# Spatial computing: a unifying approach to computational materials

Jacob Beal

Royal Society Meeting on Heterotic Computing November, 2013

**Raytheon**BBN Technologies

#### Raytheon

## Computing runs across physical space-time BBN Technologies

## **Emerging Computational Substates** Space-Time **Programming Models Multi-Substrate** dęvice **Computation** neighborhood

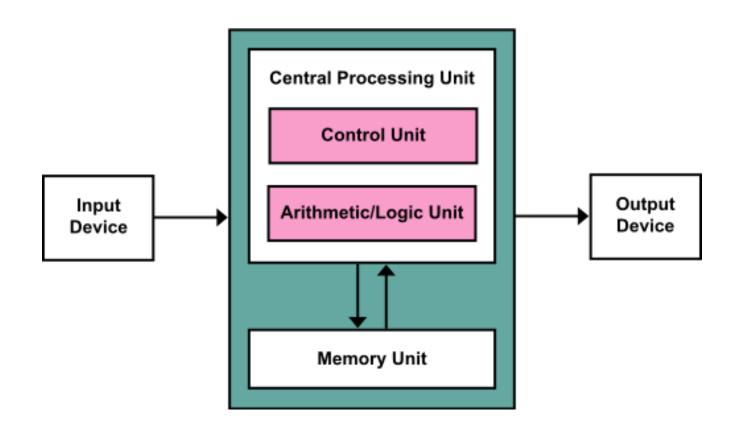
#### **Outline**



- From Monolithic to Spatial Computing
- Amorphous Medium & Field Calculus
- Biological / Hybrid Computational Substrate



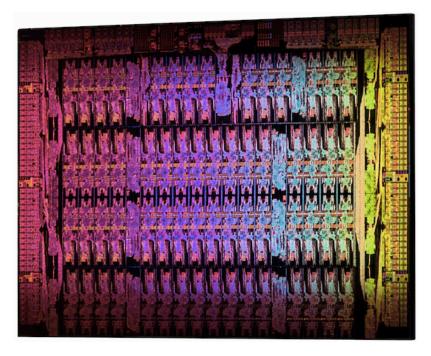
## **Traditional Monolithic Computing**

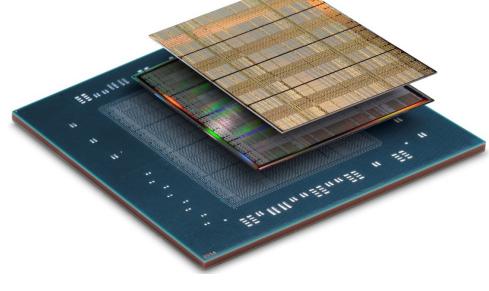


The venerable von Neumann model is breaking down in several ways...

