

Reachability of singular states in Thomas-Snoussi networks

Eric Fanchon

Institut de Biologie Structurale,
Grenoble

GeoCal, feb. 2006

Outline

1. Presentation of multivalued asynchronous (Thomas-Snoussi) networks
2. Results
 - Generalization of Snoussi's theorem
 - Generalization of the 'circuit analysis'
 - Determine the class of singular states which are potentially reachable → reduction of complexity

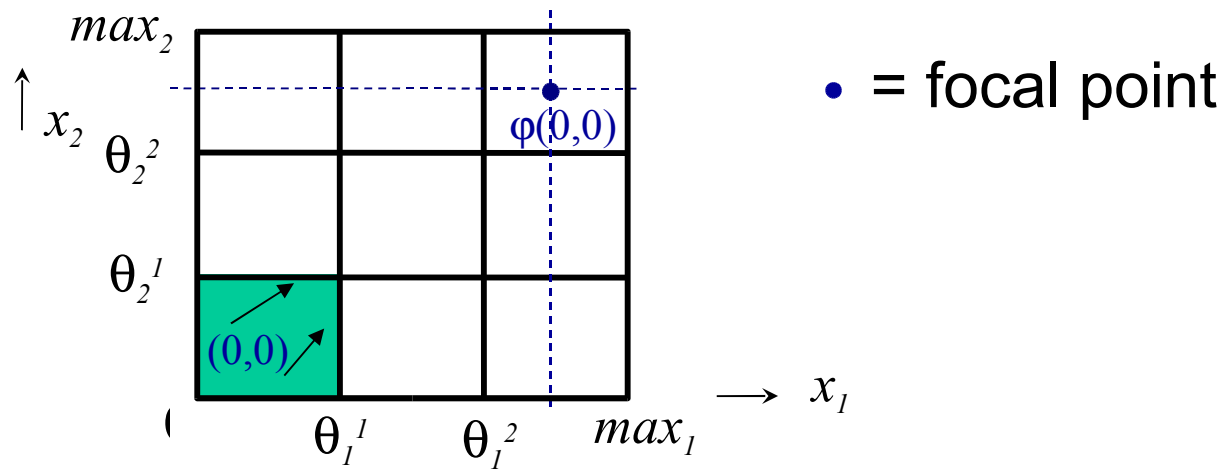
Piecewise-affine systems

$$dx_i/dt = f_i(\mathbf{x}) - \gamma_i x_i \quad \text{with } \gamma_i > 0$$

Rectangular partition

In each regular domain D , the system tends **monotonically** to a focal point $\varphi(D)$.

Phase portrait : determined by the distribution of **focal points**



Focal point equations

2d example with two thresholds on each axis :

$$\dot{x}_1 = \kappa_1 s(x_1, \theta_1^2) s(x_2, \theta_2^1) - \gamma_1 x_1 = 0$$

$$\dot{x}_2 = \kappa_2 s(x_1, \theta_1^1) s(x_2, \theta_2^2) - \gamma_2 x_2 = 0$$

s : step function

x : protein concentration

θ : threshold

κ, γ : kinetic constants

Focal point equations :

$$\varphi_1(\mathbf{x}) = K_1 s(x_1, \theta_1^2) s(x_2, \theta_2^1)$$

$$\varphi_2(\mathbf{x}) = K_2 s(x_1, \theta_1^1) s(x_2, \theta_2^2)$$

with $K_1 = \kappa_1/\gamma_1$ and $K_2 = \kappa_2/\gamma_2$

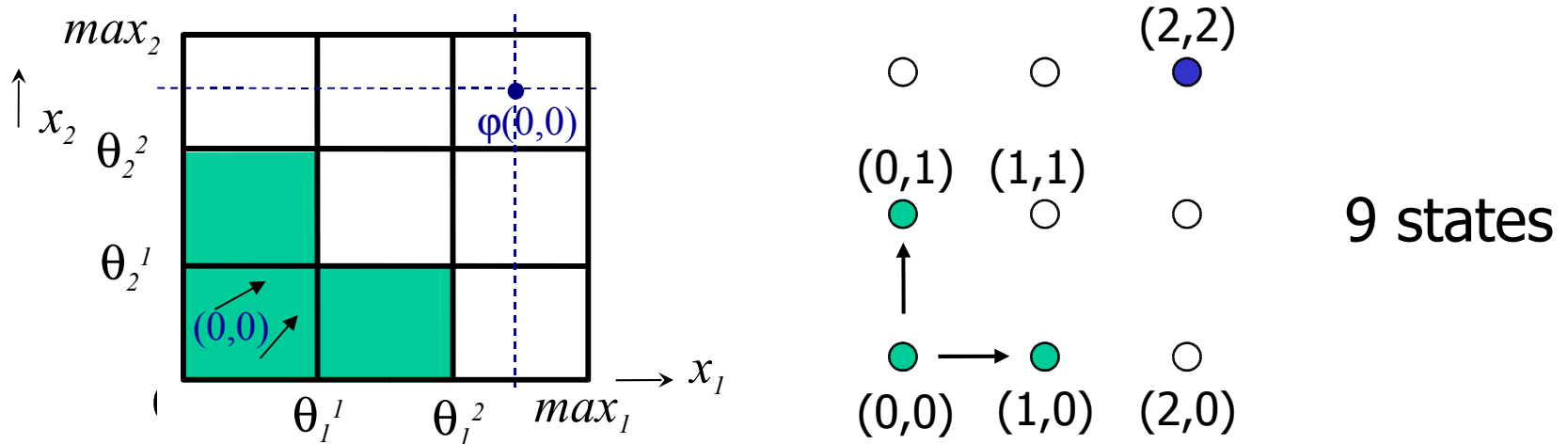
Focal point equations

$$\left\{ \begin{array}{l} \dots \\ \varphi_j(x) = g_j(s^\varepsilon(x_i, \theta_i), s^\varepsilon(x_r, \theta_r), \dots) \\ \varphi_k(x) = g_k(s^\varepsilon(x_i, \theta_i), \dots) \\ \dots \end{array} \right.$$

Discrete abstraction

Instantiation of the parameters
 → transition graph

Transition $D \rightarrow D'$: if \exists trajectory going from D to D' .



