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# Cellular Computing

ISAT Summer Study, August 1996



# Cellular Computing



Tom Knight, Paul Matsudaira

*Co-chairs*

## Study Attendees:

- Jonathan Allen (MIT)
- Elliott Brown (DARPA)
- Bernie Chern (NSF)
- Frederica Darema (DARPA)
- Tony Eng (MIT)
- Ken Gabriel (DARPA)
- John Hennessey (Stanford)
- Mark Horowitz (Stanford)
- Butler Lampson (MIT/Microsoft)
- Bob Lucas (DARPA)
- Sonny Maynard (DARPA)
- Harley McAdams (Consultant)
- Gary Minden (DARPA)
- Jose Munoz (DARPA)
- Hilarie Orman (DARPA)
- Bob Parker (DARPA)
- Rose Ritts (DARPA)
- Lucy Shapiro (Stanford)
- Gerry Sussman (MIT)
- Anna Tsao (DARPA)



# Cellular Computing



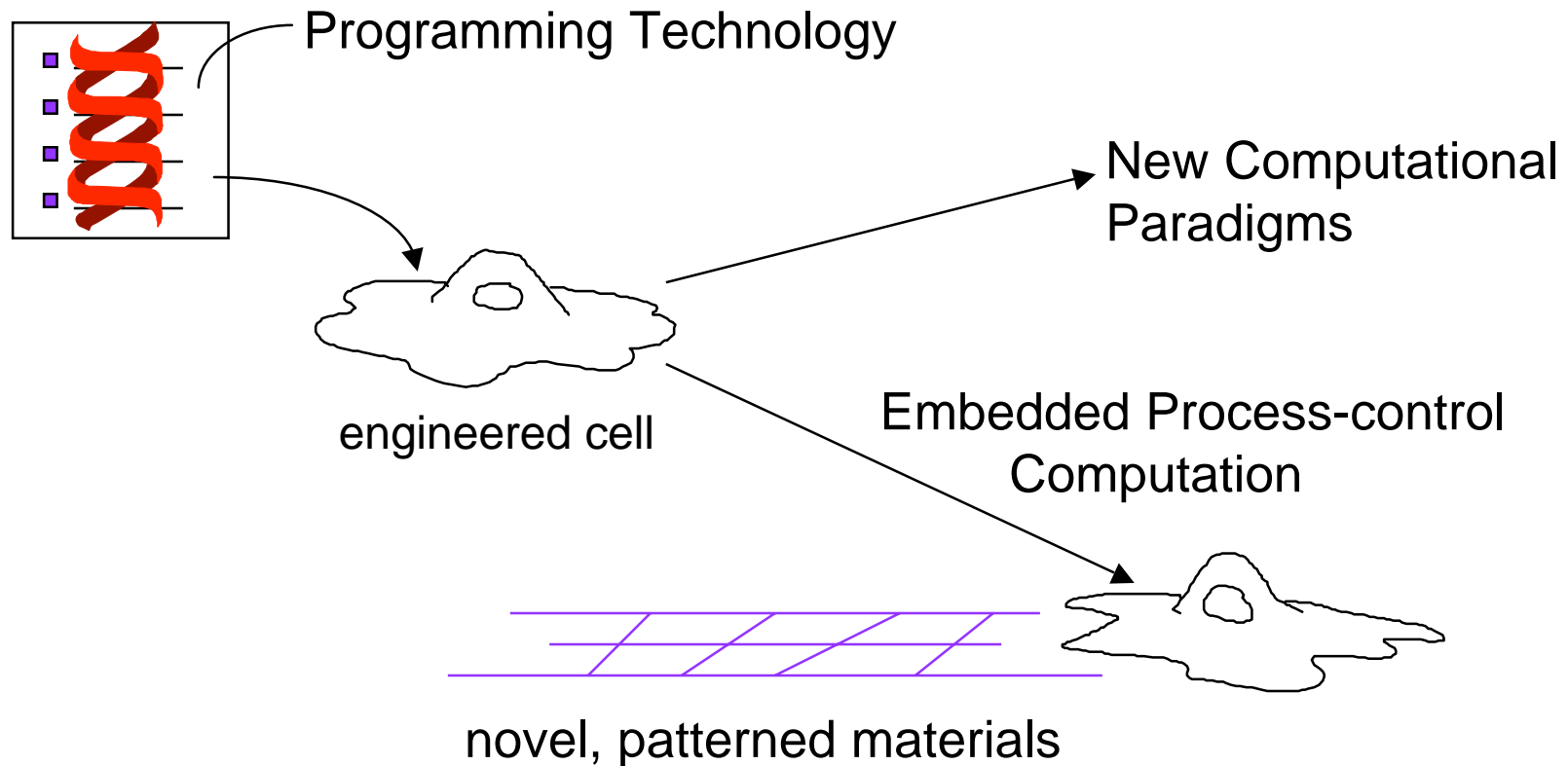
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## Other Participants

- **Bonnie Berger** (MIT)
- **Roger Brent** (Mass General)
- **George Church** (Harvard Medical)
- **Millie Donlon** (DARPA)
- **Paul Dunlap** (WHOI)
- **Eric Eisenstadt** (ONR)
- **Denny Freeman** (MIT)
- **Terri Gaasterland** (U. Chicago)
- **Alan Grossman** (MIT)
- **Shaun Jones** (DARPA)
- **Peter Karp** (SRI)
- **Eric Lander** (Whitehead)
- **Mark Reed** (Yale)
- **Dave Stenger** (NRL)
- **Bruce Tidor** (MIT)
- **George Whitesides** (Harvard)



# Create and exploit a novel technology for information processing and manufacturing by controlling processes in living cells



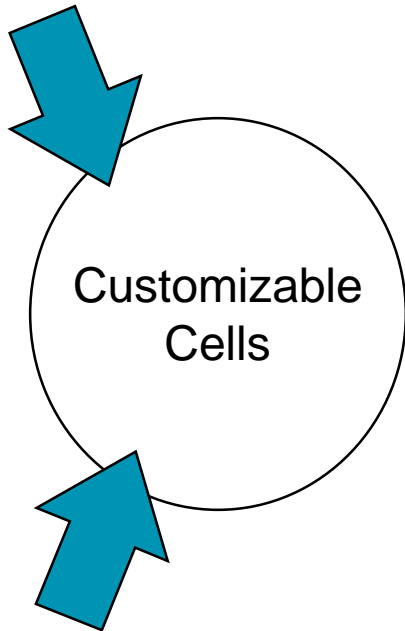


# Strategy



## Technology Development

**Biology**

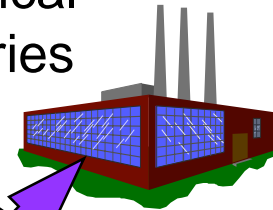


**Computer Science**

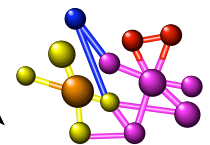
CAD Tools,  
Molecular Biological Tools,  
Instrumentation,  
Infrastructure

FSM

Chemical  
Factories

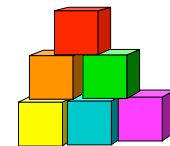


Easily  
Programmable  
Cells



Novel  
Materials

Ultrafast  
Computers





# Computer Science and Biology



## ■ Life is an information process

- DNA is a storage medium for programs
- There is evidence for abstract structure in the genetic program
  - ◆ A hierarchy of structure in complex organisms
  - ◆ An ability to mutate one structure at a time
  - ◆ Divergent implementations of the same structure
- Gene expression is the means of execution

