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# Numerical Enzyme Kinetics

using **DynaFit** software

Petr Kuzmič, Ph.D.  
BioKin, Ltd.

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## Statement of the problem

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There are **no traditional (algebraic) rate equations** for many important cases:

- **Time-dependent** inhibition in the general case  
substrate depletion  
enzyme deactivation
- **Tight binding** inhibition in the general case  
impurities in inhibitors  
dissociative enzymes
- **Auto-activation** inhibition  
e.g., protein kinases
- *Many other practically useful situations.*

## Solution

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- Abandon traditional algebraic formalism of enzyme kinetics
- Deploy **numerical (iterative) fitting modes** instead

This approach is *not new*:

D. Garfinkel (1960's - 1970's)  
C. Frieden (1980's - 1990's)  
P. Kuzmic (2000's - present)  
K. Johnson (2010's - present)

SOFTWARE

BIOSYM  
KINSIM  
DynaFit ←  
Kinetic Explorer

## *Introduction: A bit of theory*

## Numerical vs. algebraic mathematical models

FROM A VARIETY OF ALGEBRAIC EQUATIONS TO A UNIFORM SYSTEM OF DIFFERENTIAL EQUATIONS

EXAMPLE: Determine the rate constant  $k_1$  and  $k_{-1}$  for  $A + B \xrightleftharpoons[k_{-1}]{k_1} AB$

ALGEBRAIC EQUATIONS	DIFFERENTIAL EQUATIONS
$AB_t = AB_{\max}(1 - e^{-k_{\text{obs}}t})$ $k_{\text{obs}} = k_1[B]_i + k_{-1}$	$\left. \begin{aligned} d[A]/dt &= -k_1[A][B] + k_{-1}[AB] \\ d[B]/dt &= -k_1[A][B] + k_{-1}[AB] \\ d[AB]/dt &= +k_1[A][B] - k_{-1}[AB] \end{aligned} \right\}$
Applies only when $[B] \gg [A]$	Applies under all conditions

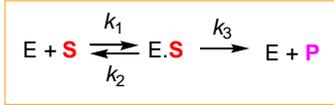
## Advantages and disadvantages of numerical models

THERE IS NO SUCH THING AS A FREE LUNCH

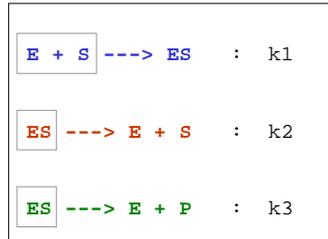
ADVANTAGE	ALGEBRAIC MODEL	DIFFERENTIAL MODEL
can be derived for any molecular mechanism	-	+
can be derived automatically by computer	-	+
can be applied under any experimental conditions	-	+
can be evaluated without specialized software	+	-
requires very little computation time	+	-
does not <i>always</i> require an initial estimate	+	-
is resistant to truncation and round-off errors	+	-
has a long tradition: many papers published	+	-

## A "Kinetic Compiler"

HOW DYNAFIT PROCESSES YOUR BIOCHEMICAL EQUATIONS



Input (plain text file):



Rate terms:

$$k_1 \times [E] \times [S]$$

$$k_2 \times [ES]$$

$$k_3 \times [ES]$$

Rate equations:

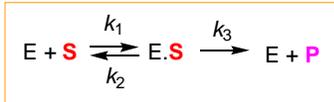
$$d[E] / dt = -k_1 \times [E] \times [S] + k_2 \times [ES] + k_3 \times [ES]$$

$$d[ES] / dt = +k_1 \times [E] \times [S] - k_2 \times [ES] - k_3 \times [ES]$$

Similarly for other species...

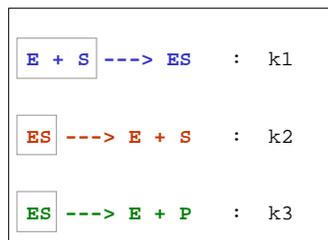
## System of Simple, Simultaneous Equations

HOW DYNAFIT PROCESSES YOUR BIOCHEMICAL EQUATIONS



"The **LEGO** method"  
of deriving rate equations

Input (plain text file):

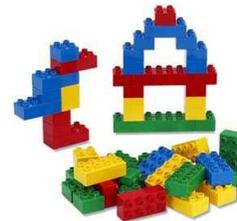


Rate terms:

$$k_1 \times [E] \times [S]$$

$$k_2 \times [ES]$$

$$k_3 \times [ES]$$



## DynaFit can analyze many types of experiments

MASS ACTION LAW AND MASS CONSERVATION LAW IS APPLIED IN THE SAME WAY

	EXPERIMENT	DYNAFIT DERIVES A SYSTEM OF ...
chemistry biophysics enzymology	Kinetics (time-course)	Ordinary differential equations (ODE)
	Equilibrium binding	Nonlinear algebraic equations
	Initial reaction rates	Nonlinear algebraic equations

### Example 1: Inhibition of HIV protease

“Tight binding” inhibition constant from initial rates

Use  $K_i^{\text{app}}$  values, not  $IC_{50}$ 's

Wha't wrong with  $IC_{50}$ 's ?

