

# Discrete time piecewise affine models of gene regulatory networks

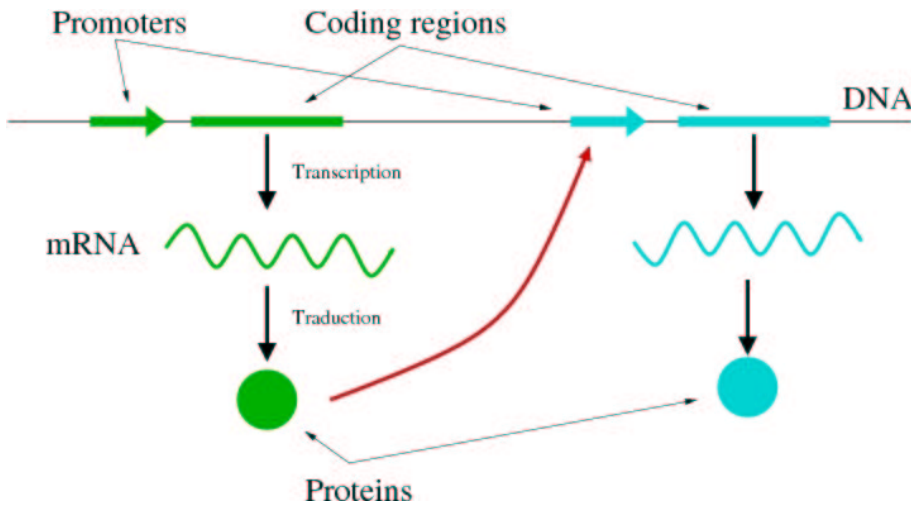
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with **R. Coutinho, R. Lima and A. Meyroneinc**

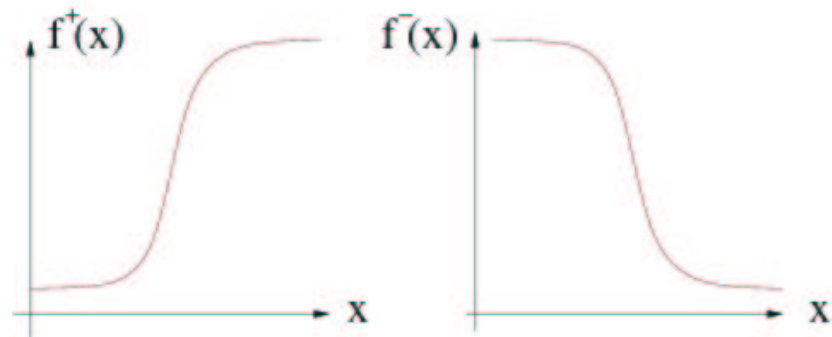
## Principles and modelling of gene regulation



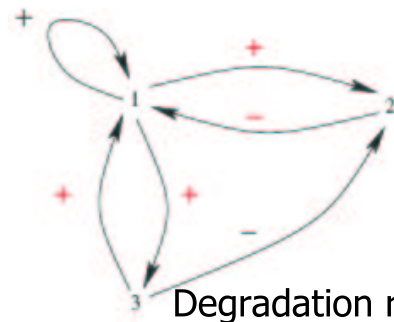
### Dynamics:

- **Expression level** =  $x_i$  in  $[0,1]$
- **Interaction:** [+ = Activation, - = Inhibition] + threshold

$$d_t x_B = -x_B + f^s(x_A) + \dots$$



## Gene regulatory networks

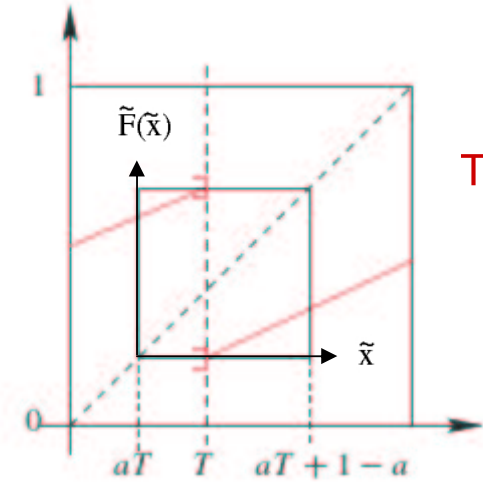


Weight [positive and normalized]      Sign in  $\{+,-\}$       Threshold in  $[0,1]$

$$x_i^{t+1} = ax_i^t + (1-a) \sum_{j \in I(i)} K_{ij} H(s_{ij}(x_j^t - T_{ij})), \quad i = 1, N$$

