

Análise de Fluxos Metabólicos Empregando Carbono Marcado (^{13}C -MFA)

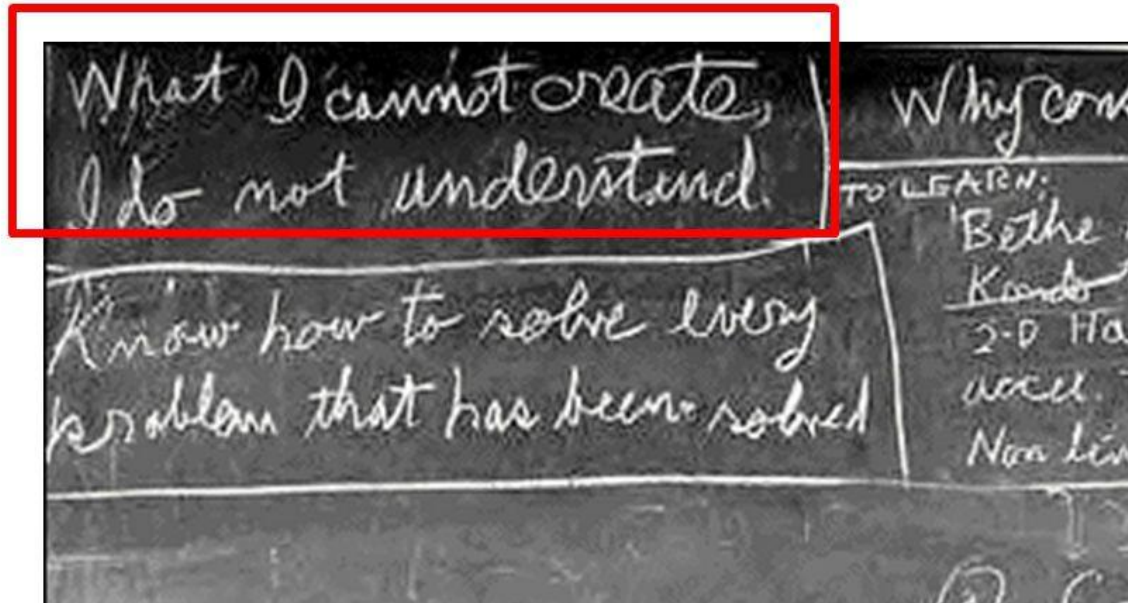
Rafael David de Oliveira

BMM5729-Análise Sistêmica e Engenharia do
Metabolismo Microbiano

Por que construimos modelos?

“What I cannot create,
I do not understand”

Richard Feynman

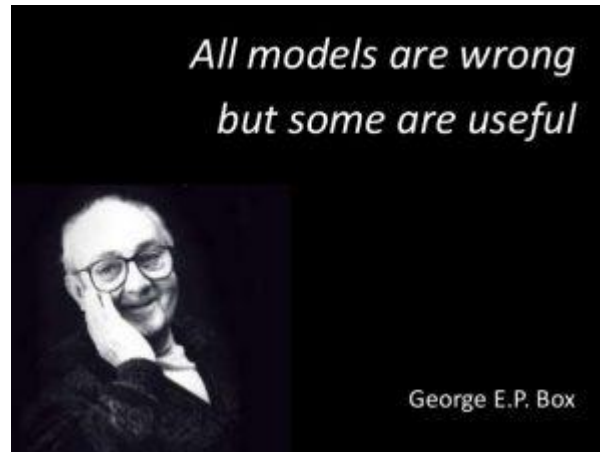


Por que construimos modelos?

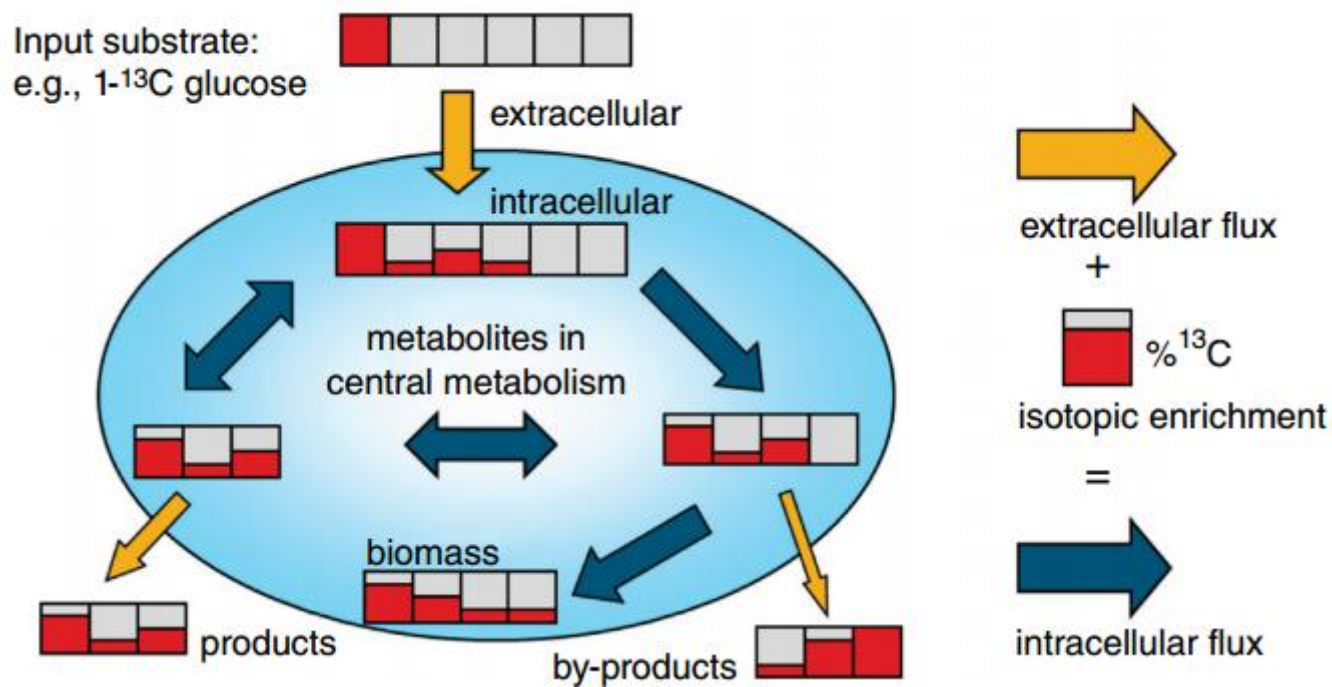
“If you can't model your Process, you don't understand it. If you don't understand it, you can't improve it. And, if you can't improve it, you won't be competitive in the 21st century.”

Jim Trainham, DuPont, 1994

Por que construímos modelos?

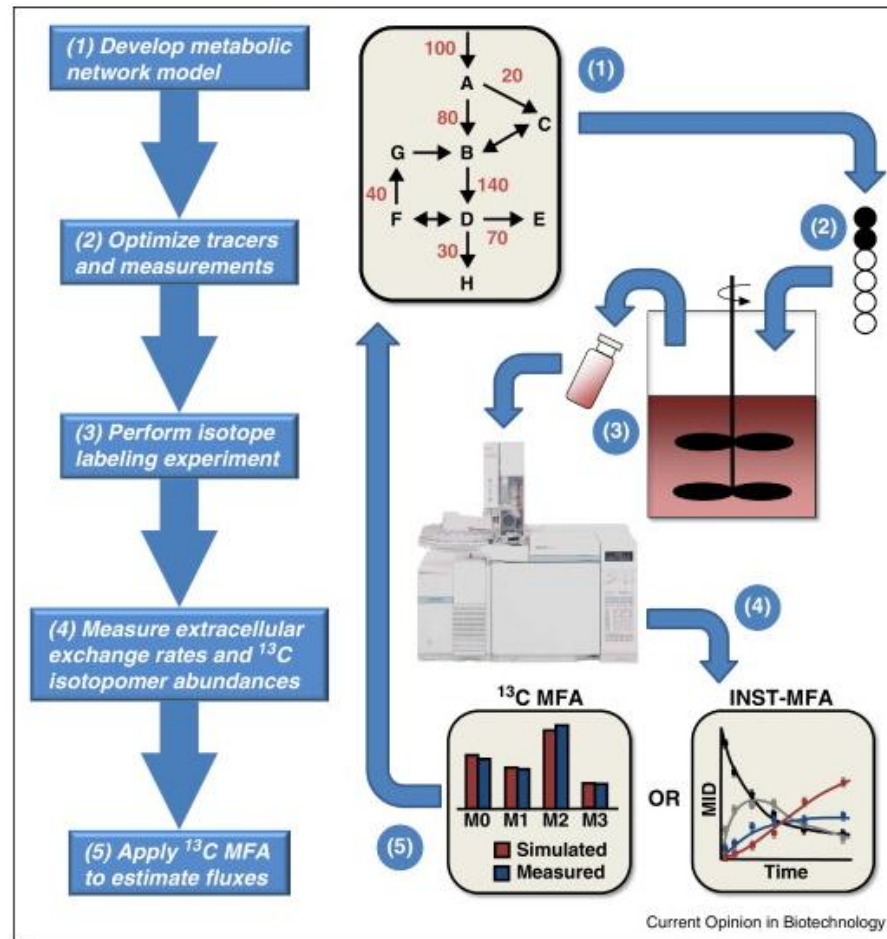


Visão Geral

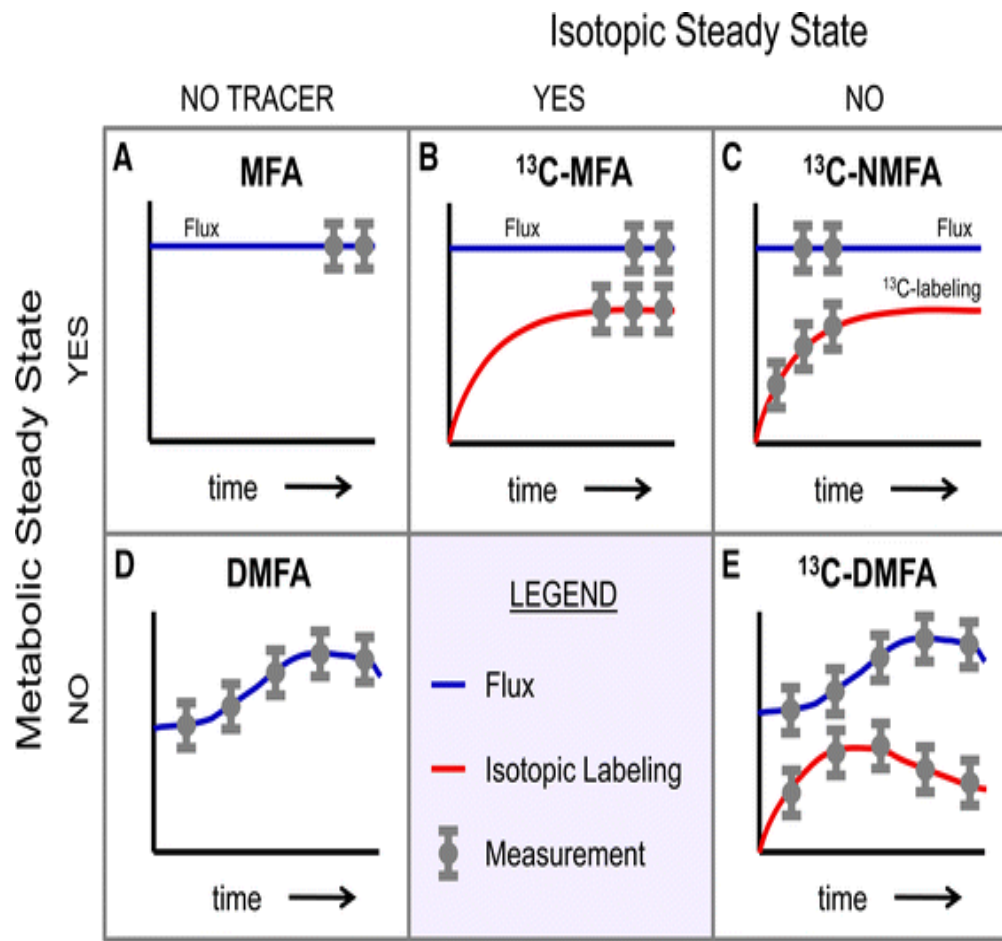


Fonte: WIECHERT, W. ¹³C-Metabolic Flux Analysis. Metabolic Engineering, mar. 2001.

