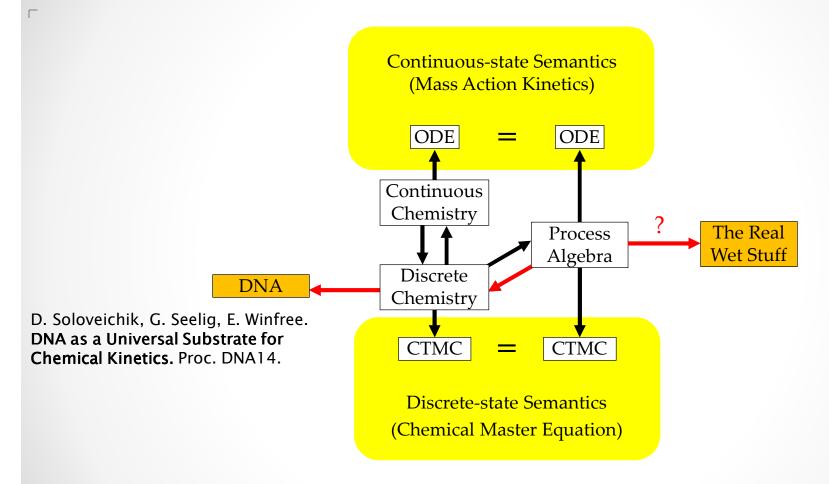


### Luca Cardelli

Microsoft Research

IST Austria, 2010-05-06 http://lucacardelli.name

### Molecules as Automata



L. Cardelli: "On Process Rate Semantics" (TCS)

L. Cardelli: "A Process Algebra Master Equation" (QEST'07)

### Smaller and Smaller

Dec. 23, 1947. John Bardeen and Walter Brattain show the first working transistor.

Sep. 1958. Jack Kilby builds the first integrated circuit.

50 years later

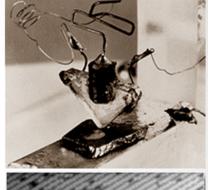
Jan. 2010. Intel and Micron announce 25nm NAND flash.

Dec. 24, 2009. Working transistor made of a single molecule.

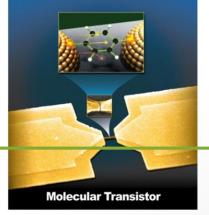
Observation of molecular orbital gating. *Nature*, 2009; 462 (7276): 1039

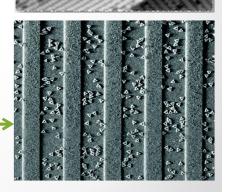
<10 iterations of Moore's Law left! The race is on for *molecular scale integrated circuits*.









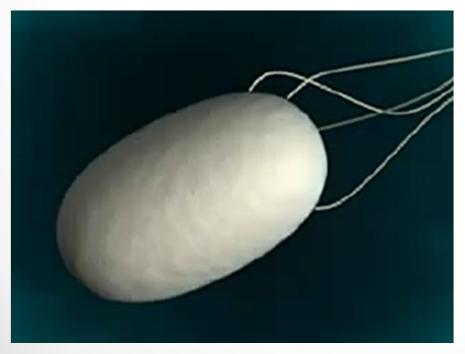


Placement and orientation of individual DNA shapes on lithographically patterned surfaces.

Nature Nanotechnology 4, 557 – 561 (2009).

## Building The Smallest Things

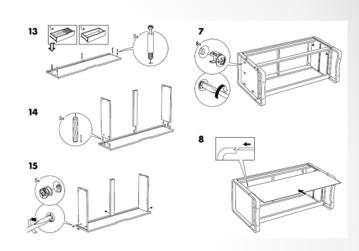
- How do we build structures that are by definition smaller than your tools?
- Basic answer: you can't. Structures (and tools) should build themselves!
- By programmed self-assembly.



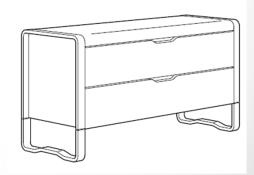


### Molecular IKEA

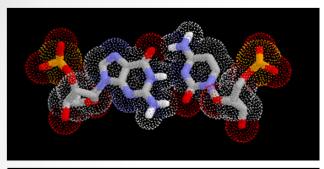
- Nature can self-assemble.
   Can we?
- "Dear IKEA, please send me a chest of drawers that assembles itself."
- We need a magical material where the pieces are pre-programmed to fit into to each other.
- At the molecular scale many such materials exist; let's pick one...



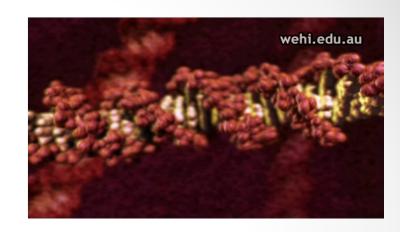


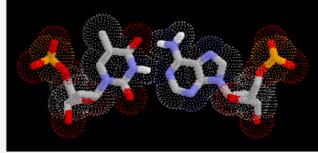


### DNA



GC Base Pair Guanine-Cytosine

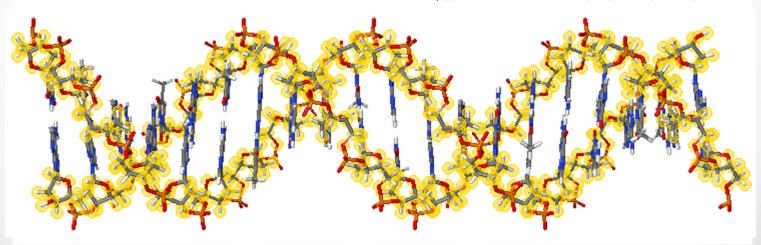




TA Base Pair
Thymine-Adenine

Interactive DNA Tutorial

(http://www.biosciences.bham.ac.uk/labs/minchin/tutorials/dna.html)



Sequence of Base Pairs (GACT alphabet)

## Robust, and Long

#### DNA in each human cell:

- 3 billion base pairs
- o 2 meters long, 2nm thick
- o folded into a 6μm ball
- o 750 MegaBytes

#### A huge amount for a cell

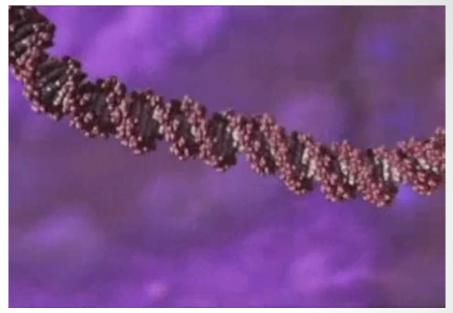
- Every time a cell replicates it has to copy 2 meters of DNA reliably.
- To get a feeling for the scale disparity, compute:

#### DNA in human body

- o 10 trillion cells
- 133 Astronomical Units long
- 7.5 OctaBytes

#### DNA in human population

o 20 million light years long



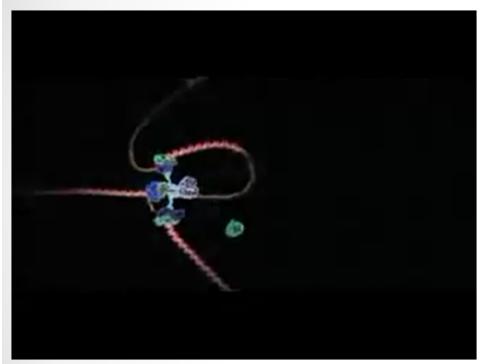
DNA wrapping into chromosomes



Andromeda Galaxy 2.5 million light years

# Zipping Along

DNA can support structural and computational complexity.



DNA replication in *real time* 

In Humans: 50 nucleotides/second Whole genome in a few hours (with parallel processing)

In Bacteria: 1000 nucleotides/second (higher error rate)



DNA transcription in real time

RNA polymerase II: 15-30 base/second

Drew Berry http://www.wehi.edu.au/wehi-tv

## Nanoscale Engineering

### Sensing

- Reacting to forces
- Binding to molecules

#### Actuating

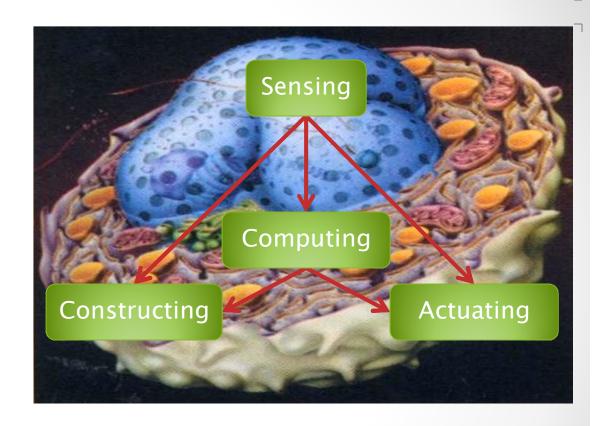
- Releasing molecules
- Producing forces

#### Constructing

- o Chassis
- o Growth

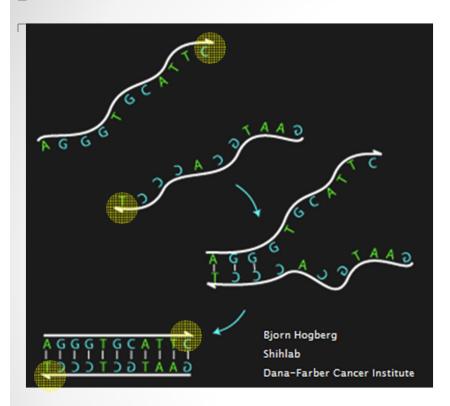
#### Computing

- Signal Processing
- Decision Making



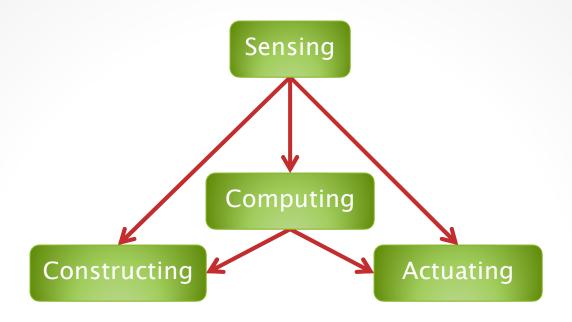
Nucleic Acids can do all this. And interface to biology.

# Hybridization

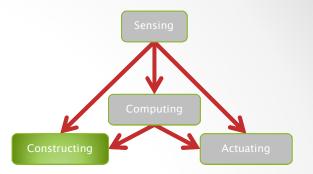




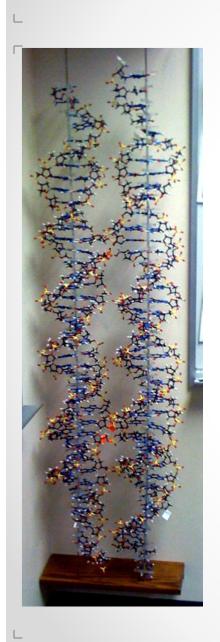
- Strands with opposite orientation and complementary base pairs stick to each other (Watson-Crick duality).
- This is all we are going to use
  - We are not going to exploit DNA replication, transcription, translation, restriction and ligation enzymes, etc., which enable other classes of tricks.