## ■ A cell contains a complex software system

- Haemophilus influenzae Rd has 1,830,137 base pairs = 457,534 bytes
- Homo Sapiens has about a 1 GByte fabrication and operational program

## ■ Study of computational processes is synergistic with biological science

- Computational science is the study of management of complexity



# Implementing the Digital Abstraction with DNA Binding Proteins

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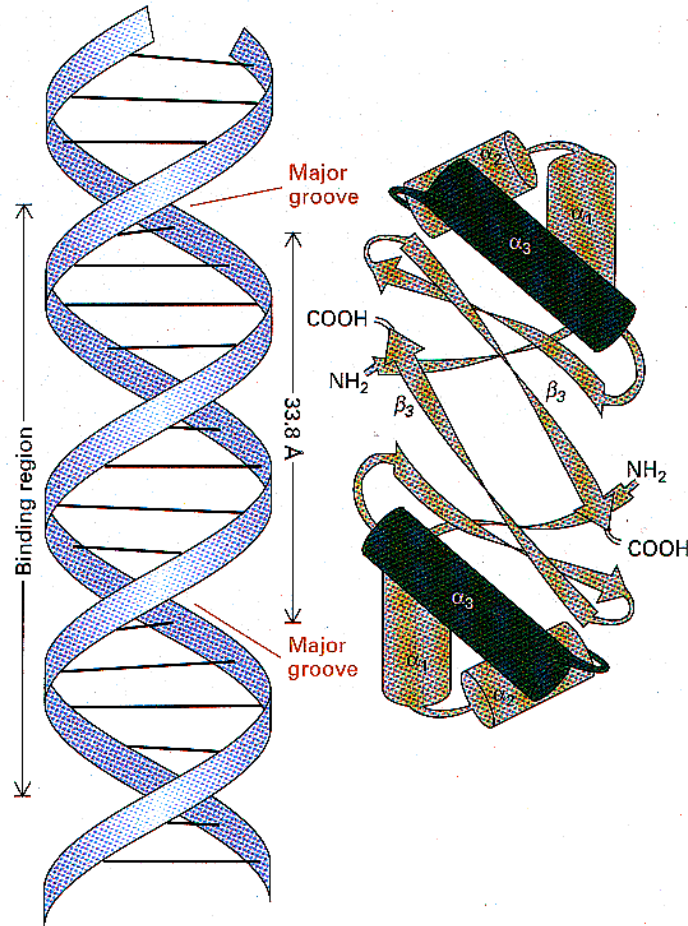
- Represent signals as the concentration of specific DNA binding proteins
- Implement the nonlinearity by **dimerization** of proteins and with **cooperative binding** at DNA binding sites
- Control the maximum concentration by **negative self regulation** of concentration
- Turning signals off is handled by normal protein degradation mechanisms
- Lambda Phage Switch is a good model
  - Mark Ptashne “A Genetic Switch” is highly recommended



