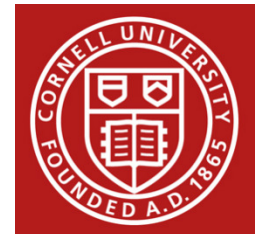
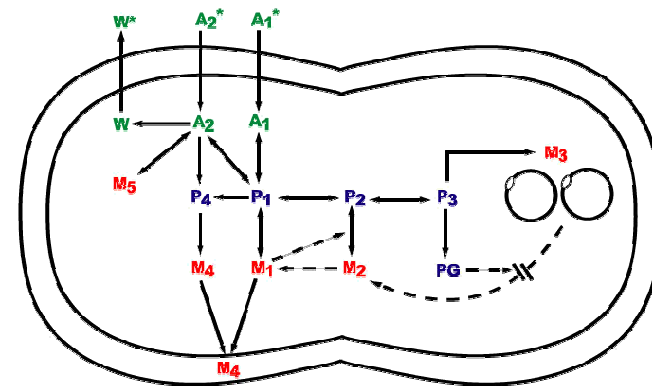


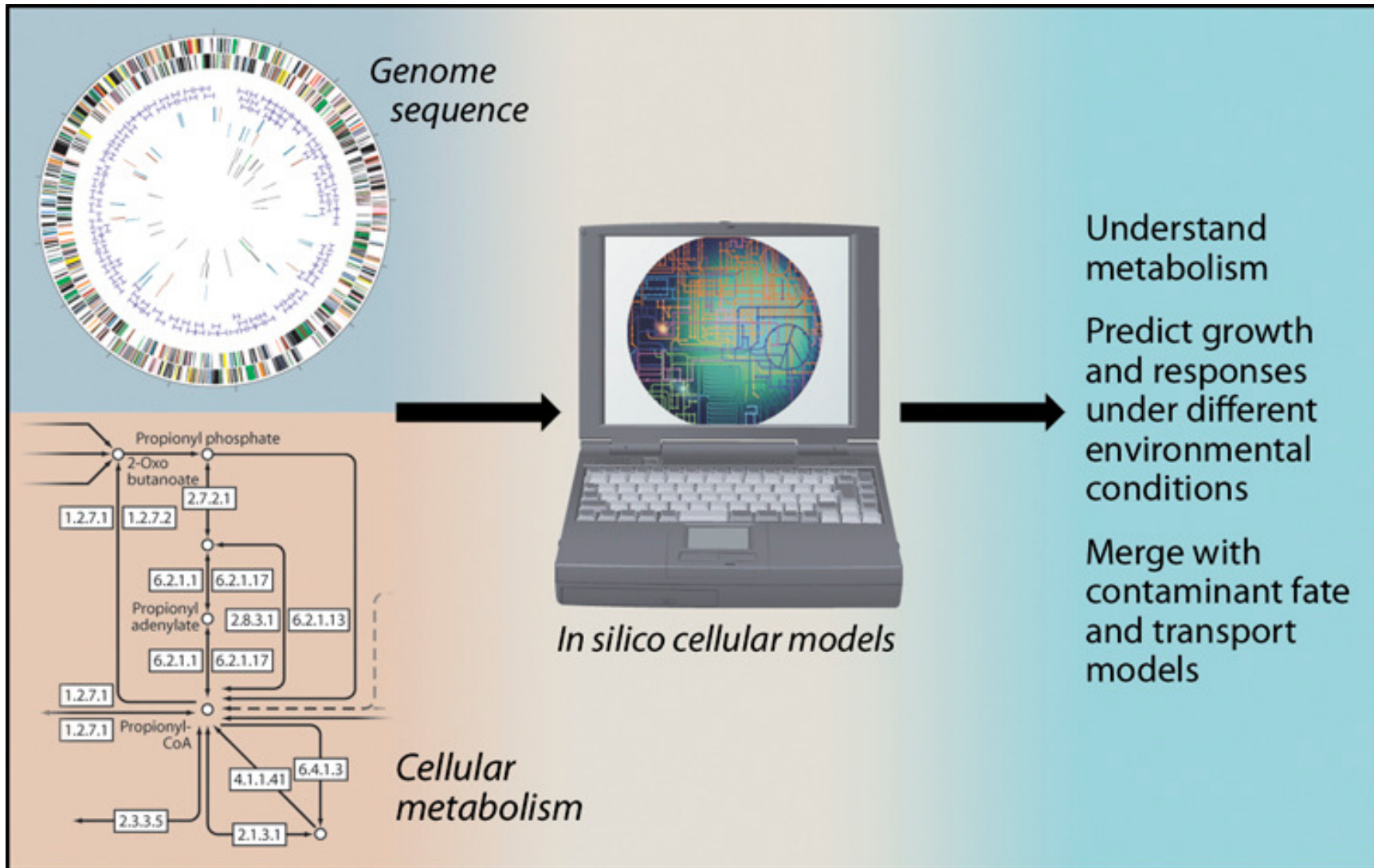
# Towards a Genomically Detailed Minimal Cell Model

