *DynaFit*:
 - the “thermodynamic box”;
 - exclusive vs. non-exclusive binding;
 - interacting vs. non-interacting binding sites.
- **Example:**

HIV-1 Rev responsible element (RRE) RNA sequence interacting with

 - (a) a model peptide representing the Rev protein
 - (b) Neomycin B as a potential Rev competitor

Goal: determine molecular mechanism – “Rev” and “Neo” mutually exclusive?


BKEB Lec 4: Equilibrium Binding
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DynaFit: Analysis of complex equilibria

UNIFORM USER INTERFACE: SYMBOLIC DESCRIPTION OF REACTION MECHANISM

```
DynaFit : equil-001.txt
File Edit View Help
Input Output
Double binding of DNA to major late promoter (Prot)
Sha et al. (1995) J. Biol. Chem. 270, 19325, Fig. 3a

[task]
data = equilibrium
task = fit

[mechanism]
Prot + DNA <=> Prot.DNA : K1 dissoci
Prot.DNA + DNA <=> DNA.Prot.DNA : K2 dissoci

[constants]
K1 = 0.001 ?
K2 = 0.01 ?
```

- species names are arbitrary: **P, D** works as well as **Prot, DNA**
- equilibrium constant names are also arbitrary (**K₁, K_{d1}, K_{eq,1}, ...**)
- any number of steps in mechanism
- any mechanism



DynaFit automatically derives the underlying mathematical model

DynaFit: Mathematical model for complex equilibria

"UNDER THE HOOD": A SYSTEM OF SIMULTANEOUS NONLINEAR ALGEBRAIC EQUATIONS

DynaFit uses a modification of algorithm "EQS" by W.R. Smith (1990)

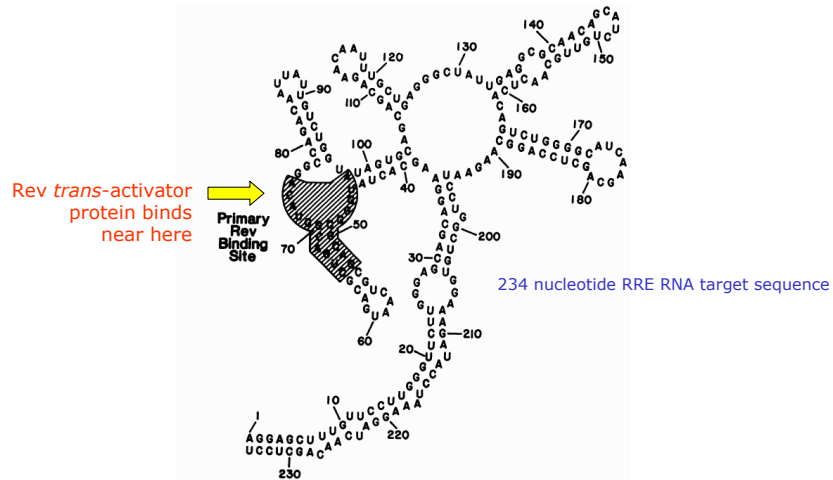
MATHEMATICAL DETAILS:

Royer, C.A.; Smith, W.R.; and Beechem, J.M. (1990)
"Analysis of binding in macromolecular complexes: A generalized numerical approach"
Anal. Biochem., **191**, 287-294.

Royer, C.A. and Beechem, J.M. (1992)
"Numerical analysis of binding data: advantages, practical aspects, and implications"
Methods Enzymol. **210**, 481-505.

Example: HIV-1 Rev response element (RRE)

Rev REGULATES THE TRANSCRIPTION OF HIV-1 REGULATORY PROTEINS



Cullen (1991) *FASEB J.* 5, 2361-8

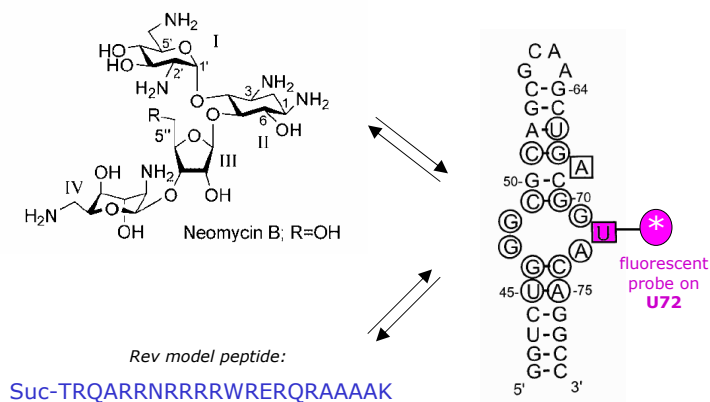
BKEB Lec 4: Equilibrium Binding

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HIV-1 RRE / Rev / Neomycin B

NEOMYCIN BINDS TO Rev RESPONSIBLE ELEMENT. COULD IT DISRUPT THE BINDING OF Rev?



