

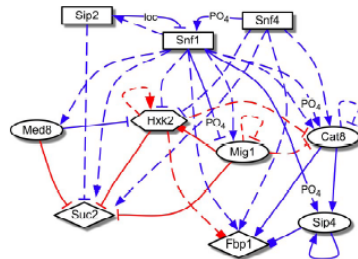
Don't be so specific:

exploiting diversity in synthesis to fast-track  
synthetic biology

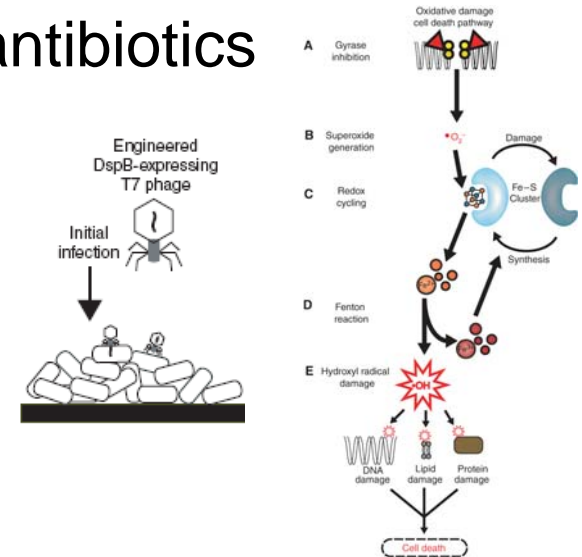


**Tom Ellis**

Jim Collins Group, Boston University

[illegible]

## antibiotics

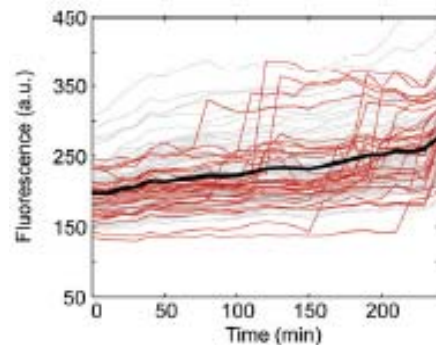


vibrating  
insoles

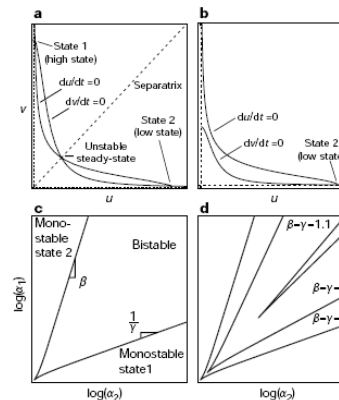


**Collins Lab**  
**Boston University**

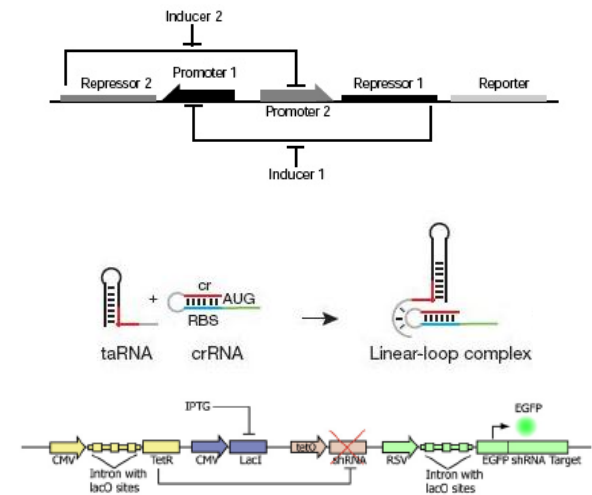
noise



# modeling



# synthetic biology




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## Brewing with Synthetic Biology

April 23rd, 2009 by Jabba



Synthetic biology rests on the hope that biological "parts" like DNA and proteins can be engineered and assembled just like a machine or computer circuit, but the field still

"While we may not fully understand the terminology and the processes involved, we do know that Collins has used the technology to brew beer. Really good beer."

"We love the idea of this RoboBeer, but they'd better not start toying around with PBR."

Sunrise Post, 26-4-09

# What is Synthetic Biology?

a new area of biological research that combines **science** and **engineering** in order to **design and build** ("synthesize") novel biological functions and systems

