

# Genetic network modeling and identification

Junior Barrera

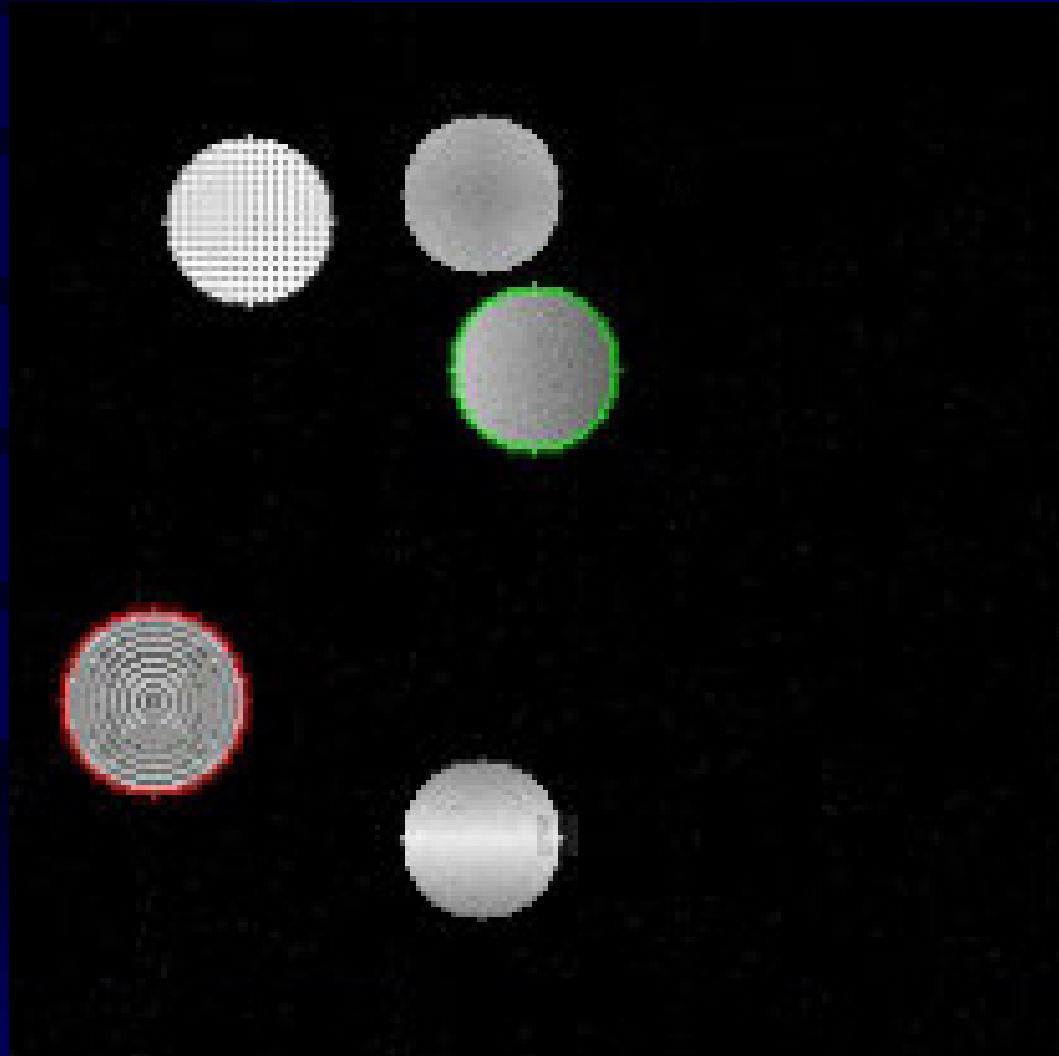
BIOINFO-USP

# Layout

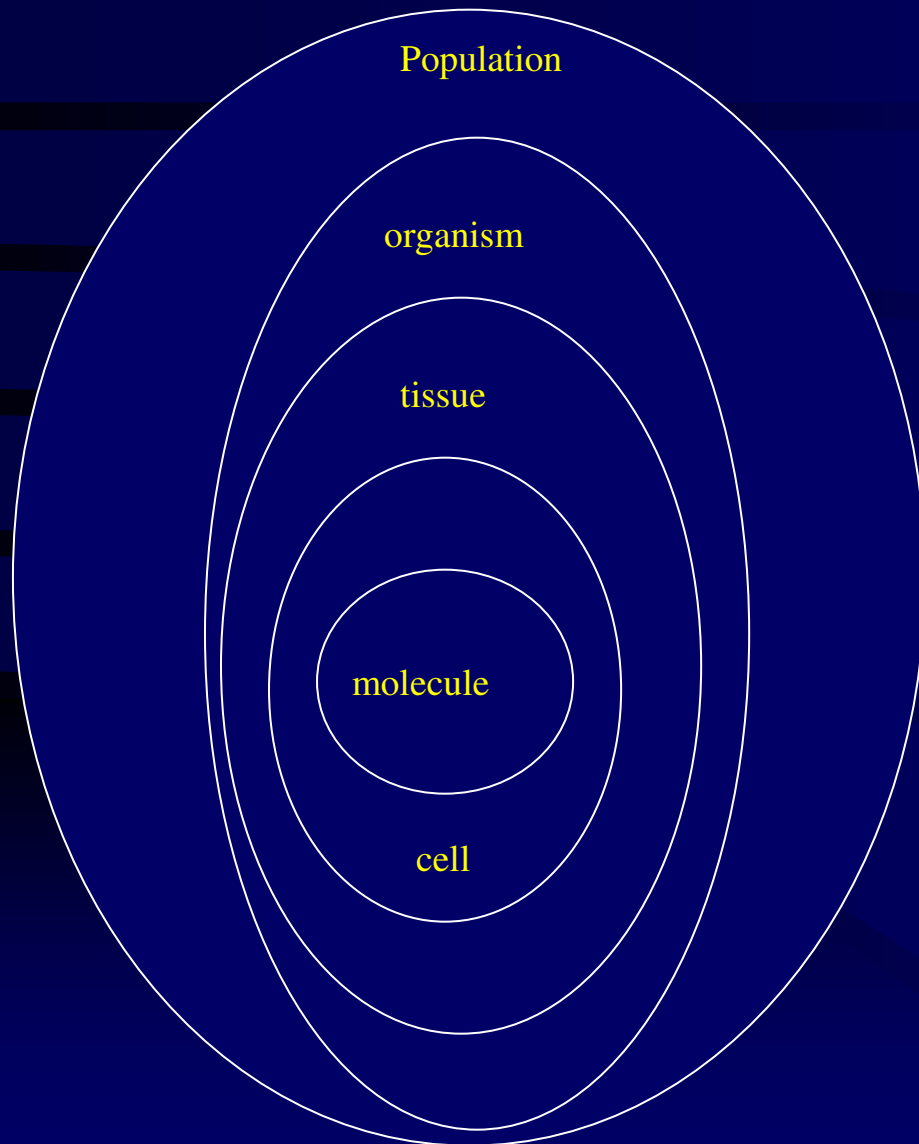
- Introduction
- Dynamical systems
- System identification
- Knowledge discovery in biology