Etapas da ^{13}C -MFA



Classificação dos métodos de MFA



Fonte: Antoniewicz, Maciek R. "Methods and Advances in Metabolic Flux Analysis: A Mini-Review." *Journal of Industrial Microbiology & Biotechnology* 42, no. 3 (March 2015)

^{13}C -NMFA e ^{13}C -DMFA

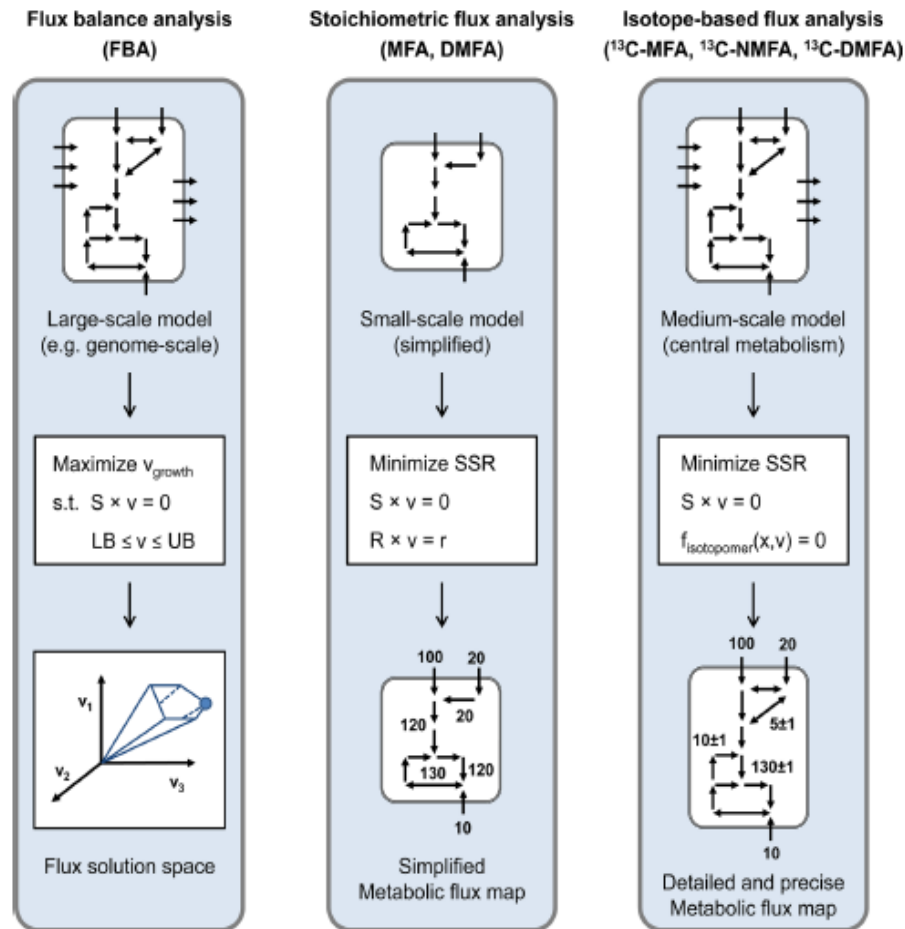
- **Vantagens**

- Estimação de uma quantidade maior de fluxos metabólicos
- Estudos de estados transientes
Redução de custos experimentais
- Crescimento em CO_2

- **Desafios**

- Número maior de medidas
- Amostragem rápida
- Métodos computacionais

Abordagem de cada método

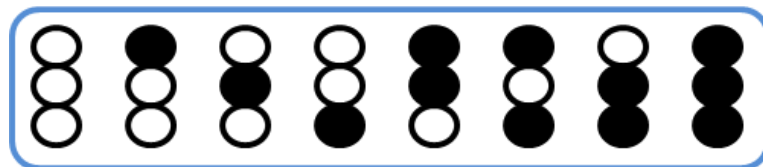


Fonte: Antoniewicz, Maciek R. "Methods and Advances in Metabolic Flux Analysis: A Mini-Review." Journal of Industrial Microbiology & Biotechnology 42, no. 3 (March 2015)

Conceito chave: Isotopômeros

Isotopômeros : Moléculas isômeras com átomos isótopos

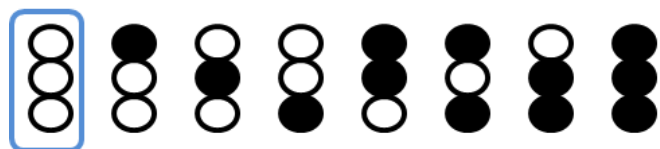
Isotopômeros de posição



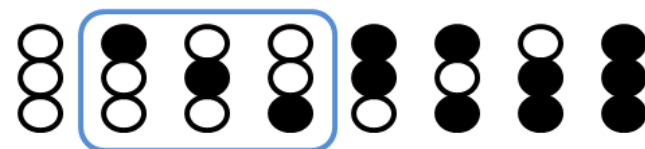
Conceito chave: Isotopômeros

Isotopômeros de massa

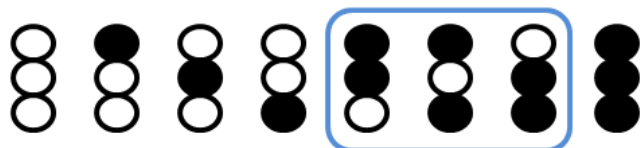
M+0



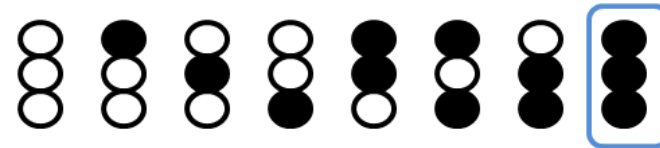
M+1



M+2



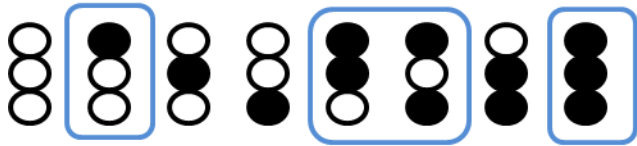
M+3



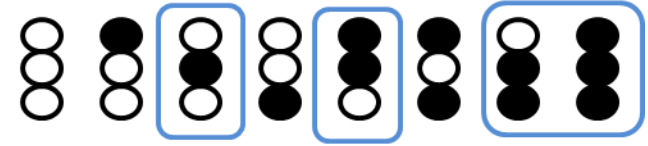
Conceito chave: Isotopômeros

Marcação nos átomos

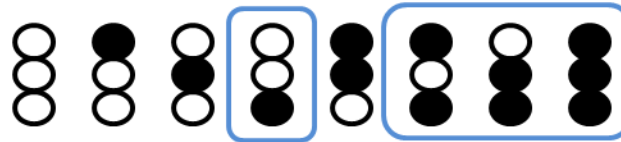
átomo 1



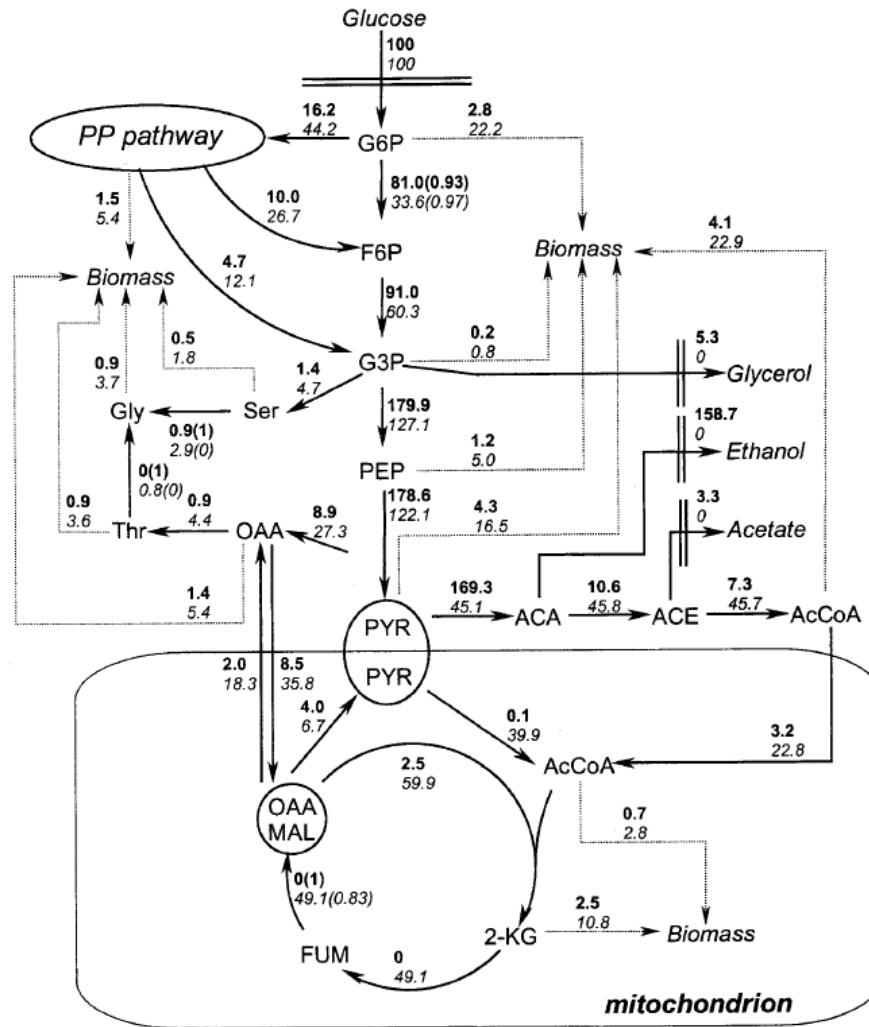
átomo 2



átomo 3



Conceito chave: transições atômicas nas reações



Conceito chave: transições atômicas nas reações

TABLE A1. Model used for flux calculations; the C atom transitions, which are used by the flux estimation routine, are also indicated

