Molecular computing with DNA: theory and implementation

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Caltech









Theorem: Let *T* be a tile assembly system ...









Building stuff



Newgrange, Ireland. 5.2k years old

- Building stuff by hand: use tools! Great for scale of 10^{+/-2} x
- Building tools that build stuff: specify target object with a computer program that then controls the manufacturing process





 Programming stuff to build itself: for building stuff in small wet places where our hands or tools can't reach





 Today you'll hear about self-assembling molecules that compute as they build themselves



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Biology is an expert at nanoscale engineering

- Evolution: a long-term random and unpredictable process used by Biology, not a good way engineer (Too slow. What are the principles? Not reproducible. Caveat: Directed evolution in a controlled environment)
- We'd like to be able to design from the ground up:
 - using materials and processes we understand
 - using a hierarchy to handle complexity
 - systems that have the potential for computation

Material

- DNA is a material that fits the bill! (Thanks Biology!)
- DNA is so predictable and well-understood that we can use it like a kind of nanoscale Lego



Newly hatched zebrafish, 3 days after zygote



DNA & DNA tiles









• Yin, Hariadi, Sahu, Choi, Park, LaBean, Reif. Science. 2008



	b1 a10*	a1 b10
b10 a9*	a10 b9*	











D Woods. Flourscently labelled nanotubes

We made a "DNA nanotube" using small DNA strands, what else can strands do?

Background: DNA nanostructures



Example DNA nanostructure: DNA origami



Movie by Shawn Douglas

Background: DNA nanostructures



Background: DNA nanostructures



DNA nanostructure examples



DNA origami: Rothemund, Nature 2006



DNA single-stranded tiles: Wei, Dai, Yin, Nature 2012

3D shapes made out of DNA



DNA origami box (that opens) Andersen et al. Nature 2009.



DNA origami 3D wireframe shapes Benson, et al. Nature 2015

Nanostructure design via self-assembly

We tell the molecules exactly where to go



Nanostructure design via self-assembly

We tell the molecules exactly where to go

Can we have **smarter** molecules that decide where to go for themselves?



100nm

Rothemund 2006 Nature



ATCGCATTAA

TAGCGTAATT

Wei, Dai, Yin. 2013 Nature

Yin et al 2008 Science

An asynchronous cellular automaton model capturing dynamics of molecular binding

- Square tiles
 - finite set of tile types, unlimited supply of each type, non-rotatable
- Each side has a glue (colour) and strength (0,1,2,3,...)
- System has a **temperature** (e.g. 2)
- Simple local binding rule: A tile sticks to an assembly if enough of its glues match so that the sum of the strengths of the matching glues is at least the temperature

Model by Winfree, 1998





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strength 2 strength 1

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seed





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seed





Algorithmic self-assembly theory: previous work



 Turing universality Winfree, PhD Thesis. 1998



- Efficient assembly of simple shapes: n x n squares using Θ(log n / log log n) tile types Adleman, Cheng, Goel, Huang STOC 2001 Rothemund, Winfree. STOC 2000
- Efficient assembly of scaled shapes using a number of tile types roughly equal to the Kolmogorov complexity of the shape

Soloveichik, Winfree. SICOMP 2007



Algorithmic self-assembly **theory**: previous work Simulation & *intrinsic* universality



Complexity hierarchy for self-assembly Damien Woods Characterisations and comparisons of selfassembly models based on **simulation** between self-assembly systems

[8] STOC 2017
[7] Phil Trans Royal Soc. A. 2015
[6] Algorithmica 2015
[5] SODA 2014
[4] ICALP 2014
[3] ICALP 2013
[2] FOCS 2012
[1] STACS 2012
Algorithmic self-assembly experiments: previous work



Bit Copying. Barish et al.2009



Sierpinski Triangles. Rothemund, Papadakis, Winfree. 2004



Counter. Barish et al. 2009





Copying & replication Schulman, Yurke, Winfree. PNAS. 2012



Copying, Sierpinsky, binary counting to 31: Can we run more algorithms?

Structure of talk

Copying, Sierpinski, binary counting to 31, can we run more algorithms?