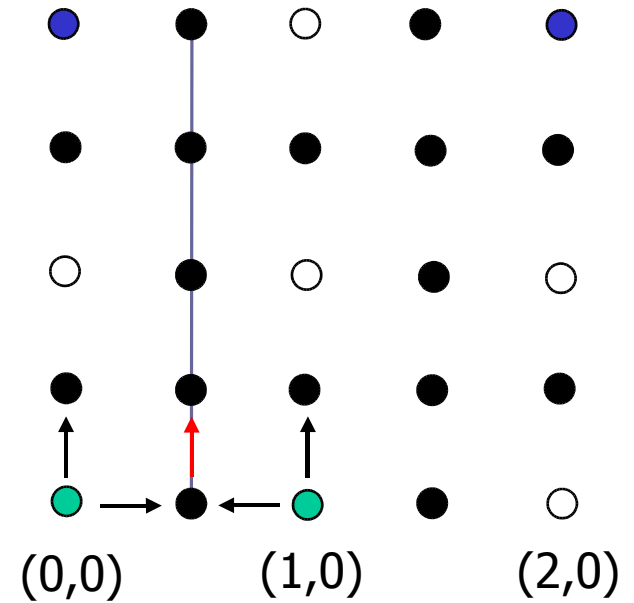
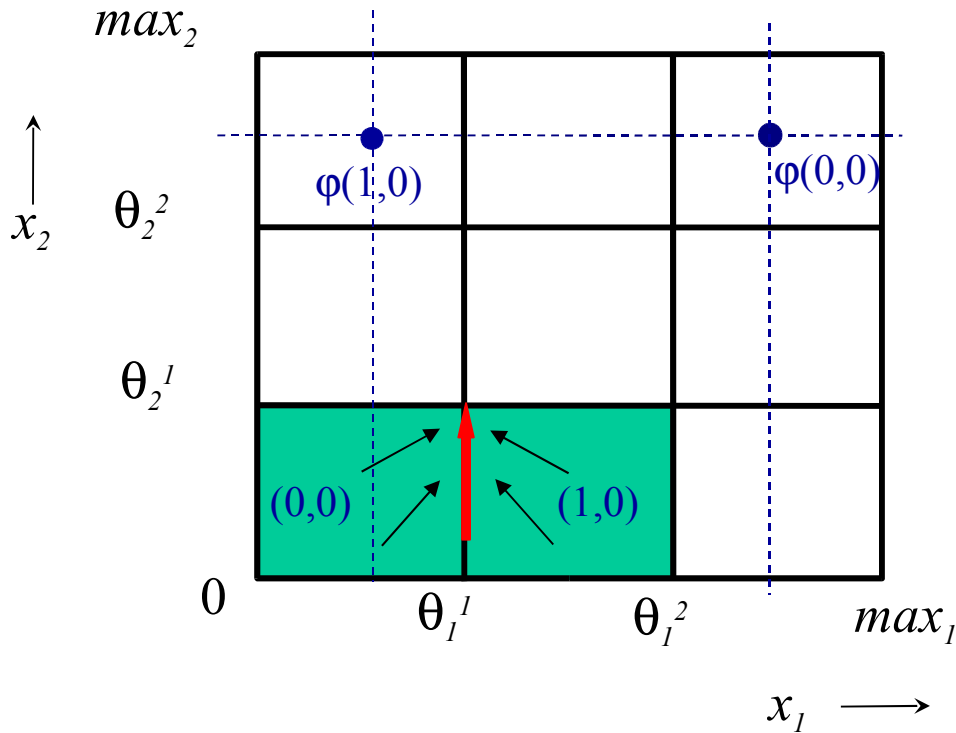
If the focal point of D is outside D : outgoing transition(s)
 Else : D is a (stable) stationary state.

Transition rule

State \mathbf{x}' is a successor of \mathbf{x} if :

- \mathbf{x}' is adjacent to \mathbf{x}
 \Rightarrow there exists at most one component i such that $x'_i \neq x_i$
- If $\varphi_i(\mathbf{x}) > x_i$: $x'_i = x_i + 1$
- If $\varphi_i(\mathbf{x}) < x_i$: $x'_i = x_i - 1$
- If $\varphi_i(\mathbf{x}) = x_i$: $x'_i = x_i$

Black wall



25 states

de Jong, Gouzé et al., Bull. Math. Biology, 66, 301 (2004)
 Sliding mode / [persistent state](#)

Singular states

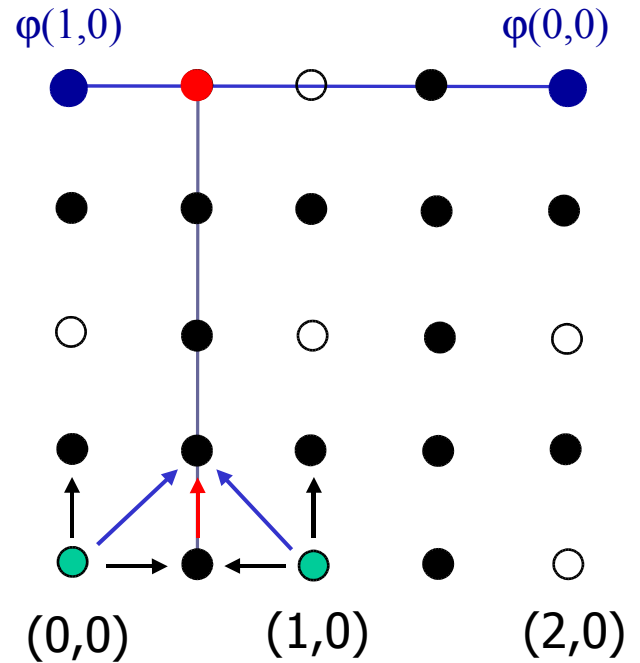
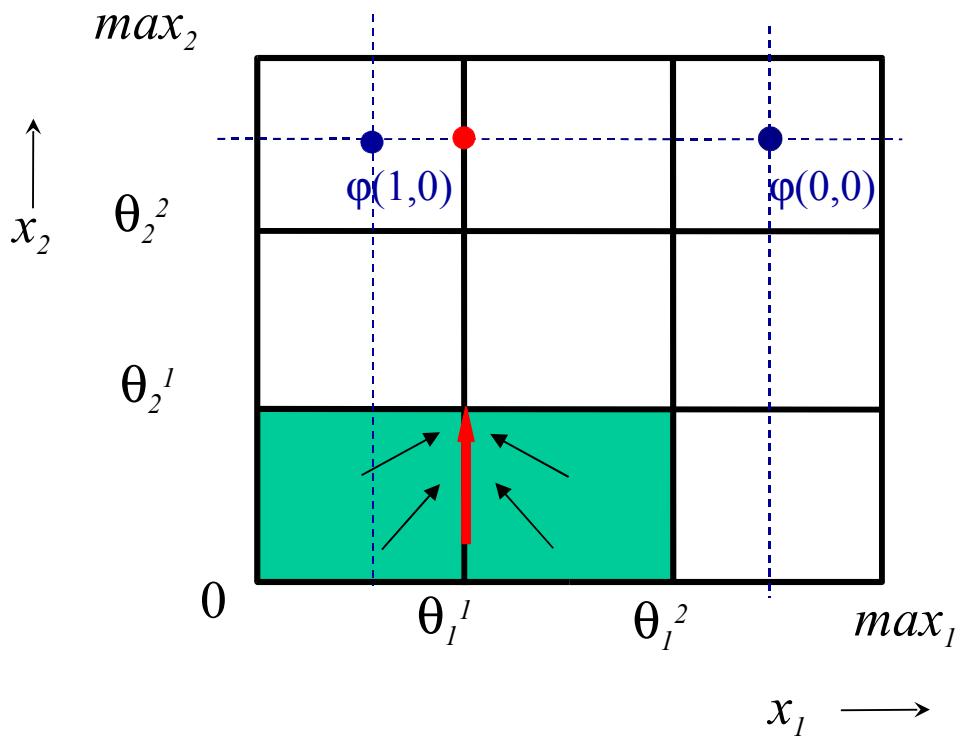
- **Order of a singular state** : number of state components equal to a threshold ($x_i = \theta_i$)

$$n=4: \quad \mathbf{x} = (1, \theta_2, 0, \theta_4) \quad \rightarrow \quad q(\mathbf{x})=2$$

- If n is the dimensionality of the system, the total number of states is increased by a factor α^n ,
 $1.5 < \alpha < 2$.