Jordan C. Atlas, and Michael L. Shuler  
CSGF Annual Conference 2009

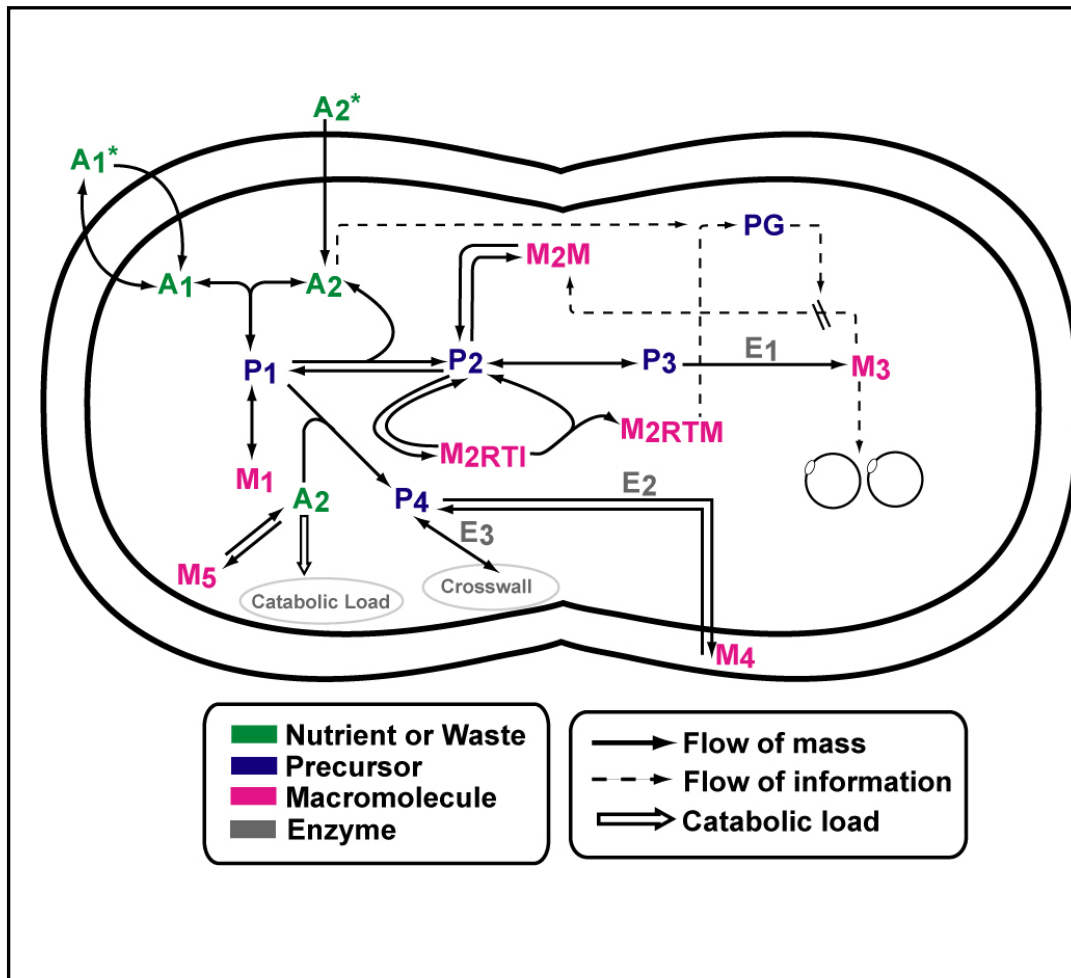
Shuler Research Group  
School of Chemical and Biomolecular  
Engineering  
July 14, 2009



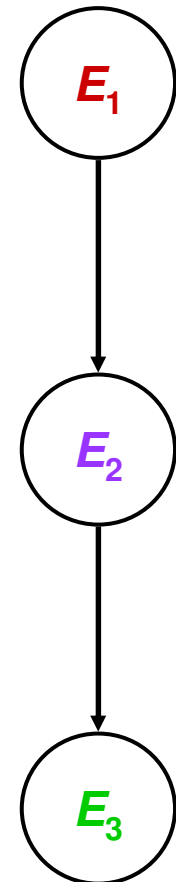
# Motivation



# Coarse-Grained Cell Modeling



- Events - **discrete** changes in cell state
- $E_1$  – DNA replication initiation
- $E_2$  – DNA replication termination
- $E_3$  – cell division
- Events depend on **chemical/genomic detail**.



# Coarse-Grained Rate Equations

$$\left(\frac{dP}{dt}\right)_S = v_{S \rightarrow P} \underbrace{\left(\frac{K_I}{K_I + \frac{I}{V}}\right)}_{\text{Inhibition Term}} \underbrace{\left(\frac{\frac{A}{V}}{K_A + \frac{A}{V}}\right)}_{\text{Activation Term}} \cdot E$$

P – Product (pg)

I – Inhibitor (pg)

A – Reactant (pg)

E – Enzyme (pg)

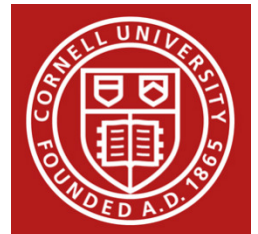
$v_{S-P}$  – Rate Constant (pg P/(hr-pg E))

$K_I$  – Inhibition Constant (pg/ $\mu\text{m}^3$ )