# The Cro Repressor in Lambda Phage



(b) Cro protein



**A Dimeric Protein  
- Cooperative Binding**



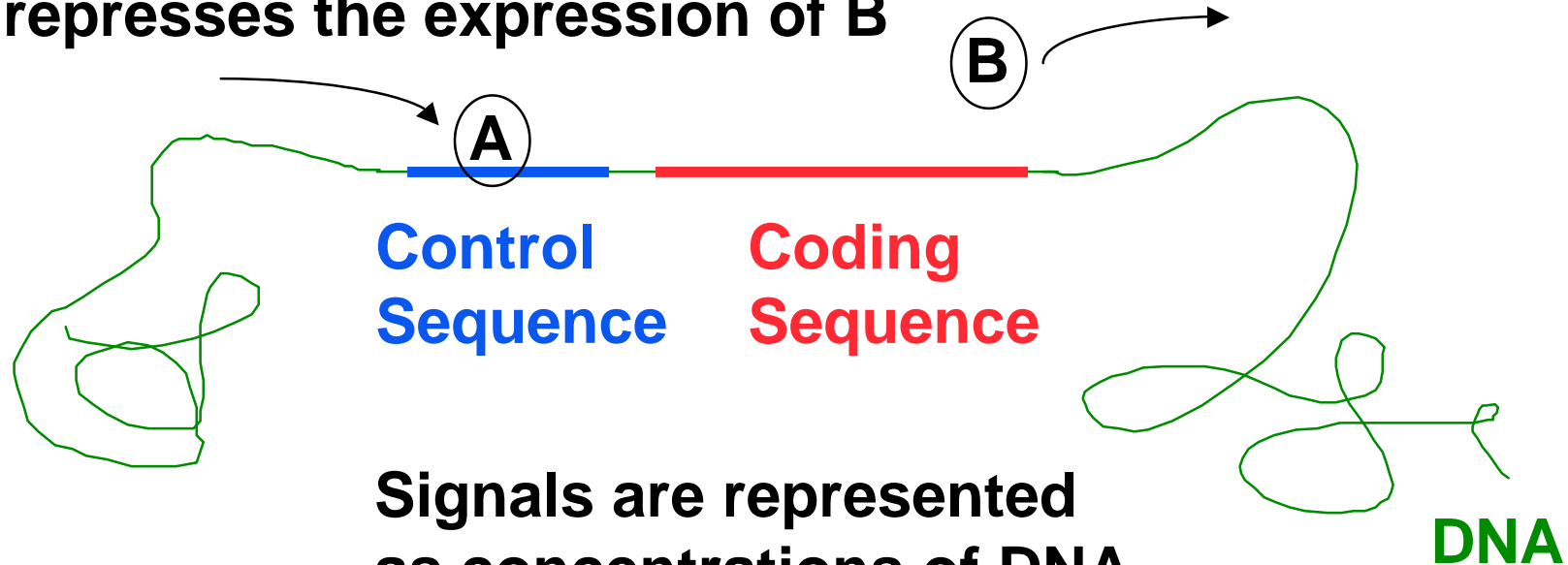


# The Digital Abstraction: An Inverter

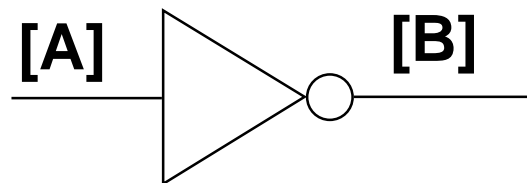


Implemented in genetic switches

A represses the expression of B

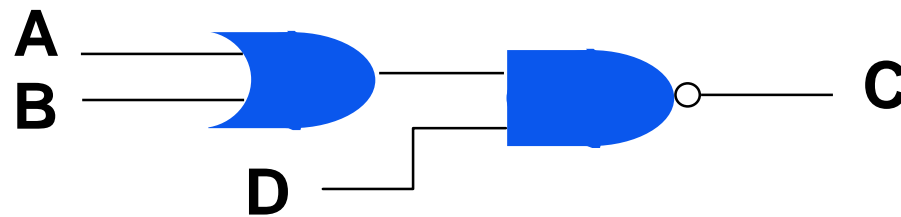
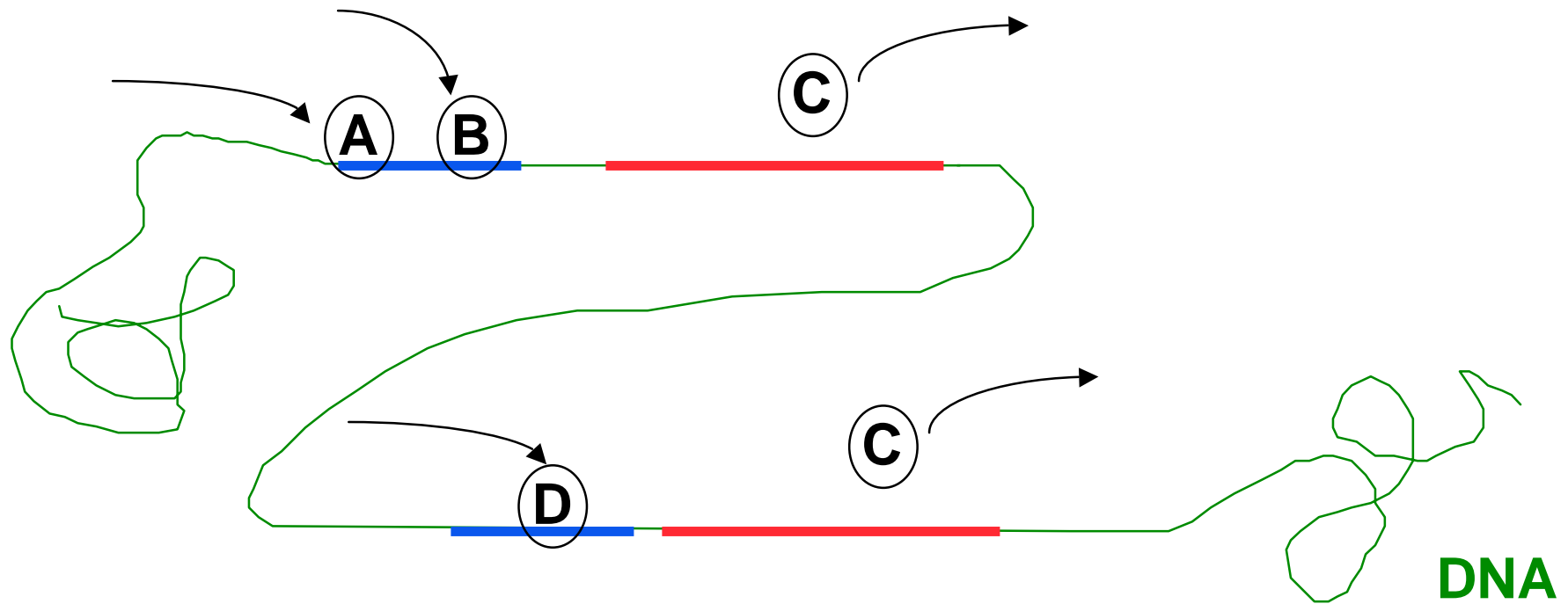


Signals are represented  
as concentrations of DNA  
binding proteins.



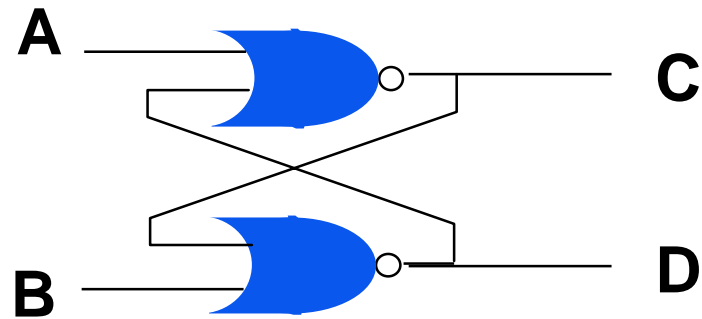
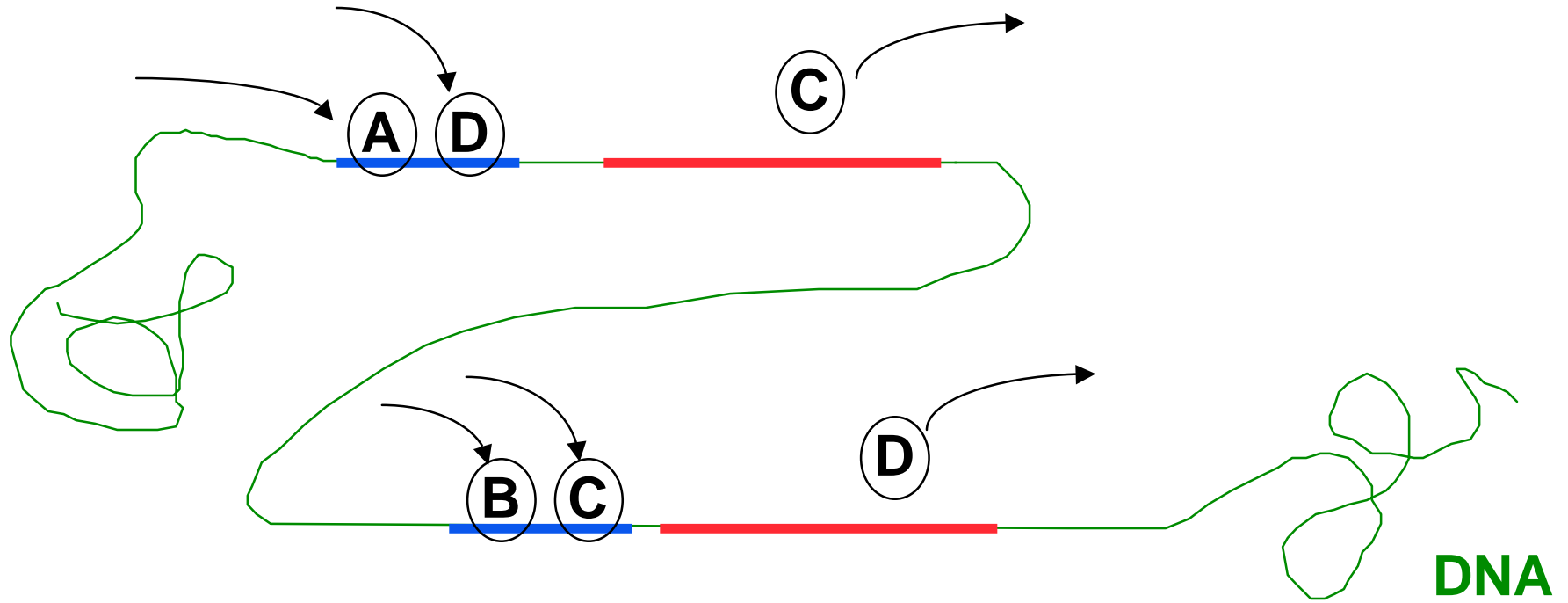


# A Simple Cellular Logic Circuit





# Digital Memory: A Flip Flop





# Alternative Implementations



- **DNA binding protein logic is very slow**
  - millihertz gate speeds
  - Even with  $10^{12}$  cells, this is still slow
- **Biology can compute more quickly**
  - Allosteric modification of protein behavior
  - Covalent modification of proteins to affect activity
    - ◆ phosphorylation
    - ◆ GDP/GTP binding proteins
    - ◆ Cyclic AMP binding proteins
  - These techniques will be much more difficult to engineer at least until we understand protein structure and function better
  - Potentially 10 - 100 hertz response rates

