The MetaGenoReg project

Towards an understanding of the interrelations between metabolic and gene regulation

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General question of biological regulation

- Cellular regulation involves several levels, including:
 - Gene regulatory networks
 - Metabolic regulation

These levels interact:

- Gene expression impacts metabolism through changes in enzyme concentrations
- Conversely metabolism influences gene expression
- > What is the rationale articulating both types of regulation?
 - Are they interchangeable ?
 - How much are they constrained?
 - What is the relative importance of gene and metabolic regulation?

Modular 'hierarchical' analysis



MCT and regulation analysis

- Metabolic Control Theory provides for sensitivity analysis around steady-states
- MCT can handle modular, hierarchical networks (Kahn & Westerhoff, 1991; Bruggeman *et al.*, 2002)

However:

- MCT is not well adapted to abrupt transitions
- Rigorously it cannot treat transients between remote steady-states
- Strong non-linearities must be captured differently
- Therefore one needs a different approach

Combining both types of regulation

Outline

- Reduce and simplify in order to understand the system's behaviour
- Develop a method for joint modelling combining different approximations suited to both types of regulation
- Measure their respective contributions

Which reduction, which approximations?

- Decompose the system into a slow (gene) and a fast (metabolic) component
 - → fast algebraic subsystem (quasi steady-state hypothesis)
- Variable aggregation
- Strongly cooperative effects to be approximated by step functions
- Various types of linearization of metabolic responses

PL model for gene regulation

de Jong et al. (2003) Bioinformatics 19:336-344

Approximate promoter responses by step functions:

$$\dot{x}_a = \mathbf{k}_a \ s^{-}(x_a, \mathbf{q}_{a2}) \ s^{-}(x_b, \mathbf{q}_{b1}) - \mathbf{g}_a \ x_a$$
$$\dot{x}_b = \mathbf{k}_b \ s^{-}(x_a, \mathbf{q}_{a1}) \ s^{-}(x_b, \mathbf{q}_{b2}) - \mathbf{g}_b \ x_b$$

 $\begin{array}{c|c} \uparrow & 1 \\ s^{-}(x, ?) \\ 0 \\ q \\ x \end{array} \rightarrow \begin{array}{c} \\ \end{array} \end{array}$

x : protein concentration
q : threshold concentration
k, g: rate constants

Piece-wise linear (PL) differential systems

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D. Kahn, MetaGenoReg project, FEBS SysBio 2007

Glucose-acetate diauxie

- Well-characterised transition in *E. coli*
- Involves major changes
 - at the metabolic level: gluconeogenesis vs. glycolysis
 - at the gene expression level
- Strong interaction between metabolic and gene expression levels



Oh et al. (2002), J Biol Chem. 277(15):13175-83.

Assessment and use of simplified model

- Benchmark model entirely specified with ODEs
- 'Toy' system to assess different reductions and approximations
- Comparison of simplified models with complete ODE model
- Parameter estimation for the simplified model on the basis of experimental data generated in the project:
 - Metabolic (concentrations and fluxes: ¹³C NMR, IC-MS) Jean-Charles Portais, Toulouse
 - Gene expression (enzyme activities, microarrays, reporter genes)
 Hans Geiselmann, Grenoble

Experimental validation

- Metabolic measurements (JC Portais, Toulouse)
- Gene expression dynamics with fluorescent reporter proteins (Hans Geiselmann, Grenoble)





Zaslaver et al. (2006), Nature Methods, 3(8): 623-628

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Roles of metabolic and gene regulation

- Study the metabolic response in the model when gene regulation is abolished
- Evaluate (quantify) the contribution of gene regulation to the metabolic response
- Conversely calculate the contribution of metabolic effects to gene regulation
- Understand the biological rationale underlying the distribution of regulation between metabolism and gene expression

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- Jean-Charles Portais, INRA-INSA Toulouse
- Agence Nationale pour la RechercheEU

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Fellowships available on MetaGenoReg

Thesis fellowship, 2007-2010 Application deadline: April 30

Post-doctoral fellowships, 2007-2009

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