## Modelling, analyzing and control of DES and DEDS

(Compendium of the recent research)

František Čapkovič

Presentation in University of Aizu

October 11, 2006

#### Author's address

#### František Čapkovič

Institute of Informatics, Slovak Academy of Sciences

Dúbravská cesta 9, 845 07 Bratislava, Slovak Republic

e-mail: Frantisek.Capkovic@savba.sk

http://www.ui.sav.sk/home/capkovic/capkhome.htm

#### Contents

#### Introduction

- Basic definition of DEDS
- Petri nets in DEDS modelling
- Directed graphs in DEDS modelling
- DEDS control synthesis
  - Definition of the control synthesis
  - Basic principle of the proposed control synthesis method

#### Examples

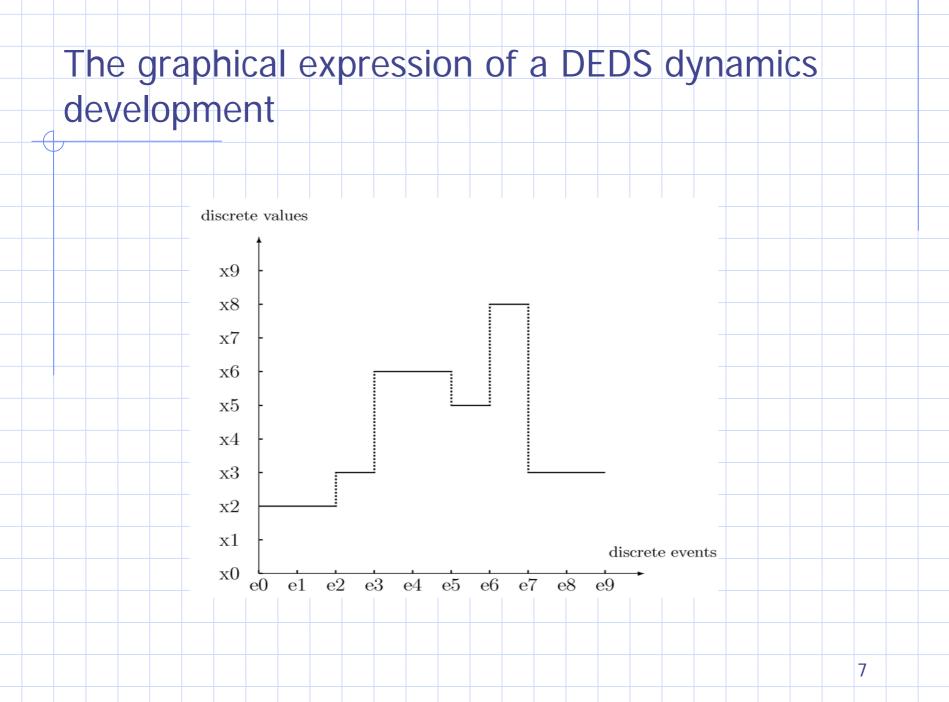
- Client-server cooperation
- Two agents cooperation
- 🔷 Adaptivity
  - Simple example
- Petri nets in problem solving
  - Problem solving and causality
  - Petri nets & reachability graphs in problem solving