Lacourciere *et al.* (2000) *Biochemistry* 39, 5630-41

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HIV-1 RRE / Rev / Neomycin B – study plan

1. Experiment #1: Observe the binding of RRE to Rev
2. Experiment #2: Observe the binding of RRE to Neomycin
3. Experiment #3: Observe the binding of RRE to Rev + Neomycin
4. Compare the observations with two alternate mechanisms:
 - a. Neomycin competes with Rev peptide ...
 - b. Neomycin does *not* compete with Rev peptide for binding to the fluorescently labeled RNA fragment
5. Conclude which of the two models is more likely to be true

DynaFit script: Skeleton for fitting equilibrium data

EVERY DYNAFIT SCRIPT HAS TO CONTAIN THESE SECTIONS

```
[task]
  task = fit
  data = equilibria

[mechanism] ← definitions of equilibrium constants

[constants] ← numerical estimates of equilibrium constants

[concentrations] ← concentrations of reactants applicable to all data sets

[responses] ← molar response coefficients (e.g., UV/Vis extinction coefficients)

[data]
  variable ... ← which component is varied in the binding experiment
  set      ... ← where to find the experimental data (not the data themselves)

[output]
  directory ...

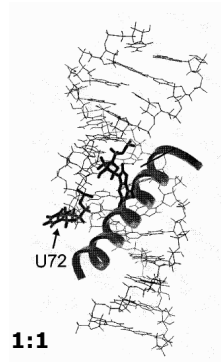
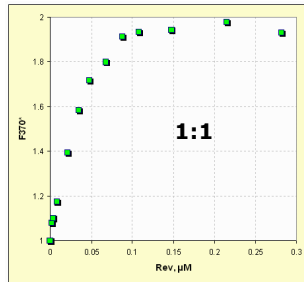
[set:...] ← experimental data

[end]
```

Experiment #1: DynaFit script - mechanism

NOTHING SPECIAL – JUST SIMPLE 1:1 BINDING

[mechanism]



Lacourciere *et al.* (2000) *Biochemistry* **39**, 5630-41

BKEB Lec 4: Equilibrium Binding

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Experiment #1: DynaFit script - constants

LOOK FOR "HALF-MAXIMUM CONCENTRATION" TO ESTIMATE DISSOCIATION CONSTANTS

[mechanism]

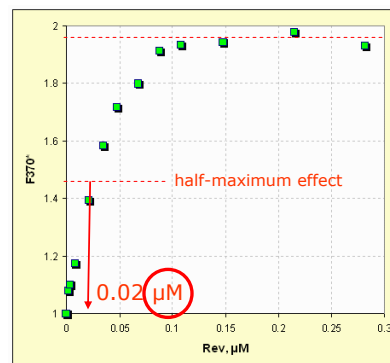


[constants]

$K = 0.02$

dissociation constants have the **same dimension as concentrations**

units must be the **same as those used in the experimental data!**



Lacourciere *et al.* (2000) *Biochemistry* **39**, 5630-41

BKEB Lec 4: Equilibrium Binding

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Experiment #1: DynaFit script - concentrations

LIST ONLY **CONSTANT** (NOT VARIABLE) CONCENTRATIONS **IDENTICAL** IN ALL DATA SETS

```
[mechanism]
R72 + Rev <=> R72.Rev : K dissoci
```

```
[constants]
```

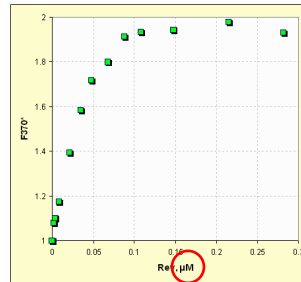
```
K = 0.02
```

```
[concentrations]
```

[R72] = 30 nM

```
R72 = 0.03
```

units must be the same as those used in the experimental data!



