

For the prediction of intracellular fluxes in *E. coli*

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Overview

- Biological question
- Modeling approach
- Biological answer

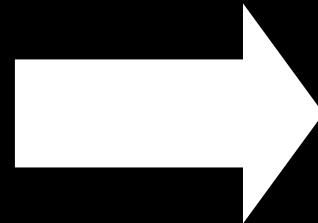
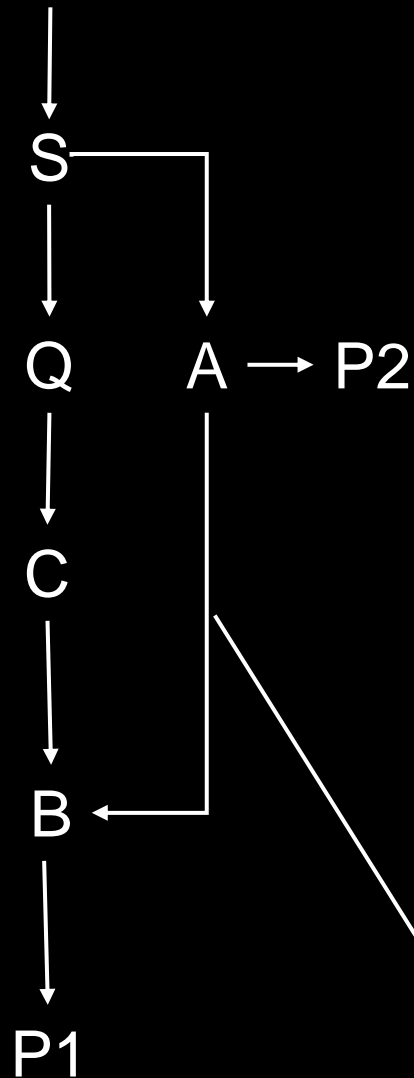
Biological question

What is the underlying **cellular strategy** that explains the experimentally observed **metabolic state** ?

Cellular strategy

- Why do we observe what we observe?
- Benefit for the cell ?
- Objective function
- Optimality principle

