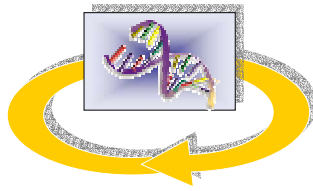


**BCB 2004, Second Bertinoro Computational Biology Meeting**  
12-19 June 2004, University of Bologna Residential Center  
Bertinoro (Forlì), Italy

## Regulation of biochemical networks as interconnection: the *behavioral* approach



**Lorenzo Farina**  
Department of Computer and System Science "A. Ruberti"  
University of Rome "La Sapienza", Italy

## Plant Computational Genomics Team



### Experimental plant biology

**Ida Ruberti**, Nucleic Acids Research Center, Department of Genetic and Molecular Biology, University of Rome "La Sapienza"

**Giorgio Morelli**, Plant Biotechnology Unit, National Research Institute for Food and Nutrition (INRAN), Rome

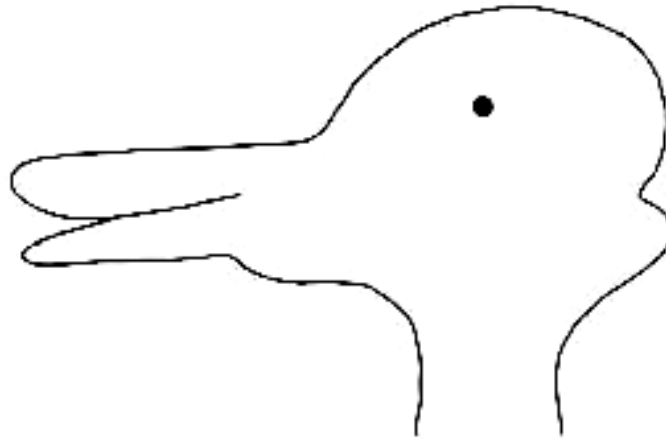
### Dynamical systems & control engineering

**Lorenzo Farina**, Department of Computer and Systems Science, University of Rome "La Sapienza"

### Additional researchers

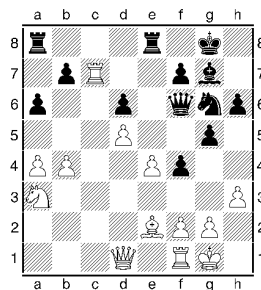
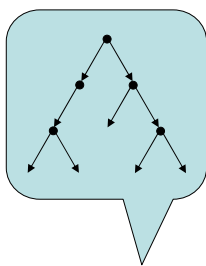
**Paolo Marcatili** (computer science) and **Paolo Uva** (PhD, biology)

## Observation vs theory



a *duck* or a *rabbit*?

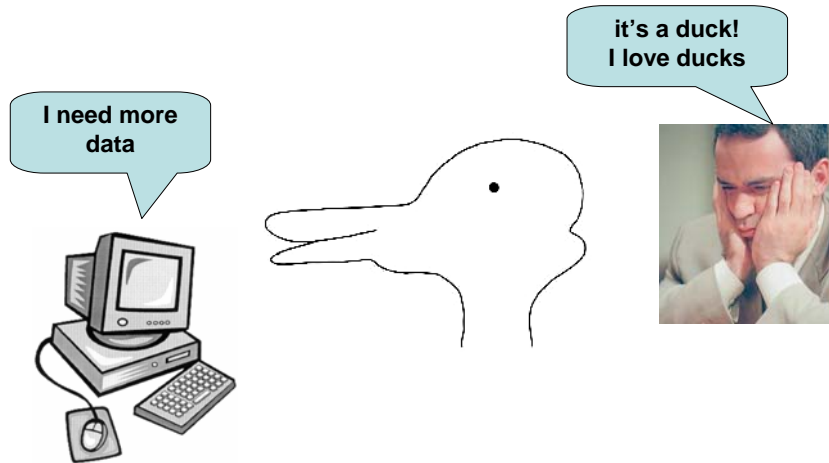
## Kasparov vs Deep Blue - I



...control the center...  
...fill the gaps...