Ex: 4 thresholds per axis, $n=10$: $\alpha^n \approx 350$

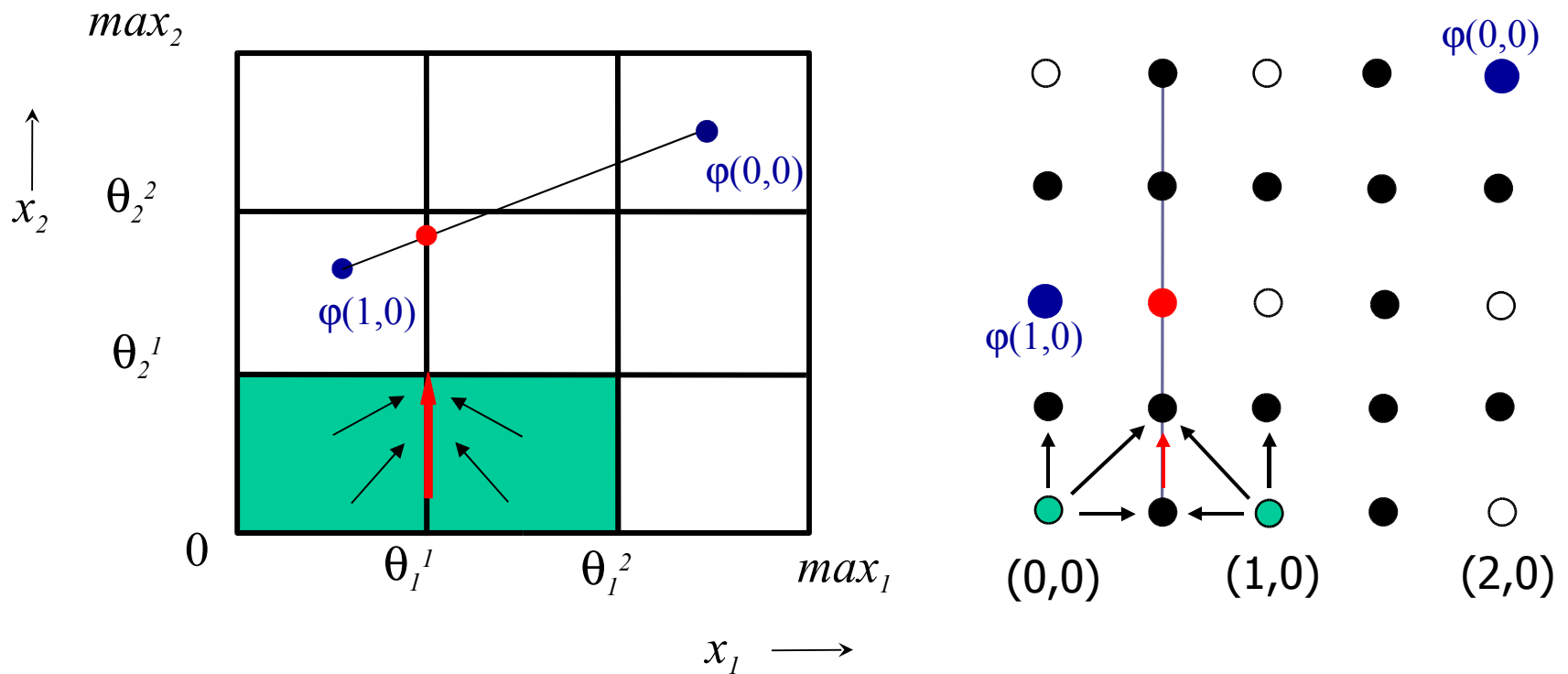
Formal (discrete) rule



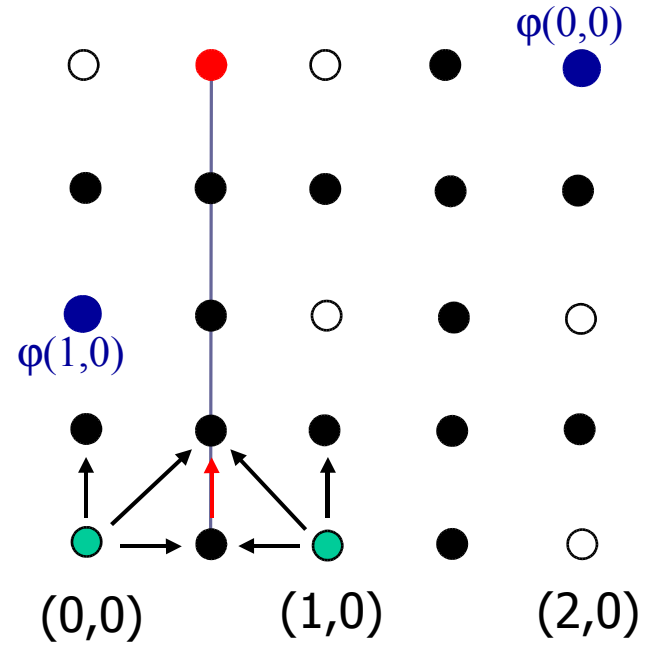
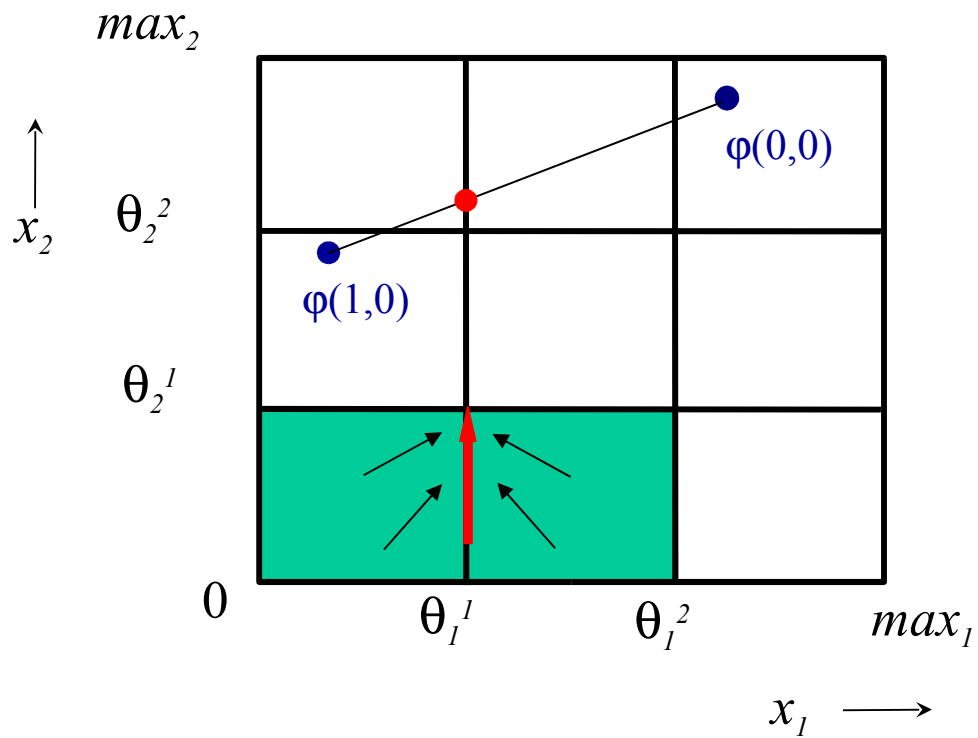
Derived from de Jong, Gouzé et al., Bull. Math. Biology, 66, 301 (2004)