Metabolic state



Distribution of all individual fluxes at given time point

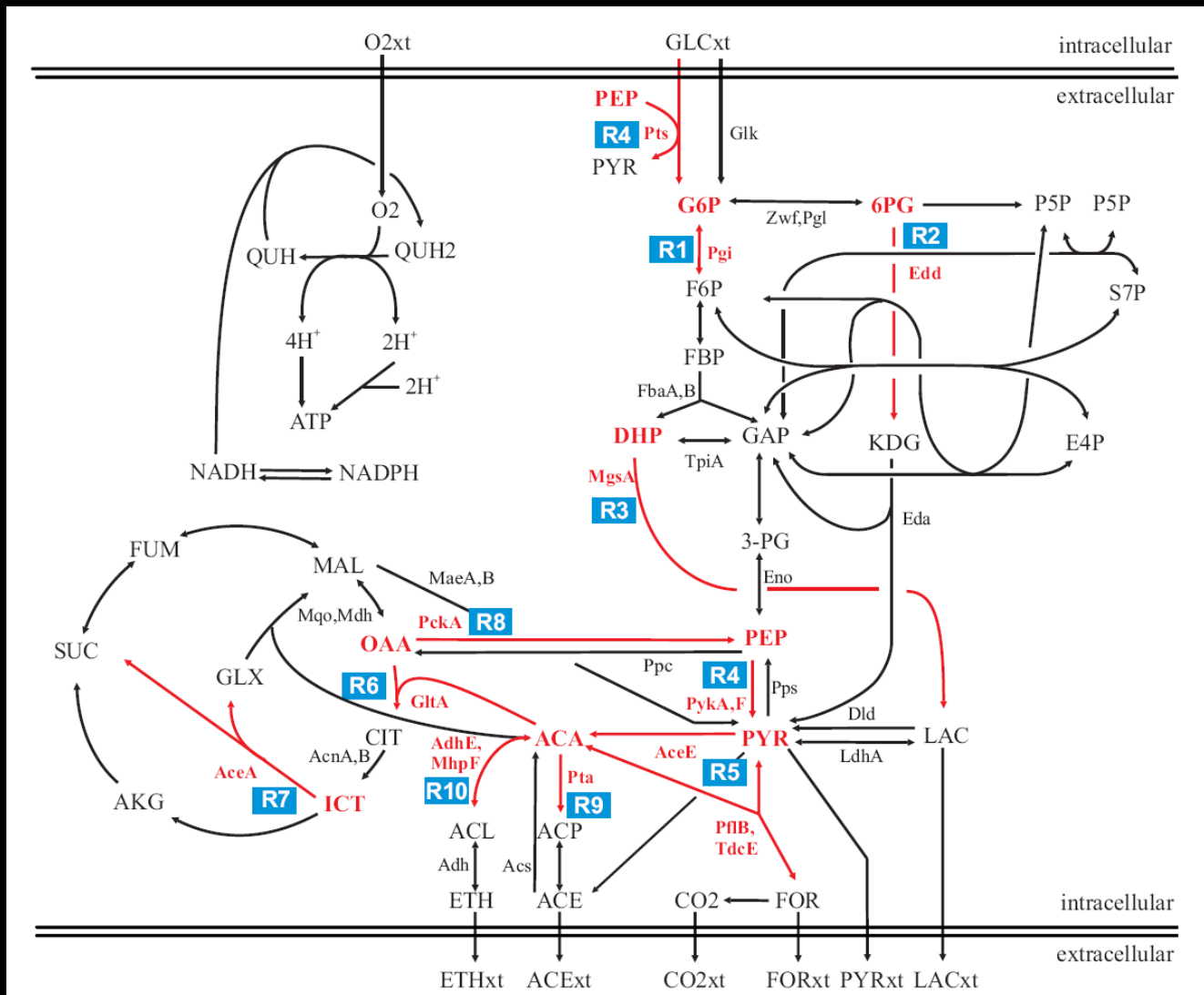
one individual flux

$$\frac{\text{mmol}}{\text{hr}}$$

Biological question

Why does the cell choose the experimentally observed intracellular flux distribution ?