Theoretical circuit model

How it works: design and implementation Experimental results

()

0

1*

0

()

0

0

()

0



0































A local circuit model: randomised gates



Programmer

specifies a layer





User gives *n* input bits $x_k \in \{0,1\}$





User gives *n* input bits $x_k \in \{0,1\}$



Programmer specifies a layer

User gives *n* input bits $x_k \in \{0,1\}$









circuit







user







programmer

Example circuit: "SORTING"

programmer



user

computation





Example circuit: "SORTING"



Example circuit: "SORTING" computation user











Example circuit: COPY bits to the right





Example circuit: LAZYSORTING



Example circuit: LAZYSORTING


Example circuit: LAZYSORTING



user

computation







Which circuits to build?



Which circuits to build?







Structure

Theoretical circuit model

How it works: design and implementation

Experimental results

From circuits to square tiles



input

layer 2 layer 3 layer 1 input

 x_1

 x_2

 X_3

 χ_4

 χ_6

 $\mathbf{0}$

3

5

growing tile lattice

From circuits to square tiles





Yin, Hariadi, Sahu, Choi, Park, LaBean, Reif. Science. 2008

From square tiles to DNA single-stranded tiles



From square tiles to DNA single-stranded tiles



From square tiles to DNA single-stranded tiles



1,288 gates \rightarrow 89 tiles \rightarrow 355 tiles \rightarrow 355 DNA strands





How the DNA tile lattice should look



DNA sequence design

- Major challenge: We need to design DNA strands that bind when they should, and to not bind when the shouldn't
- The next slide summarises some of the issues



DNA sequence design

- Major challenge: We need to design DNA strands that bind when they should, and to not bind when they shouldn't
- Custom DNA sequence designer; built on top of Nupack & ViennaRNA



Barcoded DNA origami seed

 $39,18 \quad 71,18 \quad 103,18 \quad 135,18 \quad 167,18 \quad 199,18 \quad 231,18 \quad 263,18 \quad 295,18 \quad 327,18 \quad 359,18 \quad 391,18 \quad 423,18 \quad 433,18 \quad 433$



Choose which staples have biotin modifications

Form 16-helix tube

Unzip

add streptadividin & image on mica





Abstraction hierarchy

Structure

Theoretical circuit model

How it works: design and implementation

Experimental results

Schematic



Schematic



Schematic



355 tiles that implement any 6-bit circuit

6-bit **input** strands



6-bit **input** strands

programmer: chooses 100 bubble sort tiles

355 tiles that \langle

implement **any**

6-bit circuit



tiles & seed

355 tiles that implement **any 6-bit circuit**

programmer: chooses 100 bubble sort tiles



user: adds 6-bit input 000001 (8 strands)

tiles &

seed



An example experiment: SORTING 355 tiles that 6-bit input implement **any** strands **6-bit circuit** user: adds 6-bit input 000001 (8 strands) programmer: chooses **100 bubble sort tiles** many # nanotubes 1 hour 1-2 days algorithmic seed self-assembly forms few tiles & temp(C) 40 50 60 seed nice seeded blobs melt tubes growth Joy Hui



1 day unzip, guards, deposit on mica, add streptavidin



8 µm x 8 µm







100nm

50

PARITY: is the number of 1s odd?



000001 yes 100001 no 100101yes 110101 no 001000 yes 011000 no

Testing of tile set: Parity on all 64 inputs

		32 x Y	<i>és</i>
σ(000001) = 001	(90)	σ(100000) = 211	SII Commencer and
$\sigma(000010) = 011$	69 [1	0(100011) = 213	813
<i>σ</i> (000100) = 020	828 maine in an and an an	σ(100101) = 003	803
<i>σ</i> (000111) = 023		σ(100110) = 222	5.55 minut
<i>σ</i> (001000) = 441	441	σ(101001) = 231	······································
σ(001011) = 100	1 800	σ(101010) = 232	S35 yunmannun auf
<i>σ</i> (001101) = 102	182	σ(101100) = 234	8 34 Commune
<i>σ</i> (001110) = 103	103	σ(101111) = 302	302 Minus
σ(010000) = 111	YII manual and	σ(110001) = 310	310 hour an anna 1016
σ(010011) = 114	TH surround a more some	σ(110010) = 320	920 Marchanner 950
σ(010101) = 122	155 :	σ(110100) = 330	338 Same
<i>σ</i> (010110) = 123	153	σ(110111) = 400	HOO Imminum
σ(011001) = 131	131	σ(111000) = 401	461 mm
σ(011010) = 132	1.35	σ(111011) = 411	14 1 1 Some marches a reading water
σ(011100) = 134	1.34	σ(111101) = 421	19 2 1 Mar
<i>σ</i> (011111) = 210	2163	σ(111110) = 430	4 20 manunum

32 x No







110101 =53





yes

yes

no

no

.....







