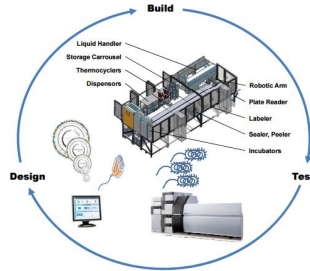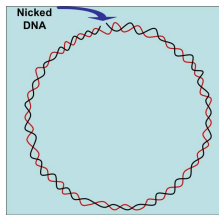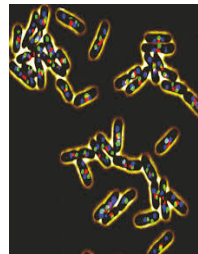# Technical summary: University of Illinois, Texas, Minnesota
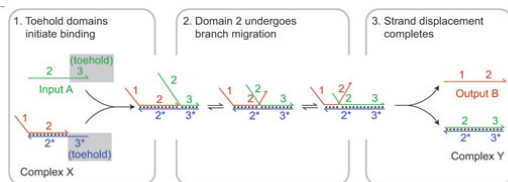
Period of Performance: [January 1st, 2018 – Janury 1st, 2021]

Native (naturally occurring) DNA

Positional encoding via DNA nicking

Process Automation

Nick-displacement based computing

Key innovations:

1) Novel encoding via positional information and native DNA strand nicking;
2) Novel error-control mechanisms for nick readouts;
3) Simple random access strategies;
4) Novel parallel, selective nicking strategies;
5) Register-based data formating/organization;
6) Novel nick displacement computing paradigm;
7) Implementation of counters and comparison units for in-memory computations.
8) Potential implementation of in-memory computation following Minsky's Register Machine.
9) Seamless integration of storage and computing.

- High cost of synthesis calls for new information encoding methods. Propose to encode information by nicking native DNA at positions specified by integer-encoded user information. Goal is to significantly reduce system implementation cost.

- Nicked DNA may be used in a new computational paradigm, termed nick displacement, to implement counters and comparison units. Goal is to integrate storage and computing paradigms via nick information and perform in-memory computations.

Existing methods are exclusively built around synthetic DNA encoding information in the symbol values. They do not involve computational features.

Specialized reading and computing strategies via nicking of native DNA. Sequencing and decoding for positional information.
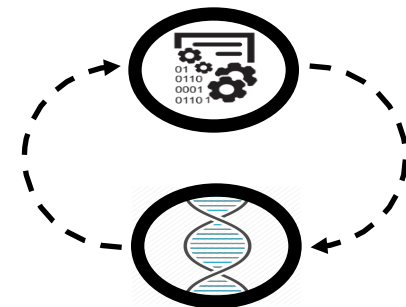
Specialized encoding for digital data into naturally occurring DNA. New computational paradigms based on positional encoding.

The Team

Alvaro Hernandez, co-PI, University of Illinois

Expertise: DNA sequencing.

Olgica Milenkovic, PI, University of Illinois

Expertise: Error-control and constraint coding for modern storage devices.

Marc Riedel, co-PI, University of Minnesota

Expertise: DNA computing, in memory computing.

David Soloveichik, co-PI, University of Texas, Austin

Expertise: DNA computing, molecular programming.

Huimin Zhao, co-PI, University of Illinois

Expertise: Chemistry, synthetic biology.

Start of the Art

Definition of SOA?

Conceptual simplicity?

Church et al, 2012
Goldman et al, 2013

Largest density?

Fountains: Erlich et al, 2017; Yazdi et al, 2017 (UIUC team)
Microsoft Research, 2016
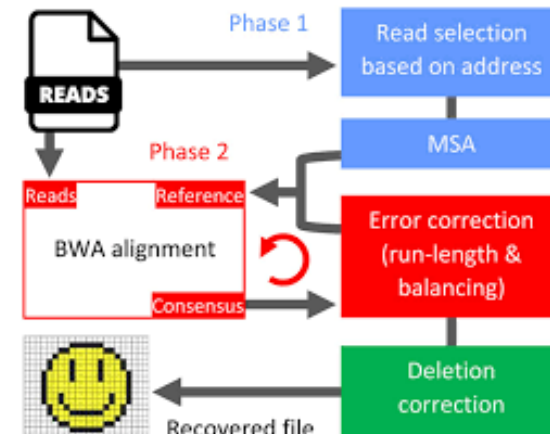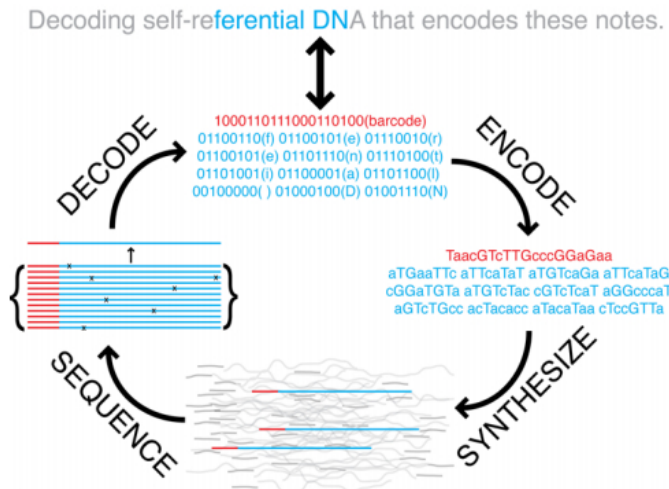
>215PB/g, file sizes >2MB

Access and rewriting, functional capabilities?

First PCR-based random access architecture
First portable architecture
Yazdi et al, 2017 (UIUC team)

Smallest cost per base?   ???

Decoding self-referential DNA that encodes these notes.

DECODE
1000110111000110100(barcode)
01100110(f) 01100101(e) 01110010(r)
01100101(e) 01101110(n) 01110100(t)
01101001(i) 01100001(a) 01101100(l)
00100000( ) 01000100(D) 01001110(N)

ENCODE

TaacGTcTTGcccGGaGaa
aTGaaTTc aTTcaTaT aTGTcaGa aTTcaTaG
cGGaTGTa aTGTcTac cGTcTcaT aGGcccaT
aGTcTGcc acTacacc aTacaTaa cTccGTTa

SEQUENCE

SYNTHESIZE

Phase 1
READS → Read selection based on address
MSA
Phase 2
Reads | Reference
BWA alignment
Consensus
Error correction (run-length & balancing)
Deletion correction
Recovered file

Start of the Art

DNA data blocklengths: 100-1000bps

Costs?

| Company	Length (bp)	#Oligos	Concentration	Price (USD)
CustomArray	10-79	92,918	1 fmol	$4,000
Twist Bioscience	1-120	600,000	0.25 fmol	$59,160
ThermoFisher	5-40	24	25 nmol	$5.2
Operon	20	96	4 nmol	$115
IDT	20	1	25 nmol	$7.4

In house synthesizers (BioLytics, BioXP): ~20bps

Beyond the Start of the Art

Native DNA based storage: Bringing down the cost and in memory computing!