## The End of Moore's Law







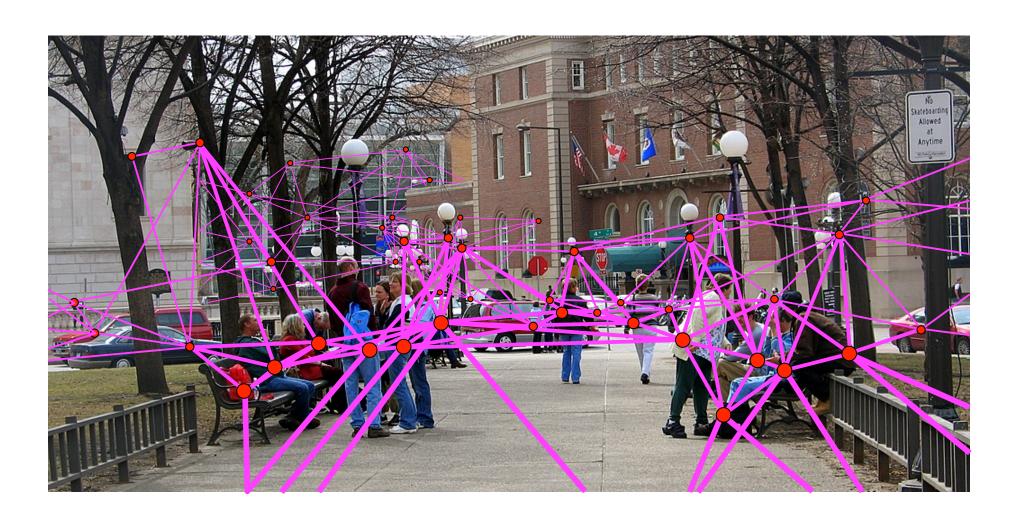
Intel Xeon Phi: 61 cores

Xilinx Virtex-7: 2M Logic cells

High-performance computing = mesh



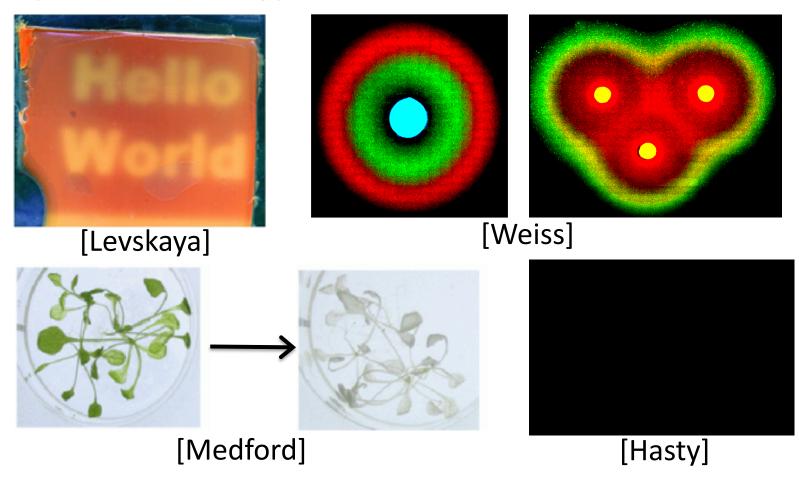
## Everything is a wireless computer





## **New Computational Materials**

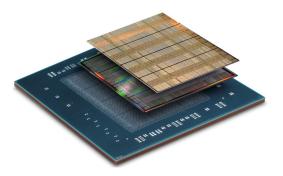
Synthetic Biology:

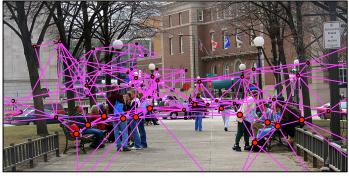


Other emerging areas too, including nanoassembly, active materials...

## Fundamentally different models









Isolate Systems
Extremely High FLOPs

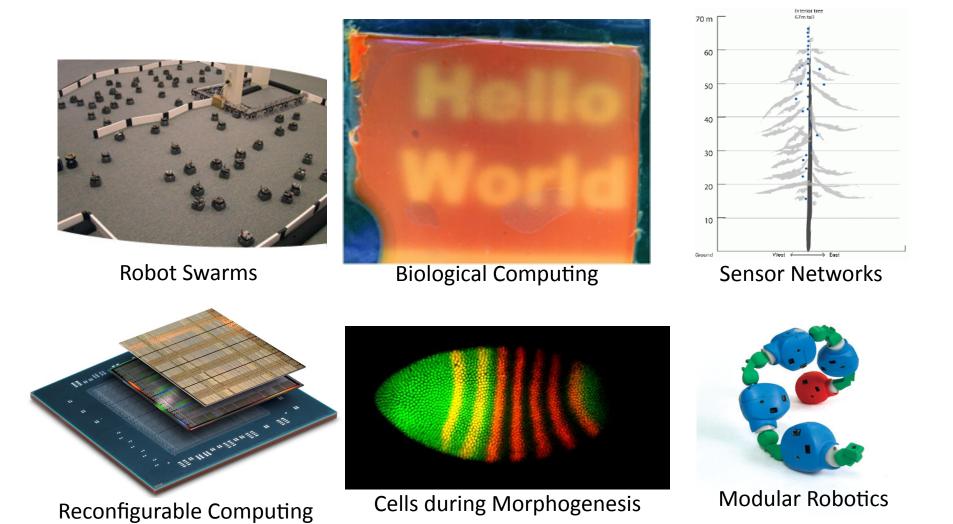
High Dispersion Moderate FLOPs

High Resolution Sense/Act Abysmal FLOPs

How can we program aggregates adaptively & efficiently? Can mixed systems exploit platform complementarity?