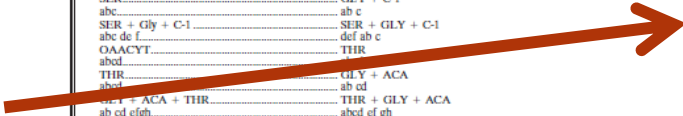
Measure and substrate	Product(s)	Measure and substrate	Product(s)
% Glucose uptake		ACCOACYT	ACCOAMIT
GLC	G6P	ab	ab
abdef	abdef	% Threonine, serine, and glycine metabolism (all enzymes assumed to be cytoplasmic)	
% EMP pathway		G6P	SER
G6P	F6P	abc	abc
abdef	abdef	SER	GLY + C-1
F6P + G6P	G6P + F6P	abc	ab c
bcdef ghijkl	abdef ghijkl	SER + Gly + C-1	SER + GLY + C-1
6P	G3P + G3P	abc de f	def ab c
bcdef	cha def	OAACYT	THR
3P	PEP	abcd	abcd
abc	abc	THR	GLY + ACA
PEP	PYR	abcd	ab cd
abc	abc	GLY + ACA + THR	THR + GLY + ACA
% PP-pathway		ab cd e fgh	abcd ef gh
G6P	CO + P5P	% Malic enzyme (malate decarboxylation, mitochondrial)	
abdef	a hodef	OAAMIT	PYR + CO
P5P + P5P	S7P + G3P	abcd	abc d
abede fghij	fgabcde hij	% Pyruvate pool	
S7P + G3P + P5P + P5P	P5P + P5P + S7P + G3P	PyRCYT	PYR
fgabcde hij klmno pqrst	abede fghij klpqrst mno	abc	abc
S7P + G3P	F6P + E4P	PYRMIT	PYR
abdefg hij	abchij defg	abc	abc
F6P + E4P + S7P + G3P	S7P + G3P + F6P + E4P	% Drain of intermediates to macromolecules	
abchij defg klmnopq rst	abdefg hij klmrst nopq	G6P	G6POUT
P5P + E4P	F6P + G3P	abdef	abdef
abode fghi	abfghi ede	P5P	P5POUT
F6P + G3P + P5P + E4P	P5P + E4P + F6P + G3P	abede	abede
abfghi ede mklmno opqr	abode fghi jkopqr lmn	E4P	E4POUT
% Ethanol, acetate, and glycerol formation		abcd	abcd
PYR	ACA + CO	G3P	G3POUT
abc	bc a	abc	abc
ACA	ETH	PEP	PEPOUT
ab	ab	abc	abc
ACA	ACE	PYR	PYROUT
ab	bc a	abc	abc
G3P	GLYC	OAACYT	OAACYTOUT
abc	abc	abcd	abcd
% Formation of AcCoA in the cytosol		ARG	ARGOUT
ACE	ACCOACYT	abede	abede
ab	ab	ACCOACYT	ACCOACYTOUT
% Anaplerotic reaction (cytosolic)		abcd	abcd
PYR + CO	OAACYT	ACCOAMIT	ACCOAMITOUT
abc d	abcd	ab	ab
% TCA cycle (considering scrambling around FUM)		abcd	abcd
PYR	ACCOAMIT + CO	SER	SEROUT
abc	bc a	abc	abc
OAAMIT + ACCOAMIT	ICTT	GLY	GLYOUT
abcd ef	dehfab	ab	ab
ICTT	ARG + CO	CT	CTOUT
abdef	abcef d	l	a
ARG	FUM + CO	GLYC	GLYCOUT
abode	bode a	abc	abc
FUM + FUM	OAAMIT + OAAMIT	THR	THROUT
abcd e fgh	abcd h gfe	abcd	abcd
OAAMIT	FUM	% Excreted products	
abcd	abcd	ETH	ETHOUT
% Transports		ab	ab
OAAMIT	OAACYT	ACE	ACEOUT
abcd	abcd	ab	ab
OAACYT	OAAMIT	% CO ₂ evolution	
abcd	abcd	CO ₂	COOUT
		l	a

* Abbreviations: ACA: acetyl-CoA; ACE: acetate; ARGOUT: acetate converted to the medium; ACCOACYT: acetyl CoA in the network; ACCOACYTOUT:

Conceito chave: transições atômicas nas reações

TABLE A1. Model used for flux calculations; the C atom transitions, which are used by the flux estimation routine, are also indicated

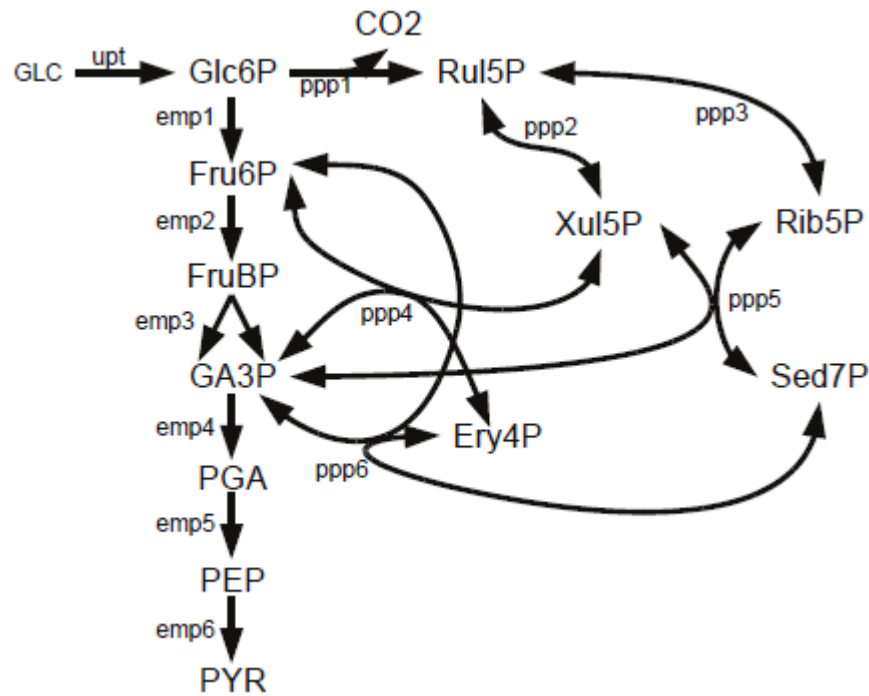
Measure and substrate	Product(s)	Measure and substrate	Product(s)
% Glucose uptake		ACCOACYT.....	ACCOAMIT
GLC.....	G6P	ab.....	ab
abdef.....	abdef	% Threonine, serine, and glycine metabolism (all enzymes assumed to be cytoplasmic)	
% EMP pathway		G6P.....	SER
G6P.....	F6P	abc.....	abc
abdef.....	abdef	SER.....	GLY + C-1
F6P + G6P.....	G6P + F6P	abc.....	ab c
bcdef ghijkl.....	abdef ghijkl	SER + Gly + C-1.....	SER + GLY + C-1
G6P.....	G3P + G3P	abc de f.....	def ab c
abdef.....	cha def	OAACYT.....	THR
3P.....	PEP	abcd.....	ab cd
abc.....	abc	THR.....	GLY + ACA
PEP.....	PYR	THR + ACA + THR.....	THR + GLY + ACA
abc.....	abc	ab cd e fgh.....	abcd ef gh
% PP-pathway		% Malic enzyme (malate decarboxylation, mitochondrial)	
G6P.....	CO + P5P	abdef.....	PYR + CO
abdef.....	a bdef	abcd.....	abc d
P5P + P5P.....	S7P + G3P	% Pyruvate pool	
abdef fghij.....	fgabcde hij	PYRCYT.....	PYR
S7P + G3P + P5P + P5P.....	abdef fghij klpqrst mno	abc.....	abc
fgabcde hij klmno pqrst.....	F6P + E4P	PYRMIT.....	PYR
S7P + G3P.....	abchij defg	abc.....	abc
abdefgh ij.....	S7P + G3P + F6P + E4P	% Drain of intermediates to macromolecules	
F6P + E4P + S7P + G3P.....	abchij defg klmnopq rst	G6P.....	G6P/OUT
abchij defg klmnopq rst.....	F6P + E4P	abdef.....	abdef
P5P + E4P.....	abfghi ede	P5P.....	P5P/OUT
abdef fghi.....	P5P + E4P + F6P + G3P	abdef.....	abdef
F6P + G3P + P5P + E4P.....	abfghi cde mklmn opqr	E4P.....	E4P/OUT
abfghi cde mklmn opqr.....	abdef fghi jkopqr lmn	abcd.....	abcd
% Ethanol, acetate, and glycerol formation		G3P.....	G3P/OUT
PYR.....	ACA + CO	abc.....	abc
abc.....	bc a	PEP.....	PEP/OUT
ACA.....	ETH	abc.....	abc
ab.....	ACE	abcd.....	abcd
ACA.....	ACE	G3P.....	G3P/OUT
ab.....	ab	abc.....	abc
G3P.....	GLYC	OAACYT.....	OAACYT/OUT
abc.....	abc	abcd.....	abcd
% Formation of AcCoA in the cytosol		ARG.....	ARG/OUT
ACE.....	ACCOACYT	abdef.....	abdef
ab.....	ab	ACCOACYT.....	ACCOACYT/OUT
% Anaplerotic reaction (cytosolic)		ab.....	ab
PYR + CO.....	OAACYT	ACCOAMIT.....	ACCOAMIT/OUT
abc d.....	abcd	ab.....	ab
% TCA cycle (considering scrambling around FUM)		SER.....	SER/OUT
PYR.....	ACCOAMIT + CO	abc.....	abc
abc.....	bc a	GLY.....	GLY/OUT
OAAMIT + ACCOAMIT.....	ICTT	ab.....	ab
abcd ef.....	dehfab	CT.....	CT/OUT
ICTT.....	AKG + CO	l.....	l
abdef.....	abcef d	GLYC.....	GLY/OUT
AKG.....	FUM + CO	abc.....	abc
abdef.....	bde a	THR.....	THR/OUT
FUM + FUM.....	OAAMIT + OAAMIT	abcd.....	abcd
abcd efgh.....	abcd hglf	% Excreted products	
OAAMIT.....	FUM	ETH.....	ETH/OUT
abcd.....	abcd	ab.....	ab
% Transports		ACE.....	ACE/OUT
OAAMIT.....	OAACYT	ab.....	ab
abcd.....	abcd	% CO ₂ evolution	
OAACYT.....	OAAMIT	CO.....	CO/OUT
abcd.....	abcd	l.....	l



Measure and substrate	Product(s)
% Glucose uptake	
GLC.....	G6P
abdef.....	abdef
% EMP pathway	
G6P.....	F6P
abdef.....	abdef
F6P + G6P.....	G6P + F6P
bcdef ghijkl.....	abdef ghijkl
6P.....	G3P + G3P
bcdef.....	cba def
3P.....	PEP
abc.....	abc
PEP.....	PYR
abc.....	abc
% PP-pathway	
G6P.....	CO + P5P
abdef.....	a bdef
P5P + P5P.....	S7P + G3P
abcde fghij.....	fgabcde hij
S7P + G3P + P5P + P5P.....	P5P + P5P + S7P + G3P
fgabcde hij klmno pqrst.....	abdef fghij klpqrst mno
S7P + G3P.....	F6P + E4P
abdefgh ij.....	abchij defg
F6P + E4P + S7P + G3P.....	S7P + G3P + F6P + E4P
abchij defg klmnopq rst.....	abdefgh ij klmrst nopq
P5P + E4P.....	F6P + G3P
abcde fghi.....	abfghi cde
F6P + G3P + P5P + E4P.....	P5P + E4P + F6P + G3P
abfghi cde mklmn opqr.....	abdef fghi jkopqr lmn

* Abbreviations: ACA: acetyl-CoA; ACE: acetate; ACE/OUT: acetate excreted to the medium; ACCOACYT: acetyl-CoA in the cytosol; ACCOACYT/OUT:

Conceito chave: Fluxos bidirecionais



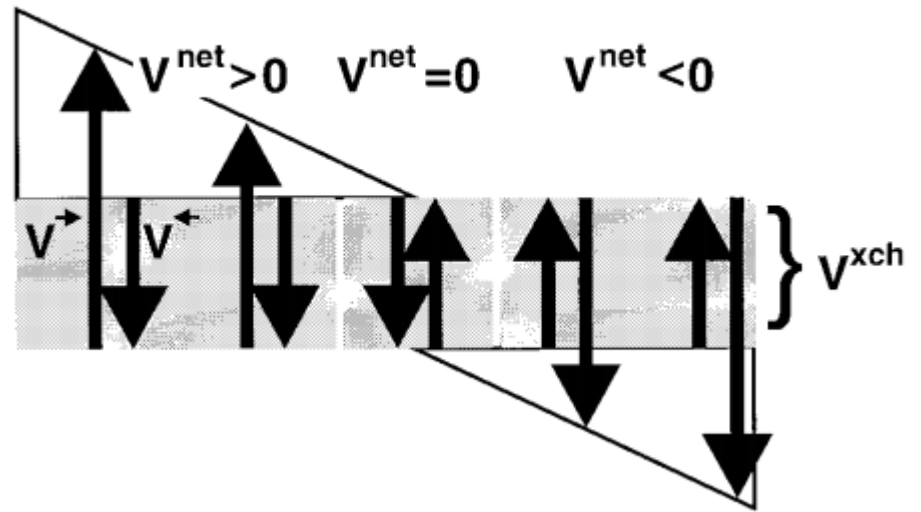
PPP3 $\vec{v} : \text{Ru5P} \rightarrow \text{Rib5P}$

$\hat{v} : \text{Ru5P} \leftarrow \text{Rib5P}$

Conceito chave: Fluxos bidirecionais

$$v^{net} = \vec{v} - \overleftarrow{v}$$

$$v^{xch} = \min(\vec{v}, \overleftarrow{v})$$



Conceito chave: Fluxos livres

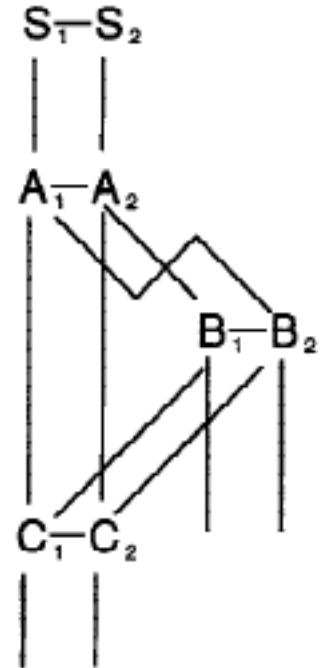
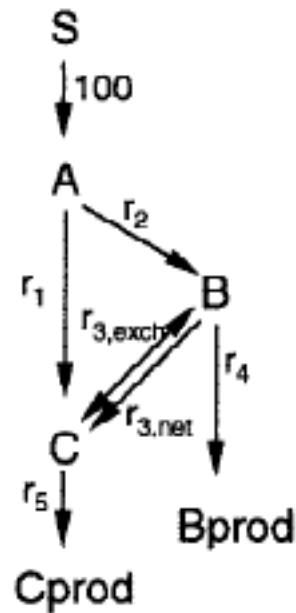
Balanços dos metabólitos:

$$A: 100 - r_1 - r_2 = 0$$

$$B: r_2 - r_{3,\text{net}} - r_4 = 0$$

$$C: r_1 + r_{3,\text{net}} - r_5 = 0$$

Rede metabólica:



Conceito chave: Fluxos livres

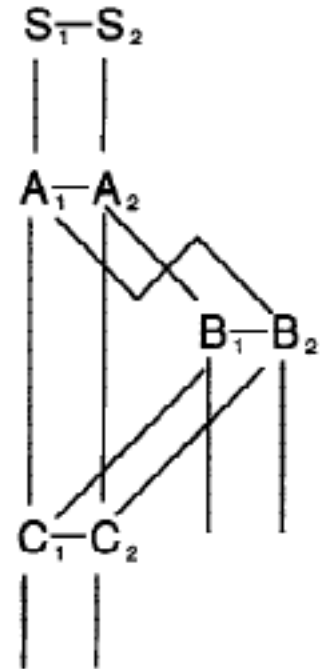
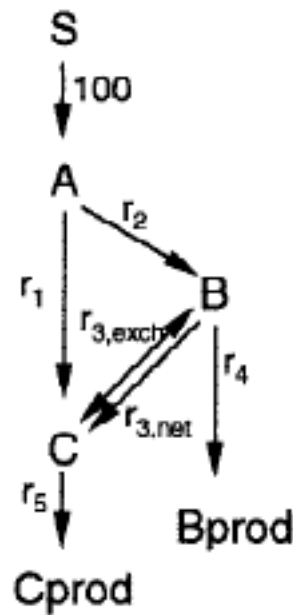
Balanços dos metabólitos:

$$A: 100 - r_1 - r_2 = 0$$

$$B: r_2 - r_{3,\text{net}} - r_4 = 0$$

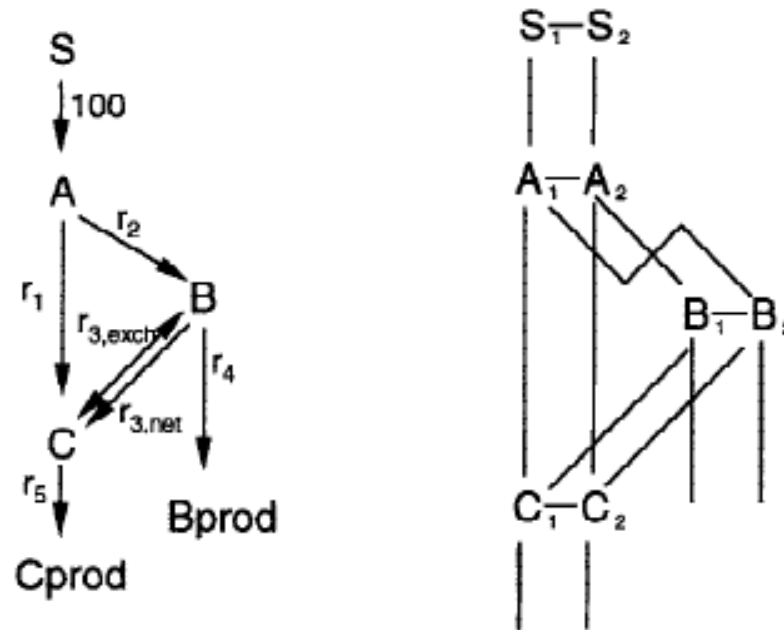
$$C: r_1 + r_{3,\text{net}} - r_5 = 0$$

Rede metabólica:



Escolho (fluxos livres)		Calculo pelos balanços		
r_1	r_3	r_2	r_4	r_5
50	0	50	50	50
0	100	100	0	100

Modelo Matemático

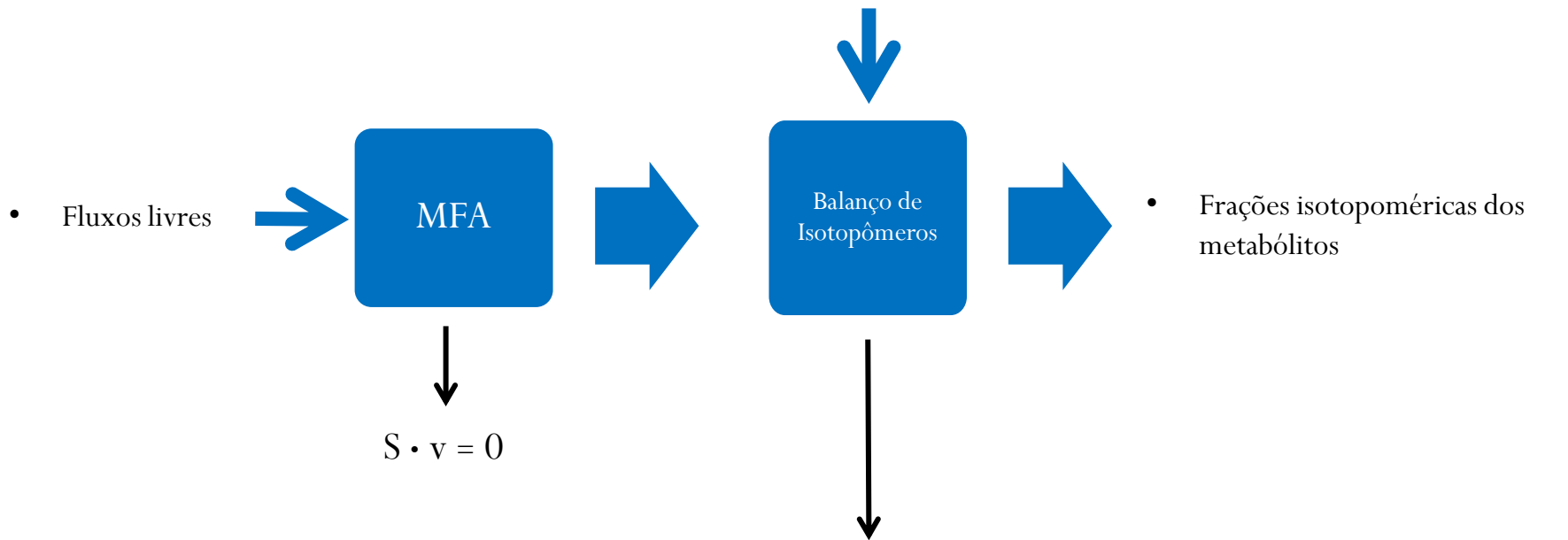


Balances de marcação nos átomos dos metabólitos:

$$\begin{array}{rcl}
 -(r_1 + r_2)A_1 & & = -100S_1 \\
 -(r_1 + r_2)A_2 & & = -100S_2 \\
 r_2A_2 & -(r_{3,\text{exch}} + r_{3,\text{net}} + r_4)B_1 & r_{3,\text{exch}}C_1 & = 0 \\
 r_2A_1 & & -(r_{3,\text{exch}} + r_{3,\text{net}} + r_4)B_2 & r_{3,\text{exch}}C_2 & = 0 \\
 r_1A_1 & (r_{3,\text{exch}} + r_{3,\text{net}})B_1 & & -(r_{3,\text{exch}} + r_5)C_1 & = 0 \\
 r_1A_2 & & (r_{3,\text{exch}} + r_{3,\text{net}})B_2 & & -(r_{3,\text{exch}} + r_5)C_2 = 0
 \end{array}$$