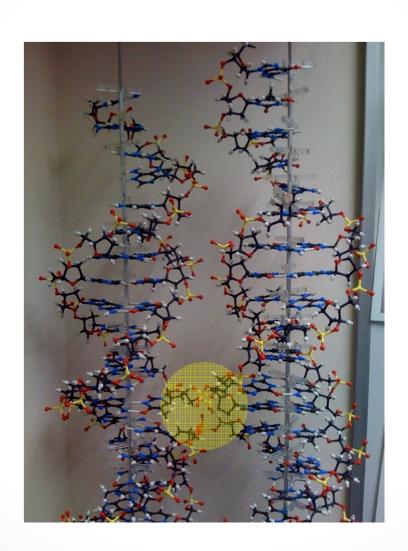


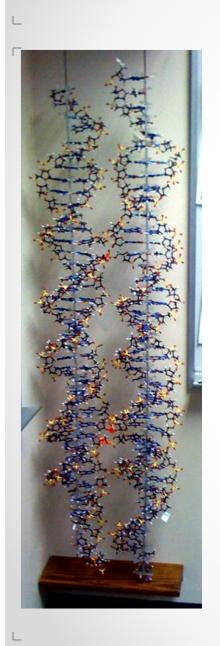
# Hybridization Tricks

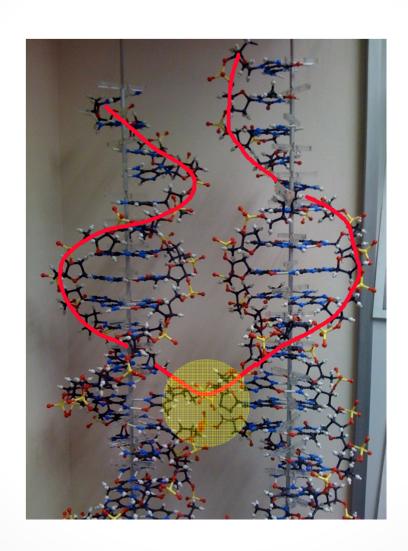


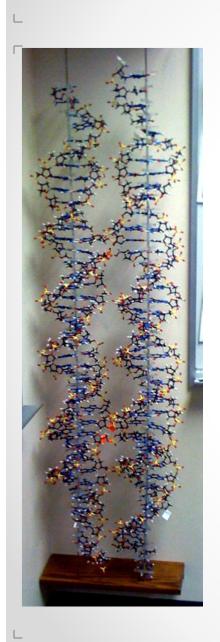
# Constructing

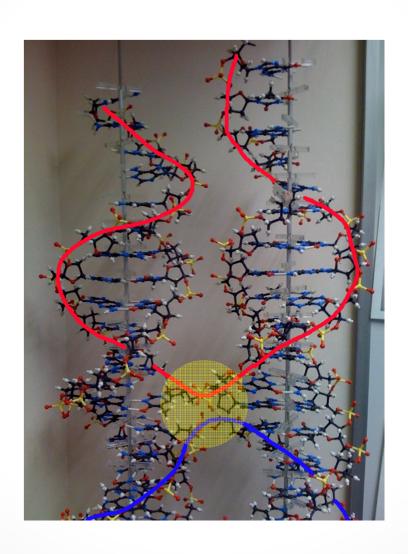


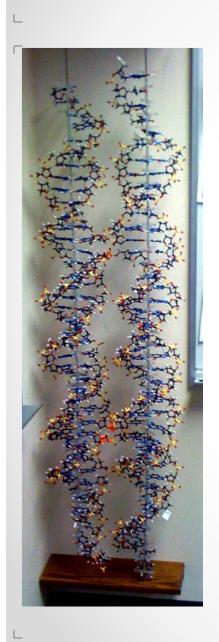


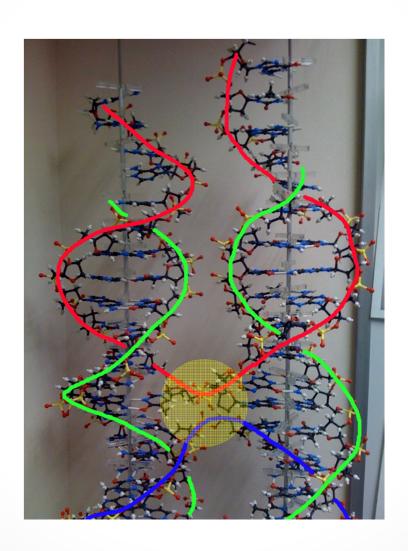


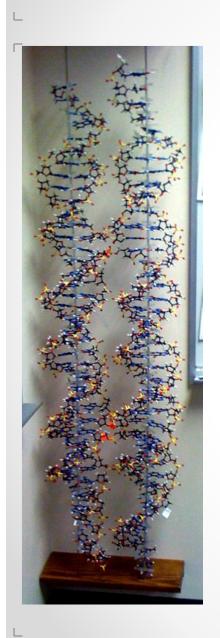


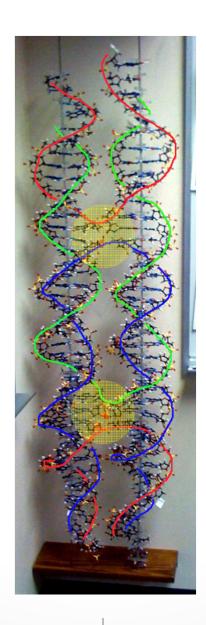




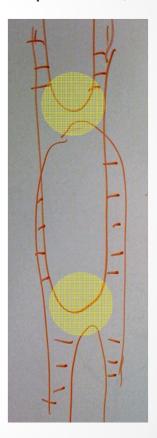






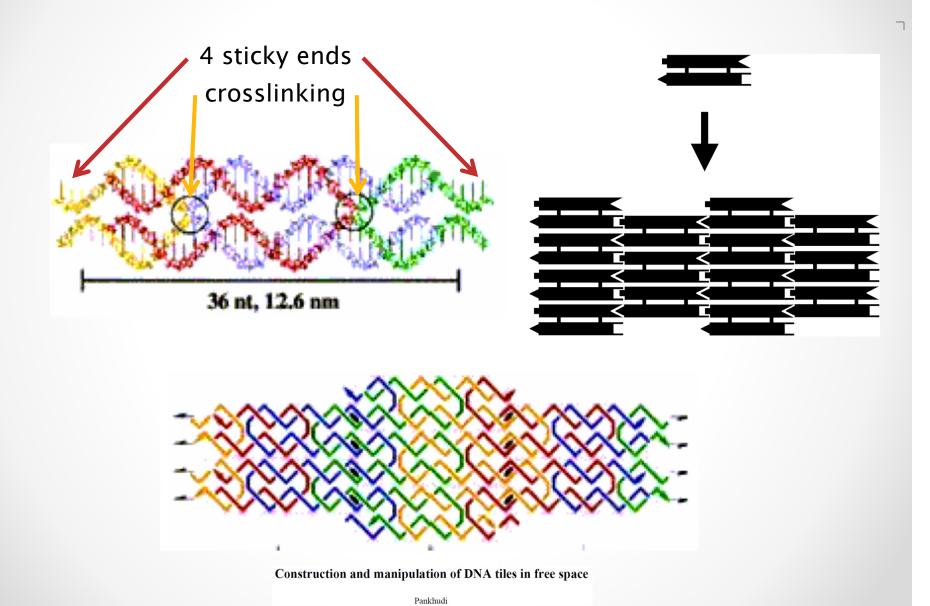


In nature, crosslinking is deadly (blocks DNA replication).

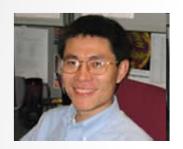


In engineering, crosslinking is the key to using DNA as a construction material.

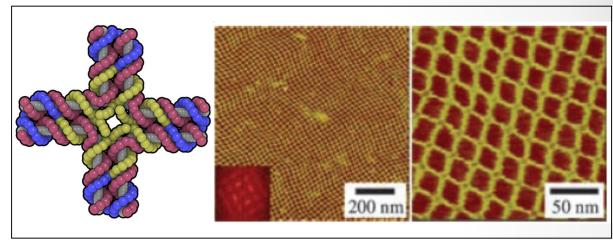
# **DNA** Tiling



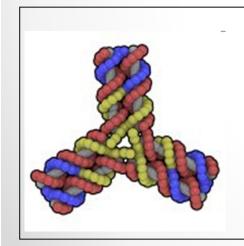
### 2D DNA Lattices

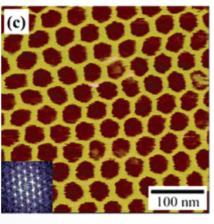


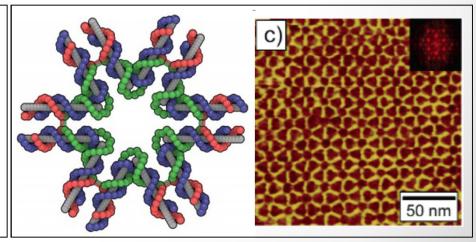
Chengde Mao Purdue University, USA



N-point Stars



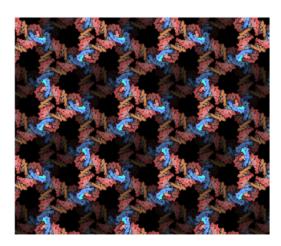


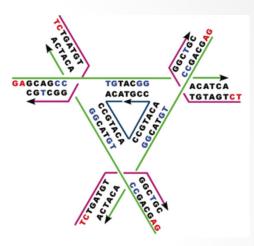


## 3D DNA Structures



Ned Seeman NYU

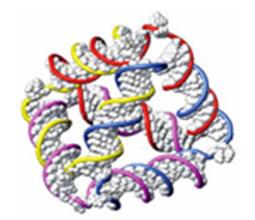


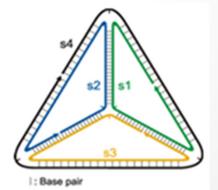


3D Cyrstal



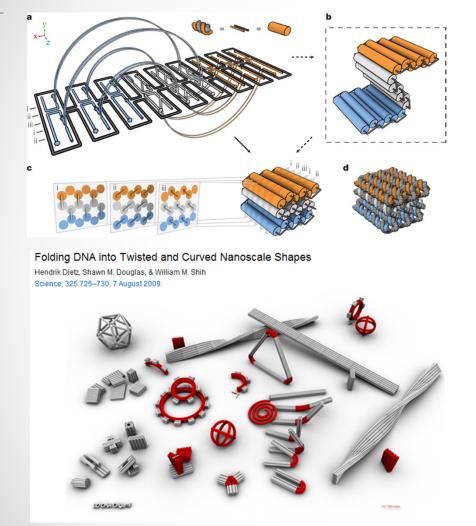
AndrewTuberfield Oxford

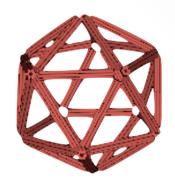




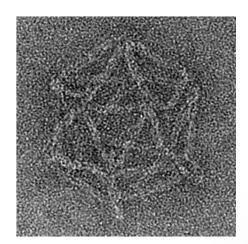
Tetrahedron

### **CADnano**





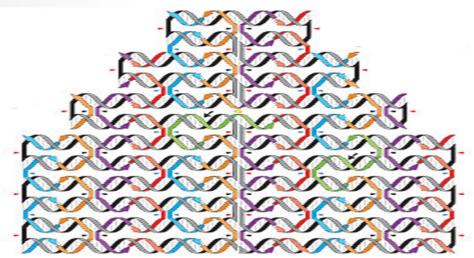


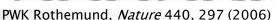


S.M. Douglas, H. Dietz, T. Liedl, B. Högberg, F. Graf and W. M. Shih Self-assembly of DNA into nanoscale three-dimensional shapes, Nature (2009)

## **DNA** Origami

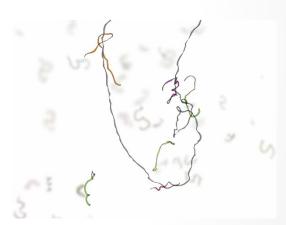
- Folding long (7000bp) naturally occurring (viral) ssDNA
- By lots of short 'staple' strands that constrain it



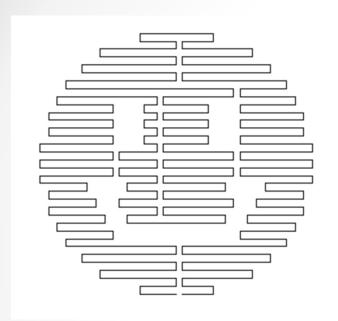


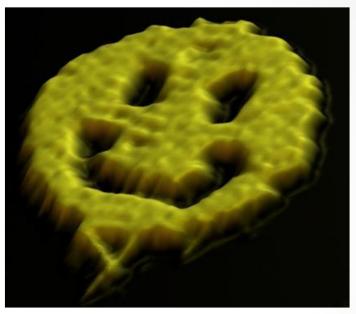
Black: long viral strand

Color: short staple strands



## **DNA** Origami





Paul Rothemund's "Disc with three holes" (2006)

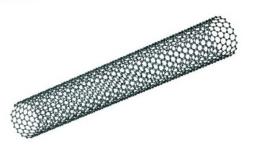


Paul W K Rothemund
California Institute of Technology

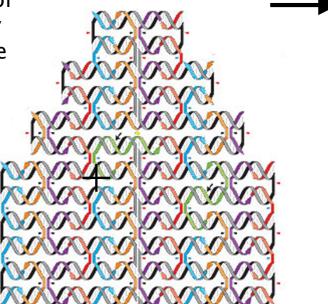
This means we can already self-assemble meso-scale structures.