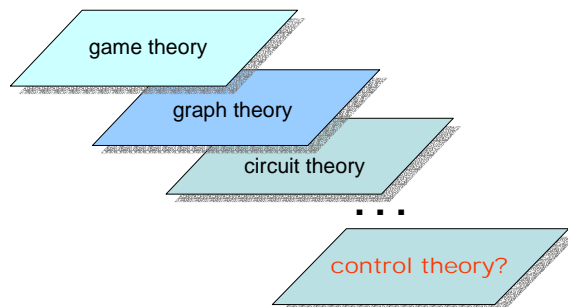


## Kasparov vs Deep Blue - II



## Metaphors and description spaces

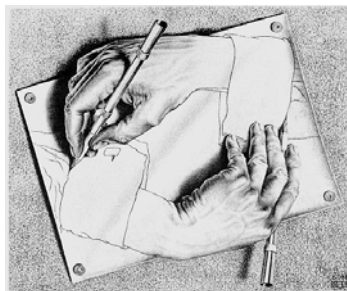
new metaphors  
*create* new  
description spaces  
or new contexts,  
that is they *provide*  
*meaning to*  
*observations*



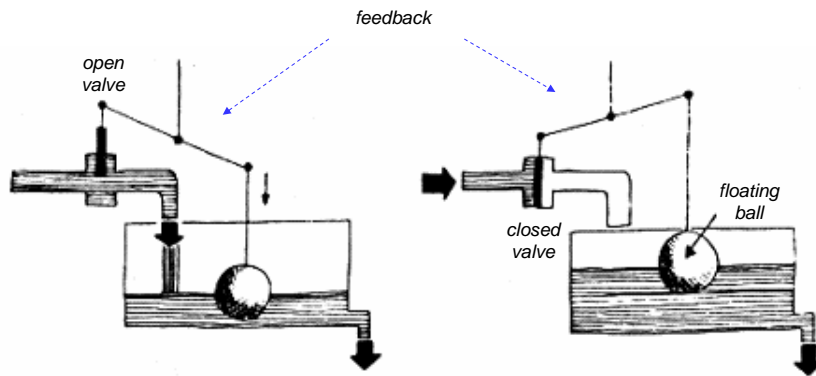
## What is control theory?

- “Principles and methods used to design engineering systems that maintain desirable performance by automatically adapting to changes in the environment”
- More specifically, control theory is concerned with designing strategies that ensure the robust performance of a system
- Robustness is mainly provided by feedback
- Examples of control systems are everywhere

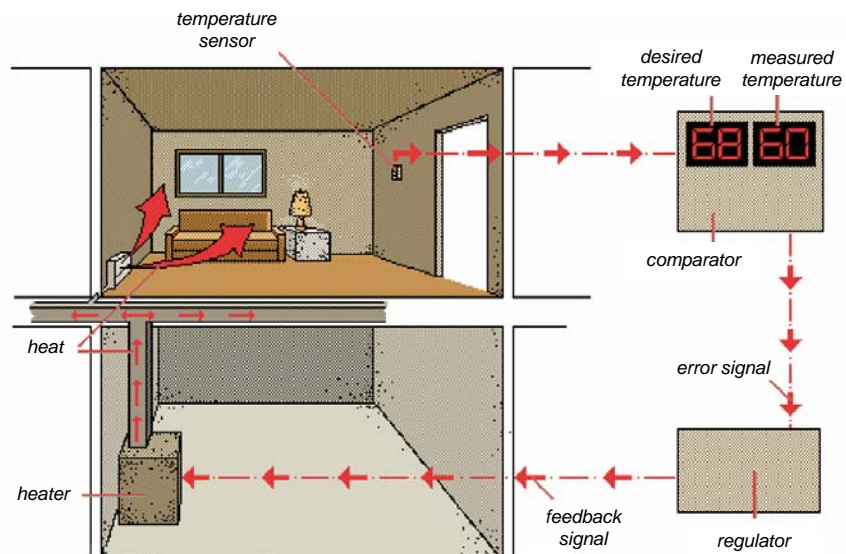
## THE JOY OF FEEDBACK !