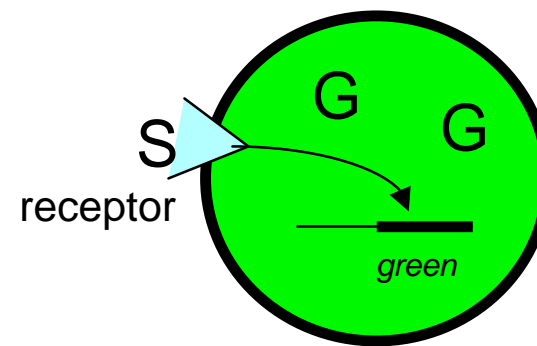
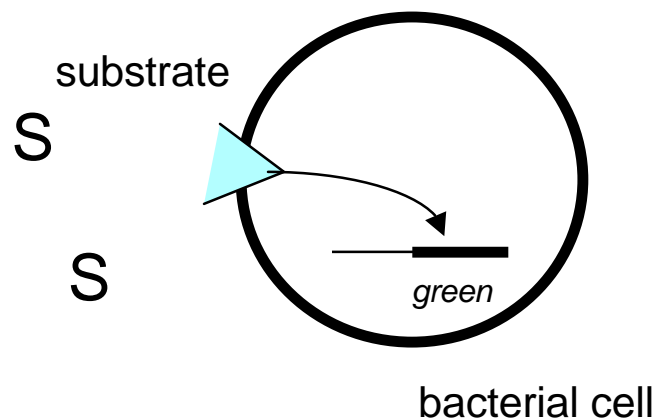


# Why Now?

## We can already engineer cells



- **Example: a Sucrose sensor**
  - Bacteria fluoresces green in the presence of sucrose
- **Are there parts available?**
  - Surface receptors for sucrose exist
  - Genes exist for Green Fluorescent Protein (GFP)
- **If no parts found, engineer parts from scratch (difficult!)**
- **How do we connect the receptor to the GFP gene**
  - Determine internal response to the receptor
  - Identify site to introduce GFP activation into the sucrose response chain
- **Create the Sucrose Sensor cell and test**

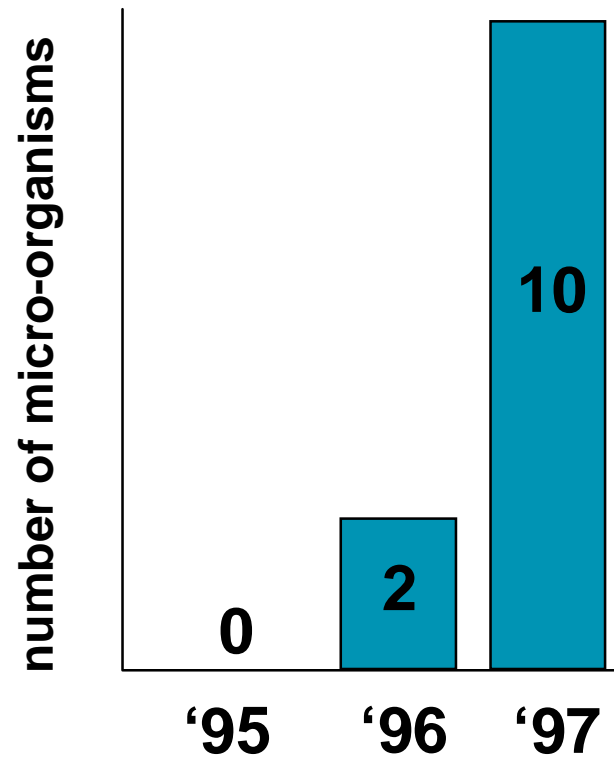




# Biochemical Knowledge is Undergoing Explosive Growth

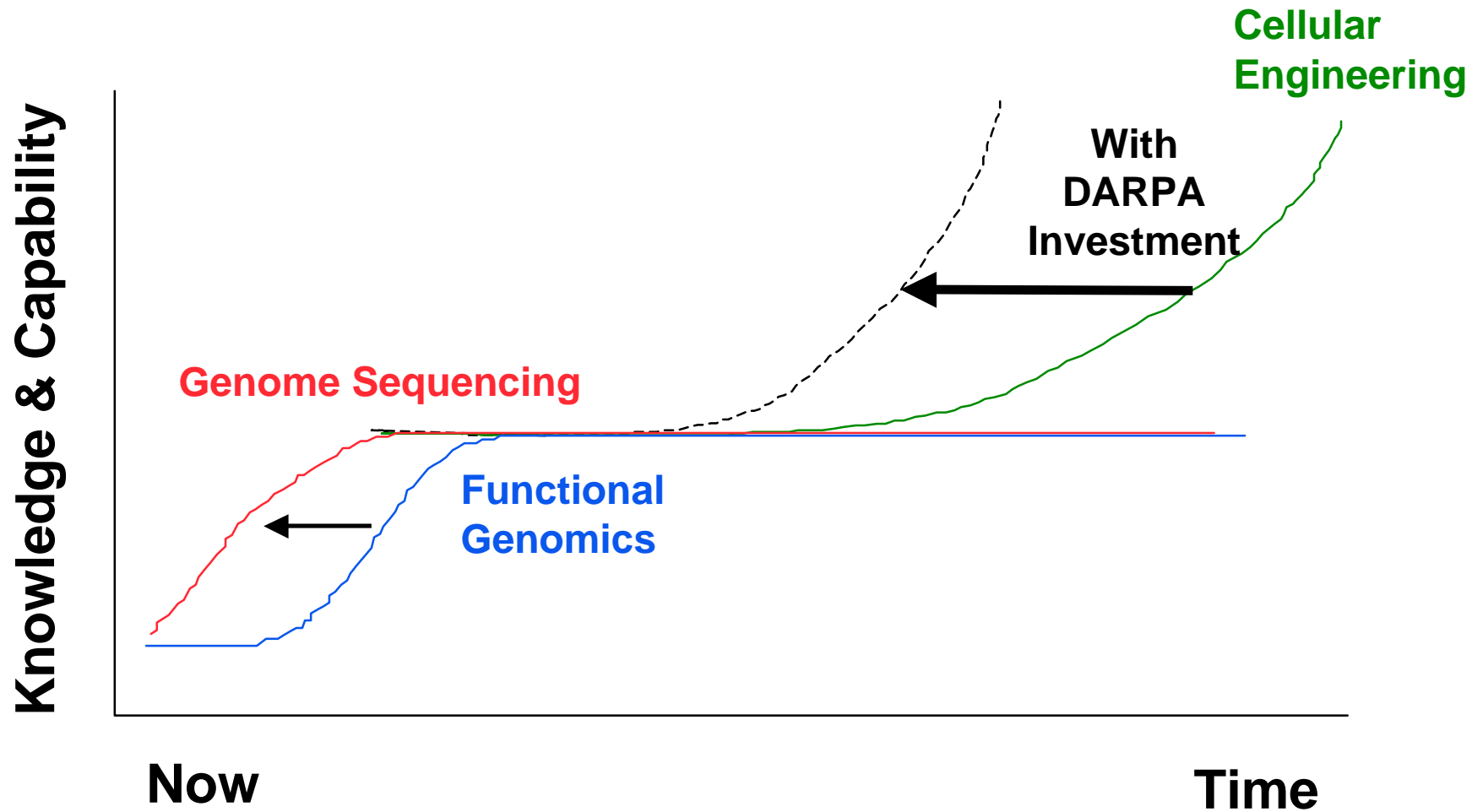


## Sequenced Genomes





# Leveraging the Ongoing Biological Investment





# Near Term Potential (1-5 years) with DARPA investment

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## ■ Applications of programmable cells