### **DNA Circuit Boards**

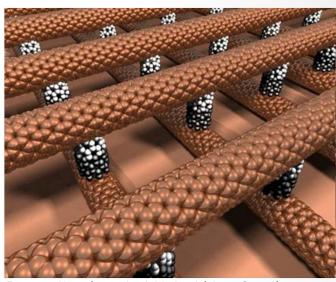
DNA-wrapped nanotubes



6 nm grid of individually addressable pixels

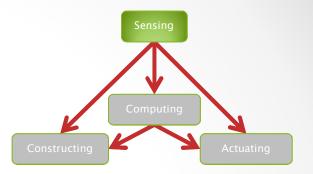


PWK Rothemund, *Nature* 440, 297 (2006)



European Nanoelectronics Initiative Advisory Council

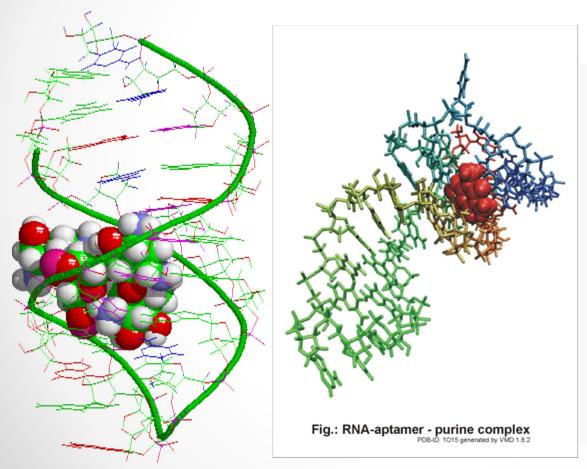
"What we are really making are tiny DNA circuit boards that will be used to assemble other components." Greg Wallraff, IBM

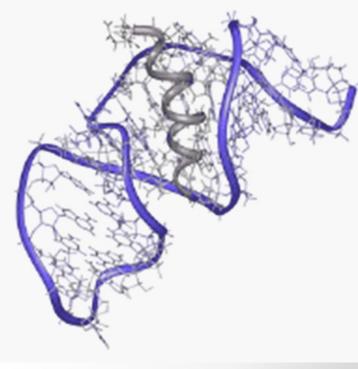


# Sensing

## **Aptamers**

 Artificially eveloved DNA molecules that stick to anything you like (highly selectively).





# Pathogen Spotlights

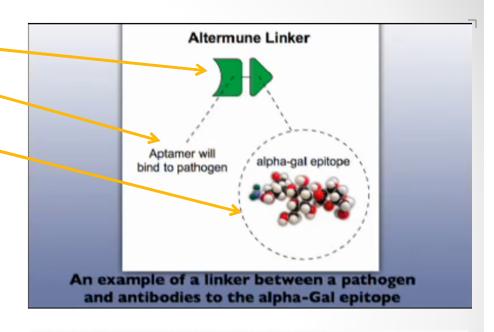
#### DNA aptamer binds to:

- o A) a pathogen
- B) a molecule our immune system already hates and immediately removes (eats) along with anything attached to it

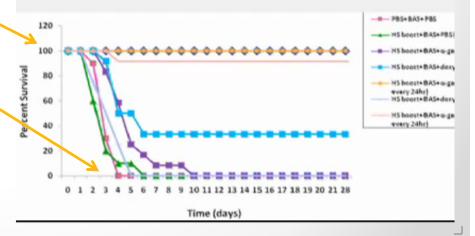
#### Result: instant immunity

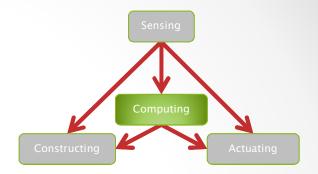
- Mice poisoned with Anthrax plus aptamer (100% survival)
- Mice poinsoned with Anthrax (not so good)

Kary Mullis (incidentally, also Nobel prize for inventing the Polymerase Chain Reaction)



Survival Curve of A/J Mice Immunized with Human Serum, Challenged with BAS and Treated with α-gal PAA-12 Aptamer and Doxycycline





# Computing

Basic Steps

## Compositionality

- Sensors and Actuators at the 'edge' of the system
  - They can use disparate kinds of inputs (sensors) and outputs (actuators)
- The 'kernel' of the system computes
  - Must use uniform inputs and outputs
- Compositionality in the kernel
  - Supporting 'arbitrary' computing complexity
  - The output of each computing components must be the same kind of 'signal' as the input
  - o If the inputs are voltages, the outputs must be voltages
  - If the inputs are DNA, the outputs must be DNA
- Central design question
  - o What should our signals (not components!) be?
  - Then design components that manipulate those signals.

### Rules of the Game

Short complementary segments hybridize reversibly

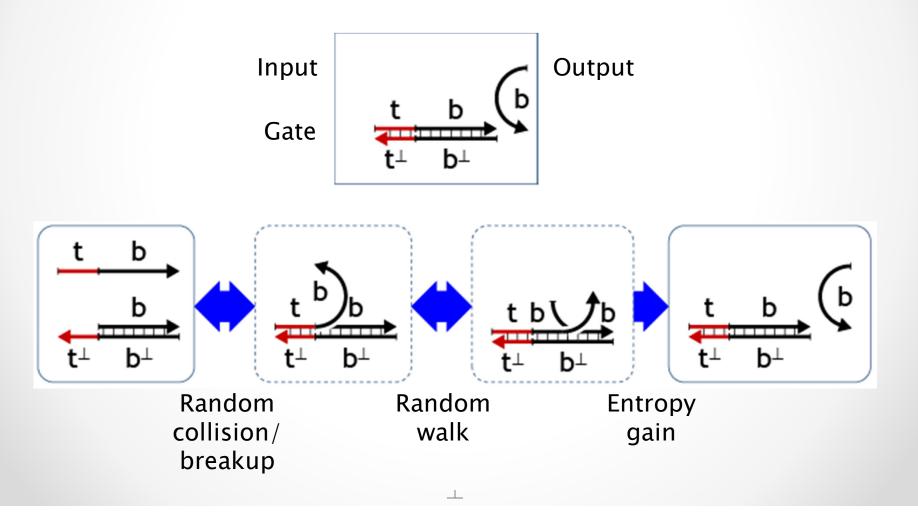


Long complementary segments hybridize irreversibly

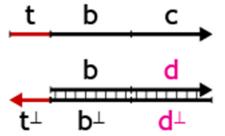
$$\begin{array}{c|c} & & & \\ \hline & &$$

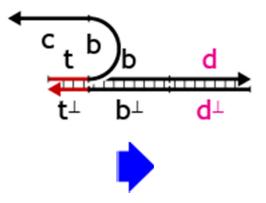
## DNA Strand Displacement

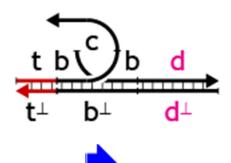
- Short strand (toehold): reversible binding
- Long strand (body): irreversible binding

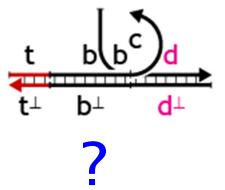


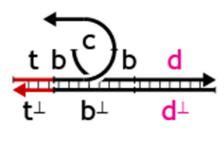
What if the input does not match the gate?





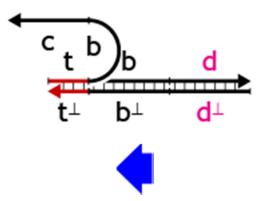






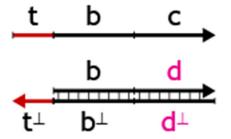


# Failed Strand Displacement

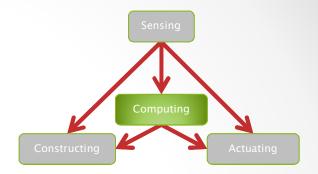


### Failed Strand Displacement

- Hence an incorrect binding will undo
  - That's why toeholds must bind reversibly



- Matching depends on the long segment only
  - Strand displacement succeeds iff the whole long segment matches
  - The address space is determined by the size of the long segment, which is unbounded (not by the size of the toehold)
  - The toehold is just a 'cache' of the address



### Computing

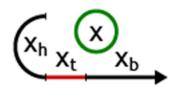
Implementing "Arbitrary" Computing Functions

# What does DNA Compute?

- Electronics has electrons
  - All electrons are the same: you can only count them
  - Few electrons = False; lots of electrons = True
  - o But Boolean Logic is only a necessary evil to build symbolic computation
- DNA computing has symbols (DNA words)
  - DNA words are not all the same
  - Symbolic computation on abstract signals can be done directly
  - Signals are presented concurrently (in a soup)
  - No requirement to do Boolean Logic
- Then, what are our 'gates' (if not Boolean?)
  - Theory of Concurrency
  - o Process Algebra as the "Boolean Algebra" of DNA Computing

# Signals

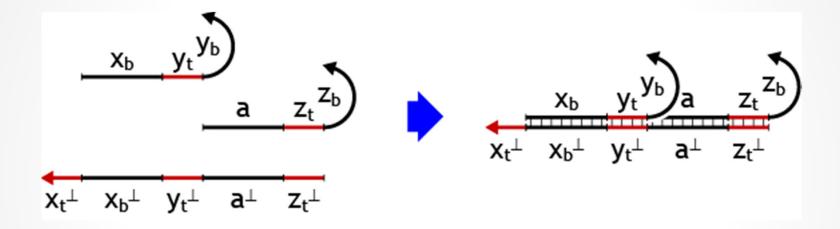
- A signal is the representation of an abstract event
  - o E.g. generated by a sensor
  - E.g. accepted by an effector
  - We are not limited to true/false
- 3-domain signals
  - o x<sub>h</sub>: hystory (ignore)
  - x<sub>t</sub>: toehold (binding)
  - x<sub>b</sub>: body (recognition)



 Signals (single stranded DNA) are prepared by (artificial) DNA synthesis

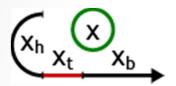
#### Gates

Double-stranded structures with free toeholds

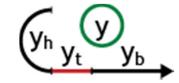


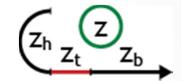
 Gates are prepared by self-assembly from singlestranded DNA that is synthesized