Metabolic network

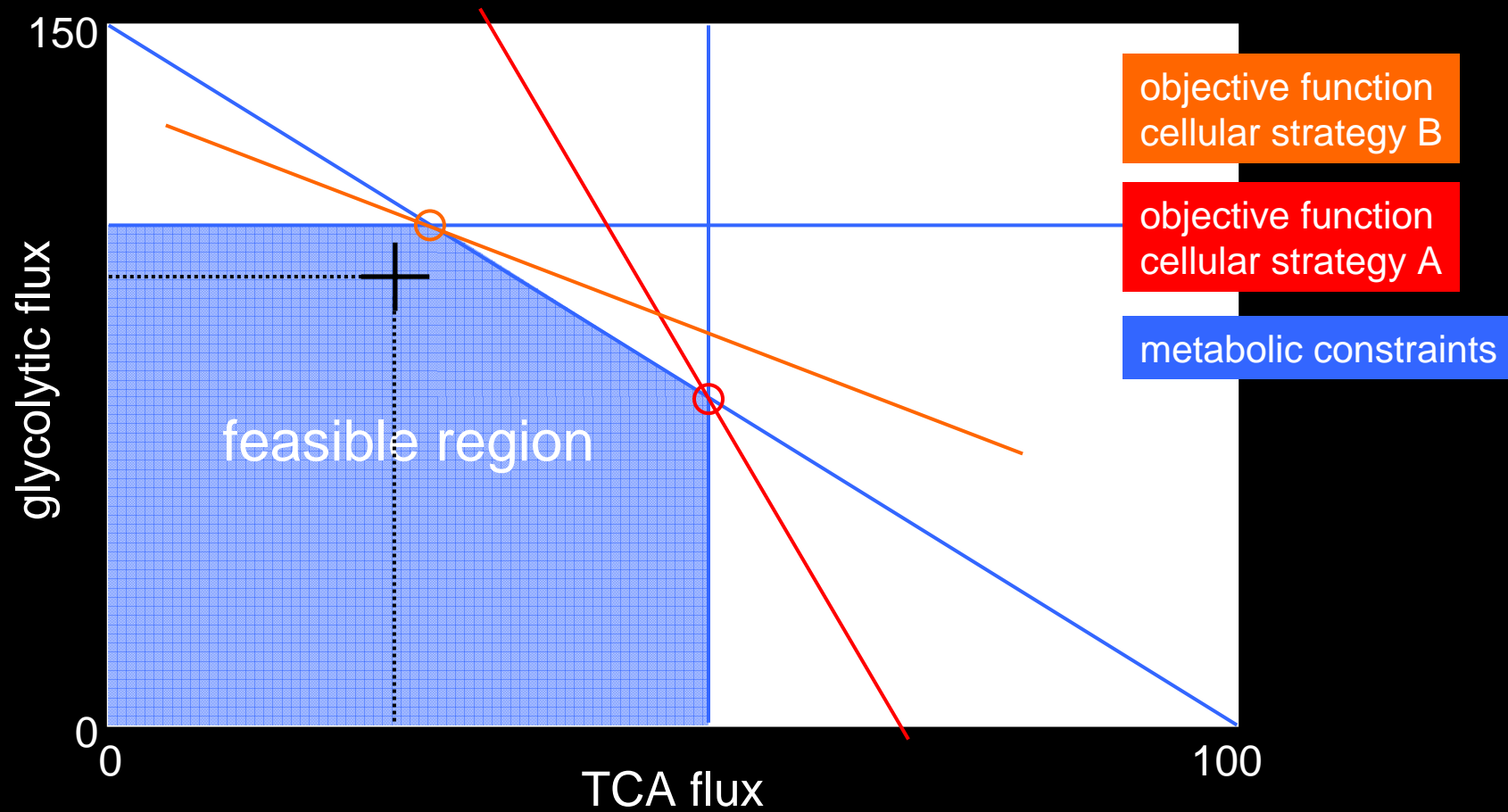


100 reactions
60 metabolites

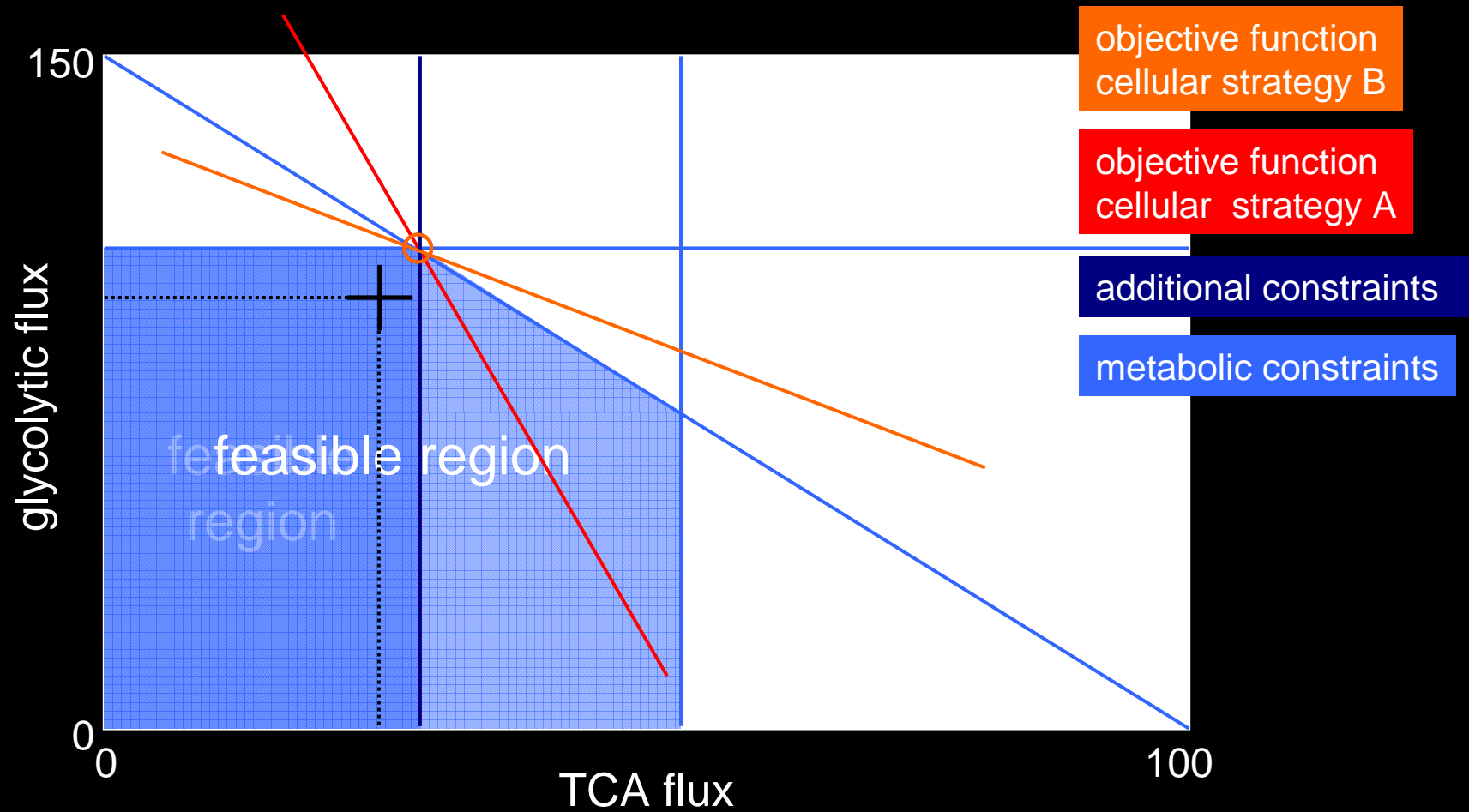
10 degrees of freedom

10 split ratios

Flux balance analysis



Flux balance analysis



Objective functions (cellular strategy)

- | | | |
|---|------------------------------------|--------------------------------|
| 1 | Biomass maximization | Growth efficiency |
| 2 | ATP maximization | Energetic efficiency |
| 3 | Sum of fluxes minimization | Resource allocation efficiency |
| 4 | ATP per flux unit maximization | Combination of 2 and 3 |
| 5 | Biomass per flux unit maximization | Combination of 1 and 3 |