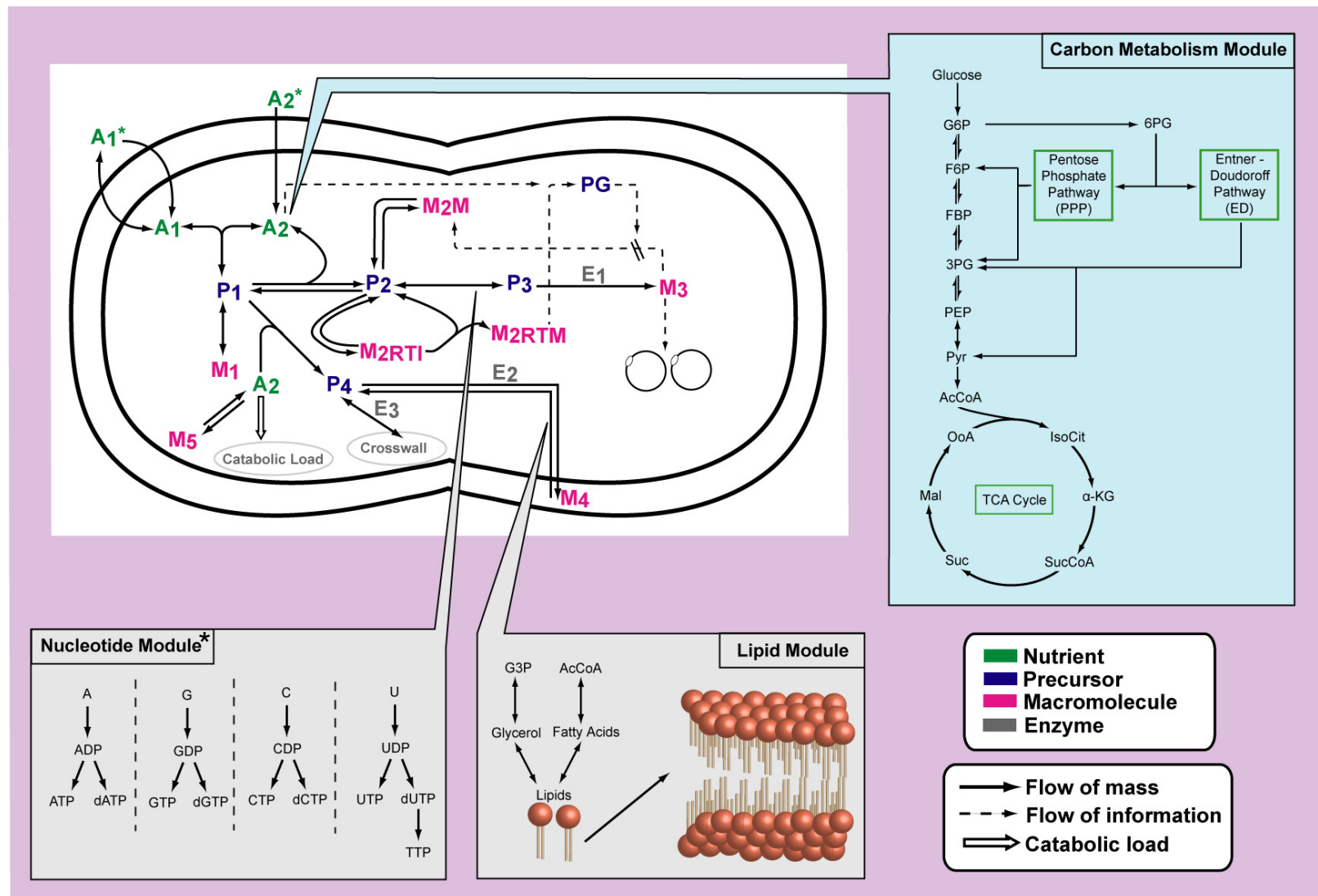
$K_A$  – Activation Constant (pg/ $\mu\text{m}^3$ )

V – Volume ( $\mu\text{m}^3$ )

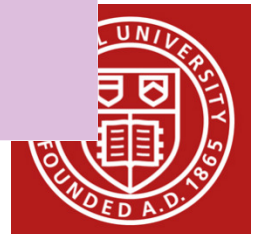
***DAE system integrated numerically using SloppyCell***



# Modular Approach to Adding Chemical/Genomic Detail



\*Castellanos *et al.*, *PNAS*, v. 101(17), 2004.

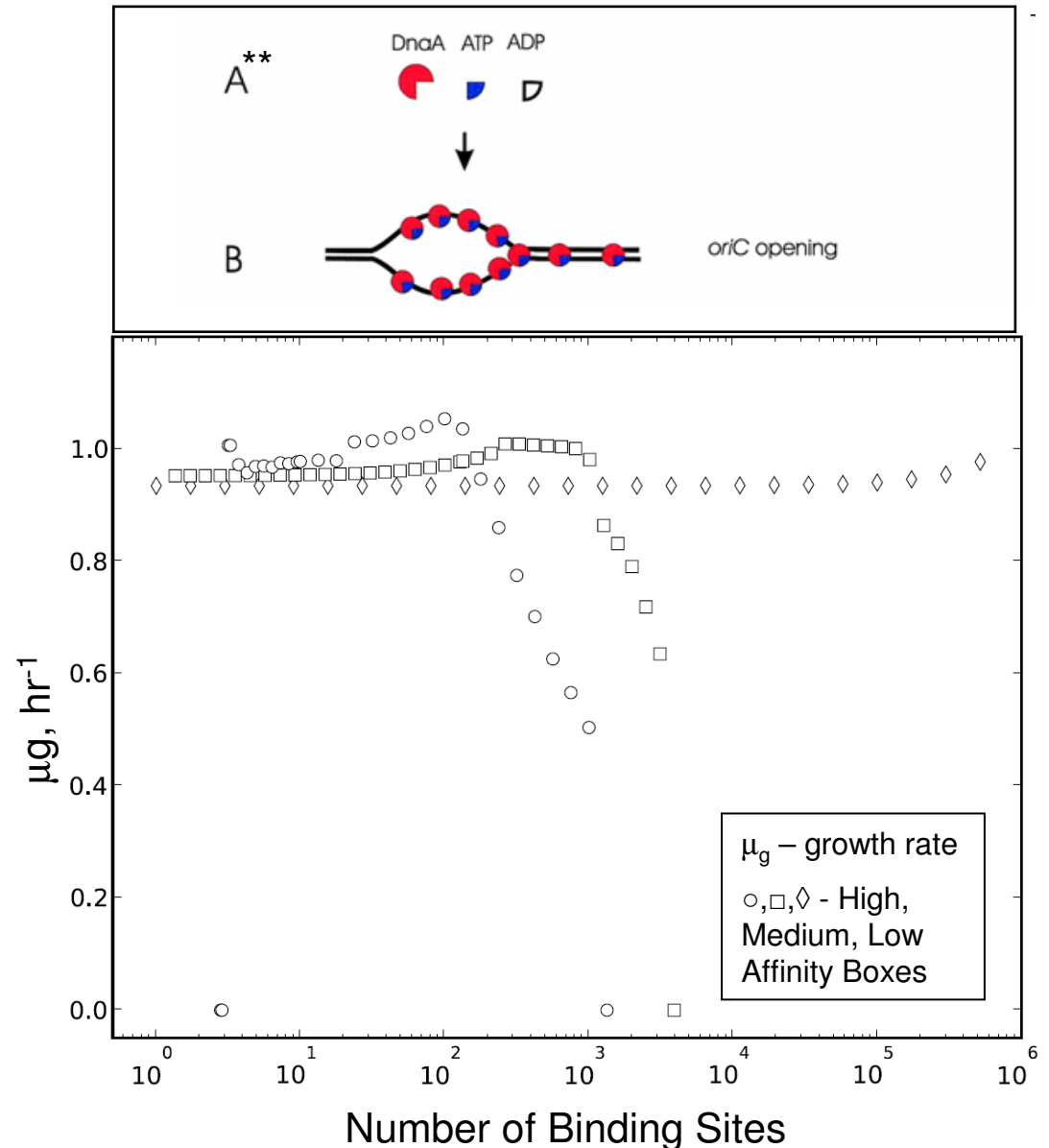


# DnaA Binding Boxes Can Interfere With Growth

- **Initiation and control of DNA replication** by DnaA-ATP molecules\*.
- **Real genomic sequence data** for distribution of DnaA binding sites and *dnaA* genes used.