## **Spatial Computers**





## More formally...



- A spatial computer is a collection of computational devices distributed through a physical space in which:
  - the difficulty of moving information between any two devices is strongly dependent on the distance between them, and
  - the "functional goals" of the system are generally defined in terms of the system's spatial structure

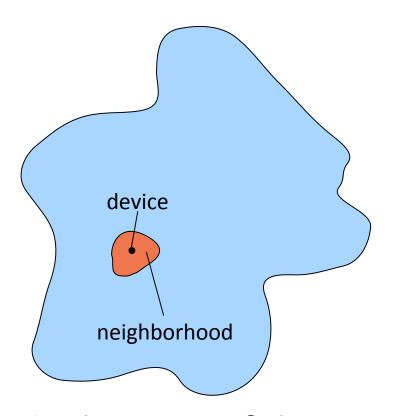
#### **Outline**



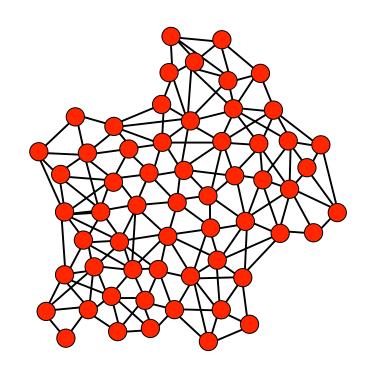
- From Monolithic to Spatial Computing
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- Continuous space & time
- Infinite number of devices
- See neighbors' past state

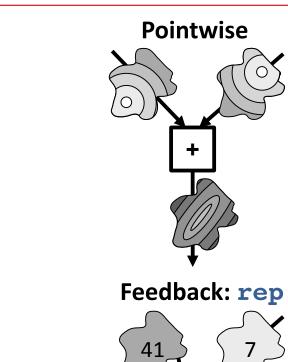


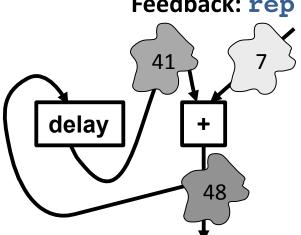
#### Approximate with:

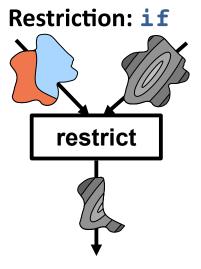
- Discrete network of devices
- Signals transmit state

#### Field Calculus:

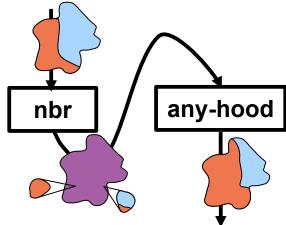












With appropriate pointwise measurements, operations are space-time universal

[Viroli et al., '13]

## Implementation: Proto



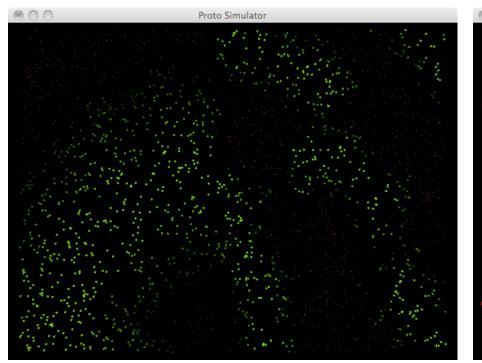
```
(def gradient (src) ...)
(def distance (src dst) ...)
                                                                                                                000
                                          evaluation
(def dilate (src n)
 (<= (gradient src) n))
(def channel (src dst width)
 (let* ((d (distance src dst))
                                                    global to local
     (trail (<= (+ (gradient src)
                                                     compilation
              (gradient dst))
                                                                                                               Loca
            d)))
                                    platform
                                                                                                device
  (dilate trail width)))
                                  specificity &
                                 optimization
                                                                                             neighborhood
                                                                                                               Discrete
                                                       discrete
                                                   approximation
                                                                      Device
                                                                       Kernel
```

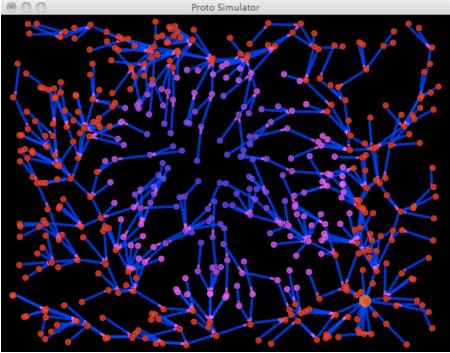
[Beal & Bachrach, '06]



