

Binding and Kinetics for Experimental Biologists

Lecture 6

Enzyme kinetics: Analysis of reaction progress

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



INVESTICE DO ROZVOJE VZDĚLÁVÁNÍ



Lecture outline

- **Goal:**

Demonstrate K_M determination from progress curves using numerical methods.
Use a "real-world" problem arising from the instructor's consulting practice.

- **Topics:**

The Michaelis constant: theory and practice.
The illusion of linearity in enzyme assays.
Global vs. local fit of multiple data sets: Mechanistic implications.
The choice of proper time interval to measure the "initial" rates.
Assessing the randomness of residual plots.
Enzyme deactivation mechanisms.

- **Implementation:**

The DynaFit software package.



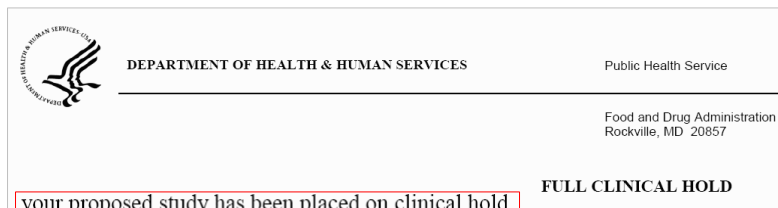
Determination of " K_M " – a Case Study

or

A Day in the Life of an Enzymology Consultant

The setup: FDA put a "hold" on a drug application

FDA = UNITED STATES FOOD AND DRUG ADMINISTRATION AGENCY



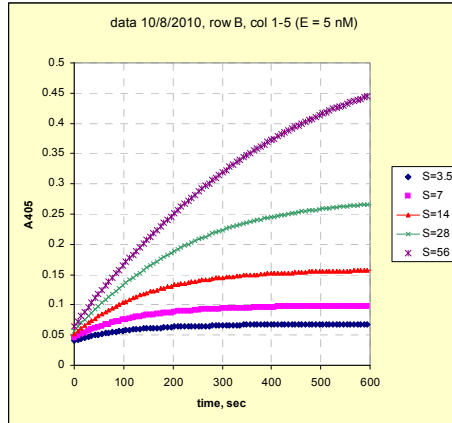
We have the following comments, to be addressed prior to submission of a license application:

1. A potency assay that measures the kinetic parameters (K_M and k_{cat}) and uses a physiologically relevant substrate should be incorporated in release testing and stability programs for drug substance and product prior to initiation of the Phase 3 clinical trial.

- The drug candidate is an **enzyme**.
- This is a small biotech company – **no kineticist on staff**.
- The solution: **Hire a consultant** to
 - design a biochemical assay; and
 - propose a method of data analysis.

The raw data

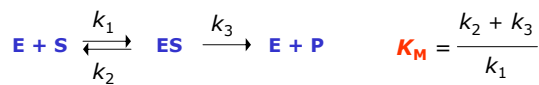
- vary **[Substrate]** from 3.5 to 56 μM
- add **[Enzyme]** at 5 nM
- observe UV/Vis absorbance at 405 nM



→ K_M ?

Michaelis constant: Mechanistic definition

" K_M " HAS **TWO DIFFERENT MEANINGS**, EVEN FOR THE SIMPLEST POSSIBLE ENZYME MECHANISM



equilibrium dissociation constant

$$K_d = k_2 / k_1$$

"strength of enzyme/substrate binding"

$$k_{\text{cat}} = k_3$$

special case: when dissociation (k_2) is much faster than chemical reaction (k_3)

$$k_2 \gg k_3 \rightarrow k_2 + k_3 \approx k_2 \rightarrow K_M = (k_2 + k_3) / k_1 \approx k_2 / k_1 = K_d$$

K_M substrate binding

k_{cat} reactivity to form product

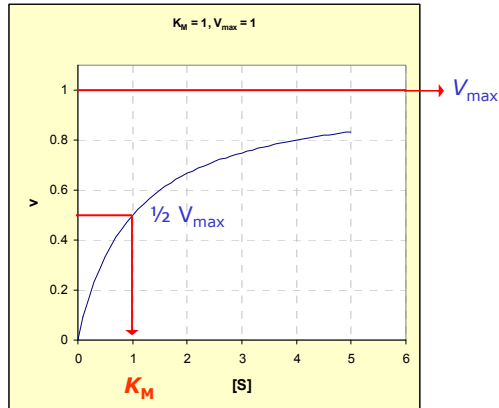
Michaelis constant: Experimental definition

