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# Engineered Communications for Microbial Robotics

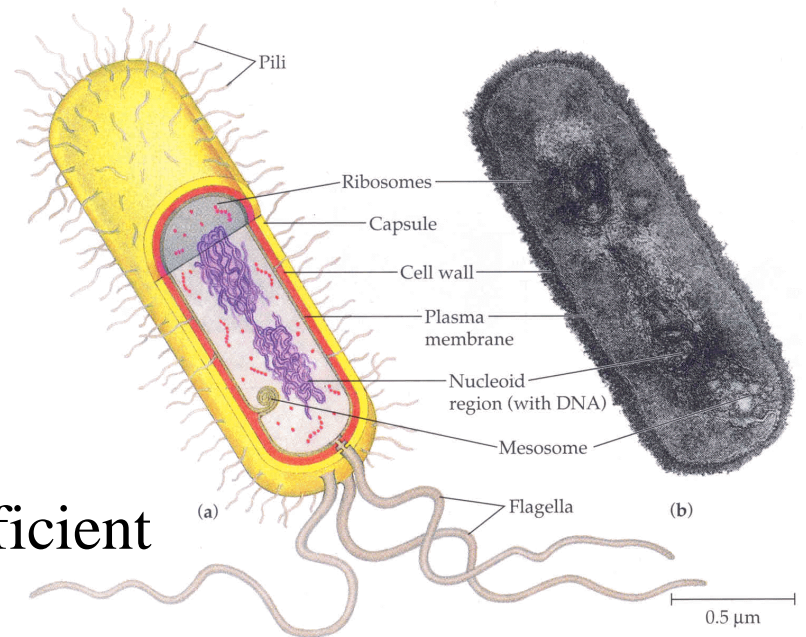
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# Microbial Robotics

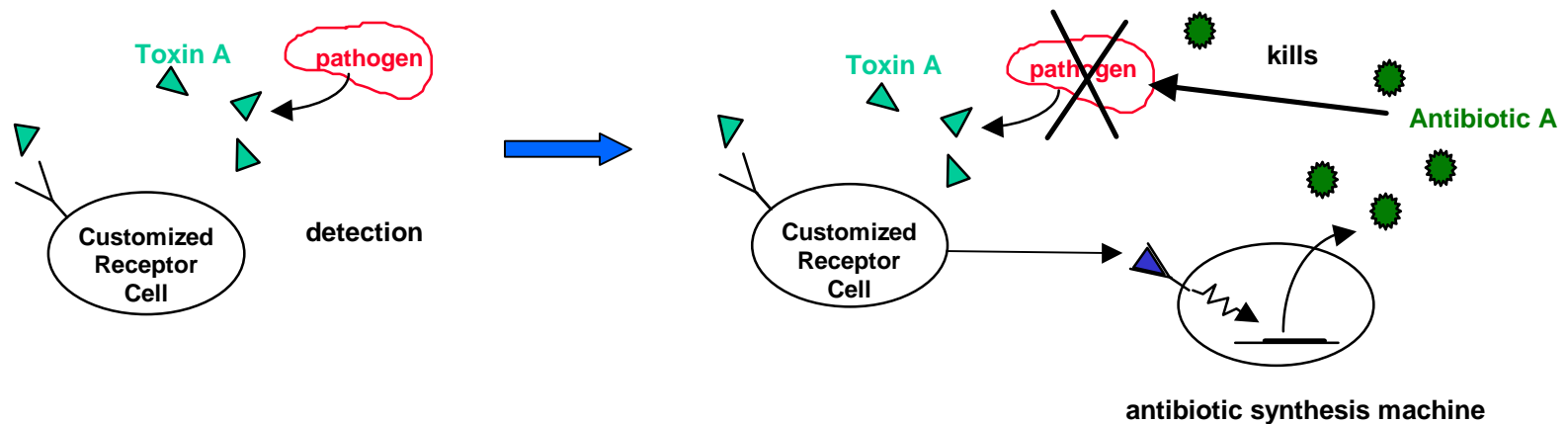
- Goal:  
*Design and implement cellular computers / robots using engineering principles*
- Special features of cells:
  - small, self-replicating, energy-efficient
- Why?
  - Biomedical applications
  - Environmental applications (sensors & effectors)
  - Embedded systems
  - Interface to chemical world
  - Molecular scale engineering



# Engineered Behavior

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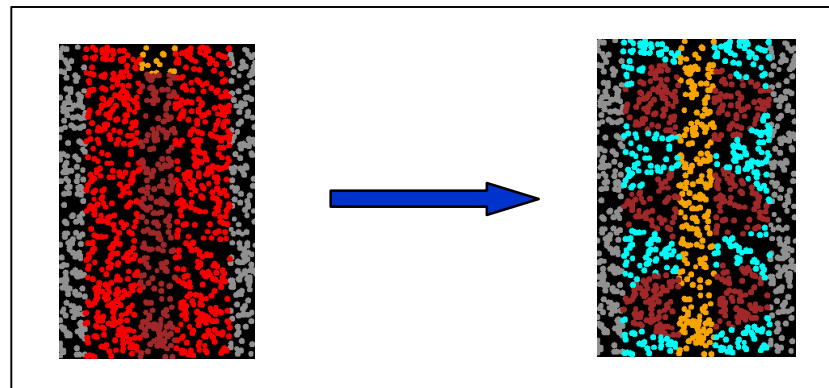
- Potential to engineer behavior into bacterial cells:
  - phototropic or magnetotropic response
  - control of flagellar motors
  - chemical sensing and engineered enzymatic release
  - selective protein expression
  - molecular scale fabrication
  - selective binding to membrane sites
  - collective behavior
    - autoinducers
    - slime molds
    - pattern formation
- Example: timed drug-delivery in response to toxins