Lacourciere *et al.* (2000) *Biochemistry* **39**, 5630-41

Experiment #1: DynaFit script - responses

LIST **ALL** MOLECULAR SPECIES **"VISIBLE"** IN THE GIVEN EXPERIMENTS

```
[mechanism]
R72 + Rev <=> R72.Rev : K dissoci
```

```
[constants]
```

```
K = 0.02
```

$2.0 / 0.03 = 66.6$

```
[concentrations]
```

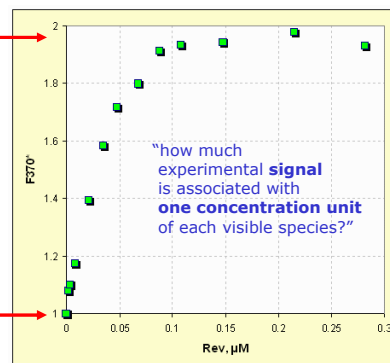
```
R72 = 0.03
```

```
[responses]
```

```
R72 = 33.3
```

```
R72.Rev = 66.6
```

$1.0 / 0.03 = 33.3$



Lacourciere *et al.* (2000) *Biochemistry* **39**, 5630-41

Experiment #1: DynaFit script - data

EXPERIMENTAL DATA CAN BE **EMBEDDED** IN THE SCRIPT OR RESIDE IN **SEPARATE FILES**

```
[mechanism]
R72 + Rev <=> R72.Rev : K dissoci

[constants]
K = 0.02

[concentrations]
R72 = 0.03

[responses]
R72 = 33.3
R72.Rev = 66.6

[data]
variable Rev
set R72--Rev
```

```
[set:R72--Rev]
Figure 2B in Lacourciere et al. (2000)
Rev,uM F370*
0.0000 1
0.0020 1.0803
0.0040 1.1005
0.0080 1.1749
0.0213 1.3921
0.0347 1.5824
0.0480 1.7166
0.0680 1.7993
0.0880 1.9123
0.1080 1.9317
0.1480 1.9436
0.2147 1.9781
0.2813 1.9298
```

a "comment"

raw data courtesy of
Jim Stivers
Johns Hopkins University

Experiment #1: DynaFit – optimized parameters

WHAT ARE THE "UNKNOWN" IN THIS EXPERIMENT?

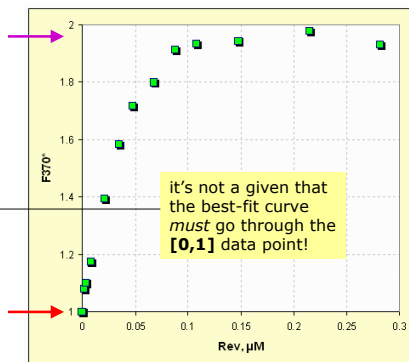
```
[mechanism]
R72 + Rev <=> R72.Rev : K dissoci

[constants]
K = 0.02 ?

[concentrations]
R72 = 0.03

[responses]
R72 = 33.3 ?
R72.Rev = 66.6 ?

[data]
variable Rev
set R72--Rev
```



Experiment #1: DynaFit – initial estimate

ALWAYS USE THIS FEATURE TO ASSESS THE QUALITY OF YOUR INITIAL ESTIMATE!

The screenshot shows the DynaFit interface. The left window, titled 'DynaFit : Fig2B-001', has a menu with 'Try' highlighted. The main window, titled 'HTML : DynaFit Results', shows a tree view with 'Fitting of complex equilibria' expanded. A plot of 'signal' vs '[Rev]' is displayed, showing a hyperbolic binding curve. The plot includes a dashed horizontal line at signal ≈ 1.75 and a solid yellow curve fitting the data points. The following parameters are listed in yellow text on the plot:

- $K_d = 0.02$
- $r_{R72} = 33.3$
- $r_{R72.Rev} = 66.6$

Experiment #1: DynaFit – performing the fit

RUN THE SCRIPT ONLY WHEN THE INITIAL ESTIMATE LOOKS REASONABLY GOOD!

The screenshot shows the DynaFit interface after performing the fit. The left window, titled 'DynaFit : Fig2B-001', has a menu with 'Run' highlighted. The main window, titled 'HTML : DynaFit Results', shows the same tree view as in the previous slide. The plot of 'signal' vs '[Rev]' is updated with the following parameters in yellow text:

- $K_d = 0.013$
- $r_{R72} = 33.4$
- $r_{R72.Rev} = 67.8$

A devil in the detail: Is our labeled [RNA] correct?