Second abstraction

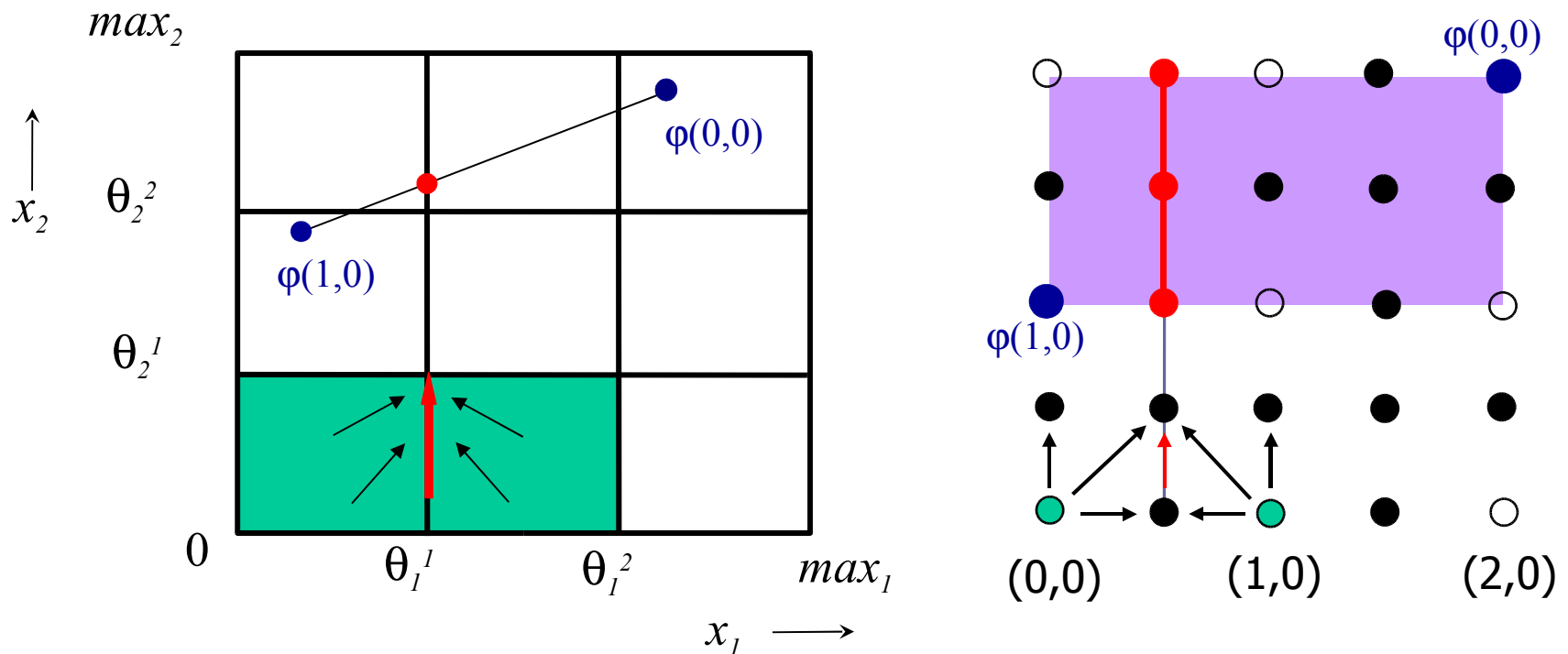
Discretization of the focal point coordinates



Second abstraction



Hyper-rectangular approximation



Superposition of the 3 possibilities

Derived from de Jong, Gouzé et al., Bull. Math. Biology, 66, 301 (2004)

Transition rules

Let \mathbf{x} be a state and \mathbf{x}' a state (adjacent to \mathbf{x}) of **lower** dimension (i.e. higher order)

Transition $\mathbf{x} \rightarrow \mathbf{x}'$ exists iff :

- The intersection of $\text{Rect}(\mathbf{x})$ and of the support of \mathbf{x} is non-empty (\mathbf{x} is **persistent**)
- Pour toute composante i qui est régulière dans \mathbf{x} et singulière dans \mathbf{x}' :
 - si $x'_i = x_i + \frac{1}{2}$: $\exists y \in \text{Reg}(\mathbf{x}), x_i < \varphi_i(\mathbf{y})$
 - si $x'_i = x_i - \frac{1}{2}$: $\exists y \in \text{Reg}(\mathbf{x}), x_i > \varphi_i(\mathbf{y})$

Transition graph

Nodes = domains (discrete states)

Arcs = all possible transitions between domains

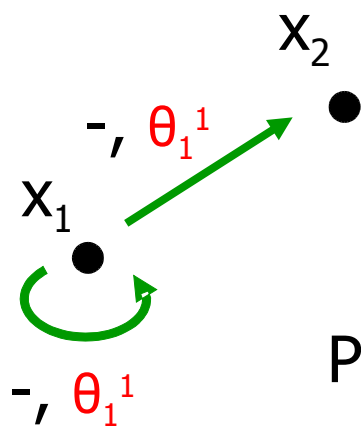
All continuous trajectories are represented by a **path** in the transition graph

The transition graph provides a qualitative view of the phase portrait

Part 2 : General properties

- Generalization of Snoussi's theorem
- Consequences of threshold multiplicities greater than 1
- Generalization of the 'circuit analysis'

Local influence graph



$$\varphi_1(\mathbf{x}) = K_1 (1 - s^+(x_1, \theta_1^1) s^+(x_2, \theta_2^1))$$

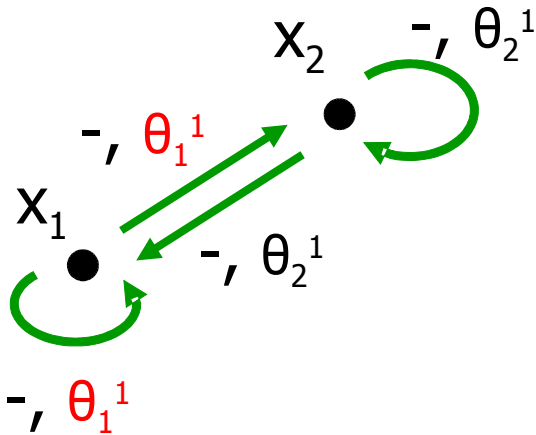
$$\varphi_2(\mathbf{x}) = K_2 (1 - s^+(x_1, \theta_1^1) s^+(x_2, \theta_2^1))$$