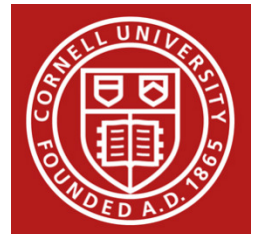
\*Atlas *et al.*, *IET Sys. Bio.*, v. 2(5), 2008.

\*\*Boye *et al.*, *EMBO Reports*, v. 1(6), 2000.



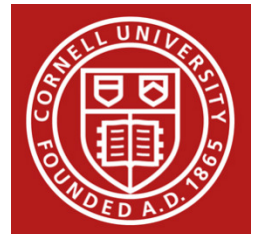
# Conclusions from Coarse-Grained Cell Models

- Applied to measure general growth trends and physiological parameters
- Mechanistic base to capture discrete physiological events in cell cycle
- Modularity demonstrated with lipids, nucleotides, and DNA replication initiation
- Can incorporate genomic information



# What Genes are Necessary to Support Life?

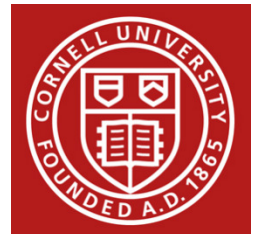
- These genes define a minimal cell
- Hypothetical organism that contains the fewest genes required for 'life'
  - Metabolic homeostasis
  - Reproduction
- Optimally supportive environment (constant pH, all necessary nutrients, waste products dilute)





# Mathematical Model of a Minimal Cell

- Basic design rules of life – minimal gene set and regulatory structure
  - Guide experiments to construct such a cell (e.g. impact of initial conditions on success)
  - Basis for a biotechnological platform cell and evaluation of alternative design strategies
1. Obtain minimal gene set.
  2. Integrate with coarse-grained modeling framework



# Minimal Gene Set

## Approaches Employed

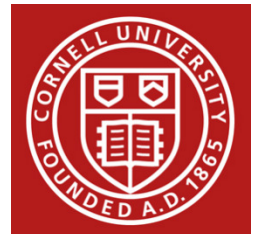
- Transposon mutagenesis, single gene knockouts
- Computational comparison

## Approach of Gil *et al.*<sup>\*,\*\*</sup>

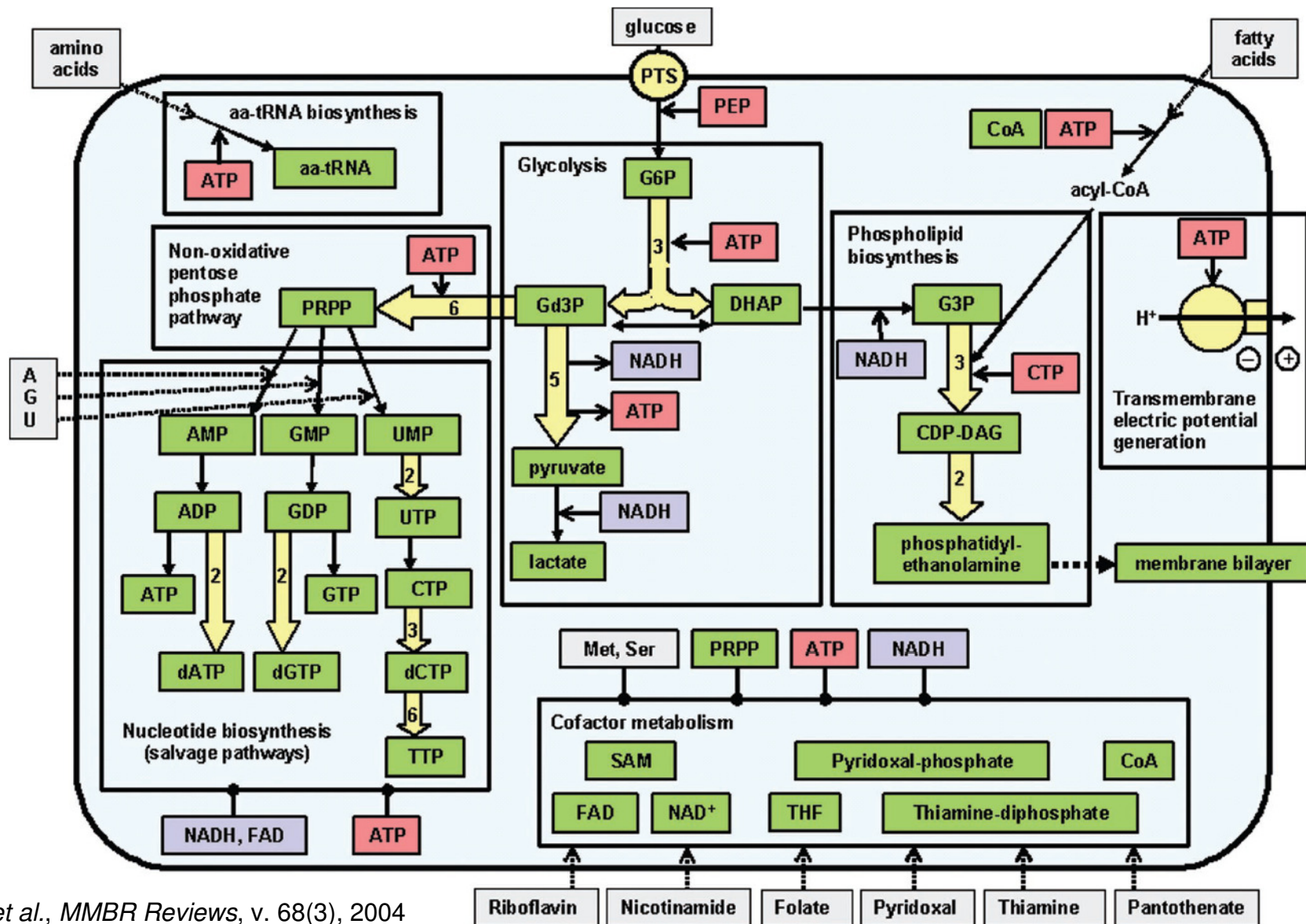
- Present an “enhanced review” of previous work as well as comparison to five endosymbionts.
- Proposed minimal gene set with **206 protein coding genes** (no tRNAs, minimal transport)