source: wikipedia

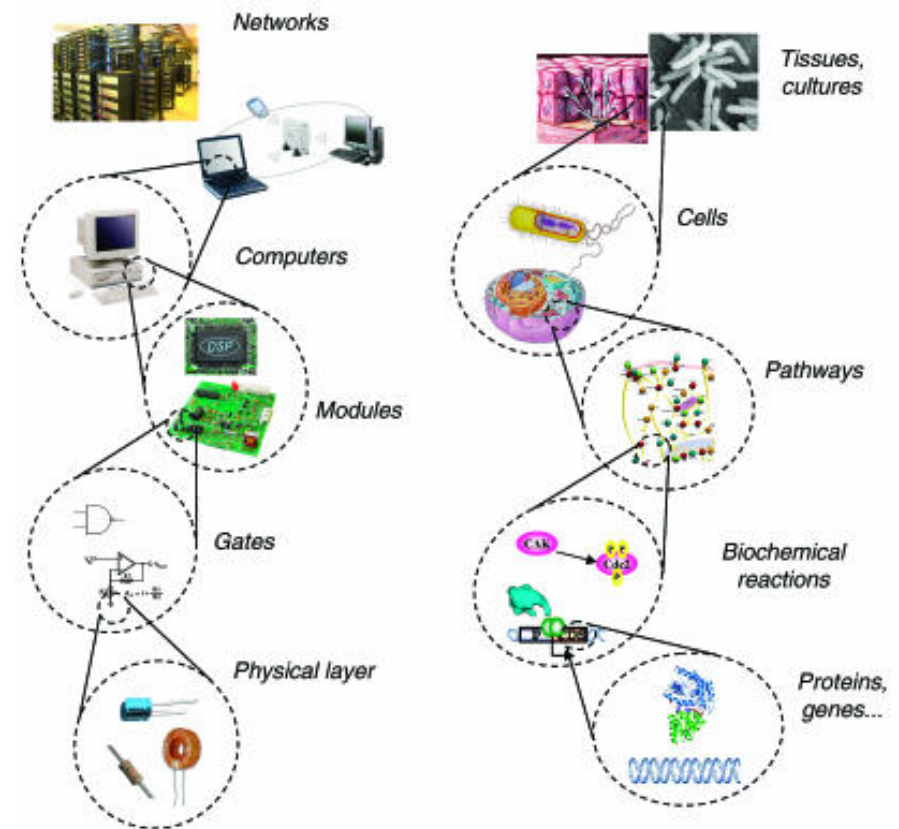
Constructing novel gene networks

Investigating biology by building  
and modeling equivalent systems

Synthesizing entirely new biomolecules

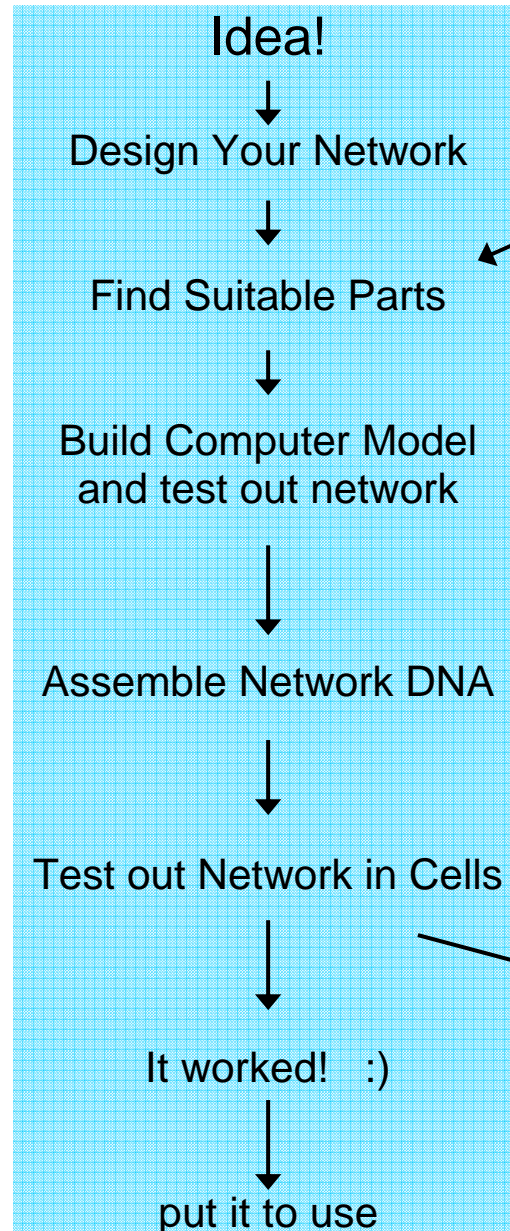
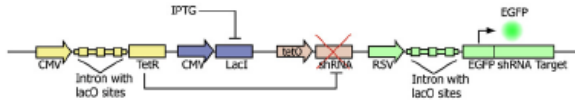
Rewriting genomes

Building new life

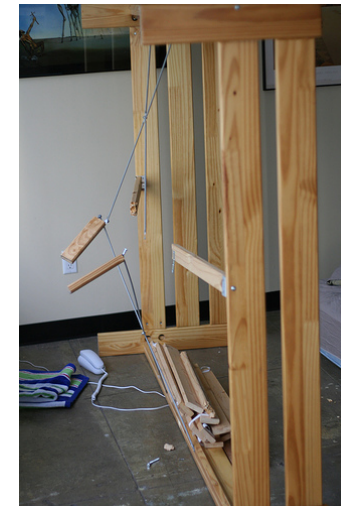


Andrianantoandro E et al, 2006

# Building gene networks - everyone's favourite part of synthetic biology



Name	Description	Promoter Sequence
Bla_11001	Las cascade right promoter	tggtatgttgatctcttggcgggata
Bla_112001	Promoter (P100)	gatttcggttgatgacacacacacacacac
Bla_112006	Modified lambda Pm promoter (repressed by 434 c)	cttccacacacacacacacacacacacac
Bla_112036	Modified lambda Pm promoter (cooperative repression by 434 c)	cttgcgttgatgacacacacacacacac
Bla_112040	Modified lambda P100 promoter -10 region from P10 and cooperatively repressed by 434 c	cttgcgttgatgacacacacacacacac
Bla_112112	TetR - TetR-4C heterodimer promoter (negative)	acttgcgttgatgacacacacacacacac
Bla_114015	P100 TetO	cttgcgttgatgacacacacacacacac
Bla_114016	P100 CIO	cttgcgttgatgacacacacacacacac
Bla_114032	promoter P100 CIO	cttgcgttgatgacacacacacacacac
Bla_114039	CR21 dP100 and P100	cttgcgttgatgacacacacacacacac
Bla_114034	BlaC1000_C1000	cttgcgttgatgacacacacacacacac
Bla_114030	Hybrid gLac with C1000 mutation	cttgcgttgatgacacacacacacacac
Bla_114018	deAp promoter	cttgcgttgatgacacacacacacacac
Bla_114004	FacA promoter	cttgcgttgatgacacacacacacacac
Bla_114005	NOT Gate Promoter Family Member (D0010144)	cttgcgttgatgacacacacacacacac
Bla_114006	NOT Gate Promoter Family Member (D001011)	cttgcgttgatgacacacacacacacac
Bla_114007	NOT Gate Promoter Family Member (D001022)	cttgcgttgatgacacacacacacacac
Bla_114008	NOT Gate Promoter Family Member (D001023)	cttgcgttgatgacacacacacacacac



:( doesn't work



# Systems often don't work first time



**London Heathrow  
Terminal 5**

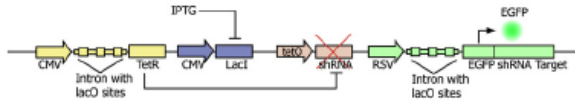
**What went wrong?**



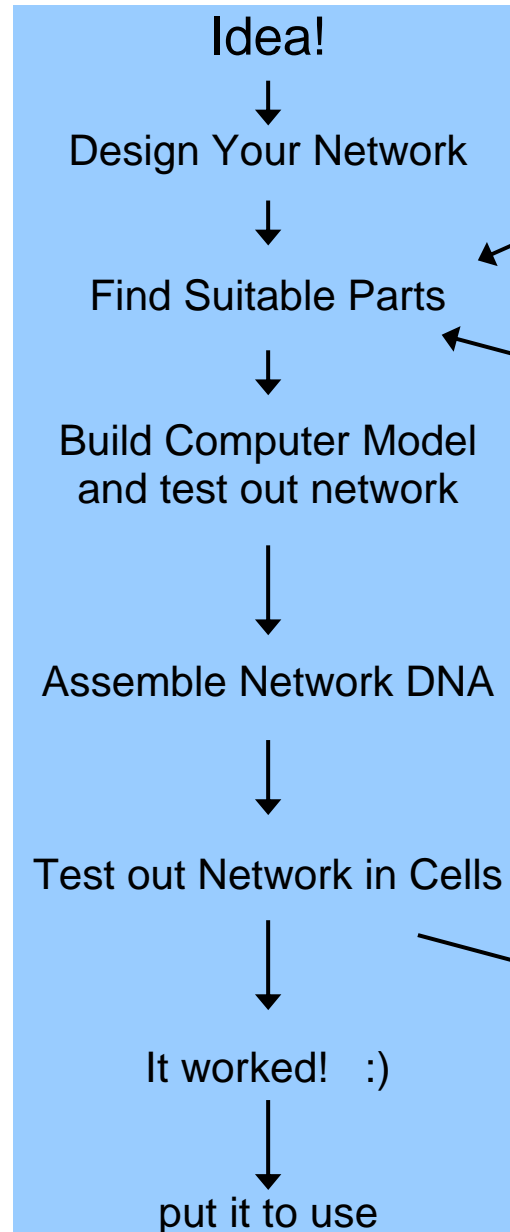
**London Millennium Bridge**

**Retrofitted**

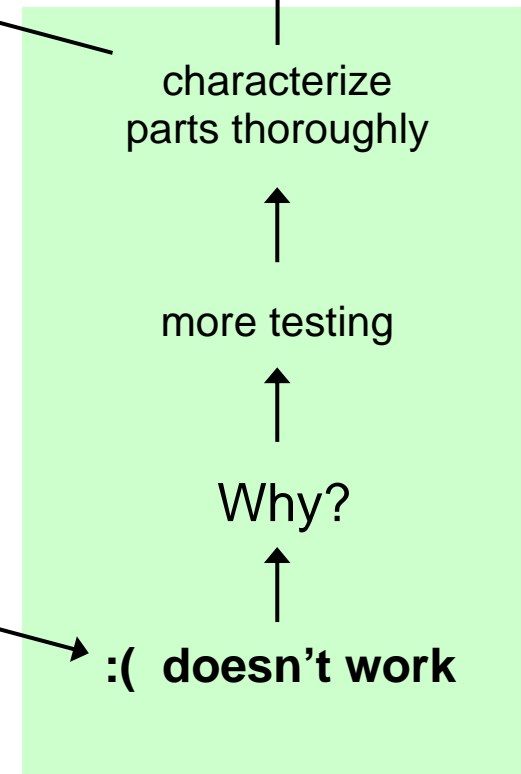
# Building gene networks - everyone's favourite part of synthetic biology