IF THE DOSE-RESPONSE CURVE IS HYPERBOLIC, THEN " K_M " HAS ONLY **ONE MEANING**

Michaelis-Menten equation:

$$v = k_{cat} [E] \frac{[S]}{[S] + K_M}$$

$$V_{max} = k_{cat} [E]$$



Michaelis constant: The classic recipe

THE SIMPLEST POSSIBLE APPROACH ("BIOCHEM-101 STUDENT LAB")

1. Perform a number of assays at constant $[E]$ and varied $[S]$
2. Fit each progress curve (or "initial portion") to a **straight line**
3. Consider the **slope** of each best-fit line as the "initial rate" (v)
4. Start up a computer program for nonlinear regression
5. In the list of built-in nonlinear models, find the "rectangular hyperbola"

$$y = a x / (b + x)$$

where

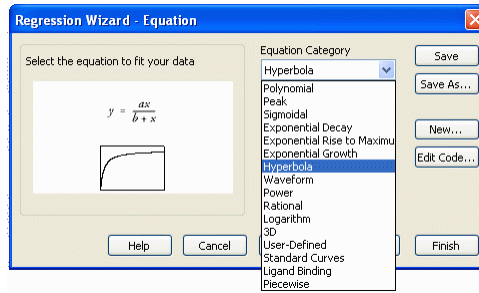
$$x = [S]$$

$$y = v$$

$$a = V_{max}$$

$$b = K_M$$

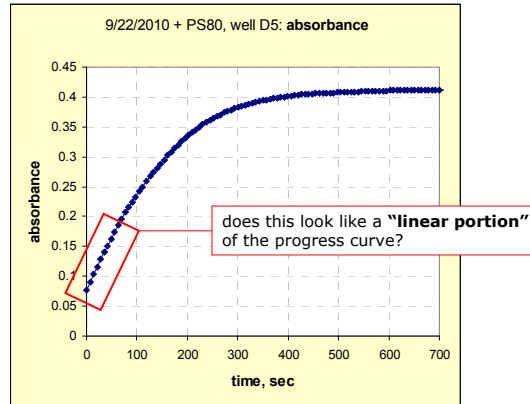
model
parameters



6. Click the [OK] button. Paste K_M and V_{max} into your final Report.
7. If k_{cat} is also required, compute it as $V_{max} / [E]$

The human eye is very bad at seeing nonlinearity

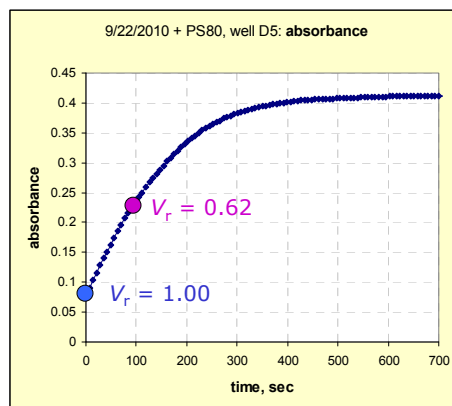
WE EVOLVED TO SEE STRAIGHT LINES - EVEN WHEN THERE ARE NONE!



If this were a "linear portion", our problems would be over:
We could get the **initial rate** by fitting a **straight line** to the first **100 seconds**.

Derivatives approximated as "finite differences"

CHECKING LINEARITY BY SIMPLE COMPUTATIONS



rate $\approx \Delta[\text{Signal}] / \Delta\text{time}$

D3		=1000*(C3-C2)/(B3-B2)			
A	B	C	D	E	
1	#	time	A ₄₀₅	1000 x V	V / V ₀
2	0	0	0.077		
3	1	7	0.090	1.8571	1.00
4	2	14	0.103	1.8571	1.00
5	3	21	0.116	1.8571	1.00
6	4	28	0.128	1.7143	0.92
7	5	35	0.140	1.7143	0.92
8	6	42	0.151	1.5714	0.85
9	7	49	0.163	1.7143	0.92
10	8	56	0.174	1.5714	0.85
11	9	63	0.185	1.5714	0.85
12	10	70	0.196	1.5714	0.85
13	11	77	0.207	1.5714	0.85
14	12	84	0.216	1.2857	0.69
15	13	91	0.225	1.2857	0.69
16	14	98	0.233	1.1429	0.62