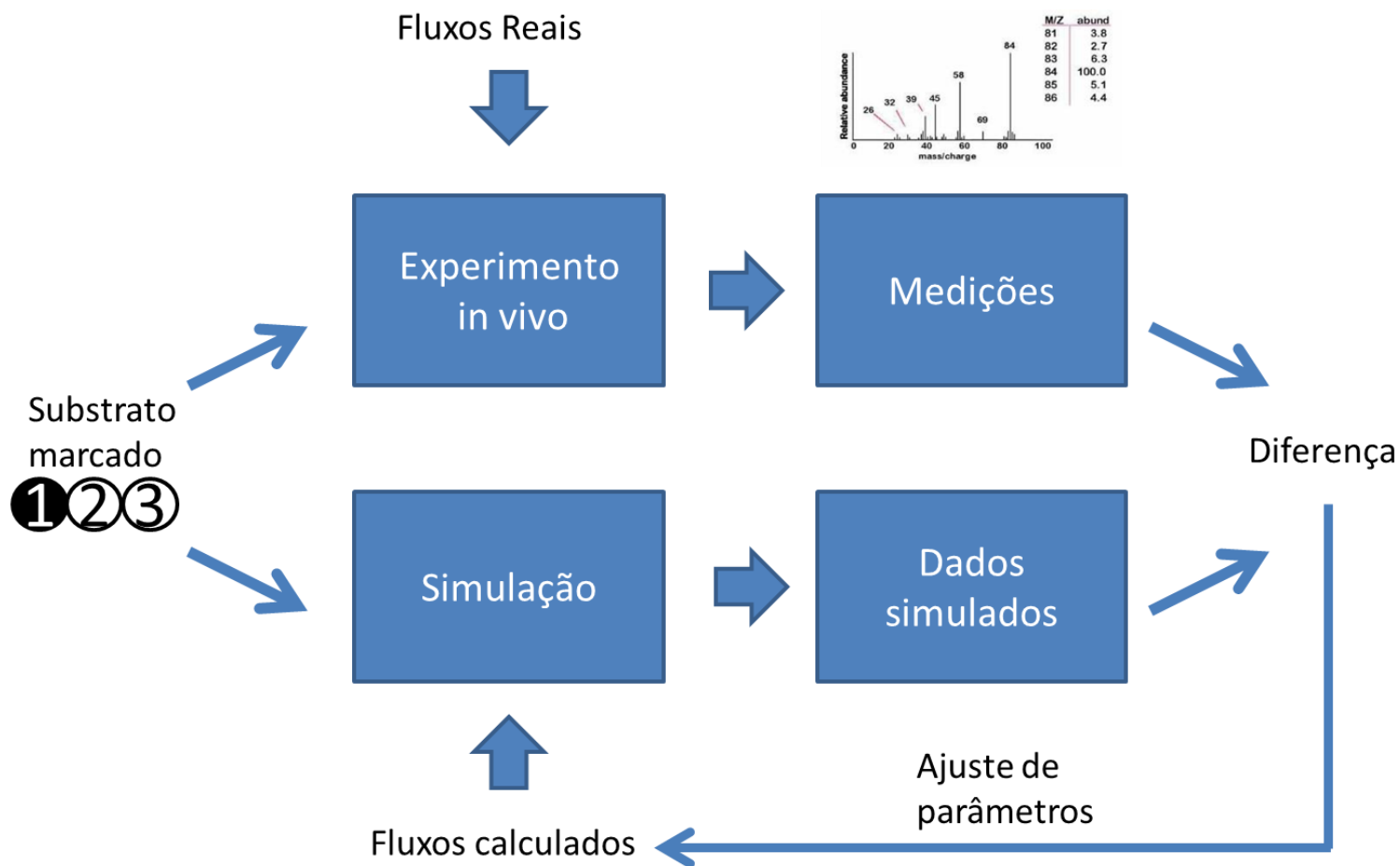
Modelo Matemático

- Transições atômicas
- Padrão de marcação no substrato

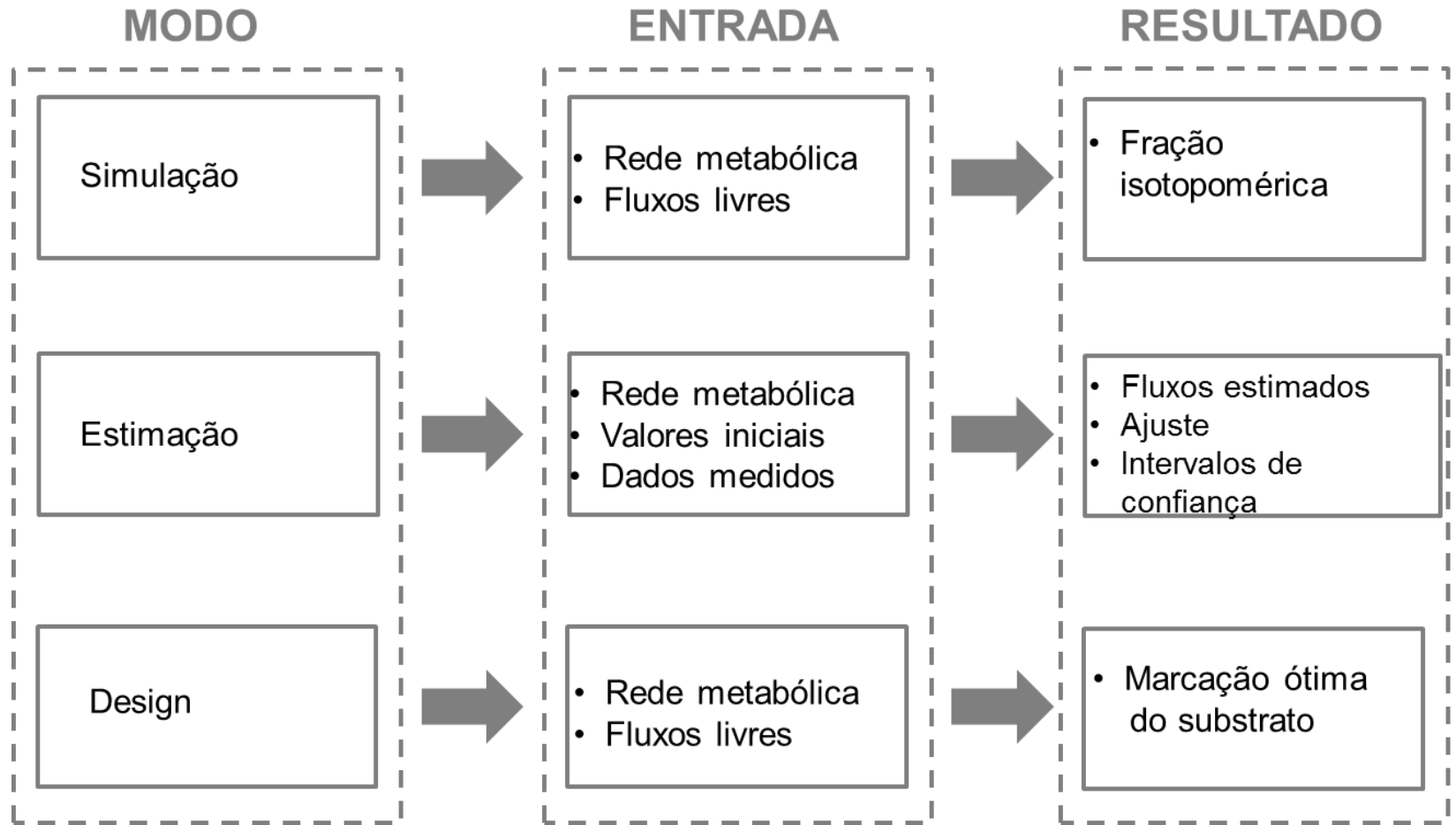


$$\bar{f}(v, \bar{x}, \bar{x}^{inp}) = \frac{1}{2} \bar{x}^T \cdot \left(\sum_i \vec{v} \cdot \vec{Q}_i + \overleftarrow{v} \cdot \overleftarrow{Q}_i \right) \cdot \bar{x} + \left(\sum_i \vec{v}_i \cdot \vec{P}_i + \sum_i \overleftarrow{v}_i \cdot \overleftarrow{P}_i \right) \cdot \bar{x} + \left(\sum_i \vec{v}_i \cdot \vec{P}_i^{inp} \right) \cdot \bar{x}^{inp} = 0$$

Estimação de fluxos



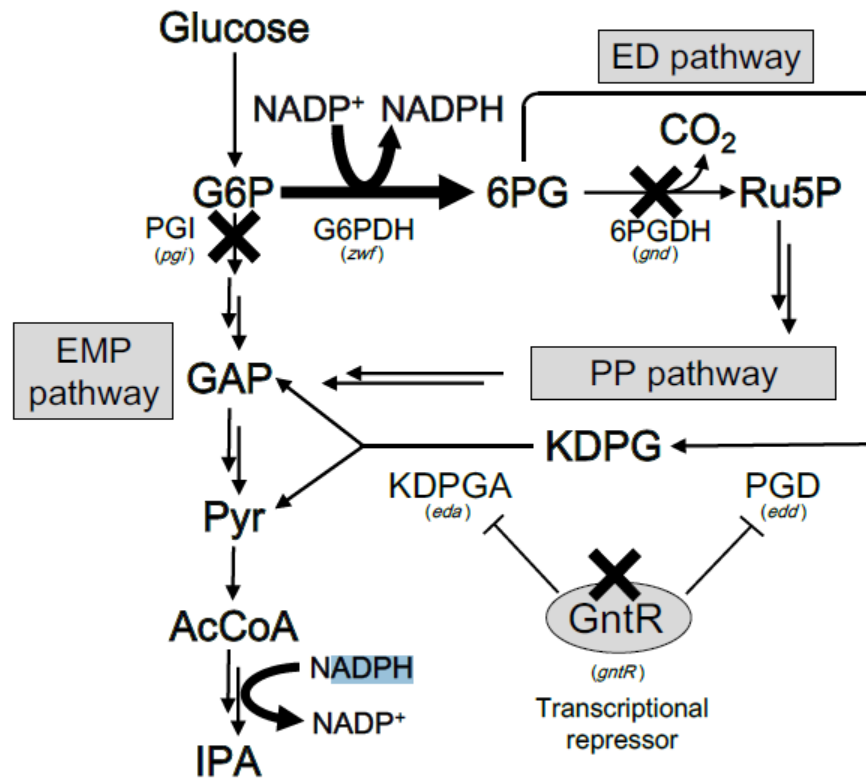
Ferramenta computacional



Aplicações:

Metabolic engineering of isopropyl alcohol-producing *Escherichia coli* strains with ^{13}C -metabolic flux analysis

Nobuyuki Okahashi, Fumio Matsuda, Katsunori Yoshikawa, Tomokazu Shirai, Yoshiko Matsumoto, Mitsufumi Wada, Hiroshi Shimizu ✉

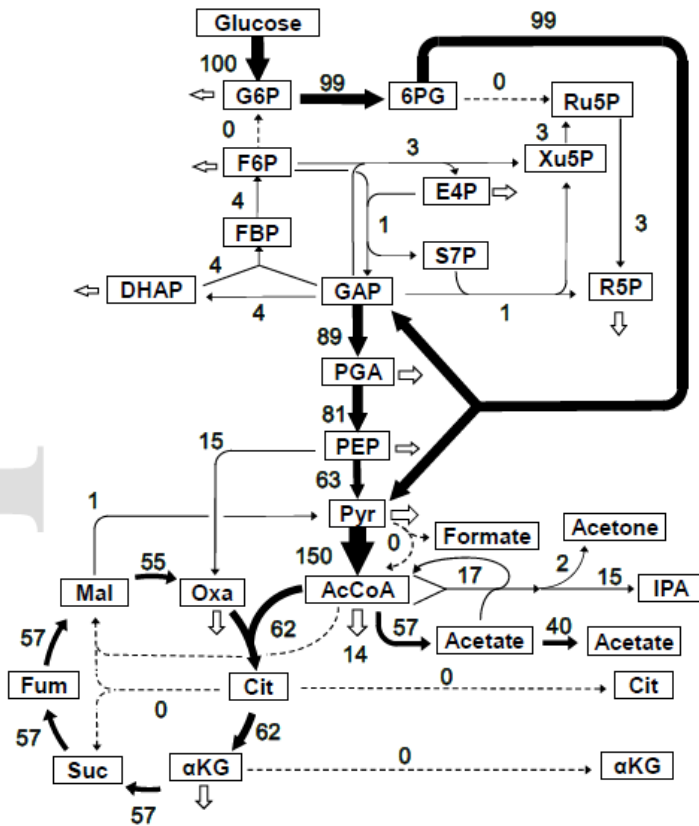


Aplicações:

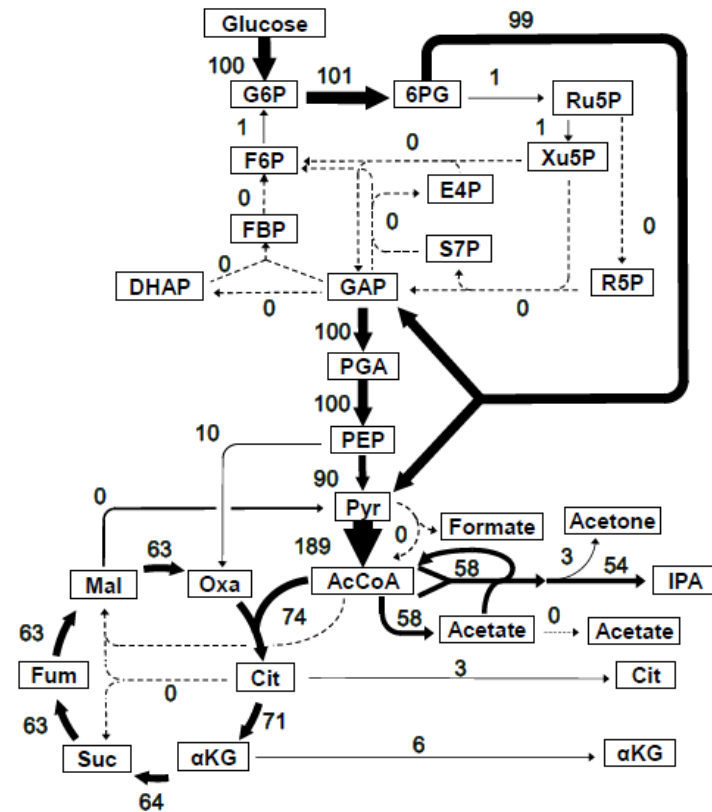
Metabolic engineering of isopropyl alcohol-producing *Escherichia coli* strains with ^{13}C -metabolic flux analysis

Nobuyuki Okahashi, Fumio Matsuda, Katsunori Yoshikawa, Tomokazu Shirai, Yoshiko Matsumoto, Mitsufumi Wada, Hiroshi Shimizu

(c)



(d)



Aplicações:

Application of ^{13}C flux analysis to identify high-productivity CHO metabolic phenotypes

Neil Templeton^{a,1}, Kevin D. Smith^b, Allison G. McAtee-Pereira^a, Haimanti Dorai^b, Michael J. Betenbaugh^c, Steven E. Lang^{b,2}, Jamey D. Young^{a,d,*}

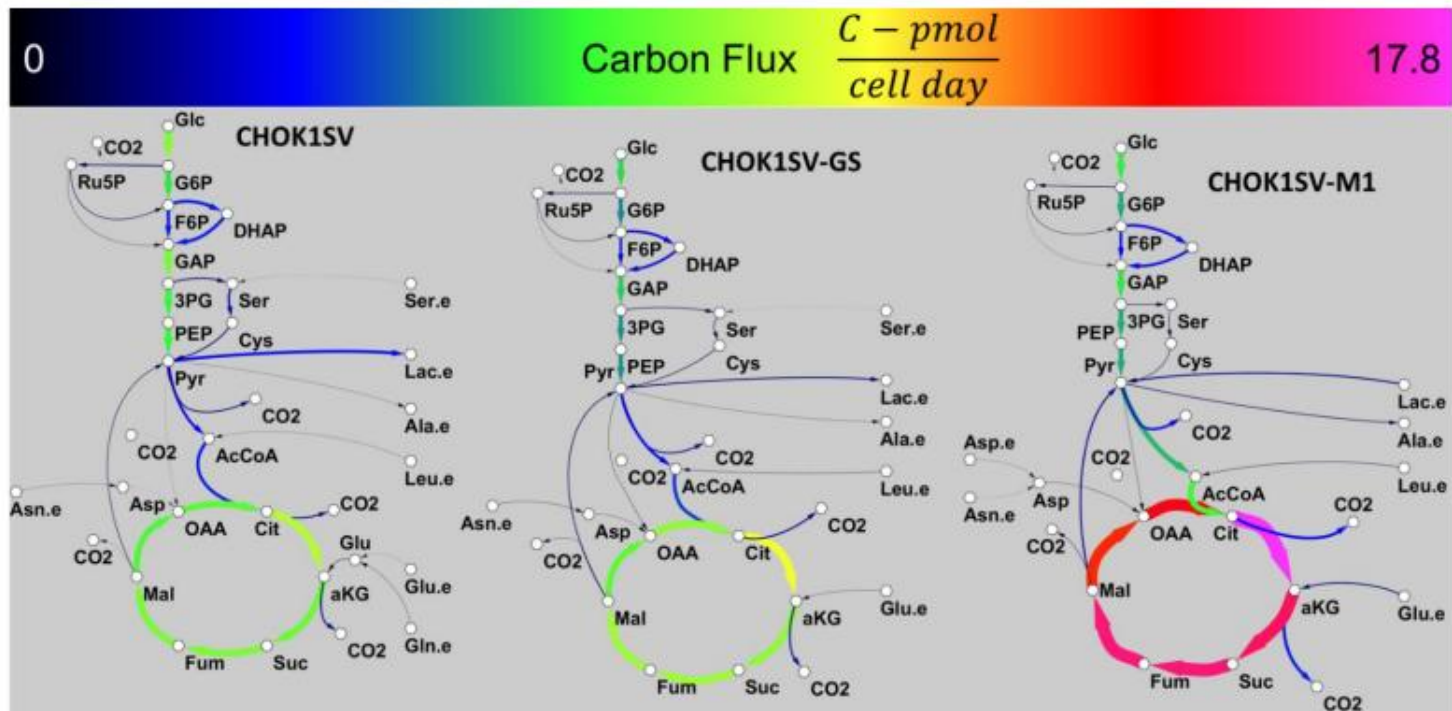


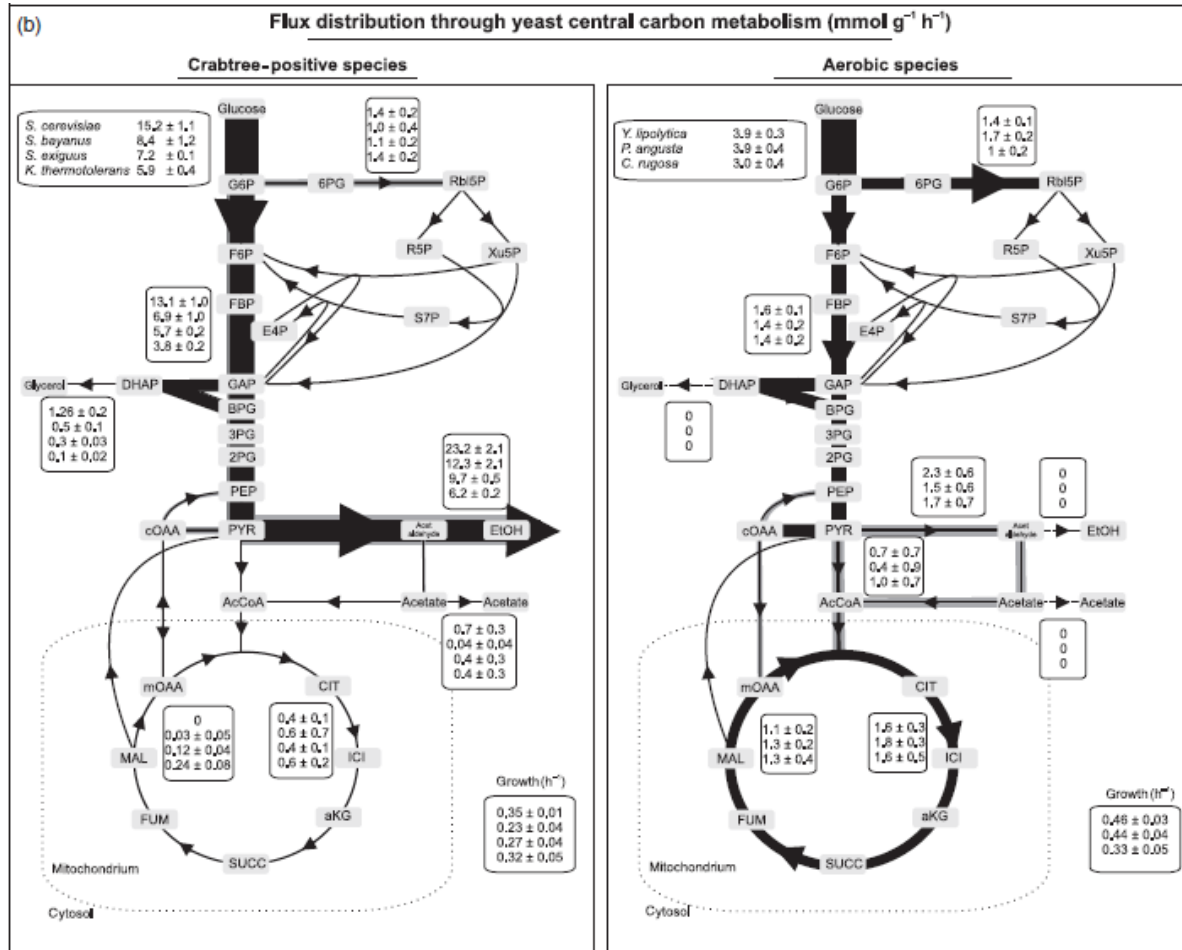
Fig 6. Comparison of flux maps for CHOK1SV parent, CHOK1SV-GS vector control, and CHOK1SV-M1 IgG-producing clone. Major carbon fluxes are shown as C-pmol/cell/day. Both width and color of directional arrows are scaled to the magnitude of carbon flux.

Aplicações:

Intracellular characterization of aerobic glucose metabolism in seven yeast species by ^{13}C flux analysis and metabolomics

Stefan Christen^{1,2} & Uwe Sauer¹

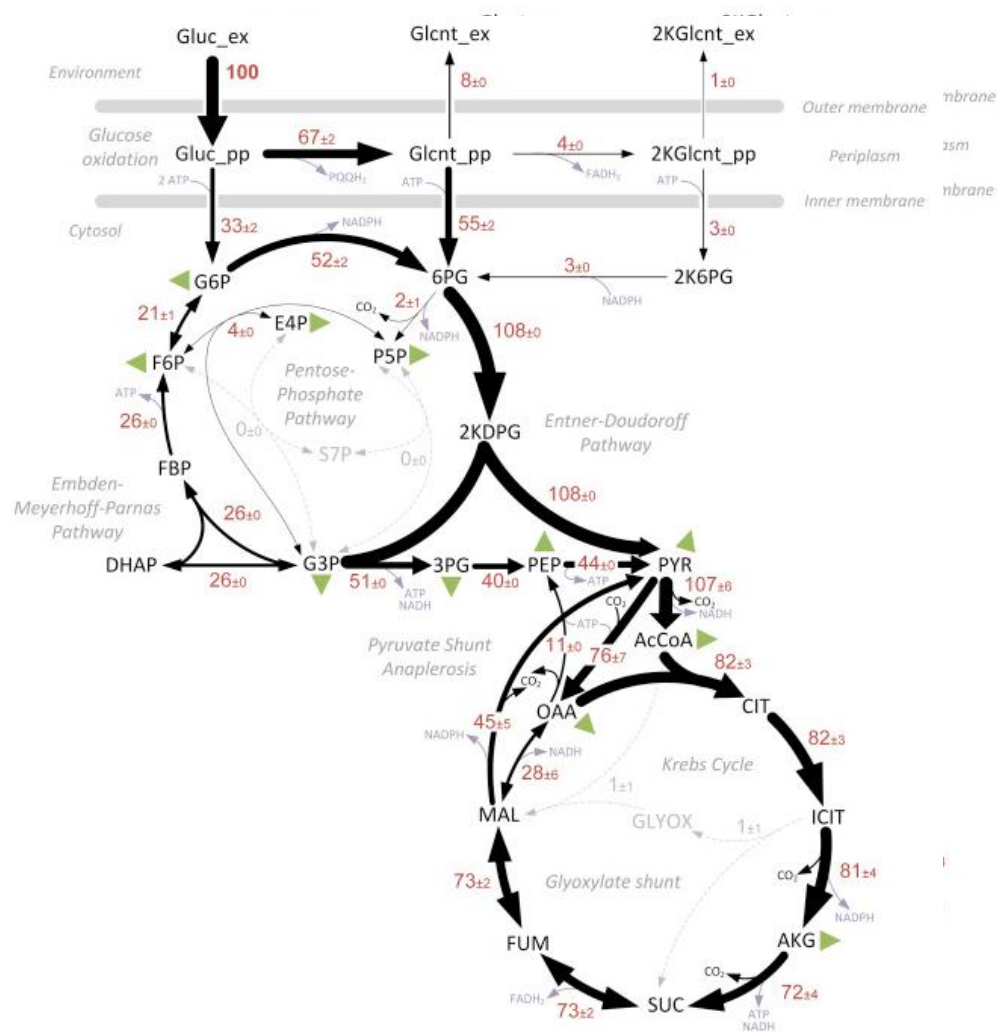
¹Institute of Molecular Systems Biology, ETH Zurich, Zurich, Switzerland; and ²Life Science Zurich PhD Program on Systems Biology of Complex Diseases, Zurich, Switzerland