idea – hour  
model – week  
network – year



Name	Description	Promoter Sequence
Bla_J1001	Low cassette right promoter	tgtagtgcgactacatctggtggtgata
Bla_J12001	Promoter (P1004)	gatttcgctgtagtgcgactacatctggtgata
Bla_J12006	Modified lambda Pm promoter (repressed by 434 c)	cttcaactctgtagtgcgactacatctggtgata
Bla_J12036	Modified lambda Pm promoter (cooperative repression by 434 c)	cttgcgactacatctggtgata
Bla_J12040	Modified lambda P100 promoter -10 region from P102 and cooperatively repressed by 434 c	cttgcgactacatctggtgata
Bla_J12212	TetR - TetR-4C heterodimer promoter (negative)	actgtagtgcgactacatctggtgata
Bla_J14015	P1002 TetO	cttgcgactacatctggtgata
Bla_J14016	P1002 C/O	cttgcgactacatctggtgata
Bla_J14032	promoter P1002 C/O	cttgcgactacatctggtgata
Bla_J14039	CR2 of P1002 and P1002	cttgcgactacatctggtgata
Bla_J14034	BlaA_C1000_C1000	cttgcgactacatctggtgata
Bla_J170003	Hybrid gLac with UV5 mutation	cttgcgactacatctggtgata
Bla_J170016	deAp promoter	cttgcgactacatctggtgata
Bla_J170104	FacA promoter	cttgcgactacatctggtgata
Bla_J172205	NOT Gate Promoter Family Member (D0010144)	gatttcgctgtagtgcgactacatctggtgata
Bla_J172201	NOT Gate Promoter Family Member (D001011)	gatttcgctgtagtgcgactacatctggtgata
Bla_J172202	NOT Gate Promoter Family Member (D001022)	gatttcgctgtagtgcgactacatctggtgata
Bla_J172203	NOT Gate Promoter Family Member (D001023)	gatttcgctgtagtgcgactacatctggtgata

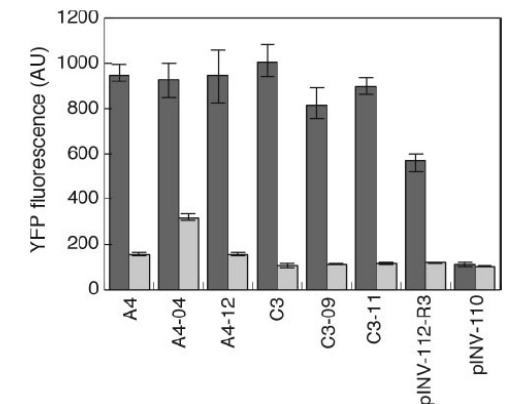
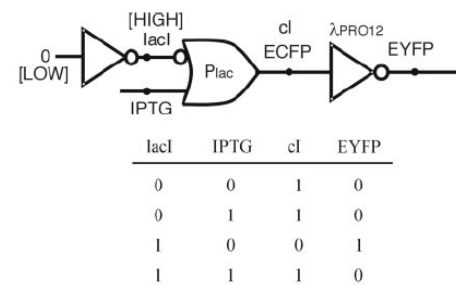
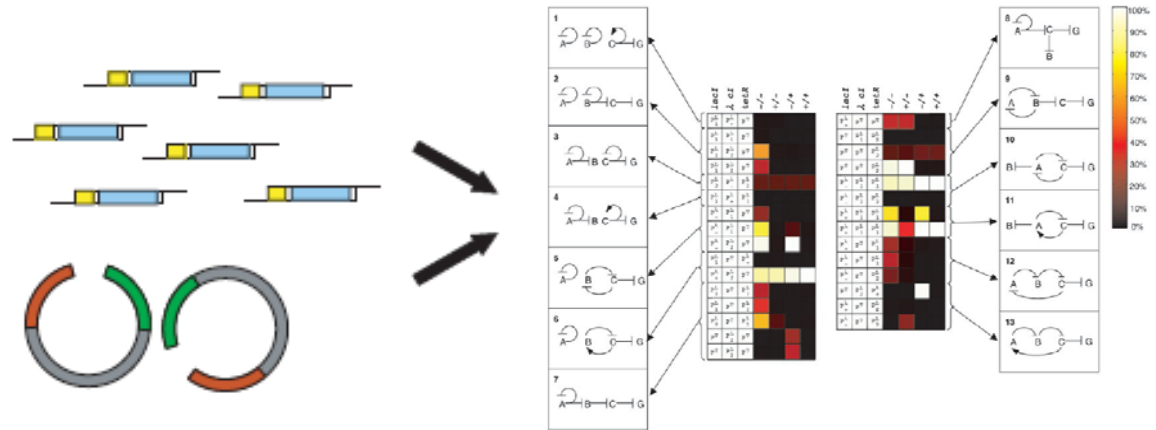


debugging

# Alternative Approaches

Module shuffling –  
Guet et al, 2002

Directed evolution –  
Yokobayashi et al, 2002



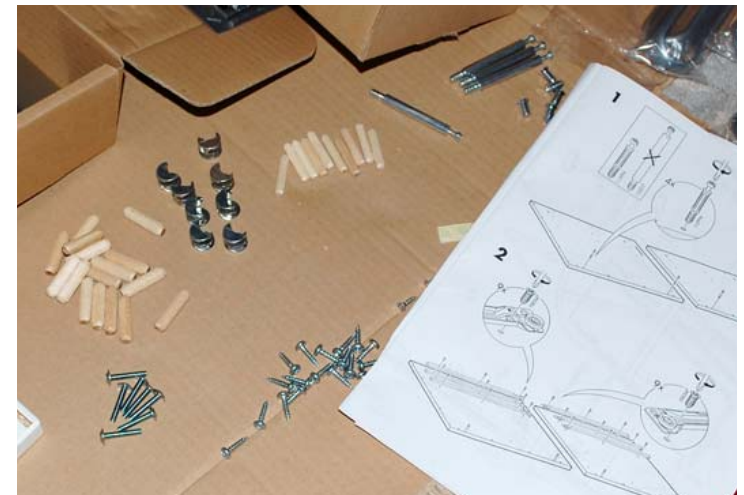
A role for **diversity** in synthetic biology

But...

These use diversity after model design

Can't we introduce diversity before design?