DynaFit output:

Optimized Parameters						
No.	Par#Set	Initial	Final	Std. Error	CV (%)	Note
#1	K	0.02	0.0126128	0.0021282	16.87	
#2	r(R72)	33.3	33.4412	0.592298	1.77	
#3	r(R72.Rev)	66.6	67.8477	0.868964	1.28	

Special situation: the K_d is *lower* than the (fixed) RNA concentration!

$$\begin{aligned} [R72] &= \mathbf{0.030} \mu\text{M} \\ K_d &= \mathbf{0.013} \mu\text{M} \end{aligned}$$



When the “fixed” concentration is higher than K_d ...

Analytical Biochemistry **286**, 45–50 (2000)

High-Throughput Screening of Enzyme Inhibitors:
Simultaneous Determination of Tight-Binding Inhibition
Constants and Enzyme Concentration

Petr Kuzmič,*¹ Kyle C. Elrod,† Lynne M. Cregar,† Steve Sideris,† Roopa R
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‡Department of Medicinal Chemistry, Axys Pharmaceuticals, Inc., 180 Kimball Way, South San

... then it *must* be optimized, along with the K_d !

Experiment #1: Optimized parameters – Take 2

ADD ONE MORE "UNKNOWN" AND SEE WHAT HAPPENS ...

[mechanism]



[constants]

$$K = 0.02 \quad ?$$

[concentrations]

$$R72 = 0.03 \quad ?$$

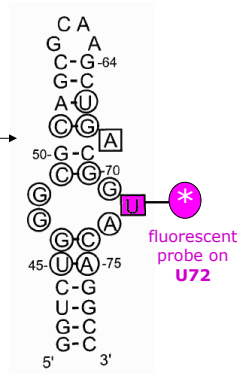
[responses]

$$R72 = 33.3 \quad ?$$

$$R72.Rev = 66.6 \quad ?$$

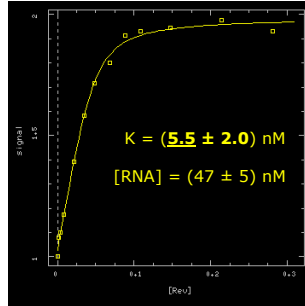
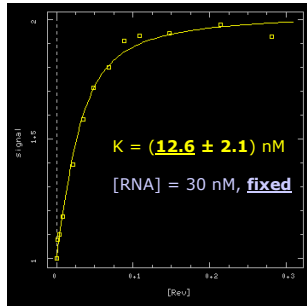
[data]

```
variable Rev
set      R72--Rev
```



Fixed or optimized [RNA]? Model selection results

AKAIKE INFORMATION CRITERION IS INCONCLUSIVE



Model discrimination analysis

Minimum sum of squares = 0.00497308

Akaike Information Criterion sum of squares did decrease by a factor of two

	model	n_D	n_p	SS_{red}	AIC_c	ΔAIC_c	weight
[1]	fixed RNA conc.	13	3	1.957	-47.2	3.2	0.171
[2]	optimized RNA conc.	13	4	1.000	-50.4	0.0	0.829

→ this number must be larger than ~10

→ "Akaike weight" must be larger than ~0.95

however the number of adjustable parameters increased!

Fixed or optimized [RNA]? Confidence intervals

THE "PLUS OR MINUS" STANDARD ERRORS ARE ALMOST **ALWAYS WRONG** (TOO SMALL)

```
[task]
  task = fit
  data = equilibria

[mechanism]
  R72 + Rev <==> R72.Rev      :      K      dissoci

[constants]
  K = 0.02 ??

[concentrations]
  R72 = 0.03 ??

[responses]
  R72      = 33.3 ?
  R72.Rev = 66.6 ?
  ...
```

"PROFILE-T" METHOD

Watts, D. G. (1994)
"Parameter estimation from nonlinear models"
Methods Enzymol. **240**, 24-36.

Bates, D. M., and Watts, D. G. (1988)
Nonlinear Regression Analysis and its Applications
Wiley, New York, pp. 127-130

Confidence intervals: Results

THE NOMINAL [RNA] CONCENTRATION IS **PROBABLY INCORRECT**

DynaFit output:

Optimized Parameters

No.	Par#Set	Initial	Final	Std. Error	CV (%)	Low	Low P (%)	High	High P (%)
#1	K	0.02	0.0054574	0.00198625	36.40	0.00219474	95	0.0112241	95
#2	[R72]	0.03	0.0473544	0.00484073	10.22	0.0346082	95	0.057239	95
#3	r(R72)	33.3	21.6544	2.07801	9.60				
#4	r(R72.Rev)	66.6	41.9983	4.55354	10.84				

parameter	best-fit value	formal error, ±	confidence interval (95%)	
K_d , nM	5.5	2.0	2.2 — 11.2	
[R72], nM	47.4	4.8	34.6 — 57.2	... nominal: 30.0

reasonable suspicion:
actual RNA concentration *might* be **higher by ~60%** than the nominal value

