Gilles Gnacadja

AMGEN
Thousand Oaks, California, USA

Society for Industrial and Applied Mathematics Annual Meeting, 2013

San Diego, California, USA 8-12 July 2013

Industry Days: A Southern California Perspective



9 July 2013

- Binding Equilibrium Calculation in Pharmacology
 - Current Practices and How They Fall Short
 - Prior Work
 - Our Work
- Polynomial System for Binding Equilibrium
 - An Example
 - The Polynomial System and its Properties
 - Solving the Polynomial System by Fixed-Point Iterations
 - Solving the Polynomial System by Cell Exclusion
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Pharmacology

Pharmacology: Study interactions between biological processes and therapeutic agents.

- Pharmacokinetics: what the body does to the drug.
- Pharmacodynamics: what the drug does to the body.
- "Pharmacostatics" at beginning of research pipeline: Study binding equilibrium in vitro of interactions between
 - receptors (biochemical recognition units),
 - ligands (pathogenic and therapeutic molecules),
 - other molecules.

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Current Practices — Illustrated with Trivial Receptor-Ligand Interaction

Chemistry

$$R + L \stackrel{k_{on}}{=} RL$$

Equilibrium state Implicit equations (Polynomial system)

$$\begin{split} & [\textbf{\textit{R}}]_{\text{Equil}} + [\textbf{\textit{R}}\textbf{\textit{L}}]_{\text{Equil}} = [\textbf{\textit{R}}]_{\text{Total}} \\ & [\textbf{\textit{L}}]_{\text{Equil}} + [\textbf{\textit{R}}\textbf{\textit{L}}]_{\text{Equil}} = [\textbf{\textit{L}}]_{\text{Total}} \\ & [\textbf{\textit{R}}\textbf{\textit{L}}]_{\text{Equil}} = [\textbf{\textit{R}}]_{\text{Equil}} [\textbf{\textit{L}}]_{\text{Equil}} / K_{\text{d}} \end{split}$$

Equilibrium state Explicit formula (Forcibly derived)

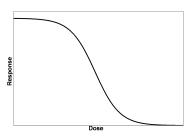
$$\begin{array}{ll} [\textbf{\textit{R}}]_{\text{Total}} & \ll [\textbf{\textit{L}}]_{\text{Total}} \\ [\textbf{\textit{L}}]_{\text{Equil}} & = [\textbf{\textit{L}}]_{\text{Total}} \quad \text{("No Ligand Depletion")} \\ \\ \frac{[\textbf{\textit{RL}}]_{\text{Equil}}}{[\textbf{\textit{R}}]_{\text{Total}}} & = \frac{[\textbf{\textit{L}}]_{\text{Total}}}{\textit{K}_{\text{d}} + [\textbf{\textit{L}}]_{\text{Total}}} \end{array}$$

Issues with Forcibly Derived Formulas

- $[R]_{Total} \ll [L]_{Total}$ is not mathematically sound. Operational wisdom: $[R]_{Total} < [L]_{Total}/10$.
- Not always applicable experimentally, e.g. in miniaturized assays.
- Need not be applicable in vivo.
- New formula derivation needed for every new interaction.
- Only possible with "receptor-centric" systems.
 (There is one receptor and all complex molecules contain it.)

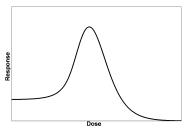


One More Issue with Forcibly Derived Formulas



This shape is expected and is what forcibly derived closed-form formulas give.

Non-monotone responses do occur and cannot be simulated with forcibly derived closed-form formulas.



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Excuses for Forcibly Derived Formulas

Somewhat admissible:

These formulas are simple and always give an answer.
They are (often, not always) directionally correct.

Not admissible:

We have many sources of error, so why fix this one?

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Current Practices and How They Fall Shor Prior Work Our Work

"No Ligand Depletion" Assumption Discarded for Competitive Antagonism

Miniaturized Receptor Binding Assays: Complications Arising from Ligand Depletion Clare M. Scaramellini Carter, Juliet R. Leighton-Davies and Steven J. Charlton J Biomol Screen 2007: 12: 255 roginally oublished online Jan 26. 2007

$$R + L \rightleftharpoons RL + A$$
 \parallel
 RA

"No Ligand Depletion" Assumption Partially Discarded for Allosteric Modulation

0022-3565/08/3253-927-934\$20.00

THE JOURNAL OF PHARMACOLOGY AND EXPERIMENTAL THERAPEUTICS
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The Impact of Orthosteric Radioligand Depletion on the Quantification of Allosteric Modulator Interactions

