

Impossibility of fast leader election in chemical reaction networks David Doty

Workshop on Advances in Numerical and Analytic Approaches for the Study of Non-Spatial Stochastic Dynamical Systems in Molecular Biology

WoAiNaAAftSoNSSDSiMB 2016!

Isaac Newton Institute of Mathematical Sciences, University of Cambridge April 5, 2016





Acknowledgments

co-author **David Soloveichik** University of Texas, Austin

Monir Hajiaghayi

Anne Condon

David Anderson









Banff International Research Station for Mathematical Innovation and Discovery



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The Software of Life



How does a cell compute?

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The Software of Life

David Rogers (Vanderbilt U., late 1950's, 16 mm film recording) given to Thomas Stossel (Brigham & Women's, Harvard Med) by Viktor Jajjar (Tufts U). Stossel converted to digital video (.avi/.qt). George McNamara and Thomas Coates (City of Hope & Childrens Hospital Los Angeles) changed from original tracking view to panorama. For scale, the red blood cells are ~5 um diameter, the S. aureus bacteria are ~1 um long. Neutrophils move ~10 um/min.



How does a cell compute?



chemistry / geometry

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Compac



What is possible to compute using chemistry? / geometry

 $R \rightarrow P_1 + P_2$

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 $M_1 + M_2 \rightarrow D$

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 $C+X \rightarrow C+Y$

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 $C+X \rightarrow C+Y$

This is traditionally a descriptive modeling language... let's instead use it as a prescriptive programming language

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 $X_1 + X_2 \rightarrow X_3$

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"Not every CRN describes real chemicals!", i.e. "where's the compiler?"

Response: Soloveichik *et al.* [*PNAS* 2011] showed how to physically implement <u>any</u> CRN using *DNA strand displacement*



 $X_1 + X_2 \rightarrow X_3$



"Not every CRN describes real chemicals!", i.e. "where's the compiler?"



$$X_1 + X_2 \rightarrow X_3$$



DNA strand displacement implementing $A+B\rightarrow C$





versus





versus



speed?



versus

sp



fast

slow



versus



fast

10-100nm

slow







versus



slow

10-100nm



spred? component size? compatible with

biological or other "wet" environments? fast 10-100nm not easily



cells



"smart" drug released only in certain cellular conditions "chemical controller" to optimize yield of metabolically produced biofuels/drugs

bioreactors







Theoretical Computer Science Approach



What computation is possible and what is not?



What computation is possible and what is not?

What computations necessarily take a long time and what can be done quickly? (Computational complexity)

Outline

- (Stochastic, discrete) chemical reaction networks
- Time lower bound on one computational task: *leader election*
- Open questions

finite set of d species {A,B,C,D...}

• configuration $\mathbf{x} \in \mathbb{N}^d$: molecular counts of each species

• finite set of *reactions*: *e.g.*

 $A+B \xrightarrow[k_2]{k_2} A+C$ $C \xrightarrow[k_3]{k_3} C$

 $\begin{array}{ccc}
A & B & C \\
X = (2, 2, 0)
\end{array}$

- $\alpha: \qquad A+B \rightarrow A+C$
- $\beta: \qquad C \rightarrow A + A$



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\end{array}$





$$\beta: \qquad C \rightarrow \boxed{A+A}$$

$$\begin{array}{cccc}
A & B & C \\
\mathbf{x} = (2, 2, 0) \\
\alpha \downarrow \\
(2, 1, 1) \\
\beta \downarrow & \mathbf{a} \\
(4, 1, 0)
\end{array}$$
Example Execution

 $\alpha: \qquad \boxed{A+B} \rightarrow A+C$ $\beta: \qquad C \rightarrow A+A$ $\begin{array}{cccc} A & B & C \\ \mathbf{x} = (2, 2, 0) \\ \alpha & \downarrow \\ (2, 1, 1) \\ \beta & \downarrow & \checkmark^{\alpha} \\ (4, 1, 0) \end{array}$

Example Execution

- $\alpha: \qquad \mathbf{A} + \mathbf{B} \rightarrow \mathbf{A} + \mathbf{C}$
- $\beta: \qquad C \rightarrow A + A$

A B C X = (2, 2, 0)α ↓ (2, 1, 1) \mathbb{V}^{α} β ↓ (4, 1, 0)α ↓ (4, 0, 1)

Stochastic kinetic model of CRNs

Solution volume v

System evolves via a continuous time Markov process:

time until next reaction is exponentially distributed with rate $\sum prop_i$ Pr[next reaction is rxn_j] = $prop_j/\sum prop_i$

reaction type $prop_i$ $A \xrightarrow{k} \dots$ $k \cdot \#A$ $A+B \xrightarrow{k} \dots$ $k \cdot \#A \cdot \#B / v$ $A+A \xrightarrow{k} \dots$ $k \cdot \#A \cdot (\#A-1) / v$

McQuarrie 1967, van Kampen, Gillespie 1977, etc

Main result (informally)

"Leader election" (getting to count 1 of a species) requires $\Omega(n)$ expected time

$L+L \rightarrow L+F$

Doty, Soloveichik, "Stable leader election in population protocols requires linear time" DISC 2015: International Symposium on Distributed Computing

Getting "precise" quantities of species (*e.g.* exactly 1 *L*) from "uncontrolled" initial conditions (*e.g.* a lot of *A*).