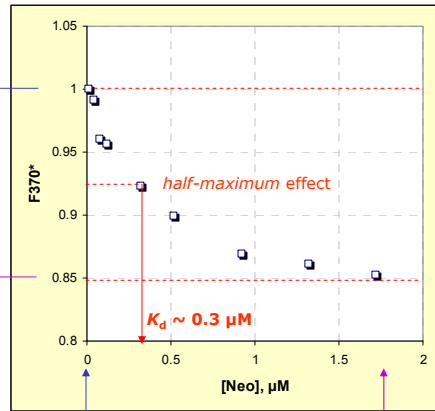
Experiment #2: RRE / Neomycin – raw data

FIXED RRE-72AP CONCENTRATION: $[R72] = 0.1 \mu\text{M}$

INITIAL ESTIMATES:

molar response of **R72**
 $1.0/0.1 = \mathbf{10}$

molar response of **R72.Neo**
 $0.85/0.1 = \mathbf{8.5}$



only **R72**
 $(0.1 \mu\text{M})$

only **R72.Neo**
 $(0.1 \mu\text{M})$

Experiment #2: RRE / Neomycin – script

USING INITIAL ESTIMATES ESTIMATED FROM RAW DATA

```
[task]
task = fit
data = equilibria

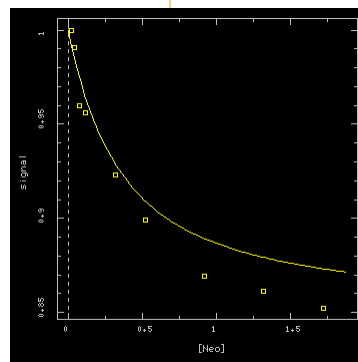
[mechanism]
R72 + Neo <=> R72.Neo :

[constants]
K = 0.3 ??

[concentrations]
R72 = 0.1 ; fixed!

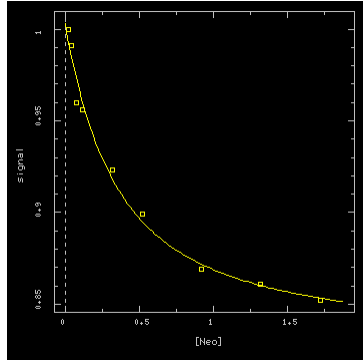
[responses]
R72 = 10 ?
R72.Neo = 8.5 ?
...
```

File .. Try



Experiment #2: RRE / Neomycin – results

USING INITIAL ESTIMATES FROM PREVIOUS SLIDE



parameter	best-fit value	formal error, \pm	confidence interval (95%)
K_d , μM	0.29	0.07	0.15 — 0.56

DynaFit output:

No.	Par#Set	Initial	Final	Std. Error	CV (%)	Low	Low P (%)	High	High P (%)	Note
#1	K	0.3	0.289936	0.0728402	25.12	0.15153	95	0.562575	95	
#2	r(R72)	10	10.0329	0.0556981	0.56					
#3	r(R72.Neo)	8.5	8.2671	0.104526	1.26					

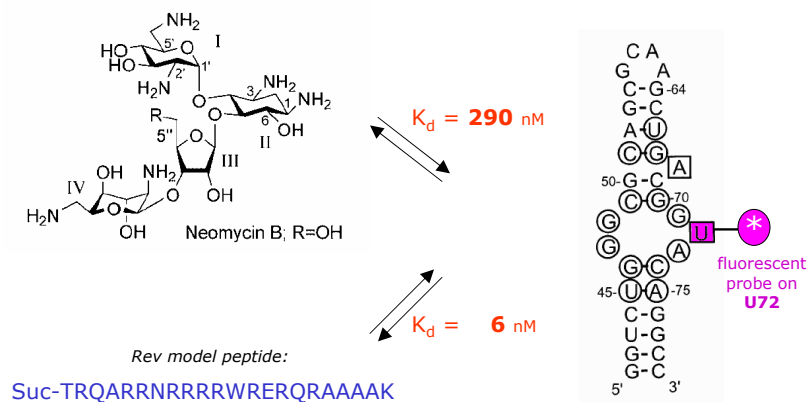


BKEB Lec 4: Equilibrium Binding

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Experiment #1 & #2: Summary

ONLY **BINARY** INTERACTIONS STUDIED SO FAR



BKEB Lec 4: Equilibrium Binding

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The main question remains unanswered

Could Neomycin *prevent* the Rev peptide from binding to the RNA?

in other words:

Is the binding of Rev and Neomycin *simultaneous* or *exclusive*?
non-competitive competitive

And how do we translate these ideas into *stoichiometric notation*?

