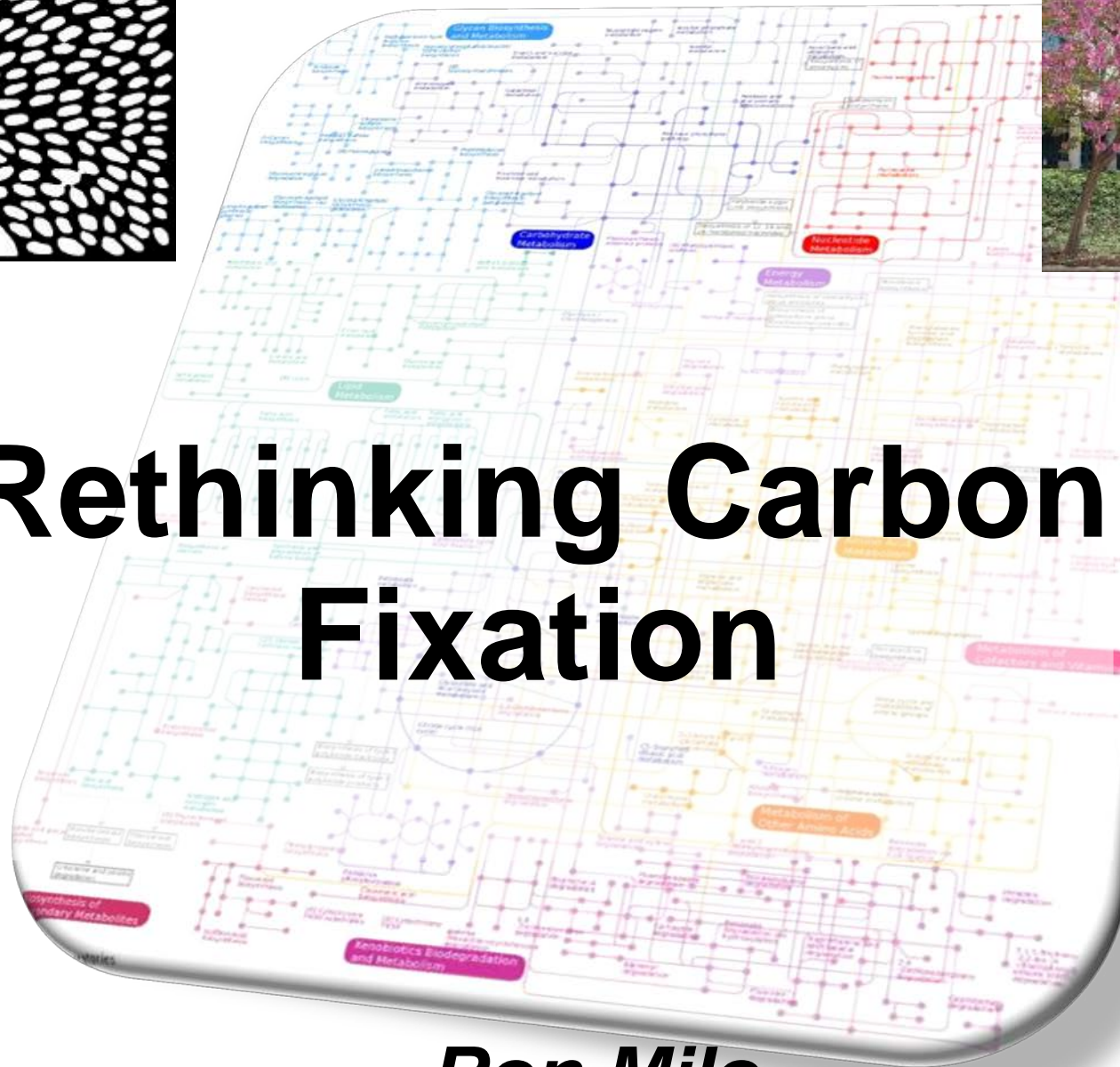




# Rethinking Carbon Fixation



**Ron Milo**

**Department of Plant Sciences  
Weizmann Institute of Science**



A photograph of three men standing outdoors in front of trees. The man on the left is wearing a blue and white striped button-down shirt over a white t-shirt with a green leaf design. The man in the center is wearing a light blue t-shirt. The man on the right is wearing a dark grey t-shirt with a green graphic. All three are smiling and looking at the camera. The background consists of large trees and green foliage.

**Arren  
Bar-Even**

**Elad  
Noor**



What limits maximal  
growth rates?

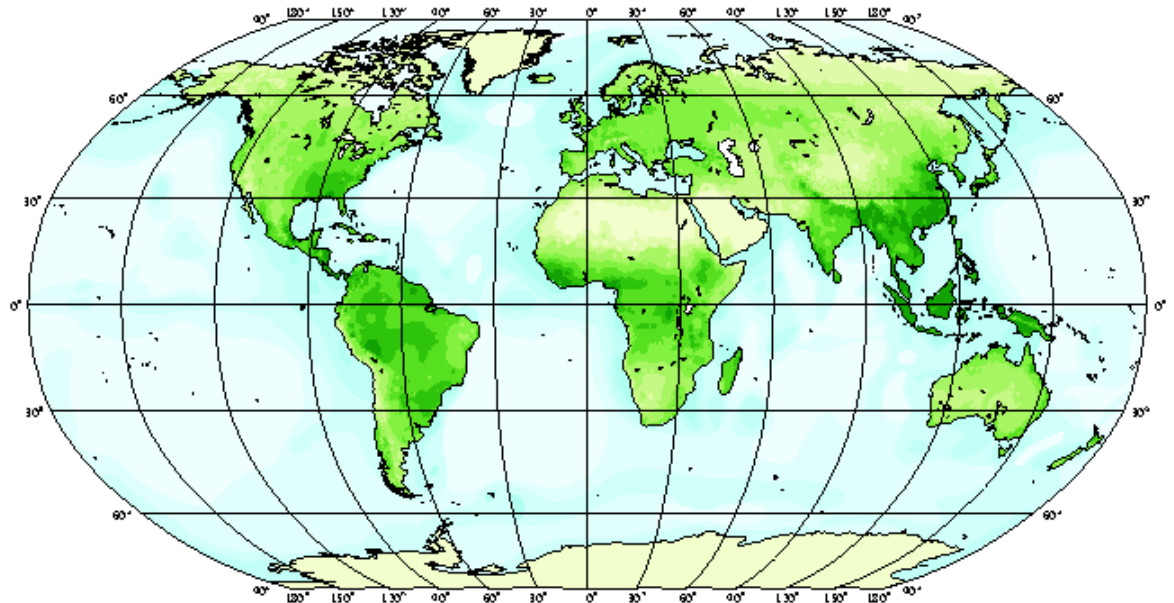


# A major frontier for systems biology: Carbon Fixation

Requires majority of land and fresh water used by humanity

A molecular process that affects global climate

Major uncertainties about rates and limits



# What governs the efficiency of photosynthesis and carbon fixation?

Constraints on metabolites concentrations, enzyme rates and pathways structure

(Noor et al, Mol. Cell 2010  
Bar-Even et al, Biochemistry 2011  
Bar-Even et al, PLOS CB 2011)

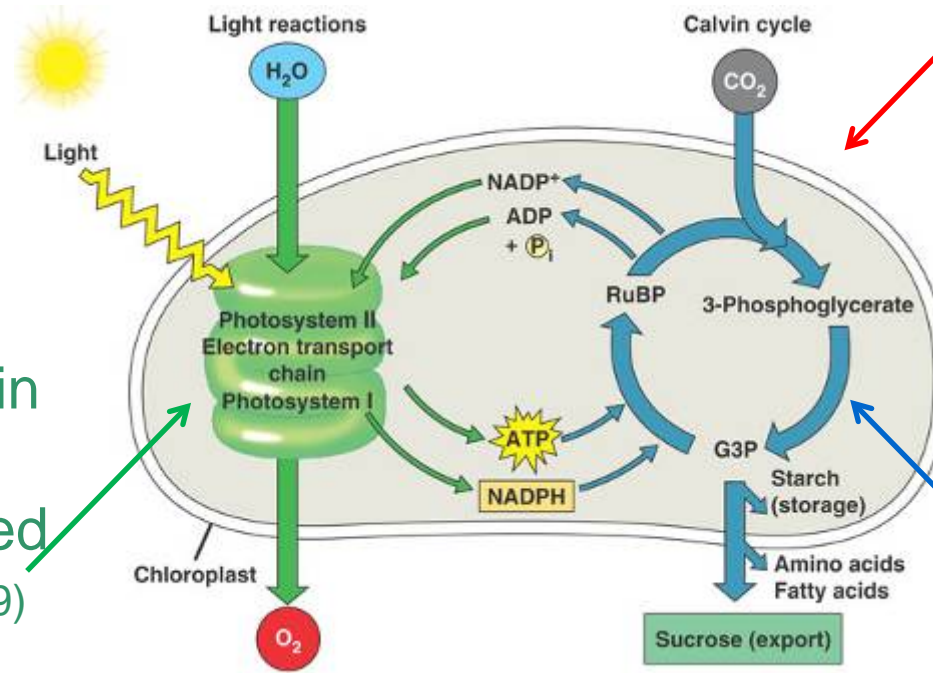


*growth*

Rubisco rate is at a limit

(Savir et al, PNAS 2010)

Design principles in photosynthesis: wavelengths utilized  
(Milo, Photos. Res. 2009)

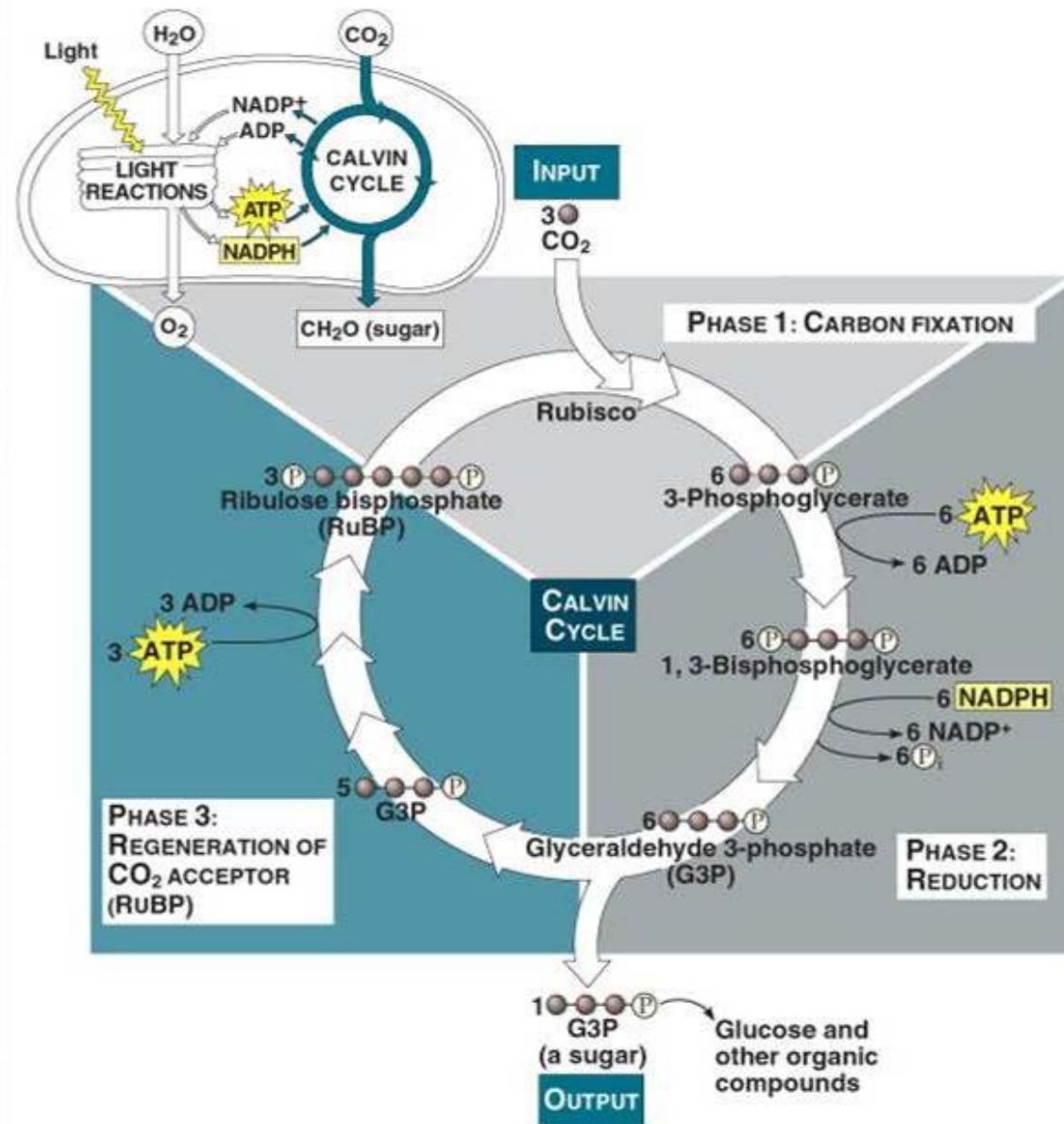


Synthetic carbon fixation pathways for higher productivity  
(Bar-Even et al, PNAS 2010;  
Bar-Even et al, JXB 2012)

# The Calvin-Benson cycle drives carbon fixation

Photosynthesis fixates carbon into organic compounds

Rubisco - key carboxylating enzyme: capturing  $\text{CO}_2$  and producing 3-carbon sugars