## Heterogeneous Computing Materials

## Functional "streams" integrate different time scales





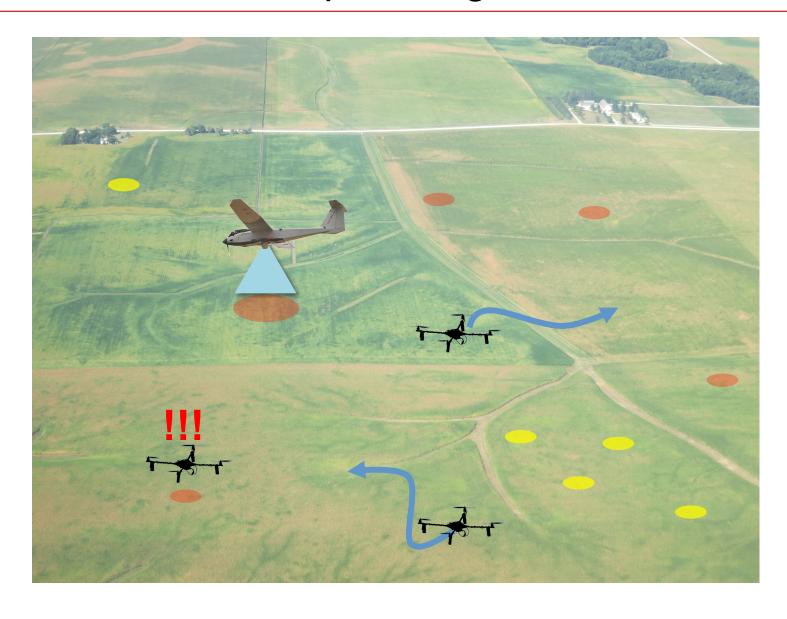
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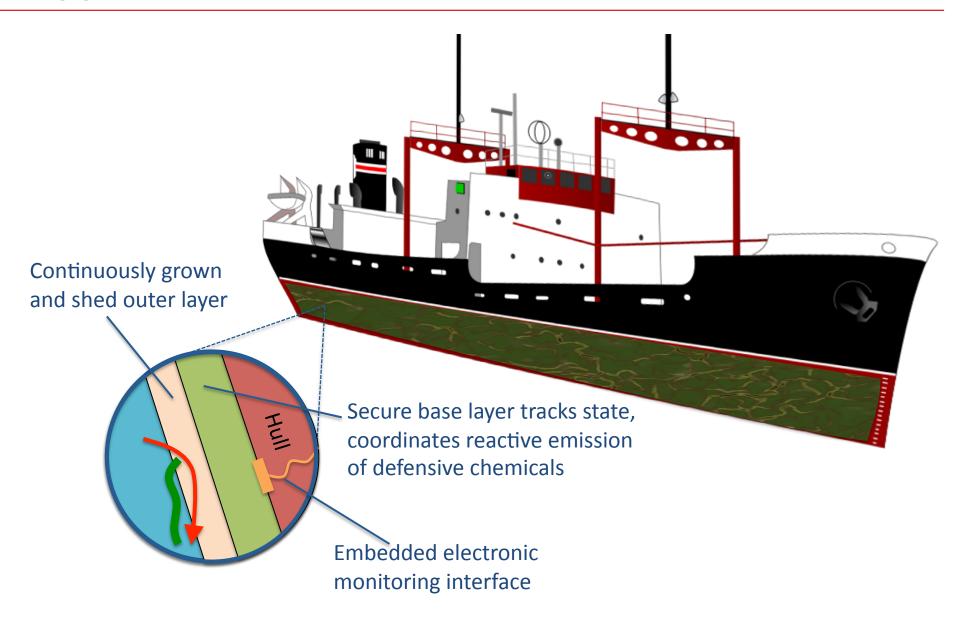