Think of a set of screws







**1. Make libraries of parts using diversity**

**2. Make models of intended networks**

**3. Input library data into models**

**Models act as a guide - selecting the best library parts  
for the output function needed**

**Construct the intended networks (and use them)**

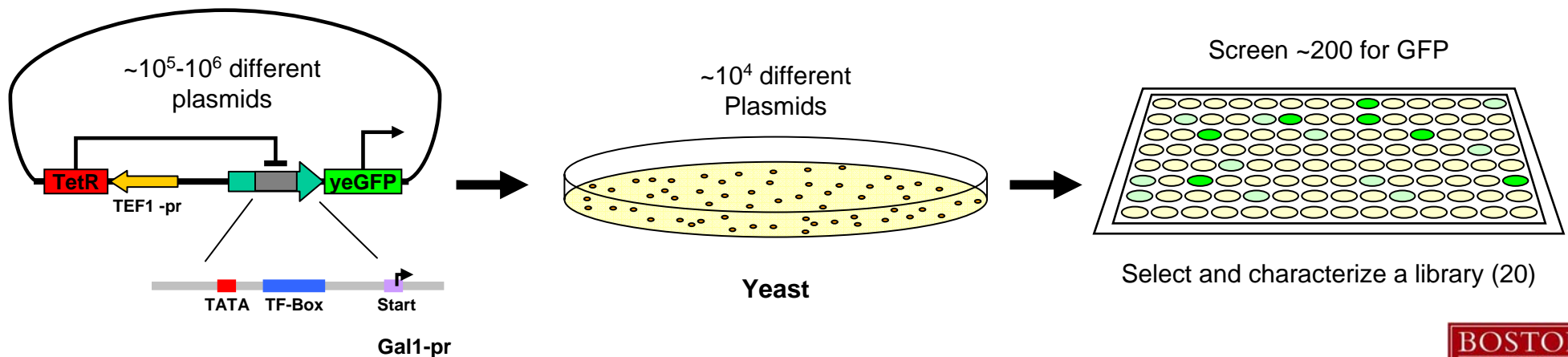
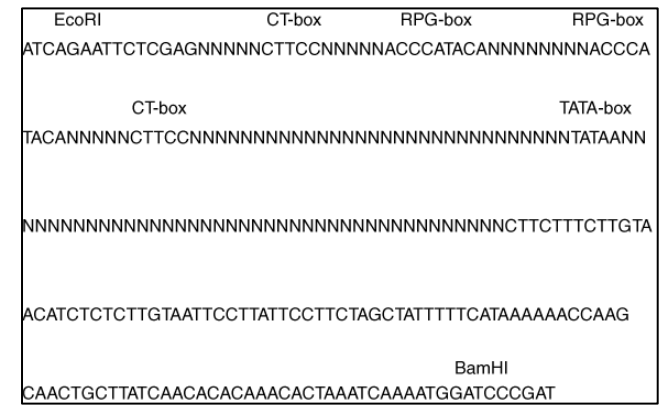
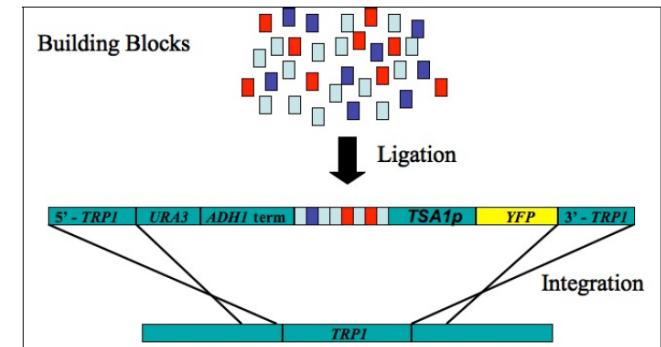
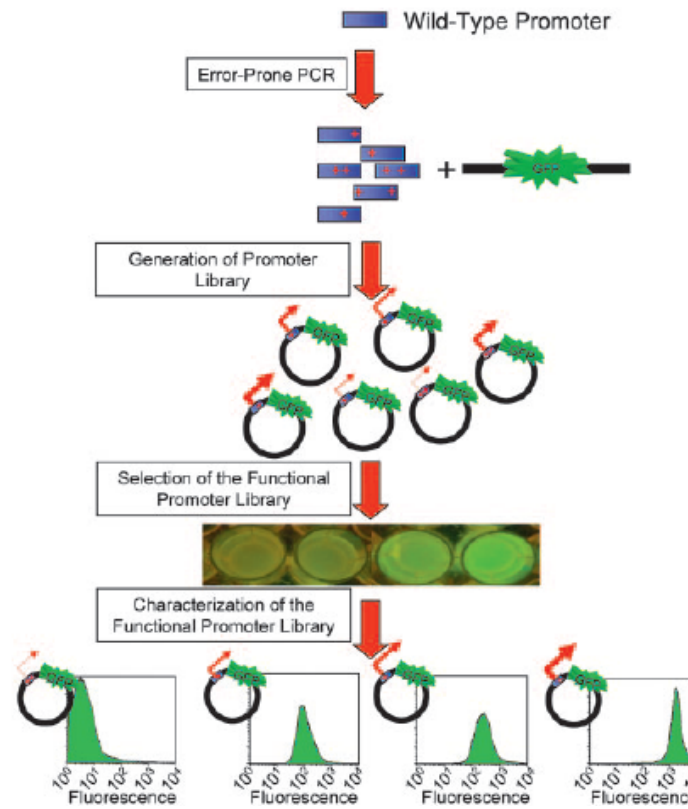
**Bypass debugging**

## Synthesis techniques:

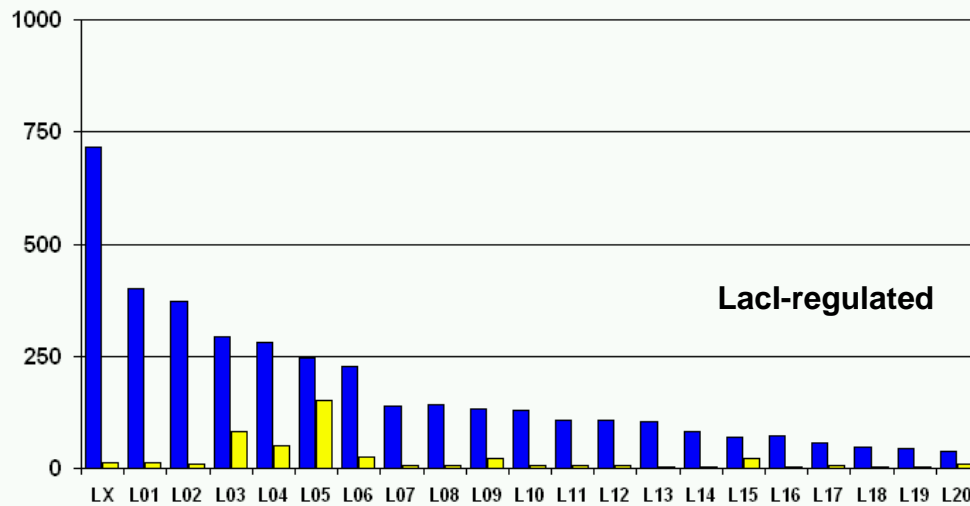
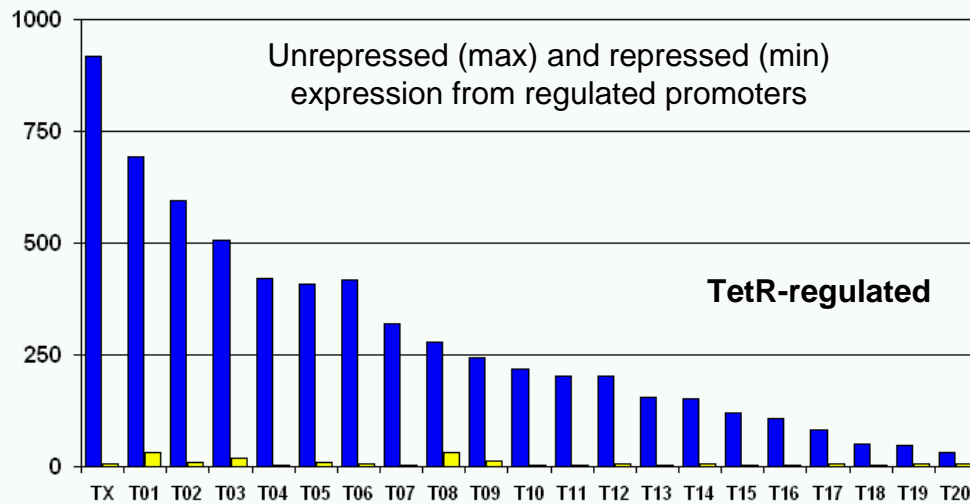
- By DNA shuffling  
Elowitz/Cohen
- By Mutation:  
Alper & Stephanopolous
- **By Synthesis:**  
**Jensen & Hammer**