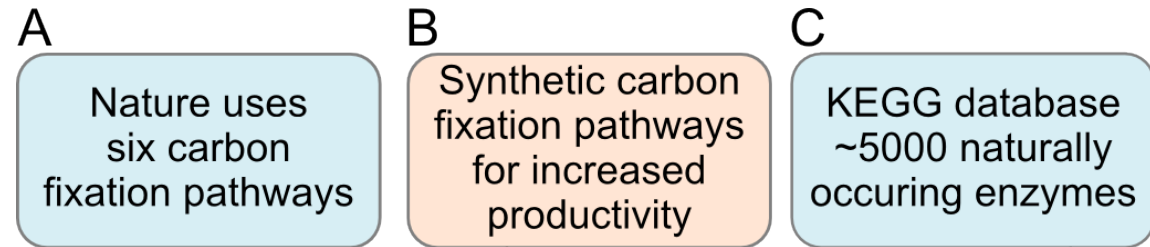


# Can we find novel ways to achieve carbon fixation?

Constraints are different → productivity and rates might be higher (e.g. domestication)

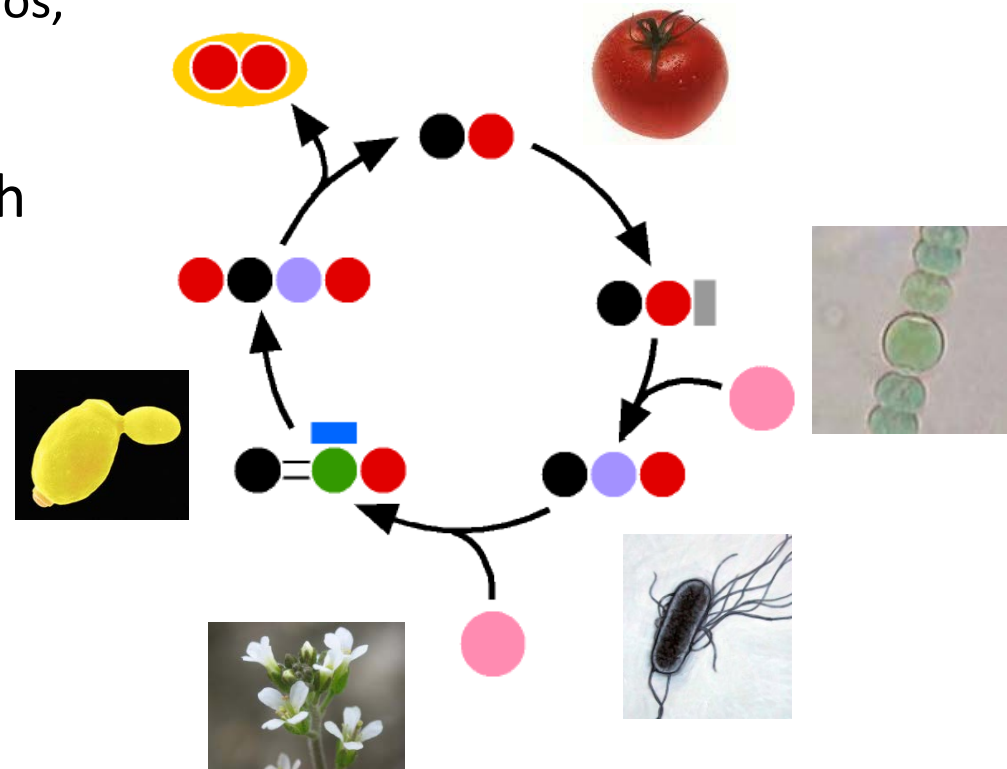
Test our understanding of what limits Nature in evolving metabolic pathways

# Finding synthetic alternatives to the Calvin-Benson Cycle



Synthetic biology & metabolic engineering  
(following Kiesling, Stephanopoulos, Maranas, Hatzimanikatis,...)

A “mix and match” approach





# How to compare the synthetic pathways?

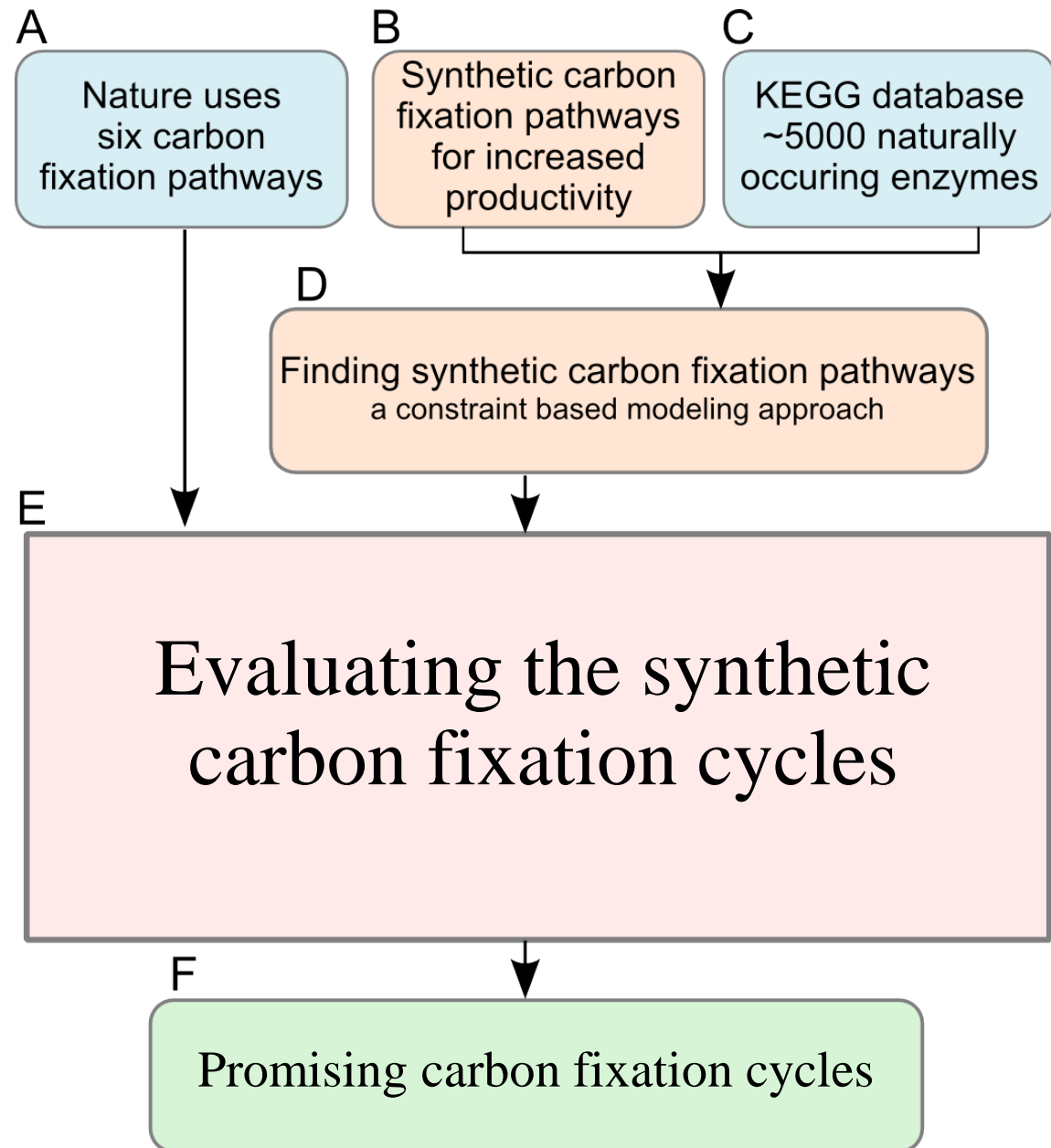
Exploration of **(5000)<sup>n</sup>**  
possible networks

Novel visualization method of  
metabolic pathways

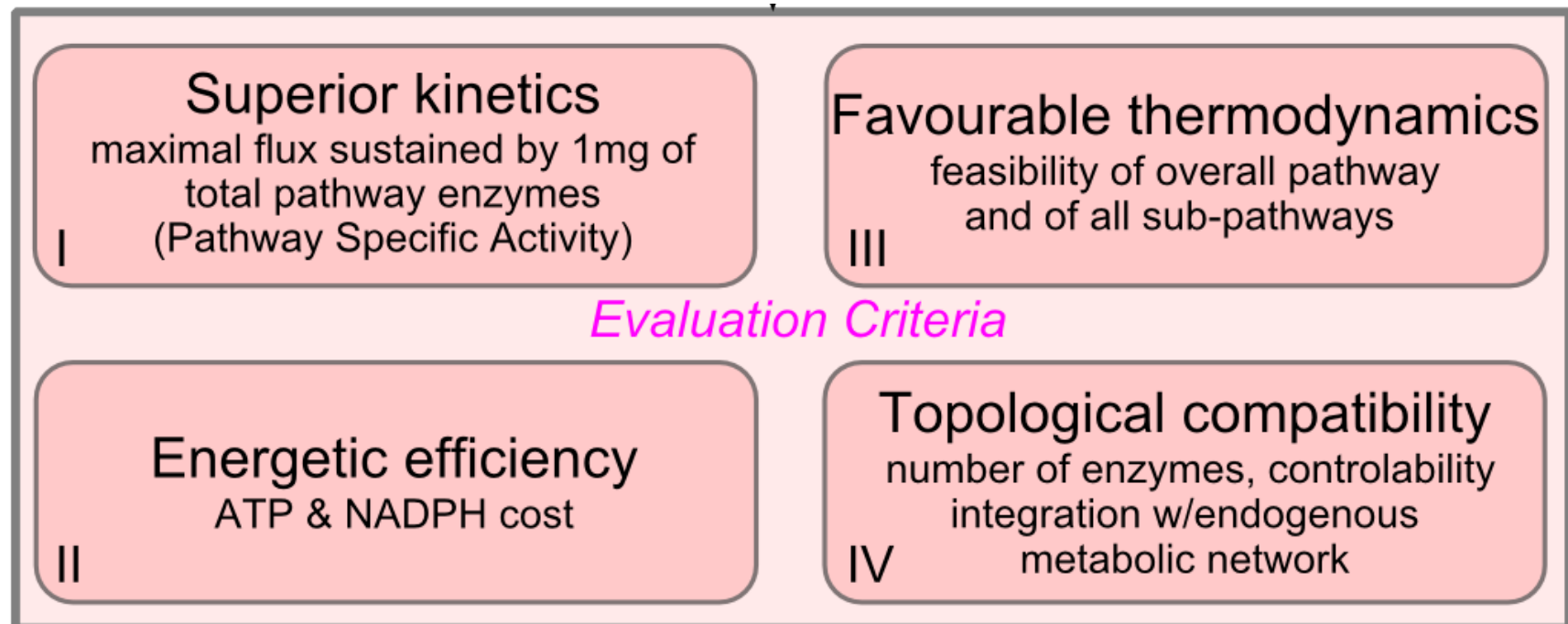
Manual curation  
>1500 papers  
>100 metabolic cycles

New methods to predict  
pathways rates

Integrated thermodynamic  
models



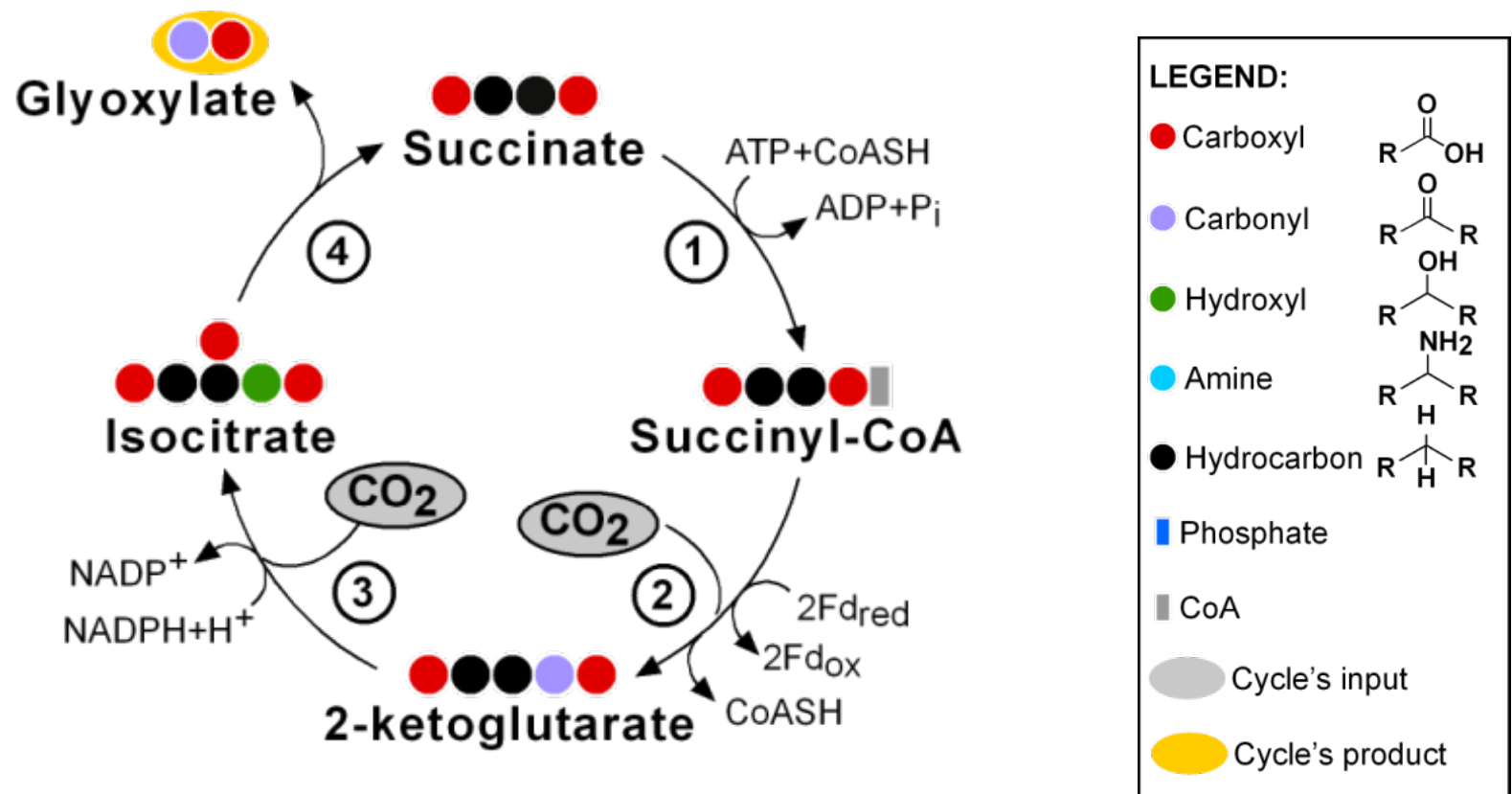
# We systematically compare all possible synthetic carbon fixation pathways