Vimesh A. Avlani, David J. McLoughlin, Patrick M. Sexton, and Arthur Christopoulos

$$R + L \rightleftharpoons RL$$

 $+$ $+$ A A
 \parallel \parallel \parallel $RA + L \rightleftharpoons RLA$

with
$$[A]_{\mathsf{Equil}} = [A]_{\mathsf{Total}}$$

Current Practices and How They Fall Shor Prior Work Our Work

More Shots at the "No Ligand Depletion" Assumption

Biochimica et Biophysica Acta, 632 (1980) 464-469

COMPETITIVE BINDING STUDIES WITH MULTIPLE SITES EFFECTS ARISING FROM DEPLETION OF THE FREE RADIOLIGAND

J.W. WELLS, N.J.M. BIRDSALL, A.S.V. BURGEN and E.C. HULME

0006-000X/W/000003-07002-00/0 Capyright 6 by The American Society for Pharmacology and Experimental Therapeutics All rights of reproduction in any form secured. assume that presumacoccory, \$1:400-409

Ligand Dissociation Constants From Competition Binding Assays: Errors Associated with Ligand Depletion AVRM GOLDEN MR ORDER W. RARRETT

Proc. Natl. Acad. Sci. USA Vol. 84, pp. 6654-6658, October 1987

An accurate method for determination of receptor-ligand and enzyme-inhibitor dissociation constants from displacement curves

ARCHIVES OF BIOCHEMISTRY AND BIOPHYSICS

Vol. 284, No. 1, Amazury, pp. 26-28, 1991
A Simple Method for Calculating the Dissociation
Constant of a Receptor (or Enzyme) - Unlabeled
Ligand Complex from Radioligand

Displacement Measurements

Robert L. Martin, Franco Renosto, and Irwin H. Segel

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Interpretation of Binding Curves Obtained with High Receptor Concentrations: Practical Aid for Computer Analysis STEPHANE SMILENS

Miniaturized Receptor Binding Assays: Complications Arising from Ligand Depletion Clare M. Scaramellini Carter, Julief R. Leighton-Davies and Steven J. Charlton J Biomol Screen 2007; 12; 255 originally published online Jan 26, 2007

0020-084508/2233-927-942820.00
The Journal of Franciscour and Experimental Transporters
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0000-8003006/2003-718--220020-00 MORRESTAN PRARMICOLOGY

Mountain Passascore Conference of Conference

Analogs of the Microtubule Stabilizer Dictyostatin
Brianne S. Raccor, Andreas Vogt, Rachel P. Sikorski, Charitha Madiraju,
Raghavan Balachandran, Kia Montgomery, Youseung Shin, Yoshikazu Fukul,
Won-Hyuk Jung, Dennis P. Curran, and Billy W. Day

Concentration of receptor and ligand revisited in a modified receptor binding protocol for high-affinity radioligands: $[^3H]$ Spiperone binding to D_2 and D_3 dopamine receptors

Juan Zhen, Tamara Antonio, Aloke K. Dutta, Maarten E.A. Reith

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Goal

- Calculate binding equilibrium concentrations ...
- by actually solving the polynomial system of conservation and equilibrium conditions ...
- with the benefits of forcibly derived formulas, i.e. get an answer always and quickly.

The Polynomial System and its Properties
Solving the Polynomial System by Fixed-Point Iterations
Solving the Polynomial System by Cell Exclusion

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The Polynomial System and its Properties
Colving the Polynomial System by Fixed-Point Iterations
Colving the Polynomial System by Cell Exclusion

The Receptor-Ligand-Antagonist-Trap System Polynomial System for Equilibrium State

$$H + L \Longrightarrow HL$$
 $+ + +$
 $A + T \Longrightarrow AT$
 $\parallel \qquad \parallel$
 $RA \qquad LT$

$$[R] + K_{RL}[R][L] + K_{RA}[R][A] = [R]_{Total}$$

 $[L] + K_{RL}[R][L] + K_{LT}[L][T] = [L]_{Total}$
 $[T] + K_{AT}[A][T] + K_{LT}[L][T] = [T]_{Total}$
 $[A] + K_{AT}[A][T] + K_{RA}[R][A] = [A]_{Total}$

The Polynomial System and its Properties
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The Receptor-Ligand-Antagonist-Trap System Polynomial System for Equilibrium State, Reformulated as a Fixed-Point Equation

$$R + L \Longrightarrow RL$$
 $+ + +$
 $A + T \Longrightarrow AT$
 $\parallel \qquad \parallel$
 $RA \qquad LT$

$$[R] = \frac{[R]_{\text{Total}}}{1 + K_{RL}[L] + K_{RA}[A]}$$

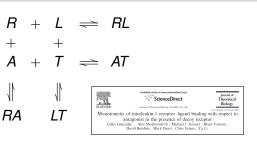
$$[L] = \frac{[L]_{\text{Total}}}{1 + K_{RL}[R] + K_{LT}[T]}$$

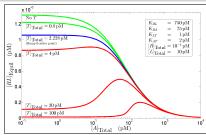
$$[T] = \frac{[T]_{\text{Total}}}{1 + K_{AT}[A] + K_{LT}[L]}$$

$$[A] = \frac{[A]_{\text{Total}}}{1 + K_{AT}[T] + K_{RA}[R]}$$

The Receptor-Ligand-Antagonist-Trap System

Polynomial System for Equilibrium State, Solved by Fixed-Point Iterations





- Fixed-point iterations converge, always and quickly. (Contraction w.r.t. Thompson metric; not L^1 , L^2 , L^∞ , etc.)
- Experimentally observed motonicity features simulated and explained.
- Forcibly derived explicit formulas only produce always-increasing and always-decreasing curves.