Partial graph associated to $(\theta_1^1, 1)$

Jacobian matrix of $\Phi(\mathbf{x})$: $a_{ij} = \partial\Phi_i/\partial x_j \neq 0$ iff j influences i

→ Every singular state \mathbf{x} is associated to a local graph $G(\mathbf{x})$

Global influence graph



$$\varphi_1(\mathbf{x}) = K_1 (1 - s^+(x_1, \theta_1^1) s^+(x_2, \theta_2^1))$$

$$\varphi_2(\mathbf{x}) = K_2 (1 - s^+(x_1, \theta_1^1) s^+(x_2, \theta_2^1))$$

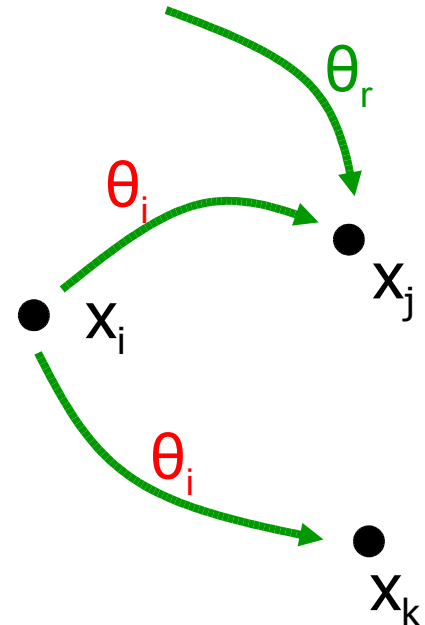
One step function \rightarrow one arc

Each arc represents a derivative $\partial\Phi_i/\partial x_j$

Threshold multiplicity

- Definition:
multiplicity of threshold θ_i = number of arcs labelled with θ_i .
- Ex: two genes belonging to the **same operon**

$$\left\{ \begin{array}{l} \dots \\ \varphi_j(\mathbf{x}) = f_j(s^\varepsilon(x_i, \theta_i), s^\varepsilon(x_r, \theta_r), \dots) \\ \varphi_k(\mathbf{x}) = f_k(s^\varepsilon(x_i, \theta_i), \dots) \\ \dots \end{array} \right.$$



Link joining the 2 focal points is a slanted segment in the plane (x_j, x_k)

$\text{mult}(\theta_i) = m$: m components of focal points may change when θ_i is crossed

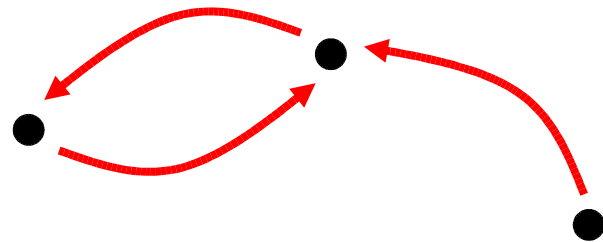
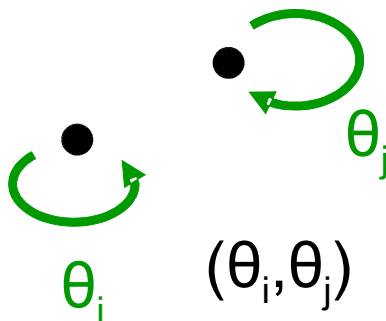
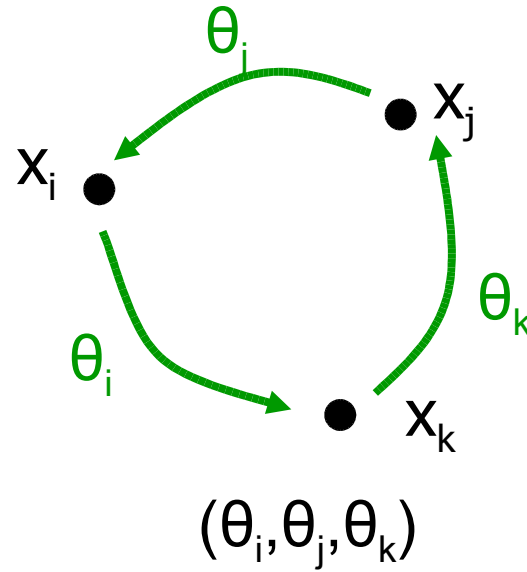
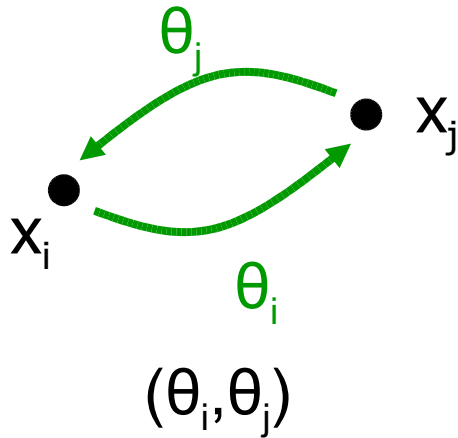
Snoussi's theorem

Snoussi & Thomas, Bull. Math. Biol., 55, 973 (1993)

- Two restrictions:
 - Additive systems :
$$f_i(\mathbf{x}) = k_{i0} + \sum k_{ij} \sigma^{\pm(ij)}(x_j, \theta_{ij})$$
 - All the thresholds have multiplicity = 1
- Let x be a singular state
 x **persistent** $\Rightarrow G(x)$ is a **hooping**

Hooping : circuit or union of **disjoint** circuits (C. Soulé)

(counter-) examples of hoopings

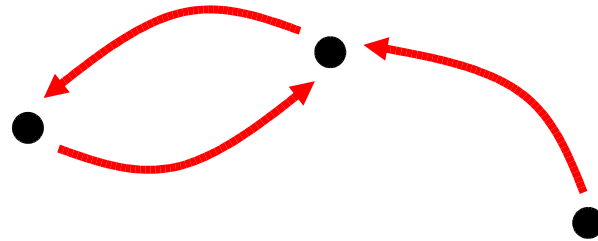
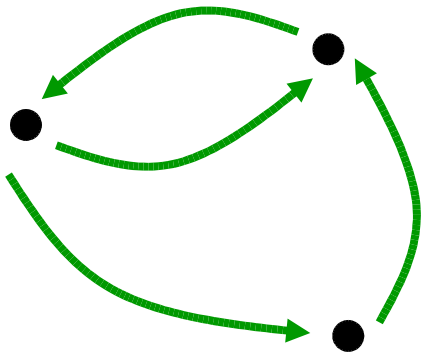
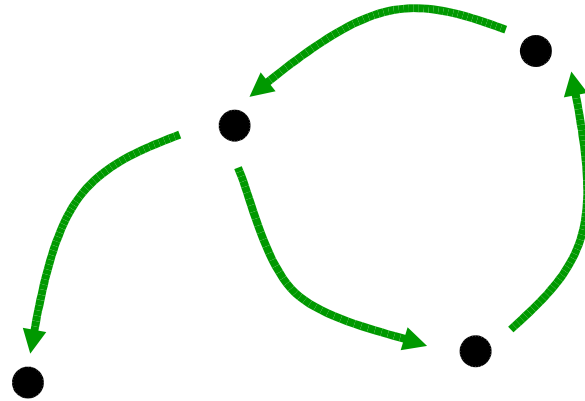
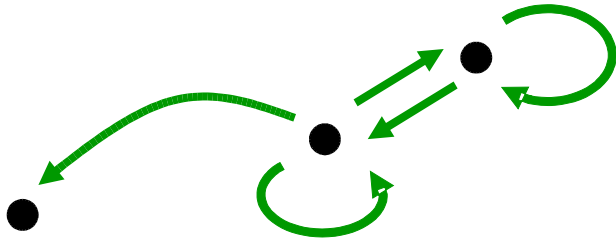


