Chemical Reaction Networks in Pharmacology and Related Mathematical Problems

Gilles Gnacadja

AMGEN

Thousand Oaks, California, USA

Workshop on Mathematical Problems Arising from Biochemical Reaction Networks

American Institute of Mathematics

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- Pharmacology
 - What is Pharmacology?
 - Reaction Networks in Receptor Pharmacology
 - Current Mathematical Modeling Practices
- Mathematical Problems
 - Classes of Networks and Properties of Equilibrium
 - Algorithms for Binding Equilibrium
 - Monotonicity of Dose-Response Curves
- Recapitulation
 - Recapitulation



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Pharmacology

Pharmacology: Study interactions between biological processes and therapeutic agents.

- Pharmacokinetics: "what the body does to the drug".
 Absorption, Distribution, Metabolism, Excretion (ADME).
- Pharmacodynamics: "what the drug does to the body".
 Drug response.

Usually studied for specific physiological systems or processes.

Common foundation: Receptor Pharmacology.

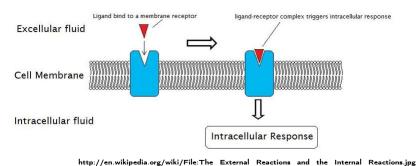


Receptor

Receptor: Biochemical recognition unit.

Cell membrane receptor

- Outside cell: Binding with ligands.
- Inside cell: Transmit, modify or stop signal.



Receptor Pharmacology

- "Pharmacostatics" at beginning of research pipeline:
 Study binding equilibrium in vitro of interactions between
 - receptors,
 - ligands (pathogenic and therapeutic agents),
 - other actors.
- Mathematical needs: Equilibria of reaction networks.
 - Most needed: "Worry-free" computational algorithms. (worry-free > working)
 - Mathematical prerequisites Properties of equilibrium:
 - Existence;
 - Uniqueness or quantified multiplicity;
 - Asymptotic stability and basins of attraction.
 - Prerequisites to prerequisites:
 Classes of networks to pose and address these questions.



26 March 2013

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Competitive Antagonism

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

$$\downarrow \uparrow$$

$$RA$$

(Orthosteric binding: binding on same site)



Allosteric Modulation

$$R + L \rightleftharpoons RL$$

$$+ \qquad \qquad +$$

$$A \qquad \qquad A$$

$$\downarrow \uparrow \qquad \qquad \downarrow \uparrow$$

$$RA + L \rightleftharpoons RLA$$

(Allosteric binding: binding on another site)



Competitive Antagonism with Trap (Shed/Decoy) Receptor

$$R + L \rightleftharpoons RL$$

$$+ +$$

$$A + T \rightleftharpoons AT$$

$$\downarrow \uparrow \qquad \downarrow \uparrow$$

$$RA \qquad LT$$

Extensions and Variations

Receptor isomerization $R \rightleftharpoons R^* \rightleftharpoons \cdots$

Receptor dimerization $R + R \rightleftharpoons RR$

Ligand dimerization RLL, RLLAA

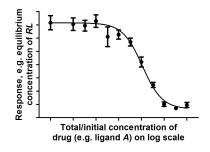
Intracellular actors transducing proteins, arresting proteins, etc

Enzymes as receptors ("reversible" but not weakly reversible)



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- 3 Recapitulation
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Parameter Inference and Simulation



Fit dose-response curves to find binding parameters when applicable network is known.

Perform exploratory simulations when applicable network is not known.



Closed-Form Formulas at All Cost

Simple, closed-form formulas for equilibrium concentrations, usually EquilConctr = rationalFnctn(BindingParams, TotalConctrs)

$$\begin{array}{l} & \scriptsize \uparrow \\ \forall \, \texttt{Ligand} \, , \, [\texttt{Ligand}]_{\texttt{Equil}} = [\texttt{Ligand}]_{\texttt{Total}} \\ & \scriptsize \uparrow \\ \forall \, \texttt{Ligand} \, , \, [\texttt{Receptor}]_{\texttt{Total}} \ll [\texttt{Ligand}]_{\texttt{Total}} \end{array}$$

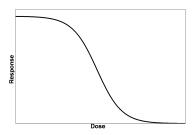
Issues:

- Not mathematically sound.
 Operational wisdom: [Receptor]_{Total} < [Ligand]_{Total}/10.
- May be unjustified experimentally, e.g. in miniaturized assays.
- Need not apply in vivo.
- New formula derivation needed for every new network.
- Only possible with "receptor-centric" networks.