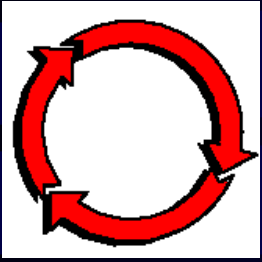
# Introduction

# Dynamical System



**Biological** Phenomena are  
**multi-scale, dynamical** and,  
in many cases, **measurable**

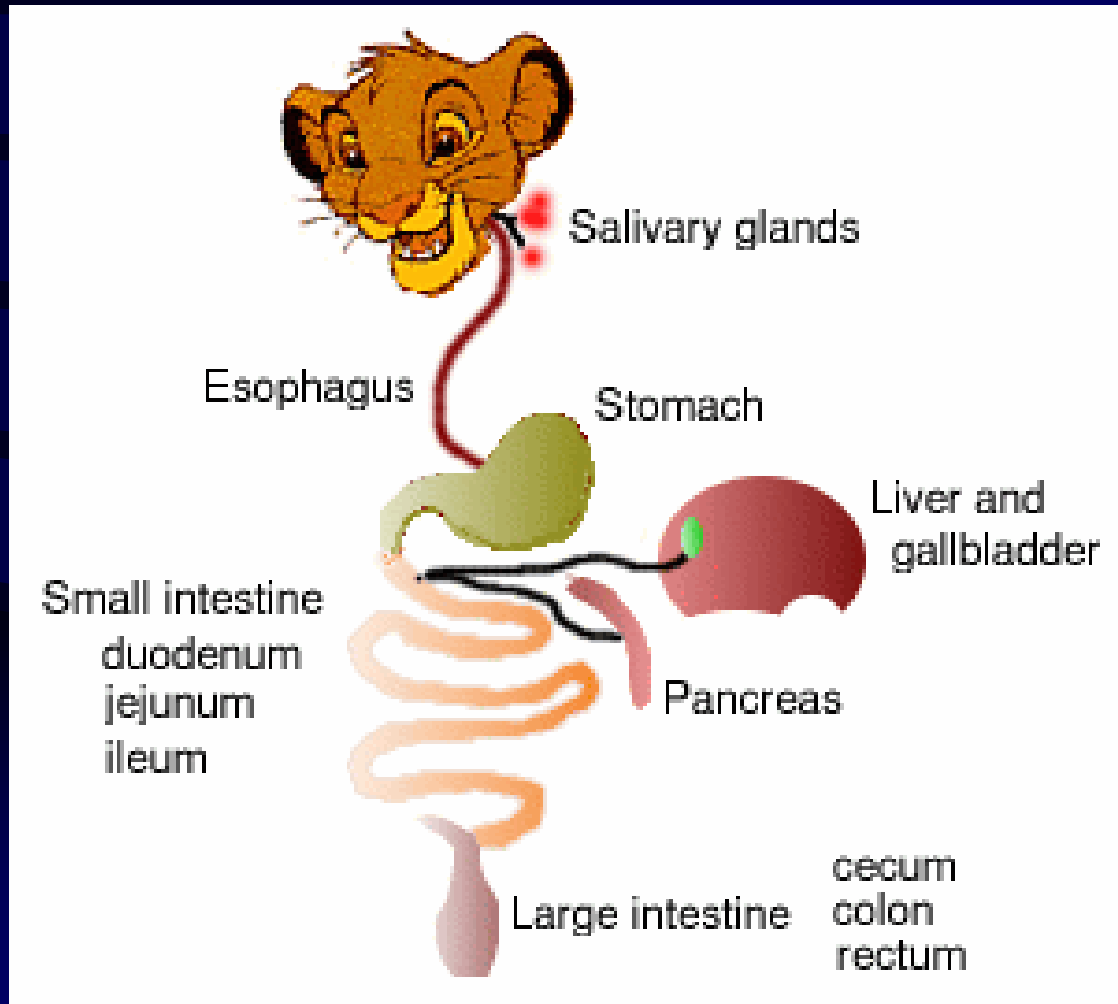




# Ecological System



# Digestive System



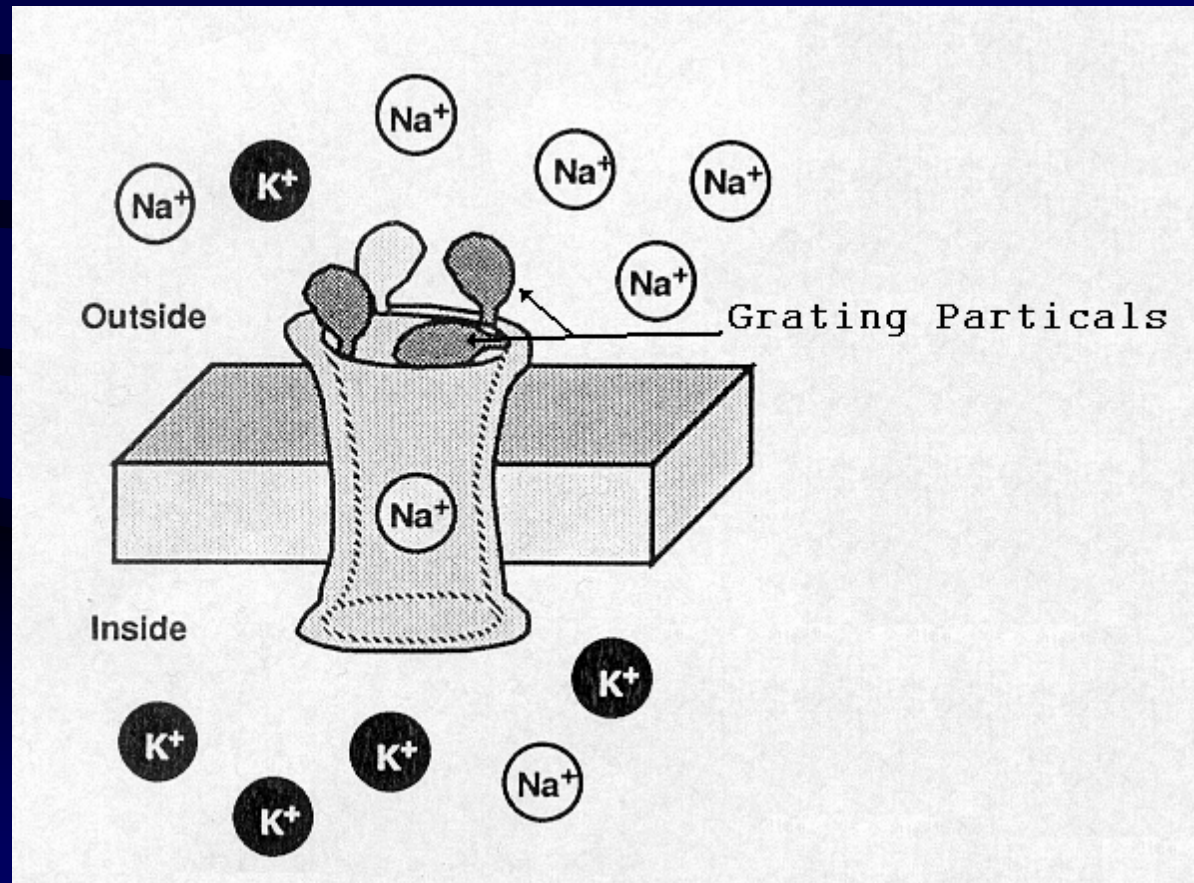