(1) Generalization of Snoussi

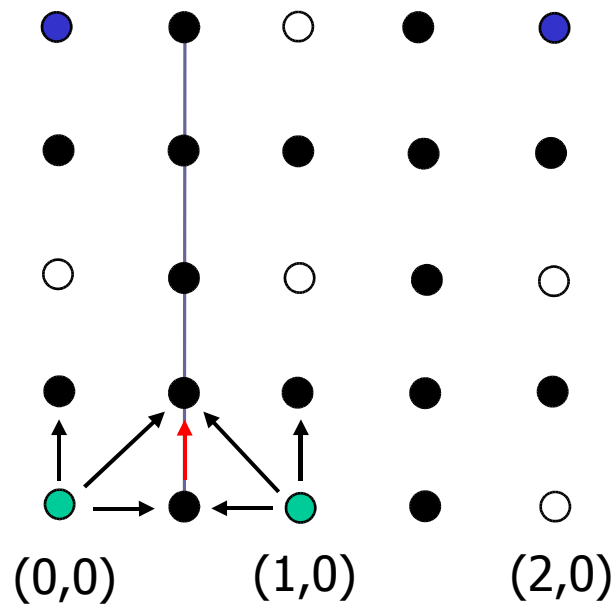
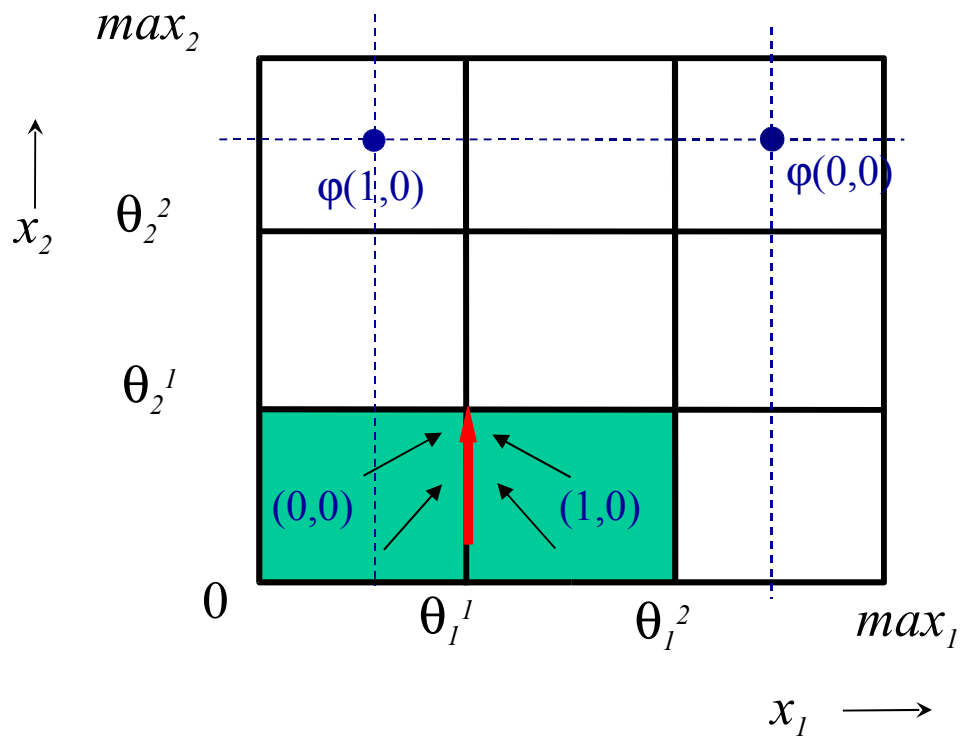
- General validity :
 - Additive or non-additive regulation functions
 - Thresholds of any multiplicity