•  $X \rightarrow Y + Z$ 

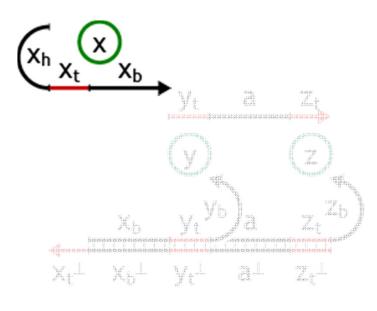


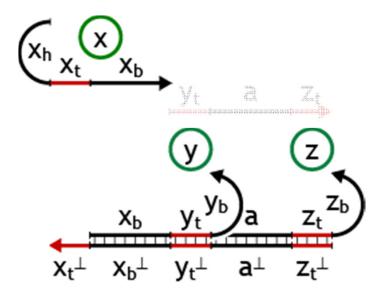


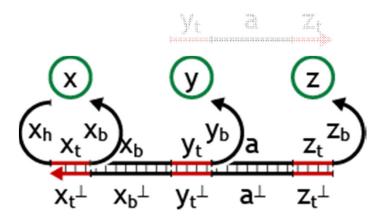


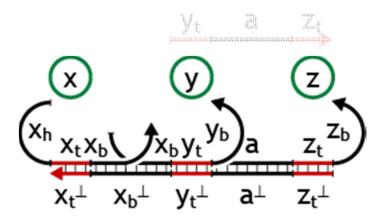


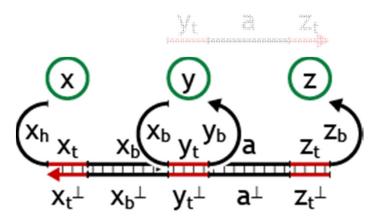
- $x \rightarrow y + 0$  transform x to y (transducer)
- $x \rightarrow x + y$  linear production of y (catalyst)
- $x \rightarrow x + x$  exponential production of x (amplifier)