## Vision: Precision Crop Management



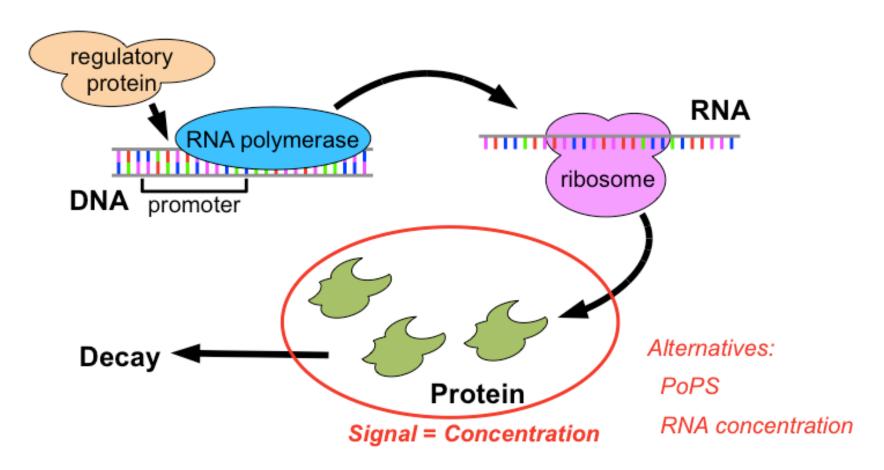


## Application: Protective Biofilms



## Raytheon BBN Technologies

## Synthetic Biology: Transcriptional Logic



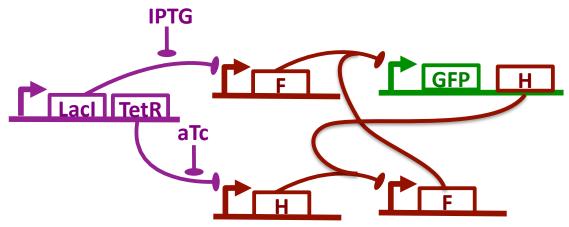
Stablizes at decay = production



## Genetic Regulatory Networks

- Parallel dataflow computation
- Continuous time evolution, feedback loops

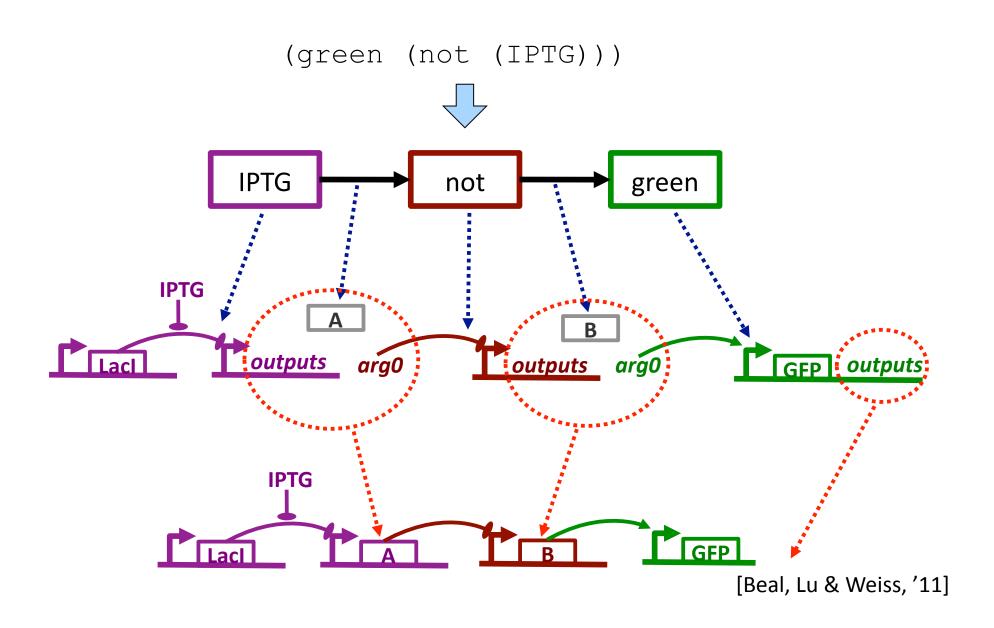
#### Example: SR-Latch



 Spatial patterning via intercellular signaling, adhesion, cell morphology, ...