# Neuron

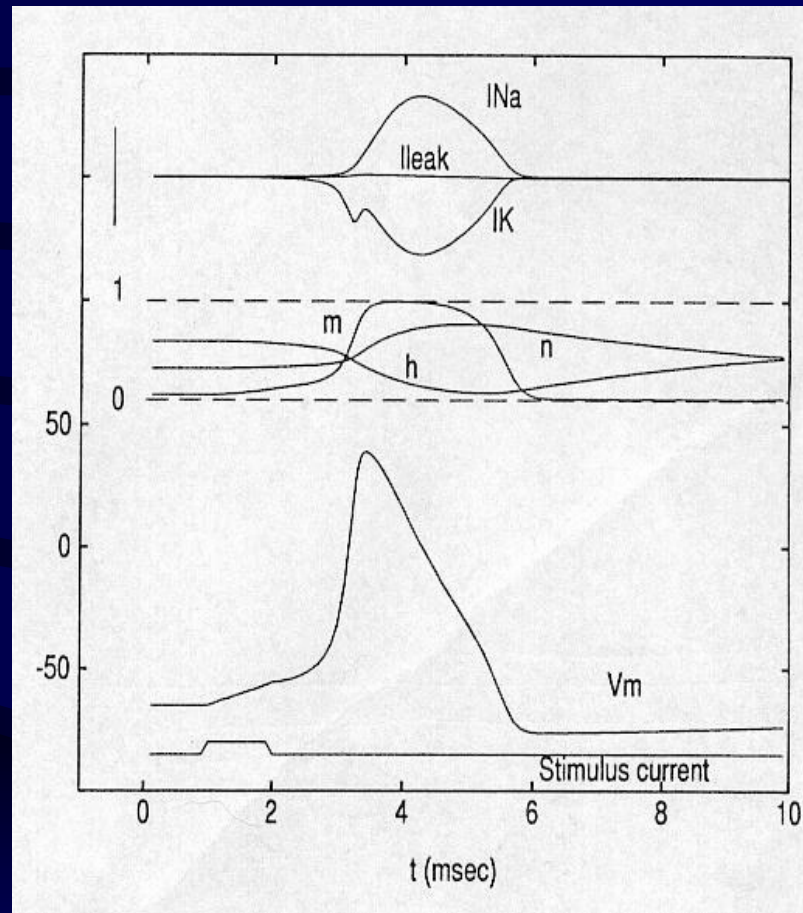
The key unit of living beings for electric signal processing

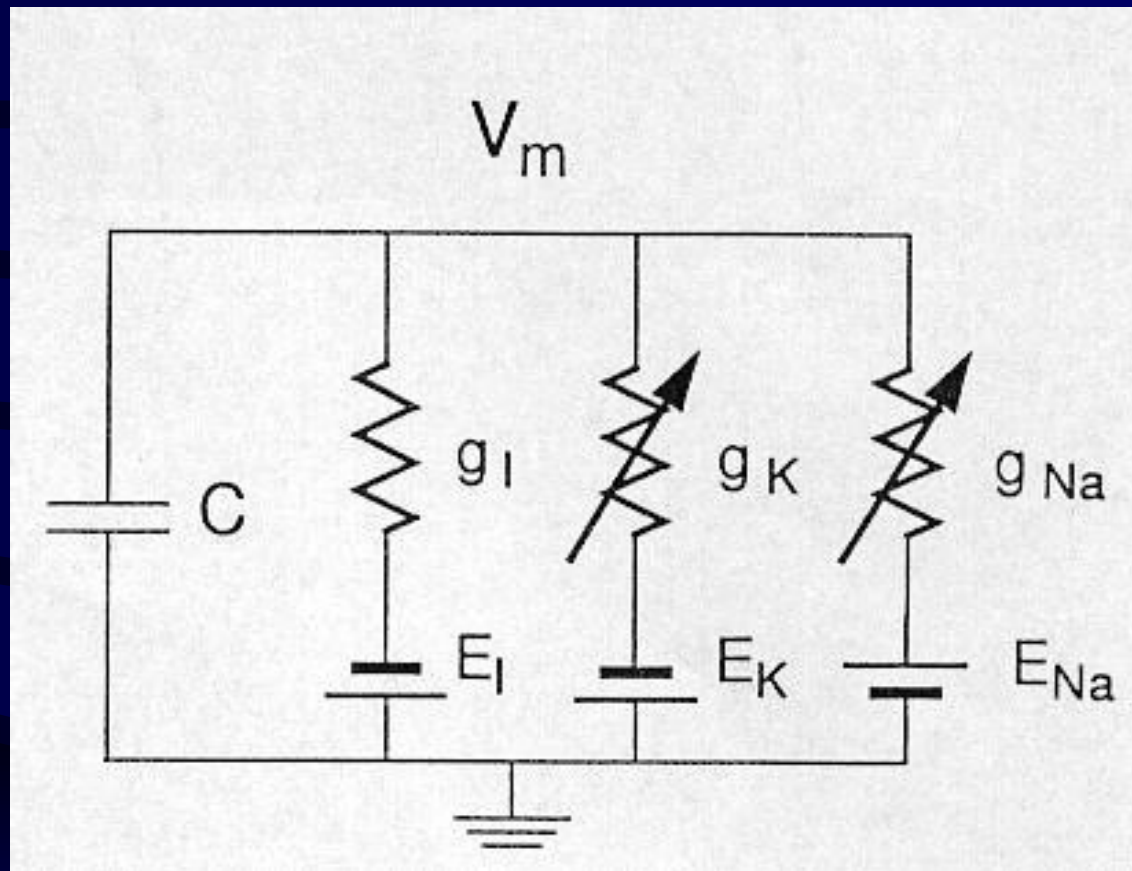




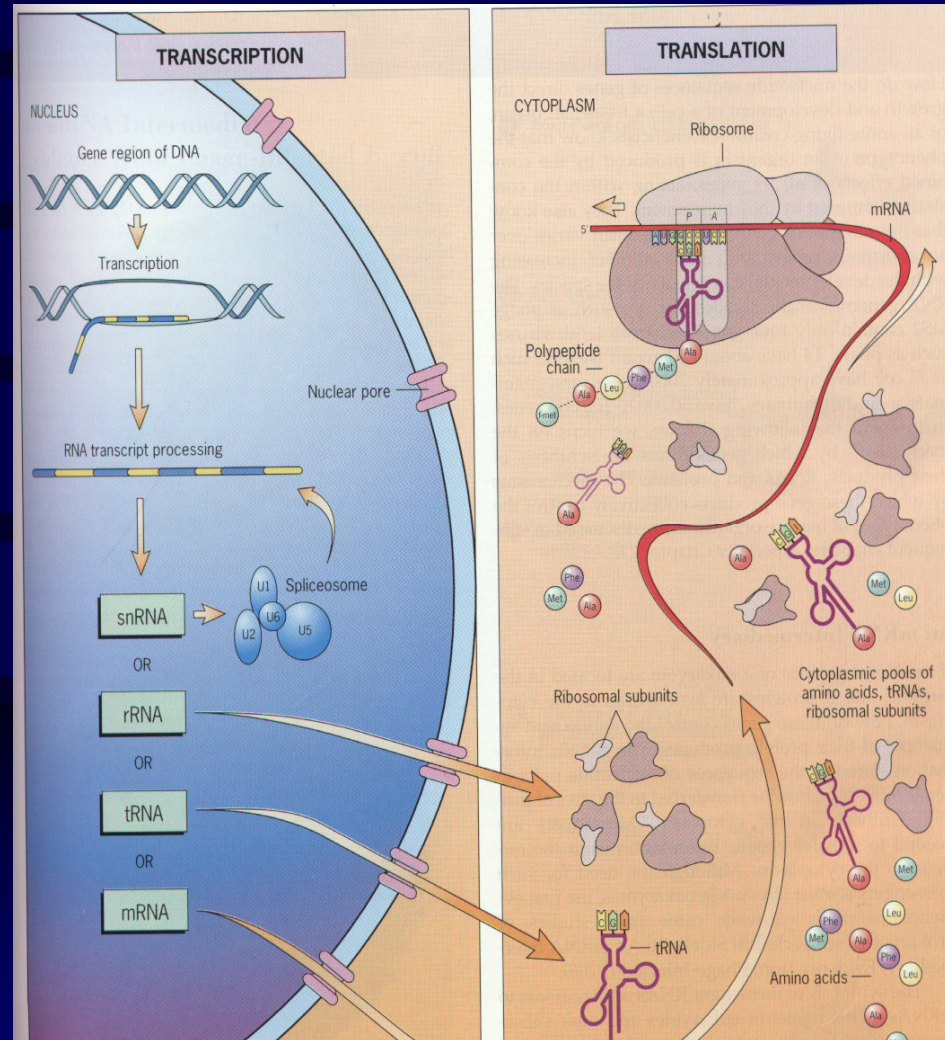
# Nobel Prize in Medicine 1963: Hodgkin - Huxley