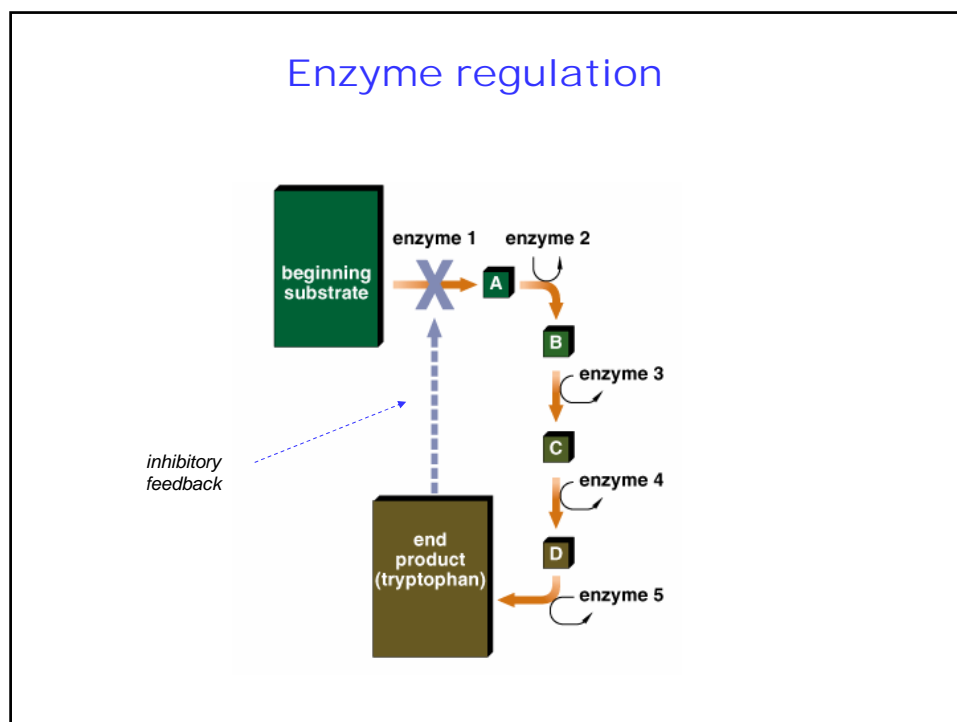
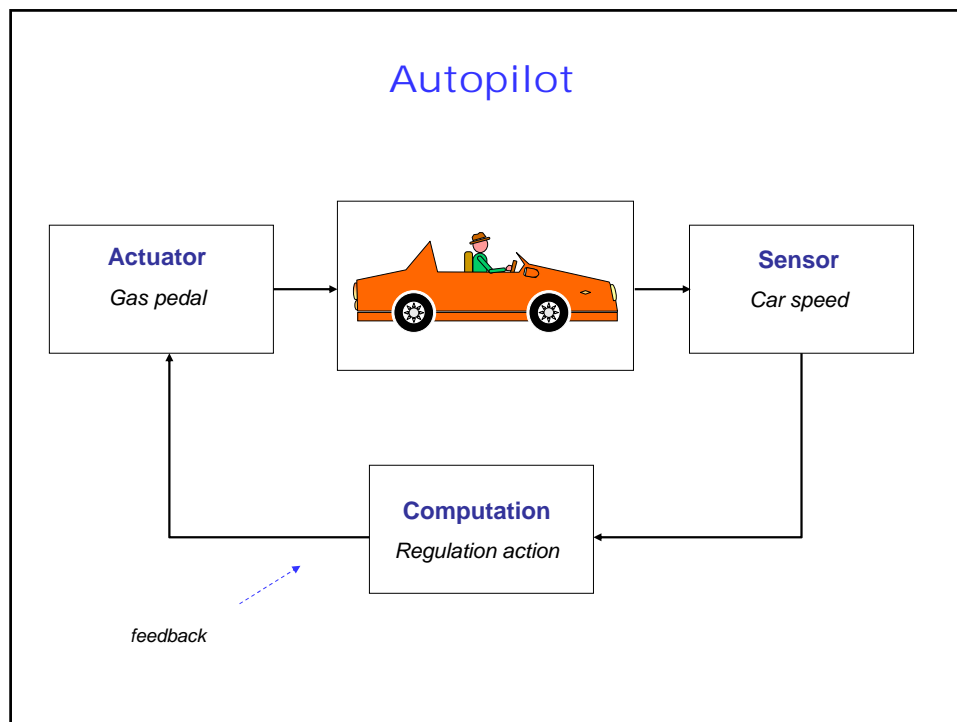