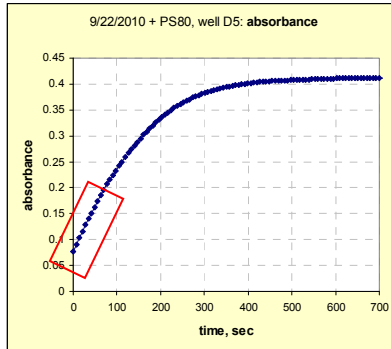
relative rate

By the time the assay reached **100 seconds**,
the reaction **rate decreased by almost one half!**

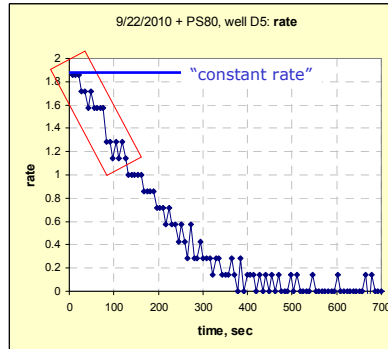
The plot of instantaneous rates

IF THERE WERE A "LINEAR PORTION", THE **RATE** PLOT SHOULD BE **STRICTLY HORIZONTAL**

signal



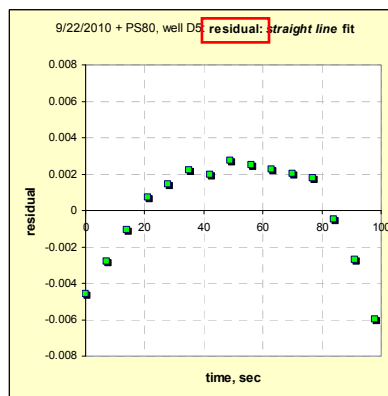
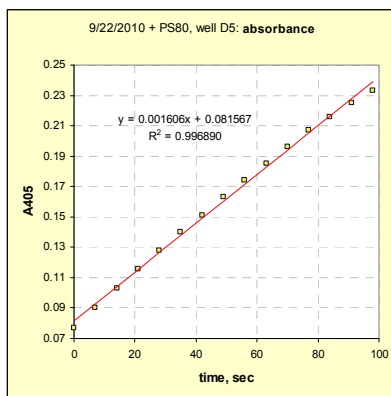
rate $\approx \Delta [\text{Signal}] / \Delta \text{time}$



By the time the assay reached **100 seconds**,
the reaction **rate** decreased by **almost one half!**

Trying the straight-line fit anyway

HOW BAD COULD IT BE, REALLY?

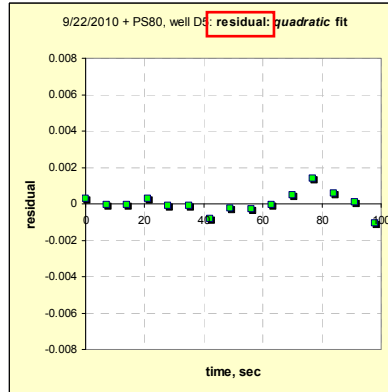
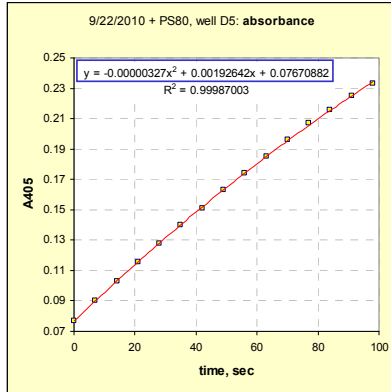


quite bad, actually:
this plot should look completely "random"

What about a quadratic polynomial?

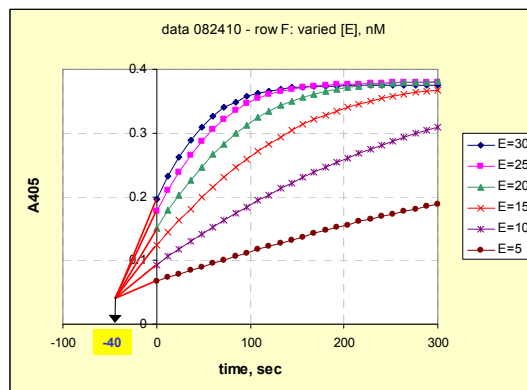
CAREFUL HERE: POLYNOMIALS ARE **UNSUITABLE FOR EXTRAPOLATIONS!**

Why would we need to *extrapolate*?



Mixing delay time

IN MOST KINETIC EXPERIMENTS WE NEVER "SEE" THE VERY INITIAL TIME POINT



actual start of the assay: "time = -40 sec"

enzyme is UV/Vis transparent
 substrate concentration is the same



absorbance at time zero
 should be identical...