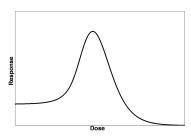
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Expectation of Monotonicity in Dose-Response Curves



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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An Attempt at a Relevant Class of Networks

GG: Advances in Applied Mathematics 43 (2009)

Complete networks of reversible binding reactions

- $(many species) \rightleftharpoons (one species)$
- Conservation from building blocks and their stoichiometry
- Parameterized for detailed-balanced equilibrium

Properties of equilibrium:

- Unique w.r.t. total concentrations of building blocks
- Globally asymptotically stable

Limitations:

- Enzymes as receptors are not covered
- Multi-state receptors probably covered with mild extensions



An Attempt at a Larger Relevant Class of Networks

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GG: Journal of Mathematical Chemistry 49 (2011) – part 2 of 3
GG: Linear Algebra and its Applications 437 (2012)
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Explicitly-reversibly constructive networks

- (many species) → (one species) (binding/association)
 (one species) → (many species) (unbinding/dissociation)
 (one species) → (one species) (isomerization)
- Each elementary species is in the source of a binding reaction and in the target of an unbinding reaction (w/ isomerization).
 Each composite species is the target of a binding reaction and the source of an unbinding reaction (w/ isomerization).
- Conservation from building blocks and their stoichiometry Limitations:
 - Class is quite large. Must be subdivided for useful discussions.
 - Reactions (many species) → (many species) not covered.
 (Do they really exist?)

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Complete Networks of Reversible Binding Reactions

GG: Mathematical Methods in the Applied Sciences 30 (2007)

GG: Advances in Applied Mathematics 43 (2009)

GG: Mathematical Biosciences 232 (2011)

Problem Statement

(skipping straight to the math)

A worry-free algorithm for finding the unique nonnegative solution $x=(x_1,\ldots,x_n)$ of the polynomial system

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

where I finite $\subset \mathbb{Z}_{\geq 0}^n \setminus \{0_n, e_{n,1}, \dots, e_{n,n}\}, a_{\alpha} \geq 0, b_i \geq 0.$



Example of Worry-Free: Iteration of a Contraction

Polynomial Equation Reformulated as a Fixed-Point Equation

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

Iterations converge if

$$\forall \alpha \in I, \alpha_1 + \cdots + \alpha_n = 2$$
.

Chemistry interpretation: Every reaction is a reversible (homo- or hetero-) dimerization of building blocks. This is quite restrictive!

GG: Mathematical Methods in the Applied Sciences 30 (2007)
Partially rediscovered: M. G. A. van Dorp, F. Berger, E. Carlon: Physical Review E 84 (2011)

If not, restrictions on binding parameters and total concentrations.

Can Worry-Free be Extended to Cover more Networks?

- Conjecture: There exists a fixed-point preserving operator that transforms the map in the fixed-point equation into a contraction (w.r.t. some metric).
- Intuition:
 - Map is monotone-decreasing w.r.t. product order.
 Works in dim 1 (one building block) thanks to total order.
 Works if all composite species are multimers (no coupling).
 Perhaps some kind of nonlinear diagonalization?
 - For networks of reversible dimerizations (not just of building blocks), perhaps some kind of iterations of iterations?
- Cell discarding algorithm with discarding by cell compression.
 Has worked well on selected examples, especially with parallel computing. Need stronger cell discarding conditions.
- Other ideas?



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Monotonicity of Dose-Response Curves

GG et al.: Journal of Theoretical Biology 244 (2007)

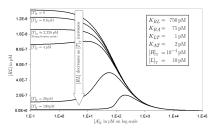
$$R + L \rightleftharpoons RL$$

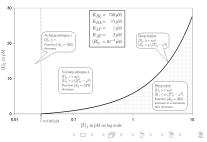
$$+ +$$

$$A + T \rightleftharpoons AT$$

$$\downarrow \uparrow \qquad \downarrow \uparrow$$

$$RA \qquad LT$$





Monotonicity of Dose-Response Curves

Published result found by hard labor - manual and very specific.

Problems:

- Systematic approaches to investigate monotonicity of dose-response curves.
- Classes of networks capable of exhibiting non-monotone dose-response curves, and partitioning of parameter space according the monotonicity.
- Classes of networks incapable of exhibiting non-monotone dose-response curves.



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Recapitulation – Three Interconnected Streams of Problems

- Algorithms for guaranteed and easy computation of equilibrium, with or without fixed-point formulation.
- Reaction networks with non-monotone dose-response curves and related partitioning of parameter space.
- Classes of networks relevant to pharmacology and appropriate for these questions and their prerequisites.