## Water level control

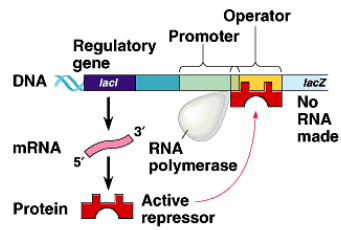


## Thermostat

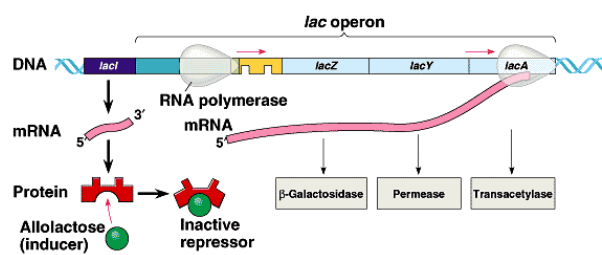




## Gene regulation

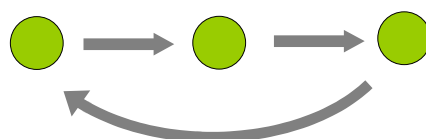


(a) Lactose absent, repressor active, operon off

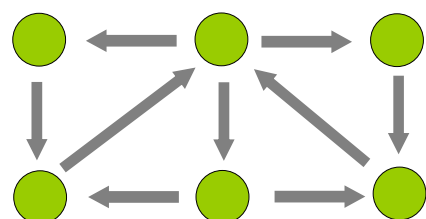


(b) Lactose present, repressor inactive, operon on

## Where is feedback?

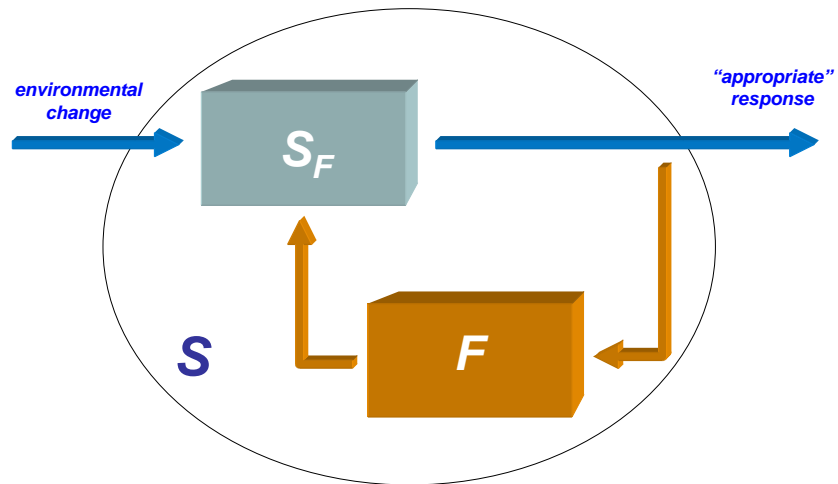


easy!

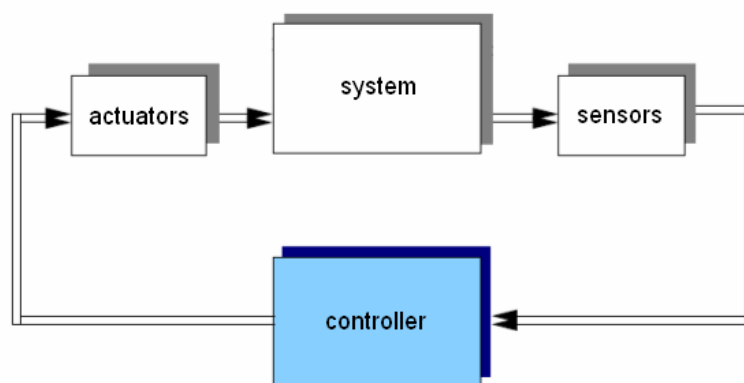


here, there and everywhere...