... unless a lot of product was
 formed already at "t = 0"

The devil in the details: *Initial* reaction rates

A FEW INNOCENT-SOUNDING CHALLENGES IN ANALYZING THE PROGRESS OF ENZYME ASSAYS:

1. The time-course of enzyme reaction is *nonlinear*.
It can be considered "almost linear" only in special cases.
2. There is a finite *mixing delay* requiring *extrapolation*.
In our experiments we always "miss" the *initial* rate.
3. Extrapolation is dangerous - unless we use a *mechanistic model*.
Generic mathematical models such as polynomials are "out".

All these problems would disappear if/when the progress of enzyme assays *can* be treated as **linear**.

This is **almost never** the case.

linear, polynomial

We hit the brick wall with algebraic models...



... so why not do it **the right way?**

Mechanistic mathematical model

MECHANISTIC MODELS ARE WELL SUITED FOR EXTRAPOLATIONS

Michaelis-Menten mechanism:



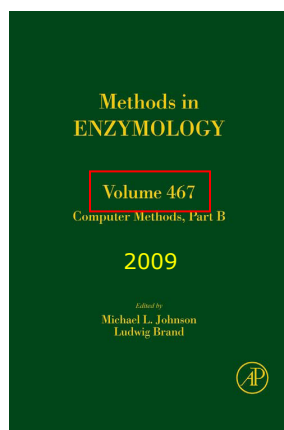
Mathematical model for reaction progress:

$$\begin{aligned}d[E]/dt &= -k_1[E][S] + k_2[ES] + k_3[ES] \\d[S]/dt &= -k_1[E][S] + k_2[ES] \\d[ES]/dt &= +k_1[E][S] - k_2[ES] - k_3[ES] \\d[P]/dt &= +k_3[ES]\end{aligned}$$

requires numerical
(iterative) solution
using a specialized
complex algorithm

Specialized numerical software: *DynaFit*

MORE THAN **600 PAPERS** PUBLISHED WITH IT (1996 – 2009)



CHAPTER TEN

DYNAFIT—A SOFTWARE PACKAGE FOR ENZYMOLOGY

Petr Kuzmič

DOWNLOAD <http://www.biokin.com/dynafit>

REFERENCES

1. Kuzmic (1996) *Anal. Biochem.* **237**, 260-273
2. Kuzmic (2009) *Meth. Enzymol.* **467**, 247-280

The Van Slyke – Cullen mechanism

JUST AS GOOD AS MICHAELIS-MENTEN

Van Slyke-Cullen mechanism:



Mathematical model for reaction progress:

$$\begin{aligned} d[E]/dt &= -k_1[E][S] + k_3[ES] \\ d[S]/dt &= -k_1[E][S] \\ d[ES]/dt &= +k_1[E][S] - k_3[ES] \\ d[P]/dt &= +k_3[ES] \end{aligned}$$

DynaFit input:

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

[mechanism]
  E + S ----> E.S      : k1
  E.S ----> E + P      : k3
  ...
```

Application of the Van Slyke-Cullen irreversible mechanism in the analysis of enzymatic progress curves
Kuzmic (2009) *Anal. Biochem.* **394**, 287-289

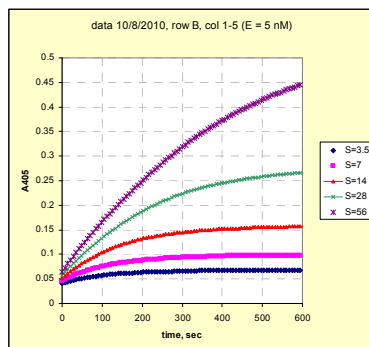
Global vs. "local" analysis

A VERY IMPORTANT CONCEPT

[2] Global Analysis of Biochemical and Biophysical Data

By JOSEPH M. BEECHEM

Meth. Enzymol. **210**, 37-54 (1992)



global analysis:

analyze **all five** curves together
as a single data set

local analysis:

analyze each curve **individually**
as five separate data sets

Local analysis to determine initial reaction rates

WE NEED INITIAL RATES FOR THE MICHAELIS-MENTEN EQUATION

The screenshot shows the DynaFit interface with a script for local analysis. The script includes the following sections:

```

[task]
  task = fit
  data = progress

[mechanism]
  E + S ---> E.S : kas
  E.S ---> E + P : kdp

[constants]
  kas = 1 ?
  kdp = 50 ?