Degradation rate  $a$  in  $[0,1)$       Set of genes with action over  $i$       Heaviside function

# Self-inhibitor $F(x) = ax + (1-a)H(T-x)$

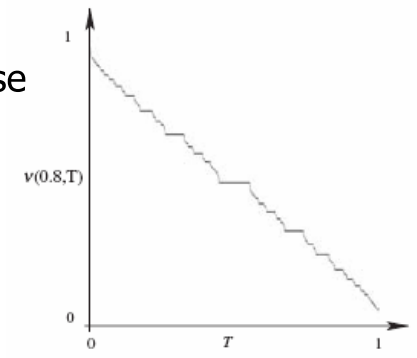


$\phi : \mathbb{R} \rightarrow [0, 1]$  is 1-periodic rotation number  $\nu \in [0, 1)$

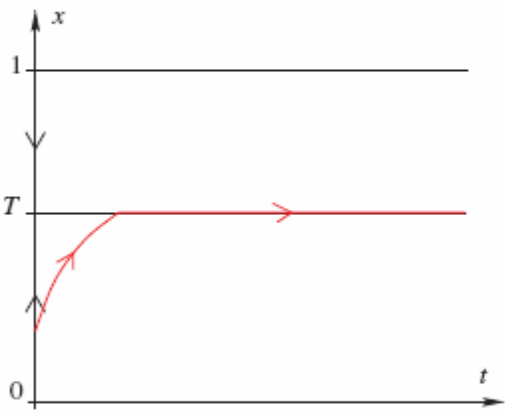
Thm:  $\lim_{t \rightarrow +\infty} (\tilde{F}^t(\tilde{x}) - \phi(\nu t + \alpha)) = 0$  for all  $\tilde{x} \in (0, 1)$

$T \mapsto \nu(a, T)$  = decreasing Devil's staircase

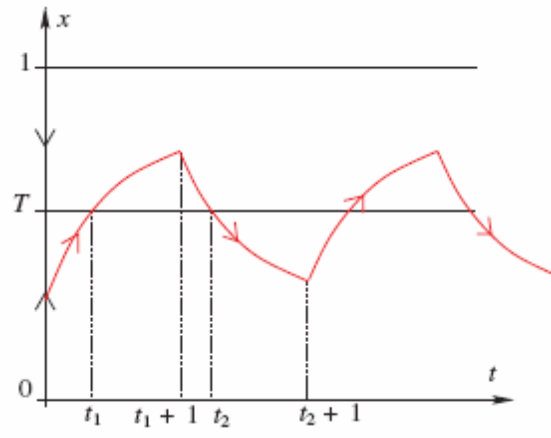
Biological relevance: Permanent oscillations with frequency mode-locking



## Origin of oscillations: Delays

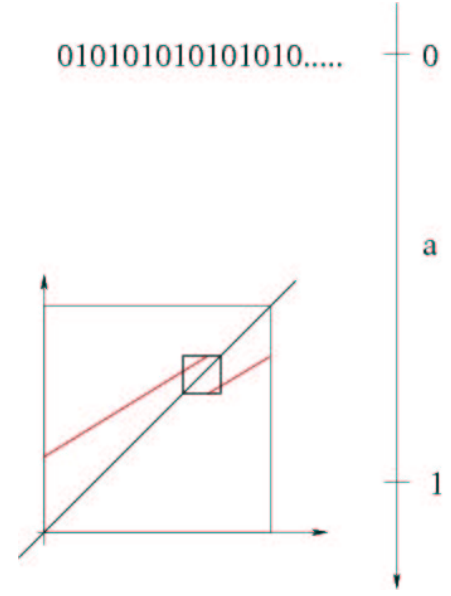


$$\frac{dx}{dt} = -x(t) + H(T - x(t))$$

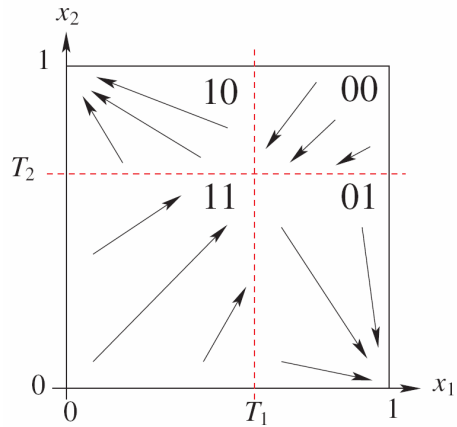
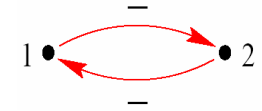


$$\frac{dx}{dt} = -x(t) + H(T - x(t-1))$$

« a = delay parameter »