Our proposed methodology: "Teaching a new dog an old trick."
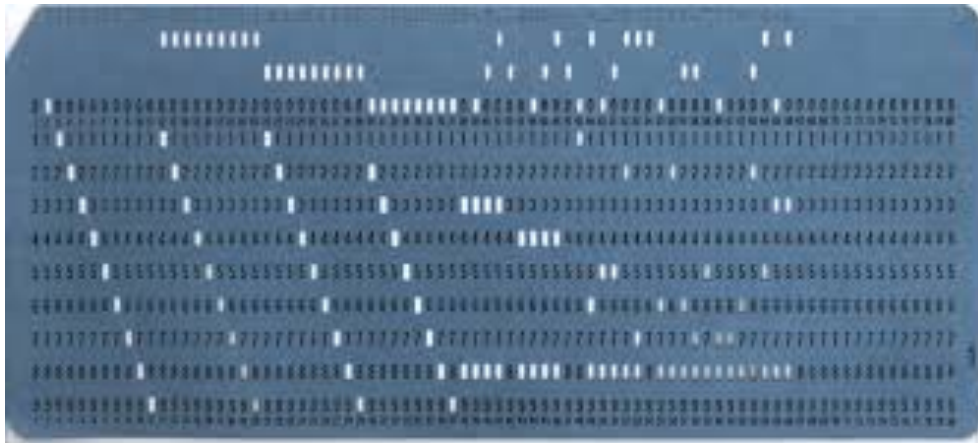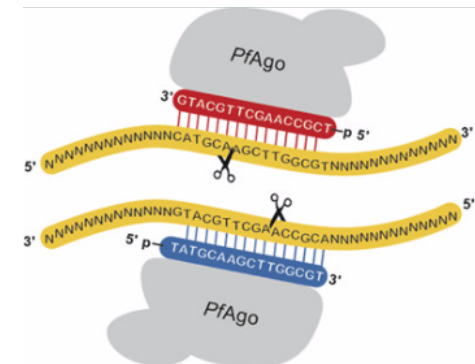
50nmols, oligolength ~20: >200,000 "punches" (bits), cost < 10 cents

Beyond the State of the Art

Why Does this Work?

1. Need to synthesize only one primer in sufficiently large concentration to introduce many nicks at same position in different registers.

2. Each nick encodes log(3) bits, expected number of nicks 200,000.

3. Short oligos (primers) also used needed for computing, may hence be used for nicking (storage), addressing (random access) and computing (nick displacement).

4. Why not store information in short ~20bps length oligos directly?

   - Problem: How does one store the primer orders?
   - mlog(m) bits needed to store order of m items.
   - Think of native strand serving as template for the order.

Risks

Challenges and risks:

1. Parallelization and scalability?
    *   Recording time depends on number of edits that may be performed in parallel.
    *   Multiple "data registers" needed – system maintenance challenges.

2. Readout architectures?
    *   Immunoprecipitation-based and nanopore nick detection methods may be of insufficient accuracy.

3. Integration with displacement computing paradigms?
    *   Precision of displacement strategies and computational delays.

Status and Outlook

Current Status/Timeline:

No adjustments made. Additional testing to be performed using nanopore sequencers.

Looking Forward/Next 6 months:

Goal 1: Data encoding, positional conversion, error-correction.
Goal 2: Native DNA sample preparation, replication, register organization.
Goal 2: Parallel register and positional DNA nicking experiments.
Goal 3. Mathematical modeling of DNA nicking-based computational paradigms.
Goal 4. Initial development of readout systems.

• Phase I Goals: Practical implementation of small scale storage architecture, theoretical development of in memory computational component.

Risks

Current and future strategies for risk mitigation:

1. Parallelization and scalability?

    - Replace and/or combine *PfAgo* editing with CRISPR technologies.
    - Combine nicking with other writing techniques such as chimeric synthesis.
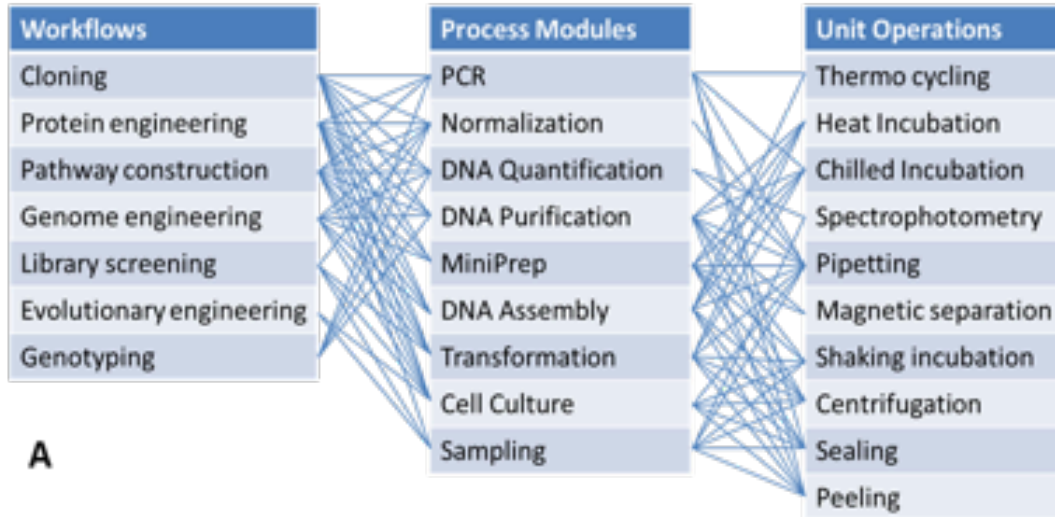
2. Readout architectures?

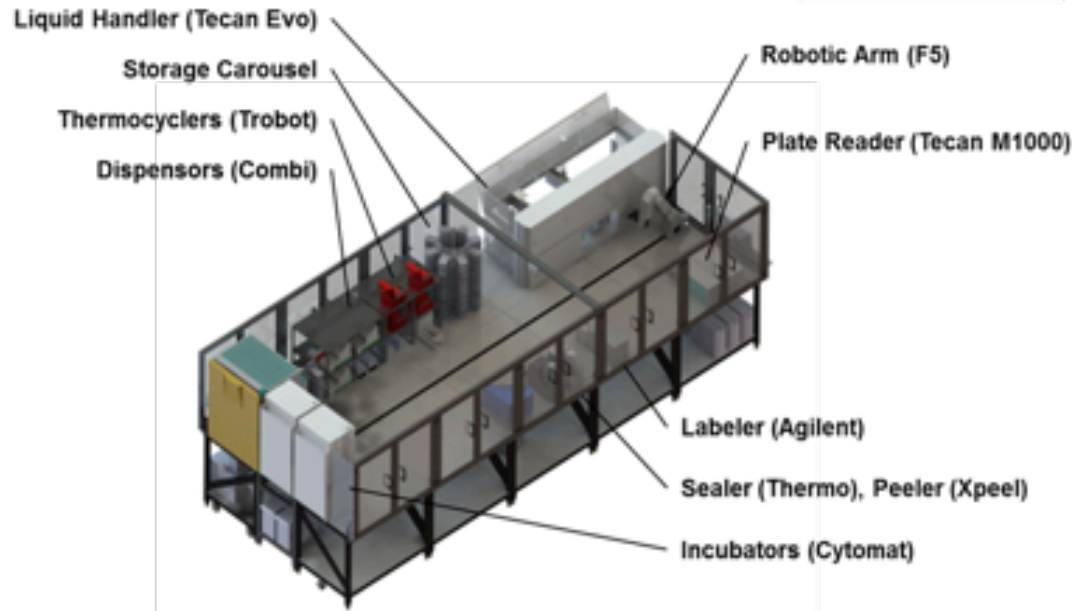- Molecular simulations to predict technical obstacles in nanopore sequencing methods.