Made using oligos  
Include regulation sites  
Uses *de novo* design

## Characterizing in parallel



# Regulated Promoter Libraries



Range of  $S_{\min}$  and  $S_{\max}$   
= range of input and output



## TetR-regulated promoters

Promoter	Max Output	error	Min Output	error
TX	918.00	33.83	7.46	0.46
T01	694.23	19.89	32.79	2.58
T02	595.79	17.07	8.38	0.50
T03	506.31	27.48	20.22	2.16
T04	421.78	5.83	3.26	0.16
T05	408.04	22.91	9.87	0.41
T06	418.60	16.63	6.46	1.68
T07	319.66	13.41	3.04	0.15
T08	277.75	12.94	30.88	1.75
T09	244.21	11.79	11.34	0.62
T10	216.99	7.34	3.27	0.18
T11	203.14	6.90	3.41	0.18
T12	201.76	3.75	7.08	0.53
T13	154.46	12.15	4.01	0.23
T14	151.03	10.36	6.42	0.19
T15	118.93	5.85	4.62	0.19
T16	108.22	3.40	3.71	0.13
T17	81.70	3.39	5.91	0.27
T18	51.75	3.27	3.26	0.25
T19	48.29	1.10	5.13	0.89
T20	30.69	0.40	6.95	0.45
TEF1	287.38	14.38		

## LacI-regulated promoters

Promoter	Max Output	error	Min Output	error
LX	717.38	21.06	13.06	0.77
L01	399.90	25.02	11.11	0.60
L02	372.59	16.87	9.71	0.11
L03	292.11	11.60	83.05	1.09
L04	282.01	13.61	50.55	1.92
L05	246.73	6.42	151.75	2.77
L06	228.45	15.37	23.79	0.31
L07	139.99	8.43	5.40	0.35
L08	141.86	6.23	7.67	0.35
L09	134.04	9.73	23.54	1.55
L10	129.13	8.04	4.96	0.30
L11	108.27	4.18	5.74	0.45
L12	107.35	4.73	5.07	0.36
L13	103.58	9.54	4.37	0.29
L14	82.32	1.50	4.15	0.23
L15	70.91	4.42	20.83	0.96
L16	72.03	3.05	4.28	0.23
L17	56.97	1.77	5.15	0.36
L18	47.16	1.33	3.91	0.28
L19	44.10	2.25	4.25	0.20
L20	37.08	2.12	9.41	0.69

TN  
TX  
T01  
T02  
T03  
T04  
T05  
T06  
T07  
T08  
T09  
T10  
T11  
T12  
T13  
T14  
T15  
T16  
T17  
T18  
T19  
T20

TATA *tetO<sub>2</sub>* *tetO<sub>2</sub>*

## Start

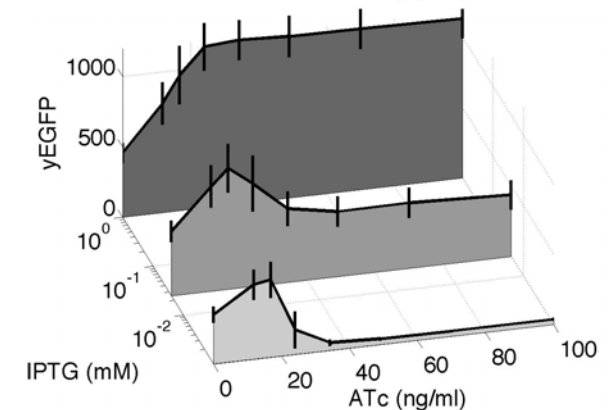
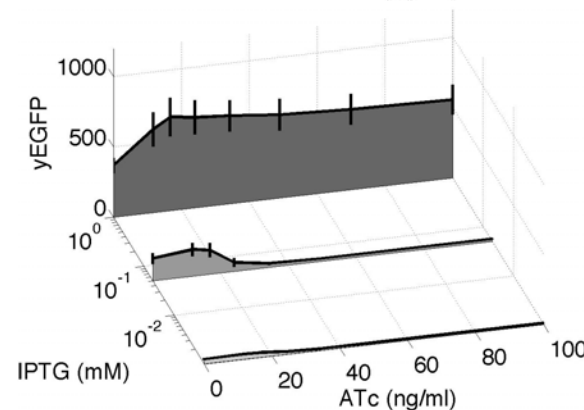
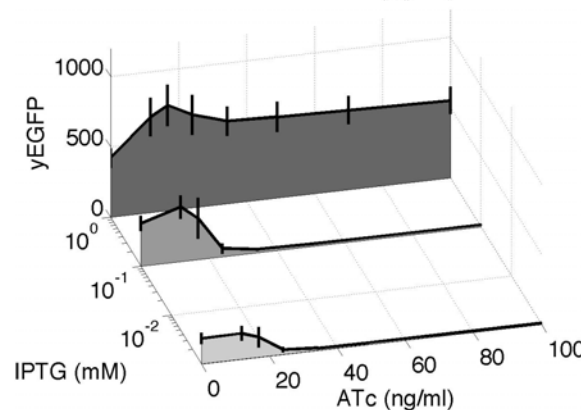
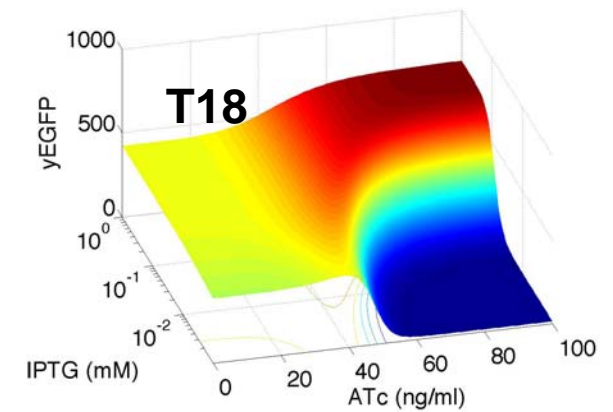
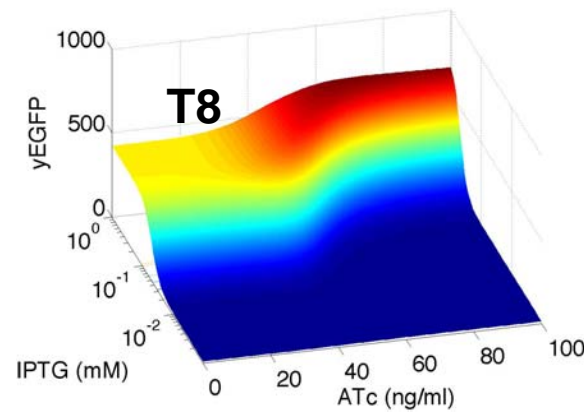
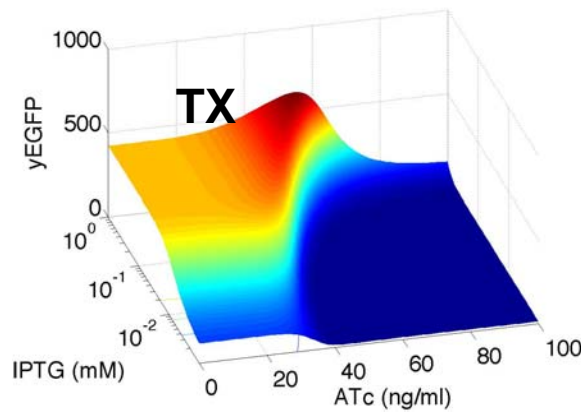
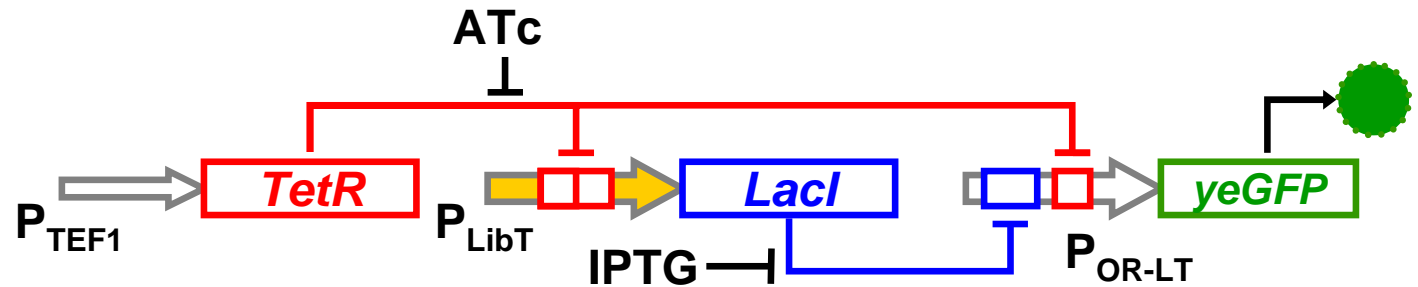
Start sequence showing regulatory elements and coding regions for various promoters.