DynaFit

Simultaneous vs. exclusive: stoichiometry

IT DEPENDS ON **HOW MANY DIFFERENT COMPLEXES** ARE FORMED

EXCLUSIVE: • **not necessarily** different binding sites



SIMULTANEOUS: • **always at different binding sites**



Simultaneous vs. exclusive: DynaFit notation

HOW MANY DIFFERENT COMPLEXES IS NOT THE ONLY QUESTION

[mechanism] ; exclusive

```
RRE + Rev <====> RRE.Rev      : Kr  dissoc
Neo + RRE <====> Neo.RRE      : Kn  dissoc
```

[mechanism] ; simultaneous

```
RRE + Rev <====> RRE.Rev      : Kr  dissoc
Neo + RRE <====> Neo.RRE      : Kn  dissoc
??? + ??? <====> Neo.RRE.Rev  : ??  dissoc
```



what goes here?

Two new concepts to consider ...

... BEFORE WE CAN FINISH OUR DYNAFIT SCRIPT

1. "thermodynamic box"
2. independent vs. interacting sites

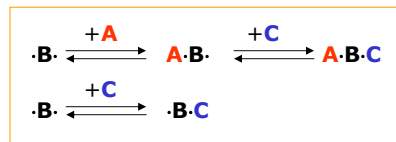
From stoichiometry to molecular mechanism

ONLY **BIMOLECULAR** INTERACTIONS ARE REALISTIC: **THREE** MOLECULES **NEVER** COLLIDE !

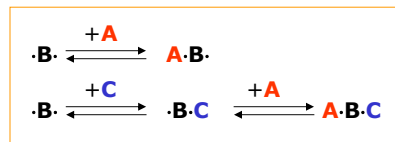
overall stoichiometry:



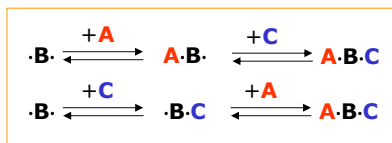
possible molecular mechanisms:



sequential I



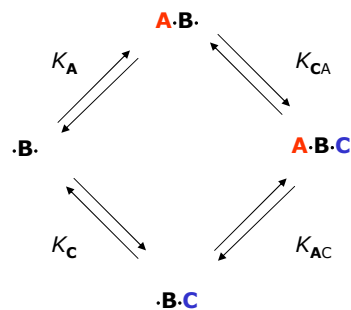
sequential II



random

Thermodynamic box: A very general idea

NO MATTER WHICH PATH WE TAKE, THE **FREE-ENERGY CHANGE** MUST BE THE SAME



all "K"s are *dissociation* constants

$$K_{CA} \times K_A = K_{AC} \times K_C$$

dissociation
from ABC:
first C then A

dissociation
from ABC:
first A then C

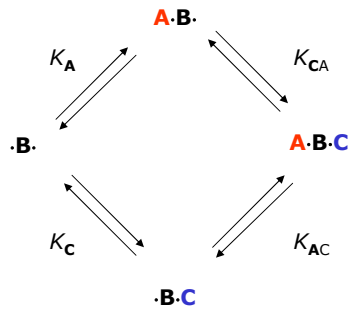
Only **three of four** equilibrium constants can have an **arbitrary** value.

Any one of the *K*'s is **a priori** defined in terms of the remaining three.

It does not matter which *K* we select to be dependent on the remaining three.

Thermodynamic box: DynaFit notation

THERE ARE MULTIPLE EQUIVALENT WAYS TO SPECIFY THE "RANDOM" MECHANISM IN DYNAFIT



all "K"s are *dissociation* constants

for example:

```
[mechanism]
A + B <=> AB : Kc diss
B + C <=> BC : Kc diss
AB + C <=> ABC : Kca diss
```

or, equivalently:

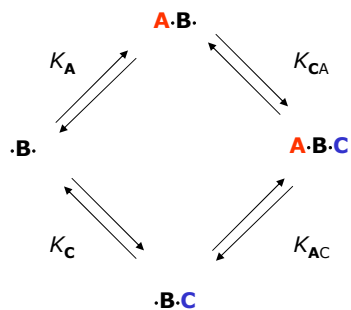
```
[mechanism]
A + B <=> AB : Ka diss
B + C <=> BC : Kc diss
A + BC <=> ABC : Kac diss
```

There must be **only three** steps
(**any** three) in the DynaFit notation!