# The simplest carbon fixation cycles are not useful

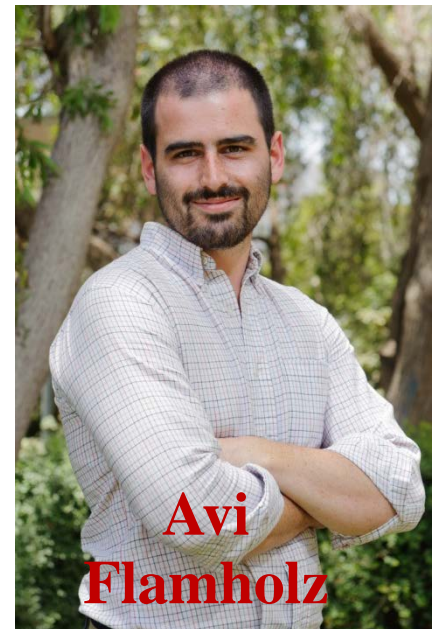
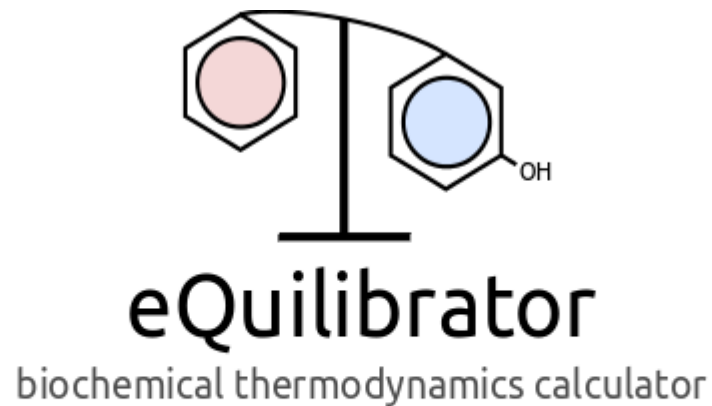
The simplest cycles are:

- (1) Thermodynamically infeasible
- (2) Kinetically slower
- (3) Employing oxygen sensitive enzymes





# Equilibrator - a web interface for thermodynamic analysis of biochemical systems



Type a **compound name** or **reaction** or try an **example** below.

## Examples

### Reactions

Glucose  $\Rightarrow$  2 Ethanol + 2  $\text{CO}_2$   
L-Malate +  $\text{NAD}^+$   $\Rightarrow$  Oxaloacetate + NADH  
ATP + Water  $\rightleftharpoons$  ADP + Phosphate

### Compounds

ATP  
Glucose  
Succinyl-CoA

### Enzymes

Rubisco  
Aldolase  
Hexokinase

# Rational design converges with natural selection

Under constraint of using Rubisco as carboxylating enzyme:  
-> Ideal solution is Calvin cycle

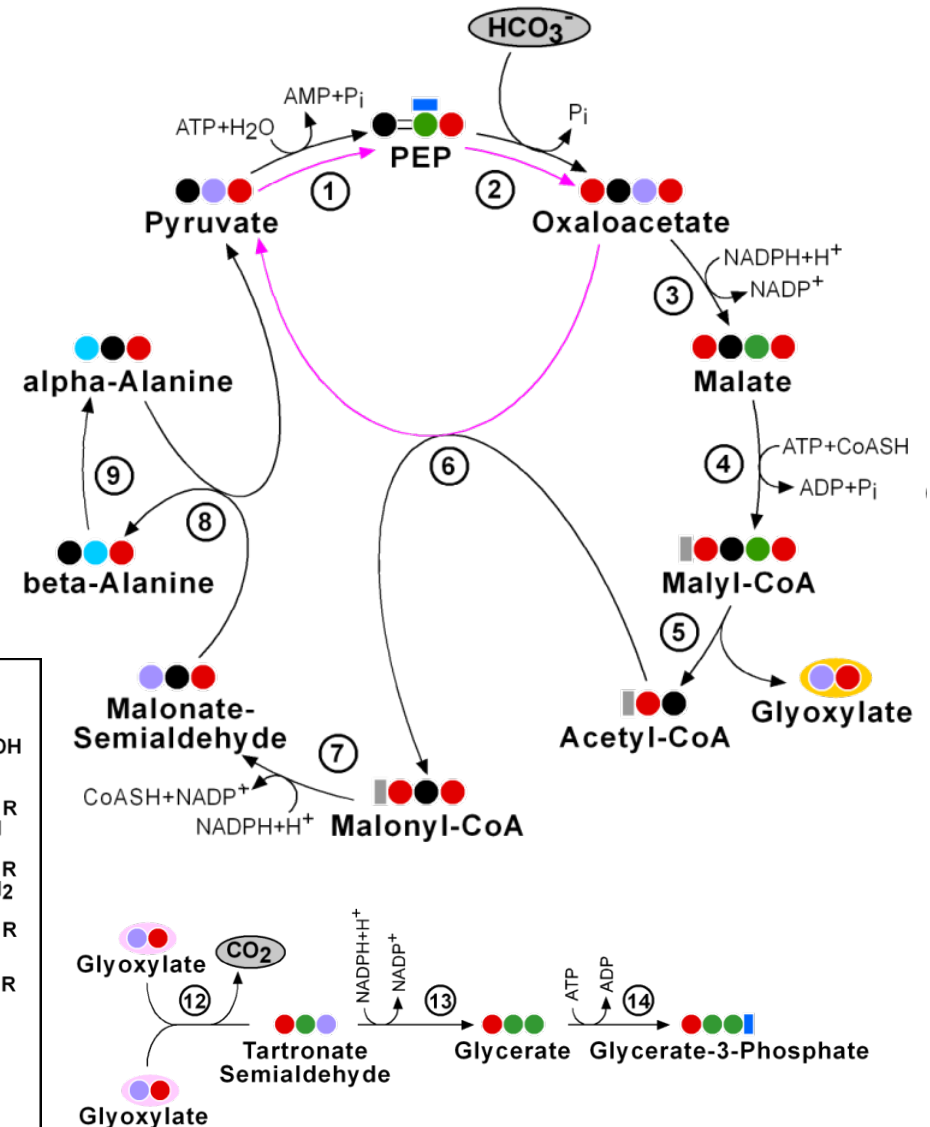
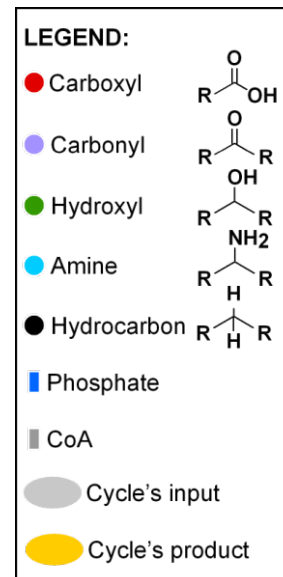
With no constraints other than using naturally occurring enzymes...

# We find a family of promising novel pathways

The Malonyl-CoA – Oxaloacetate – Glyoxylate family of pathways is predicted to be:

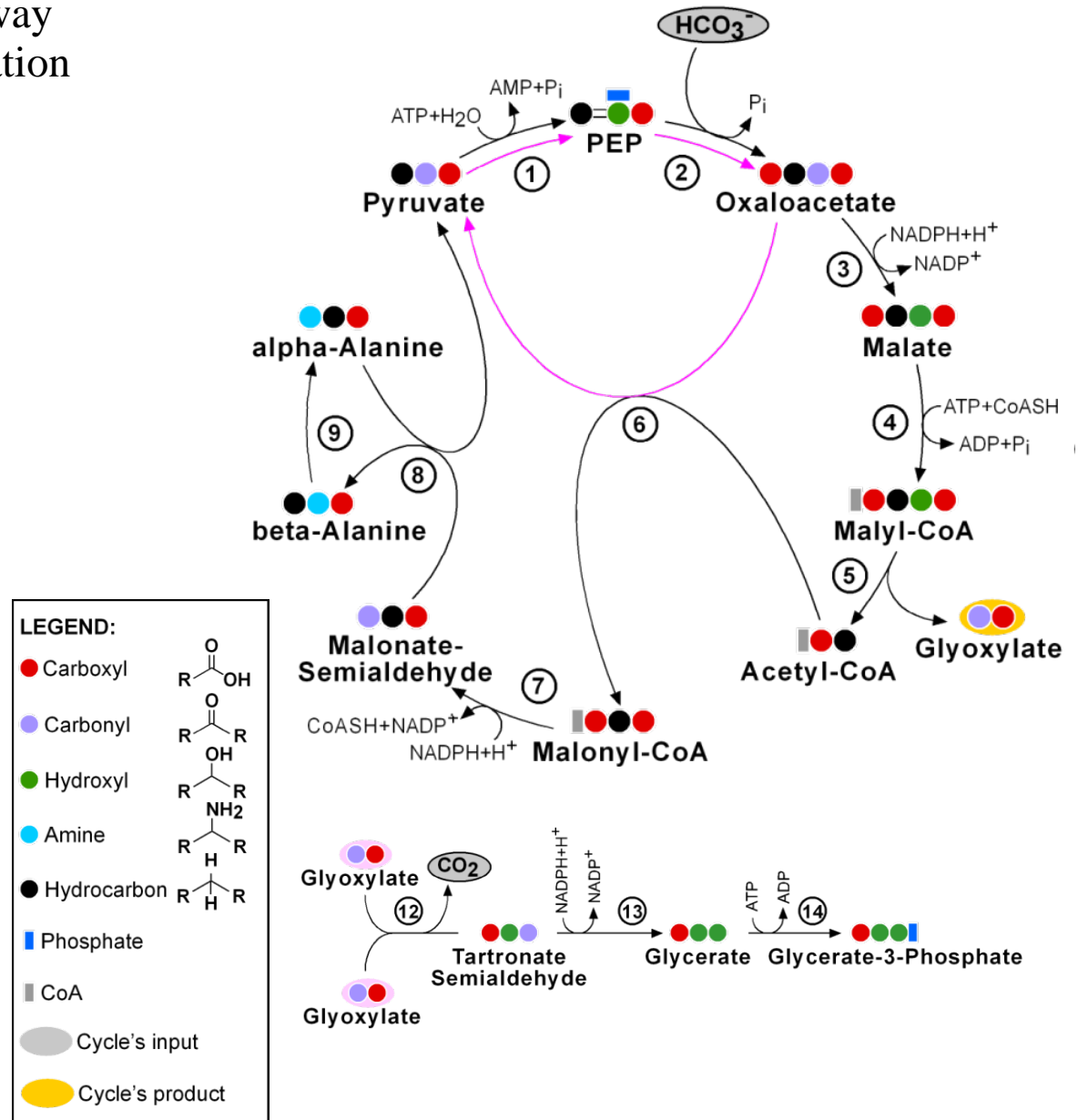
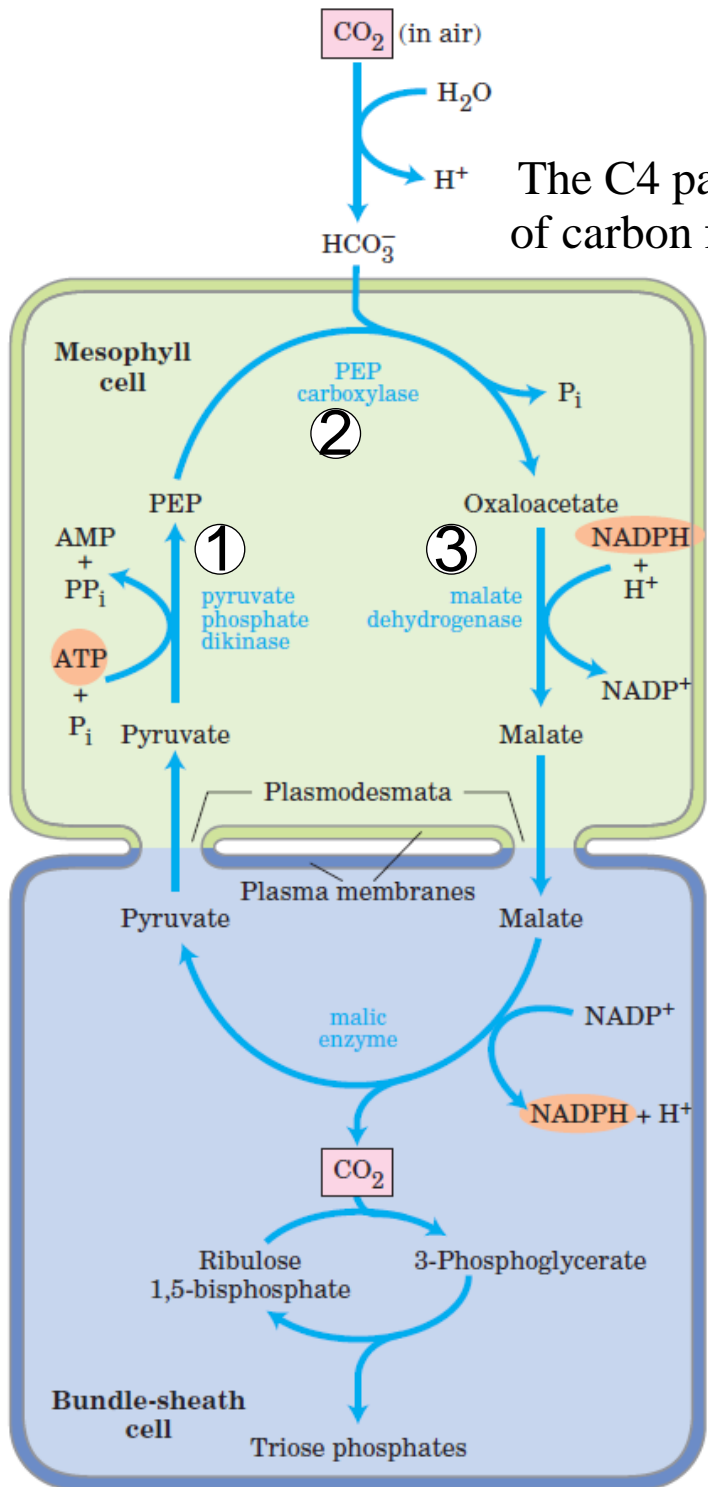
- (1) Kinetically faster  
*2-3 fold faster than Calvin Cycle*
- (2) Thermodynamically & energetically feasible
- (3) Impose least metabolic changes