- Integration of sensors, actuators and control systems
  - ◆ e.g. sucrose sensor turns cell blue
- *in vivo* delivery of pharmaceuticals
  - ◆ e.g. selective delivery of antibodies

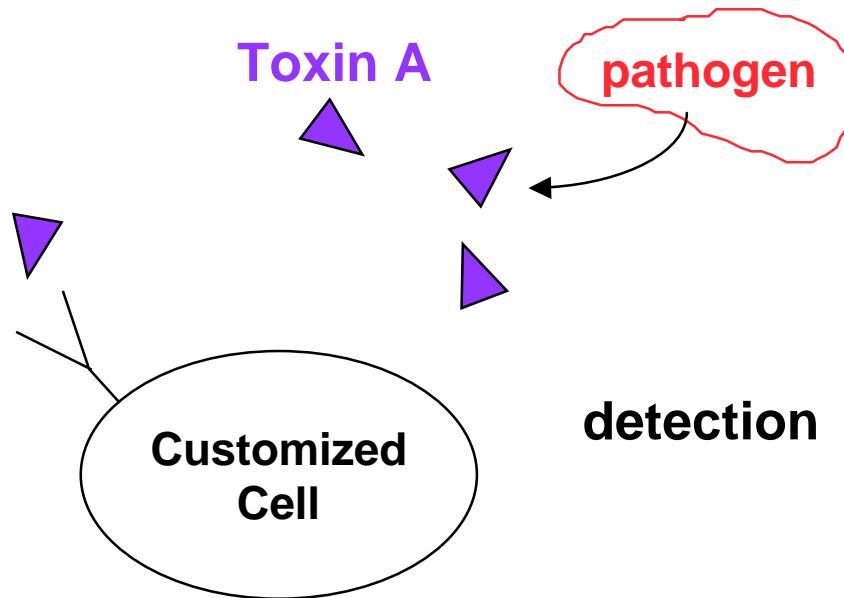
## ■ Technology Spinouts

- Bio Spice
- Improve infrastructure for biotechnology
  - ◆ Reduce GSY/ fact
- Better understanding of organizational principles
- Improved readiness for biological threats