3. Integration with computing paradigms?

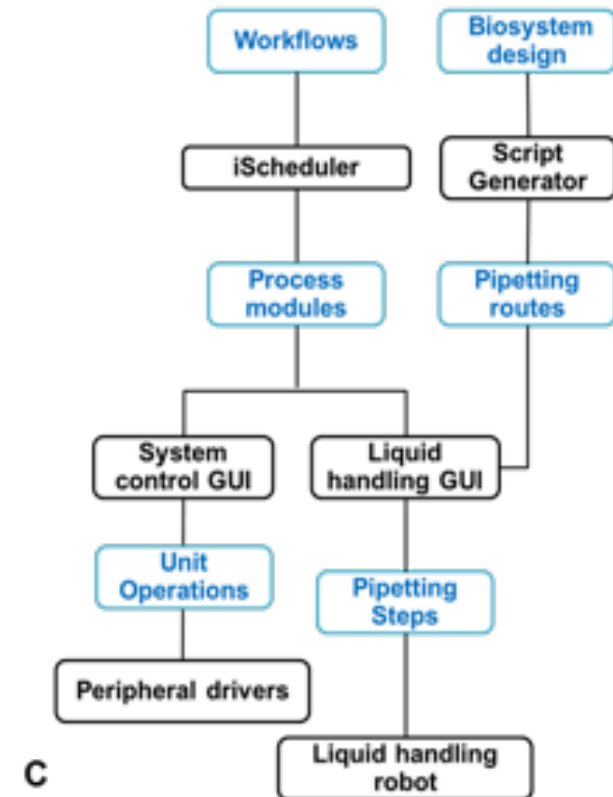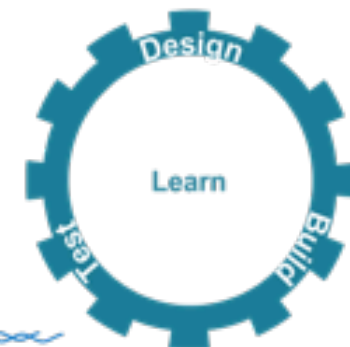- Difficult to judge. In needed, restricted to counting and comparison.
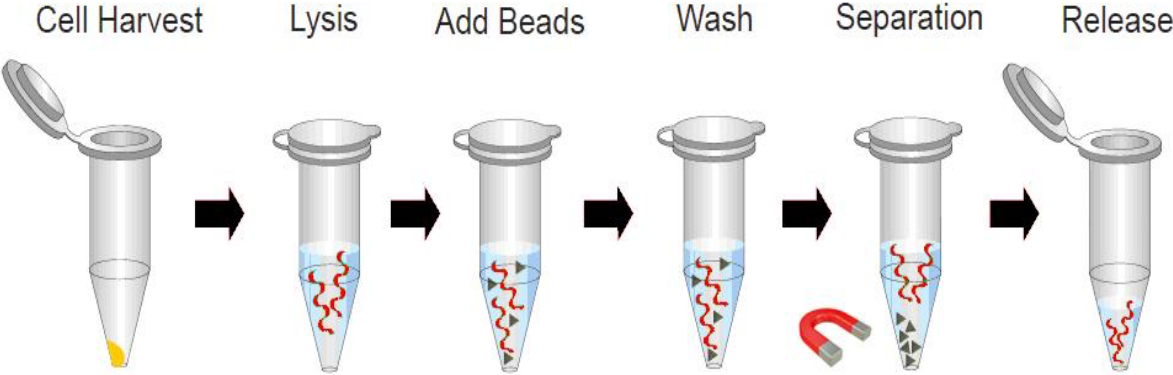
Lab Facilities

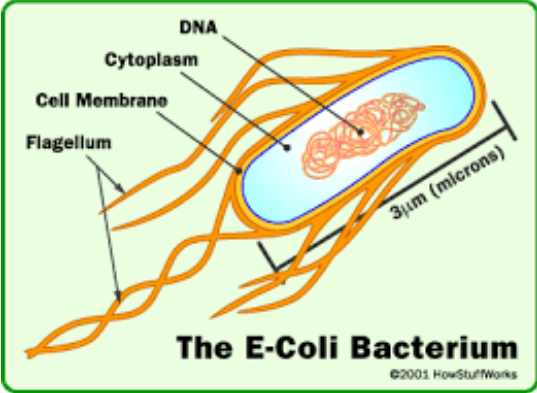

A

Workflows	Process Modules	Unit Operations
Cloning	PCR	Thermo cycling
Protein engineering	Normalization	Heat Incubation
Pathway construction	DNA Quantification	Chilled Incubation
Genome engineering	DNA Purification	Spectrophotometry
Library screening	MiniPrep	Pipetting
Evolutionary engineering	DNA Assembly	Magnetic separation
Genotyping	Transformation	Shaking incubation
	Cell Culture	Centrifugation
	Sampling	Sealing
		Peeling

B

Liquid Handler (Tecan Evo)
Storage Carousel
Thermocyclers (Trobot)
Dispensors (Combi)
Robotic Arm (F5)
Plate Reader (Tecan M1000)
Labeler (Agilent)
Sealer (Thermo), Peeler (Xpeel)
Incubators (Cytomat)

http://youtu.be/Hwb735qZ-IQ

C

Workflows — iScheduler — Process modules — System control GUI / Liquid handling GUI — Unit Operations — Peripheral drivers — Pipetting Steps — Liquid handling robot

Biosystem design — Script Generator — Pipetting routes

Design · Build · Test · Learn

10

The Project: Native DNA-Based Data Storage

The storage medium: E. coli K-12

Addressable registers

Yazdi et al, 2015, 2017

The Project: Native DNA-Based Data Storage

Why E. coli K-12?

Length of each substring	# unique substrings	$\log_4$(# unique substrings)
1	4	1.0000
2	16	2.0000
3	64	3.0000
4	256	4.0000
5	1,024	5.0000
6	4,096	6.0000
7	16,383	7.0000
8	65,360	7.9981
9	256,527	8.9844
10	898,115	9.8883
11	2,196,861	10.5335
12	3,478,960	10.8651
13	4,170,362	10.9959
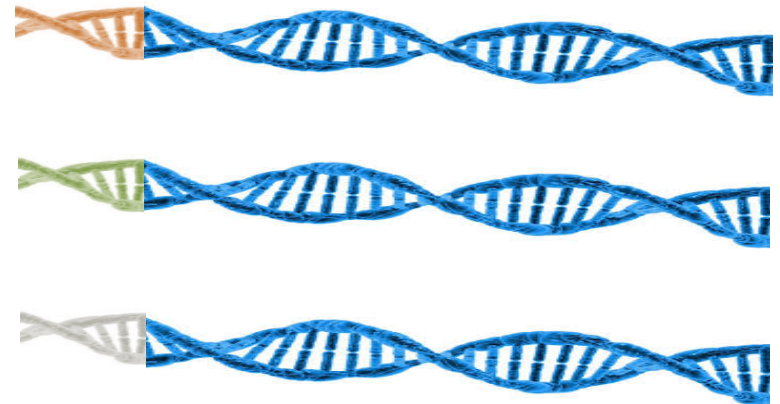
Genome: U00096.3 Escherichia coli str. K-12 substr. MG1655, complete genome

Length in bp: 4,641,652

Organism name	Length	M	m
Streptomyces coelicolor A3(2) (high GC Gram+)	9,054,847	5	2,621
Myxococcus xanthus DK 1622 (d-proteobacteria)	9,139,763	6	2,817
Nostoc punctiforme PCC 73102 (cyanobacteria)	9,059,191	5	5,569

The Project: Native DNA-Based Data Storage

Data Encoding

Ternary coding: Do not nick (0), nick sense (1), nick antisense (3)

Nicking window: 10-20 bps

Set encoding: Convert binary string into positions of nicks. Allows for efficient error correction (Lex and Grey order).