# Communications

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- Cellular robotics requires
  - Intracellular control circuits
  - Intercellular signaling
- First, characterize communication components
- Engineer coordinated behavior using diffusion-based communications



Example of pattern generation in an amorphous substrate, using only diffusion-based signaling

- Demonstrate engineered communications using the lux Operon from *Vibrio fischeri*

# Outline

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- Previous Work
- Implementing computation & communications
  - Intracellular regulation of transcription
  - Intercellular regulation of protein activity
- Quorum sensing
- Experimental Results
- Conclusions

# Previous Work

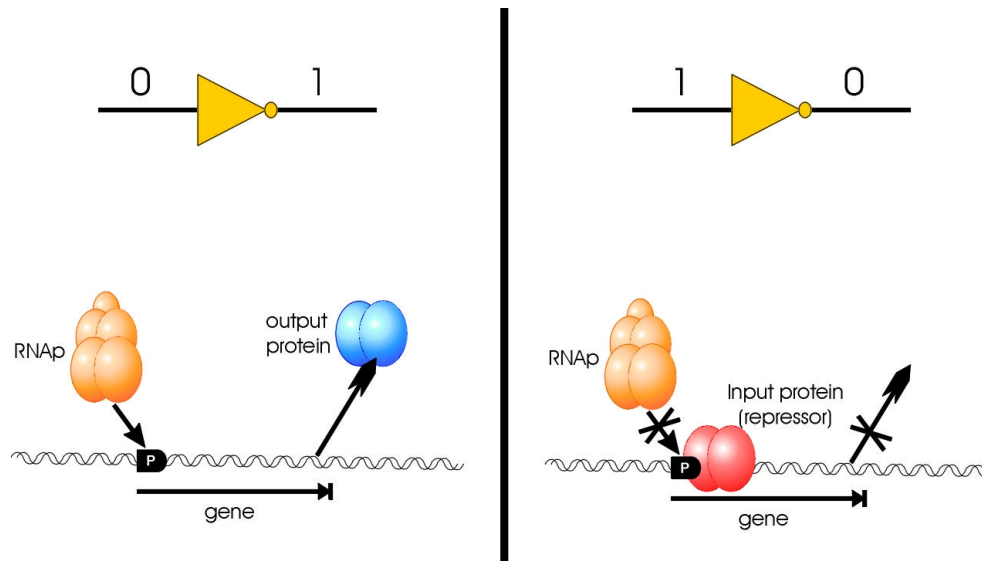
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- Cellular gate technology  
[Knight & Sussman, '98]
- Simulation & characterization of gates and circuits  
[Weiss, Homsy, Knight, '98, '99]
- Toggle Switch implementation  
[Gardner & Collins, '00]
- Ring Oscillator implementation  
[Elowitz & Leibler, '00]

# Intracellular Circuits: The Inverter

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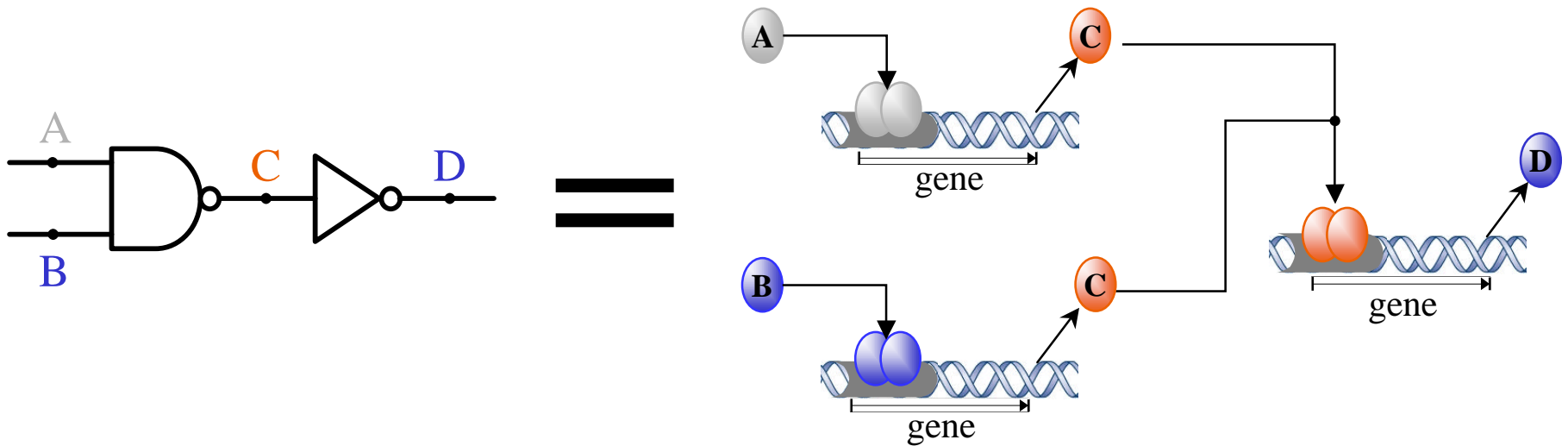
- *In-vivo* digital circuits:
  - signal = concentration of a specific protein
  - computation = regulated protein synthesis + decay
- The basic computational element is an **inverter**