# Two mutually inhibiting interactions [Positive circuit]



$$\begin{cases} x_1^{t+1} = ax_1^t + (1-a)H(T_2 - x_2^t) \\ x_2^{t+1} = ax_2^t + (1-a)H(T_1 - x_1^t) \end{cases}$$



- either the orbit visits only 00 and 11
- or it converges either to (0,1) [when in 10] or to (1,0) [when in 01]

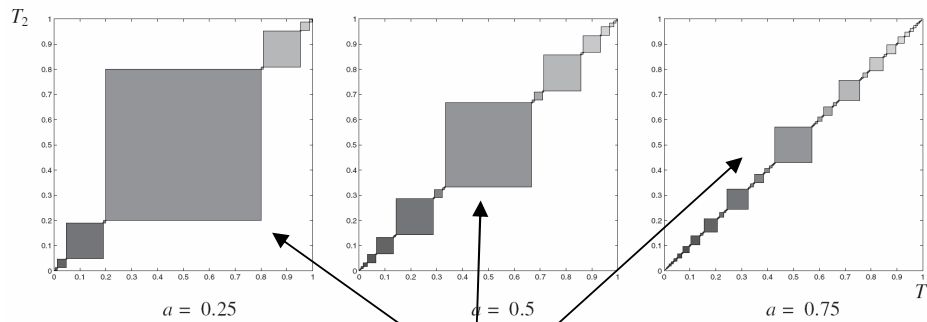
## Existence of orbit visiting only 00 and 11 ?

Yes, depending on parameters

Asymptotically, we have  $x^t = x_1^t = x_2^t$  and  $x^{t+1} = ax^t + (1-a)H(T_1 - x^t) = ax^t + (1-a)H(T_2 - x^t)$

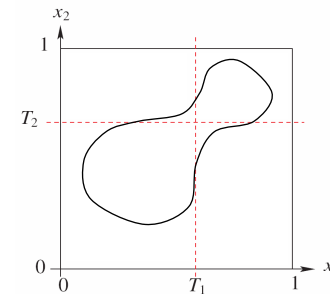
**[Self-inhibitor:**  $x^t$  attracted by a unique (quasi)-periodic orbit with rotation number  $\nu$  ]

## Existence domains of (quasi)-periodic orbits



$\nu = 1/2$

## Origin of permanent oscillations

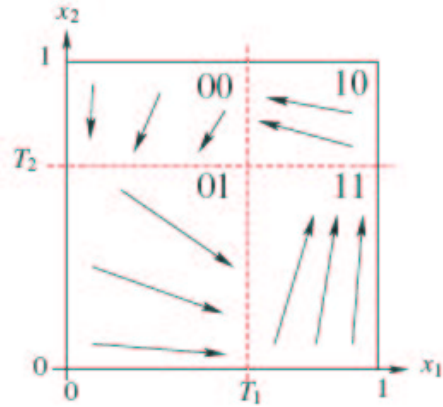
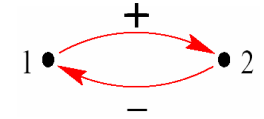


(possible) trajectory in a system of coupled differential equations with **delays**

# Negative circuit of two genes

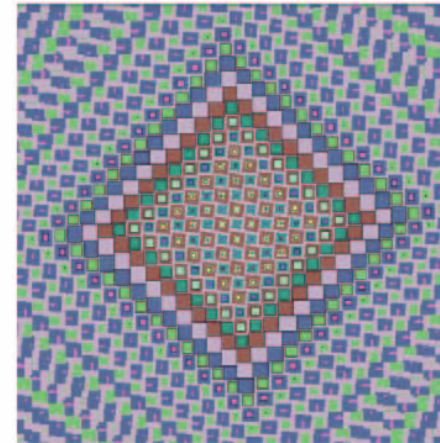
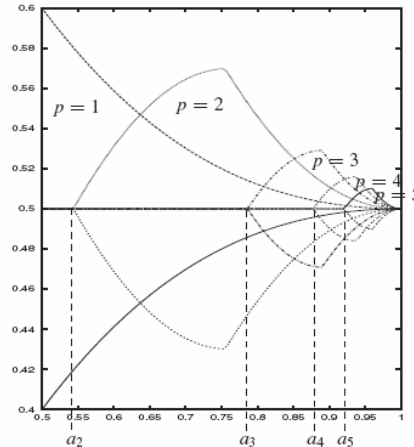
$$x_i^t = (1 - a) \sum_{k=0}^{\infty} a^k \theta_{3-i}^{t-k-1} \text{ for all } t \in \mathbb{Z}, i = 1, 2.$$