Can we achieve better results than natural pathway? Maybe if the constraints are different



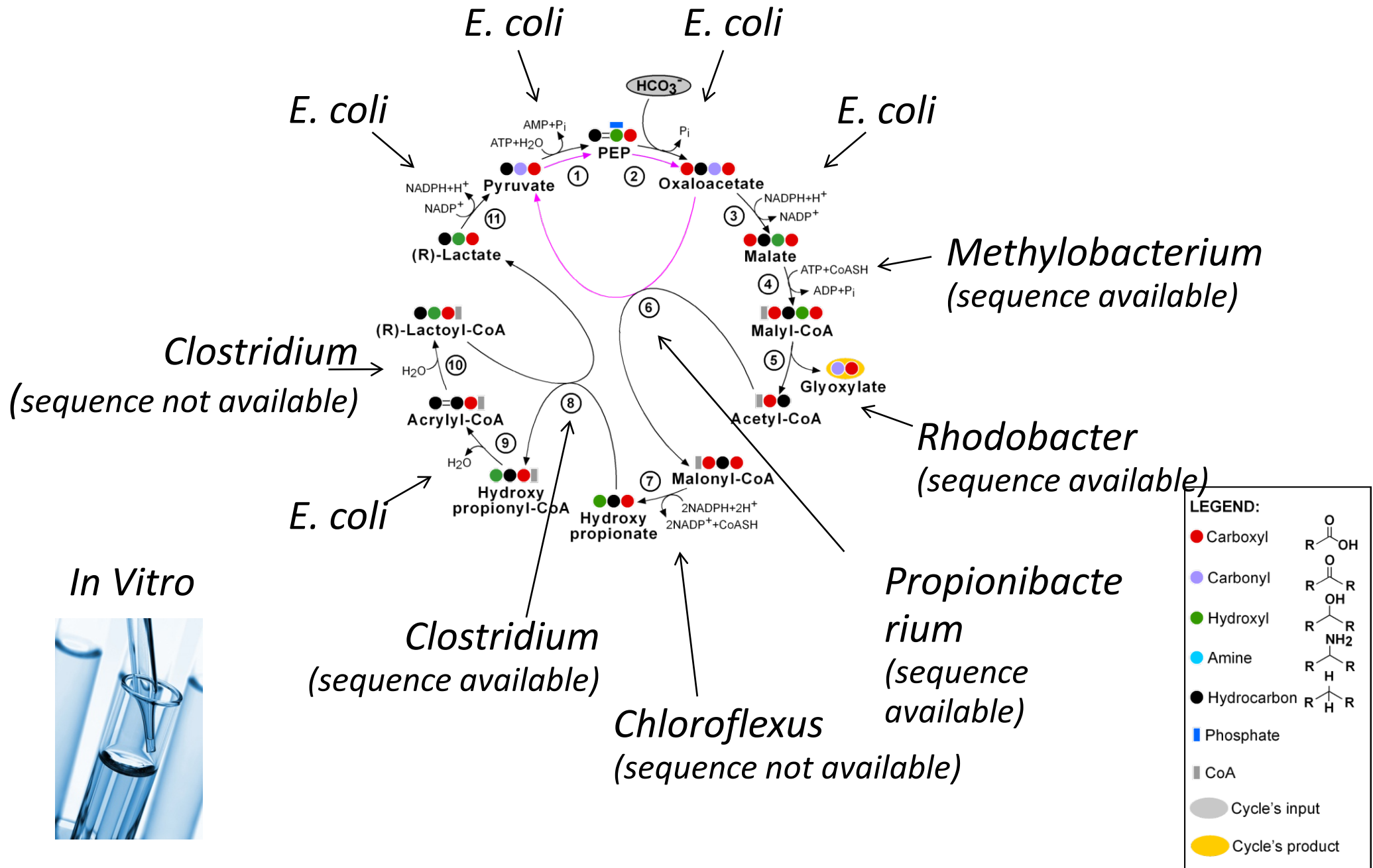


## The C4 pathway of carbon fixation





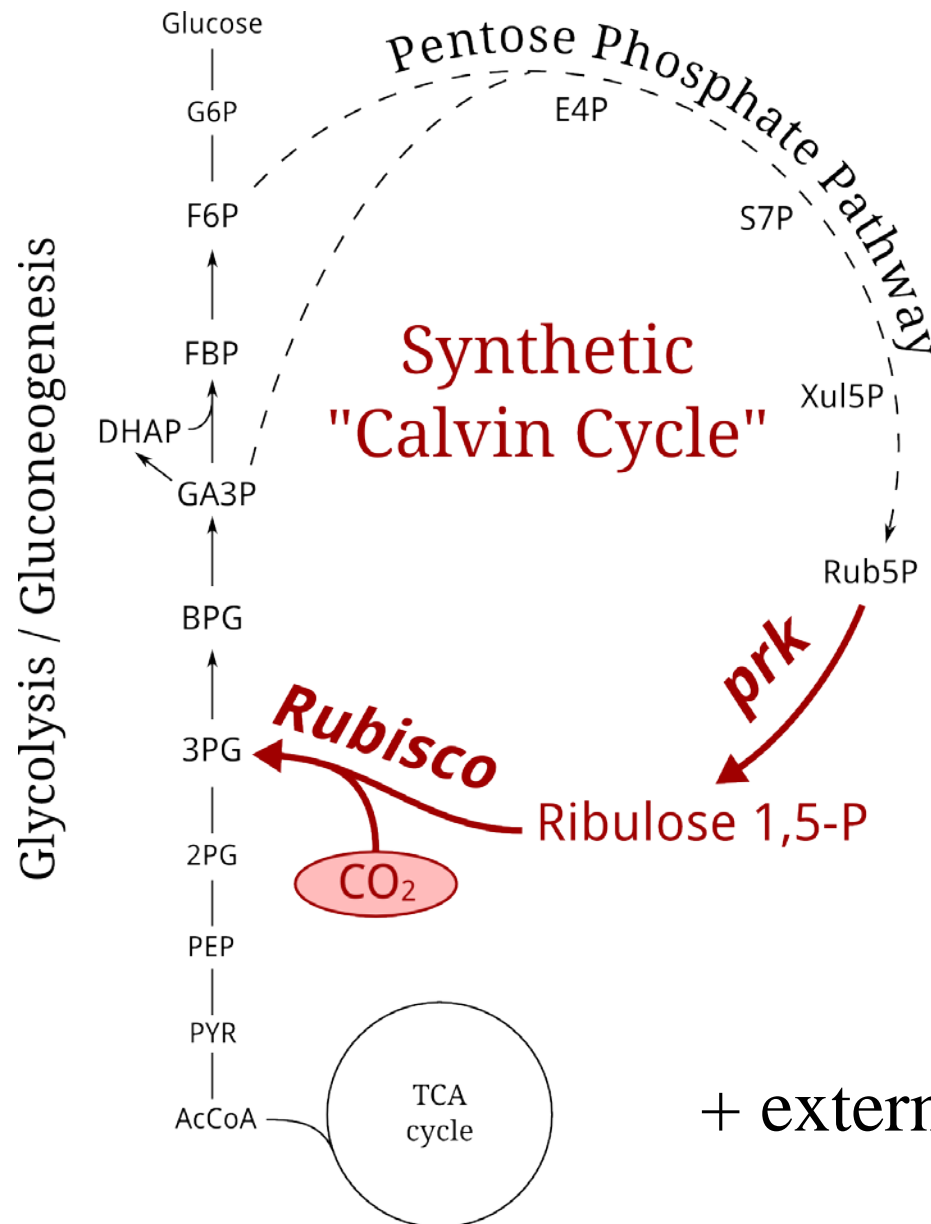
# Testing the synthetic cycles by merging enzymes from several organisms





Testing computational predictions *in vivo*:  
we develop a model system for comparing  
novel carbon fixation pathways

# Only two genes are missing in *E. coli* to complete the Calvin-Benson cycle



See also:  
Bonacci, ..., Savage,  
PNAS 2012

+ external energy source

# The real energy sources....



**Lior  
Zelcbuch**

**Shira  
Amram**

**Niv  
Antonovsky**



Toxicity hampers cloning efforts

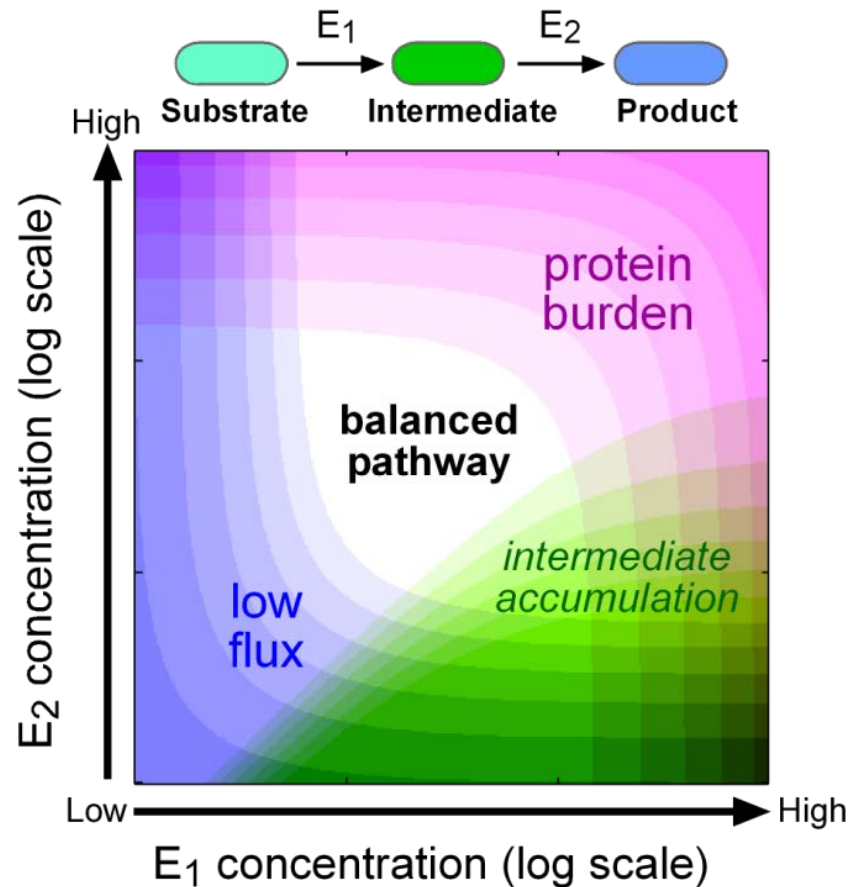
Enzyme levels are either too high or too low, or combination