➤ Allows building any (complex) digital circuit in individual cells

# Digital Logic Circuits

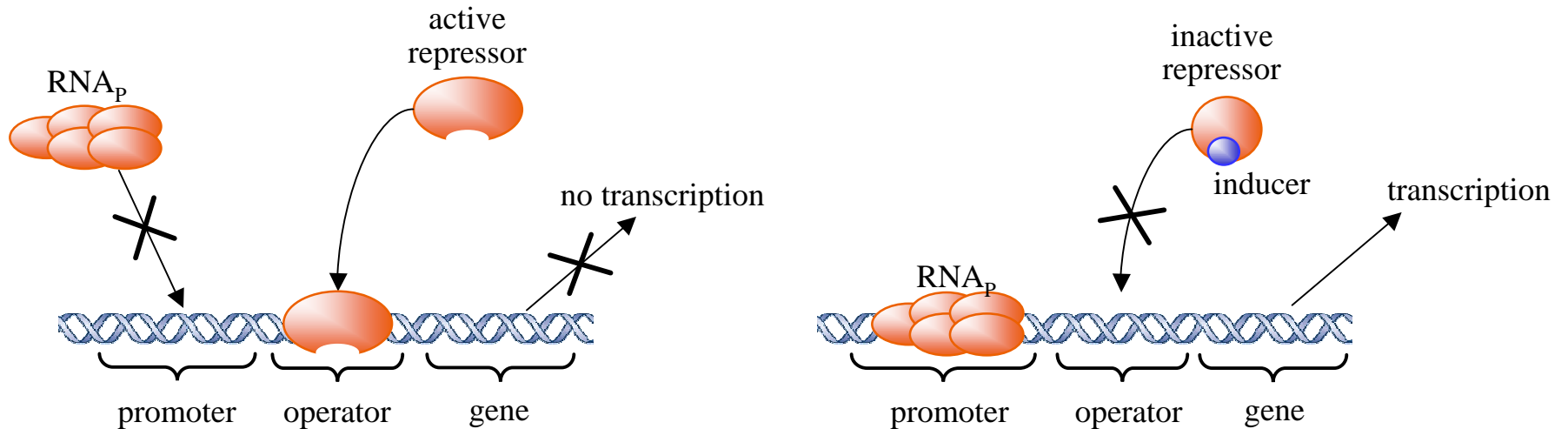
- With these inverters, any (finite) digital circuit can be built



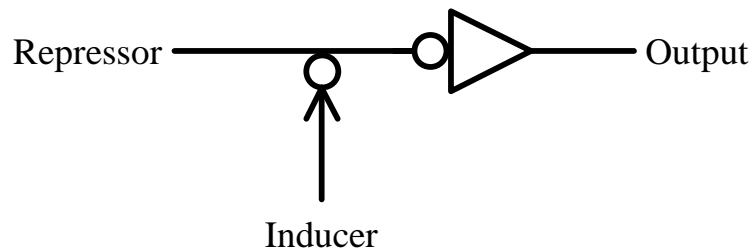
- proteins are the wires, genes are the gates
- NAND gate = “wire-OR” of two genes
- NAND gate is a universal logic element



# Repressors & Small Molecules

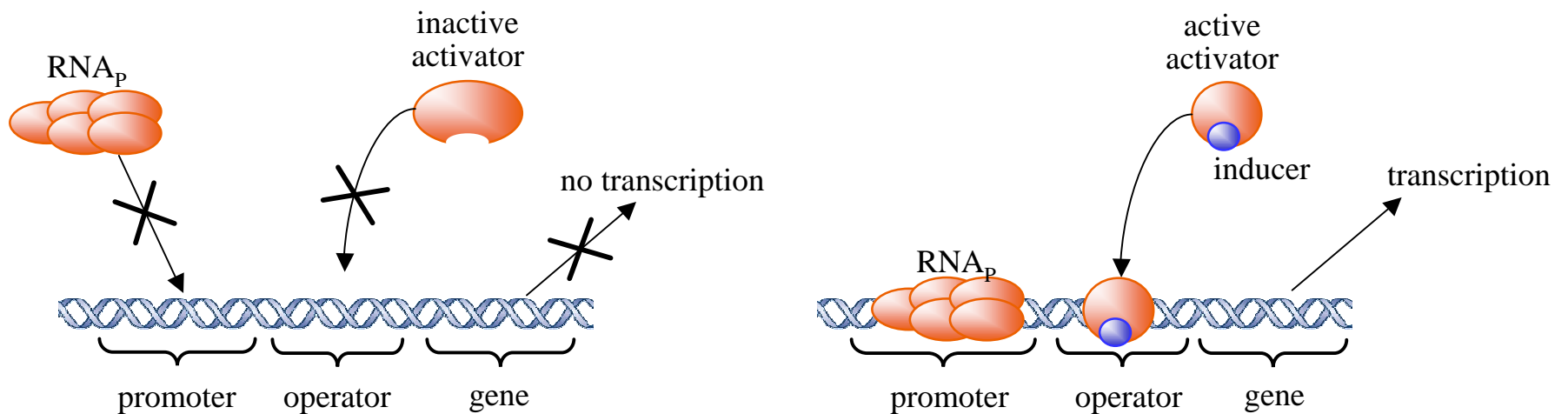


- **Inducers can inactivate repressors:**
  - IPTG (Isopropylthio-β-galactoside) → Lac repressor
  - aTc (Anhydrotetracycline) → Tet repressor
- **Use as a logical gate:**

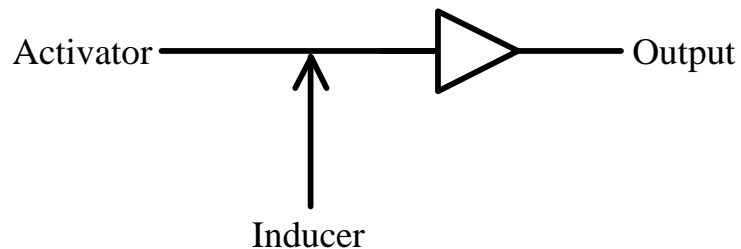


Repressor	Inducer	Output
0	0	1
0	1	1
1	0	0
1	1	1

# Activators & Small Molecules



- Inducers can also activate activators:
  - VAI (3-N-oxohexanoyl-L-Homoserine lacton) → luxR
- Use as a logical (AND) gate:



Activator	Inducer	Output
0	0	0
0	1	0
1	0	0
1	1	1

# Summary of Effectors

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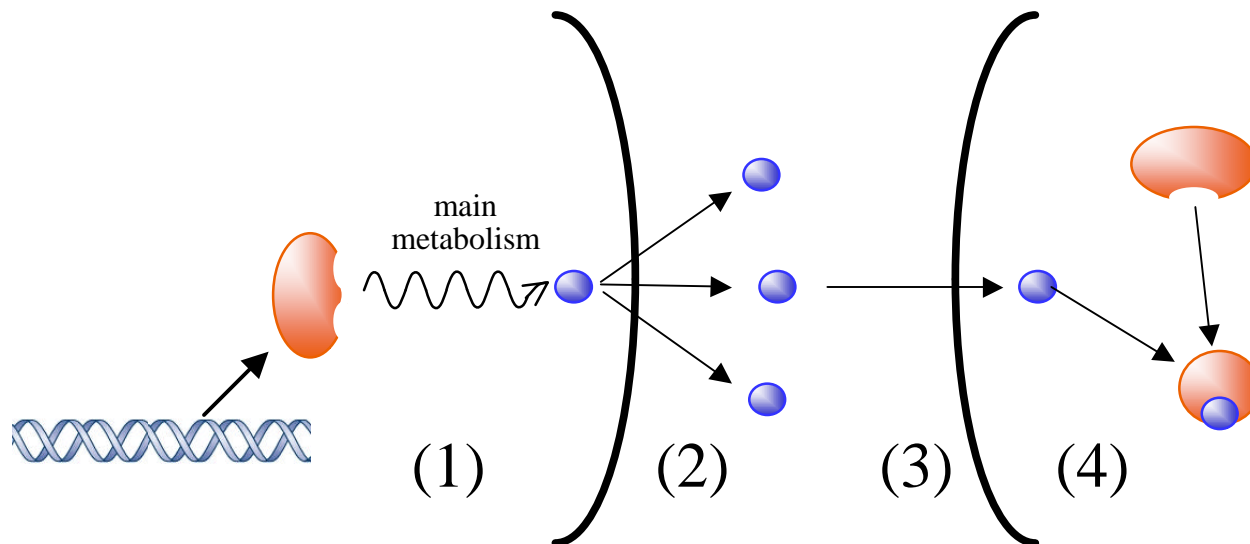
Protein : Effector		Effector present		Effector not present	
		binds DNA	transcription	binds DNA	transcription
inducers	TetR : aTc	+	-	-	+
	LuxR : VAI	-	-	+	+
co-repressors	TrpR : tryptophane	+	+	-	-
	? : ?	-	+	+	-

- Inducers and Co-repressors are termed effectors
- Reasons to use effectors:
  - faster intracellular interactions
  - intercellular communications

# Intercellular Communications

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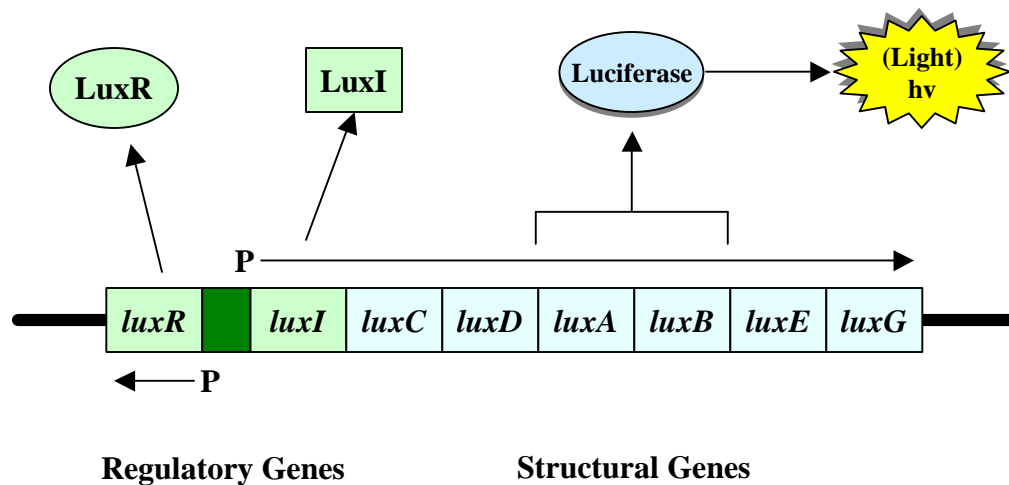
- Certain inducers useful for communications:
  1. A cell produces inducer
  2. Inducer diffuses outside the cell
  3. Inducer enters another cell
  4. Inducer interacts with repressor/activator → change signal



# Quorum Sensing

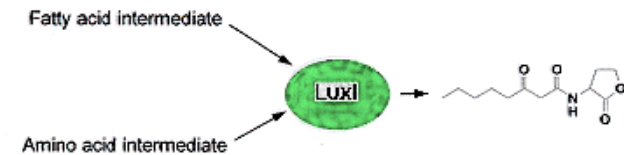
- Cell density dependent gene expression

Example: *Vibrio fischeri* [density dependent bioluminescence]