123 (0)	00000	00000	124 (1)	00001	00001	125 (2)	00010	00011	126 (3)	00011	00010
127 (4)	00100	00110	134 (5)	00101	00100	135 (6)	00110	00101	136 (7)	00111	00111
137 (8)	01000	01111	145 (9)	01001	01110	146 (10)	01010	01100	147 (11)	01011	01101
156 (12)	01100	01001	157 (13)	01101	01011	167 (14)	01110	01010	234 (15)	01111	01000
235 (16)	10000	11000	236 (17)	10001	11001	237 (18)	10010	11011	245 (19)	10011	11010
246 (20)	10100	11110	247 (21)	10101	11100	256 (22)	10110	11101	257 (23)	10111	11111
267 (24)	11000	10111	345 (25)	11001	10110	346 (26)	11010	10100	347 (27)	11011	10101
356 (28)	11100	10001	357 (29)	11101	10011	367 (30)	11110	10010	456 (31)	11111	10000

The Project: Native DNA-Based Data Storage

Data Encoding

Set encoding: Convert binary string into sets of positions of nicks.
Error-control through controlled set intersection.
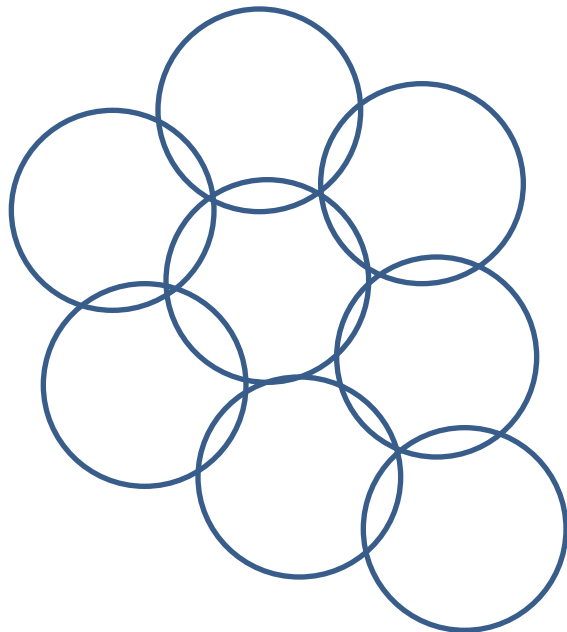
L-intersecting family of sets
(Babai & Frankl, Erdos-Ko-Rado type theorems)

L={1,2,..,s}, s << n

Bad pairs: Good pairs:
{1,3,5,12,46,…}   {1,3,5,12,46,…}
{1,3,6,13,46,...} …}   {2,7,9,17,33,…}

Can handle: deletions, insertion, transposition errors (Gabry et al, 2017)

The Project: Native DNA-Based Data Storage

DNA Nicking

PfAgo: An Ago protein from hyperthermophilic archaea *Pyrococcus furiosus*, is uses DNA as guide and cleave ssDNA target at temperatures up to 100 °C.
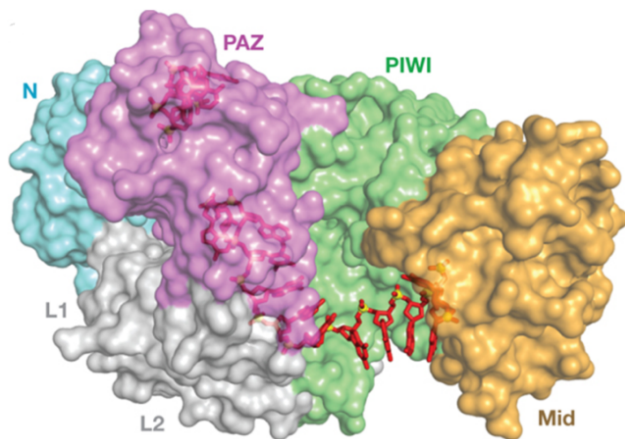
Cleavage of ssDNA target using ssDNA guide for *PfAgo*
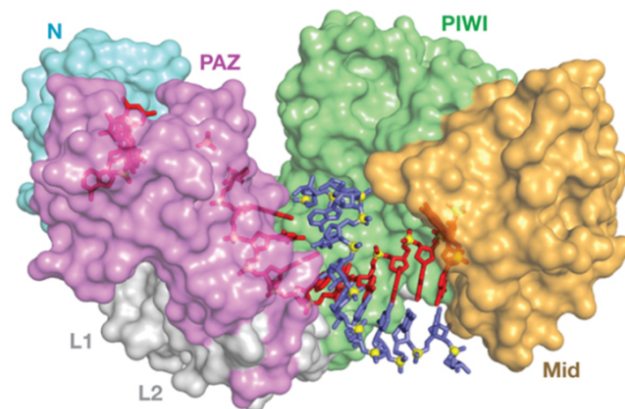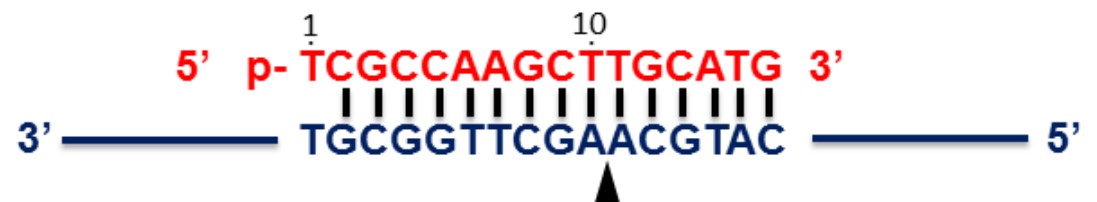
Swarts et al. *Nature* (2014)

The Project: Native DNA-Based Data Storage

Programmable DNA-guided artificial restriction enzymes
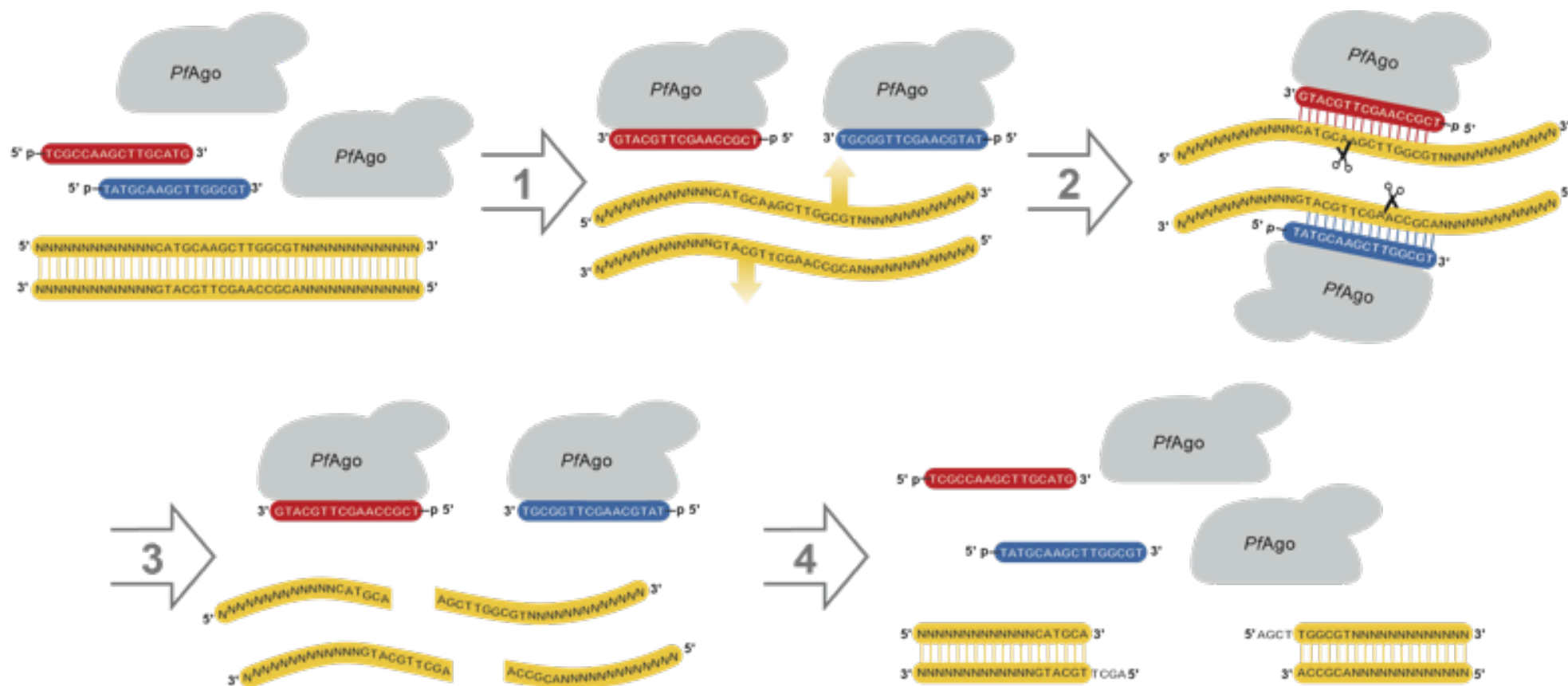
The Project: Native DNA-Based Data Storage