# Giving it a go

1 library = 21 networks

Feed forward loop motif - robust, non-linear

Modeling type:  
prediction ahead  
of assembly

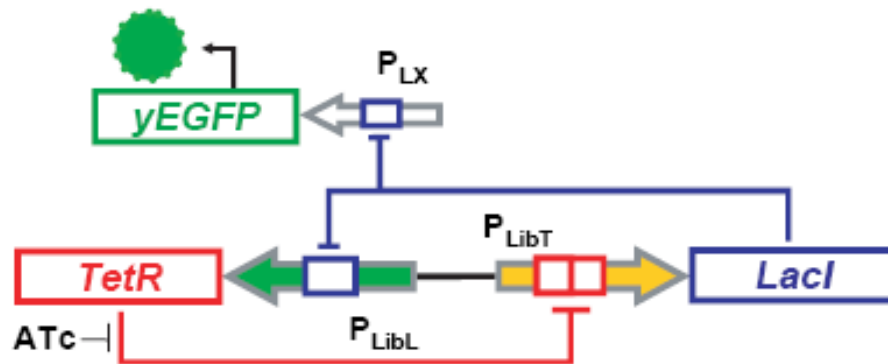




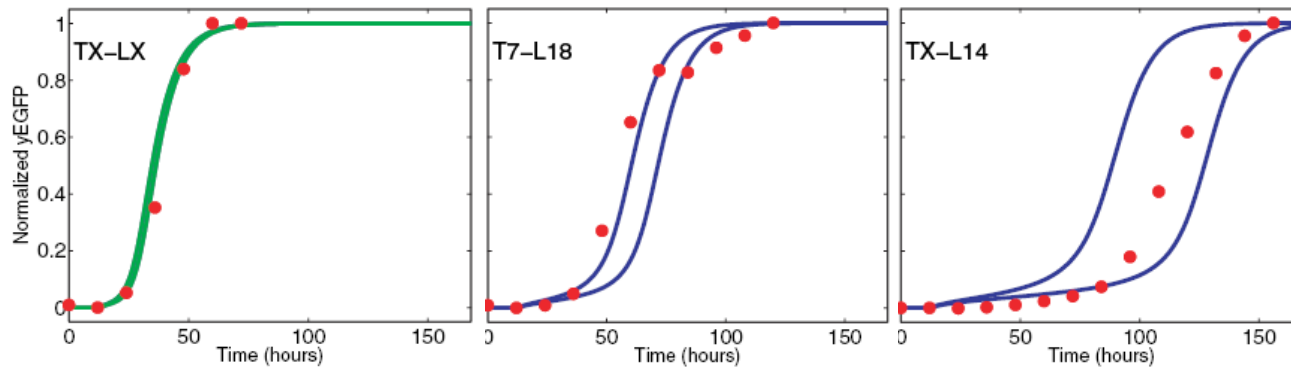
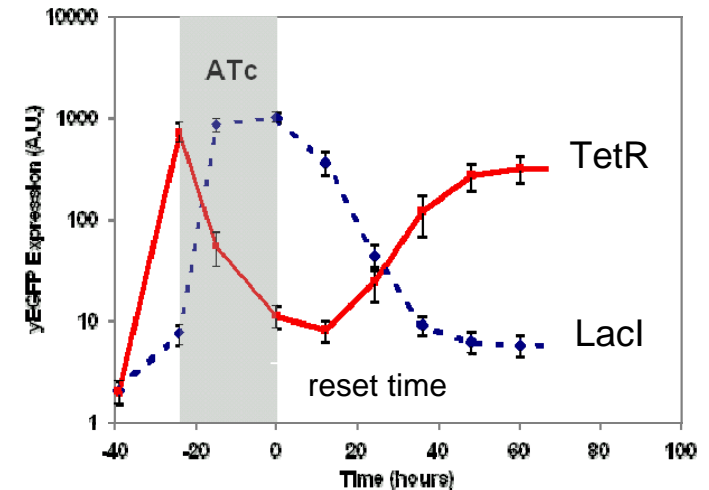
# More complex case

Monostable toggles that act as programmable 'timers'  
unbalanced mutual repression

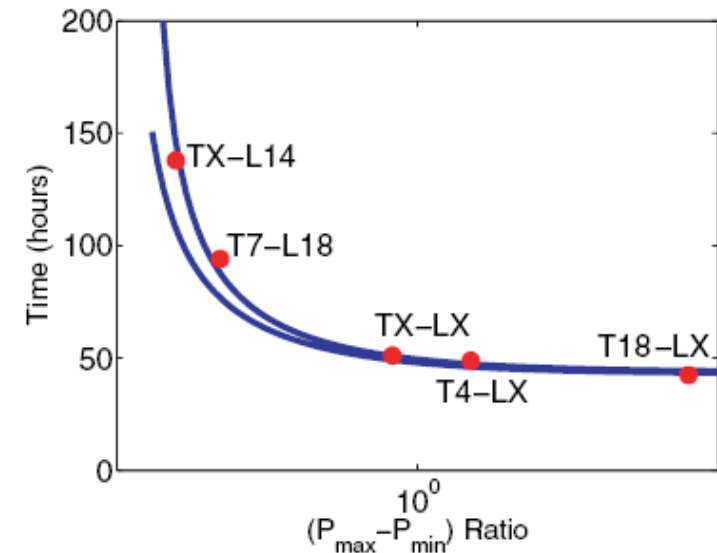
Modeling type: predictions based on single example