Requires a novel method for exploring space of expression levels

# Different expression levels in a synthetic metabolic pathway should be tested to find a balanced pathway

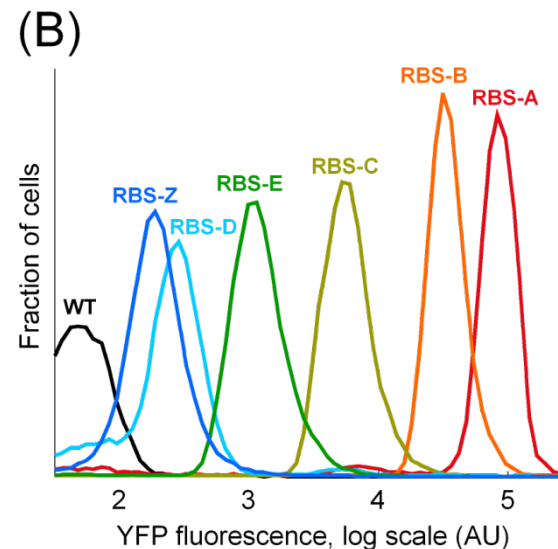
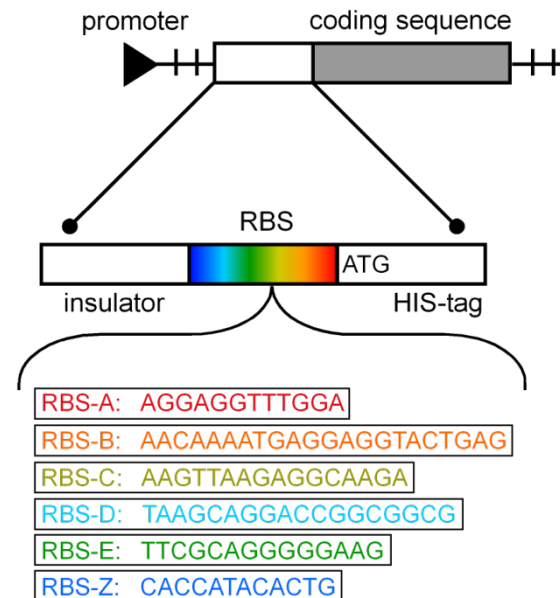
Location in expression space of the “ideal” balance is very difficult to predict

Requires experimental method to explore expression space efficiently

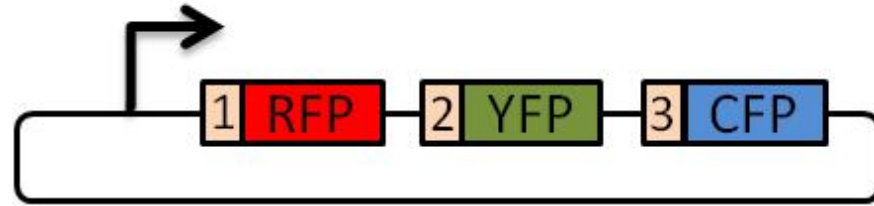


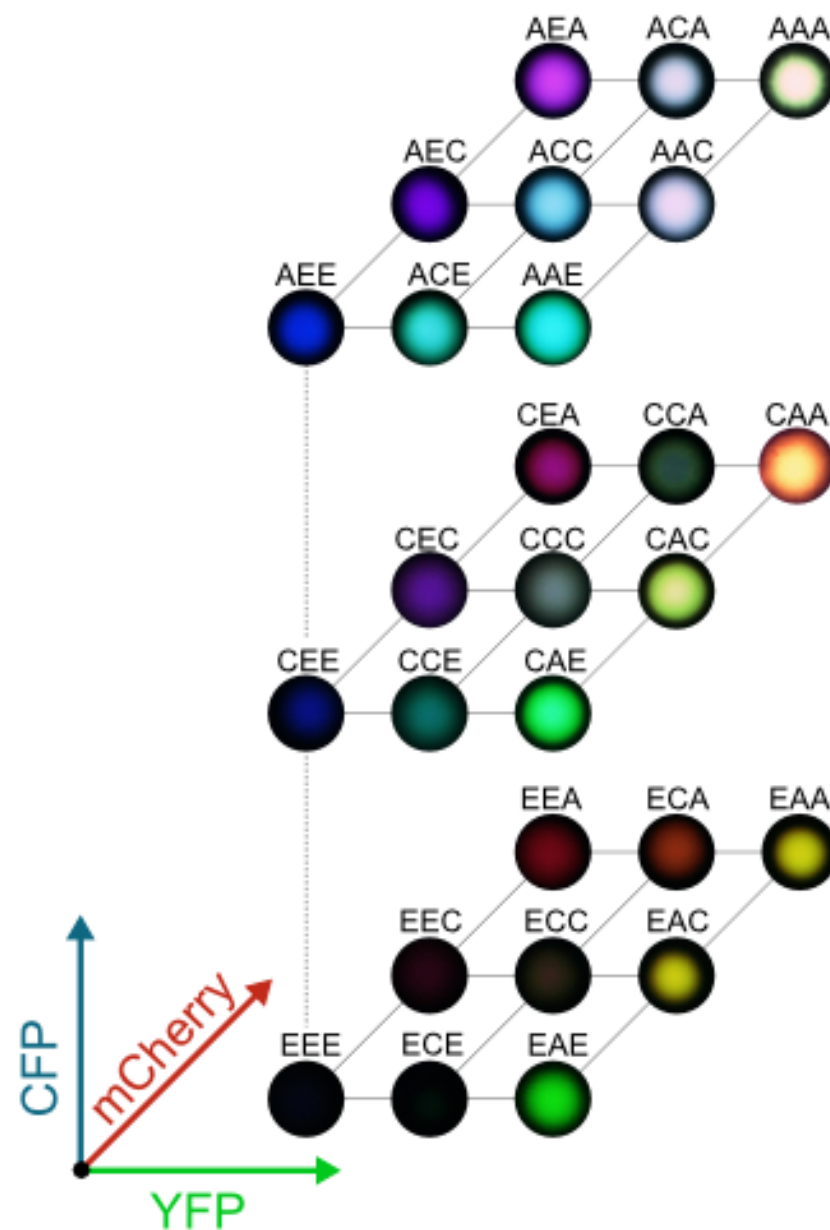
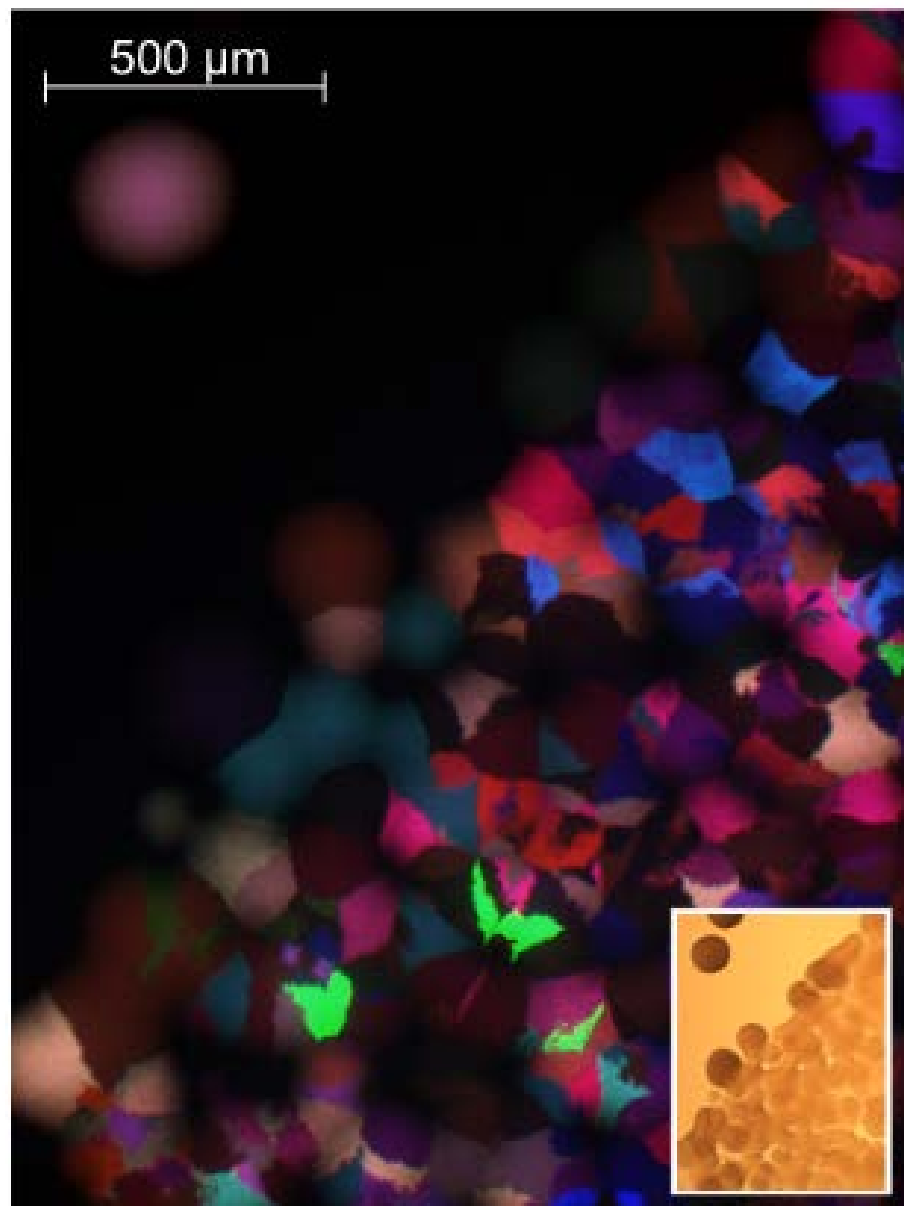
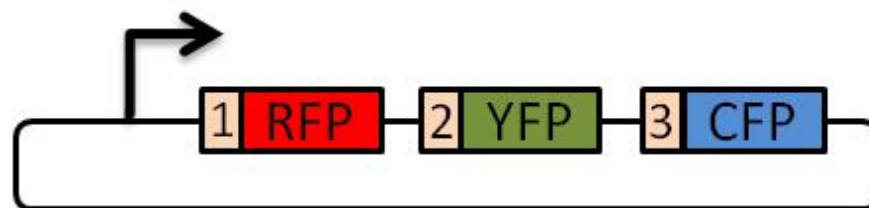
# Ribosome binding site modulation explores expression space

Following: *Salis, Mirsky  
& Voigt, NBT 2009*



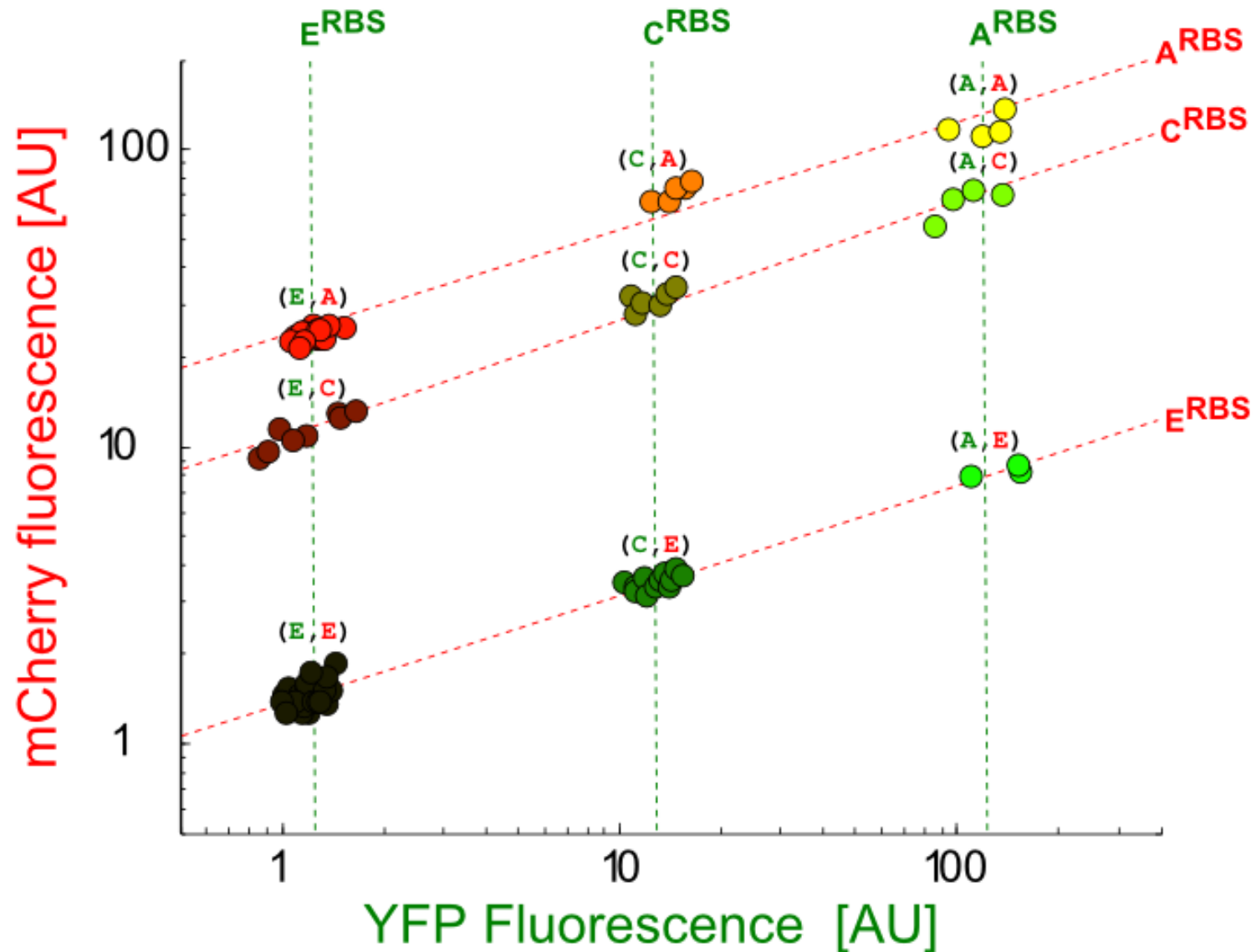
# Proof of concept – using ribosome binding sites to span fluorophores expression space







Expression space is spanned in a combinatorial manner over ~2 orders of magnitude