# Molecular Biology



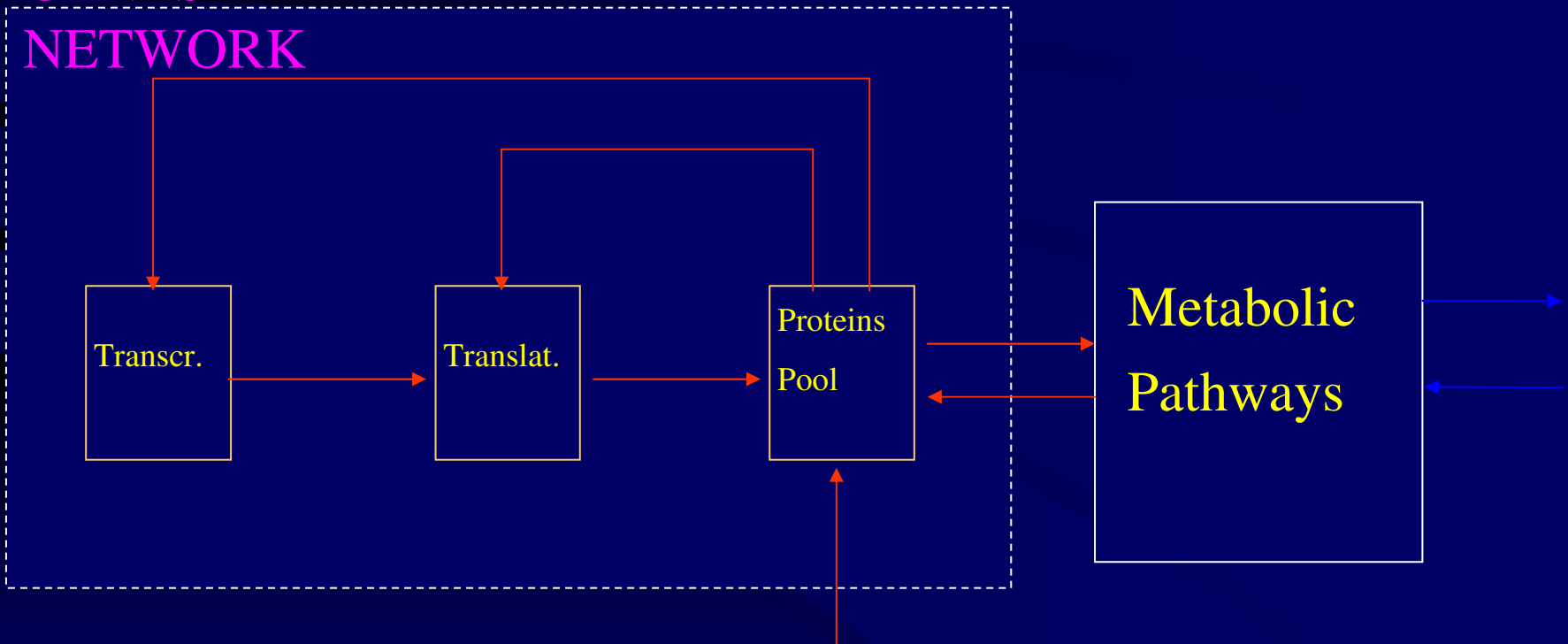


# Cell

■ peptide

■ non peptide

GENES  
NETWORK

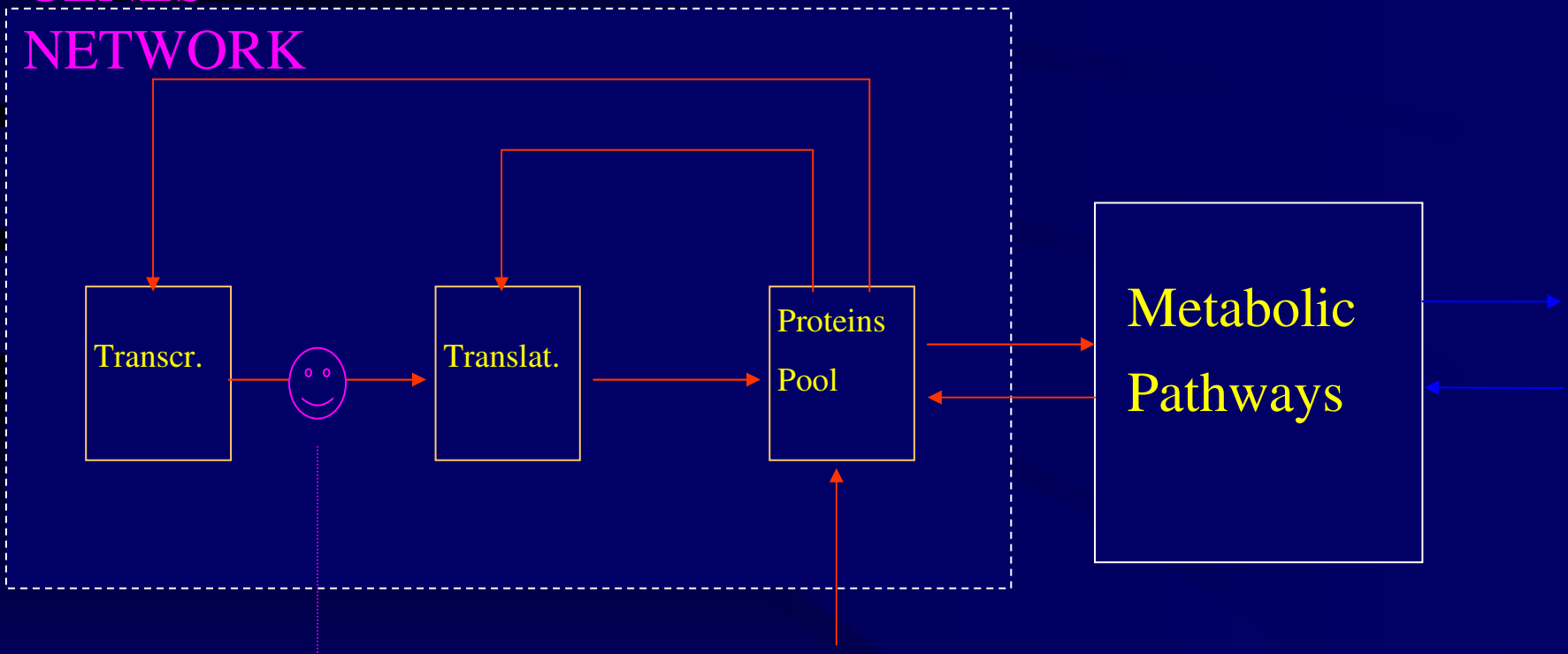


# Cell

■ peptide

■ non peptide

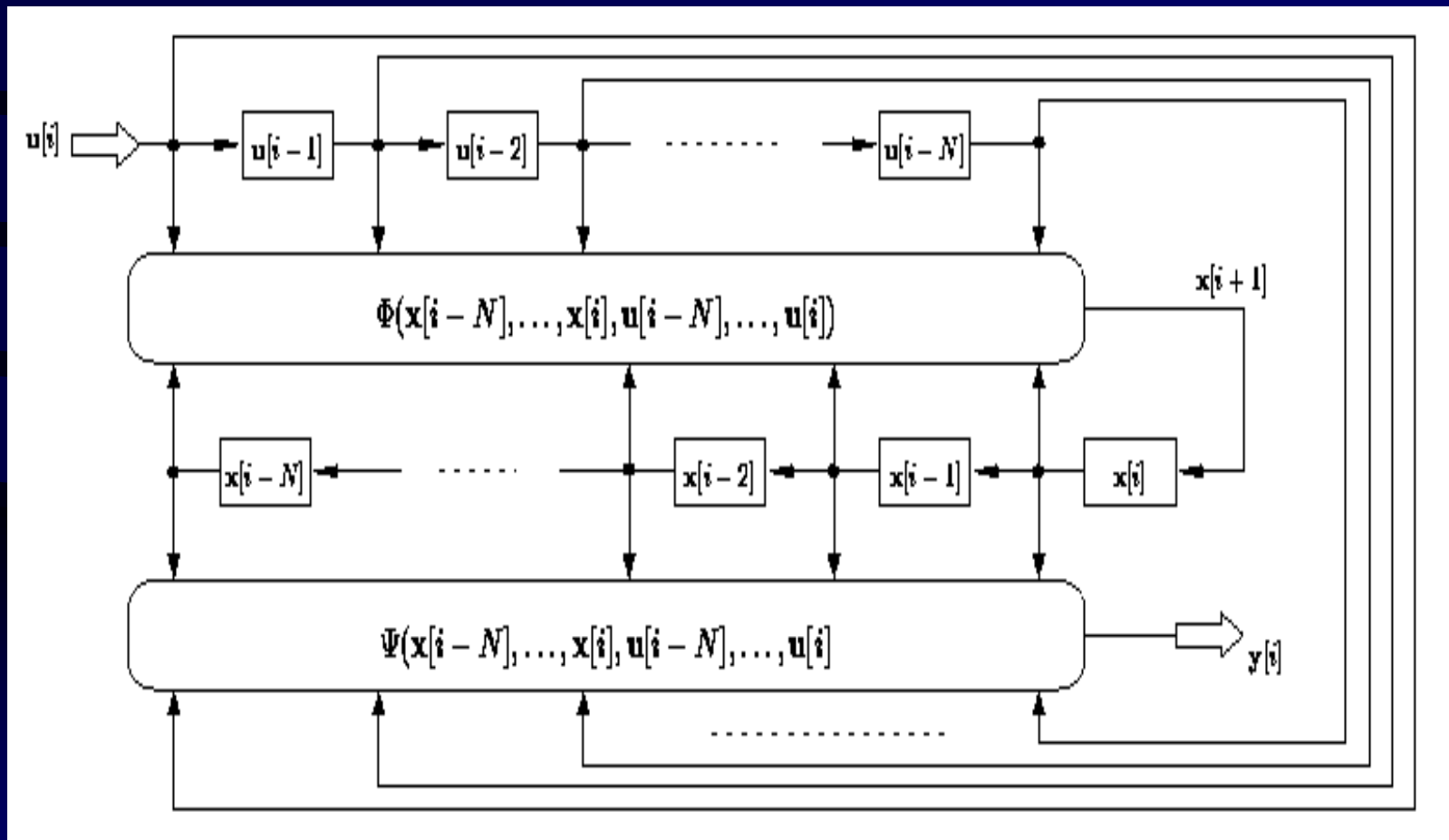