Systematic approach

9 additional constraints

mass / energy
thermodynamic
environmental
regulatory

11 objective functions

linear
non-linear
quadratic
mixed-integer

6 environmental conditions

3 batch cultures¹
3 chemostat cultures^{2,3}

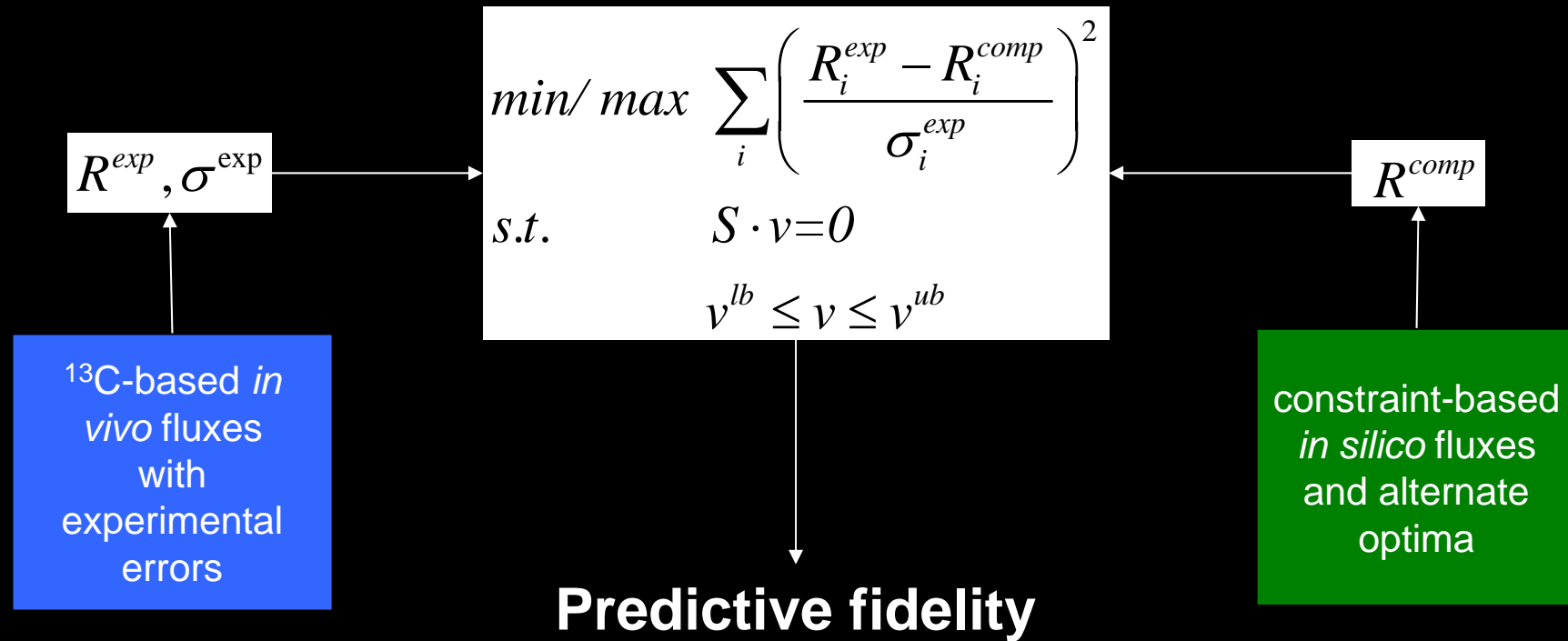
~600 permutations

¹ Perrenoud *et al* (2005) *J Bacteriol* **187** 3171 - 3179

² Nanchen *et al* (2006) *Appl Environ Microbiol* **72** 1164 – 1172

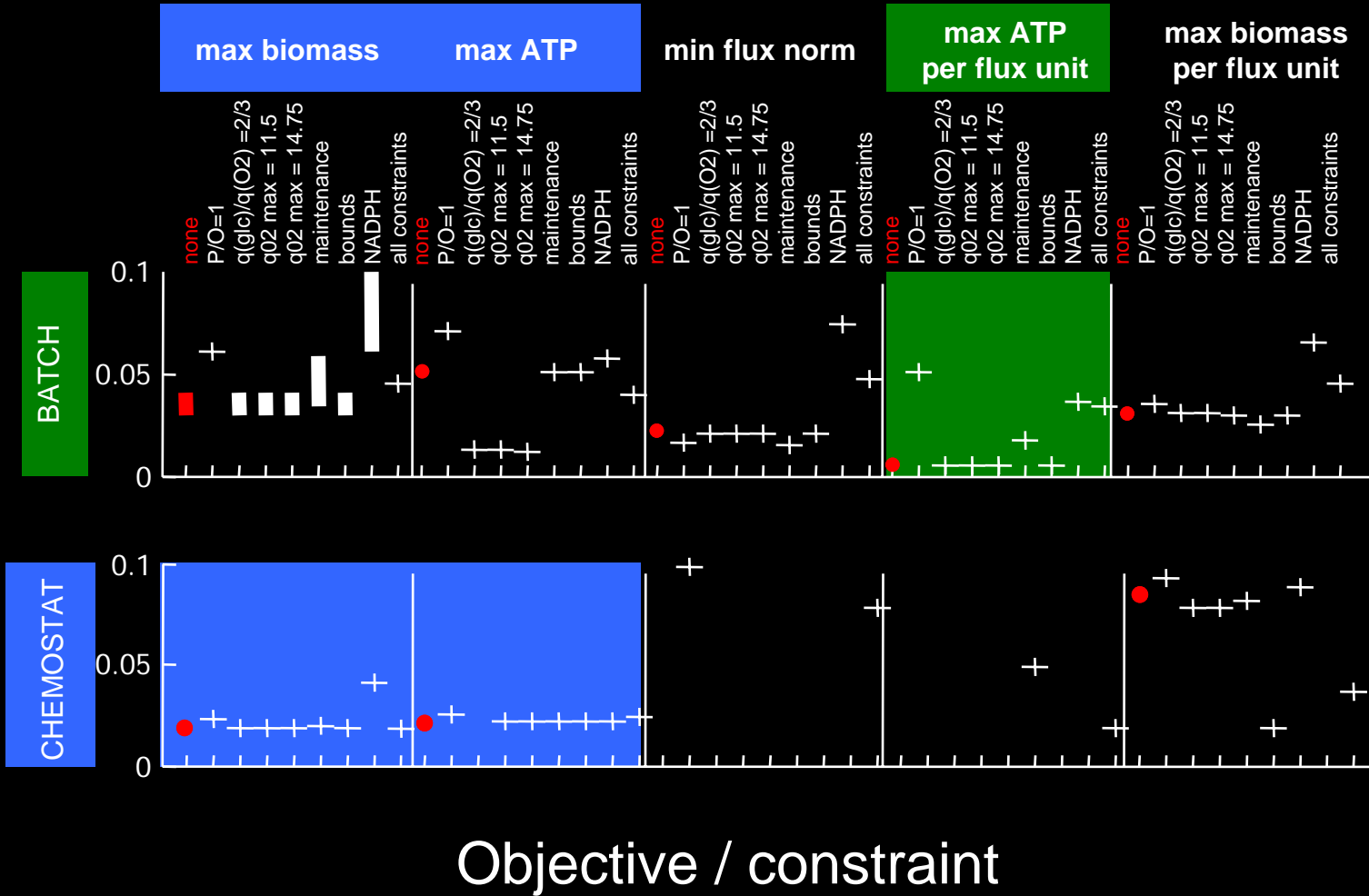
³ Emmerling *et al* (2002) *J Bacteriol* **184** 152 – 164