How many other ways exist
to specify this mechanism in DynaFit ?

Independent / interacting sites

WHETHER OR NOT PAIRS OF EQUILIBRIUM CONSTANTS IN THE "BOX" ARE THE SAME



all "K"s are *dissociation* constants

independent sites:

$$K_{CA} = K_C$$

$$K_{AC} = K_A$$

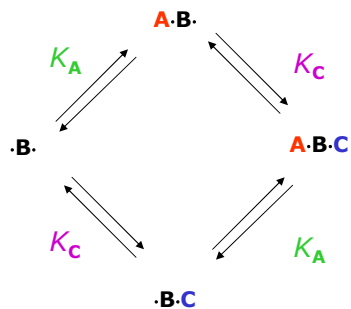
interacting sites:

$$K_{CA} \neq K_C$$

$$K_{AC} \neq K_A$$

Independent sites: DynaFit notation

THERE ARE MULTIPLE EQUIVALENT WAYS TO SPECIFY THIS, TOO



for example:

```
[mechanism]
A + B <=> AB : KA diss
B + C <=> BC : Kc diss
AB + C <=> ABC : Kc diss
```

or, equivalently:

```
[mechanism]
A + B <=> AB : Ka diss
B + C <=> BC : Kc diss
A + BC <=> ABC : Ka diss
```

Only **two** distinct dissociation constants.

all "K"s are *dissociation* constants

Simultaneous vs. exclusive: DynaFit notation

FINALLY WE KNOW ENOUGH THEORY TO FINISH THE DYNAFIT SCRIPT

```
[mechanism] ; exclusive
```

```
RRE + Rev <=> RRE.Rev : Kr dissoc
Neo + RRE <=> Neo.RRE : Kn dissoc
```

```
[mechanism] ; simultaneous, non-interacting
```

```
RRE + Rev <=> RRE.Rev : Kr dissoc
Neo + RRE <=> Neo.RRE : Kn dissoc

Neo.RRE + Rev <=> Neo.RRE.Rev : Kr dissoc
```

```
[mechanism] ; simultaneous, interacting
```

```
RRE + Rev <=> RRE.Rev : Kr dissoc
Neo + RRE <=> Neo.RRE : Kn dissoc

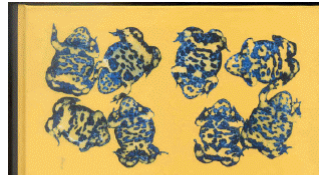
Neo.RRE + Rev <=> Neo.RRE.Rev : Krn dissoc
```

Automatic model selection in DynaFit

```
[task]
  task = fit
  data = equilibria
  model = exclusive ?
...
...

[task]
  task = fit
  data = equilibria
  model = interacting ?
...
...

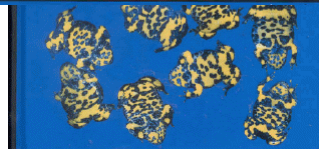
[task]
  task = fit
  data = equilibria
  model = non-interacting ?
...
...
```



MODEL SELECTION AND MULTIMODEL INFERENCE
A Practical Information-Theoretic Approach

MODEL SELECTION AND MULTIMODEL INFERENCE
A Practical Information-Theoretic Approach
SECOND EDITION

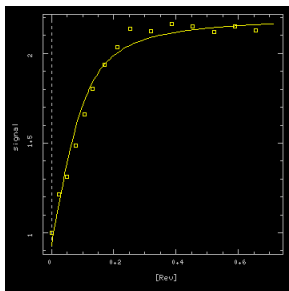
KENNETH P. BURNHAM • DAVID R. ANDERSON



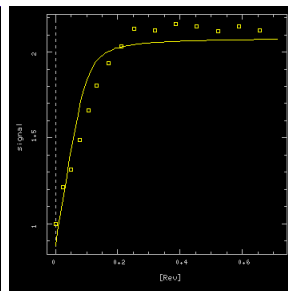
Model selection: round 1 – fixed [RNA]

NEITHER MODEL FITS VERY WELL AT ALL!

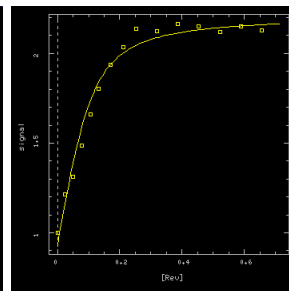
experiment #3 labeled [RNA]: 100 nM, constant [RNA] is under suspicion
 Neomycin B: 990 nM, constant
 Rev peptide: 0 – 655 nM, varied



exclusive



non-interacting



interacting

All equilibrium constants were **fixed** at values determined in **binary** binding studies.