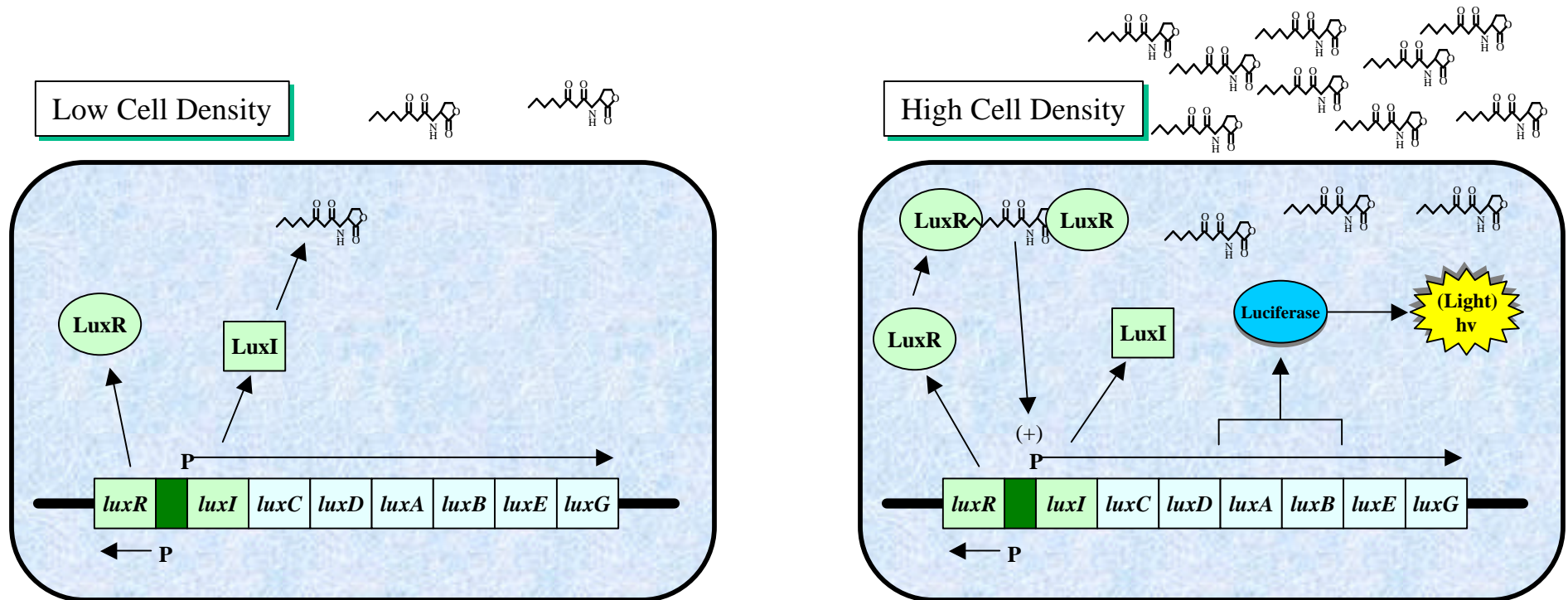
The lux Operon

LuxI converts some precursors into 3-N-oxohexanoyl-L-Homoserine lactone



LuxI metabolism  
 → *autoinducer* (VAI)

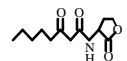
# Density Dependent Bioluminescence



free living, 10 cells/liter  
<0.8 photons/second/cell

symbiotic,  $10^{10}$  cells/liter  
800 photons/second/cell

➤ A positive feedback circuit



# Similar Signalling Systems

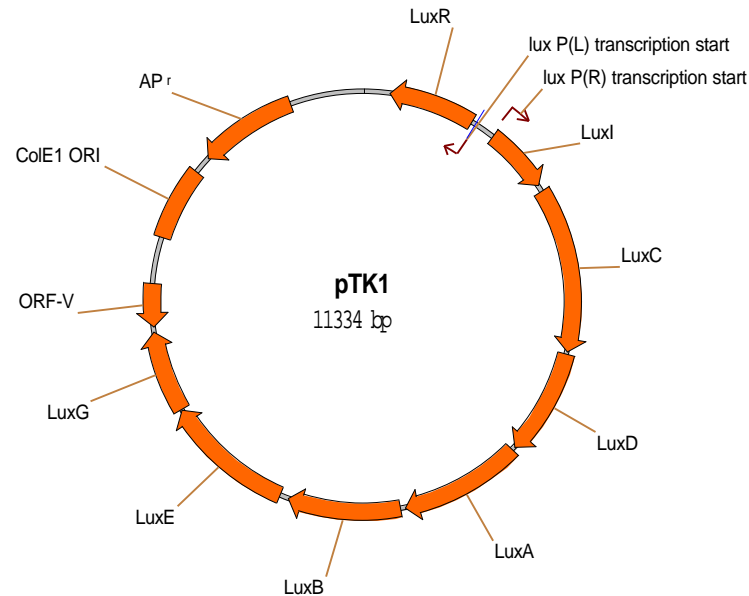
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## N-acyl-L-Homoserine Lactone Autoinducers in Bacteria

Species	Relation to Host	Regulate Production of	I Gene	R Gene
<i>Vibrio fischeri</i>	marine symbiont	Bioluminescence	<i>luxI</i>	<i>luxR</i>
<i>Vibrio harveyi</i>	marine symbiont	Bioluminescence	<i>luxL,M</i>	<i>luxN,P,Q</i>
<i>Pseudomonas aeruginosa</i>	Human pathogen	Virulence factors	<i>lasI</i>	<i>lasR</i>
		Rhamnolipids	<i>rhlI</i>	<i>rhlR</i>
<i>Yersinia enterocolitica</i>	Human pathogen	?	<i>yenI</i>	<i>yenR</i>
<i>Chromobacterium violaceum</i>	Human pathogen	Violaceum production Hemolysin Exoprotease	<i>cviI</i>	<i>cviR</i>
<i>Enterobacter agglomerans</i>	Human pathogen	?	<i>eagI</i>	?
<i>Agrobacterium tumefaciens</i>	Plant pathogen	Ti plasmid conjugation	<i>traI</i>	<i>traR</i>
<i>Erwinia caratovora</i>	Plant pathogen	Virulence factors Carbapenem production	<i>expI</i>	<i>expR</i>
<i>Erwinia stewartii</i>	Plant pathogen	Extracellular Capsule	<i>esaI</i>	<i>esaR</i>
<i>Rhizobium leguminosarum</i>	Plant symbiont	Rhizome interactions	<i>rhiI</i>	<i>rhiR</i>
<i>Pseudomonas aureofaciens</i>	Plant beneficial	Phenazine production	<i>phzI</i>	<i>phzR</i>