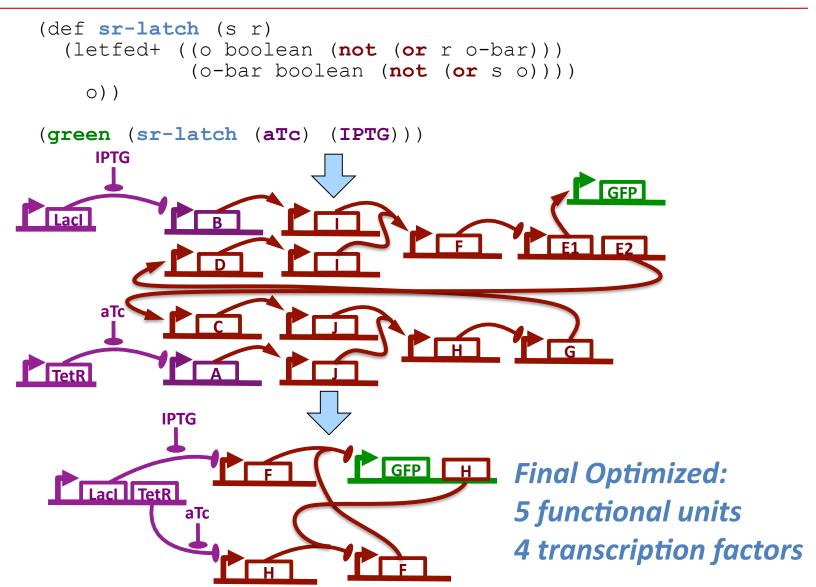


## BioCompiler: Proto → GRN





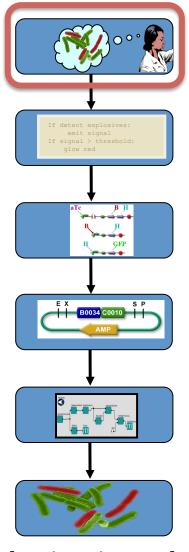
## Optimization of Complex Designs



Unoptimized: 15 functional units, 13 transcription factors



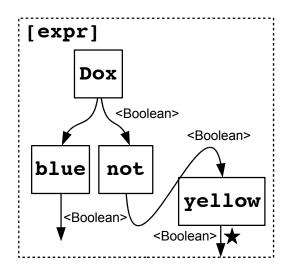
A high-level program of a system that reacts depending on sensor output

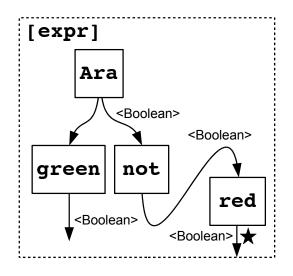


[Beal et al., 2012]

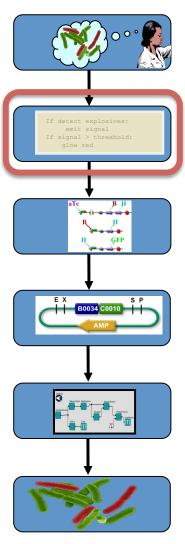


#### Program instantiated for two target platforms





E. coli Target

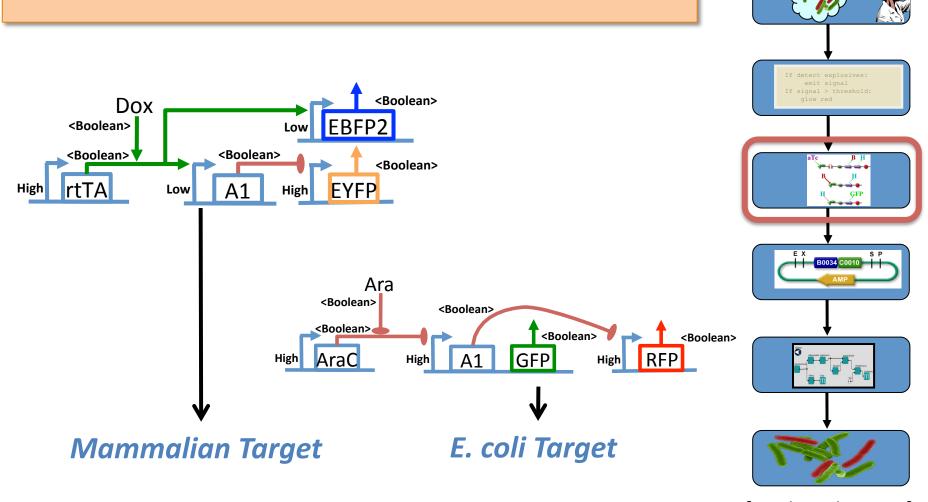


[Beal et al., 2012]