## Measures of inhibitory potency

INTRINSIC MEASURE OF POTENCY:

$$\Delta G = -RT \log K_i$$

DEPENDENCE ON EXPERIMENTAL CONDITIONS	Depends on		Example:
	[S]	[E]	Competitive inhibitor
<b>1. Inhibition constant</b>	<b>NO</b>	<b>NO</b>	$K_i$
<b>2. Apparent <math>K_i</math></b>	<b>YES</b>	<b>NO</b>	$K_i^* = K_i (1 + [S]/K_M)$
<b>3. <math>IC_{50}</math></b>	<b>YES</b>	<b>YES</b>	$IC_{50} = K_i (1 + [S]/K_M) + [E]/2$

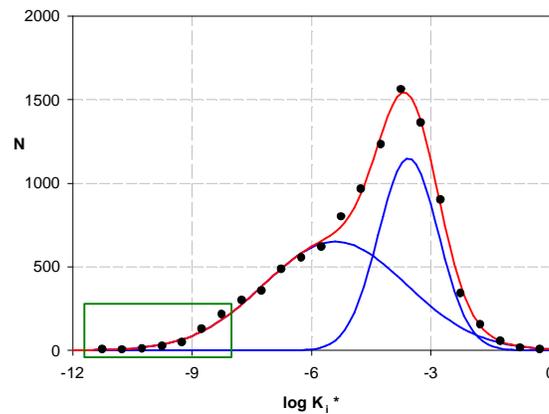
"CLASSICAL" INHIBITORS:  $[E] \ll K_i$ :  $IC_{50} \approx K_i^*$

"TIGHT BINDING" INHIBITORS:  $[E] \approx K_i$ :  $IC_{50} \neq K_i^*$

## Tight binding inhibitors : $[E] \approx K_i$

HOW PREVALENT IS "TIGHT BINDING"?

A typical data set:  $\sim 10,000$  compounds  
 Completely inactive:  $\sim 1,100$  ... NOT SHOWN  
 Tight binding:  $\sim 400$

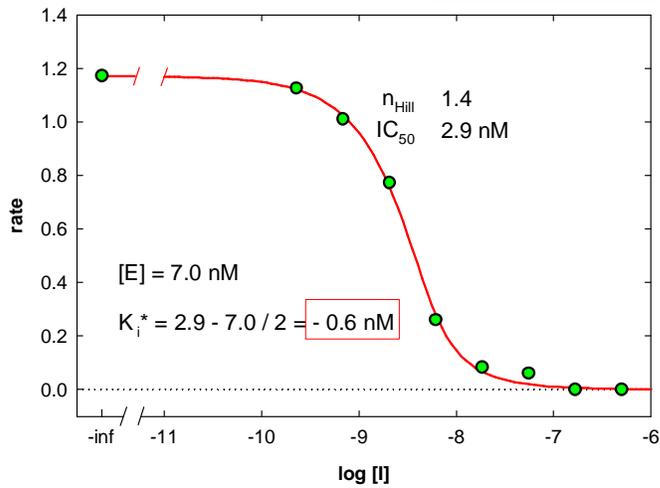


Data courtesy of  
Celera Genomics

### Problem: Negative $K_i$ from $IC_{50}$

FIT TO FOUR-PARAMETER LOGISTIC:

$$K_i^* = IC_{50} - [E] / 2$$



Data courtesy of  
Celera Genomics

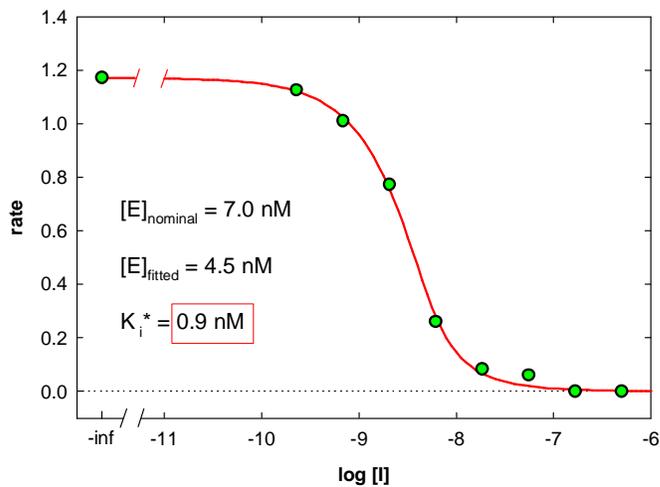


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13

### Solution: Do not use four-parameter logistic

FIT TO MODIFIED MORRISON EQUATION: [P. Kuzmic et al. \(2000\) Anal. Biochem. 281, 62-67.](#)  
[P. Kuzmic et al. \(2000\) Anal. Biochem. 286, 45-50.](#)



Data courtesy of  
Celera Genomics



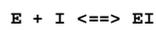
Numerical Enzyme Kinetics

14

live demo

## DynaFit in $K_i^{app}$ determination

- fitting model is very simple to understand:



## Comparison of results

Fitting model	Result
$v = P_{\max} \frac{P_{\max} - P_0}{1 + ([I]/IC_{50})^n}$	$IC_{50} = (1.3 \pm 0.13) \text{ nM}$
$v = V_b + V_0 \frac{[E] - [I] - K_i^* + \sqrt{([E] - [I] - K_i^*)^2 + 4[E] K_i^*}}{2[E]}$	$K_i^* = (0.10 \pm 0.05) \text{ nM}$
$E + I \rightleftharpoons EI \quad : \quad K_i^*$	$K_i^* = (0.10 \pm 0.05) \text{ nM}$

↑ 10 x ! ↓

## Fitting models for enzyme inhibition: Summary

### MEASURE OF INHIBITORY POTENCY

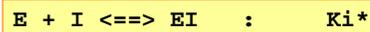
- Apparent inhibition constant  $K_i^*$  is preferred over  $IC_{50}$

### MATHEMATICAL MODELS

- Modified Morrison equation is preferred over four-parameter logistic equation:

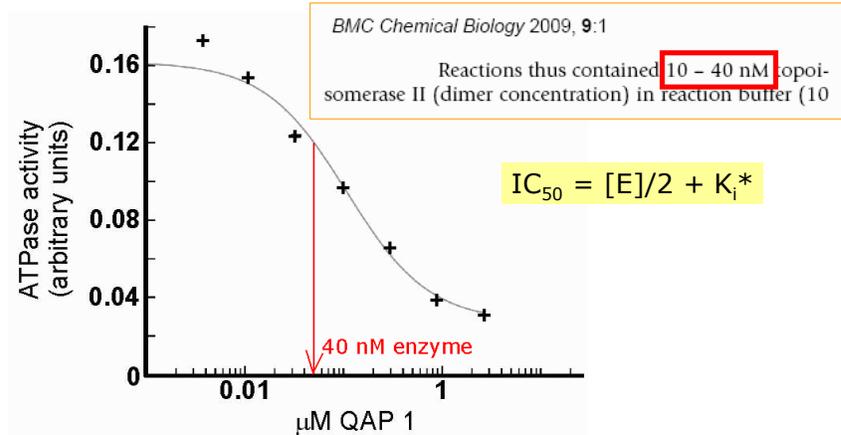
$$v = V_0 + V_0 \frac{[E] - [I] - K_i^* + \sqrt{([E] - [I] - K_i^*)^2 + 4[E]K_i^*}}{2[E]}$$

- A **symbolic** model (DynaFit) is equivalent and more convenient:



## Recent $IC_{50}$ work from Novartis, Basel

Patrick Chène *et al.* (2009) "Catalytic inhibition of topoisomerase II by a novel rationally designed ATP-competitive purine analogue"  
*BMC Chemical Biology* 9:1



## Challenges of moving from $IC_{50}$ to $K_i^{app}$

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- Legitimate need for continuity  
structure of existing corporate databases
  - Simple inertia ("fear of the unknown")
  - Lack of awareness
- 

### POSSIBLE SOLUTIONS:

- Gradual transition (report both  $IC_{50}$  and  $K_i^*$  for a period of time)
- Re-compute historical data:  $K_i^* = IC_{50} - [E]/2$

## Finer points of $K_i^{app}$ determination

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Sometimes  $[E]$  **must** be optimized, but sometimes it **must not** be:

Kuzmic, P., *et al.* (2000) "High-throughput screening of enzyme inhibitors: Simultaneous determination of tight-binding inhibition constants and enzyme concentration" *Anal. Biochem.* **286**, 45-50