Predictive fidelity describes the accuracy of flux predictions



Two metabolic states identified in *E. coli*

Predictive fidelity

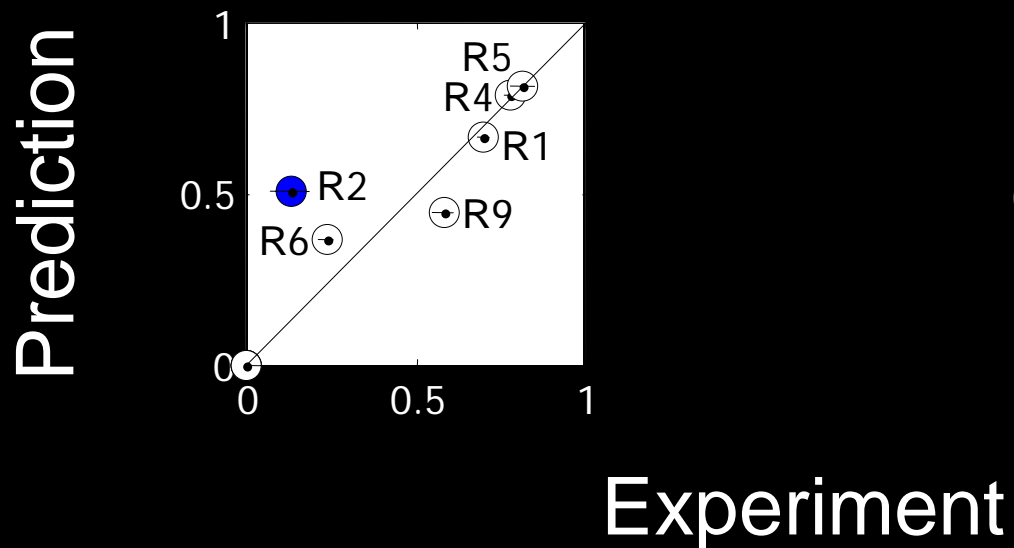


Objective / constraint

Two metabolic states identified in *E. coli*

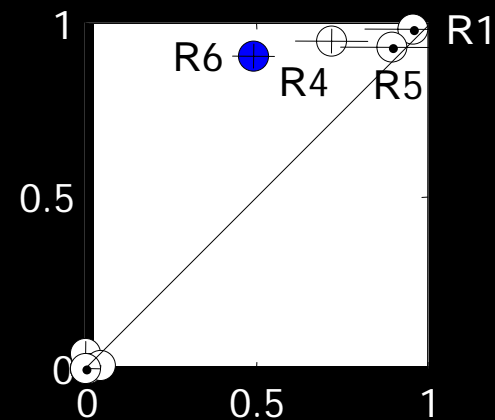
BATCH

max ATP / flux unit



CHEMOSTAT

max ATP (biomass)



Conclusions

1. Assumption so far still valid?

Maximization of biomass (growth) widely accepted
Two metabolic states operational in *E. coli*

2. Evolutionary selection of metabolic network regulation?

No additional, potentially artificial constraints

Acknowledgement

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