- 
- The background of the slide is an abstract, dark image with various colorful, irregular shapes and patches. The colors include shades of green, blue, purple, red, orange, and yellow, creating a complex, textured appearance. The text is overlaid on this background.
- Enabled us to solve the toxicity problem in bacteria
  - Useful for optimizing pathways

# Expressing & testing key steps of carboxylation

Ribose-5-P



(Ribose-5-phosphate isomerase, *E. coli*)

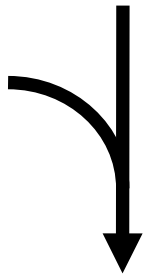
Ribulose-5-P



**PRK** (Phosphoribulokinase, *S. elongatus*)

Ribulose-1,5-BP

CO<sub>2</sub>



**Rubisco** (*R. rubrum*)

Glycerate-3P (x2)

# Ribose-5-P *in-vitro* carbon fixation assay using *E.coli* extracts

(Ribose-5-phosphate isomerase, *E. coli*)

Ribulose-5-P



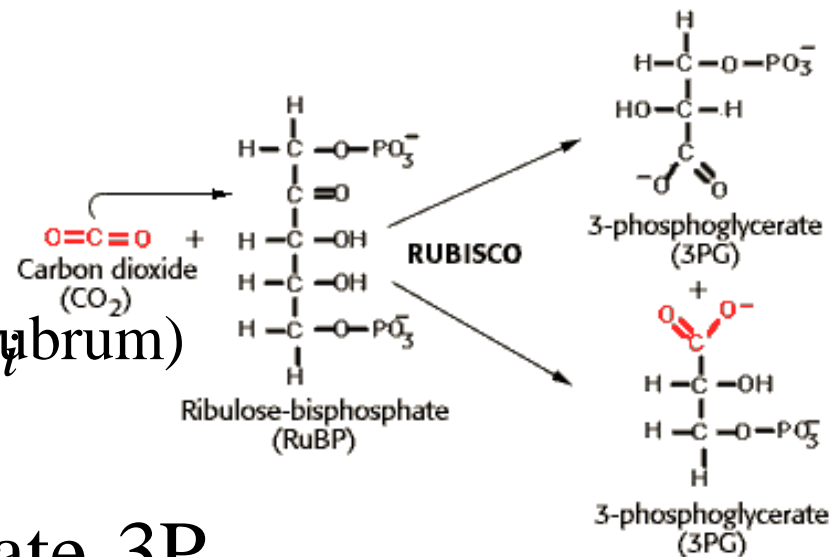
**PRK** (Phosphoribulokinase, *S. elongatus*)

Ribulose-1,5-BP

<sup>13</sup>CO<sub>2</sub>

**Rubisco** (*R. rubrum*)  
“Carbon fixing”  
cell extract

<sup>13</sup>Glycerate-3P + Glycerate-3P

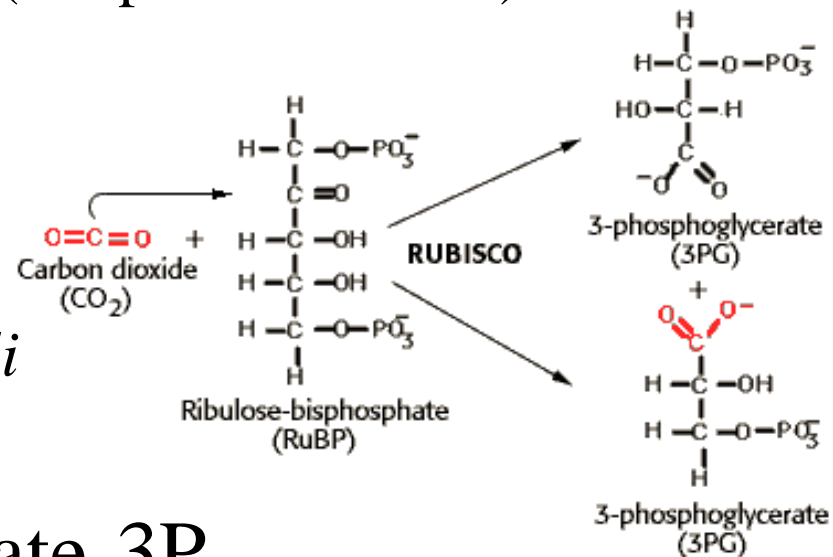
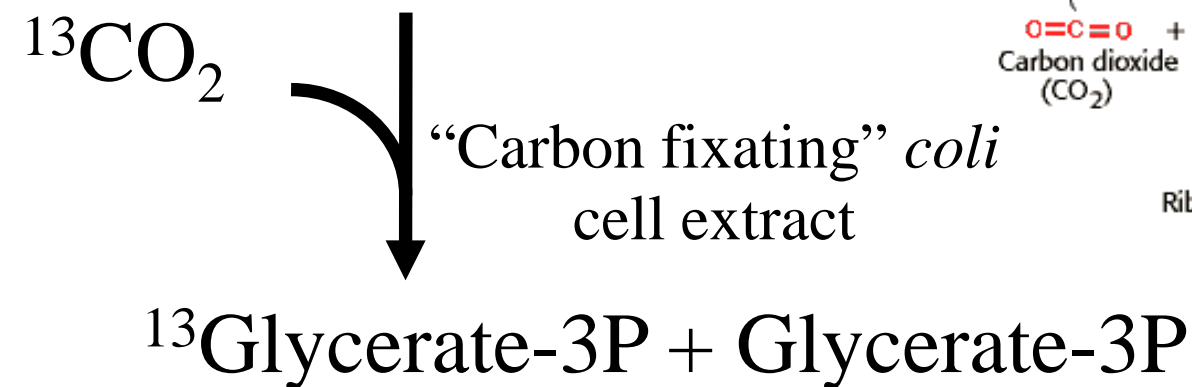


# Carbon fixation assay using LC-MS



Ilana Rogachev and Sergey Malitsky (Asaph Aharoni lab)

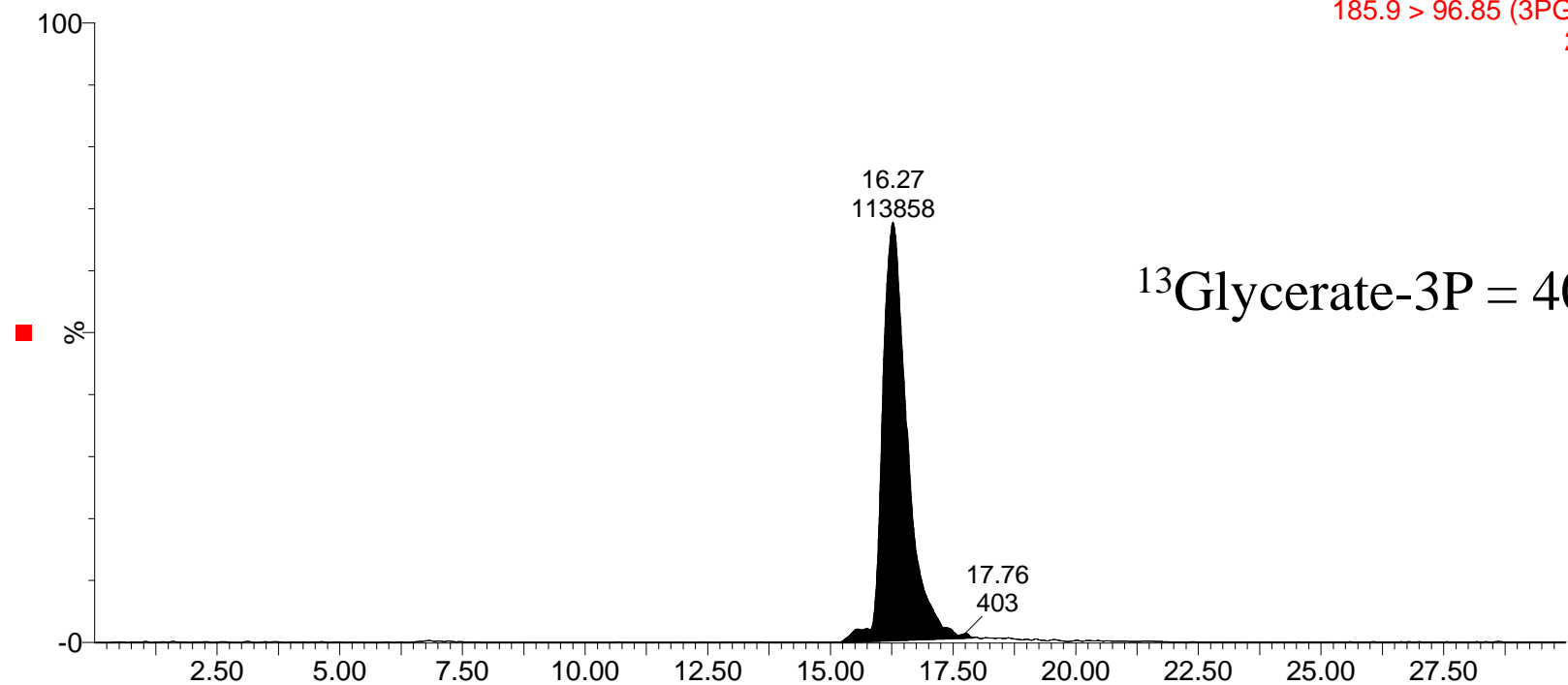
Ribulose-1,5-BP





BP\_N5\_27\_Jan\_33 Sm (SG, 2x8)

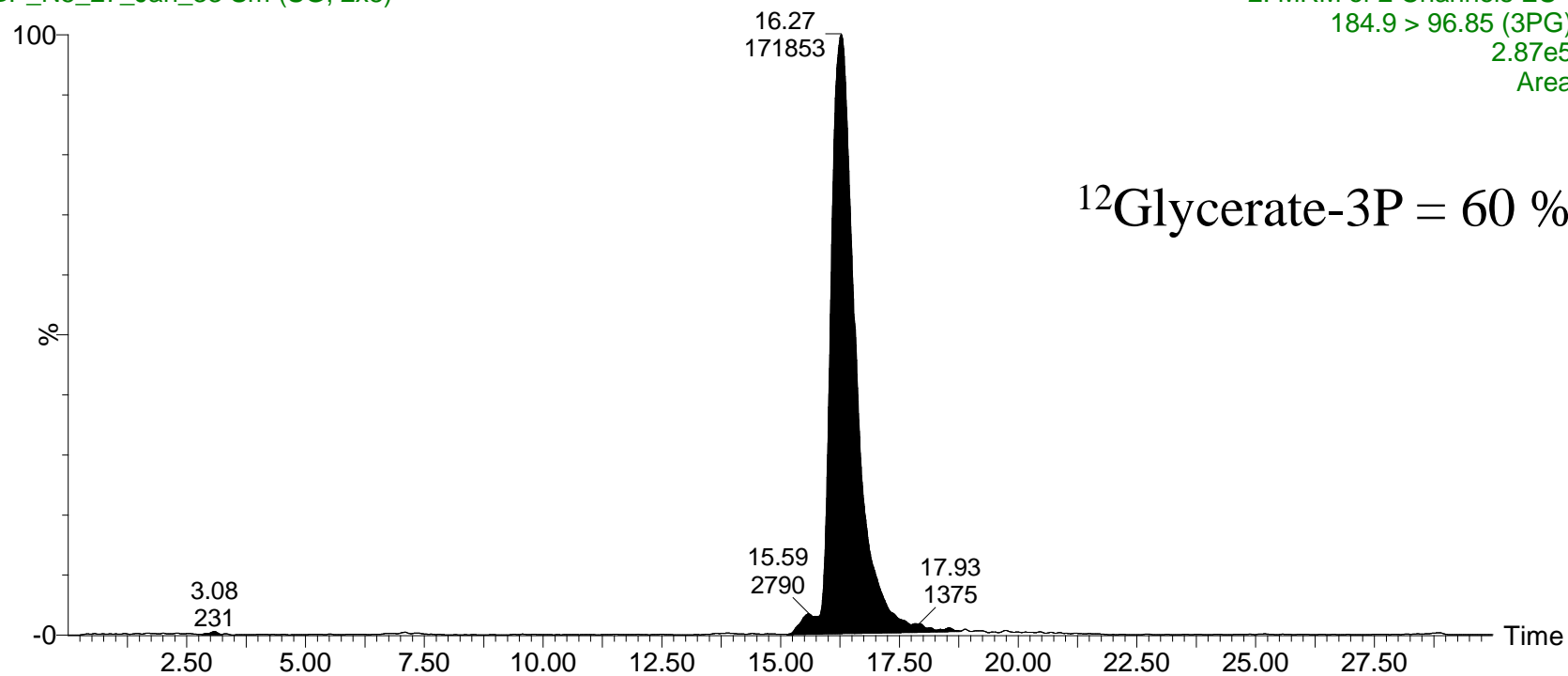
2: MRM of 2 Channels ES-  
185.9 > 96.85 (3PG\_C13)  
2.87e5  
Area



$^{13}\text{Glycerate-3P} = 40 \%$

BP\_N5\_27\_Jan\_33 Sm (SG, 2x8)

2: MRM of 2 Channels ES-  
184.9 > 96.85 (3PG)  
2.87e5  
Area



$^{12}\text{Glycerate-3P} = 60 \%$

Ribose-5-P



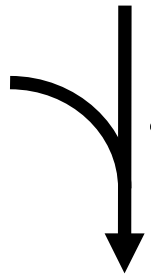
“Carbon fixing” *coli*  
(Ribose-5-phosphate isomerase, *E. coli*)  
cell extract