"Robust regression" analysis (exclusion of outliers):

Kuzmic, P. (2004) "Practical robust fit of enzyme inhibition data" *Meth. Enzymol.* **383**, 366-381

Serial dilution is **not** always the best:

Kuzmic, P. (2011) "Optimal design for the dose-response screening of tight-binding enzyme inhibitors" *Anal. Biochem.* **419**, 117-122

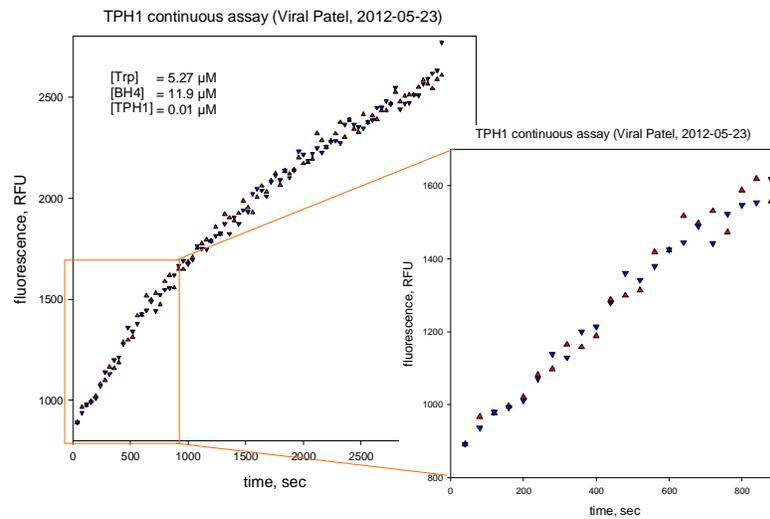
## Example 1: TPH1 inhibition

### Determination of initial reaction rates

from *nonlinear* progress curves

## First look at raw experimental data

NOTE THE EXCELLENT REPRODUCIBILITY: THESE ARE **TWO REPLICATES** ON TOP OF EACH OTHER



## The text-book recipe: Linear fit

STANDARD APPROACH: FIT A **STRAIGHT LINE** TO THE **"INITIAL PORTION"** OF EACH CURVE

To calculate the initial velocity from a reaction progress curve, the investigator first needs to examine the curve to ascertain the portion of it that represents the steady-state region. One needs to be sure that in the selected region, pre-steady-state phenomena are fully resolved, and data representing greater than 10% substrate turnover are excluded. Once the steady-state region of the data set is isolated, linear regression is performed to calculate the slope.

Stein, R. "Kinetics of Enzyme Action" (2011), sect. 2.5.4

Standard curve



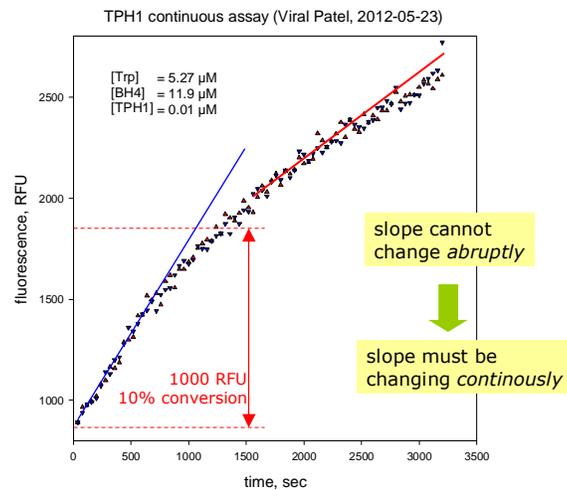
**1  $\mu\text{M}$  of product (5-HT)**  
corresponds to an increase  
in fluorescence of **1919.9 RFU**



Fluorescence change expected at **10% conversion**: ~ **1000 RFU**

## Looking for linearity at less than 10% conversion

IS THIS A "STRAIGHT LINE"?