**Mammalian Target** 



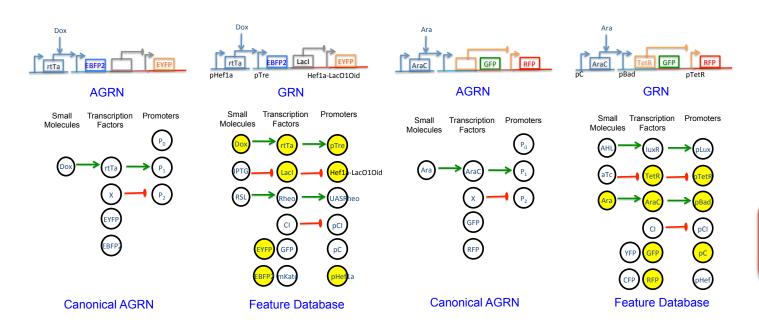
#### Abstract genetic regulatory networks



[Beal et al., 2012]



Automated part selection using database of known part behaviors



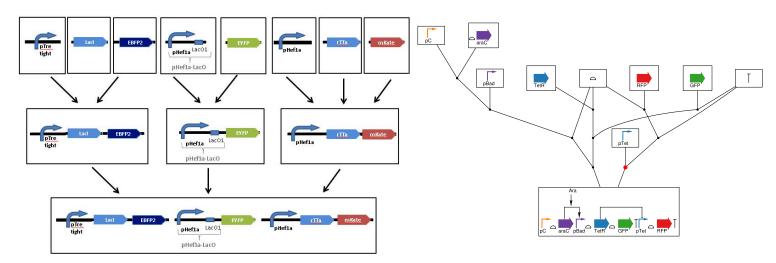
Mammalian Target

E. coli Target

[Beal et al., 2012]

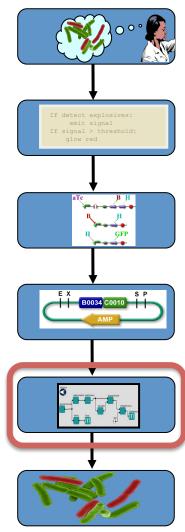


Automated assembly step selection for two different platform-specific assembly protocols



Mammalian Target

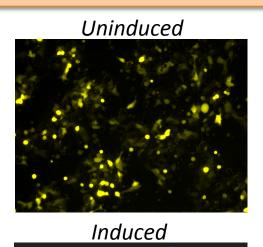
E. coli Target



[Beal et al., 2012]

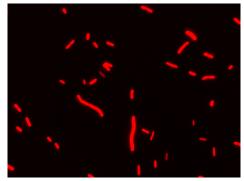


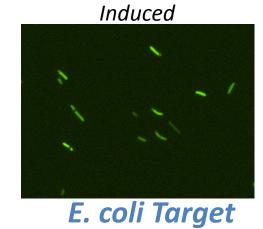
#### Resulting cells demonstrating expected behavior

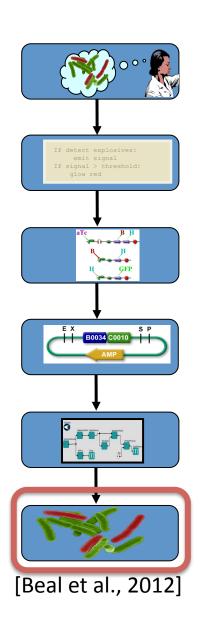












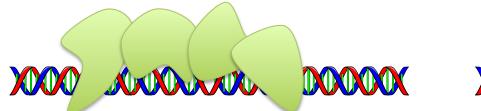


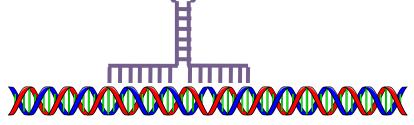
## Challenge: Synthetic Device Libraries

# Can use a device only once/circuit → need lots of devices!

Zinc-Finger Proteins:

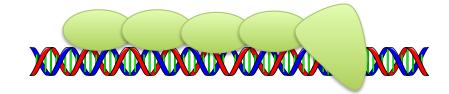


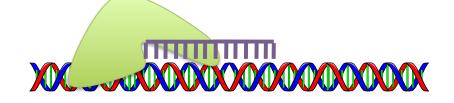




**TALE Proteins:** 

CRISPR: CAS/gRNA:



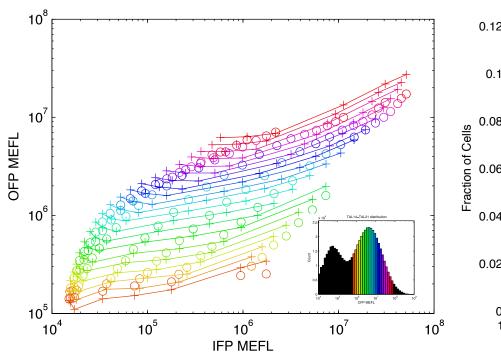




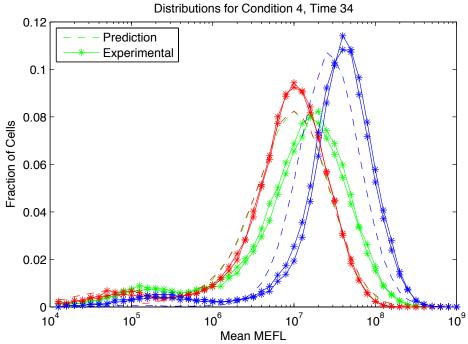
## Challenge: Predictable Composition

## Improved models & metrology

## → high-precision circuit prediction



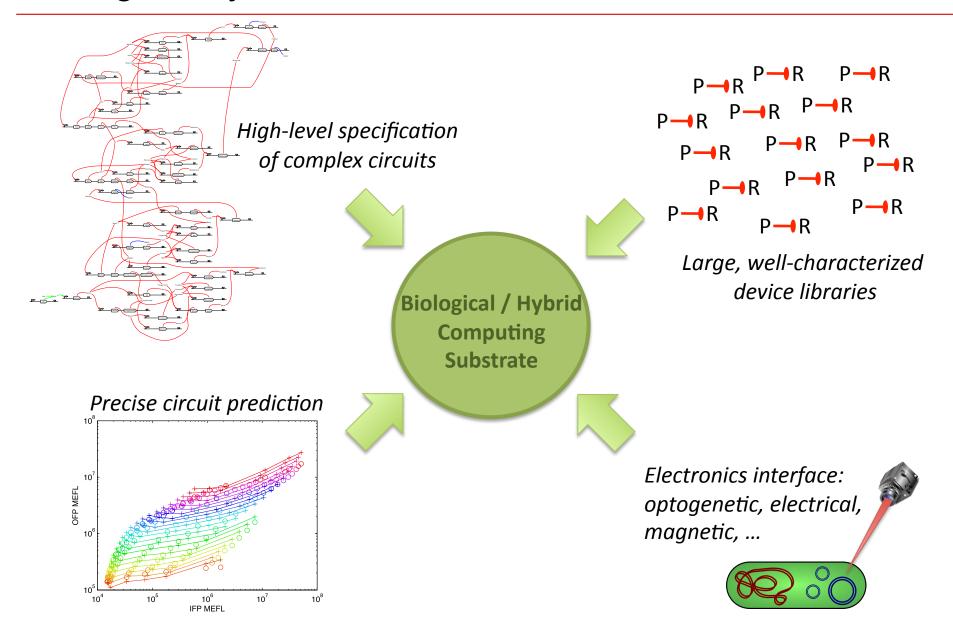
**Two-Repressor Cascade** 



Three-Replicon Mixture



## Biological/Hybrid Substrates: where we stand





- Major technological trends are all driving towards a world filled with spatial computers
- Continuous space-time models allow effective adaptive aggregate programming.
- Mixed-material computation will enable a wide range of visionary applications.
- Rapid progress towards predictable, scalable computational control of biological organisms

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Swapnil Bhatia

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Viktor Vasilev

Tyler Wagner



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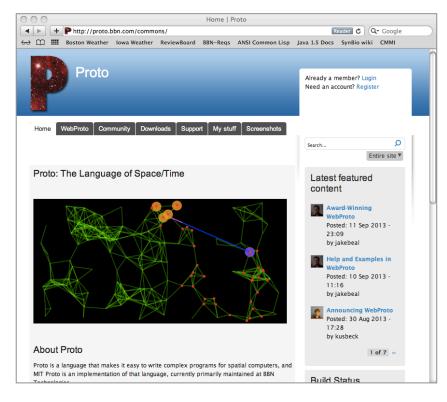
Ferruccio Damiani



#### Tools available online!



#### http://proto.bbn.com/



#### http://synbiotools.bbn.com

