Competition, feedback and fluctuations in genetic regulatory modules

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Introduction

The E. coli transcription network

Taken from: Shen-Orr et al. Nature Genetics 31:64-68(2002)



Properties of the Network

- Approx. Scale-Free Network
- Includes Modular Structures Motifs Autorepressor
 Feed-Forward Loop
 Single-Input Module
 No Feedback Loops



Multistability

Oscillations



В

The Auto-repressor

- Protein A acts as a repressor to its own gene
- It can bind to the promoter of its own gene and suppress the transcription



The Auto-repressor

Rate equations – Michaelis-Menten form

$$\frac{d[A]}{dt} = \frac{g}{1+k[A]^h} - d[A]$$

h = Hill coefficient

k=b/u = repression strength

Rate equations – Extended Set

$$\frac{d[A]}{dt} = g(1-[r]) - d[A] - b[A](1-[r]) + u[r]$$

$$\frac{d[A]}{dt} = b[A](1-[r]) - u[r]$$



It's a noisy business!

(McAdams & Arkin, 1999)



From Michael Elowitz, Science (2002)

The Auto-repressor

 $P(N_A, N_r)$: Probability for the cell to contain N_A free proteins and N_r bound proteins

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The Master Equation

$$\begin{aligned} \frac{d}{dt} P(N_A, N_r) &= g(1 - N_r) [P(N_A - 1, N_r) - P(N_A, N_r)] \\ &+ d[(N_A + 1)P(N_A + 1, N_r) - N_A P(N_A, N_r)] \\ &+ b[N_r(N_A + 1)P(N_A + 1, N_r - 1) - (1 - N_r)N_A P(N_A, N_r)] \\ &+ u[(N_r + 1)P(N_A - 1, N_r + 1) - N_r P(N_A, N_r)] \end{aligned}$$

The Auto-repressor



The Genetic Switch



- A mutual repression circuit.
 - Two proteins A and B negatively regulate each other's synthesis

Bistability

- The probability distribution is composed of two peaks
- The separation between these peaks determines the quality of the switch



Lipshtat, Loinger, Balaban and Biham, Phys. Rev. Lett. 96, 188101 (2006) Lipshtat, Loinger, Balaban and Biham, Phys. Rev. E 75, 021904 (2007)

The Exclusive Switch



Switching Time as a first passage problem



B. Barzel and O. Biham, Phys. Rev. E 78, 041919 (2008)

Mixed feedback loops



Shimoni, G. Friedlander, S. Altuvia, H. Margalit and O. Biham, Preprint (2011)

Stochastic Timer



Persistence

Bacterial persistence is a phenomenon in which a small fraction of genetically identical bacteria cells survives after an exposure to antibiotics

Survival fraction Α **B** Microfluidic device Flow channe PDMS grooves Membrane PEMS 30 40 50 0 10 20 Time on ampicillin (h) C 0:00 D 0:59 E 1:45 F 6:50 G 7:38 H 8:39 Growth medium (GM1) Ampicillin (A) Growth medium (GM2)

What is the mechanism?

Figure taken from: N.Q Balaban et al., Science 305, 1951 (2004)



HipA – Stable toxin

HipB – Unstable Antitoxin, Neutralizes HipA



Cells that contain a large number of A proteins divide slowly and are not affected by antibiotics.

This state is characterized by a long **lag time**.



Threshold behavior

Fraction of persisters = $Prob(A > A_0)$ [Threshold]

Dependence on A and B production



E. Roten, A. Loinger, I. Ronin, I. Levin-Reizman, H. Gabay, N. Shoresh, O. Biham and N.Q. Balaban, PNAS 107, 12541 (2010)

miRNA Regulation



Summary

- We have studied several modules of genetic networks using deterministic and stochastic methods
- The combination of competition, feedback and fluctuations has an important effect on the function of these modules. In particular, it gives rise to phenotypic diversity in populations of identical cells.
- Current work is aimed at extending the results to more complex networks