[concentrations]
  E = 0.005
    
```

Next to the script is a plot of reaction progress showing a curve of product concentration over time. A table of parameter values is overlaid on the plot:

No.	Par#	Set	Initial	Final
#1	kas	1	0.721467	
#2	kdp	50	72.6279	

Reading off the initial rates

"INITIAL RATE" IS COMPUTED AT A SPECIFIC REACTION TIME (E.G. 1 SEC)

The screenshot shows the DynaFit Results window. On the left is a navigation menu with options like Script, Settings, Model, Summary, Parameters, Data & model, State variables, and Residual. The main area displays a plot titled "Derivatives (reaction rates)" showing the initial reaction rates over time. A table of results is shown below the plot:

No.	Dataset	Time (sec)	Rate
1	./courses/BKEB/lec-6/km/data-10min/B05.txt	-11	0.00109813

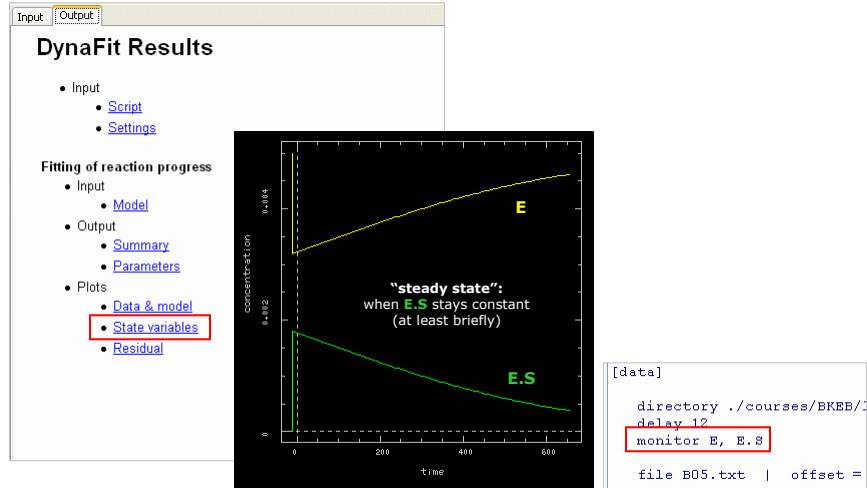
A [data] window is open, showing the following configuration:

```

directory ./courses/BKEB/...
delay 12
monitor E, E.S
file B05.txt | offset =
    
```

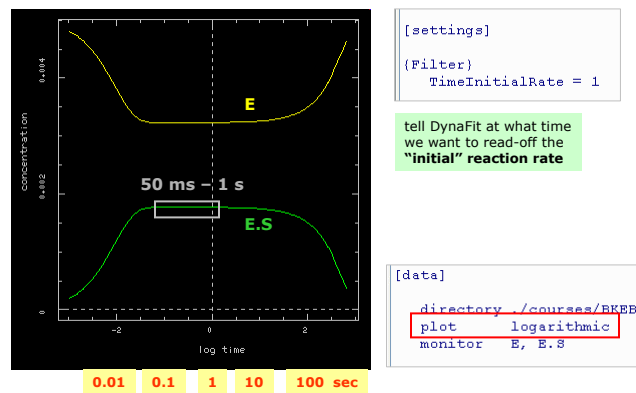
Plot of state variables (species concentrations)

ALWAYS EXTREMELY HELPFUL



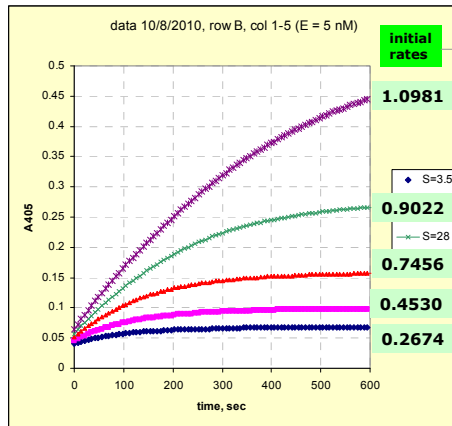
Logarithmic plot: Identify the steady-state range

WHEN A BIOCHEMICAL ASSAY REACHES THE **STEADY-STATE** IS SYSTEM-SPECIFIC



Initial rates from local fit of progress curves

FINALLY READY TO COMPUTE THE K_M



absorbance units / sec

→ K_M ?

Fit initial rates – initial estimate

```

DynaFit : rates-001.txt
File Edit View Help
Input Output

[task]
task = fit
data = rates
approximation = rapid-equilibrium

[mechanism]
E + S <=> E.S : Km  dissoc
E.S --> E + P : kcat

[constants]
Km = 10 ??
kcat = 10 ??