Programmable DNA-guided artificial restriction enzymes
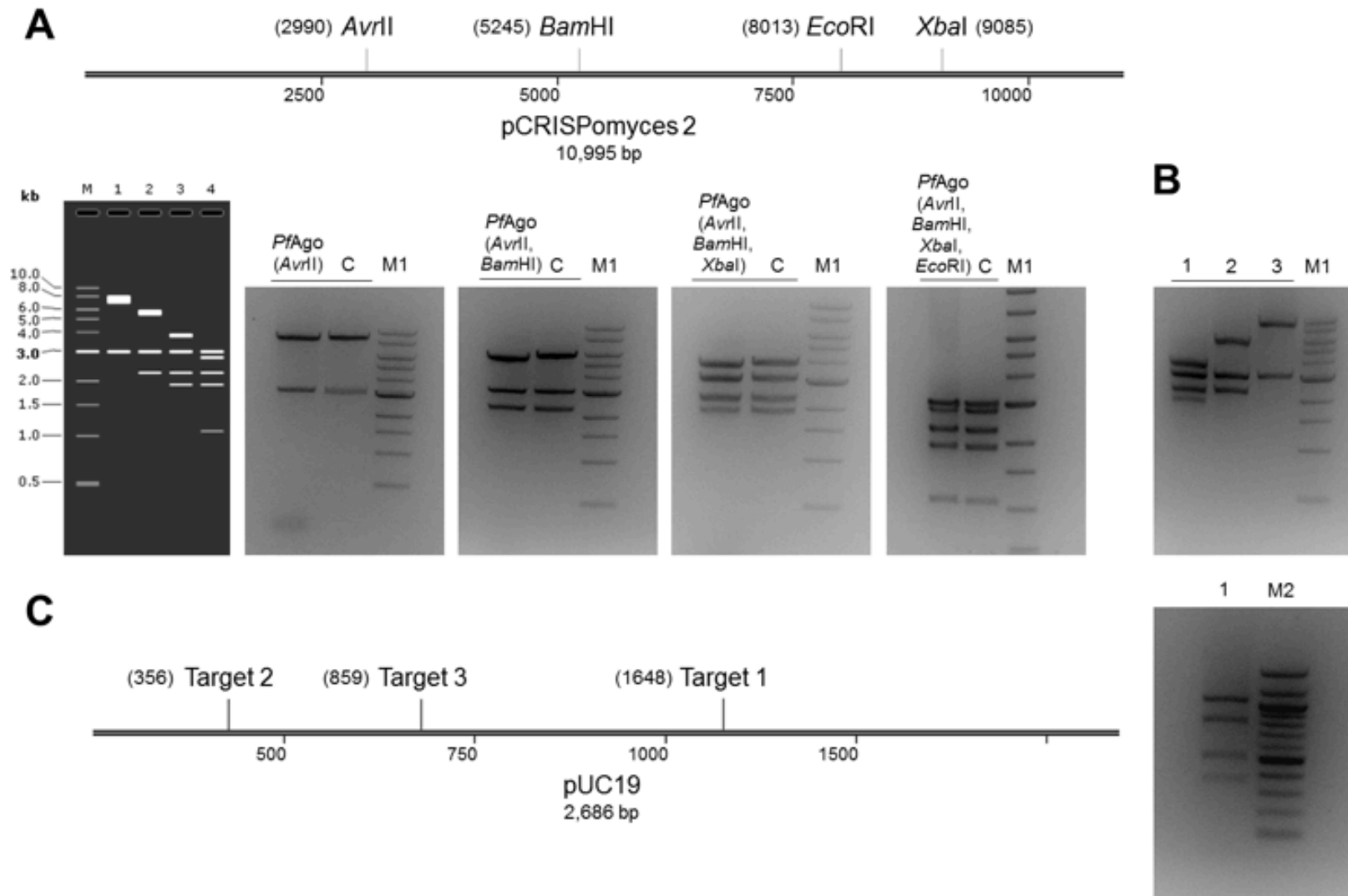
The Project: Native DNA-Based Data Storage

Programmable DNA-guided AREs

- Programmability and multiplexing
  - Can create extremely large number of AREs with virtually any sequence specificity and defined sticky ends of varying length.
  - The system can be used in parallel (multiplexed).
  - AREs nickases need only one guide.

- Accessibility
  - Low production cost.

- High specificity and activity
  - Significantly better than the CRISPR-Cas9 for in vitro applications.

"Revolutionizing Biotechnology with Artificial Restriction Enzymes." *Genetic Engineering and Biotechnology News*, Feb. 10, 2017.

DNA-Computing: Strand Displacement

Input

Chen, Dalchau, Srinivas, Phillips, Cardelli, Soloveichik, Seelig, *Nature Nanotechnology* 2013

DNA-Computing: Strand Displacement

DNA-Computing: Strand Displacement

The Project: Native DNA-Based Data Storage
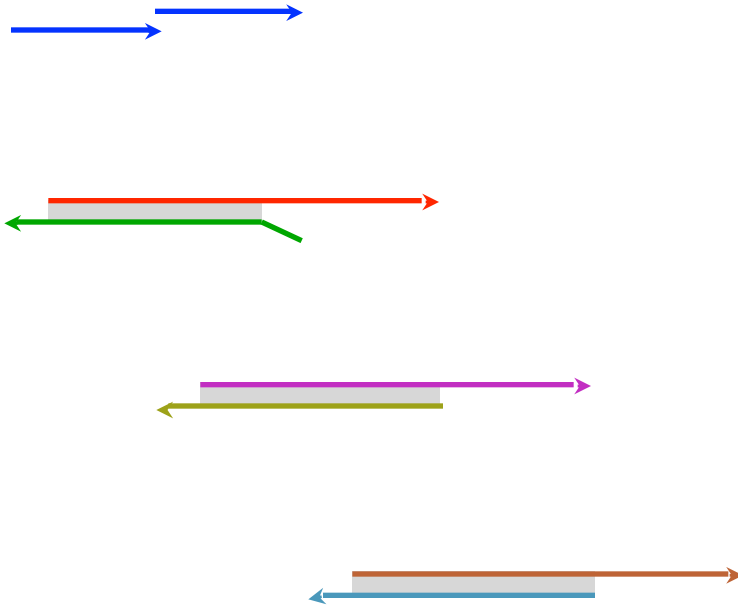
DNA-Computing: Strand Displacement