# Cloning the lux Operon into E. coli

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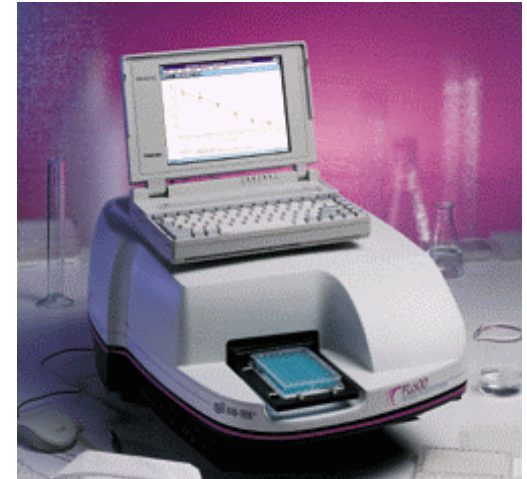


- First, we shotgun cloned the lux Operon from *Vibrio fischeri* to form plasmid pTK1
- Sequenced the operon [Genbank entry AF170104] (thanks to Nick Papadakis)
- Expressed in E. coli DH5a → showed bioluminescence



# Experimental Setup

- BIO-TEK FL600  
Microplate Fluorescence Reader

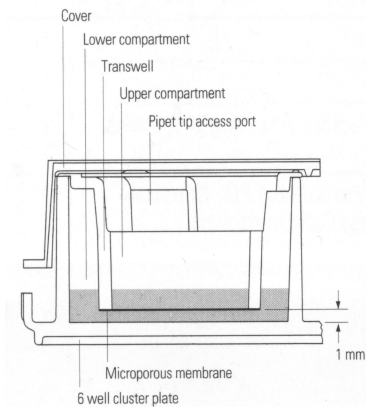


- Costar Transwell microplates and cell culture inserts with permeable membrane (0.1 $\mu$ m pores)



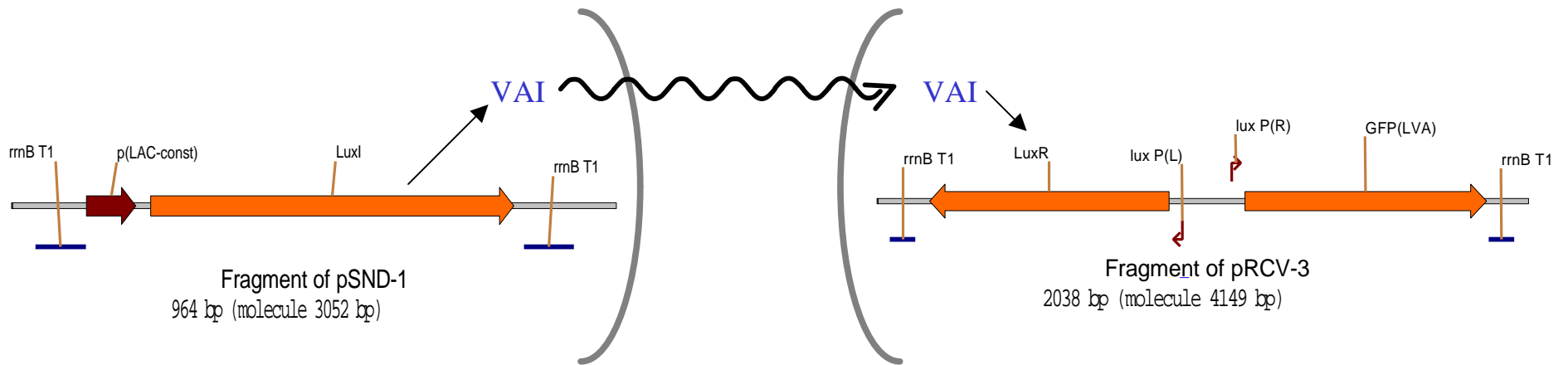
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- Cells separated by function:
  - Sender cells in the bottom well
  - Receiver cells in the top well
- Top excitation and emission fluorescence readings