\*Gil, *et al.*, *MMBR Reviews*, v. 68(3), 2004

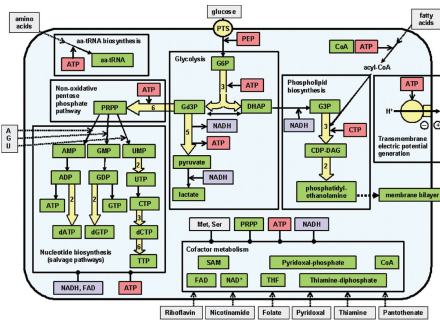
\*\*Gabaldón, *et al.*, *Phil Trans Roy Soc B*, v. 362, 2007



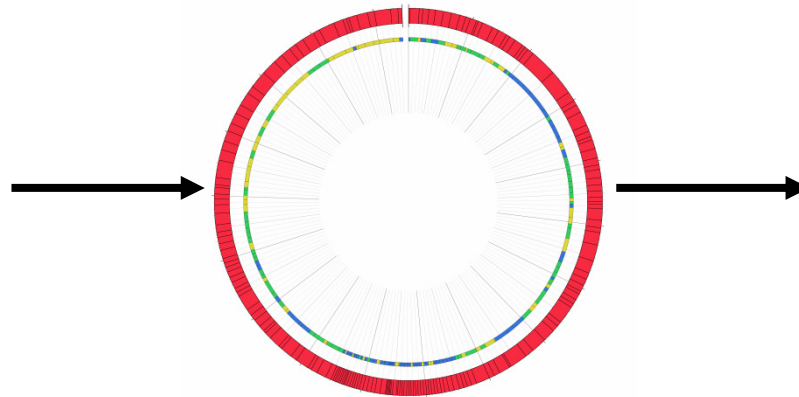
# Metabolic Features of the Minimal Gene Set



# How Might We Create a Minimal Cell Model?



Gil, *et al.* gene set  
(206 protein coding genes)



Computational Chromosome

Includes protein and RNA encoding genes

(109 single genes, 20 gene clusters)