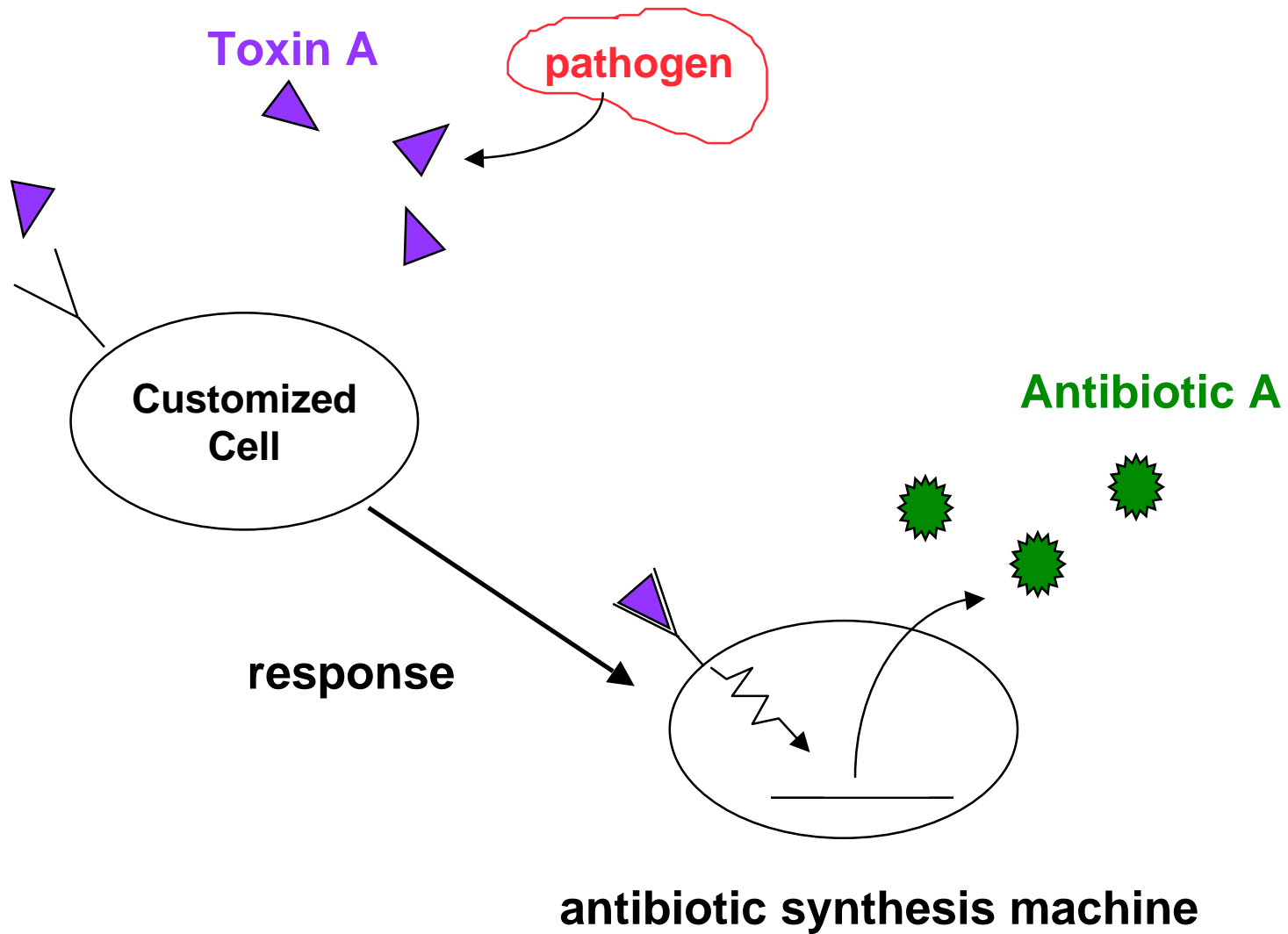


# In Situ Antibiotic Delivery



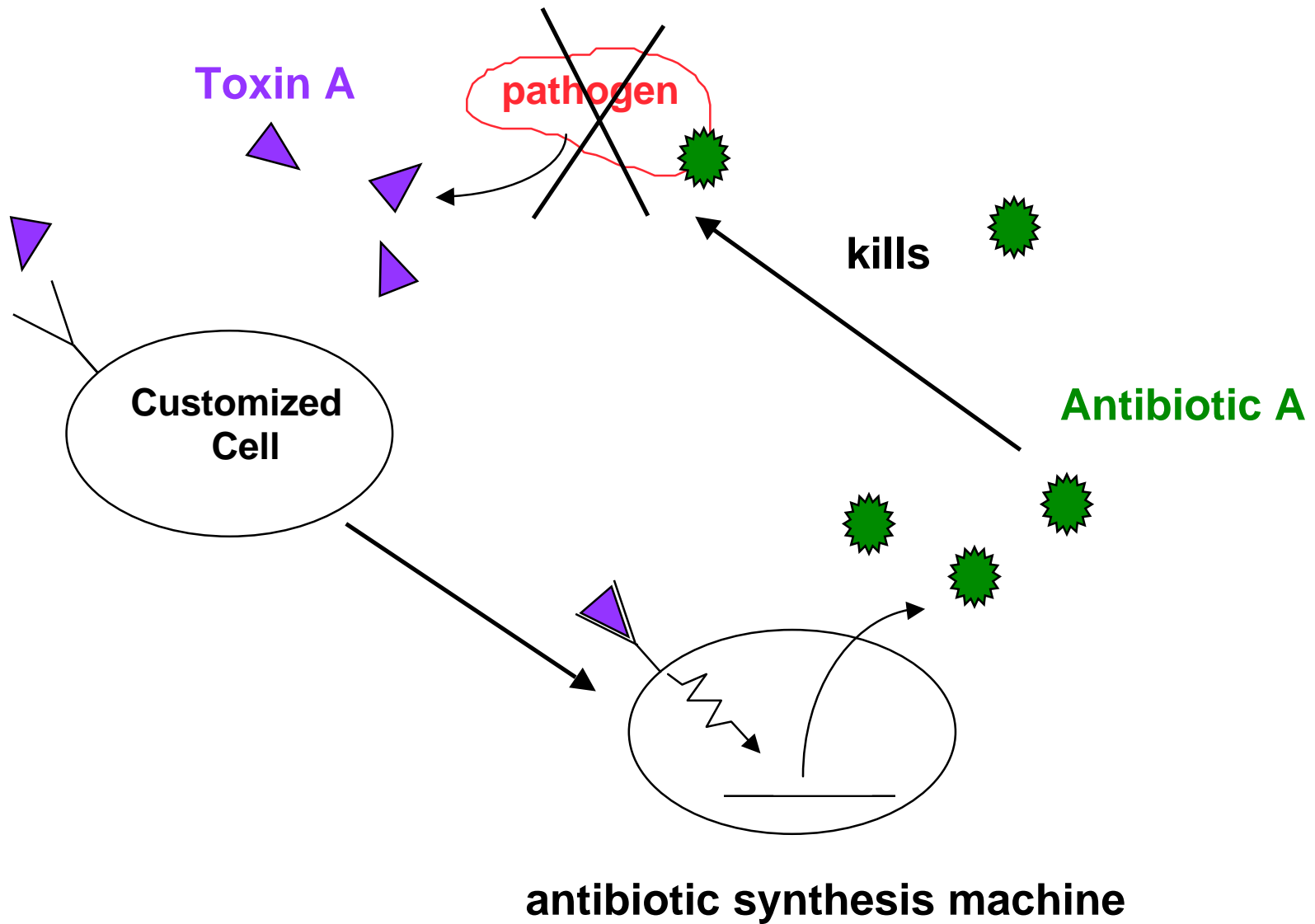


# In Situ Antibiotic Delivery





# In Situ Antibiotic Delivery



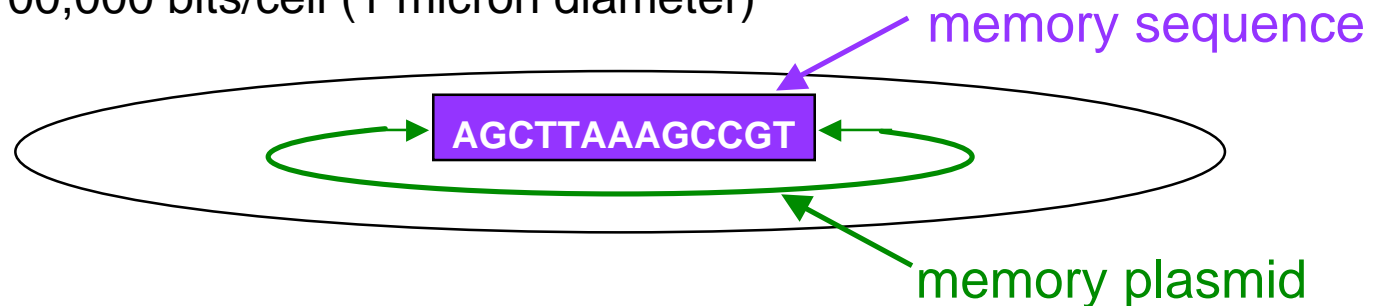


# Medium Term Potential with DARPA investment



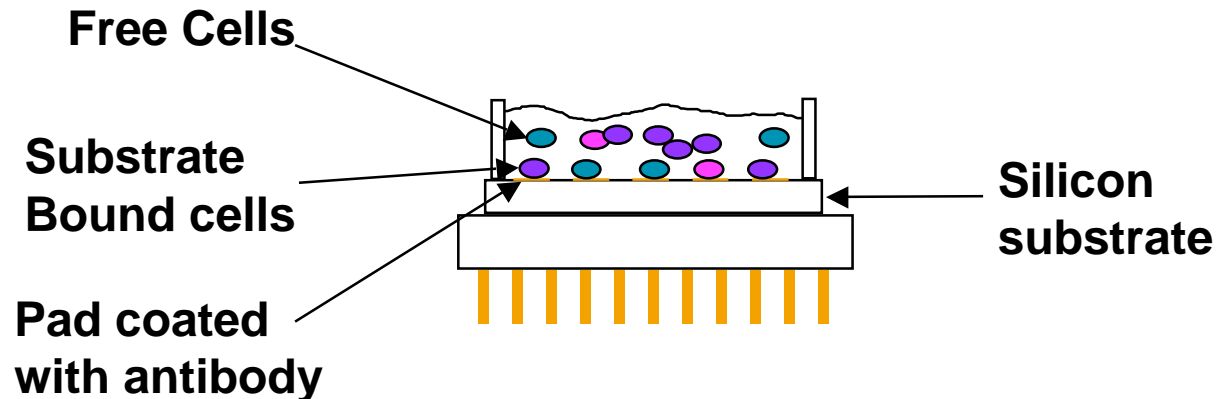
## ■ Dense Molecular Memory

- 100,000 bits/cell (1 micron diameter)



## ■ Hybrid Silicon / Cell Structures

- silicon computation
- biological interfaces
  - ◆ natural connection to the chemical world





# Long Term Potential (20+ years) with DARPA investment



**The ability to control biological processes to create patterned materials where the placement of individual molecules is under program control**

**- Creating molecularly perfect materials -**

- **Ultrascale computing structures**
- **High strength / weight materials**
- **Nonlinear optical materials**
- **Custom organisms**
  - **Disease Blockers**
  - **Purposely engineered multicellular organisms**