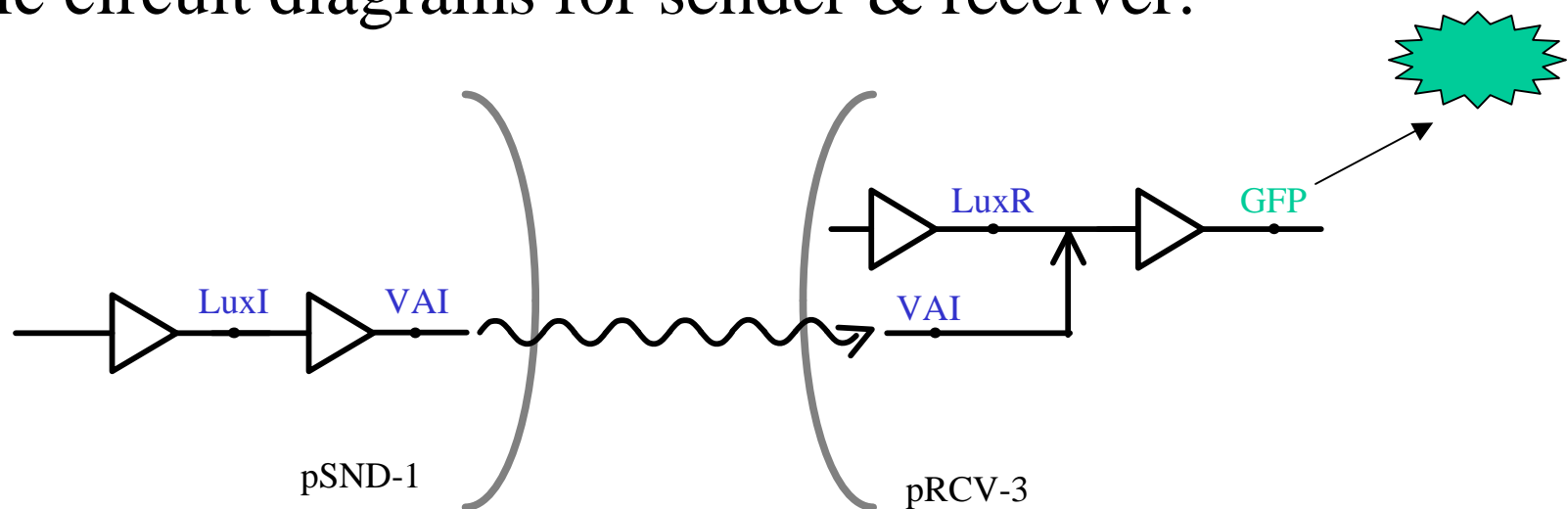


# Experiment I: Constant Signaling

- Genetic networks for sender & receiver:

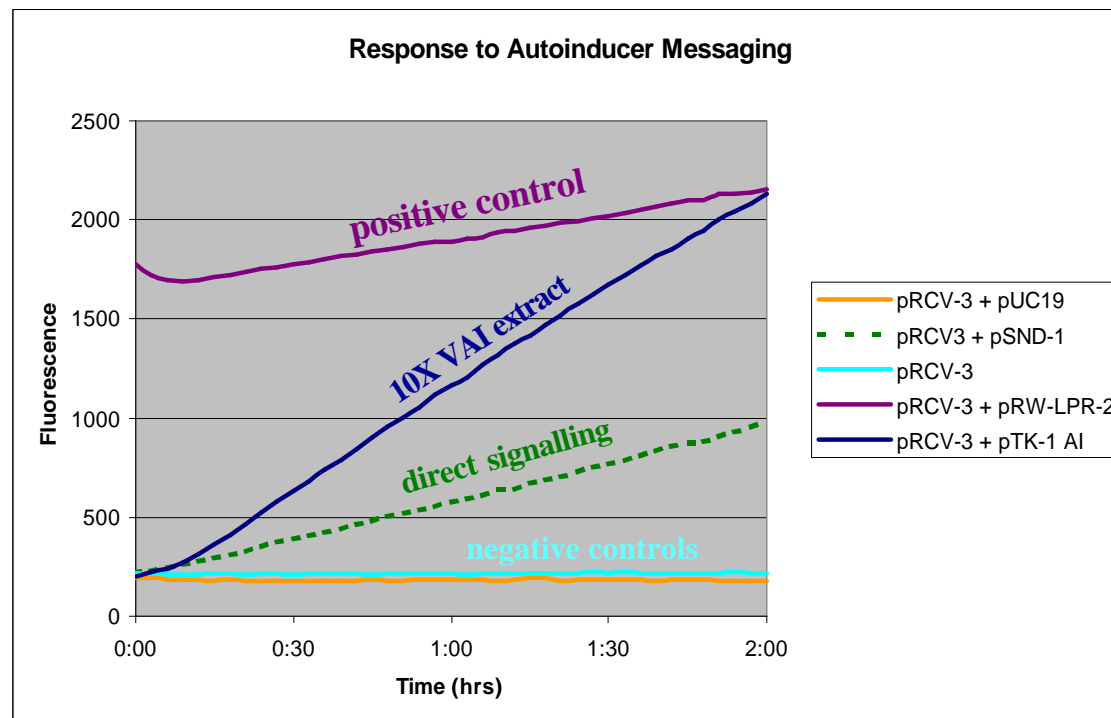


- Logic circuit diagrams for sender & receiver:



# Experiment I: Constant Signalling

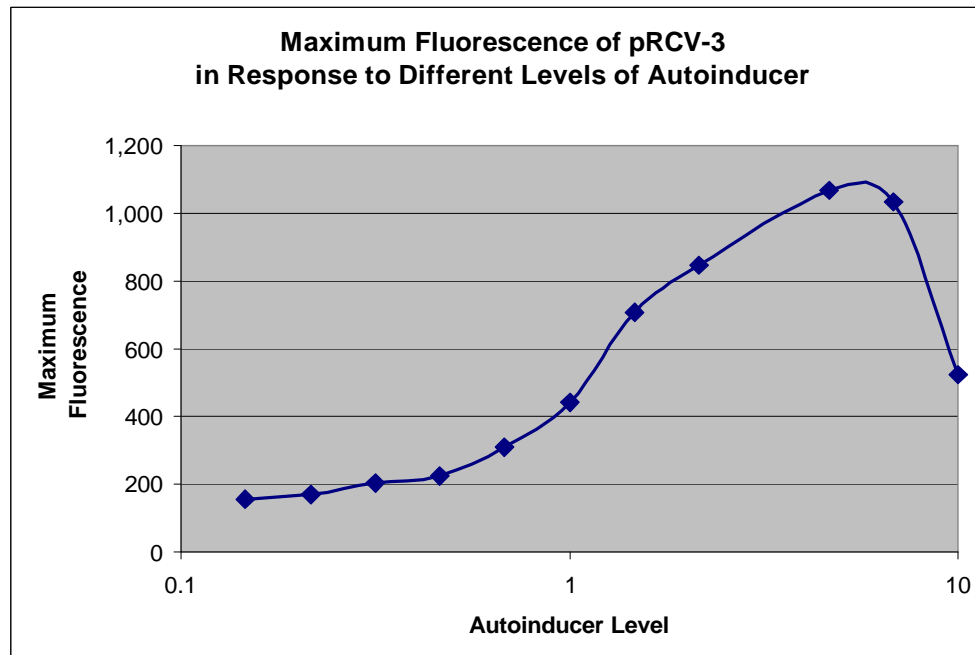
- Figure shows fluorescence response of receiver (pRCV-3)
  - Several cultures grown separately overnight @37°C
  - Cultures mixed in 5 different ways and incubated in FL600 @37°C
  - Fluorescence readings taken every 5 minutes for 2 hours