DNA-Computing: Strand Displacement

The Project: Native DNA-Based Data Storage

DNA-Computing: Strand Displacement

DNA-Computing: Strand Displacement

Output
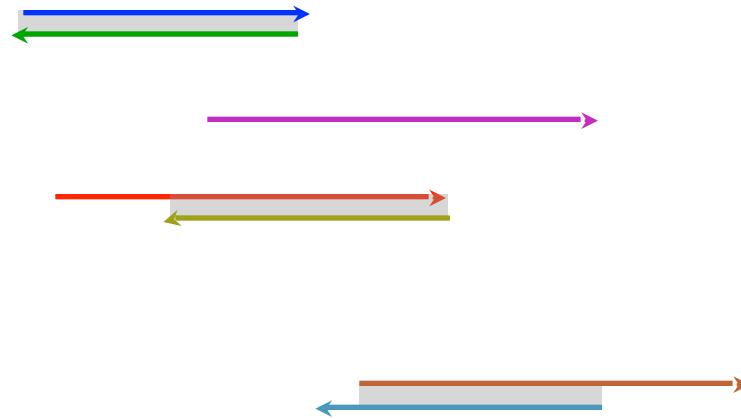
DNA-Computing: Strand Displacement

Notice: No sequence overlap!
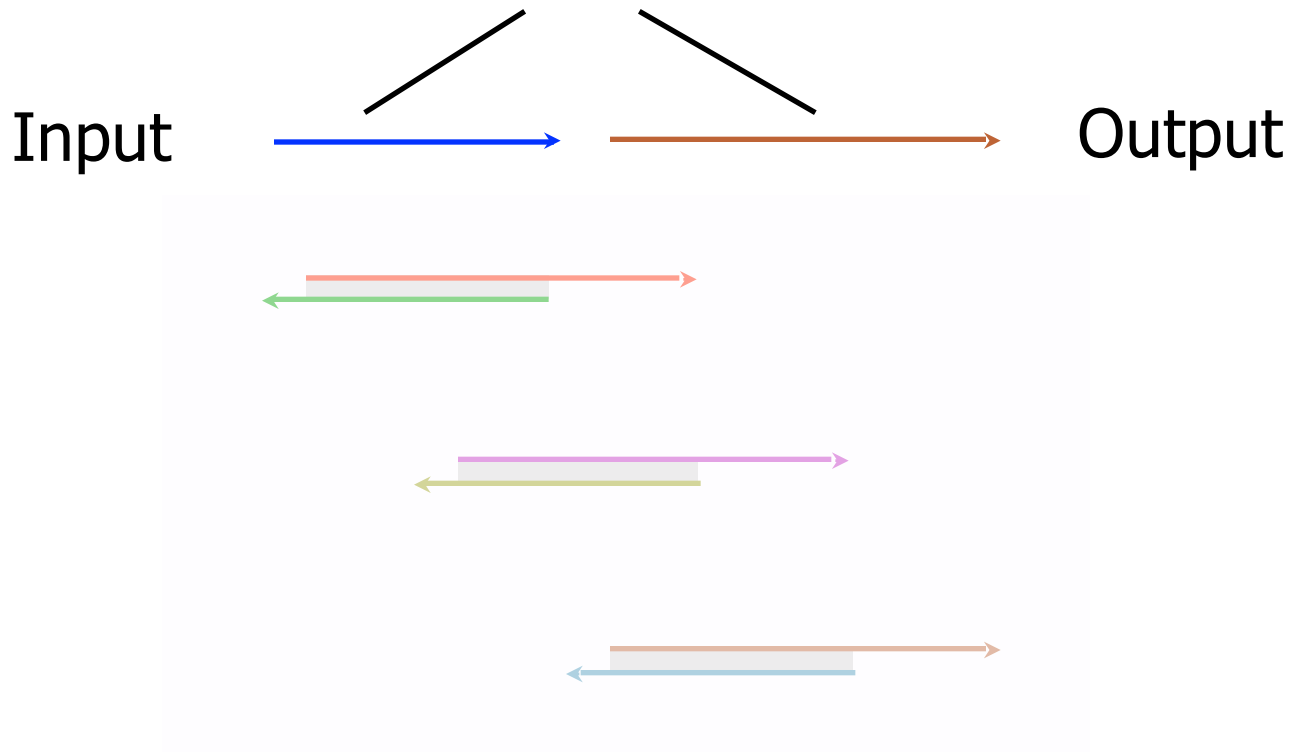
Input   Output

The Project: Native DNA-Based Data Storage

DNA-Computing: Strand Displacement

Input1 + Input2 → Output

The Project: Native DNA-Based Data Storage

- Logic circuits [Seelig et al, *Science* 2006, Qian et al, *Science* 2011]

- Neural networks [Qian et al, *Nature* 2011]

- Distributed algorithms [Chen et al, *Nature Nanotechnology* 2013]

- Dynamical systems (oscillator) [Srinivas et al, Accepted to *Science*]

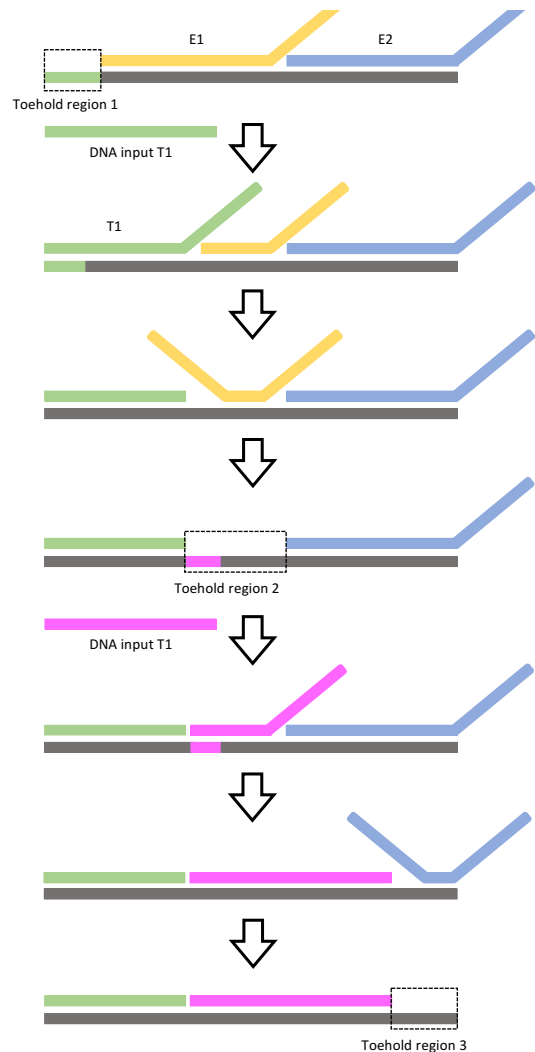$$X + Y \rightarrow X + B$$
$$X + Y \rightarrow B + Y$$
$$X + B \rightarrow X + X$$
$$Y + B \rightarrow Y + Y$$