GENES  
NETWORK



microarray

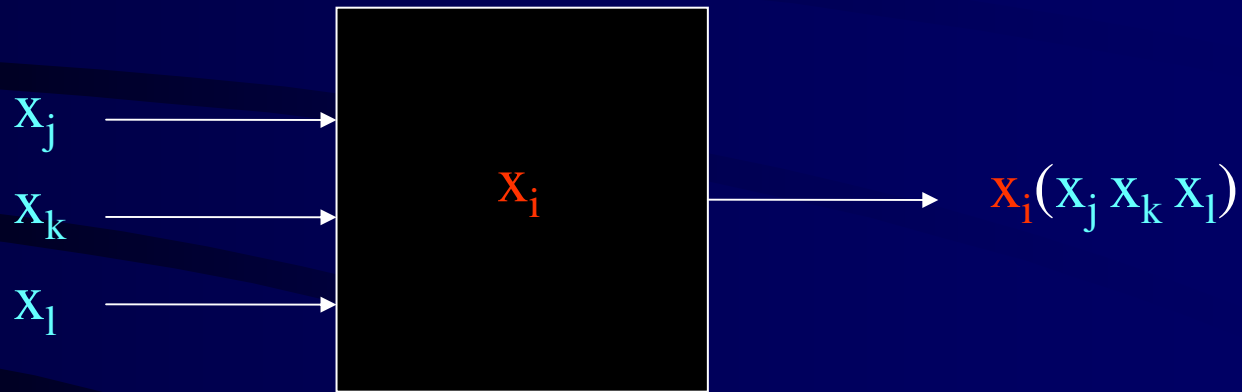
# Dynamical System

# Graphical Interpretation

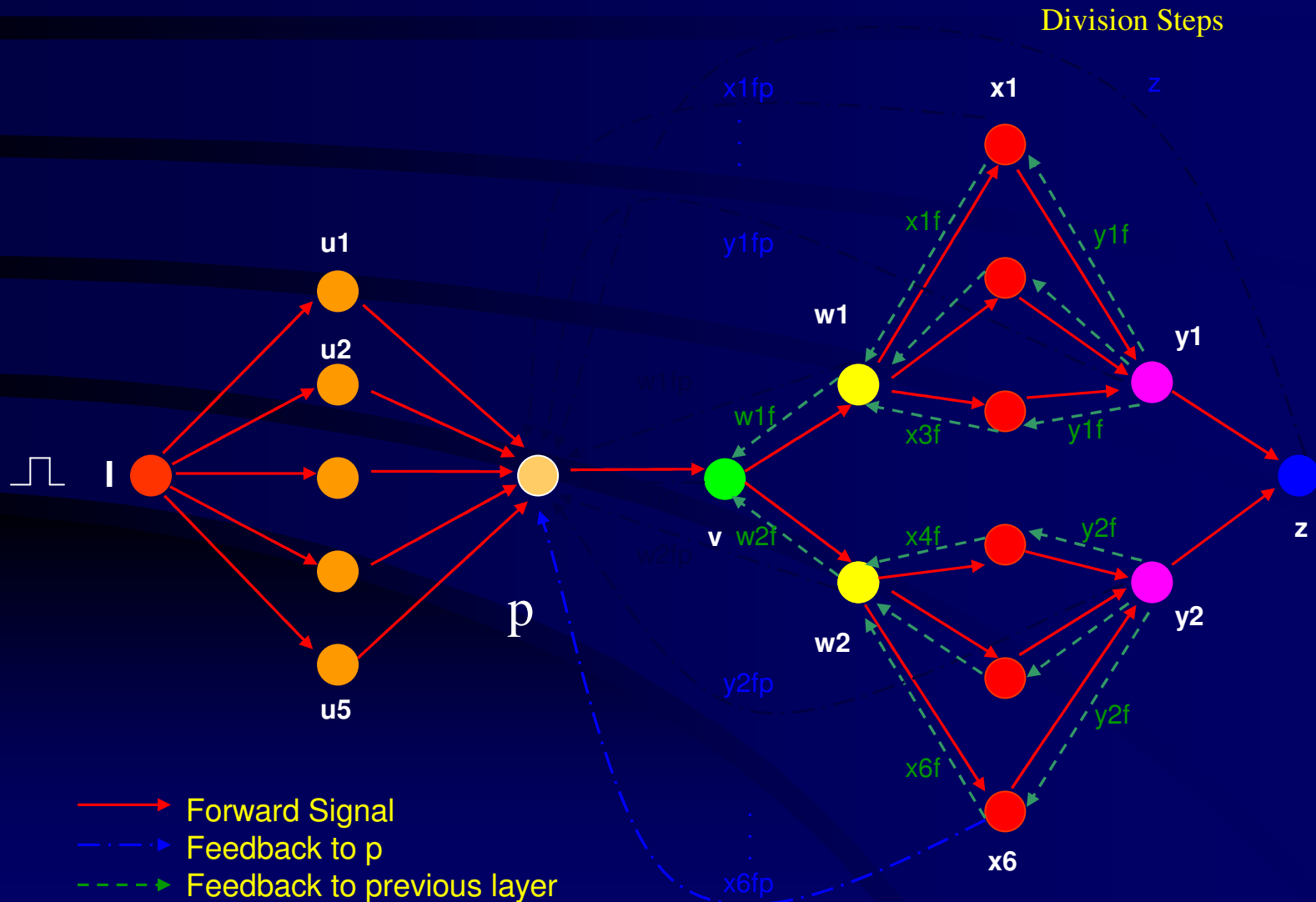




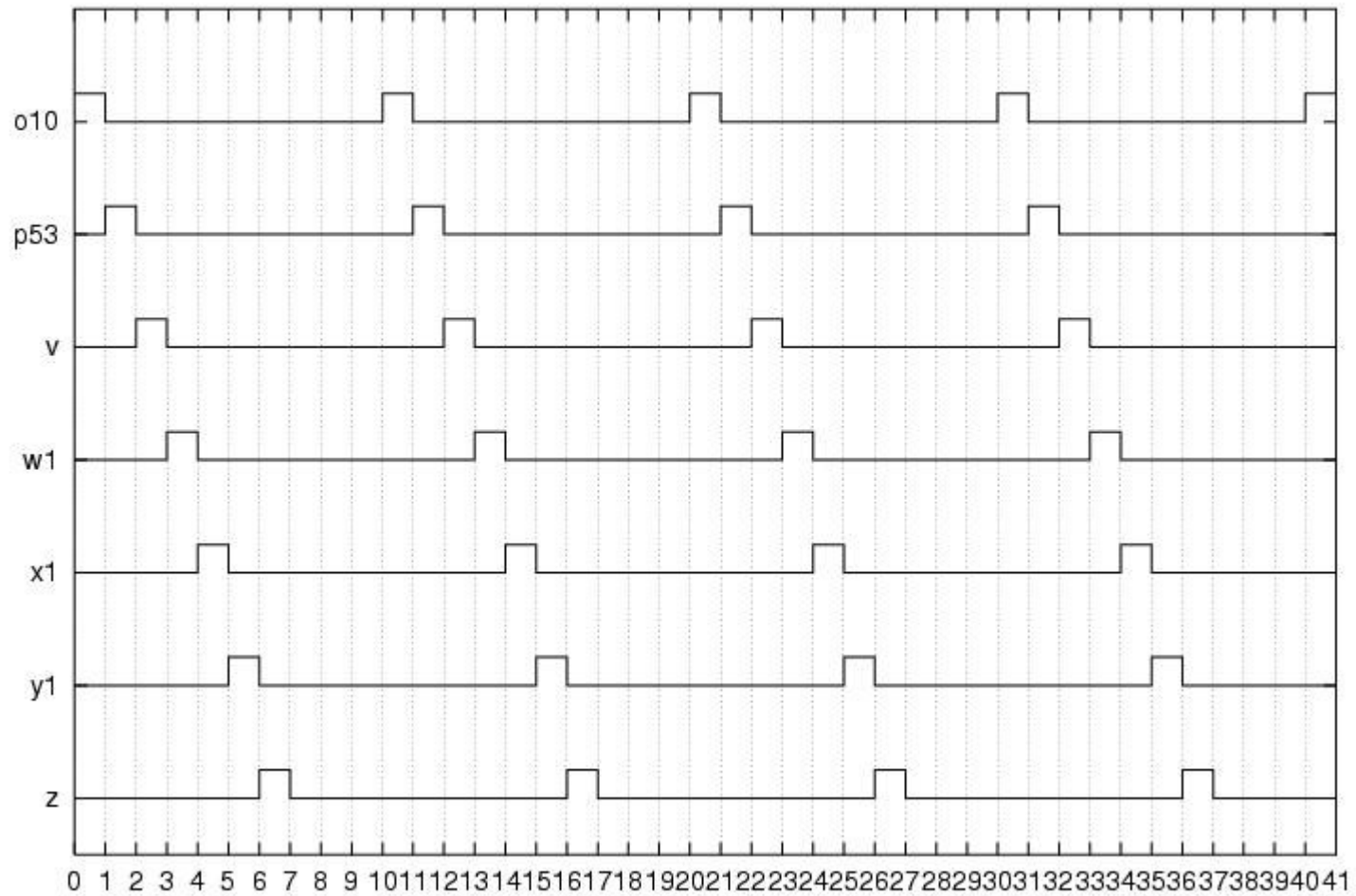
# Deterministic System



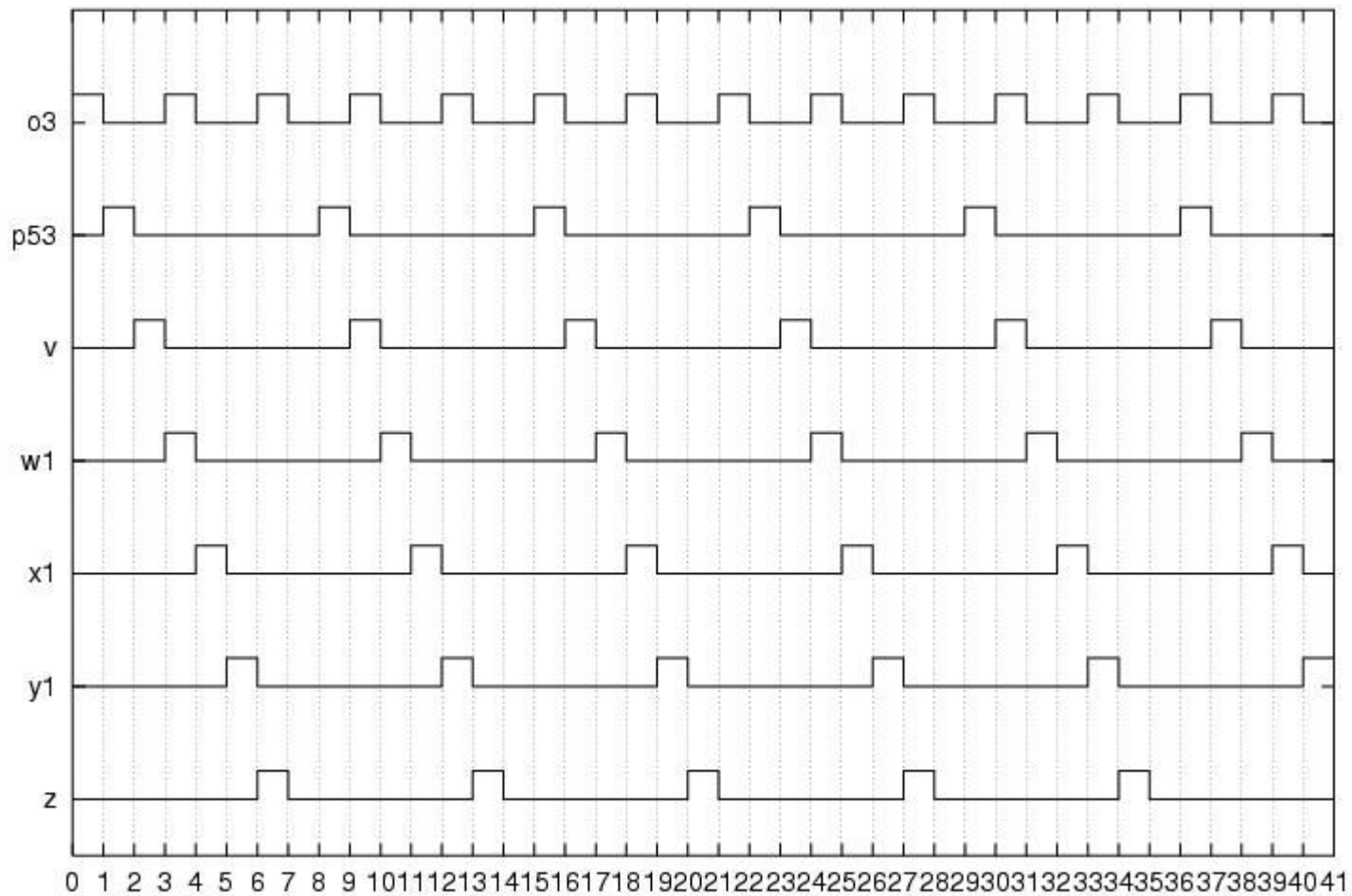