Erik Winfree

Computational power of this model?

The model is a rather restricted circuit model: "depth 2 layer", restricted wiring within layer, repeated-layer, 0/1 signals on the wires. What can it compute?



Something outside AC⁰ (parity), no more than P (via explicit simulation for *t* layers)

Classes of problems:

AC⁰: constant depth, poly size, Boolean circuits with arbitrary fanin gates

NC¹: log depth, poly size, Boolean circuits with fanin \leq 2 gates

L: deterministic log space Turing machines

P: deterministic polynomial time Turing machines

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Rule 110



Theorem: Let *M* be a Turing machine that runs in time *t*, rule 110 simulates *M* in $O(t^2 \log t)$ steps

[Cook 2004] [Neary, Woods, 2006] [Neary, PhD thesis] (d) sequence of simulations

Turing machine
Cyclic tag system C
Inule 110

(e) O(t² log t)-bit input, O(t² log t) time steps

[C]left ... [C]left [C]left [input for C] [C]right [C]right ... [C]right ...

rule 110

computation
simulating cyclic
tag system C

Simulation of rule 110

- X Y ZF(0,0,0) = 0X Y ZF(1,0,0) = 0
- F(0,0,1) = 1 F(1,0,1) = 1 rule 110
- F(0,1,0) = 1 F(1,1,0) = 1 truth table
- F(0, 1, 1) = 1

F(1, 1, 1) = 0

x	Express the rule as $f(g(x,y),h(y,z))$		
У	у'	$y' = (\neg x \land y) \lor (y \otimes z)$	
Z			



Simulation of rule 110

xyz	xyz	
F(0, 0, 0) = 0	F(1, 0, 0) = 0	
F(0, 0, 1) = 1	F(1, 0, 1) = 1	rule 110
F(0, 1, 0) = 1	F(1, 1, 0) = 1	truth table
F(0, 1, 1) = 1	F(1, 1, 1) = 0	

X	Express the rule as $f(g(x,y),h(y,z))$
У	$\mathbf{y'} y' = (\neg x \land y) \lor (y \otimes z)$
Ζ	

IBC sub-circuit



6-bit IBC to simulate 3 bits of rule 110







RULE110 circuit: simulation of cellular automata



RULE110 circuit: simulation of cellular automata



California surf: WAVES







FAIRCOIN: Unbiased bit from biased coin



59

Counting to 63

Circuit with 63 distinct strings

123...

cycle 63

Is there a 64-counter?

No! Proof by Tristan Stérin, Maynooth University



42

....62 63 1 2

Palindromes: high communication complexity

palindrome yes yes no no



How well did the 21 circuits work?

Extensive testing of all 355 tiles:

- every tile type was used in some circuit
- for many circuits tested all tile types for that circuit
- ran one circuit on all 64 inputs

Analysed ~12k nanotubes with ~5M tile attachments:



Reprogrammable: demonstrated many new self-assembly programs Scaling up: 15x more tile types than previous algorithmic self-assembly systems Low error: Careful sequence design; Proofreading Good structure: Nanotube lattice & hardcoded rows Lots of tile types: Long SST domains

63



raw data 8µm x 8µm





Dave Doty UC Davis

Erik Winfree Caltech

Acknowledgements



C Myhrvold Harvard



Joy Hui

Harvard



Felix Zhou

Oxford



Peng Yin Harvard



Woods, Doty, Myhrvold, Hui, Zhou, Yin, Winfree. *Diverse and robust molecular algorithms using reprogrammable DNA self-assembly.* Nature. 567 (7748), 366 2019

Special thanks to: Constantine Evans, Ashwin Gopinath, Paul Rothemund, Sungwook Woo, Cody Geary, Cris Moore, Chris Thachuk, Rizal Hariadi, Rebecca Schulman



- 1219274 Doty, Woods
- 1162589 Winfree Yin Doty Woods
- 0832824 & 1317694 Molecular Programming Project. Winfree et al.
- NASA #NNX13AJ56G. Woods.

Fin?

Ongoing and future work:

- Self-assembly
- Molecular robotics
- Self-replication

We are looking for postdocs and PhD students!

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