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The Polynomial System and its Properties

Solving the Polynomial System by Fixed-Point Iterations Solving the Polynomial System by Cell Exclusion

The Polynomial System

$$X_i + \sum_{\alpha \in I} \alpha_i \, \mathbf{a}_{\alpha} \, \mathbf{x}^{\alpha} = \mathbf{b}_i$$
 $i = 1, ..., n$

Unknown
$$x = (x_1, \dots, x_n) \in \mathbb{R}^n_{\geq 0}$$

Given

$$\begin{aligned} &b_{i}\geqslant 0\;,\;\forall\;i=1,\ldots,n\\ &I\;\text{finite}\subset\mathbb{Z}_{\geqslant 0}^{n}\backslash\{0_{n},e_{n,1},\ldots,e_{n,n}\}\\ &a_{\alpha}\geqslant 0\;,\;\forall\;\alpha=(\alpha_{1},\ldots,\alpha_{n})\in I\\ &x^{\alpha}:=x_{1}^{\alpha_{1}}\cdots x_{n}^{\alpha_{n}} \end{aligned}$$







Univalent positive polynomial maps and the equilibrium state of chemical networks of reversible binding reactions Gilles Gnacadja





A Jacobian criterion for the simultaneous injectivity on positive variables of linearly parameterized polynomial maps Gilles Gnacadja

Equivalent Fixed-Point Formulation

$$X_i = rac{b_i}{1 + \sum_{lpha \in I, \, lpha_i > 0} lpha_i \, a_lpha \, x^{lpha - e_{n,i}}} \qquad i = 1, \dots, n$$

$$x = f(a, b, x)$$

 $f(a,b,\cdot):\mathbb{R}^n_{\geq 0}\! o \!\mathbb{R}^n_{\geq 0}$ is smooth and order-reversing

Equivalent Fixed-Point Formulation

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Solution Exists, is Unique, and is Infinitely Smooth

$$x_i + \sum_{\alpha \in I} \alpha_i a_\alpha x^\alpha = b_i$$
 , $i = 1, \ldots, n$

Existence

Brouwer Fixed Point Theorem

Uniqueness

Gale-Nikaidô Global Injectivity Theorem

Gale, D. and H. Nikaidô

Math. Annalen 159, 81-93 (1965)

The Jacobian Matrix and Global Univalence of Mappings $_{\mathrm{By}}$

DAVID GALE and HUKUKANE NIKAIDO in Providence and Osaka

Smoothness

Inverse Function Theorem



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Solving by Fixed-Point Iterations



- Fixed point iterations always converge if all complex molecules are (homo- or hetero-) dimers.
 - The map iterated is a contraction w.r.t. the Thompson metric (not L^1 , L^2 , L^∞ , etc) and is order-reversing.
 - Iterates provide a descending sequence of boxes that converges to the solution point.

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 - Iterates provide a descending sequence of boxes that converges to the solution point.
- With k-mers with $k \ge 3$, the descending sequence of boxes converges, either to the solution point, or to a non-point box that contains it. ("Coupled fixed points")

First part partially rediscovered: M. G. A. van Dorp, F. Berger, E. Carlon

Computing Equilibrium Concentrations for Large Heterodimerization Networks

Physical Review E. Volume 84, Issue 3, September 2011

Solving by Fixed-Point Iterations



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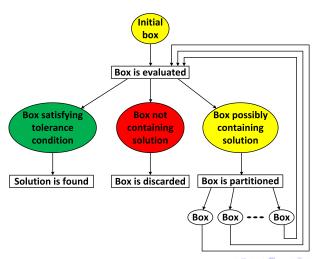
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Solving by Cell Exclusion

If the descending sequence of boxes converges to a non-point box, divide the box and try the same on each subbox.

Do this again, and again...

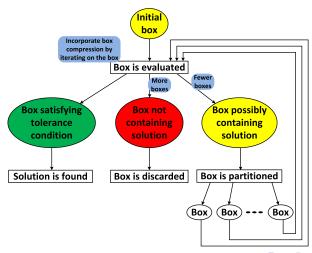
Solving by Cell Exclusion



27/29

Solving the Polynomial System by Cell Exclusion

Strengthening Cell Discarding with Cell Compression



- Calculating binding equilibrium in "pharmacostatics" is about solving certain nice polynomial systems.
- Customary practice is to derive simple formulas at all cost.
 - Reduced accuracy
 - Only monotone response curves
- Algorithms exist to actually solve the polynomial systems with a priori assurance of success.
 - Exploit fixed-point formulation
 - Fixed-point iterations
 - Cell exclusion algorithm, strengthened by cell compression
 - Work in progress: stronger cell discarding conditions
- Enable scientists to study pharmacostatics of biochemical mechanisms that would otherwise be fudged or discarded.



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