Ribulose-5-P



“Carbon fixing” *coli*  
**PRK** (Phosphoribulokinase, *S. elongatus*)  
cell extract

Ribulose-1,5-BP



**Rubisco** (*R. rubrum*)  
“Carbon fixing” *coli*  
cell extract

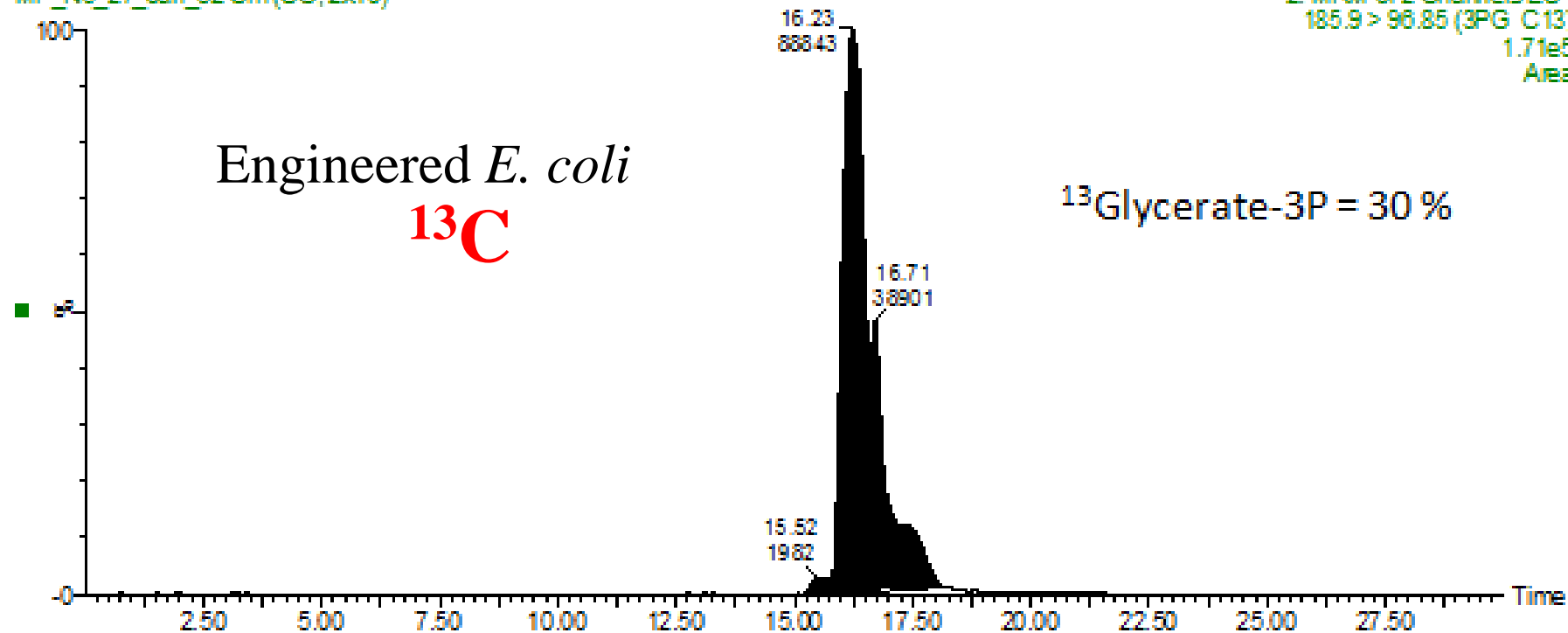
<sup>13</sup>Glycerate-3P + Glycerate-3P

MP\_N5\_27\_Jan\_32 Sm(SG, 2x10)

2: MRM of 2 Channels ES-  
185.9 > 96.85 (3PG C13)  
1.71e5  
Area

Engineered *E. coli*  
 **$^{13}\text{C}$**

$^{13}\text{Glycerate-3P} = 30\%$

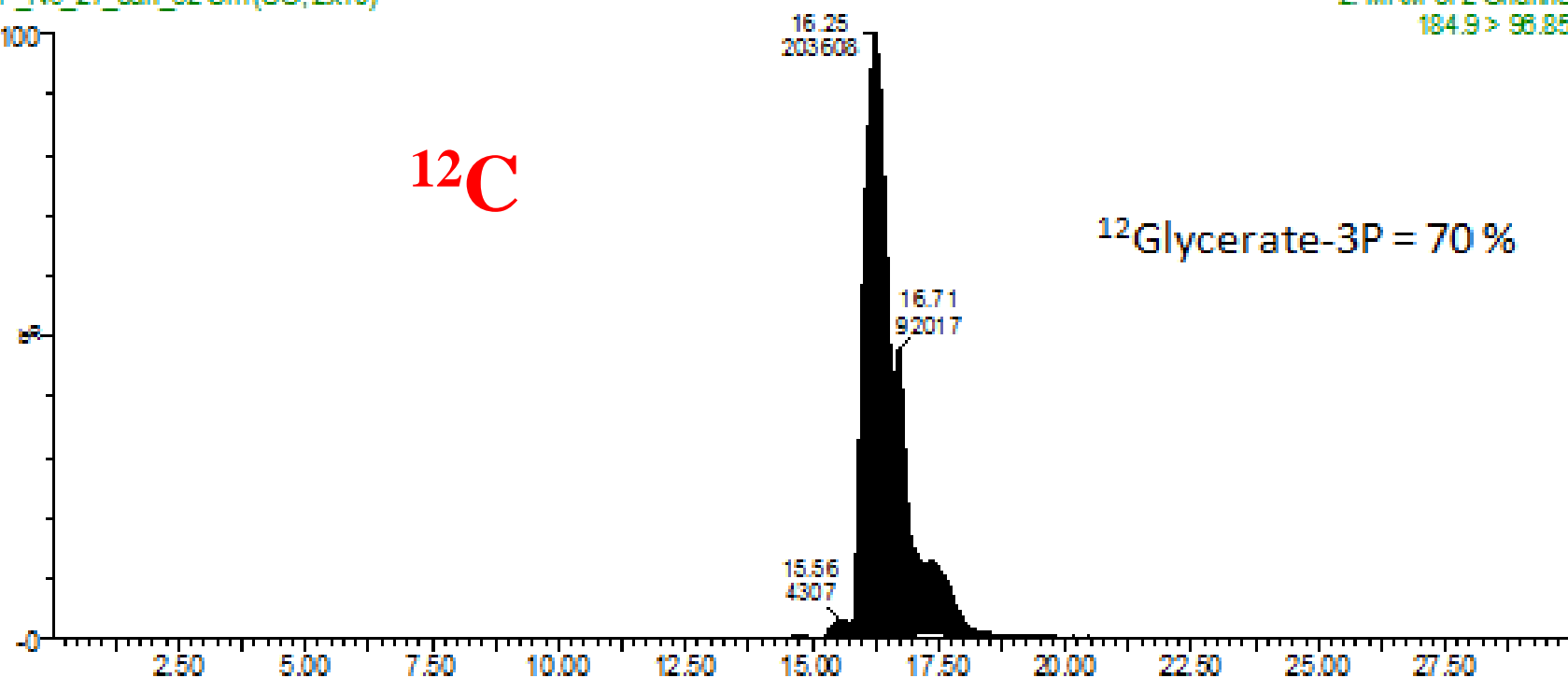


MP\_N5\_27\_Jan\_32 Sm(SG, 2x10)

2: MRM of 2 Channels ES-  
184.9 > 96.85 (3PG)  
3.98e5  
Area

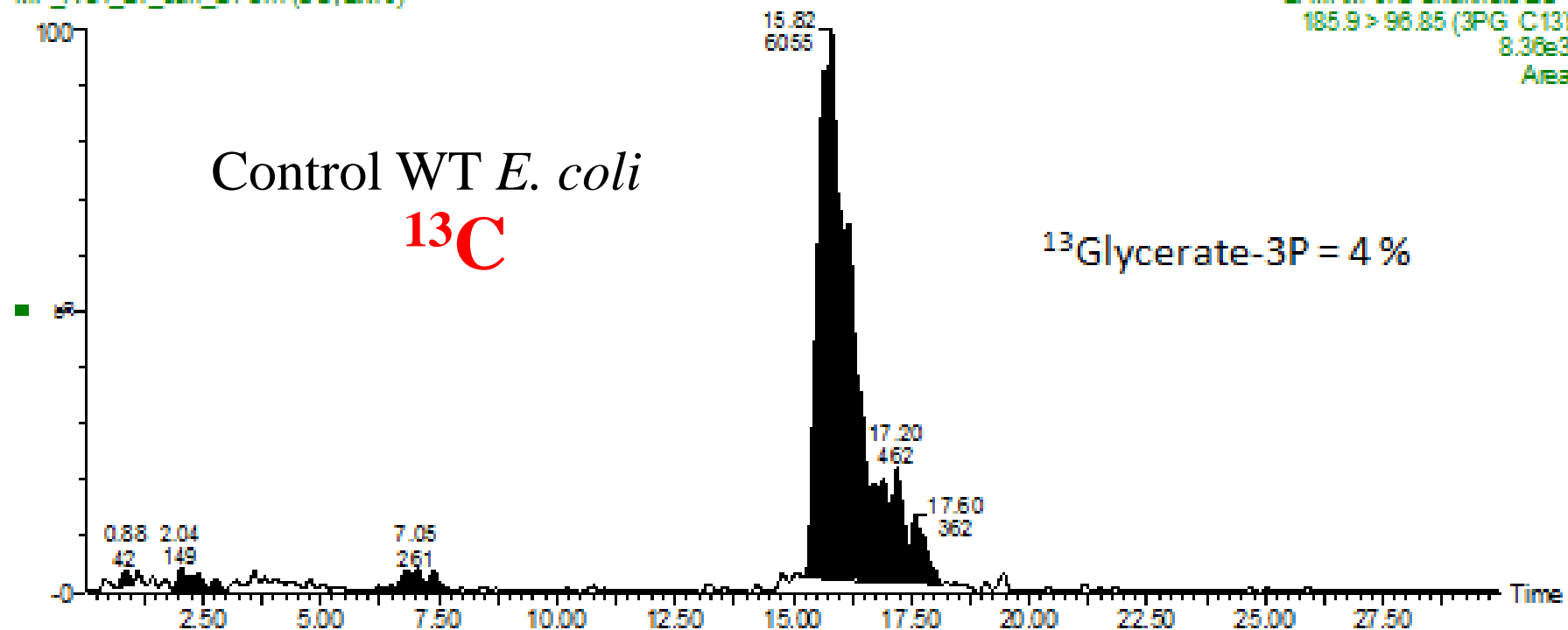
**$^{12}\text{C}$**

$^{12}\text{Glycerate-3P} = 70\%$



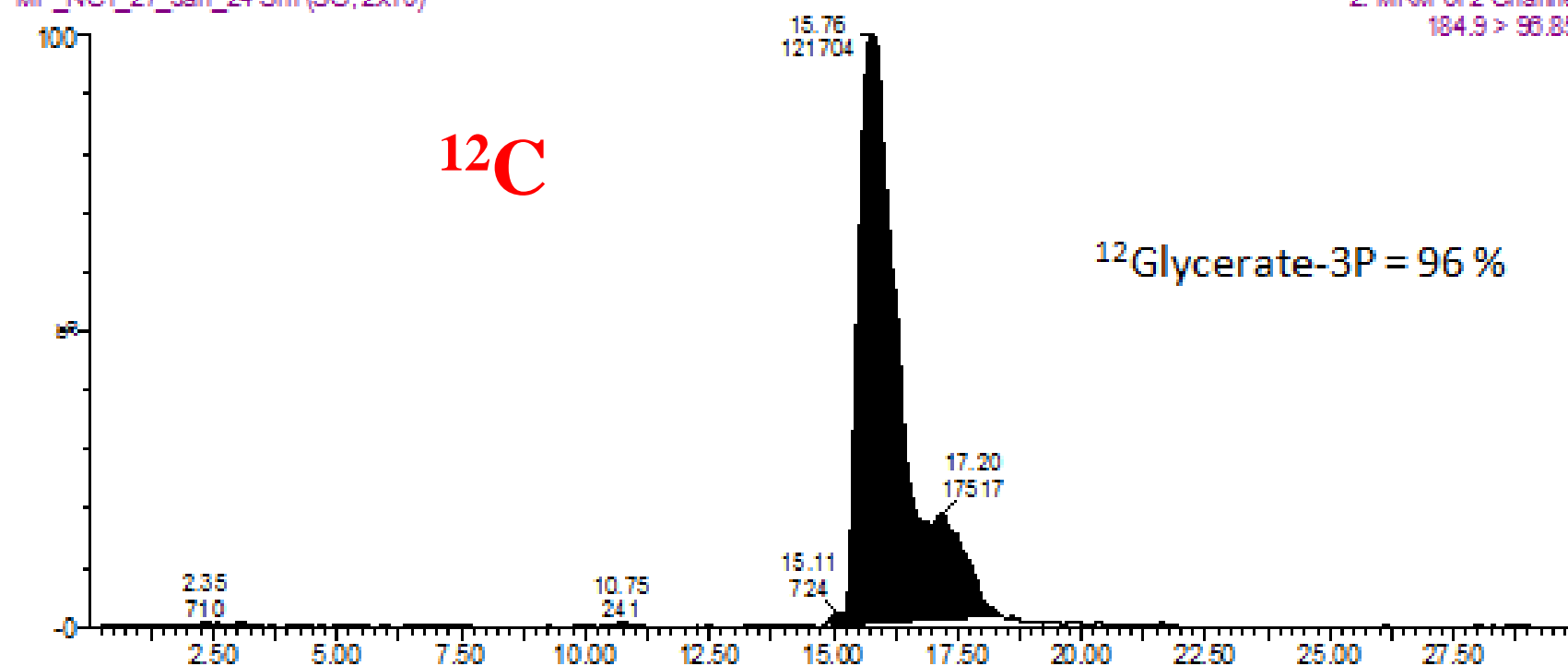
MP\_NC1\_27\_Jan\_24 Sm (SG, 2x10)