## Feedback and self-regulation systems



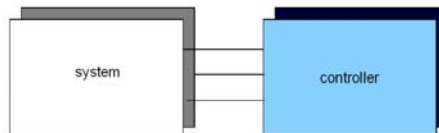
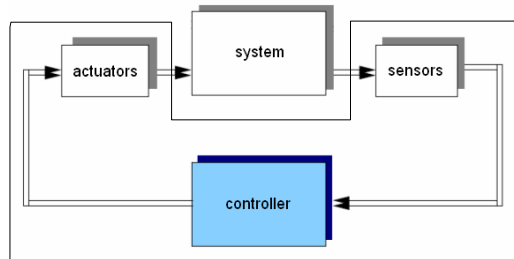
## The "intelligent control" paradigm



*functional separation among sensors / actuators /  
decision system*

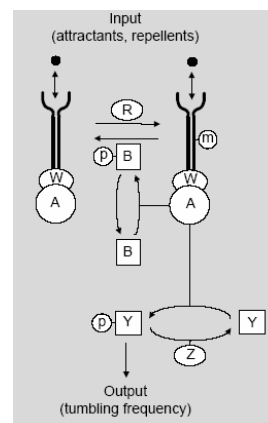
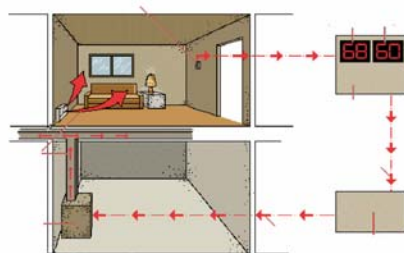
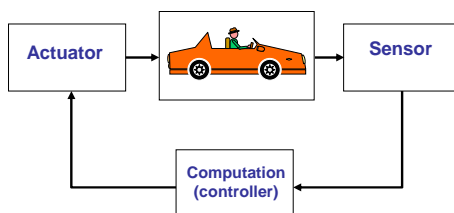


## Control as *interconnection*

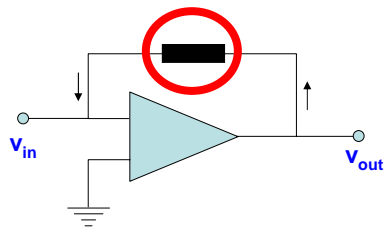
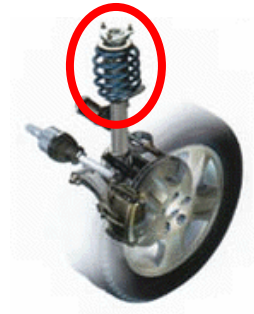
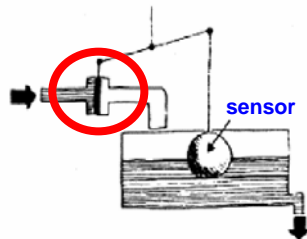


*interconnection  
changes  
the overall system  
properties  
i.e. its "behavior"  
no clear functional  
separation*

## Examples of "intelligent" control systems



## Examples of “interconnected” control systems

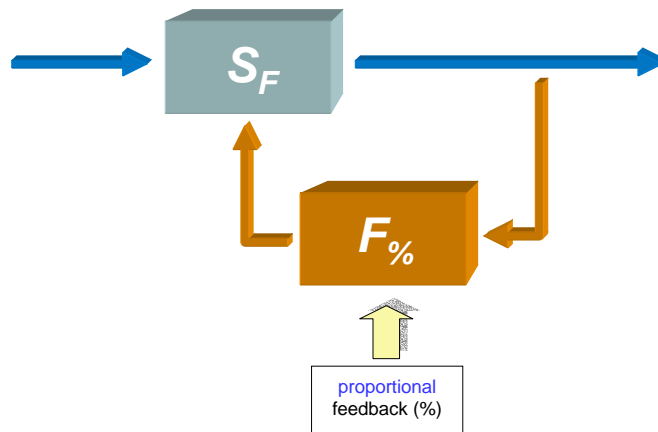


A biological example?