$X_0 = 0.7, \ Y_0 = 0.3$
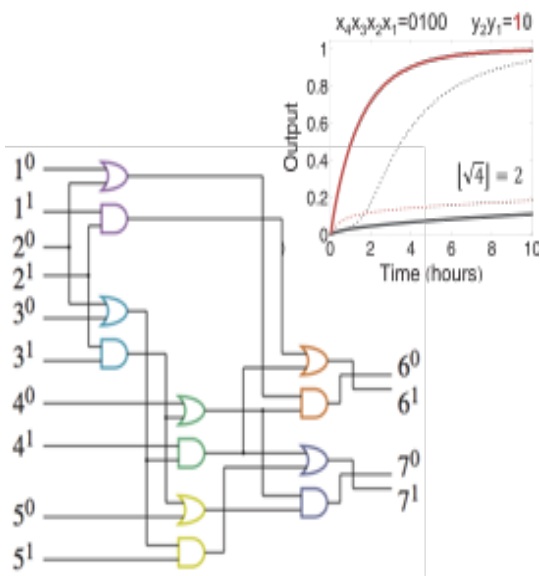
Logic circuit
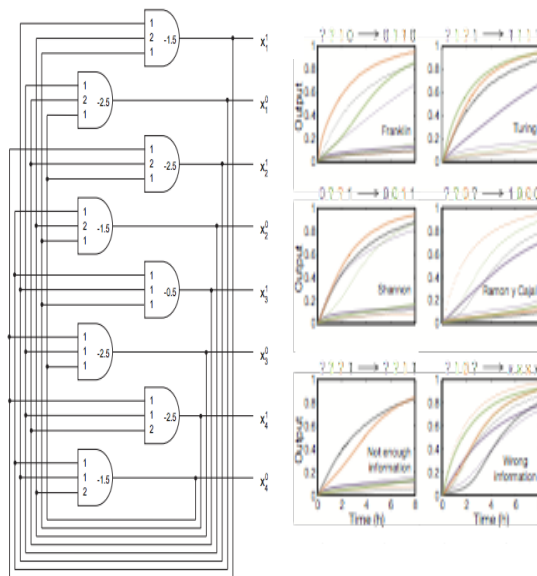
Neural Network
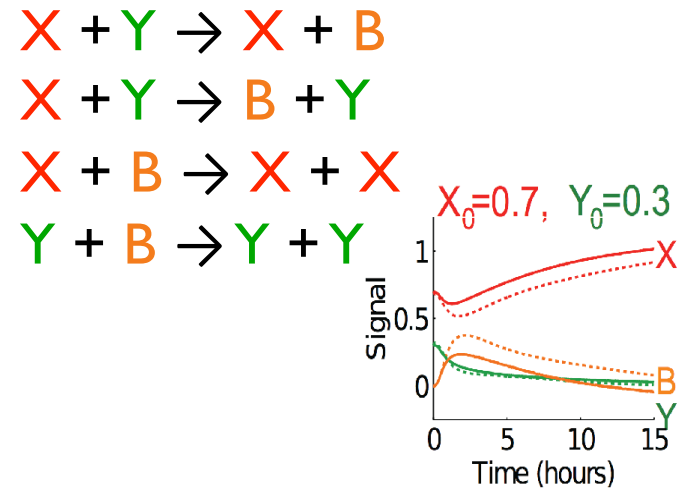
Distributed algorithm

The Project: Native DNA-Based Data Storage

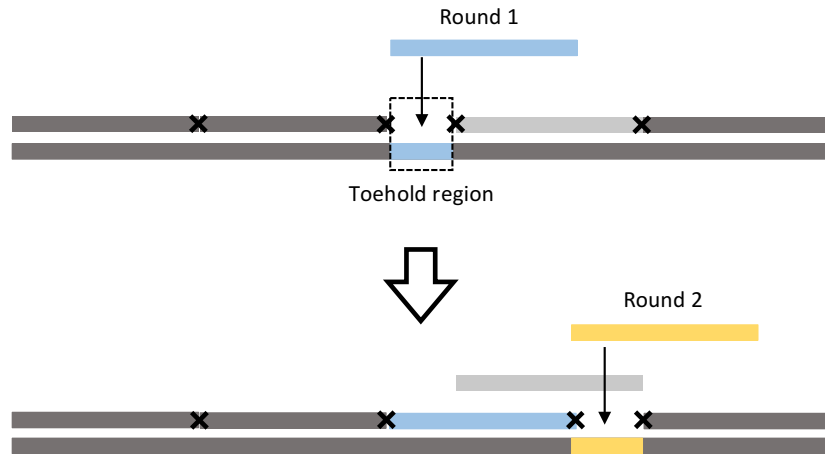## DNA-Computing: Strand Displacement and Nick Displacement
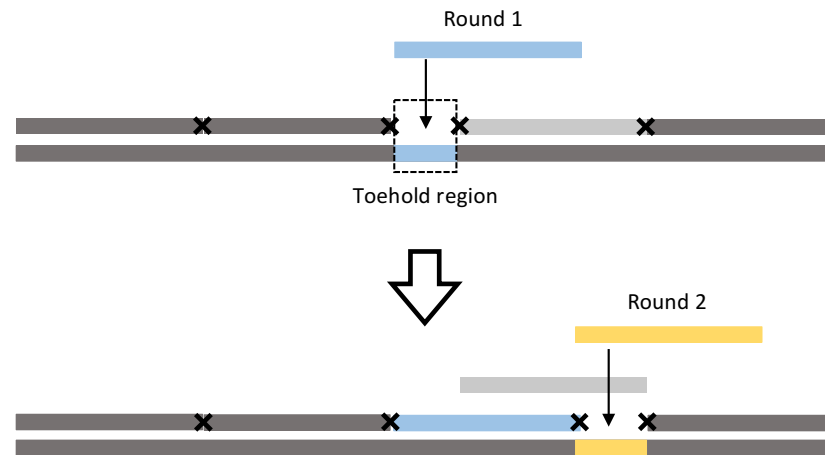
First strand displacement and new nick displacement paradigm built around native DNA.

Primers may be used to displace nicks by one position (for toehold length ~20).
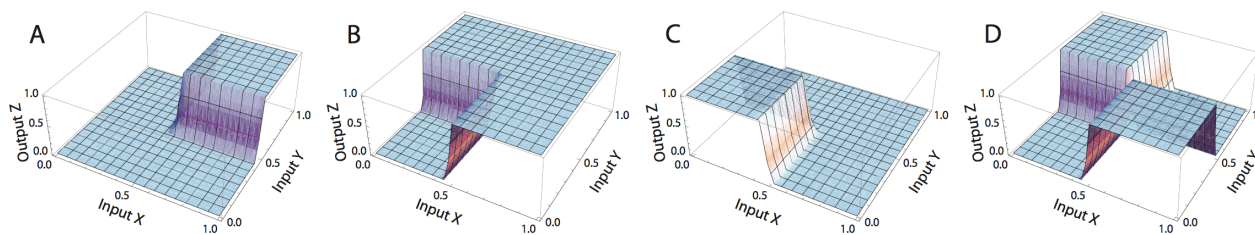
The Project: Native DNA-Based Data Storage

DNA-Computing: Strand Displacement and Nick Displacement

Counting: Adding and Subtracting

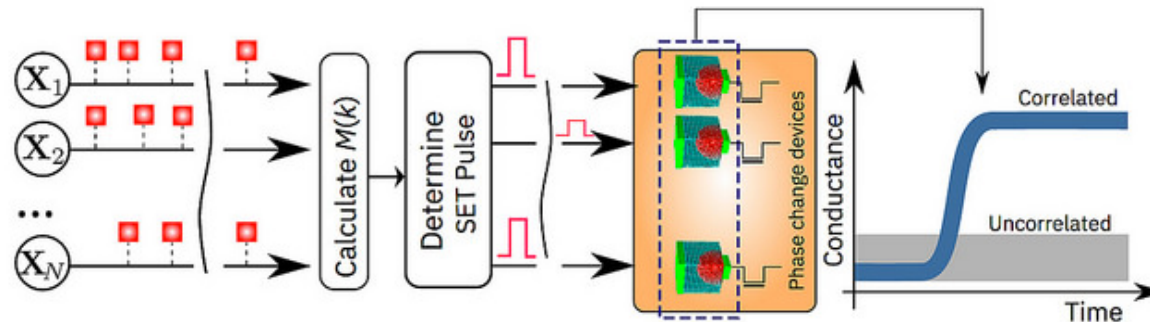Displacing nicks left-right until carry over is encountered

Comparison: Values in different registers

Example: Logical Computation with DNA Strand Displacement. Figure shows simulations of DNA-based implementations of standard logic gates: (A) AND, (B) OR, (C) NOR, (D) XOR. (Salehi, Riedel, Parhi, 2015.)