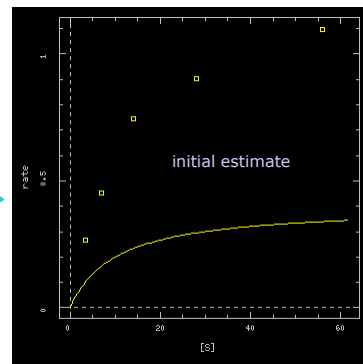
[responses]
p = 8

[concentrations]
3.5 0.2674
7 0.4520
E = 0.005
14 0.7457
28 0.9022
[data]
56 1.0981

variable S
set rates

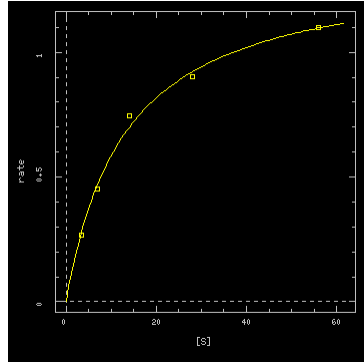
[set:rates]
S rate
[set:rates]
end
    
```

"File .. Try"



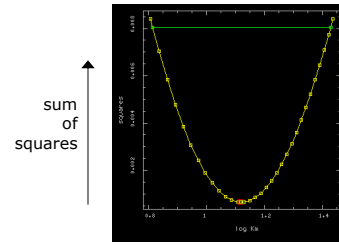
Fit initial rates – results

REMEMBER: THE STANDARD ERROR (\pm VALUE FREQUENTLY REPORTED) IS MEANINGLESS
 standard error



$$K_M = (13.1 \pm 1.6) [6.5 \dots 26.8] \mu\text{M}$$

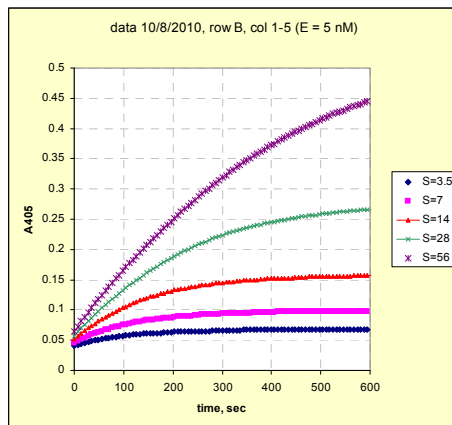
confidence interval
(99% probability)



No.	Par#Set	Initial	Final	Std. Error	CV (%)	Low	High
#1	Km	10	13.1442	1.57495	11.98	6.52297	26.8159
#2	kcat	10	33.8915	1.5029	4.43	26.649	45.2416

The Michaelis constant from initial rates

ALMOST DONE MAYBE



$$K_M = 13.1 \mu\text{M}$$

are we done yet?

A closer look:



what else we can learn from the same data?

Global fit of all five progress curves

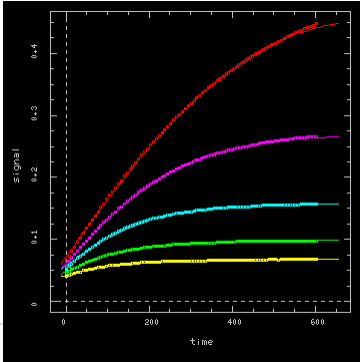
VAN-SLYKE CULLEN MECHANISM (SAME AS BEFORE, IN THE LOCAL FIT)

```
DynaFit : row-B-global-001.txt
File Edit View Help
Input Output
Global fit of all five progress curves.
|
[task]
task = fit
data = progress