## Numerical analysis: Fit to a full system of differential equations

### A **NONLINEAR** MODEL OF COMPLETE REACTION PROGRESS

```
[task]
data = progress
task = fit

[mechanism]
E + S <=> ES : kas kds
ES -> E + P : kdp

[constants]
kas = 1000
kds = 100000 ?
kdp = 1 ?

[concentrations]
E = 0.01

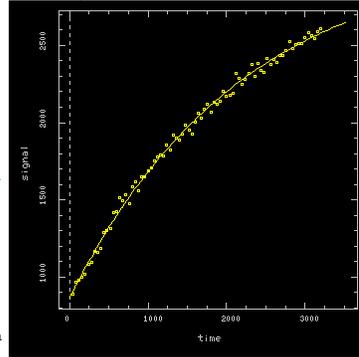
[responses]
P = 100 ?

[data]
sheet B01.txt
column 2 | offset auto ? | concentration

[output]
directory ../output/fit-B01
rate-file ../data/rates/B01v.txt
```

DYNAFIT INPUT

DYNAFIT OUTPUT



## DynaFit auto-generated fitting model

### A **NONLINEAR** MODEL OF COMPLETE REACTION PROGRESS

```
[mechanism]
E + S <=> ES : kas kds
ES -> E + P : kdp
```

$$\begin{aligned}d[E]/dt &= -k_{as}[E][S] + k_{ds}[ES] + k_{dp}[ES] \\d[S]/dt &= -k_{as}[E][S] + k_{ds}[ES] \\d[ES]/dt &= +k_{as}[E][S] - k_{ds}[ES] - k_{dp}[ES] \\d[P]/dt &= +k_{dp}[ES]\end{aligned}$$

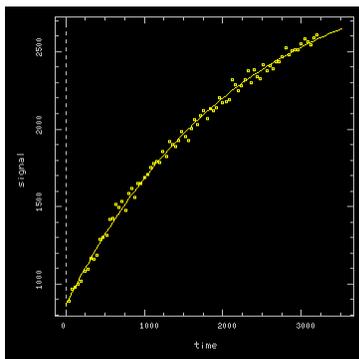
[Back to Index...](#)

Program DynaFit ver. 4.05.004

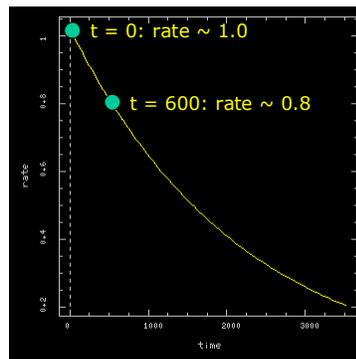
## Instantaneous rate plot

THE SLOPE OF THE PROGRESS CURVE **DOES** CHANGE ALL THE TIME

fluorescence:



rate of change in fluorescence:



**20 %** drop in reaction rate over the first 10 minutes  
(less than 10% substrate conversion)

*live demo*

### DynaFit in “full automation” mode

- suitable for routine processing of many compounds
- mechanism is assumed to be known independently

## Example 2: Inhibition of 5 $\alpha$ -ketosteroid reductase

“Slow, tight” binding

Model discrimination analysis

## Possible molecular mechanisms of time-dependent inhibition

Slow binding proper



Rearrangement of initial enzyme-inhibitor complex



*etc.* (several other possibilities)

## Model discrimination analysis in DynaFit

ANY NUMBER OF ALTERNATE KINETIC MODELS CAN BE COMPARED IN A SINGLE RUN

### DYNAFIT INPUT SCRIPT FILE:

```
[task]
  data = progress | task = fit | model = one-step ?

[mechanism]
  E + S ----> ES : kaS
  ES ----> E + P : kdP
  E + I <=> EI : kaI kdI
  ...

[task]
  data = progress | task = fit | model = two-step ?

[mechanism]
  E + S ----> ES : kaS
  ES ----> E + P : kdP
  E + I <=> EI : kaI kdI
  EI <=> EJ : kIJ kJI
  ...
```

*live demo*

## DynaFit in “model selection” mode

- model selection criteria (AIC, BIC)
- residual analysis
- use common sense to check results

## Summary and conclusions

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### Benefits of using DynaFit in the study of enzyme inhibition:

- **No mathematical models**, only symbolic models ( $E + I \rightleftharpoons EI$ )

Everybody can understand this.  
This prevents making mistakes and facilitates "transfer of knowledge".

- **Automation**

Can be used to process 1000's of compounds in a single run.  
Automatic model selection (Bayesian Information Criterion).

- **No restrictions on experimental design**

Not necessary to have large excess of inhibitor ("tight binding")

- **No restrictions on reaction mechanism**

Any number of interactions and molecular species

## Possible deployment at Novartis / Horsham

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### Free support from BioKin Ltd included with site license:

- **Periodic data review via email**

Send your raw data, get results back in 72 hours (in most cases).

- **Phone support**

Call +1.617.209.4242 any time during US (EST) business hours.

- **Periodic on-site "DynaFit course"**

Once a year (either in the Fall or Spring); one-day workshop format.

- **Free upgrades**

DynaFit continues to evolve (e.g., "Optimal Experimental Design")