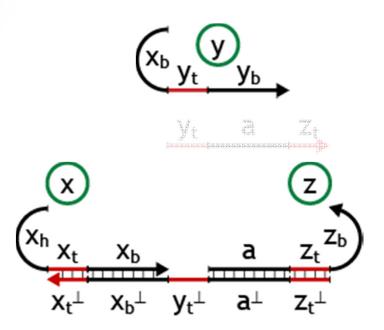


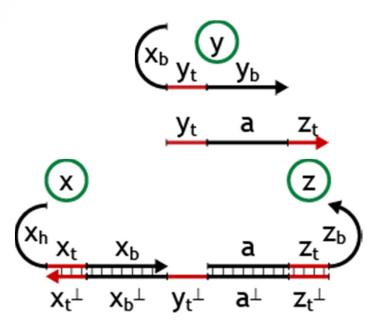


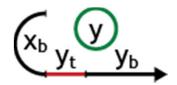


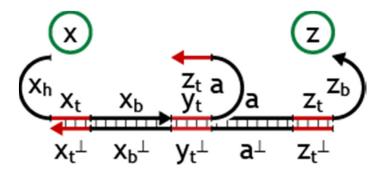


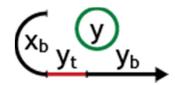


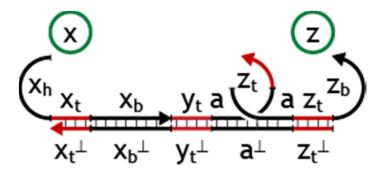


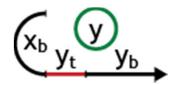


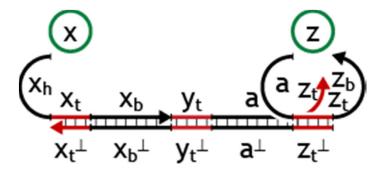


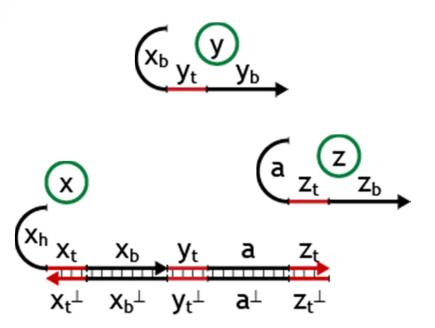


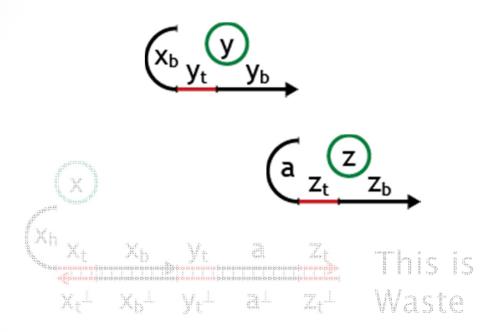




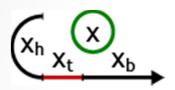


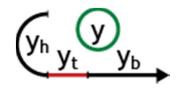




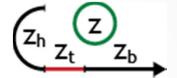


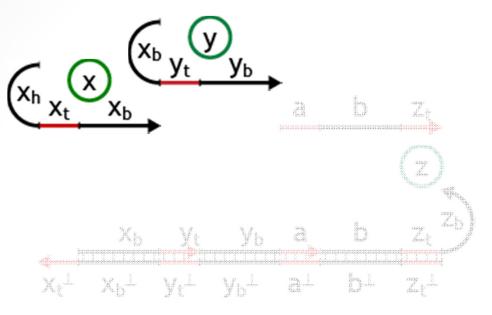
$$x + y \rightarrow z$$

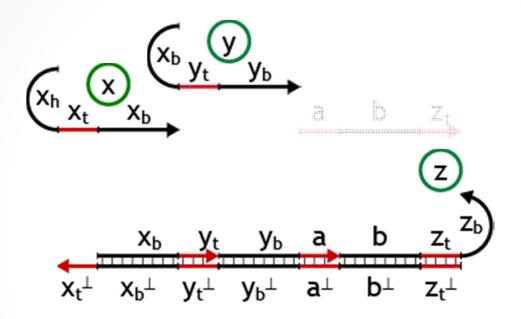


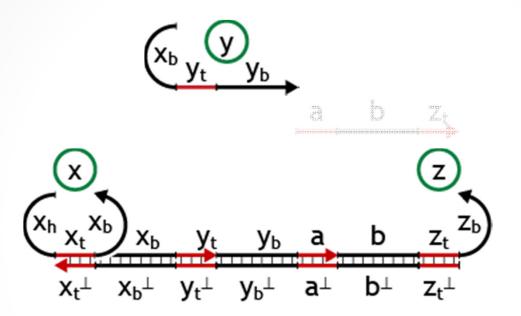


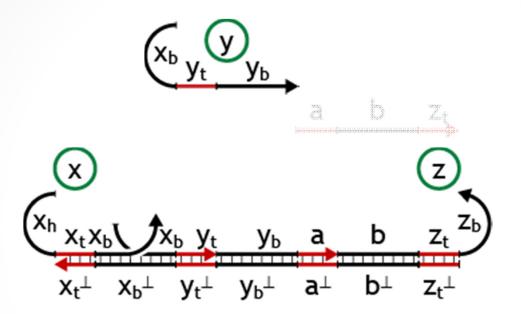


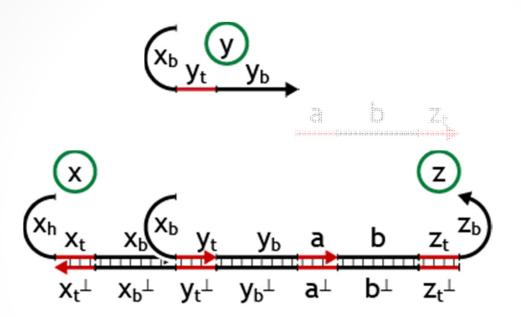


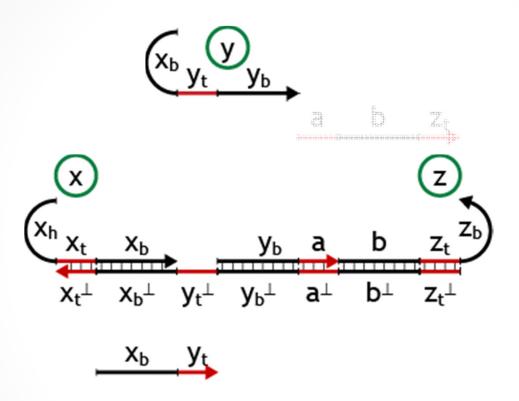


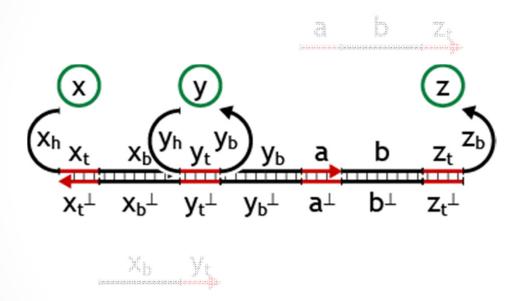


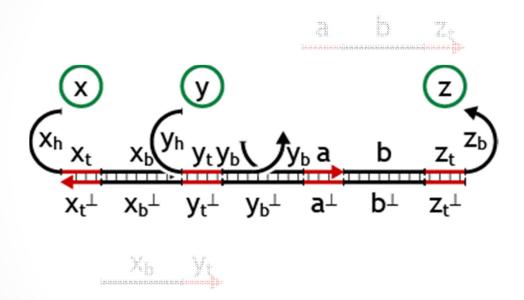


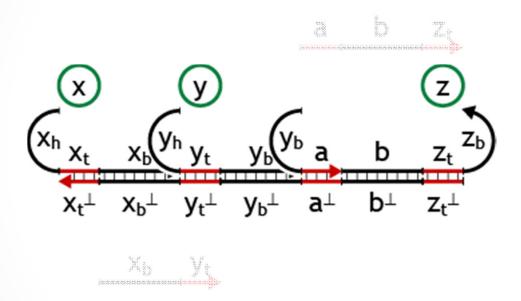


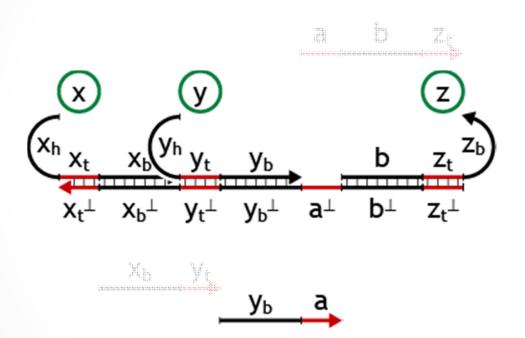


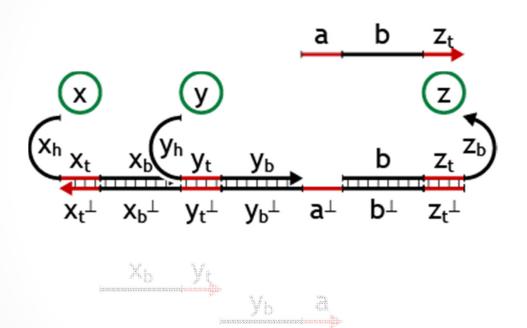


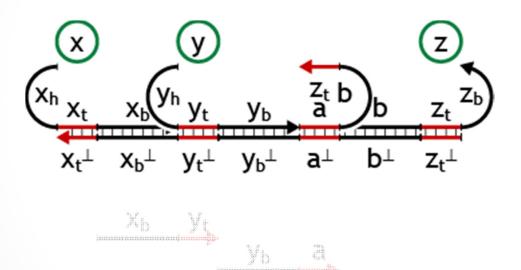


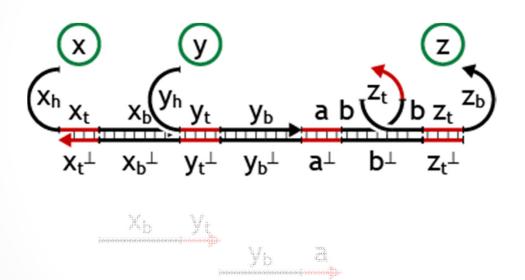


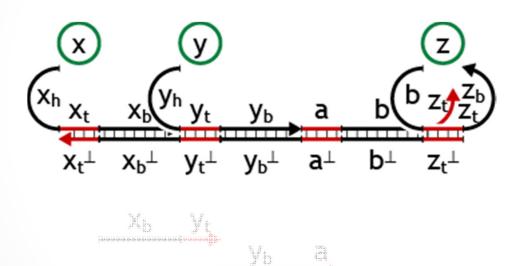


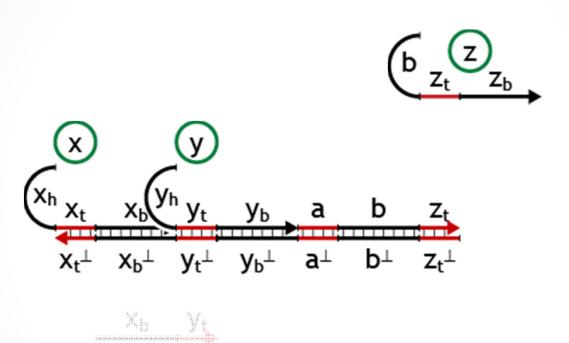


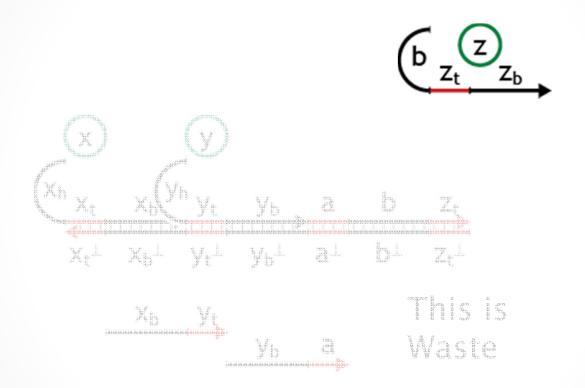




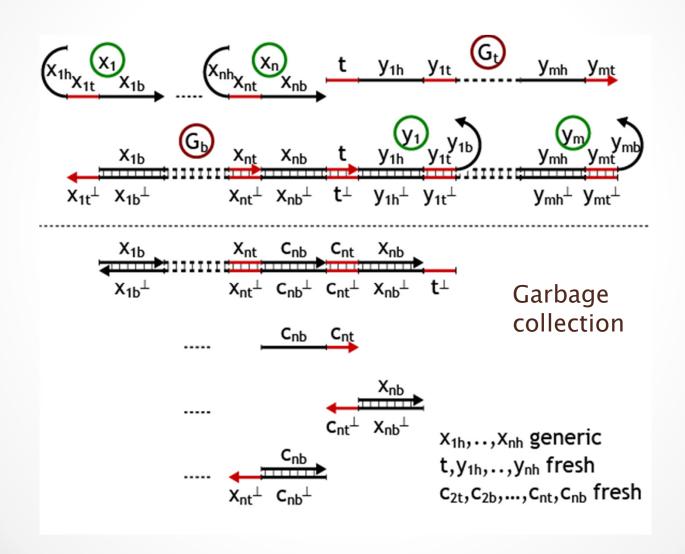








#### General n-Join/m-Fork Gate



## Gate Design Verification

#### Active garbage

- The active join residuals slow down the performance of following joins.
- $\circ$   $\rightarrow$  Add a garbage collector to remove the active residuals.

#### Interference between gates

- The join garbage collector interferes with the fork gate.
- $\circ$   $\rightarrow$  Modify the fork gate to remove the interference.

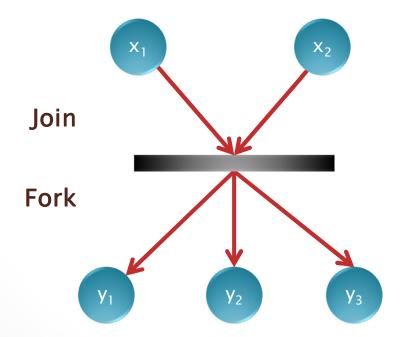
#### What else could go wrong?

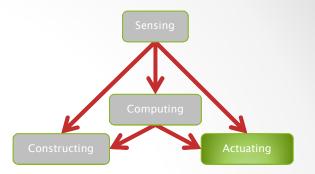
- Endless possibilities.
- → Prove that the fork/join gate structures correctly implement fork/join in all larger circuits.

#### Strand Algebra

$$x_1 \mid ... \mid x_n \mid [x_1,...,x_n].[y_1,...,y_m] \rightarrow y_1 \mid ... \mid y_m$$

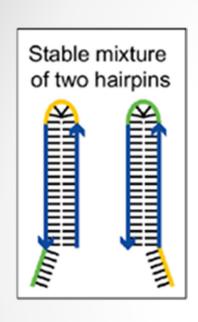
Join + Fork + Populations = (Stochastic) Petri Nets

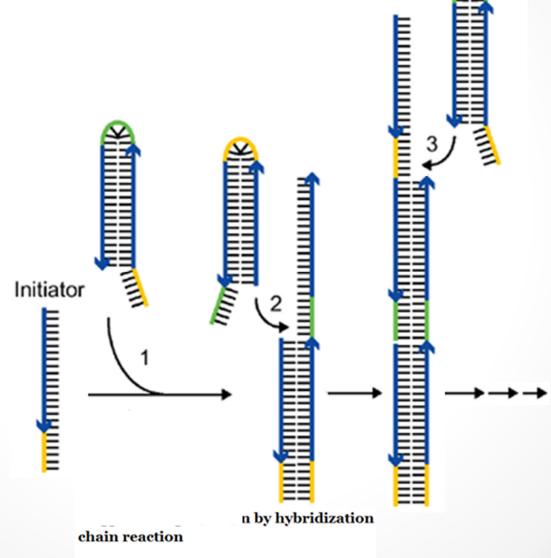




## Actuating

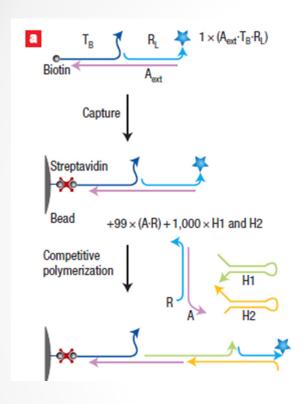
## Hybridization Chain Reaction





Robert M. Dirks† and Niles A. Pierce‡,§

#### Polymerization Motor

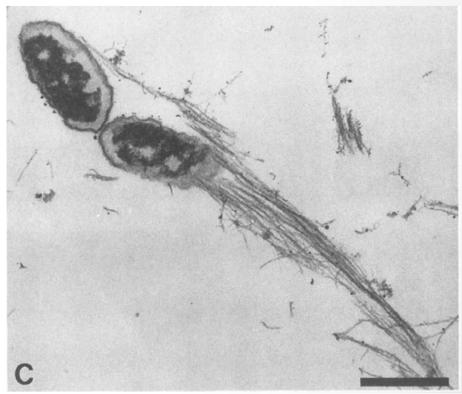


An autonomous polymerization motor powered by DNA hybridization

SUVIR VENKATARAMAN¹, ROBERT M. DIRKS¹, PAUL W. K. ROTHEMUND²³, ERIK WINFREE²³ AND NILES A. PIERCE¹. $^{4*}$ 

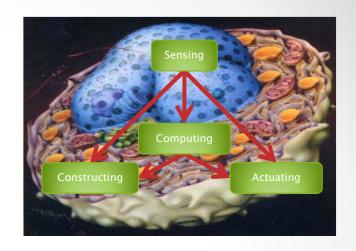
Rickettsia (spotted fever)





Directional Actin Polymerization Associated with Spotted Fever Group Rickettsia Infection of Vero Cells

ROBERT A. HEINZEN, STANLEY F. HAYES, MARIUS G. PEACOCK, AND TED HACKSTADT\*



## Curing

#### A Doctor in Each Cell

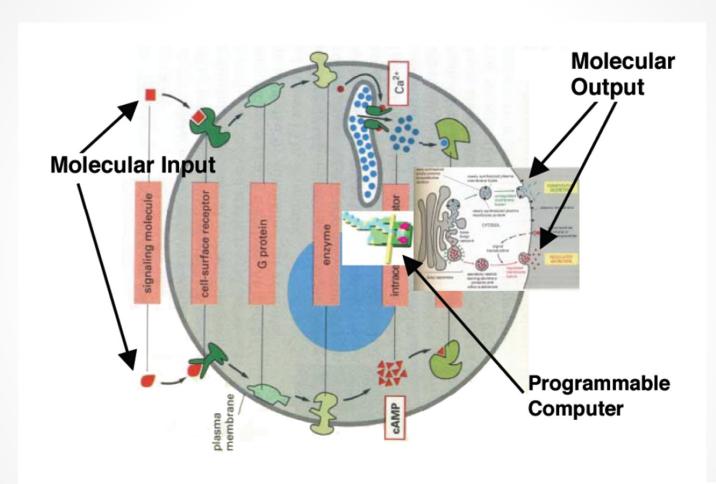


Fig. 1 Medicine in 2050: "Doctor in a Cell"

| Rivka Adar       |
|------------------|
| Kobi Benenson    |
| Gregory Linshitz |
| Aviv Regev       |
| William Silverma |

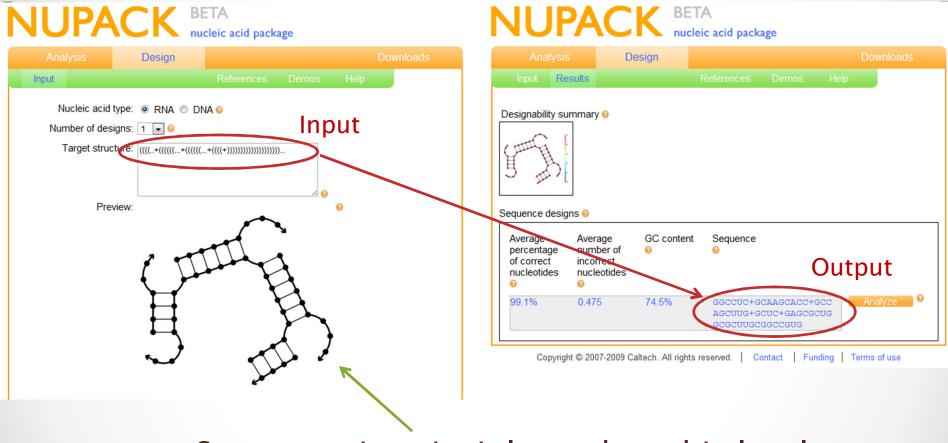
**Ehud Shapiro** 

Molecules and computation

Tools



## Sequence Design



So we can in principle work at this level.