Symbolic dynamics

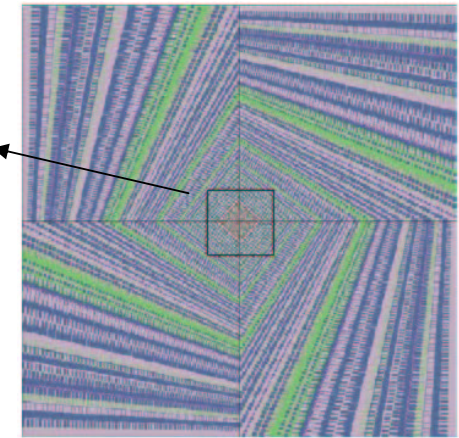


## 1/ Balanced orbits

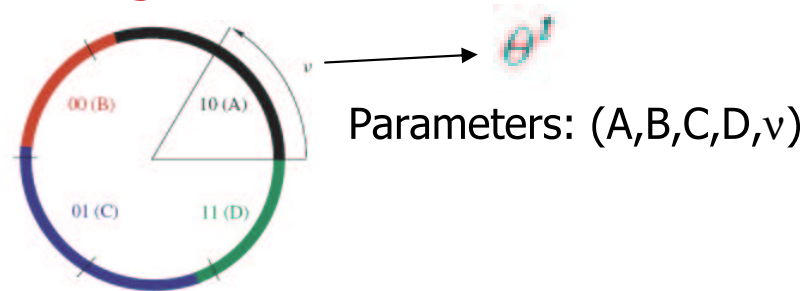
$\theta^t = (00^p 01^p 11^p 10^p)^\infty$  exists iff  $(T_1, T_2) \in [T_p(a), 1 - T_p(a)]^2$



Ex:  $a = 0.99 > a_{14}$

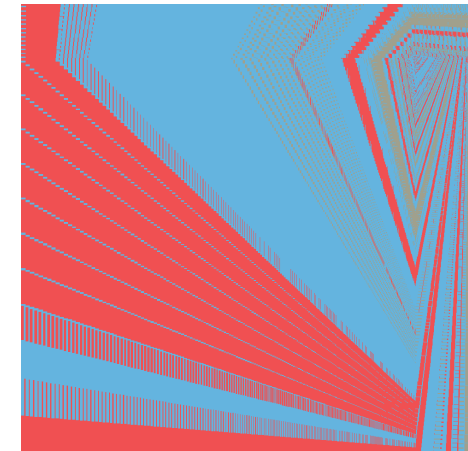
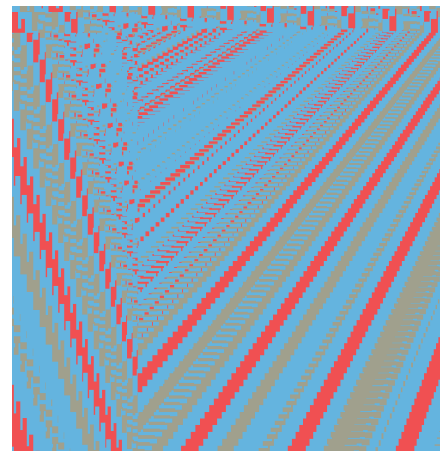


## 2/ Regular orbits



$$T_1 = T_2 = 1/2$$

Ex2:  $T_1 = T_2 = 0.88$

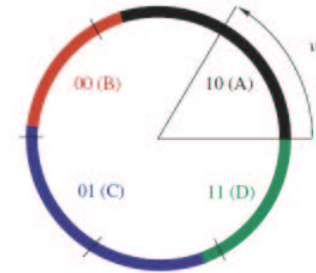


Analysis of a family of regular orbits:

- $(A, B, C, D, v)$  such that
- 1 point/lap in 10 and 00
- p points/lap in 01
- p points/lap in 11