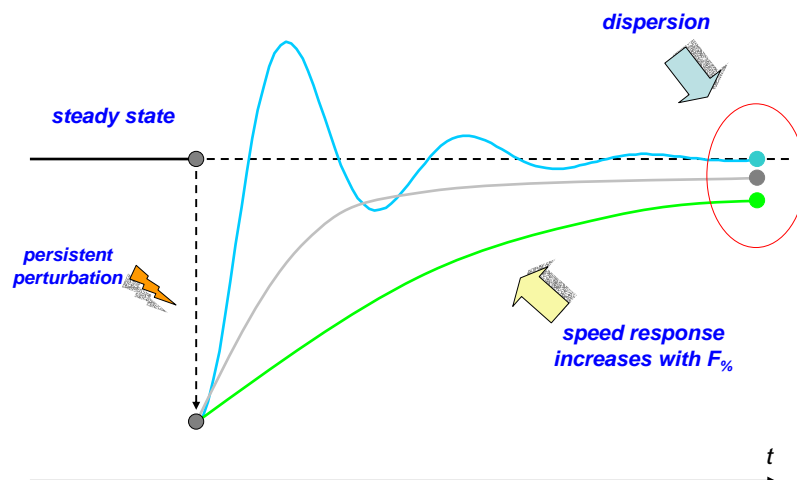


SELF  
REGULATION  
SYSTEMS  
*BEHAVIORS*

## Proportional control system



## The behavior of proportional control

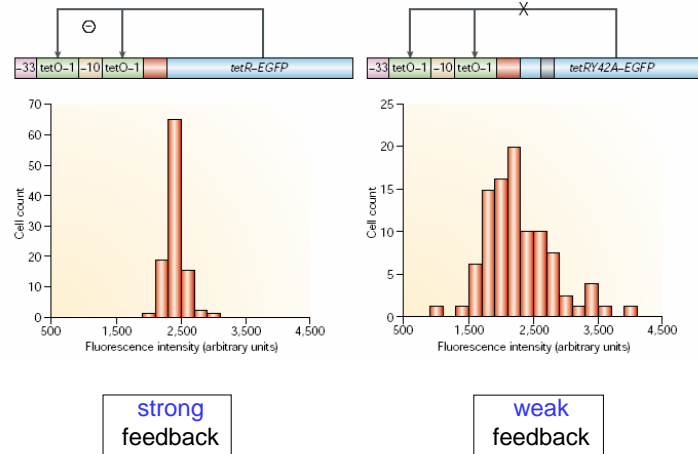


## Engineering stability in gene networks by autoregulation

Attila Becskei & Luis Serrano

NATURE | VOL 405 | 1 JUNE 2000

## Dispersion

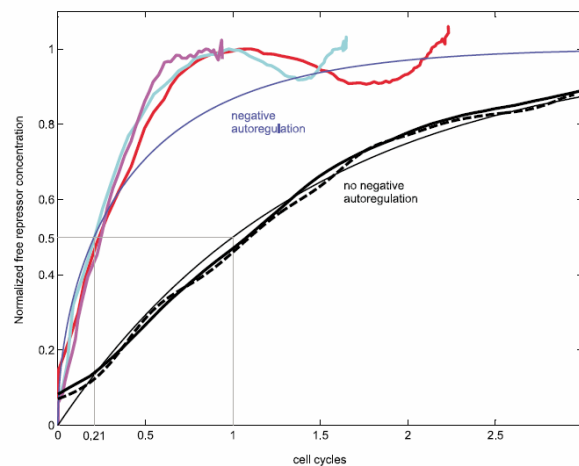


## Negative Autoregulation Speeds the Response Times of Transcription Networks

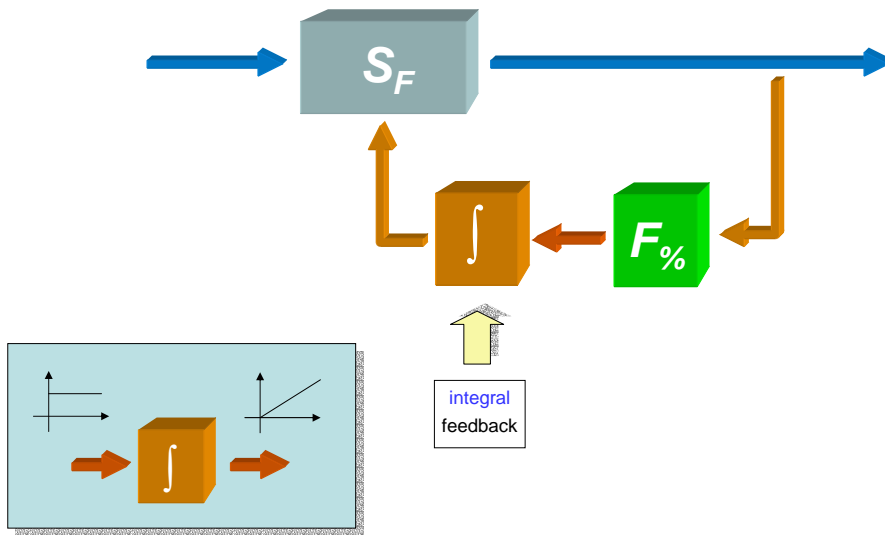
Nitzan Rosenfeld<sup>1</sup>, Michael B. Elowitz<sup>2</sup> and Uri Alon<sup>1\*</sup>