2: MRM of 2 Channels ES-  
185.9 > 98.85 (3PG C13)  
8.36e3  
Area

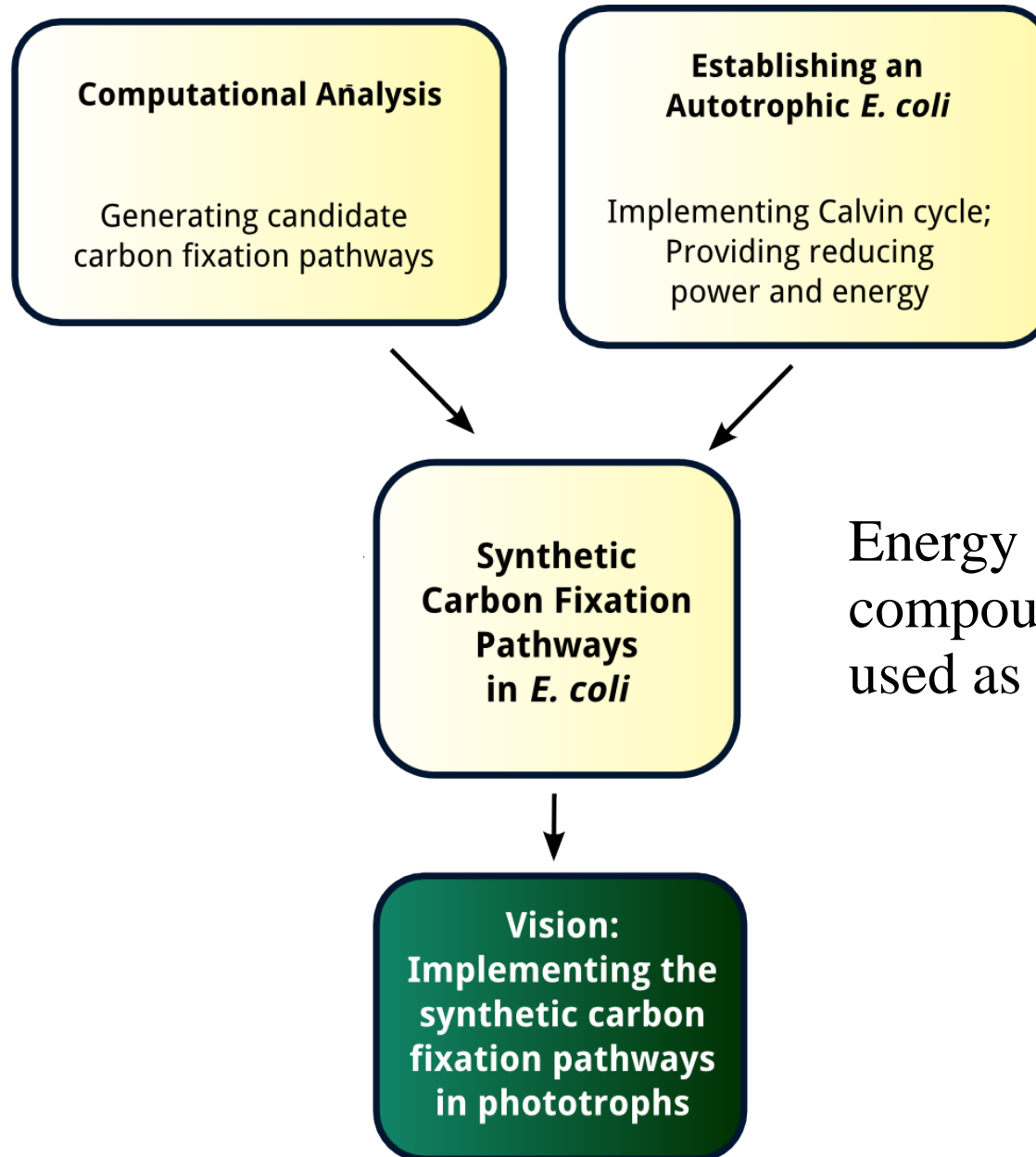


MP\_NC1\_27\_Jan\_24 Sm (SG, 2x10)

2: MRM of 2 Channels ES-  
184.9 > 98.85 (3PG)  
1.39e5  
Area



# Experimentally engineer carbon fixating *E. coli* as part of grand plan



Energy supplied by reduced compound that cannot be used as carbon source



We are aware that  
**“evolution is smarter than you are”**  
(Orgel's law)

We expect to learn about **horizontal gene transfer**,  
**constraints on metabolic networks** and  
**limits to productivity**

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Search

Find Terms:  e.g., ribosome, p53, transcription

Organism:  all

Click a row for more details.

ID	Property	Organism	Value	Range/Units
195	Available ribosomes	Bacteria Escherichia coli	500	nm
92	Average distance between ribosomes on mRNA	Bacteria Escherichia coli	80	41-79 nucleotides
122	Diameter of ribosome	Bacteria Escherichia coli	20	nm
343	Elongation rate of ribosomes in Xenopus laevis stage VI oocytes	African clawed frog Xenopus laevis	3	nucleotides/s
119	MW of ribosome	Bacteria Escherichia coli	2700	kDa/kDa
112	Number of protein types to make ribosome	Bacteria Escherichia coli	55	unitless
260	Number of ribosomes	Budding yeast Saccharomyces cerevisiae	200,000	unitless
111	Number of ribosomes/cell	Bacteria Escherichia coli	18,000	unitless
113	Number of RNA types to make ribosome	Bacteria Escherichia coli	3	unitless
253	Percent of total transcription devoted to ribosomal RNA	Yeast	80	Percent
190	Ribosome + rRNA → Ribosome rRNA+1	Bacteria Escherichia coli	100	bp/sec
484	Ribosome diameter	Generic	30	nm
483	Ribosome volume	Generic	1.4e-5	um <sup>3</sup>
390	Ribosomes	African clawed frog Xenopus laevis	10e+11	ribosomes
51	Volume occupied by ribosomes	Bacteria Escherichia coli	8	Percent
123	Volume of ribosome	Bacteria Escherichia coli	6.2e-6	um <sup>3</sup>

ATP to make one cell: ~55 billion  
 Volume occupied by RNA: 6%  
 Number of tRNA/cell: ~200,000  
 Speed: 50  $\mu$ m/sec  
 Ribosomes: 6,800 - 72,000  
 Proteins: ~ $3.6 \times 10^6$   
 Translation rate: 12 - 21 aa/sec  
 Volume occupied by water: 70%



Generation time: 4 days  
 Cells in an adult male: 1031  
 Number of genes: 20,621  
 Eggs laid during lifetime: 300  
 Size of Genome: 100Mbp  
 Life span: 2-3 weeks  
 Run speed at 20°C: 0.13mm/sec  
 Cells in hatched larvae: 556



Median haploid volume: 42  $\mu$ m<sup>3</sup>  
 Number of ribosomes: ~200,000  
 Nucleus volume: 7% of cell  
 mRNA out of total RNA: 5%  
 mRNA in cell: 15,000  
 Kcat of Pyruvate kinase: 71,400/min  
 Cell diameter: ~5 $\mu$ m  
 RNA to DNA ratio: 50



Total number of taste buds: 10,000  
 Cell divisions in a life-time:  $10^{17}$   
 Abundance of p53 per cell: ~160,000  
 Average brain weight: ~1350g  
 Hairs on the head: 90,000-150,00  
 Diameter of erythrocytes: 7.5 $\mu$ m  
 Weight of skin: 4.1 Kg  
 Average time between blinks: 2.8 Sec

## SnapShot: Key Numbers in Biology

## Cell

Uri Moran,<sup>1</sup> Rob Phillips,<sup>2</sup> and Ron Milo<sup>1</sup>

<sup>1</sup>Weizmann Institute of Science, Rehovot, Israel; <sup>2</sup>California Institute of Technology, Pasadena, CA, USA

Cell size	Concentration	Diffusion and catalysis rate
<p><b>Bacteria (<i>E. coli</i>):</b> <math>\approx 0.7\text{--}1.4\ \mu\text{m}</math> diameter, <math>\approx 2\text{--}4\ \mu\text{m}</math> length, <math>\approx 0.5\text{--}5\ \mu\text{m}^3</math> in volume; <math>10^8\text{--}10^9</math> cell/ml for culture with <math>\text{OD}_{600} \approx 1</math></p> <p><b>Yeast (<i>S. cerevisiae</i>):</b> <math>\approx 3\text{--}6\ \mu\text{m}</math> diameter <math>\approx 20\text{--}160\ \mu\text{m}^3</math> in volume</p> <p><b>Mammalian cell volume:</b> <math>100\text{--}10,000\ \mu\text{m}^3</math>; HeLa cell: <math>500\text{--}5000\ \mu\text{m}^3</math> (adhering to slide <math>\approx 15\text{--}30\ \mu\text{m}</math> diameter)</p>	<p><b>Concentration of 1 nM:</b> in <i>E. coli</i> <math>\approx 1</math> molecule/cell; in HeLa cells <math>\approx 1000</math> molecules/cell</p> <p><b>Characteristic concentration for a signaling protein:</b> <math>\approx 10\ \text{nM}\text{--}1\ \mu\text{M}</math></p> <p><b>Water content:</b> <math>\approx 70\%</math> by mass; general elemental composition (dry weight) of <i>E. coli</i>: <math>\approx \text{C}_4\text{H}_7\text{O}_2\text{N}_1</math>; Yeast: <math>\approx \text{C}_6\text{H}_{10}\text{O}_3\text{N}_1</math></p> <p><b>Composition of <i>E. coli</i> (dry weight):</b> <math>\approx 55\%</math> protein, <math>20\%</math> RNA, <math>10\%</math> lipid, <math>15\%</math> other</p> <p><b>Protein concentration:</b> <math>\approx 100\ \text{mg/ml} = 3\ \text{mM}</math>. <math>10^6\text{--}10^7</math> per <i>E. coli</i> (depending on growth rate); Total metabolites (MW <math>&lt; 1\ \text{kDa}</math>) <math>\approx 300\ \text{mM}</math></p>	<p><b>Diffusion coefficient for an “average” protein:</b> in cytoplasm <math>D \approx 5\text{--}15\ \mu\text{m}^2/\text{s} \rightarrow \approx 10\ \text{ms}</math> to traverse an <i>E. coli</i> <math>\rightarrow \approx 10\ \text{s}</math> to traverse a mammalian HeLa cell; small metabolite in water <math>D \approx 500\ \mu\text{m}^2/\text{s}</math></p> <p><b>Diffusion-limited on-rate for a protein:</b> <math>\approx 10^8\text{--}10^9\ \text{s}^{-1}\text{M}^{-1} \rightarrow</math> for a protein substrate of concentration <math>\approx 1\ \mu\text{M}</math> the diffusion-limited on-rate is <math>\approx 100\text{--}1000\ \text{s}^{-1}</math> thus limiting the catalytic rate <math>k_{\text{cat}}</math></p>
Length scales inside cells	Division, replication, transcription, translation, and degradation rates	Genome sizes and error rates
<p><b>Nucleus volume:</b> <math>\approx 10\%</math> of cell volume</p> <p><b>Cell membrane thickness:</b> <math>\approx 4\text{--}10\ \text{nm}</math></p> <p><b>“Average” protein diameter:</b> <math>\approx 3\text{--}6\ \text{nm}</math></p> <p><b>Base pair:</b> <math>2\ \text{nm}</math> (D) <math>\times 0.34\ \text{nm}</math> (H)</p> <p><b>Water molecule diameter:</b> <math>\approx 0.3\ \text{nm}</math></p>	<p>at <math>37^\circ\text{C}</math> with a temperature dependence (Q10) of <math>\approx 2\text{--}3</math></p>	<p><b>Genome size:</b> <i>E. coli</i> (enterobacteria) <math>\approx 5\ \text{Mbp}</math> <i>S. cerevisiae</i> (budding yeast) <math>\approx 12\ \text{Mbp}</math> <i>C. elegans</i> (nematode) <math>\approx 100\ \text{Mbp}</math> <i>D. melanogaster</i> (fruit fly) <math>\approx 120\ \text{Mbp}</math> <i>A. thaliana</i> (plant) <math>\approx 120\ \text{Mbp}</math> <i>M. musculus</i> (mouse) <math>\approx 2.5\ \text{Gbp}</math> <i>H. sapiens</i> (human) <math>\approx 2.9\ \text{Gbp}</math> <i>T. aestivum</i> (wheat) <math>\approx 16\ \text{Gbp}</math></p>
Energetics	<p><b>Cell cycle time</b> (exponential growth in rich media): <i>E. coli</i> <math>\approx 20\text{--}40\ \text{min}</math>; budding yeast <math>70\text{--}140\ \text{min}</math>; HeLa human cell line: <math>15\text{--}30\ \text{hr}</math></p>	
<p><b>Membrane potential</b> <math>\approx 70\text{--}200\ \text{mV} \rightarrow 2\text{--}6\ k_{\text{B}}T</math> per electron (<math>k_{\text{B}}T \equiv</math> thermal energy)</p>		



**Check for  
open positions**