$$\mathbf{x} \text{ persistent} \Rightarrow \text{indegree}(G(\mathbf{x})) > 0$$

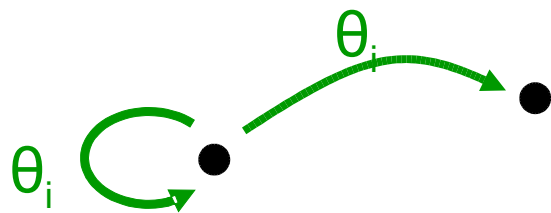
(counter-) examples



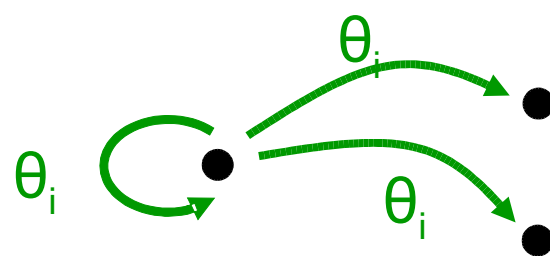
$q = 1$



or



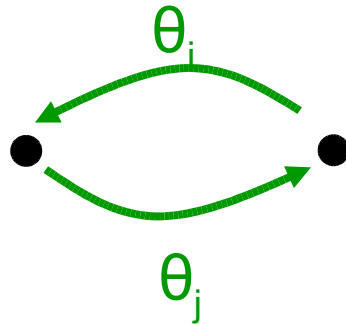
or



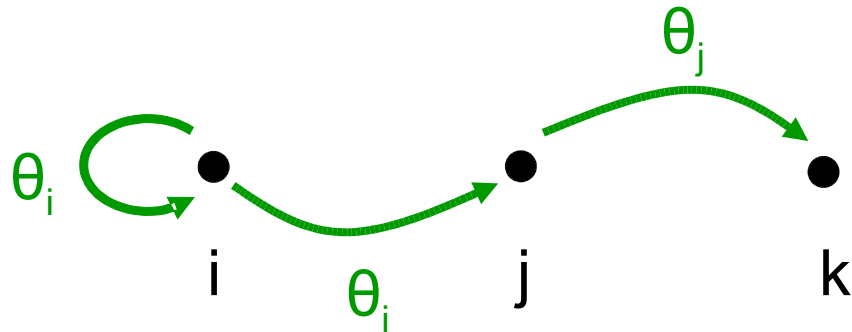
$q = 2$



Hooping

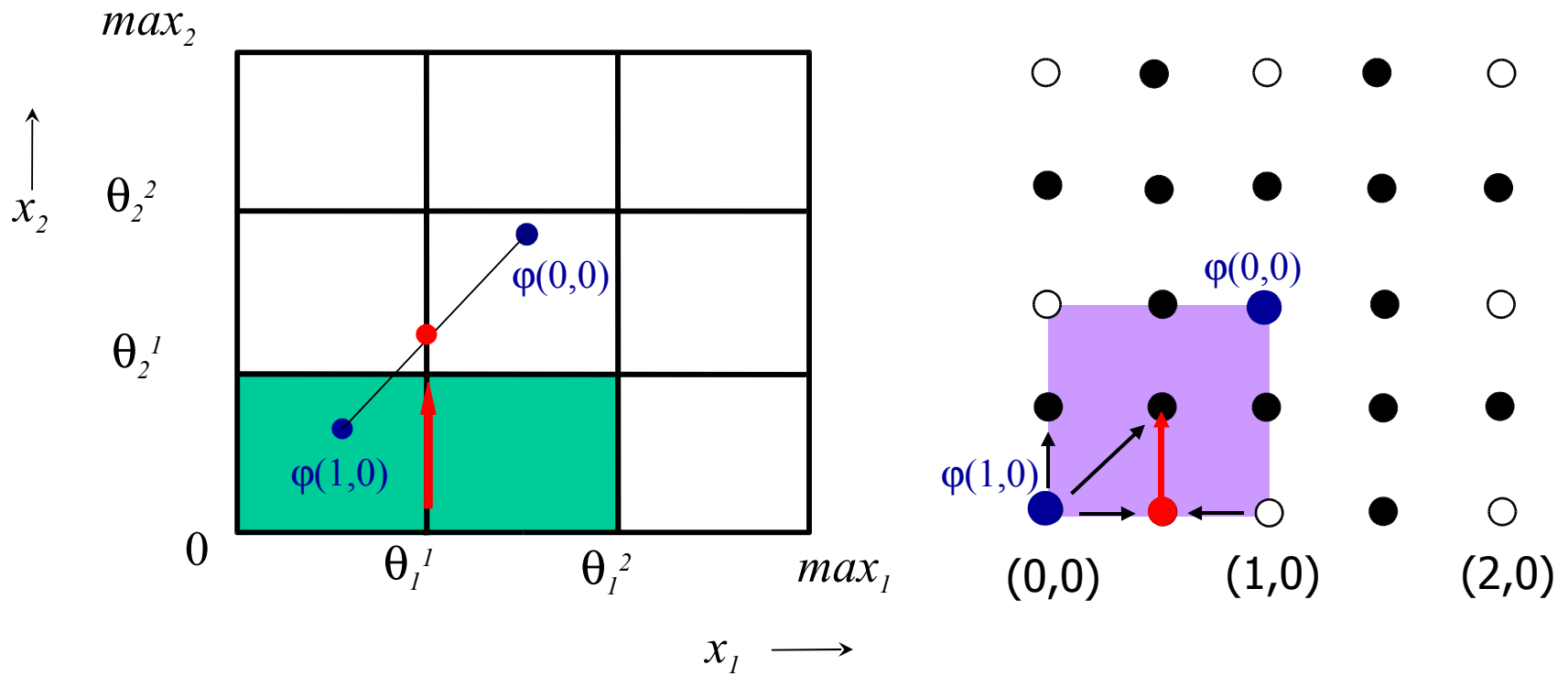


Circuit

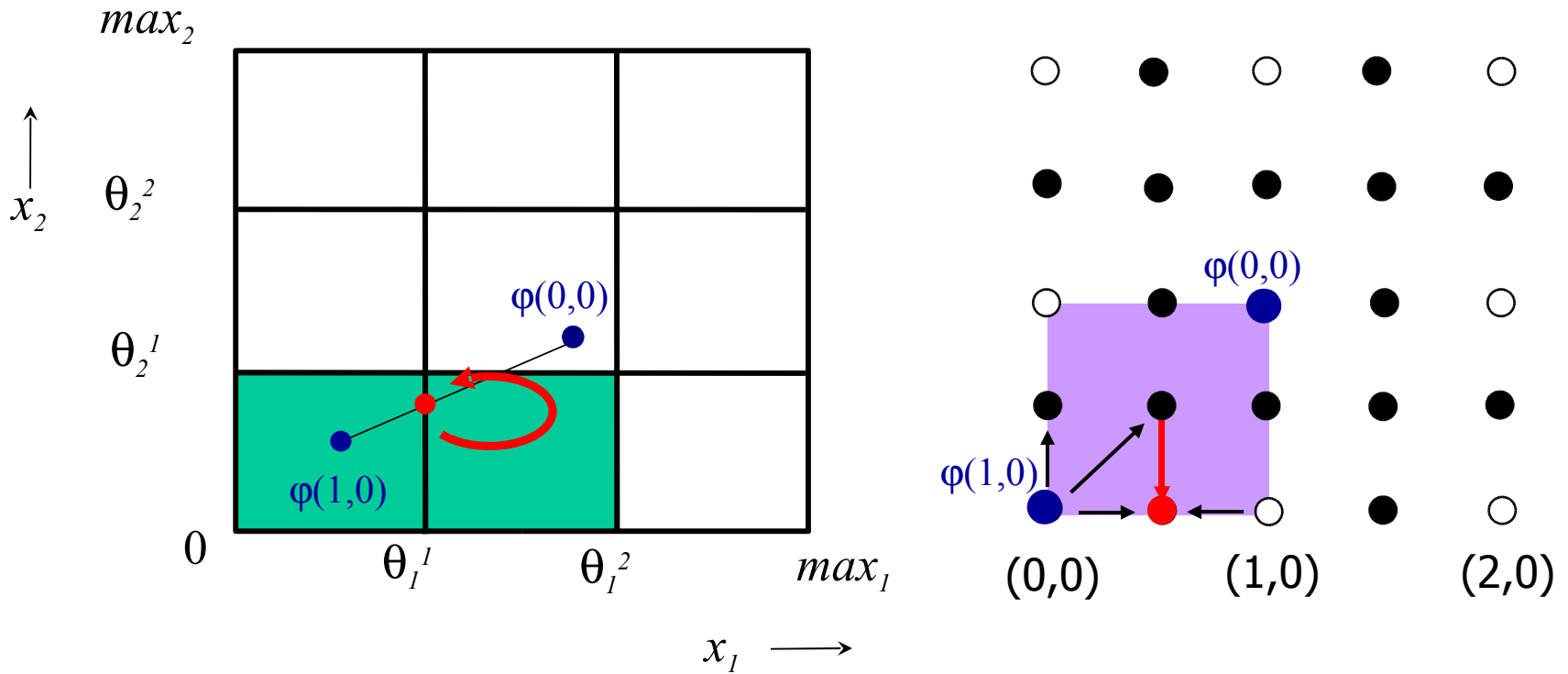


Persistent but not
robustly persistent

Degeneracy

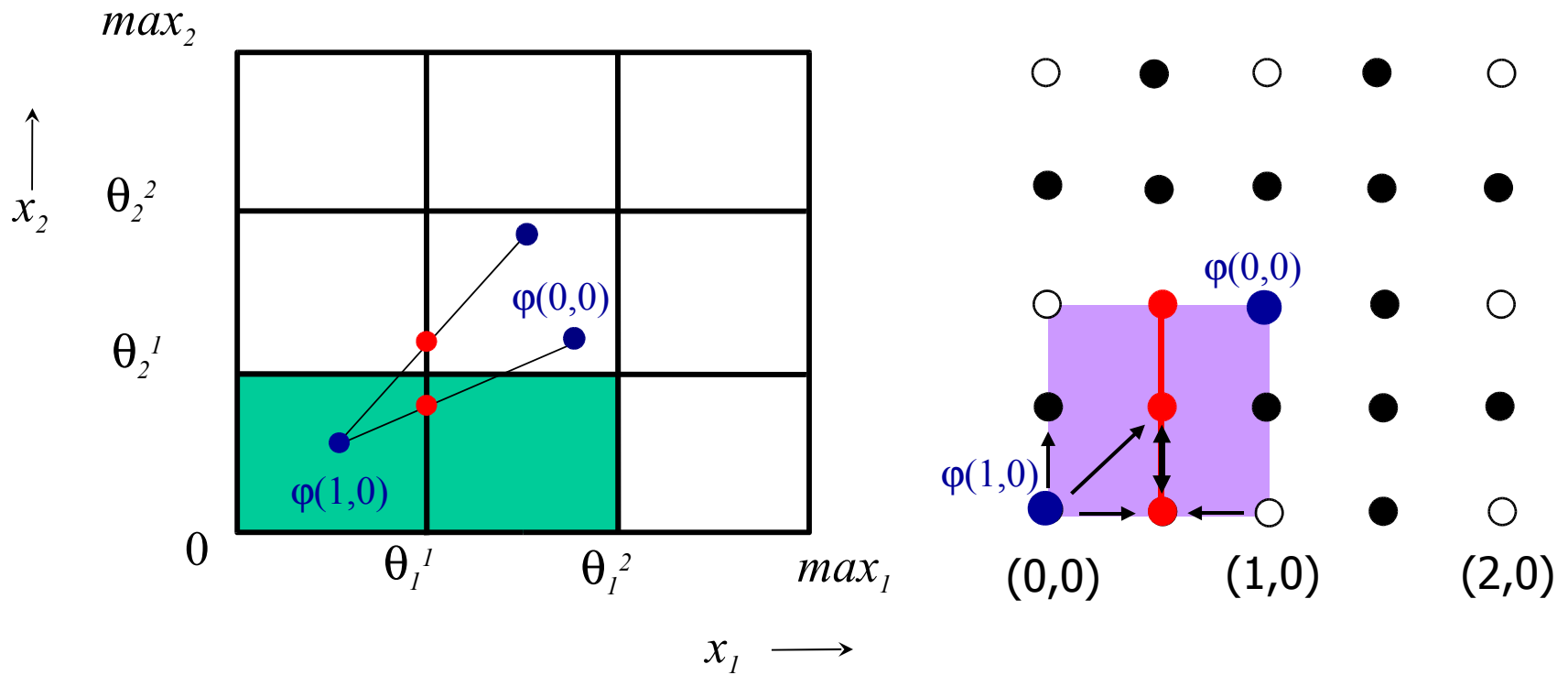


Degeneracy



singular state $(\theta_1^1, 0)$ is stationary

Degeneracy



state $(\theta_1^1, 0)$ is both stationary and non-stationary!

(2) relationship between multiplicity and degeneracy

- **Degeneracy** is possible only if singular state x contains at least 1 threshold θ_j with multiplicity > 1
- if all thresholds are such that $m(\theta_j) = 1$: **no degeneracy**

Reachability of higher orders from regular states

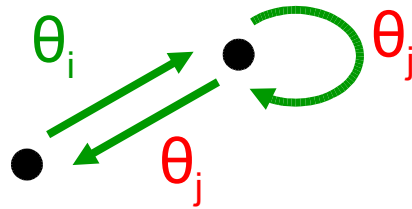
Approximation :

- 'coincidence' transitions can safely be ignored
→ no diagonal transitions to states of lower dimension (higher orders)

⇒ a state \mathbf{x} of order q can be reached:

- directly by a spiralling trajectory converging on \mathbf{x} → logical cycle in the discrete description. Possible if $G(\mathbf{x})$ is a negative circuit.