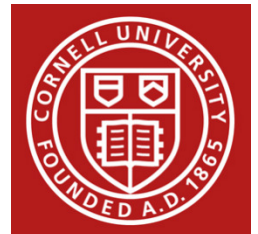
Proposed Reaction Rates

$$\left( \frac{dS_i}{dt} \right)_j = f(S, E_j)$$

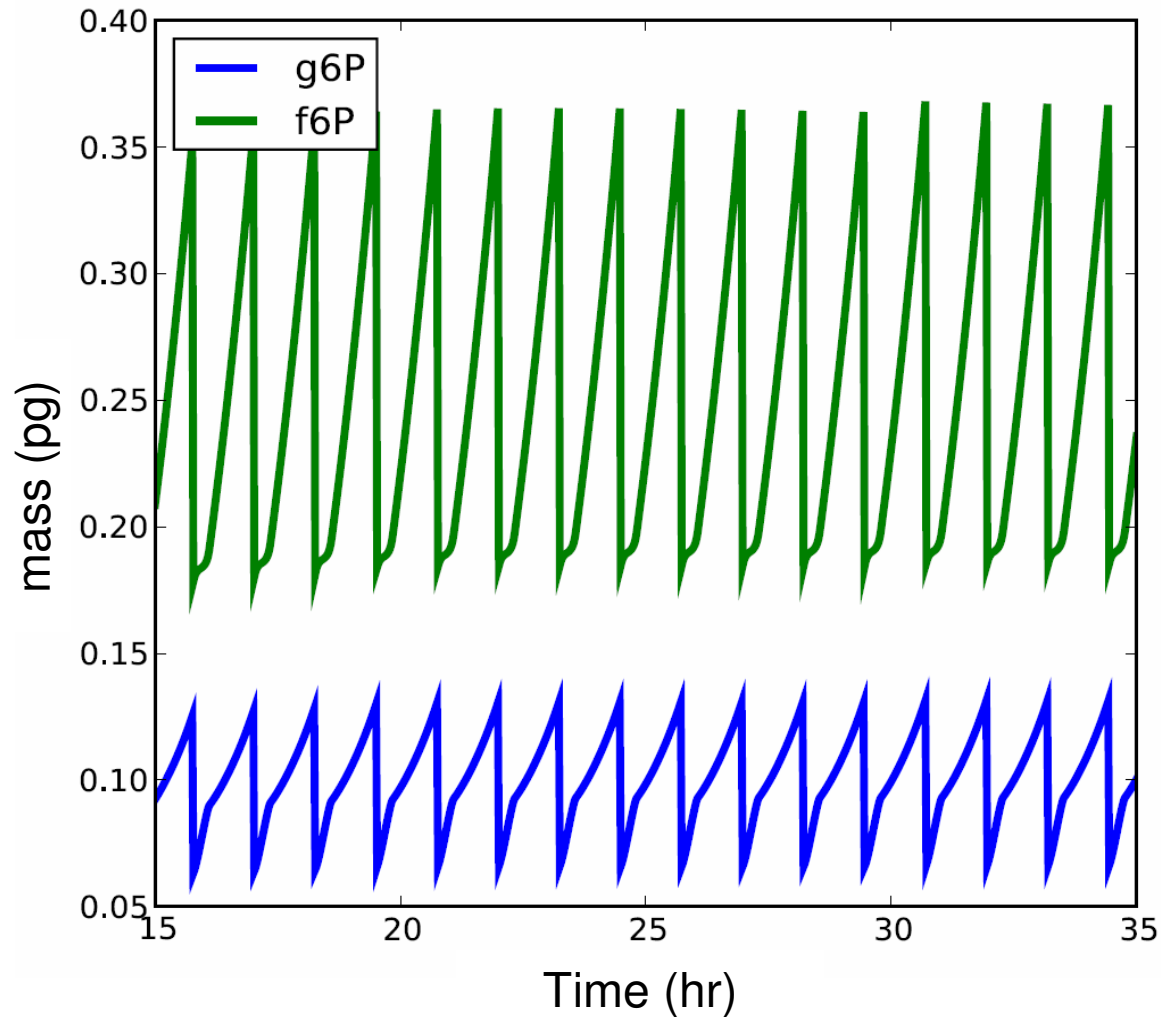
$S_i$  = species  $i$

$S$  = all species

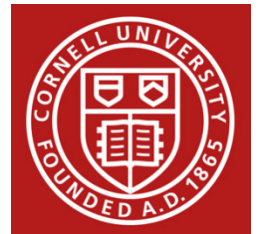
$E_j$  = enzyme  $j$



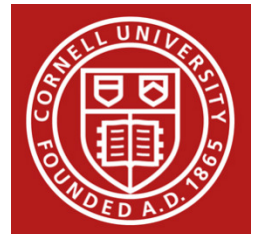
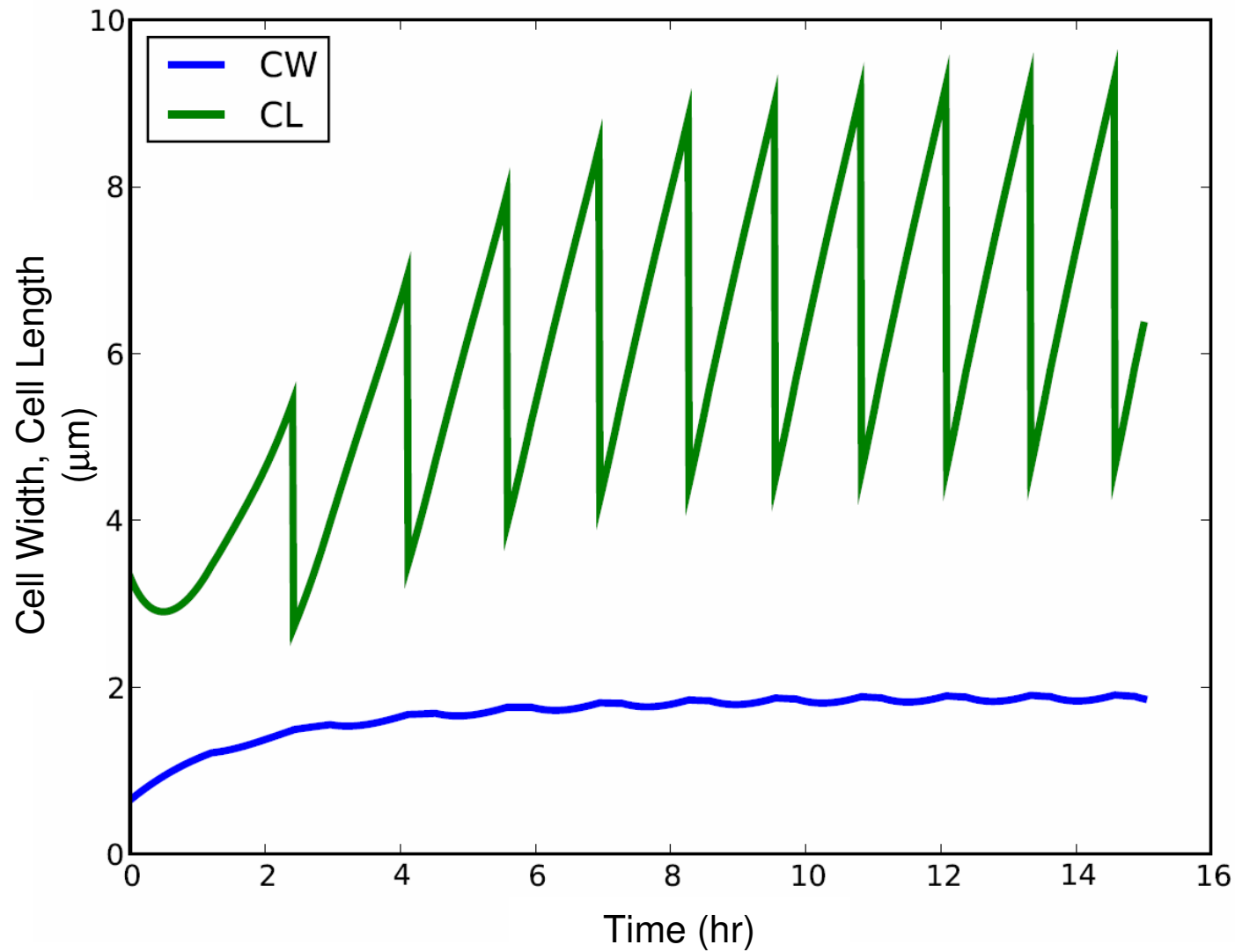
# Stable Cell Cycle