Aplicações:

GC-MS-based ^{13}C metabolic flux analysis resolves the parallel and cyclic glucose metabolism of *Pseudomonas putida* KT2440 and *Pseudomonas aeruginosa* PAO1

Michael Kohlstedt, Christoph Wittmann



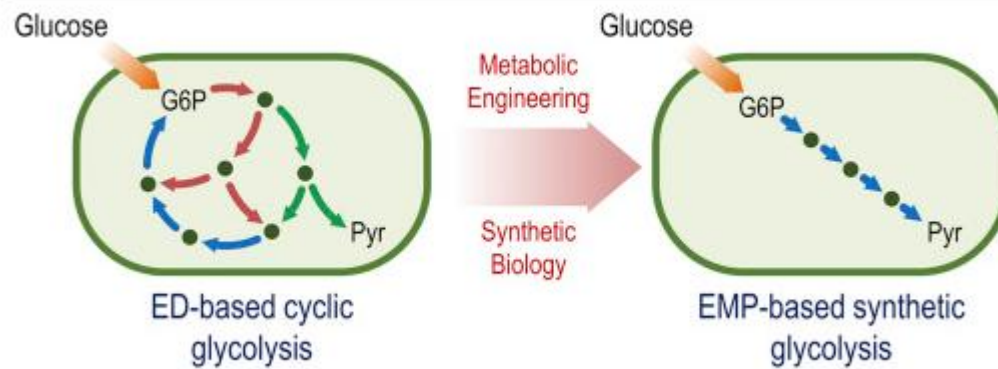
Aplicações:

Functional implementation of a linear glycolysis for sugar catabolism in *Pseudomonas putida*

Alberto Sánchez-Pascuala^{a,1}, Lorena Fernández-Cabezón^b, Víctor de Lorenzo^{a,**}, Pablo I. Nikel^{b,*}

^aSystems and Synthetic Biology Program, Centro Nacional de Biotecnología (CNB-CSIC), Campus de Cantoblanco, 28049 Madrid, Spain

^bThe Novo Nordisk Foundation Center for Biosustainability, Technical University of Denmark, 2800 Kongens Lyngby, Denmark



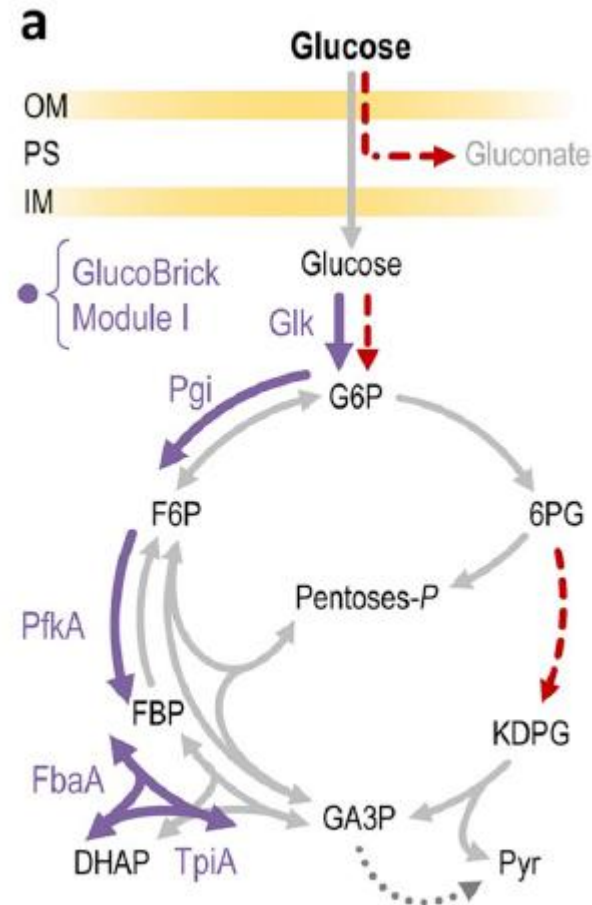
Aplicações:

Functional implementation of a linear glycolysis for sugar catabolism in *Pseudomonas putida*

Alberto Sánchez-Pascuala^{a,1}, Lorena Fernández-Cabezón^b, Víctor de Lorenzo^{a,**}, Pablo I. Nikel^{b,*}

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^bThe Novo Nordisk Foundation Center for Biosustainability, Technical University of Denmark, 2800 Kongens Lyngby, Denmark



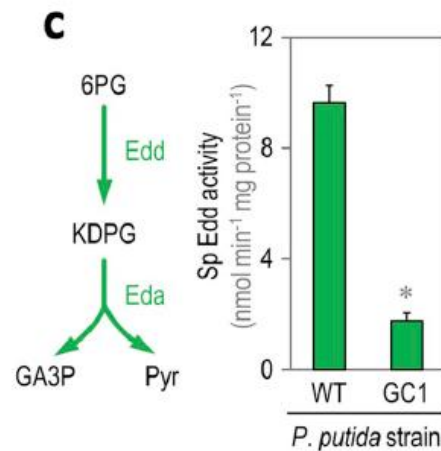
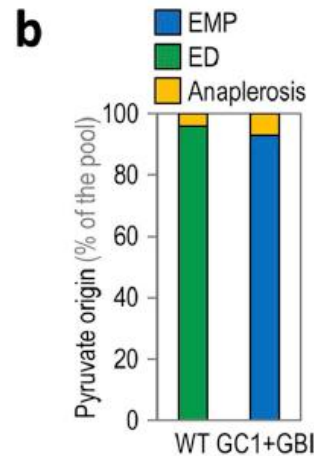
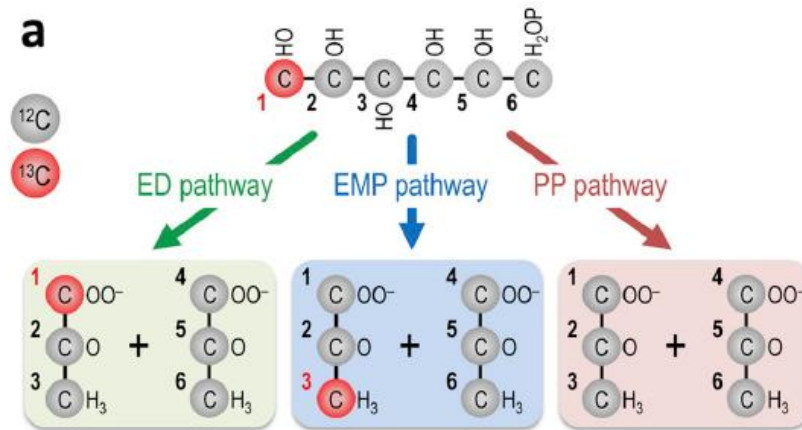
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Exercício: *Saccharomyces cerevisiae*

Obejtivos:

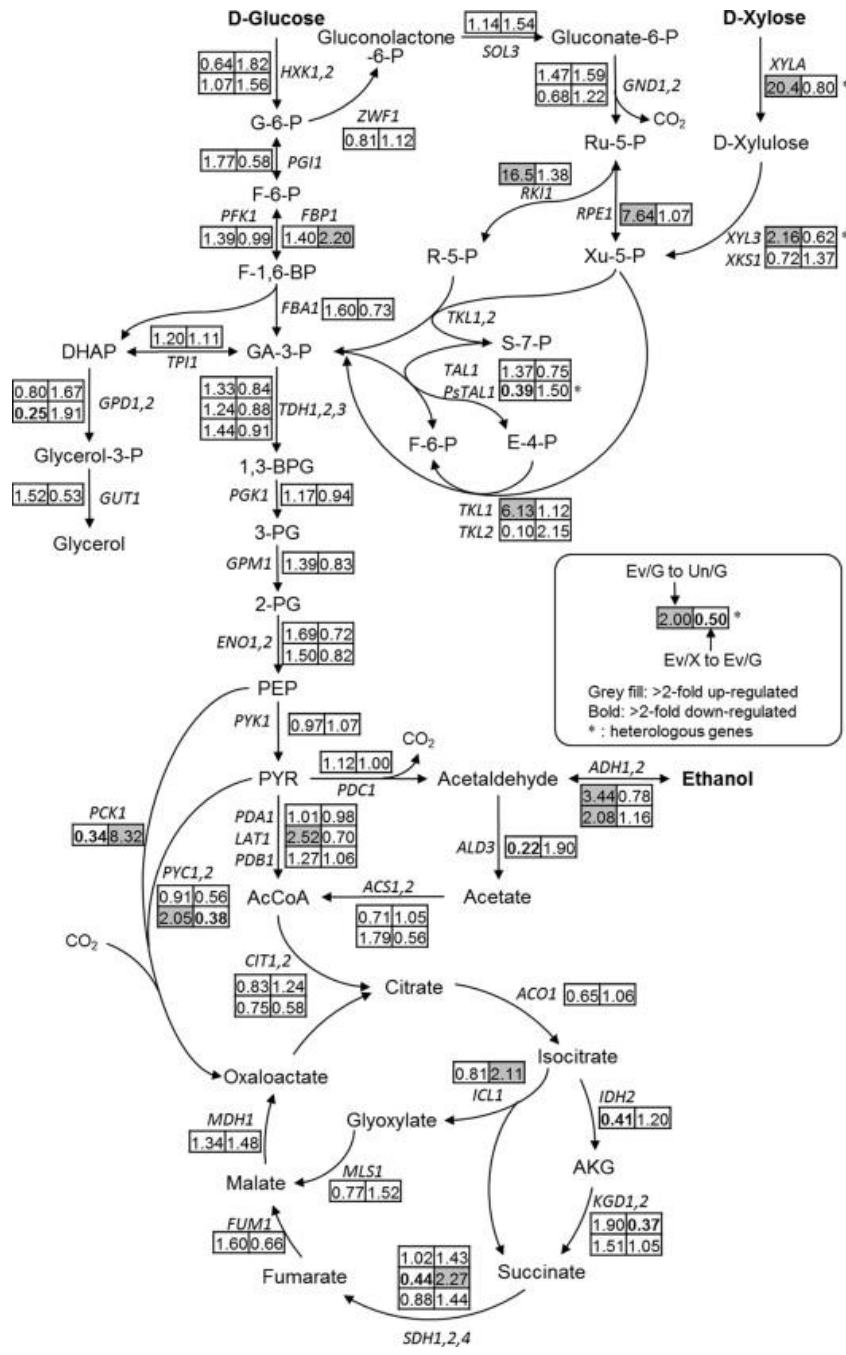
- Comparar FBA x ^{13}C -MFA
- Esclarecer limitações de ^{13}C -MFA

Network Identification and Flux Quantification in the Central Metabolism of *Saccharomyces cerevisiae* under Different Conditions of Glucose Repression