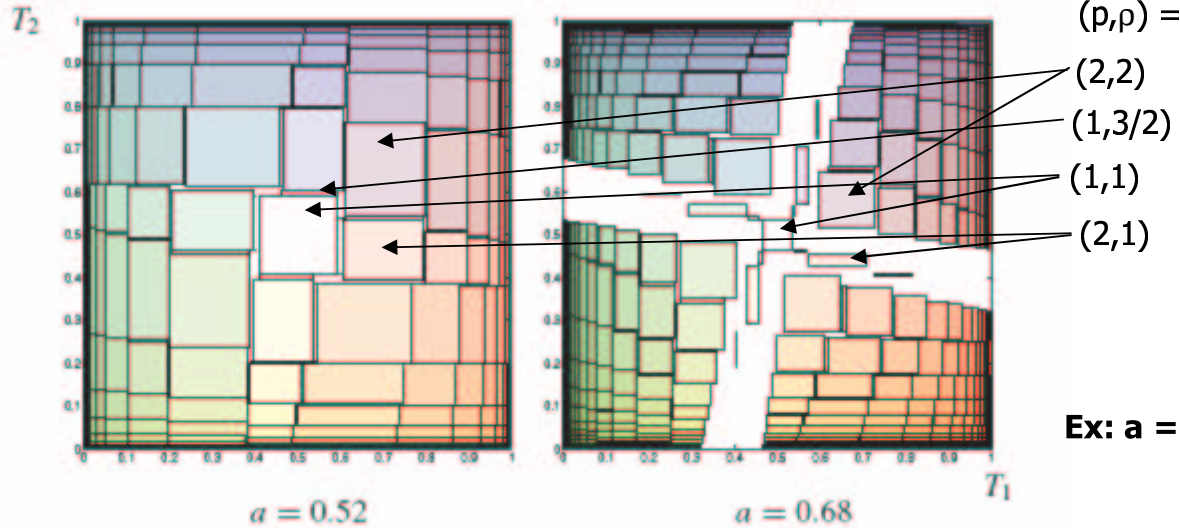
## Existence and uniqueness of regular orbits

with  $(A,B,C,D,v)$  s.t. 1 pt/lap in 10 and 00,  $p$  pts/lap in 01,  $\rho$  pts/lap in 11



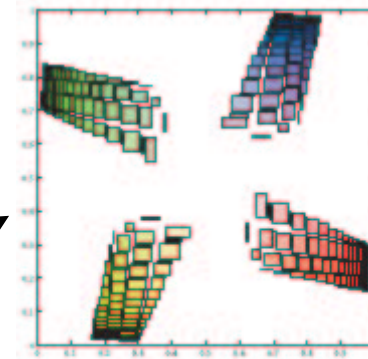
$a_c \sim 0.544$

**Theorem 4.1.** (Families of regular orbits and their parameter dependence. Simple case) *The  $(p, \rho)$ -regular orbit exists iff  $(T_1, T_2)$  belongs to a unique rectangle  $I_1(a, p, \rho) \times I_2(a, p, \rho)$  which exists for every  $p \geq 1$  and  $\rho \geq 1$  provided that  $a \in (0, a_c]$ .*



**Proposition:** When  $a > a_c$ , existence for  $p > p(a)$  and  $\rho > \rho(a, p)$ .

Ex:  $a = 0.842$



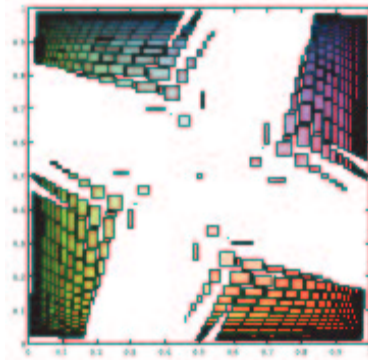
$n_A = 2$  and  $n_C = 2, 6$

**Regular orbits** with  $n_A$  pt/lap in 10,  $n_B$  pt/lap in 00,  $n_C$  pt/lap in 01,  $\rho$  pts/lap in 11

**Theorem 4.3.** (Families of regular orbits and their parameter dependence. General case) *Let  $n_A \geq 1$  and  $n_C \geq 1$  be arbitrary integers.*

*The  $(n_A, n_B, n_C, \rho)$ -regular orbit can exist – upon a suitable choice of the parameters  $(a, T_1, T_2)$  – for any  $\rho$  in an interval of the form  $(\rho_c, \infty)$  only if  $n_B = 1$ .*

*The  $(n_A, 1, n_C, \rho)$ -regular orbit exists iff  $(T_1, T_2)$  belongs to a unique rectangle  $I_1(a, n_A, n_C, \rho) \times I_2(a, n_A, n_C, \rho)$  which exists provided that  $a \in [\underline{a}_{n_A, n_C}, \bar{a}_{n_A, n_C}]$  and that  $\rho$  is larger than a critical value (say  $\rho \geq \rho_{a, n_A, n_C}$ ). The numbers  $\underline{a}_{n_A, n_C}$  and  $\bar{a}_{n_A, n_C}$  are known explicitly.*



$n_A = 1$  and  $n_C = 1, 20$

**Open problems:** Other regular orbits, non regular orbits, complete description ( $a < 1/2$ )