g6P – glucose 6-phosphate, f6P – fructose 6-phosphate



# Physiological State - Shape and Size



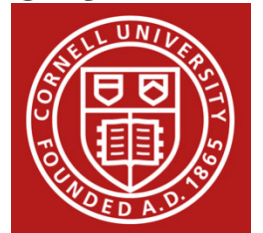
# Venter Institute Synthetic Cell

## 3 part strategy:

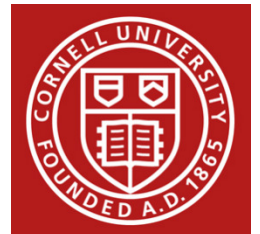
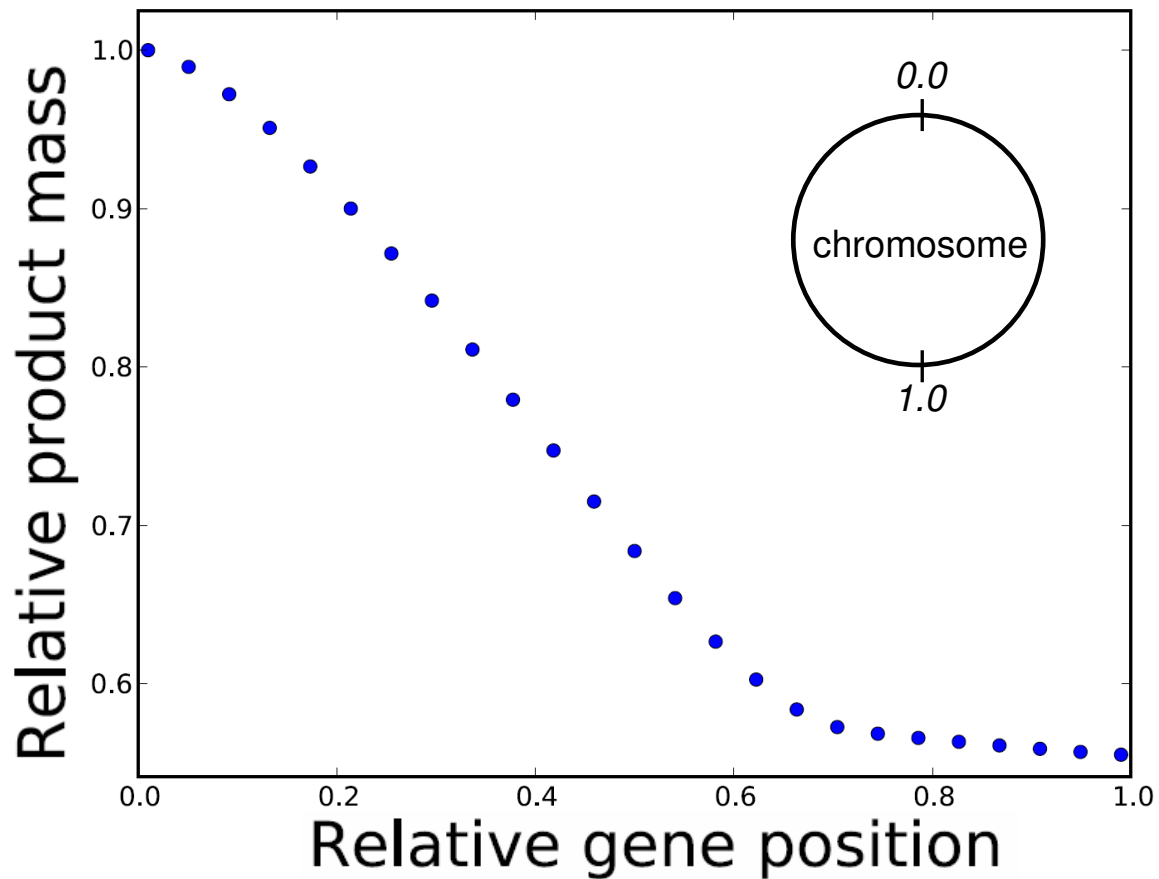
- 1) **Genome transplantation:** DNA from *Mycoplasma mycoides* into *Mycoplasma capricolum*\*
- 2) **Construction of synthetic *Mycoplasma genitalium* genome**\*\*
- 3) **Transplant synthetic genome** into bacterium to make first synthetic bacterium—No Report!