ANDREAS KAROLY GOMBERT,[†] MARGARIDA MOREIRA DOS SANTOS,
BJARKE CHRISTENSEN, AND JENS NIELSEN*

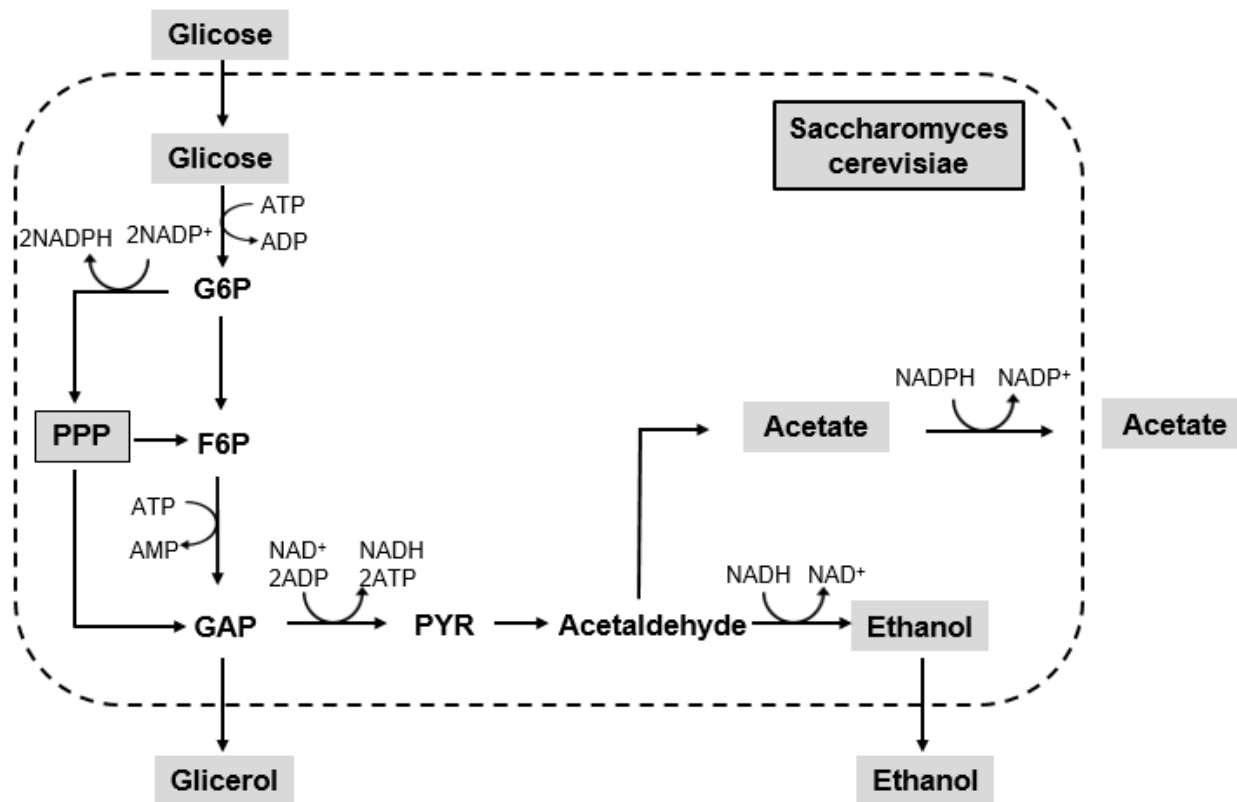
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Received 22 June 2000/Accepted 23 November 2000



Simplificações na rede

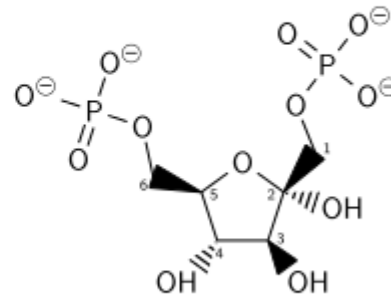
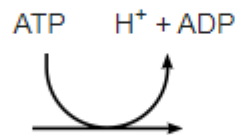
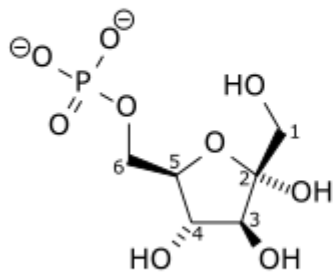
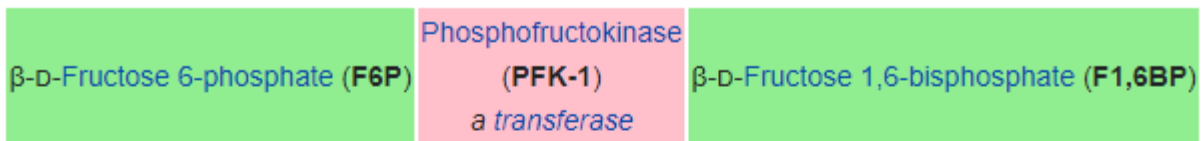
- Reações lineares
- Equilíbrio rápido



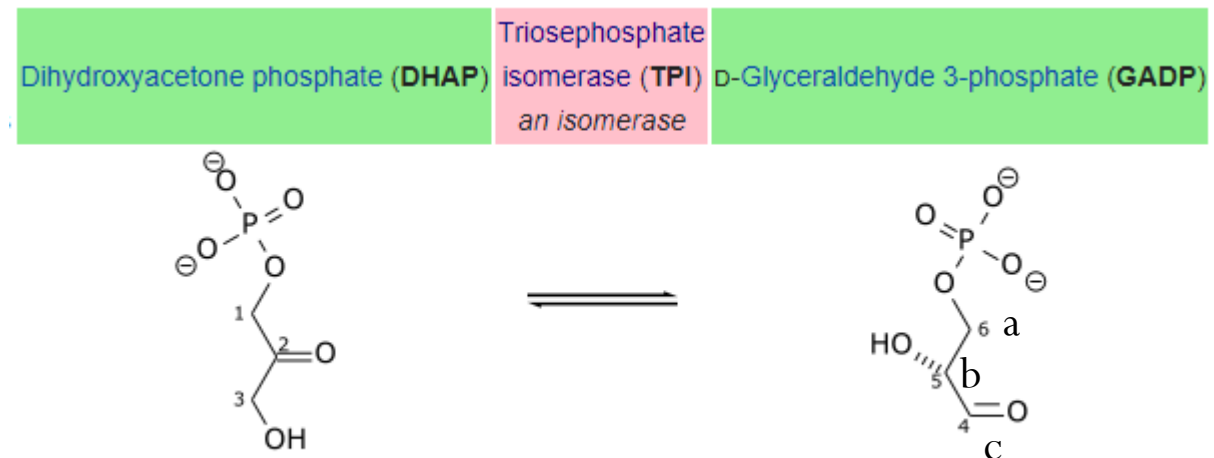
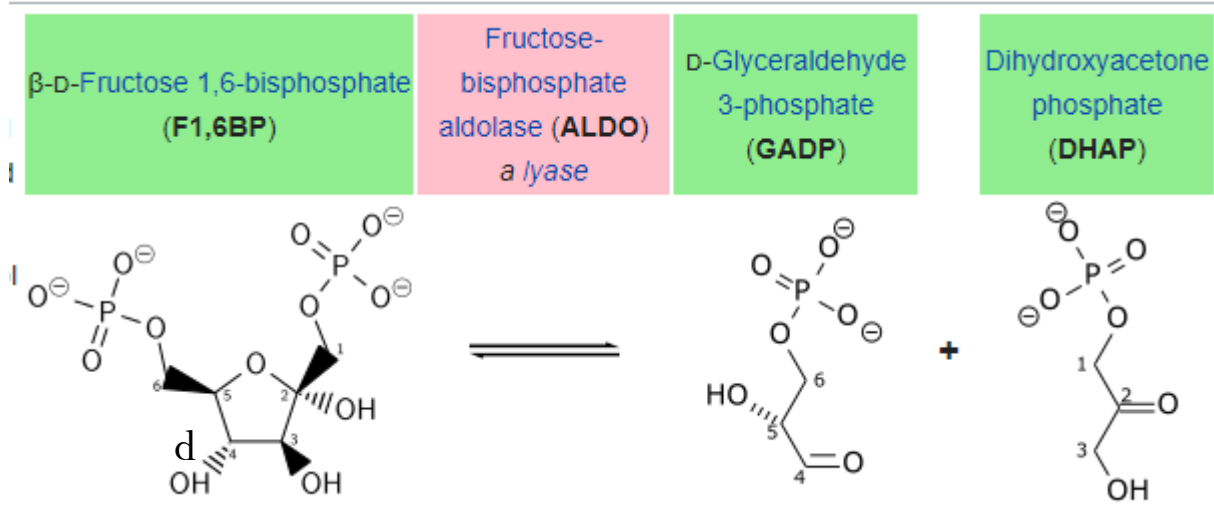
FBA: hipóteses

- Cultivo em anaerobiose
- Baixo crescimento celular
- Alta produção de etanol
- Composição da biomassa desconhecida

^{13}C -MFA: Transições

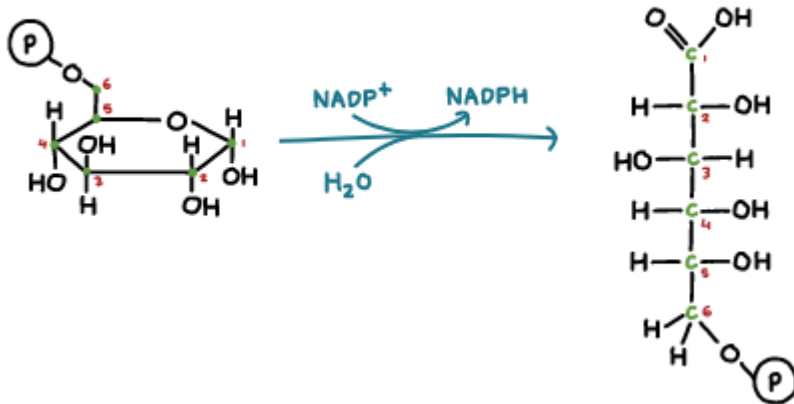


^{13}C -MFA: Transições

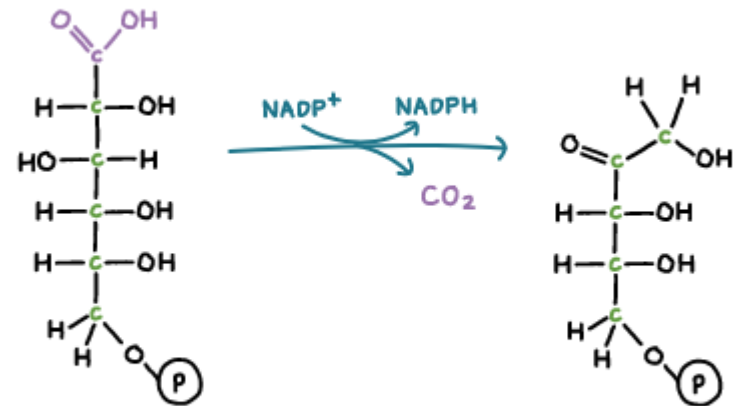


^{13}C -MFA: Transições

Oxidative Phase : Step 1



Oxidative Phase : Step 2



5 Carbons
1 Phosphate

^{13}C -MFA: Dados medidos

- 75%[1- ^{13}C]-Glicose + 25%[4- ^{13}C]-Glicose

Isotopômeros de posição GAP

1	0.1548
2	0.0000
3	0.0269

Isotopômeros de posição E4P

1	0.0509
2	0.2326
3	0.0000
4	0.0490

Mínimos quadrados

$$\sum_1^n (\text{predição do modelo} - \text{dado experimental})^2$$