# Visual DSD A Strand Displacement Simulator

Matthew Lakin, Simon Youssef, Andrew Phillips

http://lepton.research.microsoft.com/webdna/

#### Syntax







 $\begin{array}{c} J.~R.~Soc.~Interface\\ {\rm doi:}10.1098/{\rm rsif.}2009.0072.focus\\ Published~online \end{array}$ 

#### A programming language for composable DNA circuits

Andrew Phillips\* and Luca Cardelli

#### A. Syntax of DNA molecules D

Upper strand with sequence complementary to S

s

<s>

Molecule with segments G<sub>1</sub>,...,G<sub>K</sub>

G<sub>1</sub> G<sub>2</sub> ... G<sub>K</sub>

G1:G2:...:GK

Parallel molecules D<sub>1</sub>,...,D<sub>K</sub>

 $D_1$   $D_2$  ...  $D_K$ 

D1 | D2 | ... | DK

Molecules D with private domains N<sub>1</sub>,...,N<sub>K</sub>

(N<sub>1</sub>,...,N<sub>K</sub>)

new (N1,...,NK) D

#### B. Syntax of DNA segments G

Lower strand with toehold No

N°

N^c

Double strand with sequence S and overhangs L, R



<L>[S]<R>

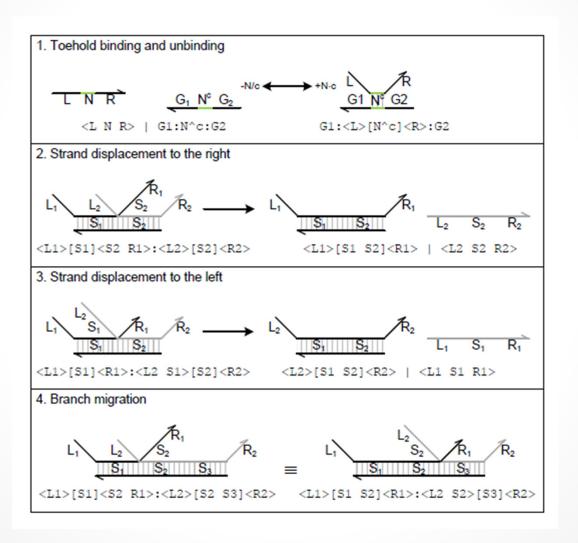
#### C. Syntax of DNA sequences S,L,R

Sequence of domains O1,...,OK

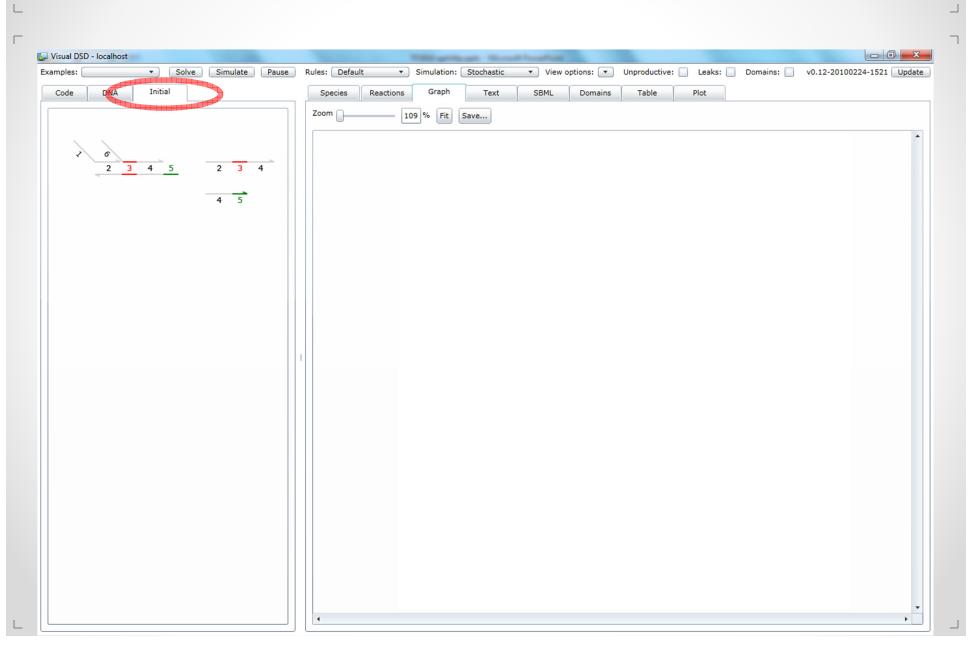
 $O_1$   $O_2$  ...  $O_K$ 

01 02 ... OK

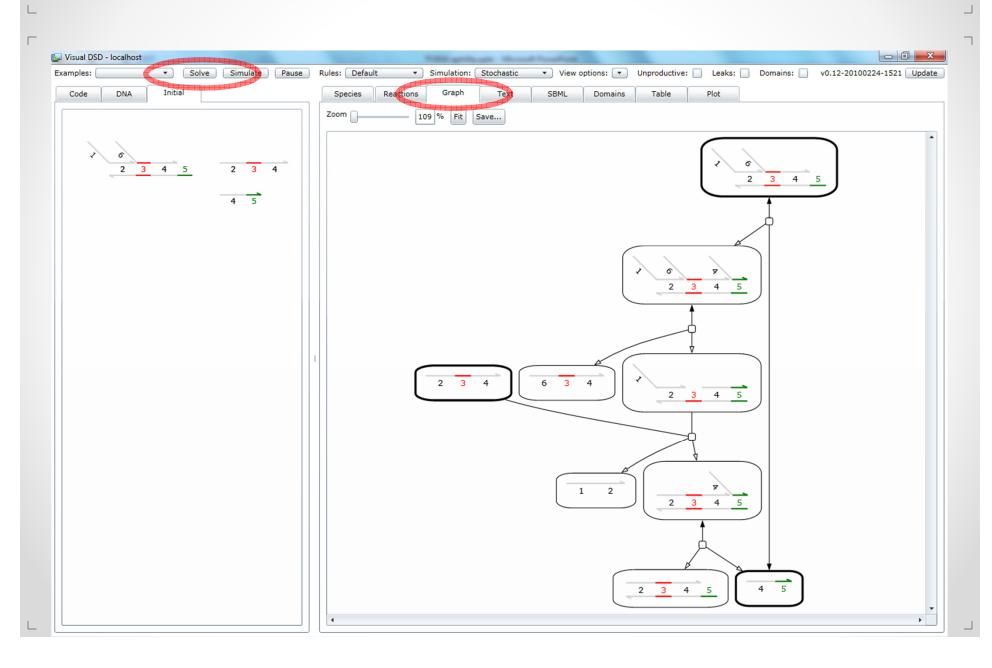
#### **Dynamics**



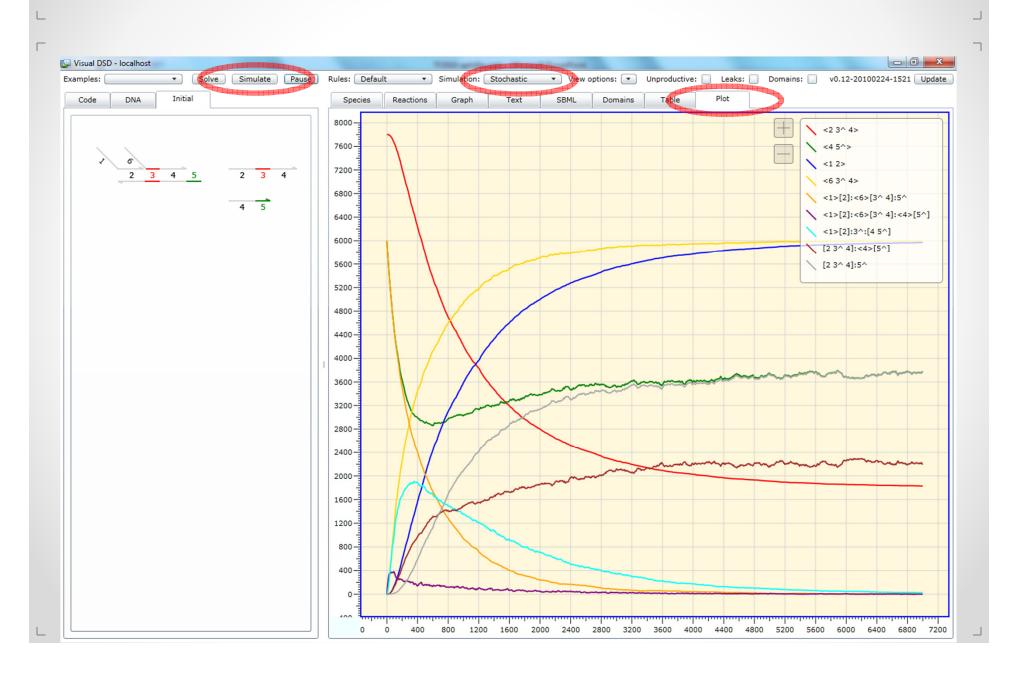
## Initial Species



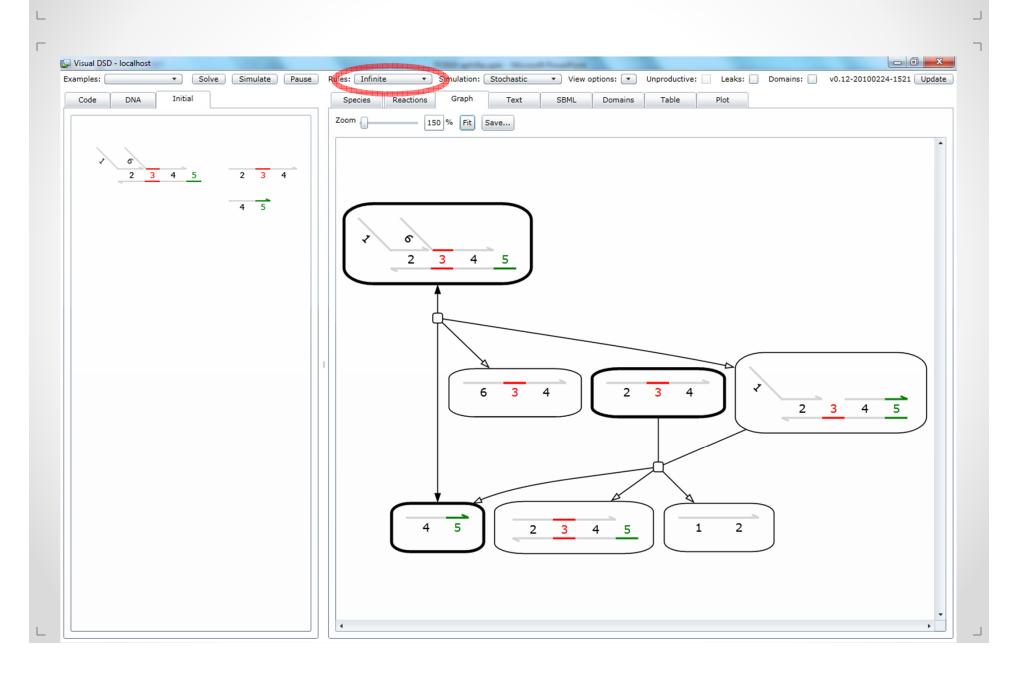
## Reaction Graph



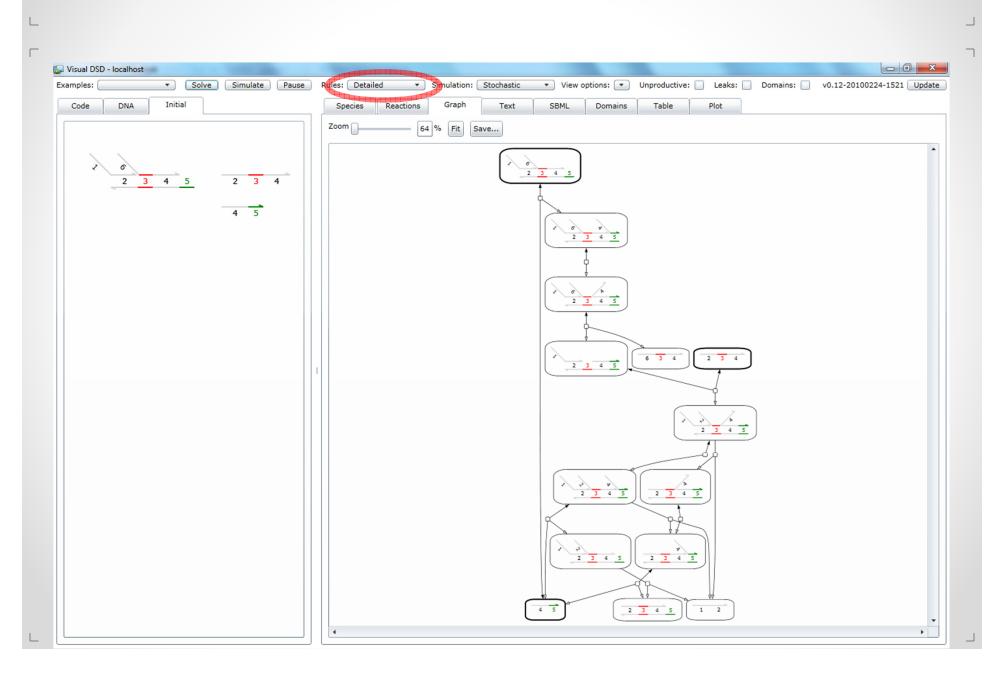
#### Simulation



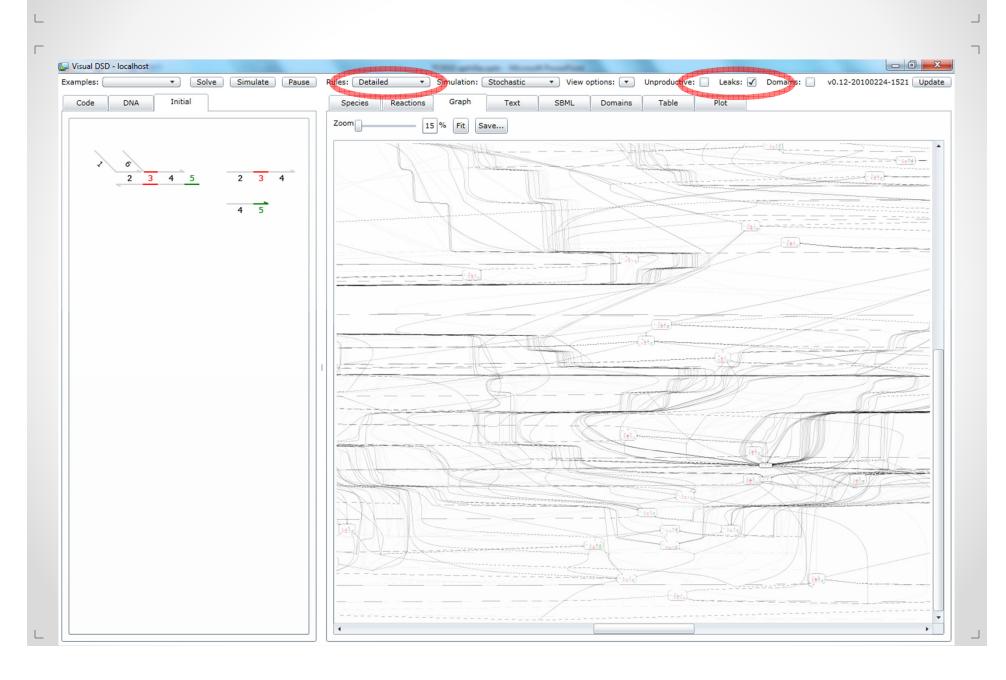
#### **Abstract Reactions**



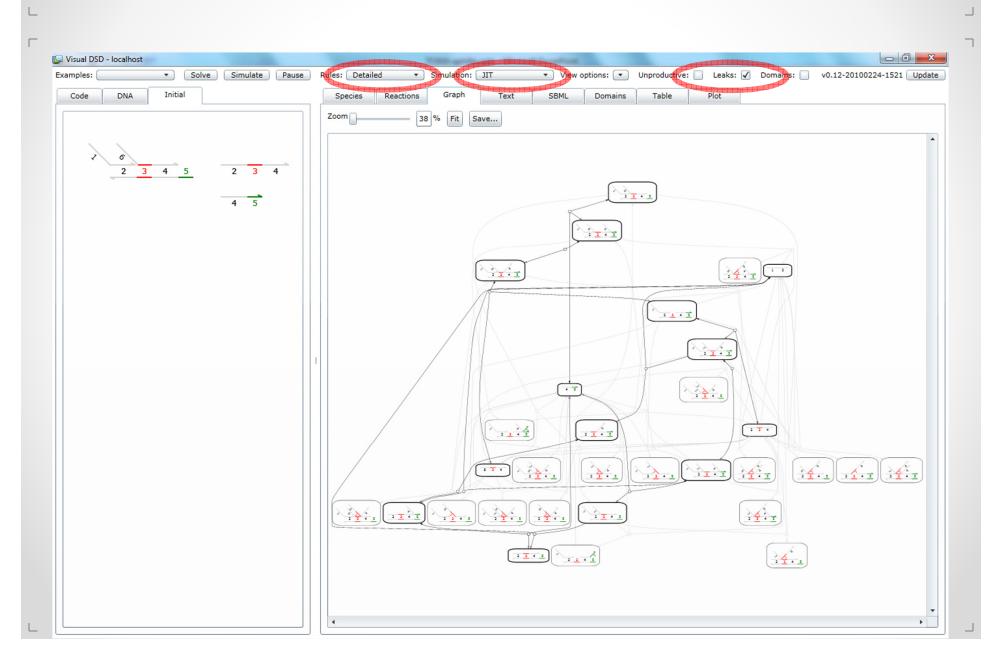
#### **Detailed Reactions**



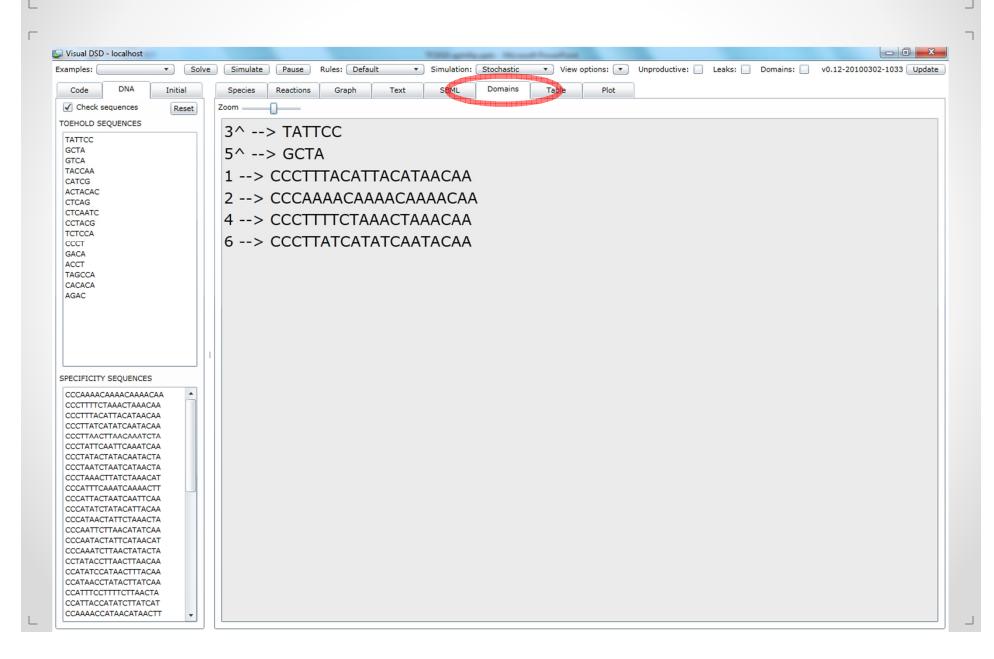
#### Detailed Leak Reactions!



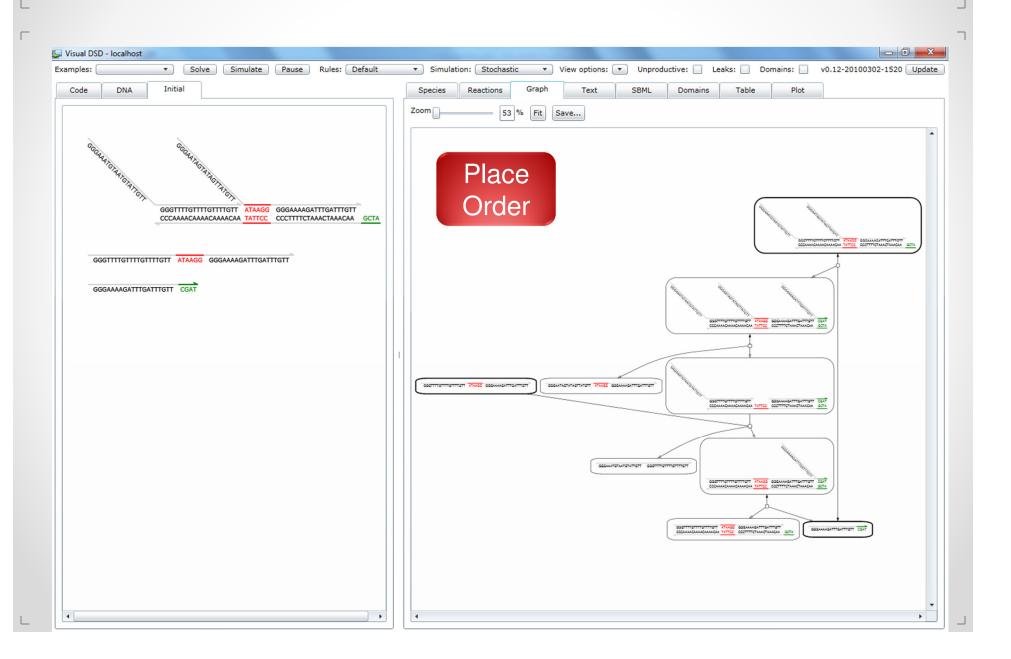
#### Just-in-Time Simulation



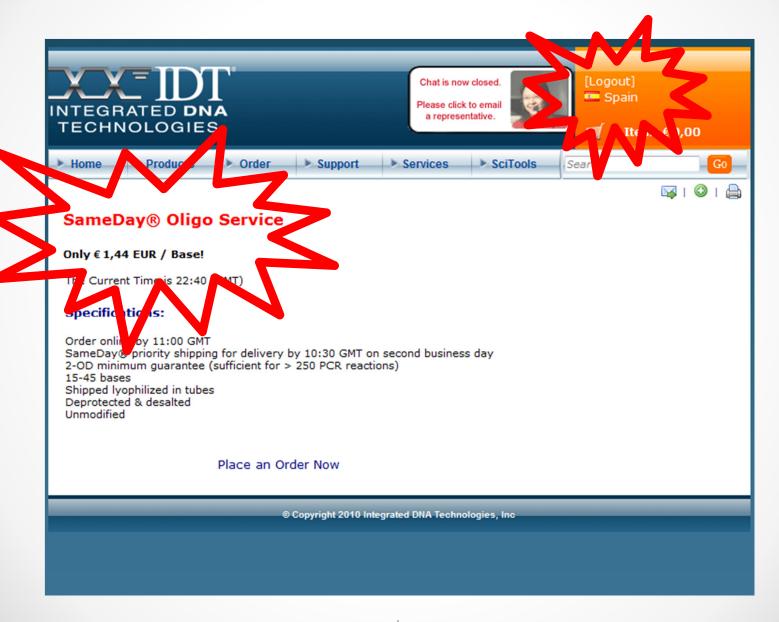
#### **DNA Sequences**



#### Final DNA Circuit



#### Next-Day Oligos!



#### Place Order NOW!



## DNA by Mail



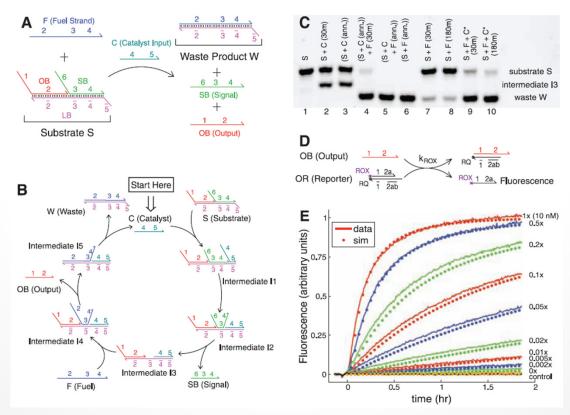
#### It runs!