# Experiment II: Characterizing the Receiver

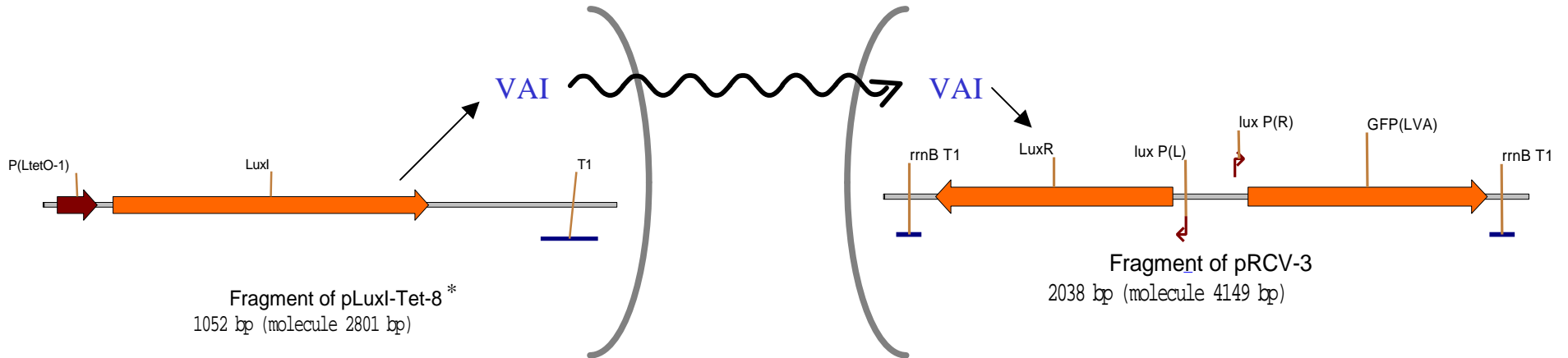
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- Figure shows response of receiver to different levels of VAI
  - VAI extracted from pTK1 culture
  - Receiver cells (pRCV-3) grown @37°C to late log phase
  - Receiver cells incubated in FL600 for 6 hours @37°C with VAI
  - Data shows max fluorescence for each different VAI level



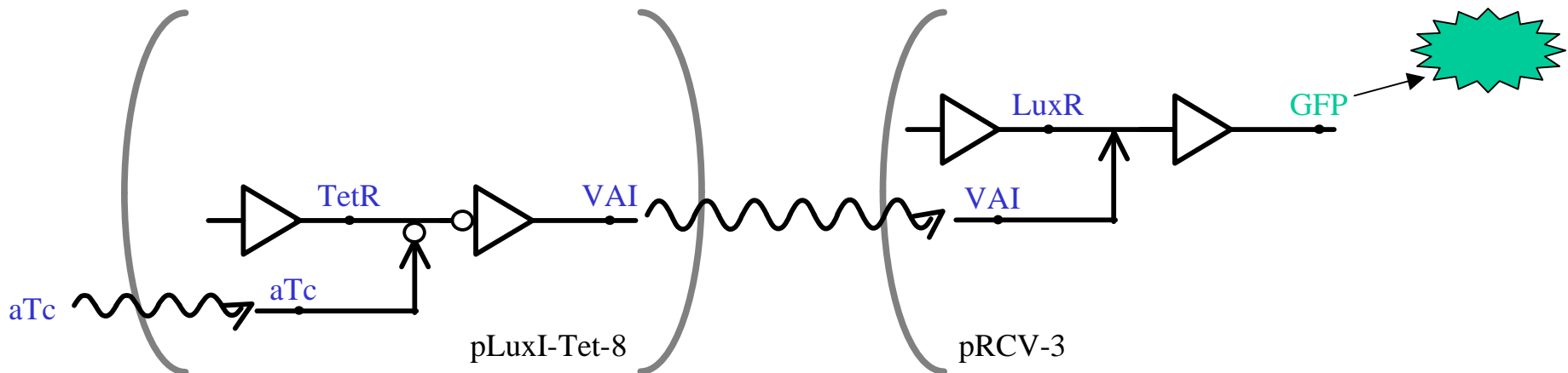
# Experiment III: Controlled Sender

- Genetic networks for controlled sender & receiver:



\* E. coli strain expresses TetR (not shown)

- Logic circuit diagrams for controlled sender & receiver:





# Conclusions & Future Work

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- This work:
  - Isolated an important intercellular communications mechanism
  - Analyzed its components
  - Engineered its interfaces with standard genetic control and reporter mechanisms
- Future:
  - Additional analysis of lux characteristics
  - Examine and incorporate additional, non-cross reacting, communications systems
  - Integrate communications with more sophisticated in-vivo circuits
  - Engineer coordinated behavior (e.g. to form patterns)