# Cell Cycle Modeling



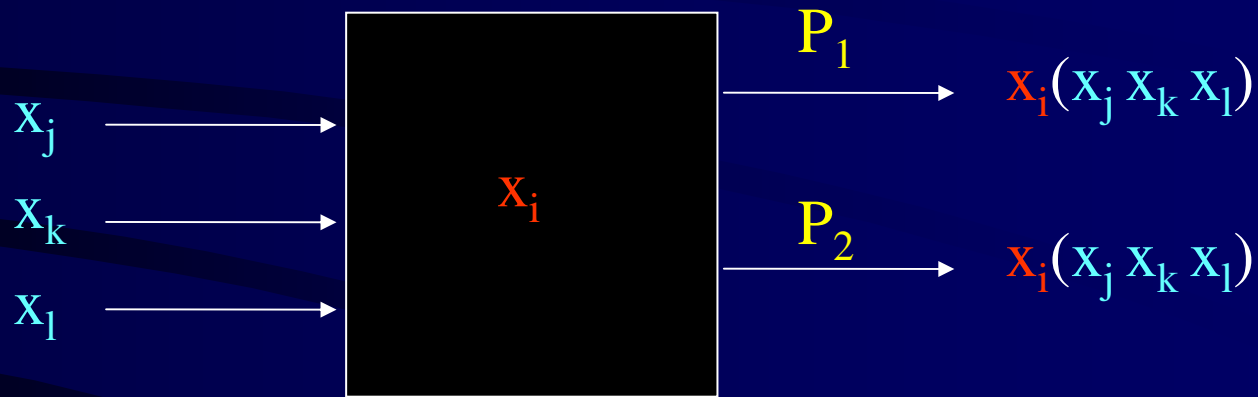
Oscilador de Período 10: FUNCIONAMENTO GERAL (parte\_B-t4A-o10.sim)



Oscilador de Período 3: FUNCIONAMENTO GERAL (parte\_B-t4A-o3.sim)