[mechanism]
E + S ---> E.S : kas
E.S ---> E + P : kdp

[constants]
[data]
directory ./courses/BKEB/lec-6/km/data-10min
delay 12
file B01.txt | offset = auto ? | conc 8 = 3.5 ?
file B02.txt | offset = auto ? | conc 8 = 7 ?
file B03.txt | offset = auto ? | conc 8 = 14 ?
file B04.txt | offset = auto ? | conc 8 = 28 ?
file B05.txt | offset = auto ? | conc 8 = 56 ?
```

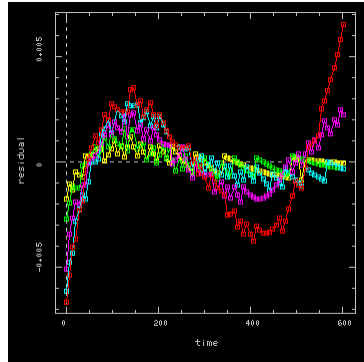
File .. Run
→



looks "reasonably good"
or does it ?!

Global fit – residual plot

DOES NOT LOOK GOOD AT ALL



If you see a residual plot as **bad** as this one, completely ignore any other result from DynaFit.

Always look at residual plots.

“Good” and “bad” residual plots

ASSESSING RESIDUAL PLOTS IS ONE OF THE **MOST IMPORTANT** SKILLS OF A DATA ANALYST

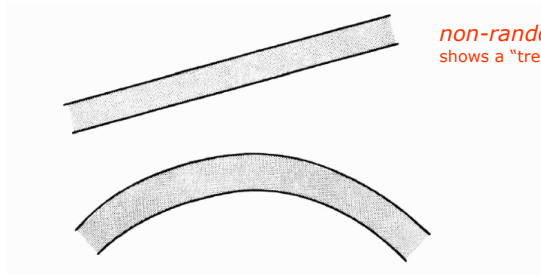
GOOD:



random sequence
no “trend” or “pattern”

A satisfactory residuals plot should give this overall impression.

BAD:



non-random sequence
shows a “trend” or a “pattern”

Examples of characteristics shown by unsatisfactory residuals behavior.

Draper & Smith (1981) *Applied Regression Analysis*, p. 146

Global fit – model parameters

DOES NOT LOOK GOOD AT ALL, EITHER

No.	Par#Set	Initial	Final
#1	kas	1	1.74027
#2	kdp	50	31.7959
#3	[S]#1	3.5	3.31032
#4	offset#1	0.041	0.0360932
#5	[S]#2	7	6.43236
#6	offset#2	0.046	0.0362807
#7	[S]#3	14	12.6996
#8	offset#3	0.052	0.0351632
#9	[S]#4	28	25.5942
#10	offset#4	0.057	0.0195611
#11	[S]#5	56	48.0148
#12	offset#5	0.065	-0.00229371

[mechanism]



$$K_M = k_{dp}/k_{as} = 18.2 \mu\text{M}$$

13.1 μM from initial rates

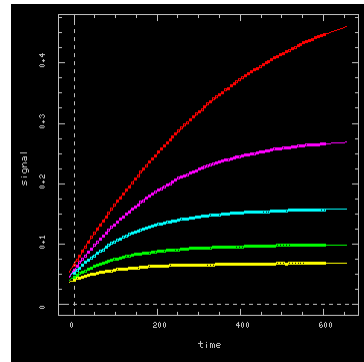
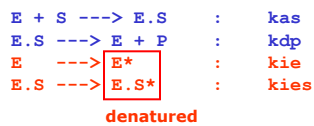
These "best fit" concentrations are highly improbable:

It has been established that the actual **titration error** is much smaller than this.

Modified global model: *Enzyme deactivation*

ENZYMES DO "DIE" IN THE COURSE OF MANY ASSAYS

[mechanism]

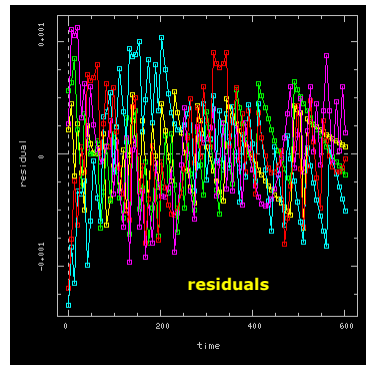


Mechanical Effects on the Kinetics of the HIV Proteinase Deactivation
Kuzmic *et al.* (1996) *Biochem. Biophys. Res. Commun.* **221**, 313-317

Sadana (1991) *Biocatalysis - Fundamentals of Enzyme Deactivation Kinetics*
Prentice-Hall, Englewood Cliffs, NJ.

Enzyme deactivation model: Results

IT LOOKS GOOD EVEN UP CLOSE (RESIDUALS AND PARAMETERS)



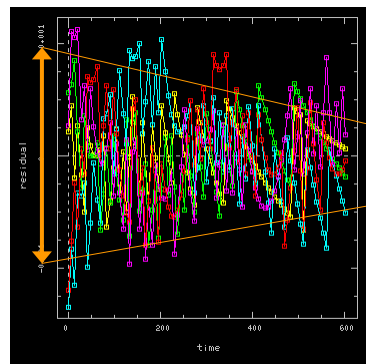
No.	Par#Set	Initial	Final
#1	kas	1	2.37068
#2	kdp	50	32.4275
#3	kie	0.01	0.00256721
#4	kies	0.001	0.000874611
#5	[S]#1	3.5	3.73501
#6	offset#1	0.041	0.0326275
#7	[S]#2	7	7.15389
#8	offset#2	0.046	0.0307653
#9	[S]#3	14	13.9572
#10	offset#3	0.052	0.0271767
#11	[S]#4	28	28.3765
#12	offset#4	0.057	0.00900732
#13	[S]#5	56	59.6727
#14	offset#5	0.065	-0.0245337

} $K_M = 13.6 \mu\text{M}$
13.1 μM
initial rates

These concentration look OK.

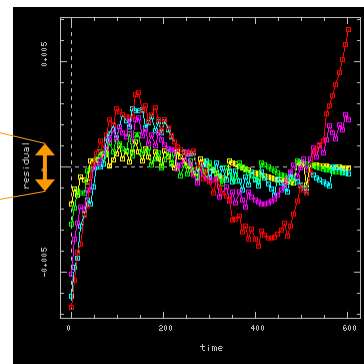
Residual plots: A "good" vs. "bad" comparison