DNA-Computing: In Memory Computation

A schematic illustration of an in memory computing algorithm. Neural Computations are performed directly on data stored in memory. Credit: IBM Research

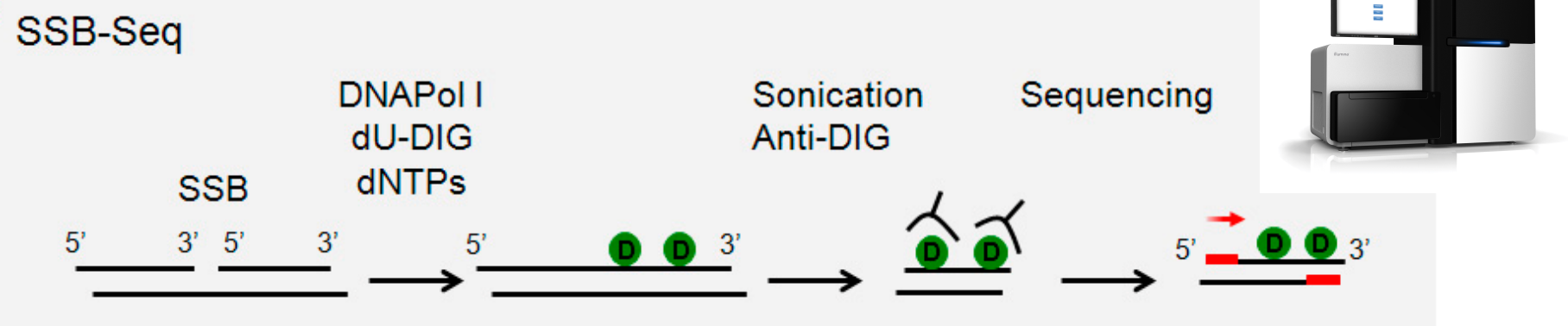Computing with high-dimensional vectors (P. Kanerva, Cognitive Computation'09)

Advantages of in memory computations:

- General and scalable model of computing.
- Memory-centric with highly parallel operations.
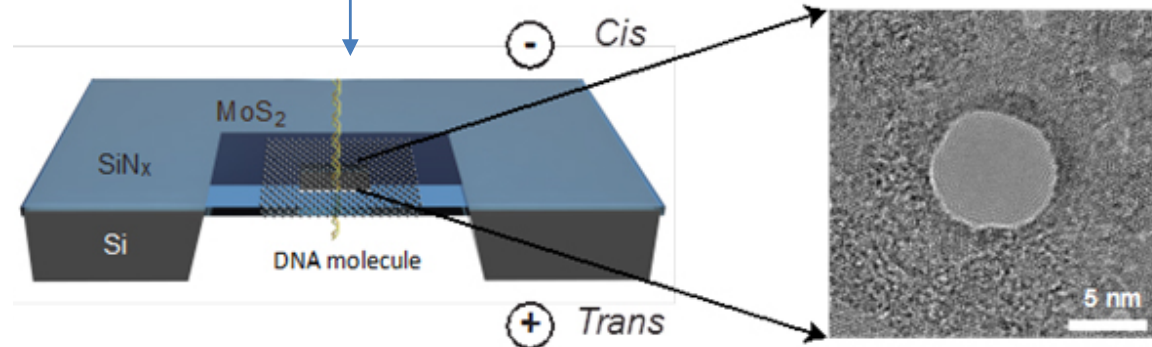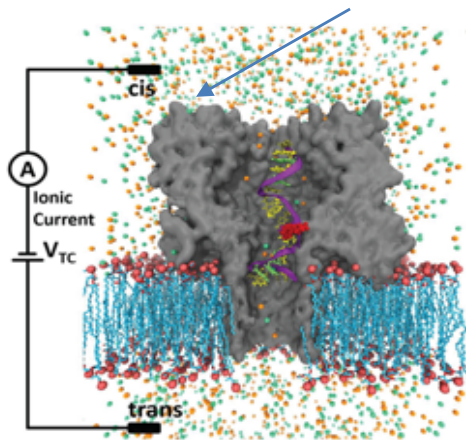- Extremely robust against most failure mechanisms and noise.

The Project: Native DNA-Based Data Storage

Readout Architectures

NGS

SSB-Seq

1. Nick detection via immunoprecipitation+NGS
2. Nick detection using protein and solid state nanopores (In collaboration with Radenovic lab, EPFL, Leburton lab UIUC)
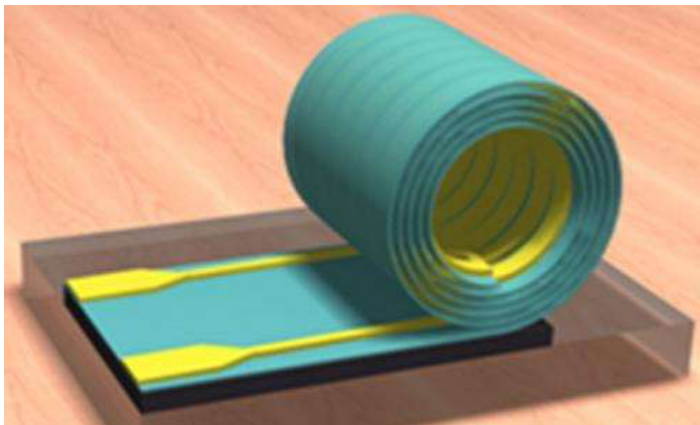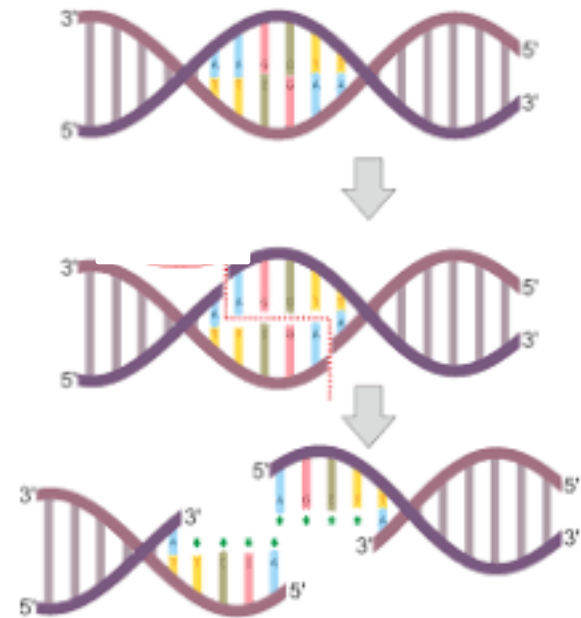
The Project: Native DNA-Based Data Storage

Nick-Encoding for Watermarking

Nicking →
DSB+PCR

Random Access: via strand displacement, addressing or microtubes
(In collaboration with X. Li Lab, ECE UIUC)
Not funded by this project.

Closed Session

ROI

Number of people employed, by category:
3 graduate students, 2 postdoctoral fellows.

Number of newly trained scientists in this area: None

Resource Status: None

Number of PhD theses initiated based on this work: None yet

Discoveries utilized on other efforts: NSF CCF, CIA, SRI UIUC

Patents filed: 3

Papers published: For proposed topic material >5 journal papers

Presentations given: [please indicate the number of invited talks separately]

Technology licenses: None

New companies formed: On related subject - HelixVault

Venture capital: None

Follow-on funding: None