*J. Mol. Biol.* (2002) **323**, 785–793

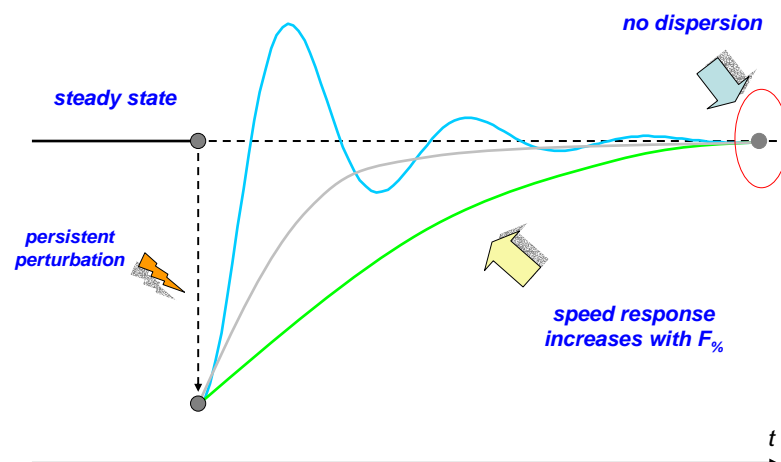
## Response speed



## Integral control system

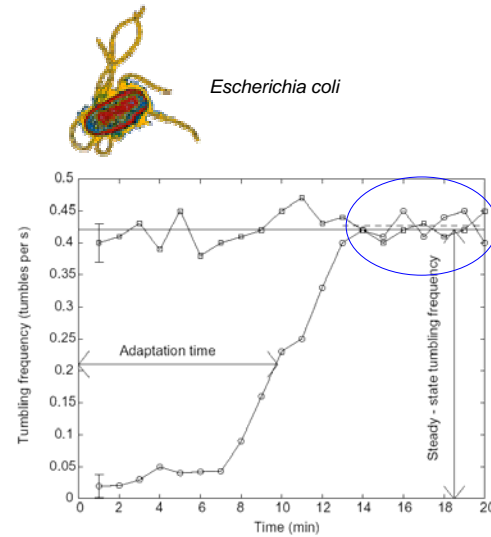


## The behavior of integral control

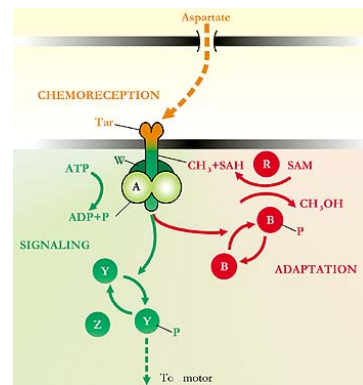


## Robustness in bacterial chemotaxis

U. Alon<sup>†</sup>, M. G. Surette<sup>‡</sup>, N. Barkai<sup>†</sup> & S. Leibler<sup>†\*</sup>  
NATURE | VOL 397 | 14 JANUARY 1999