- easy to add billions of molecules to test tube
- difficult to add 1

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Versions of "leader election" in biology: centriole number, choice of olfactory receptor expression, ...

First step towards establishing full theory of time complexity in CRN computation ("in-house" result)

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Defining stable leader election

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If number of reachable configurations is finite, CRN will reach such a configuration with probability 1

How to fairly assess speed?

Like any respectable computer scientist... by ignoring constant factors



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rate constants k_i bounded by 1



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n = total molecular countvolume $v = \Theta(n)$ *i.e.*, <u>require bounded concentration</u> (finite density constraint)



n molecules volume $v = \Theta(n)$



n molecules volume $v = \Theta(n)$





propensity: $#A \cdot #B / v = \Theta(1/n)$

expected time to produce *Y*:

 $\Theta(n)$

n molecules volume $v = \Theta(n)$



$$A + B \rightarrow Y + B$$

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Θ(*n*)

 $\Theta(\log n)$

 $B + X \rightarrow B + B$ $A + B \rightarrow Y + B$

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$$A + B \rightarrow Y + B$$

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 $\begin{array}{c} B + X \rightarrow B + B \\ A + B \rightarrow Y + B \end{array}$

initial configuration: <u>uniform</u> (all *n* molecules of the same species) **output:** stable configuration with #L = 1

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Naïve algorithm:

initial config = {n L}

 $L+L \rightarrow L+F$

 $\Theta(n)$ time



"2-bottleneck" reaction

initial configuration: <u>uniform</u> (all *n* molecules of the same species) **output:** stable configuration with #L = 1

Naïve algorithm:



Fast leader <u>elimination</u> $L+F \rightarrow F+F$

"2-bottleneck" reaction

initial configuration: <u>uniform</u> (all *n* molecules of the same species) **output:** stable configuration with #L = 1

Naïve algorithm:



Fast leader elimination

 $\stackrel{\mathsf{L}}{\wedge} \stackrel{\mathsf{F}}{\rightarrow} \stackrel{\mathsf{F}}{} \stackrel{\mathsf{F}}{\rightarrow} \stackrel{\mathsf{F}}{} \stackrel{\mathsf{F}}{\rightarrow} \stackrel{\mathsf{F}} \stackrel{\mathsf{F}}{\rightarrow} \stackrel{\mathsf{F}}{\rightarrow} \stackrel{\mathsf$

 $\Theta(\log n)$ time

one of these is always count $\geq n/2$

"2-bottleneck" reaction

Main theorem

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notion of denseness is compatible with *"mass action limit" a.k.a. "mean field approximation"*

Sublinear time implies \exists reaction sequence resulting in 1 *L* with no O(1)-bottleneck reactions

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when L=2 and $L+B \rightarrow C+D$ occurs, $B \gg 1$ since it's not a bottleneck

This configuration might not be stable! (CRN could produce a new leader)



Sublinear time leader election from non-uniform initial configurations is possible!

 $#R = n^{1/4}$ $#X = n - n^{1/4}$ #L = 0

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Sublinear time leader election from non-uniform initial configurations is possible!

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total expected time $O(n^{1/2} \log n)$ (proof not shown)

Large counts lemma

From uniform initial configuration $\mathbf{i} = \{n \ A\}$, with probability > 99%, after O(1) time, all species reach count $\Omega(n)$

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hypothesis of lemma



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 (\mathbf{i}_n) : uniform initial configurations (all *n* molecules are *A*)



hypothesis of lemma

(**i**_n): uniform initial configurations (all *n* molecules are *A*) (**x**_n): **i**_n \Rightarrow **x**_n where **x**_n(*S*) \ge 0.01*n* for <u>all</u> species *S* (large counts lemma)



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(**i**_n): uniform initial configurations (all *n* molecules are *A*) (**x**_n): **i**_n \Rightarrow **x**_n where **x**_n(*S*) \ge 0.01*n* for <u>all</u> species *S* (large counts lemma) (**y**_n): **x**_n \Rightarrow **y**_n no bottleneck (fast), **y**_n has stable leader (correct)



hypothesis of lemma

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- goal is **any** positive number of leaders under some constant
- there are **multiple** leader species L_1, L_2, \dots, L_k and we want to stabilize to $\sum \#L_i = 1$

Convergence versus stabilization

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Leader election takes $\Omega(n)$ time to <u>stabilize</u>; what about convergence?



Leader election takes $\Omega(n)$ time to <u>stabilize</u>; what about convergence?

What initial configurations allow sublinear leader election?

dense configurations like { n/2 A, n/4 B, n/4 C }: **NO**

non-dense configurations like { $n-n^{1/4} X$, $n^{1/4} R$ }: **YES**

Take-home message (engineer's perspective)

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Ask not what nature does

Take-home message (engineer's perspective)



Ask not what nature does

Ask what nature could do...



Recruiting Ph.D. Students



David Soloveichik



David Doty