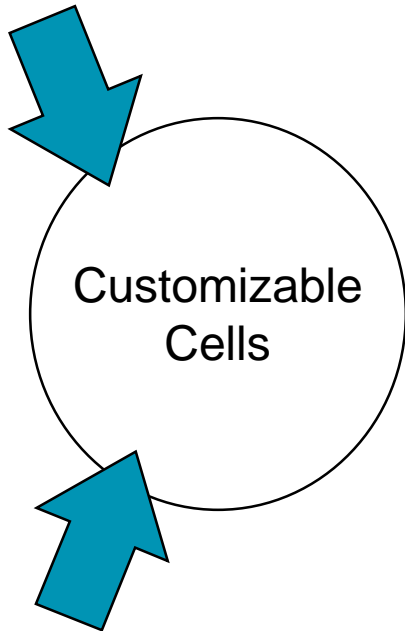


# Strategy



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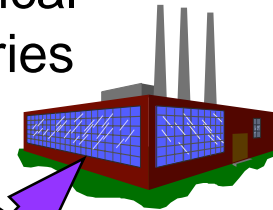


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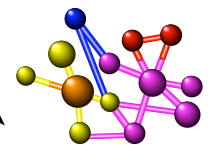
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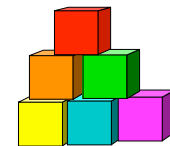


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# Naturally Occurring Sensor and Actuator Parts List



## Sensors

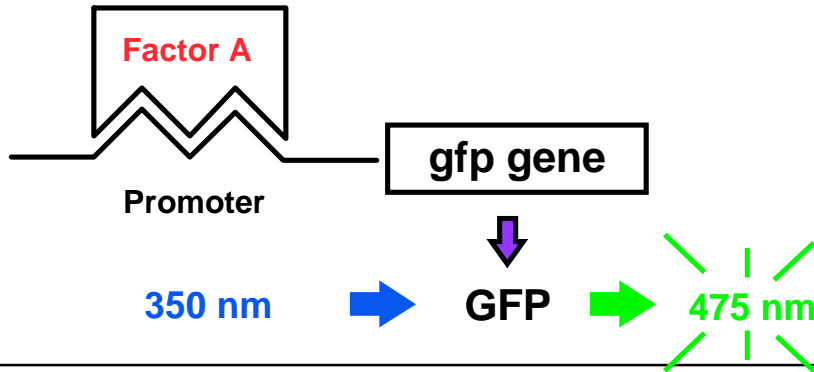
- **Light (various wavelengths)**
- **Magnetic and electric fields**
- **pH**
- **Molecules**
  - Ammonia
  - H<sub>2</sub>S
  - maltose
  - serine
  - ribose
  - cAMP
  - NO
- **Internal State**
  - Cell Cycle
  - Heat Shock
- **Chemical and ionic membrane potentials**

## Actuators

- **Motors**
  - Flagellar
  - Gliding motion
- **Light (various wavelengths)**
- **Fluorescence**
- **Autoinducers (intracellular communications)**
- **Sporulation**
- **Cell Cycle control**
- **Membrane transport**
- **Exported protein product (enzymes)**
- **Exported small molecules**
- **Cell pressure / osmolarity**
- **Cell death**



# New Product Announcement:

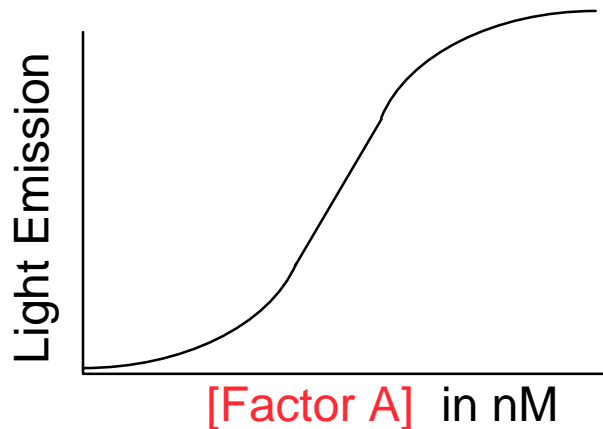


## Green Fluorescent Protein Photon BioTransducer

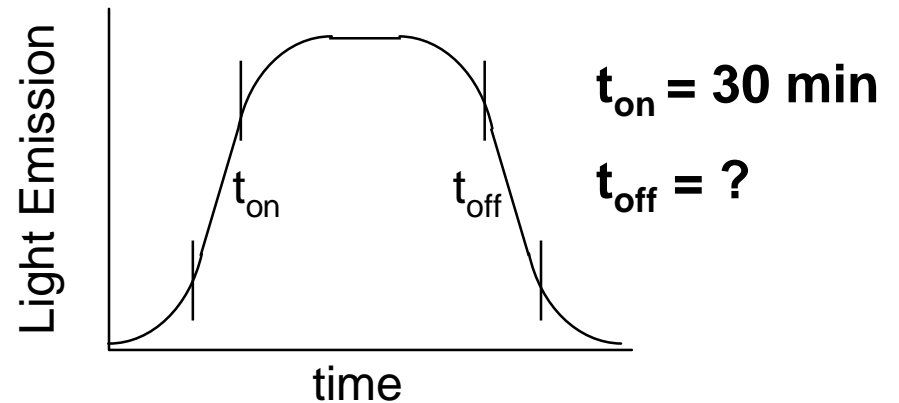
Absolute Maximum Operating Conditions: - 40 to + 80 °C

Typical Operating Conditions: + 25 to + 37°C

DC Characterisitcs:



AC Characterisitcs:





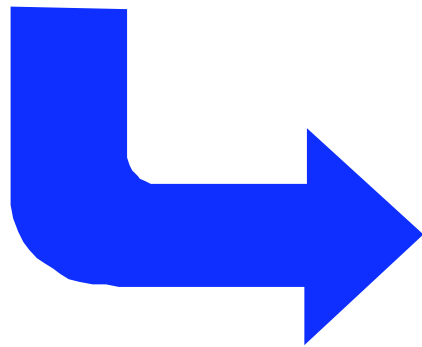


# Integrated Single-Cell Process-Control Systems

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- **Transducers**
- **Storage**
- **Control Mechanism**



**...can engineer  
single-celled  
process-control systems**



# Programmable Cooperative Behavior

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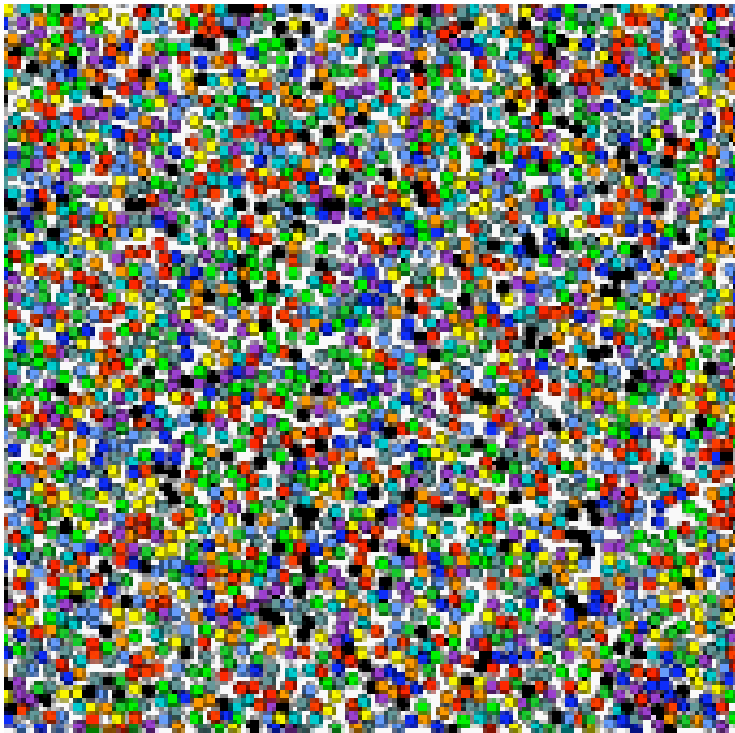
- **Multicellular systems display cooperative behavior**
- **Establishing cooperative behavior is a computational problem**
- **Biologically, it requires cell to cell communications**
- **Control results in**
  - **Patterned biological behavior**
  - **Patterned material fabrication**