# Stochastic System



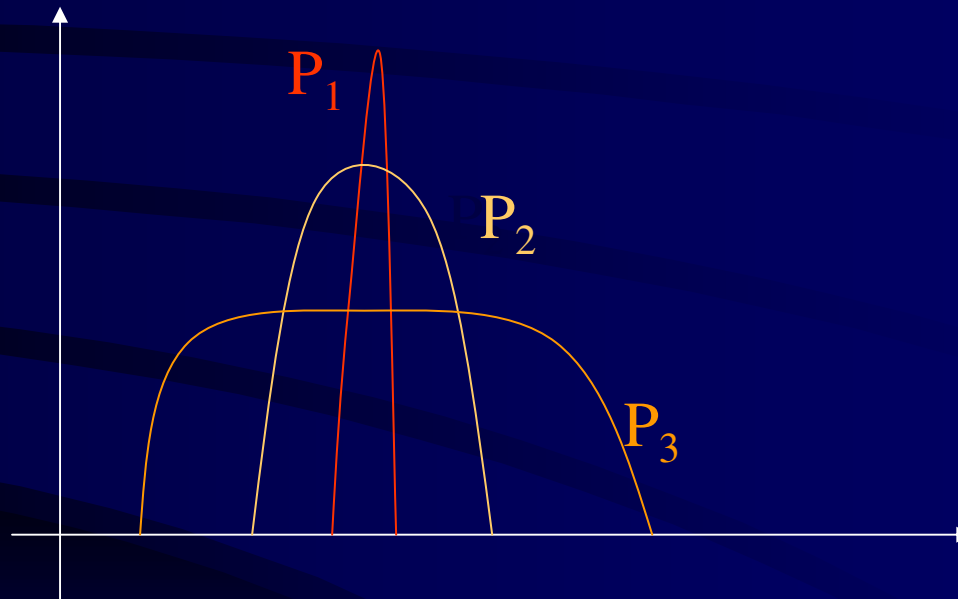
$$P_1 + P_2 = 1$$

Almost deterministic system:  $P_1 \gg P_2$

# System Identification

# Entropy

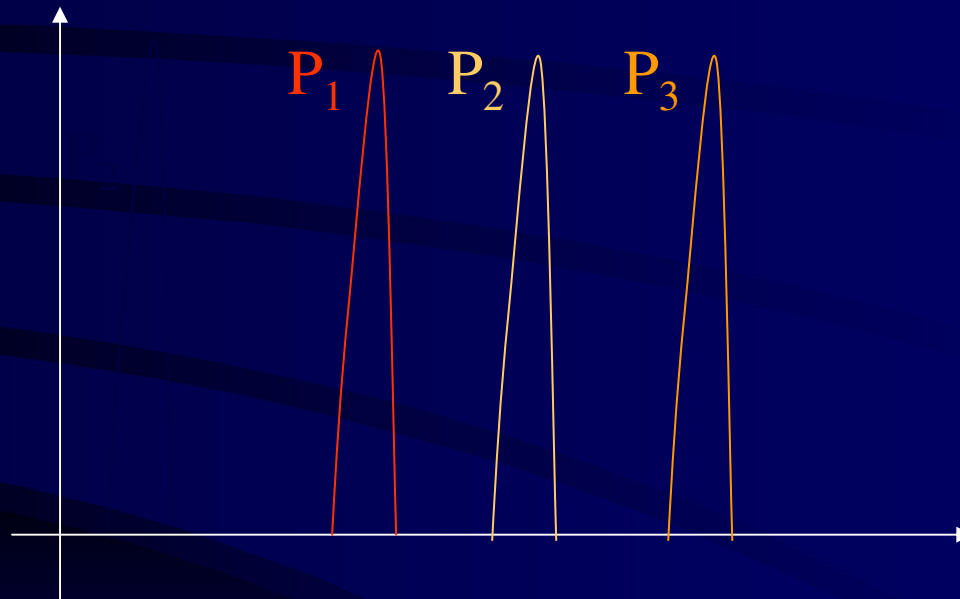
$$H(P) = -\sum p_i \log p_i$$



$$H(P_1) < H(P_2) < H(P_3)$$

# Entropy

$$H(P) = -\sum p_i \log p_i$$

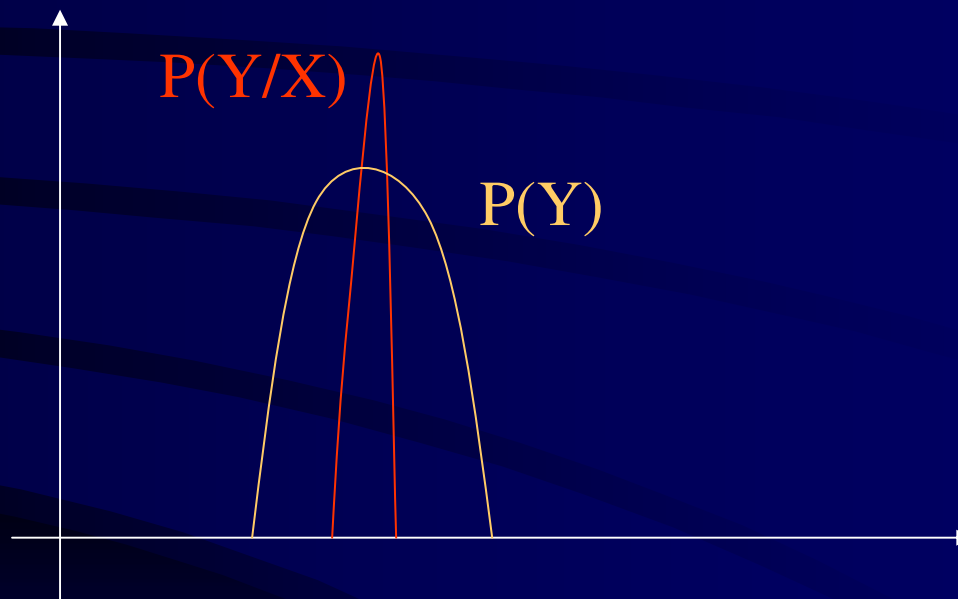


$$H(P_1) = H(P_2) = H(P_3)$$



## Mutual information

$$I(X, Y) = H(Y) - H(Y / X)$$



$$H(Y/X) < H(Y)$$

## Mean conditional entropy

$$E[H(Y / X)] = -\sum P(X) \sum P(Y / X) \cdot \log(P(Y / X)).$$