2 libraries = 441 networks



Predicted Relationship from  
computational model + one experimental test case



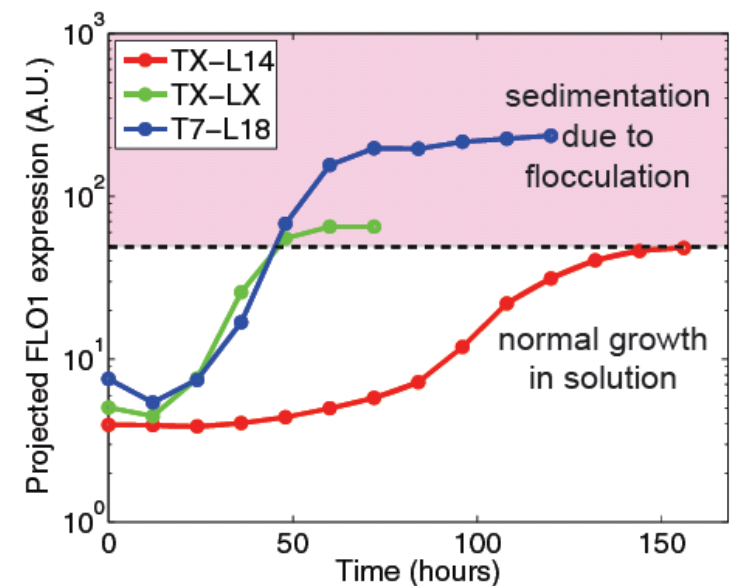
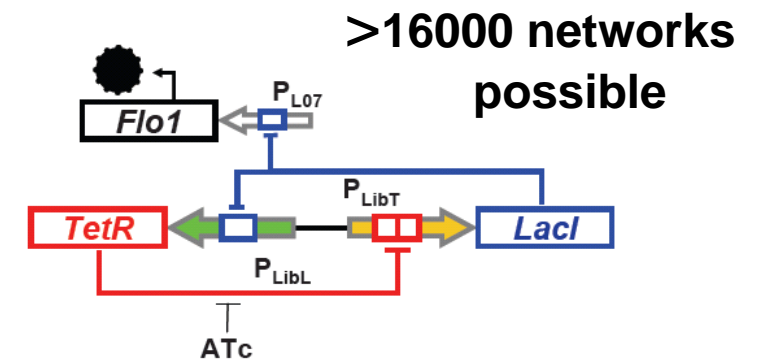
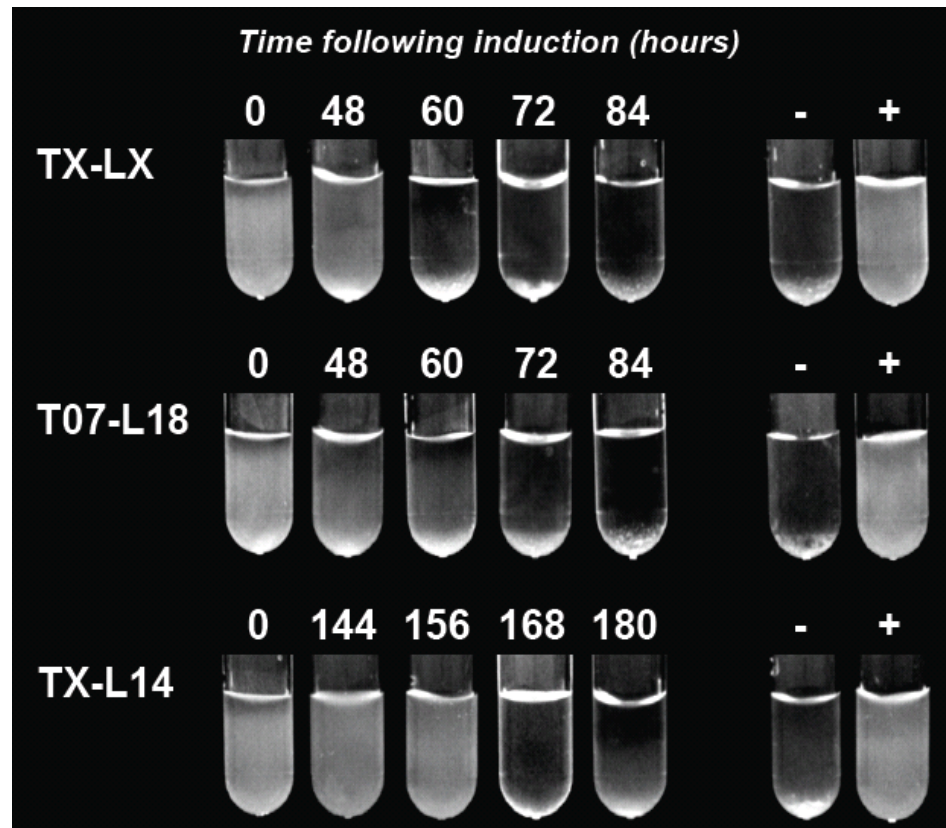
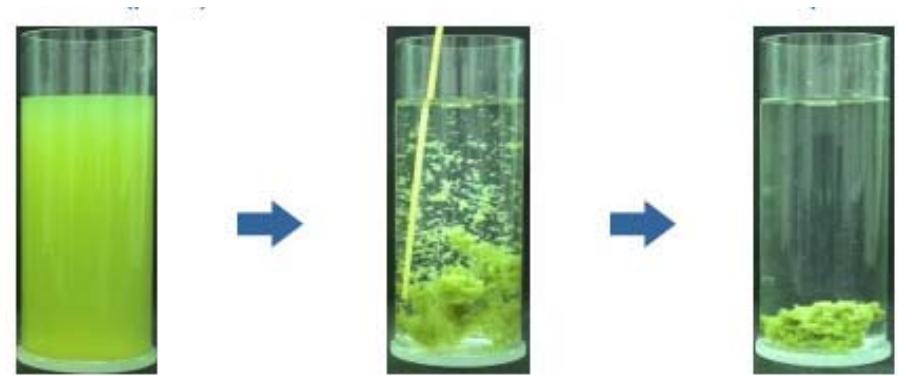
# Applying the network

Yeast flocculation - sedimentation

Why would this be of use?

**Beer**, wine... and now biofuels

Advantages of the system – controlled, predictable



# So what?

**“Diversity? Isn’t this just degenerate synthesis?”**

**“Libraries aren’t new”**

**“Predictive models aren’t new”**

**“I’m too busy to make multiple parts”**

**“Can I just use yours?”**

## Advantages

Fast  
Predictive  
Desired output levels  
Fine-tuning of response  
  
Provides parts for community

## What to apply it to?

Regulatory networks  
Modular bioparts  
RNA – eg. RBS/polyA  
Protein binding sites  
  
Investigate motifs/modules

## Follow-ups

Promoters with activation  
Mammalian cells, *E.coli*  
More complex networks  
  
Sequence/output relation  
Digital understanding

## Future Vision

Implementable in a BioFAB  
Scaled-up libraries  
  
All parts made this way?  
Diversify from start chassis

# Tom Ellis – Techniques, Construction and Implementation

now at **University of Cambridge**, Dept of Biotechnology and Chemical Eng.