\*Science 317: 632-638, 2007

\*\*Science 319: 1215-20, 2008

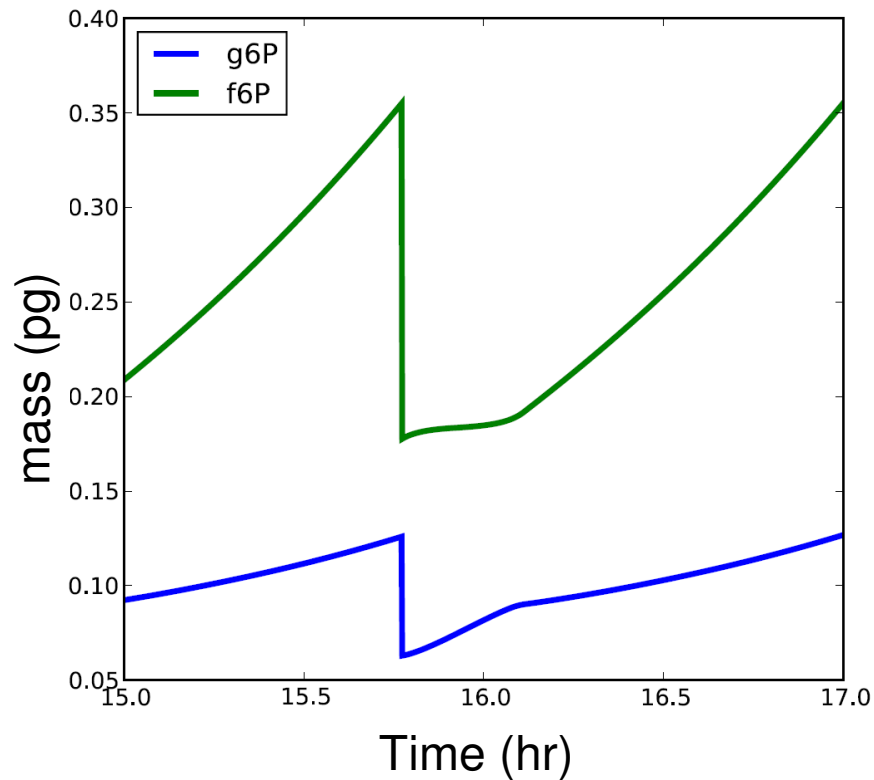


# Gene Position Influences Product Production

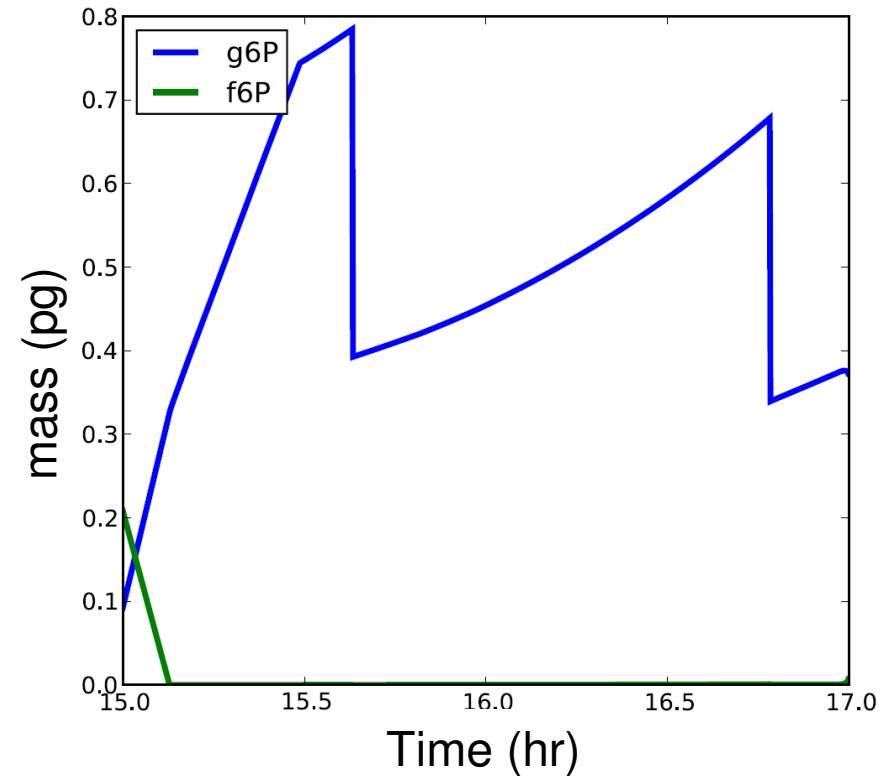




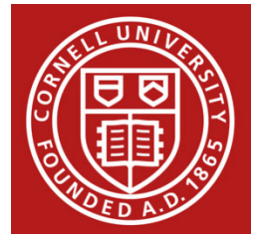
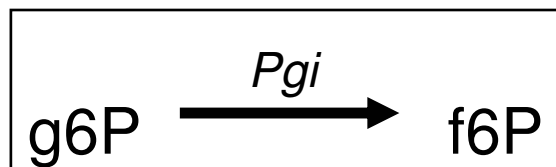
# Initial Conditions Affect Cell Viability



Default Pgi (glucose 6-P isomerase) Mass

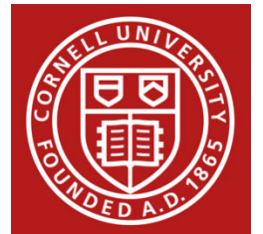


Pgi Reduced by 50% - Results in Cell Death



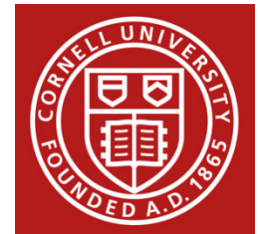
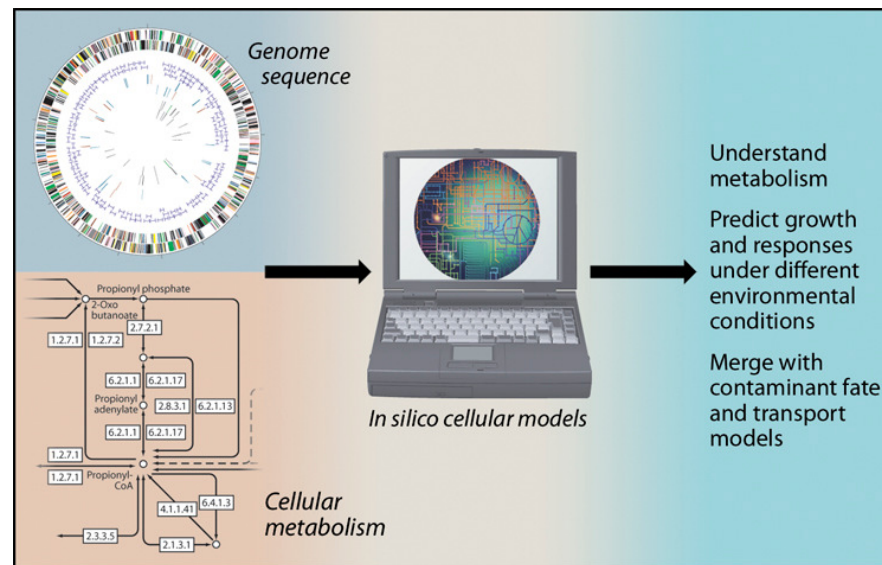
# Minimal Cell Conclusions

- Dynamic models can translate genomic detail into physiological predictions
- Outputs:
  - Concentrations of all chemical species
  - Physiological state, including size and dimensions of cell
- Cell can sustain replication indefinitely
- Synthetic cell more difficult than predicted
- Mechanistic details can (and should) be added



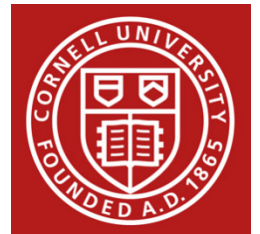
# What Has Been Accomplished?

Shown for the first time that it is possible to build a genomically and chemically complete cell model capable of indefinite growth and replication



# Acknowledgements

- Professor Michael Shuler
- Dr. Evgeni Nikolaev
- Professor Jim Sethna
- Dr. Ryan Gutenkunst
- Dr. Joshua Waterfall
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**Questions?**



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