

University of Minho School of Engineering Centre of Biological Engineering

### Introduction

Systems Biology aims to understand and predict cellular behavior through the creation of computational cell models.

Constraint-based modeling has been used to model metabolic networks at the genome scale [4]. Its simplicity provides scalability but ignores kinetic behavior and enzymatic regulation.

→ Kinetic models at the genome scale are being recently built, adding approximative kinetic rate laws to constraint-based models [3,6]. However, they still lack enzymatic regulation.

Petri nets are a graphical and mathematical formalism used to model all kinds of biological networks [5].

Extended Petri nets are an extension that include special types of arcs able to model different kinds of interactions.

### Objectives

Use Extended Petri nets to model metabolic networks in order to account for regulatory interactions.

Develop a framework for kinetic inference that generates kinetic models from the underlying topology.

Build an Extended Petri net model of the central carbon metabolism of *E. coli*, based on the available dynamic model [1], and generate kinetic models (with and without enzymatic regulation).

Simulate the metabolic phenotype of mutant strains upon gene knockout and adjustment of enzyme expression levels.

Evaluate the impact of accounting for enzymatic regulation by comparing the results with those obtained with the original model.

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# **MODELING ENZYMATIC REGULATION IN METABOLIC NETWORKS**

## **DANIEL MACHADO\*** Supervisors: Eugénio C. Ferreira, Isabel Rocha, Bruce Tidor \* dmachado@deb.uminho.pt



### Conclusions

- Enzymatic regulatory effects can influence the metabolic flux distribution.
- Extended Petri nets can model such effects with activation and inhibition arcs.
- $\rightarrow$  They provide a better scaffold to generate large-scale kinetic models.
- $\rightarrow$  These models may reveal new targets for rational strain design. Future work...
- $\rightarrow$  Parameter estimation is still the main bottleneck of this process.
- $\rightarrow$  The framework can be extended to include transcriptional regulation.

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- $\rightarrow$  Kinetic models generated with GMA kinetics [2].
- ➔ Parameters fitted to wild-type steady-state.
- $\rightarrow$  New models predicted the mutant phenotypes.
- Regulatory effects can only be predicted by the model with regulation.
- → Example: 5-fold underexpression of *pepCxylase* – only the model with regulation correctly predicted the flux shift confirmed by the original model.

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0.05	0.1	0.15	0.2	0.25	0.3	0.35

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