Mammalian cell synthetic biology

Engineer dry-life tolerance into cells

genetic, metabolic and protein engineering

And other ideas...

## Xiao Wang – Modeling and Predictions

doing even more amazing work with Matlab – e.g. cells that count

Done with help from:

Jim Collins, Boston University

Henry H Lee, Boston University

Peter R Jensen, Biocentrum DTU

Kevin Verstrepen, KU Leuven



# Diversity-based, model-guided construction of synthetic gene networks with predicted functions

Tom Ellis<sup>1,2</sup>, Xiao Wang<sup>1,2</sup> & James J Collins<sup>1</sup>

Engineering artificial gene networks from modular components is a major goal of synthetic biology. However, the construction of gene networks with predictable functions remains hampered by a lack of suitable components and the fact that assembled networks often require extensive, iterative retrofitting to work as intended. Here we present an approach that couples libraries of diversified components (synthesized with randomized nonessential sequence) with *in silico* modeling to guide predictable gene network construction without the need for *post hoc* tweaking. We demonstrate our approach in *Saccharomyces cerevisiae* by synthesizing regulatory promoter libraries and using them to construct feed-forward loop networks with different predicted input-output characteristics. We then expand our method to produce a synthetic gene network acting as a predictable timer, modifiable by component choice. We use this network to control the timing of yeast sedimentation, illustrating how the plug-and-play nature of our design can be readily applied to biotechnology.

Synthetic biology promises to transform biotechnology by applying engineering principles to biological systems<sup>1</sup>. In less than a decade this field has already yielded technological applications, providing new avenues for drug manufacture<sup>2,3</sup>, biofabrication<sup>4</sup> and therapeutics<sup>5,6</sup>, while also showing promise in alternative energy<sup>7</sup>. A major focus of the field is the synthesis of gene networks with predictable behavior<sup>8–10</sup>, either to endow cells with novel functions<sup>11–15</sup> or to study analogous natural systems<sup>1,16–19</sup>. Despite a booming community and notable successes, the basic task of assembling a predictable gene network from biomolecular parts remains a considerable challenge and often takes many months before a desired network is realized<sup>20</sup>. If

Directed evolution has been shown to provide a short-cut through this phase<sup>21</sup> but is complicated by the additional work needed to couple networks to selective pressures.

This time-consuming *post hoc* tweaking phase stems in part from having to work with a limited set of imperfect components. Although this lack of reliable parts is being addressed by community efforts<sup>20</sup>, it remains an acute problem because most of the available components are inadequately characterized. For example, many promoters are simply characterized as being 'weak' or 'strong'. What is needed to resolve this problem and fast-track synthetic biology is an approach that creates libraries of components ahead of any assembly. Then, by

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Wednesday, April 22, 2009

## Brewing with Synthetic Biology

A new approach offers a more efficient way to design biological "circuits."

By Guanying Mu

Audio > Share > Favorites Print E-mail



Synthetic biology rests on the hope that biological "parts" like DNA and proteins can be engineered and assembled just like a machine or computer circuit, but the field still has some way to go before this is the case. As much as biologists know about the structure and function of biological molecules, their behavior when interacting with one another is still unpredictable.

A new approach detailed in this week's issue of the journal *Nature Biotechnology* offers a more systematic approach

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16 April 2009



Image: Punchstock

Biotechnology: A better engineered beer

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## Brewing with Synthetic Biology

read 81 times · 1 replies · posted 4/23/2009 12:15:18 AM

Reply



Stevie Lin  
1928:47

<http://www.technologyreview.com/biomedicine/22528/>

"Researchers at Boston University have developed a way to predict the behavior of different DNA segments and make synthetic biology a little bit more reliable. James Collins and colleagues have built libraries of component parts and a mathematical modeling system to help them predict the behavior of parts of a gene network. Like any self-respected bunch of grad students, they decided to demonstrate the approach by making beer. They engineered gene promoters to control when flocculation occurs in brewers yeast, which allowed them to finely control the flavor of the resulting beer."

Yes, I go to this from Slashdot.

Reply

Private message



Jesse McPherson  
4331:130

I think this stuff could be interesting, but controlling flocculation is hardly official when most brewers filter anyway. I remember reading about this synthetic biology thing that they were trying to assemble, but I think that they'll need to demonstrate something much more novel than this before people really jump onto the bandwagon.

4/23/2009 8:30:30 AM

Post a reply

Private message

RateBeer Forums > Beer / Site News

Reply

-

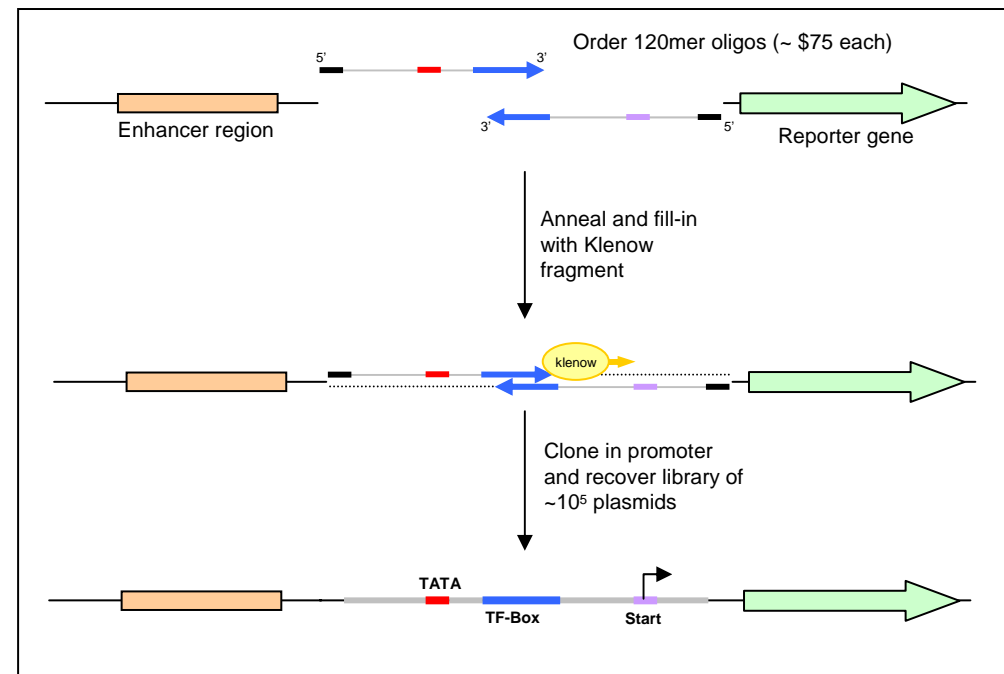
# Promoter Construction

Cloning to get set-up and get appropriate controls

Make everything modular!

Work large scale (pooling colonies from plates),  
use plate-reader and then flow cytometer to pick  
20 clones

Take repeatable measurements of each library  
member



5'-PstI---(N)<sub>35</sub>---TATA---(N)<sub>11</sub>---*tetO*<sub>2</sub>-(N)<sub>2</sub>-*tetO*<sub>2</sub>-3' .....→ *Klenow pol extension*  
 .....← 3'-*tetO*<sub>2</sub>---(N)<sub>23</sub>---Start---(N)<sub>44</sub>---BamHI-5'