ASSESSING RESIDUAL PLOTS IS ONE OF THE **MOST IMPORTANT** SKILLS OF A DATA ANALYST



with enzyme deactivation

no recognizable pattern:
random

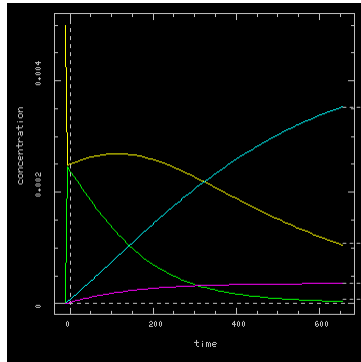


without enzyme deactivation

a clear "zig-zag" pattern
non-random

Concentration plot: How much deactivation?

example assay: $[S] = 14 \mu\text{M}$



E* ----- **denatured enzyme** is the main molecular form at the end of the assay

E -----

E.S* -----

E.S -----

K_M determination: Summary

1. The progress curves must be treated as **nonlinear**

There is no "linear" portion, even if it seems that there is one.

2. Michaelis constant, K_M , was determined by **two independent methods**

A. local fit of progress curves \rightarrow fit of initial rates ($K_M = 13.1 \mu\text{M}$)

B. global fit of progress curves ($K_M = 13.6 \mu\text{M}$)

Both methods gave the same results.

3. Global fit revealed that the enzyme undergoes **deactivation**.

Deactivation (denaturation) is almost complete after 15 minutes.

4. Deactivation **does not interfere** with K_M determination.

If we use the initial rate method; or
if we take deactivation into account in the global fit.

5. Overall: ***This substrate is very suitable for a K_M assay.***

If we use an appropriate (nonlinear) method of data analysis.

What about k_{cat} ?

THE FDA WANTS US TO DO TWO THINGS: K_M AND k_{cat}

We have the following comments, to be addressed prior to submission of a license application:

1. A potency assay that measures the kinetic parameters (K_M and k_{cat}) and uses a physiologically relevant substrate should be incorporated in release testing and stability programs for drug substance and product prior to initiation of the Phase 3 clinical trial.

Michaelis-Menten equation:

$$v = V_{max} \frac{[S]}{[S] + K_M}$$
$$V_{max} = k_{cat} [E]$$

The problem:

Even with the differential-equation model, we can (essentially) **measure only** K_M and V_{max} .

$$k_{cat} = V_{max} / [E]$$

The solution:

At some point we must determine the concentration of **active enzyme [E]** (active site concentration).

The only other possibility:

1. Determine "**apparent k_{cat}** ", from [E] as total protein, for a **reference sample** of enzyme.
2. Relate every other "**apparent k_{cat}** " value to the reference sample in the future.

Summary and conclusions

1. Even a "simple task" such as K_M determination can be quite tricky if it is to be done correctly and rigorously.
2. DynaFit can help in dealing with the nonlinearity of reaction progress.
3. **Local fit** of individual progress curves is **not sufficiently powerful** to reveal the true kinetic mechanism.
4. **Global fit** of multiple curve is much preferred for **mechanistic** studies.
5. **Residual plots** are crucially important for model validation.
6. DynaFit is not a "silver bullet": You must still **use your brain** a lot.