Model selection: round 2 – optimized [RNA]

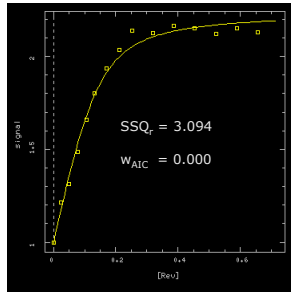
GOODNESS-OF-FIT IS MUCH IMPROVED

experiment #3

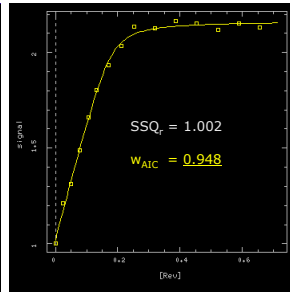
labeled [RNA]: **178 nM, optimized** in the fit

Neomycin B: 990 nM, constant

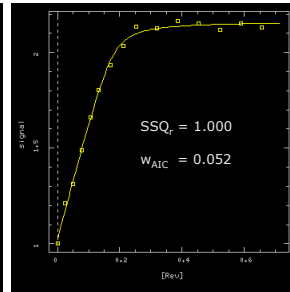
Rev peptide: 0 – 655 nM, varied



exclusive



non-interacting



interacting

actual [RNA] **78% higher** than nominal?

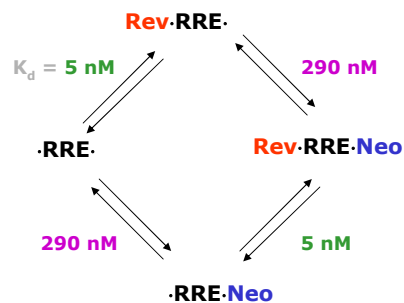


BKEB Lec 4: Equilibrium Binding

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Mechanism for HIV-1 RRE / Neomycin / Rev

NON-EXCLUSIVE BINDING TO TWO DISTINCT, NON-INTERACTING SITES

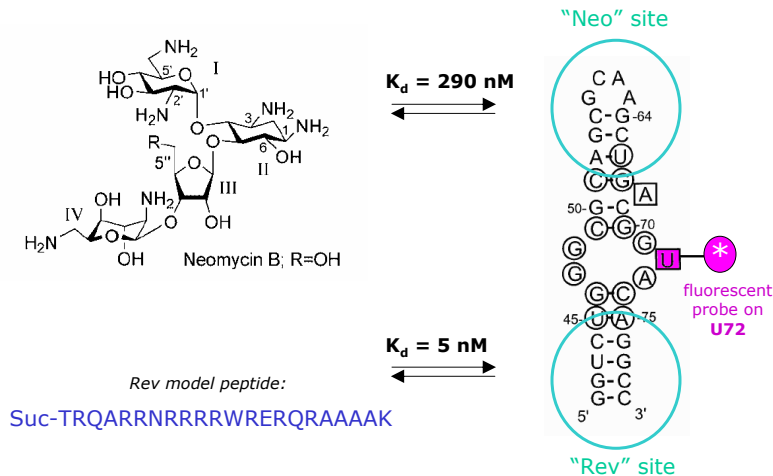


BKEB Lec 4: Equilibrium Binding

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Mechanism for HIV-1 RRE / Neomycin / Rev

STRUCTURAL IMPLICATIONS OF THE BINDING DATA: **SEPARATE BINDING SITES**



Summary and conclusions

1. Equilibrium binding data are easily handled by numerical models. Arbitrary conditions (no “excess of **A** over **B**”); arbitrarily complex mechanisms.
2. Certain **restrictions** exist on **representing reaction mechanisms**. The “thermodynamic box” rule must always be obeyed.
3. **Exclusive vs. non-exclusive** binding is expressed simply as a **different number of complexes** present in the overall mechanism.
4. **Interacting vs. non-interacting** sites are expressed simply by assigning **identical vs. unique values** to equilibrium constants.
5. Incorrectly specified concentrations have a large impact on best-fit values of equilibrium constants *and* on model selection.

BUT THERE IS SOME RELIEF:

when the binding is “tight”, **actual concentrations can be inferred** from the data;
when the binding is “loose”, systematic concentration errors do not matter (much).

6. DynaFit is not a “silver bullet”: You must still **use your brain** a lot.