- by a path of states of order $0, 1, \dots, q-1$ which are *persistent*
- or a combination of the two

Examples



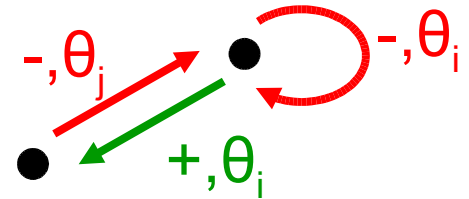
$$\text{mult}(\theta_j) = 2$$

Both (θ_i) and (θ_i, θ_j) can be persistent

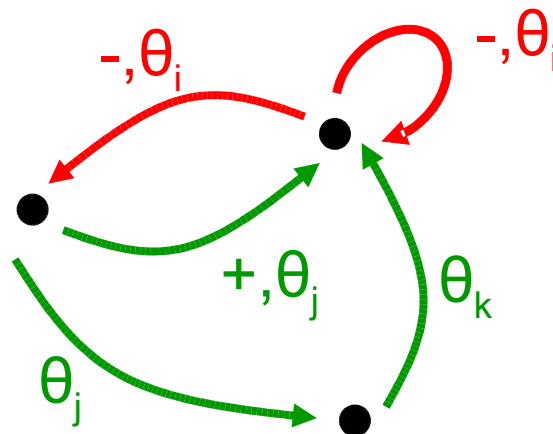
→ possibility to reach $q=3$

Reachability of higher orders from regular states

- $q=1$ No condition
- $q=2$ reachable if $q=1$ can be persistent and stable
- $q=3$ previous cond. + possible persistence of $q=2$



- $q=4$
- ...



Perspectives

- This work is part of a larger project : Formulation of the discrete transition system in Constraint Logic Programming, with Fabien Corblin and Laurent Trilling (LSR, Grenoble)
- Proceedings of WCB05 (Workshop on Constraint Based Methods for Bioinformatics, Spain, 2005), pp 25-34.
<http://www.dimi.uniud.it/dovier/WCB05/wcb05.pdf>

Perspectives :

- Qualitative analysis of phase portrait : steady states, cycles
- Simulations
- Inference of parameters of known behavior
- Behavioral equivalence of two models...

Summary

- Generalization of Snoussi's theorem
 - Differences mainly due to thresholds of multiplicity >1
 - Analysis in terms of circuits/hoopings in the general case
- synthesis of two approaches: the logical approach of Thomas et al and the approach of de Jong et al (based on the Filippov method)