## Mean mutual information

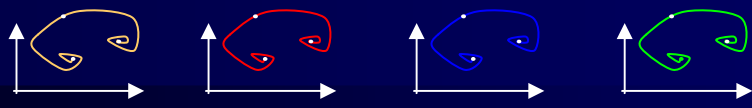
$$E[I(X, Y)] = H(Y) - E[H(Y / X)]$$

## Mean mutual information estimation

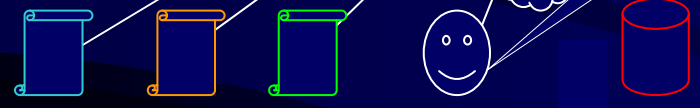
$$\hat{E}[H(Y / X)] = -\sum \hat{P}(X) \sum \hat{P}(Y / X) \log(\hat{P}(Y / X)).$$

$$\hat{E}[I(X, Y)] = \hat{H}(Y) - \hat{E}[H(Y / X)]$$

# Knowledge discovery in Biology

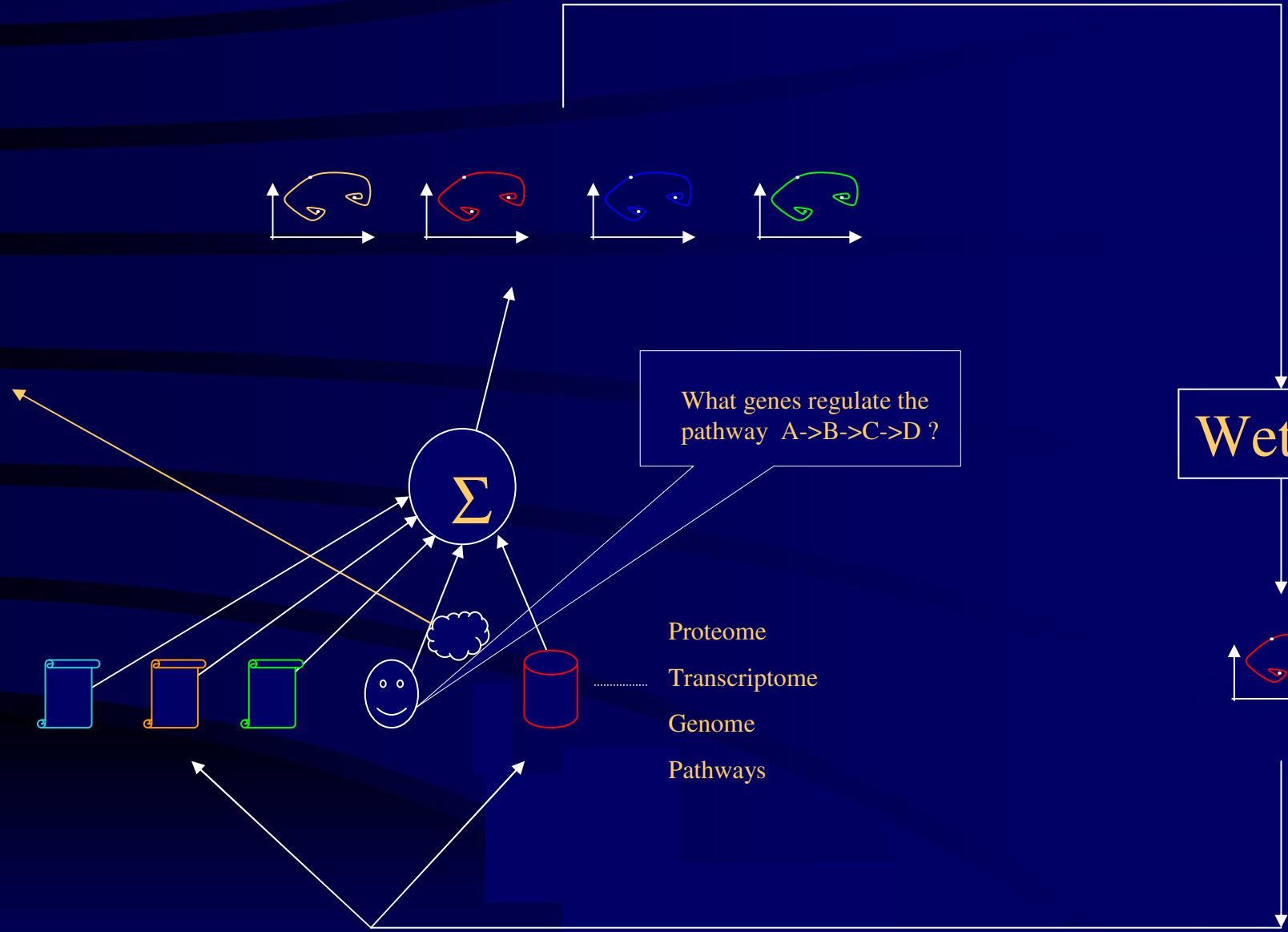
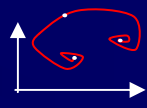


What genes regulate the pathway A->B->C->D ?



- Proteome
- Transcriptome
- Genome
- Pathways

Wet Lab



# The life cycle of the malaria parasite