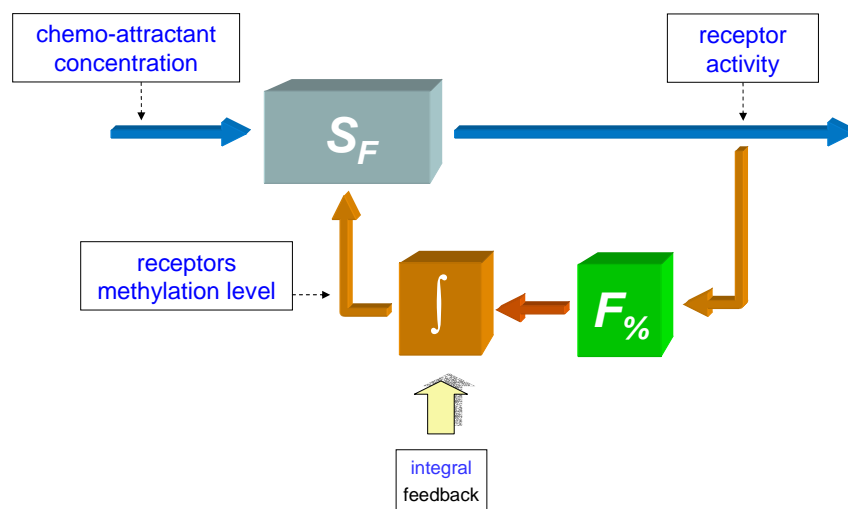


## Perfect adaptation



## Robust perfect adaptation in bacterial chemotaxis through integral feedback control

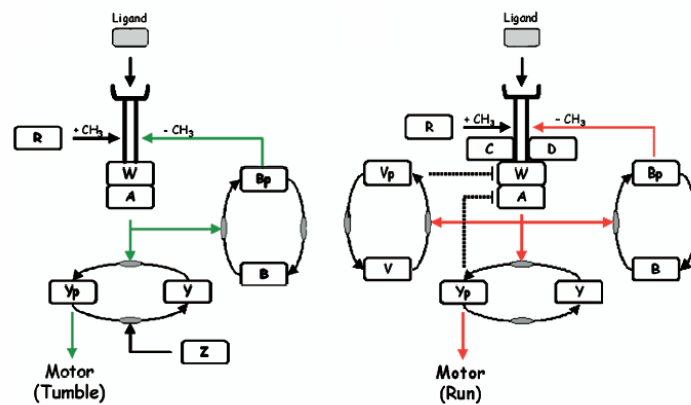
Tau-Mu Yi<sup>†\*</sup>, Yun Huang<sup>†\*</sup>, Melvin I. Simon<sup>†\*</sup>, and John Doyle<sup>†</sup>  
PNAS | April 25, 2000 | vol. 97 | no. 9 | 4649–4653



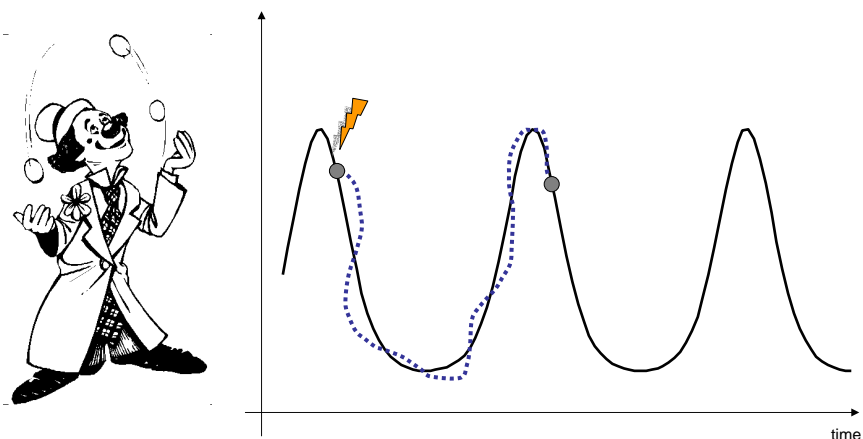
# Design and Diversity in Bacterial Chemotaxis: A Comparative Study in *Escherichia coli* and *Bacillus subtilis*

Christopher V. Rao<sup>1</sup>, John R. Kirby<sup>2</sup>, Adam P. Arkin<sup>1,3\*</sup>

PLoS BIOLOGY February 2004 | Volume 2 | Issue 2



## Trajectory tracking



## Conclusions

- Control theory provides strategies aiming to obtain “appropriate” responses to environmental changes
- Control theory may be able to give meaningful interpretation to data and indications on possible underlying biochemical mechanisms
- Feedback control is the major source of robustness
- A control system may be composed of separate units acting as sensors / controllers / actuators or may be **not**
- The presence of a control system may be argued by looking at “behaviors”
- A control system may be implemented in many equivalent ways, but some “behaviors” remain the same