(Nothing to do with us.)

#### Engineering Entropy-Driven Reactions and Networks Catalyzed by DNA

David Yu Zhang, et al. Science **318**, 1121 (2007);

DOI: 10.1126/science.1148532

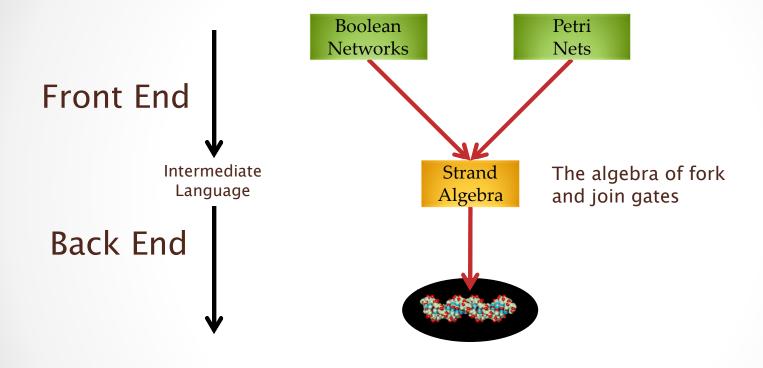


## DNA Compilation

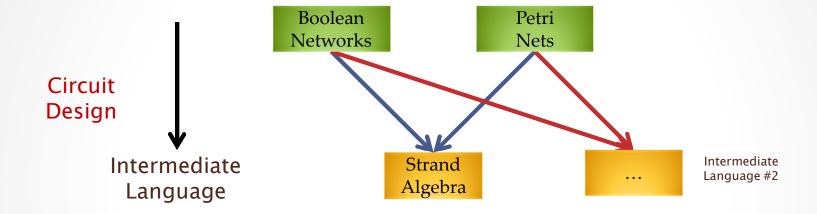
## Compilers

Language Language Language Design #1 Design #2 Design #3 Boolean Petri Networks Nets Monolithic Language Language Language Implementation #1 Implementation #2 Implementation #3 Compilers

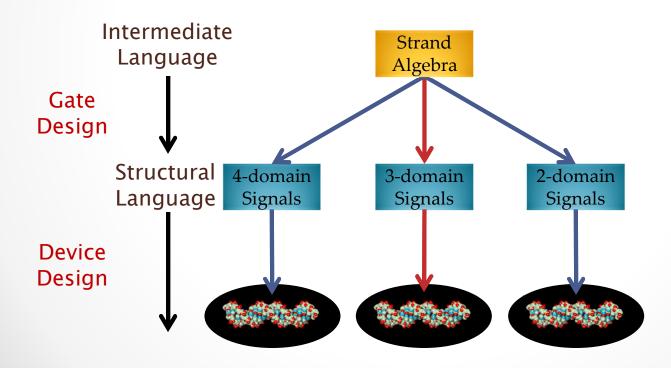
#### Intermediate Languages



#### Front Ends



#### **Back Ends**



## Strand Algebra

## Strand Algebra

n x m gates

 $[x_1,...,x_n].[y_1,...,y_m]$  is a *signal* is a *gate* 

0 is an *inert solution* 

P|P is *parallel composition* of signals and gates

P\* is a *population* (multiset) of signals and gates

Reaction Rule

$$x_1 \mid ... \mid x_n \mid [x_1,...,x_n].[y_1,...,y_m] \rightarrow y_1 \mid ... \mid y_m$$

Auxiliary rules (axioms of diluted well-mixed solutions)

$$P \rightarrow P' \Rightarrow P \mid P'' \rightarrow P' \mid P''$$
 Dilution  $P \equiv P_1, P_1 \rightarrow P_2, P_2 \equiv P' \Rightarrow P \rightarrow P'$  Well Mixing

Where  $\equiv$  is a congruence relation (syntactical 'chemical mixing') with  $P^* \equiv P \mid P^*$  for unbounded populations.

#### Compiling Strand Algebra to DNA

$$P ::= x : [x_1,...,x_n].[y_1,...,y_m] : 0 : P|P : P*  $n \ge 1, m \ge 0$$$

t y<sub>1h</sub> y<sub>1t</sub> G<sub>t</sub> y<sub>mh</sub> y<sub>mt</sub>

- compile(x) =  $(x_h x_t \otimes_{x_h} x_t)$
- compile( $[x_1,...,x_n]$ . $[y_1,...,y_m]$ ) =  $x_{1b}$   $x_{nt}$   $x_{nb}$   $x_{nt}$   $x_{nb}$   $x_{nb}$  x

- compile(0) = empty solution
- compile(P | P') = mix(compile(P), compile(P'))
- compile(P\*) = population(compile(P))

#### More in the DNA15 Paper

- Stochastic strand algebra
  - Matches the stochastic semantics of interacting automata
  - Uses a technique for implementing constant buffered populations, to replace P\* with finite populations
- Nested strand algebra
  - An higher-level language (with nested expressions)
  - A compilation algorithm into the basic strand algebra

# Compiling Abstract Machines

• • •

### Boolean Networks

#### Boolean Networks to Strand Algebra

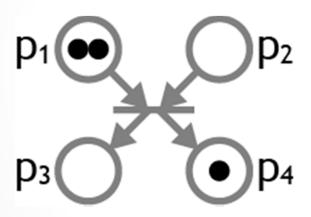
This encoding is *compositional*, and can encode *any* Boolean network:

- multi-stage networks can be assembled (combinatorial logic)
- network loops are allowed (sequential logic)

### Petri Nets

Petri Nets to Strand Algebra

Transitions as Gates
Place markings as Signals



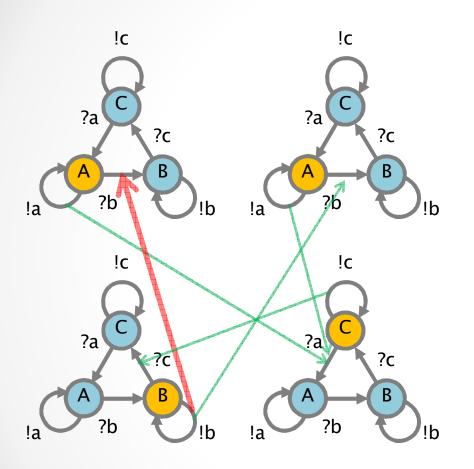
$$([p_1,p_2].[p_3,p_4])^*|$$
  
 $p_1|p_1|p_4$ 

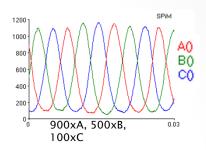
## **Chemical Reaction Networks**

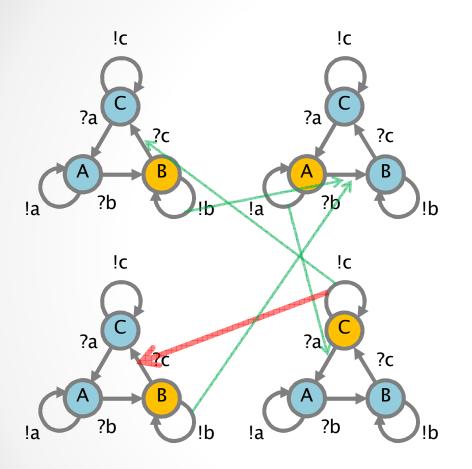
Implementing an arbitrary finite chemical system in DNA with asymptotically correct kinetics Soloveichick & al. DNA 15

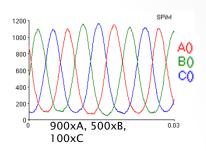
Species become signals Reactions become gates

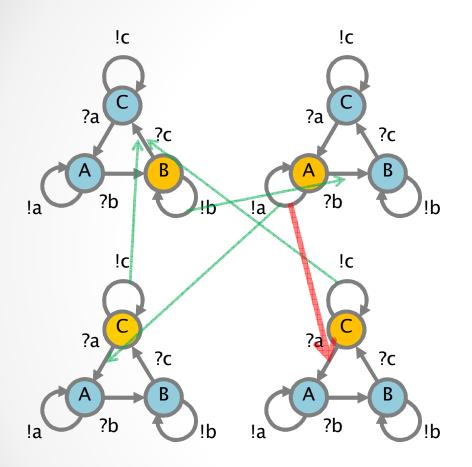
$$A + B \rightarrow C + D \Rightarrow$$

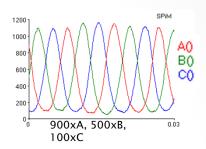


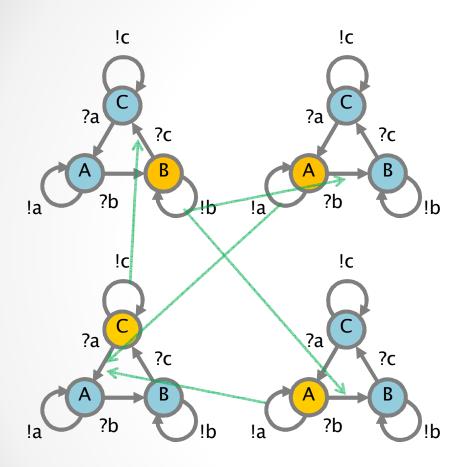


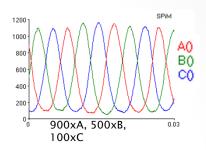












And finally...

## Summary

- Abstract Machines to Strand Algebra
  - o Or other intermediate language
- Strand Algebra to DSD
  - o Or other structural language
- Simulation, analysis, etc.
  - o Iterate a lot
- DSD to Sequences
  - E.g. NuPack, or pre-build strand libraries
- Sequences to DNA
  - Web order
- DNA experiments
  - Fairly basic wet lab
- Deployable Nanotech

### Conclusions

#### Nucleic Acids

Programmable matter

### DNA Strand Displacement

A computational mechanism at the molecular level

### DNA as a Compilation Target for Abstract Machines

- Abstract Machines (Boolean Networks, Petri Nets, Interacting Automata)
- o Intermediate languages (Strand Algebra, Strand Displacement Language).
- DNA sequence generation.

#### Tools

- Thermodynamic analysis.
- Reaction graph generation.
- Simulation.
- Verification (not yet).

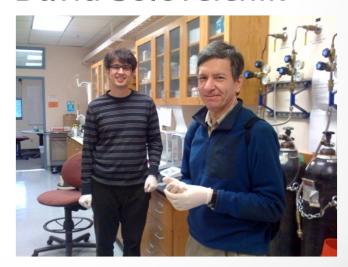
# Acknowledgments



#### Illustrations

- o John Reif, Duke
- Ned Seeman, NYU
- o Erik Winfree, Caltech
- o Bernard Yurke, Boise State
- Wikipedia
- YouTube

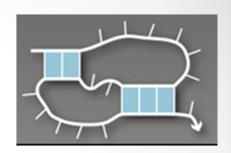
#### David Soloveichik



### The Molecular Programming Project

#### Caltech & U.Washington

- National Science Foundation's Expeditions in Computing
- Shuki Brooks, Erik Klavins, Richard Murray, Niles Pierce, Paul Rothemund, Erik Winfree.



#### Goals

- Create a functional abstraction hierarchy and use this hierarchy to construct programming languages and compilers.
- Create a theoretical framework for the analysis and design of molecular programs, one that serves as the underpinning for an actual practice of molecular programming.
- Validate our compilers and theoretical framework with experimental systems utilizing molecular programs with 10 to 100 times the number of components currently used.
- Test our molecular programming technologies on real-world applications.
- Recruit and train a generation of molecular programmers with the insight and skills necessary to conceive, design, and implement complex molecular systems.