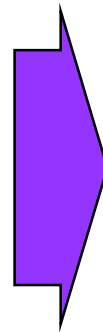
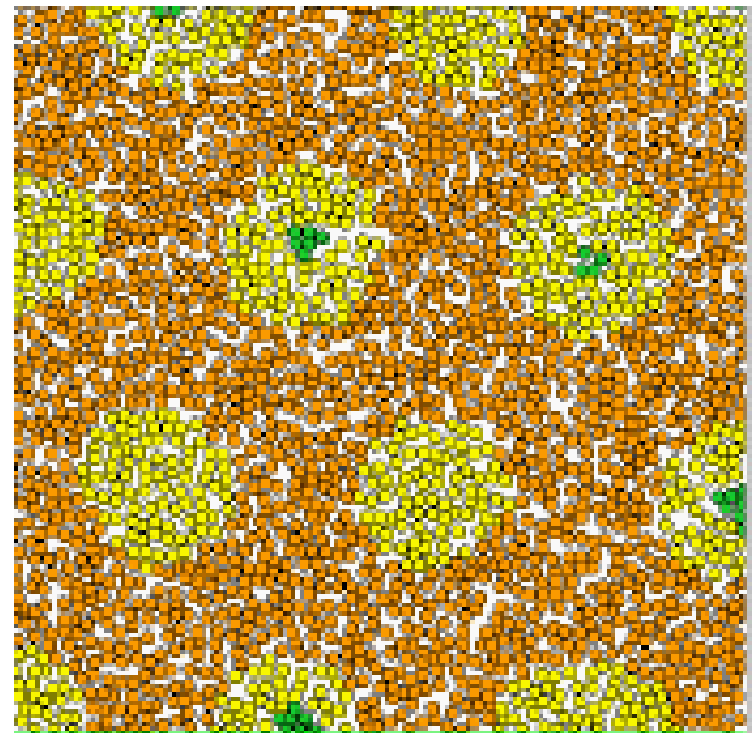
# Pattern Formation with Local Rules



**Initial state is random**



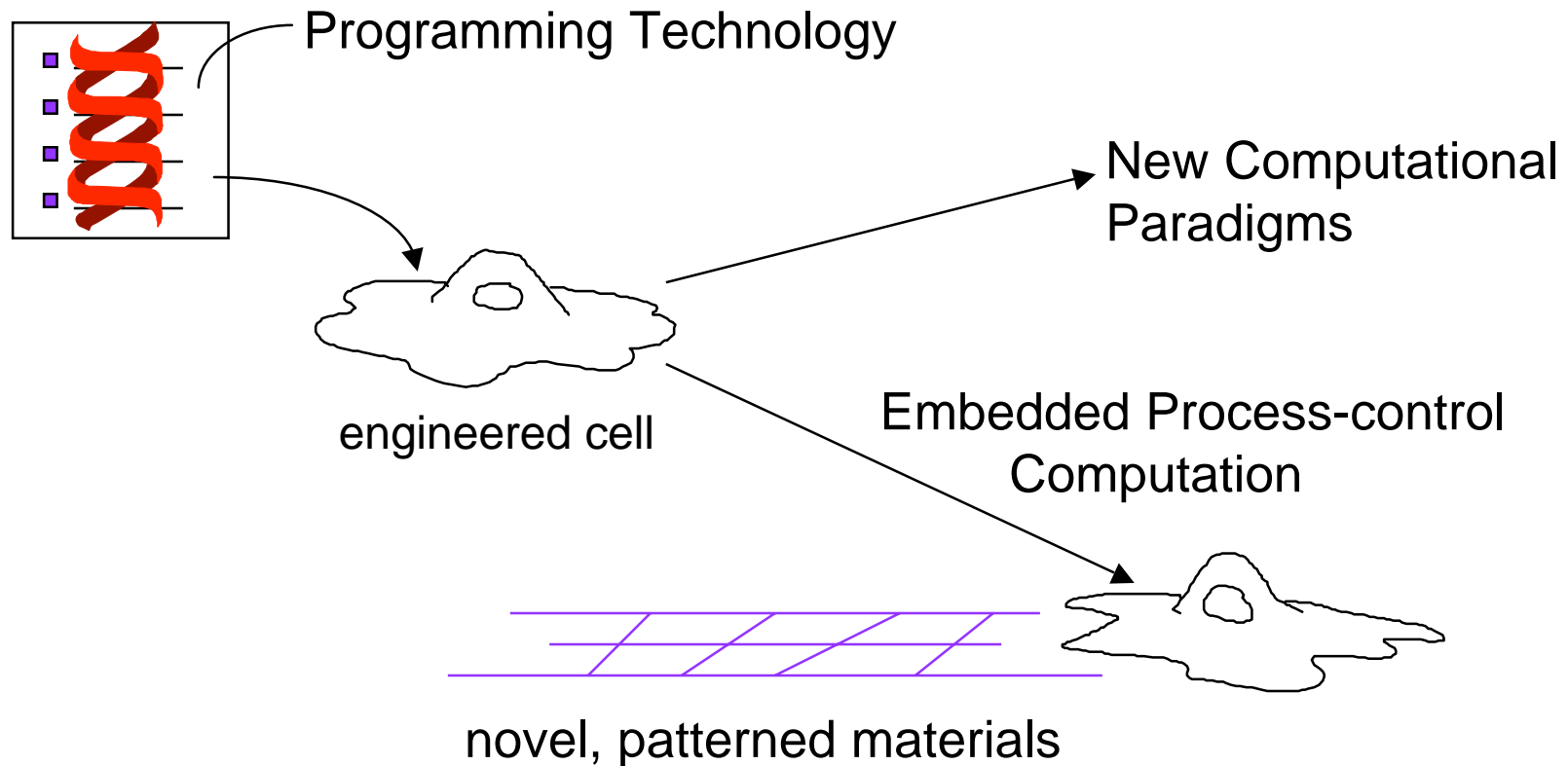
**Final state is patterned**



**Even simple, locally-controlled systems can produce predictable patterns, with only local communication.**



# Create and exploit a novel technology for information processing and manufacturing by controlling processes in living cells





# Current Challenges

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- **Engineer the first digital control system into a living cell**
- **Engineer the system support for experimental cellular engineering into living cells**
- **Engineer component interfaces**
- **Develop instrumentation and modelling tools -- BioSpice**
  - Obtain missing data in spec sheet fields
  - Discover unknown fields in the spec sheet
- **Create computational organizing principles**
  - Invent languages to describe phenomena
  - Build models for organizing cooperative behavior