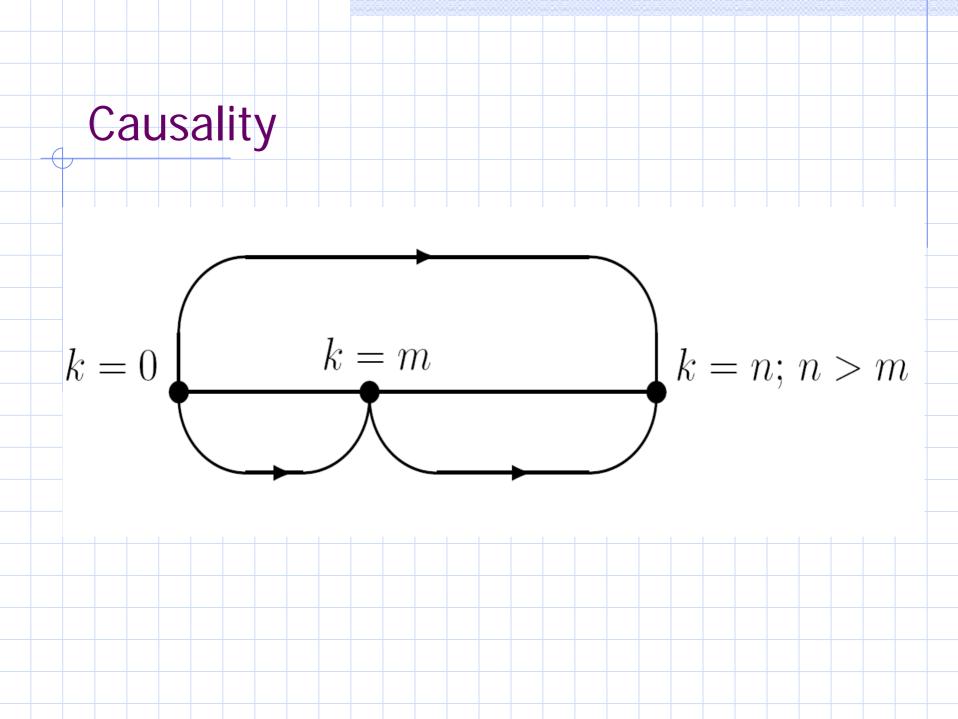
#### Problem solving & DES

- Solving the DES control synthesis problem
- Agent-based approach to DES control synthesis
- Example the maze problem solving
- Approaches to solving the problem
  - Mutual intersection of autonomous solutions
  - Solving the global problem in the whole
  - Utilizing P-invariants of Petri net based model



- Engineering applications
  - Assembly & disassembly process
  - Flexible manufacturing system
- Conclusions

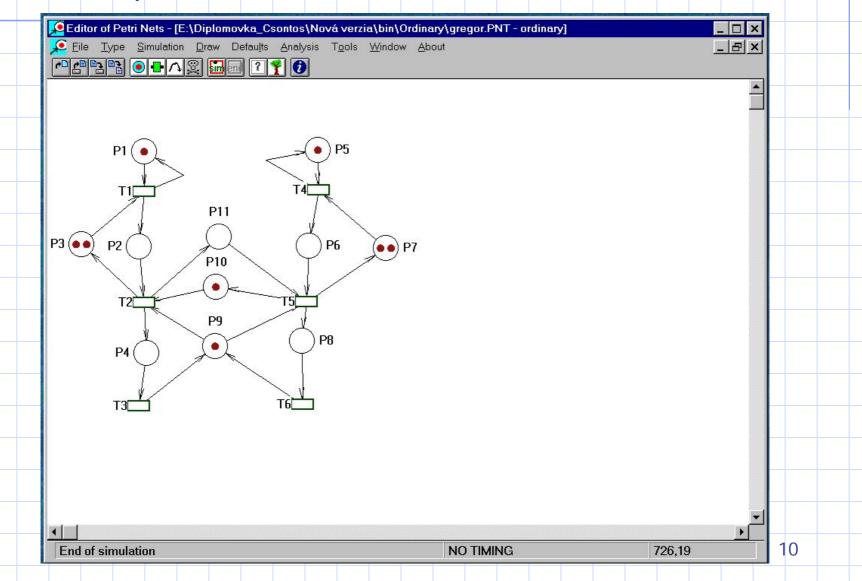




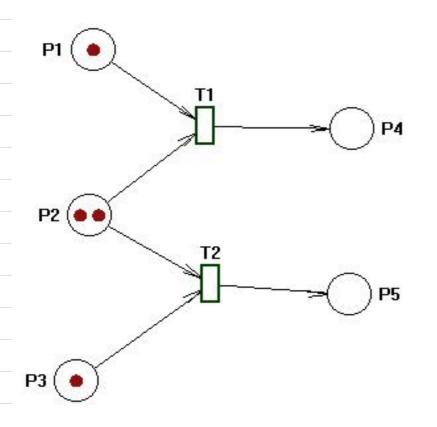
#### Why Petri nets in DEDS modelling ????

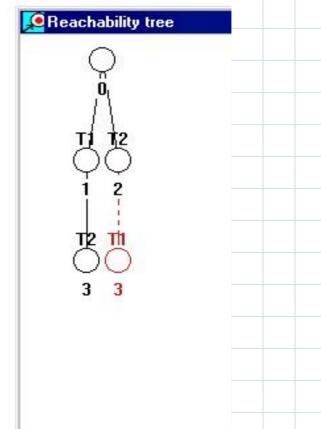
- PN are able to express parallelism and conflict situations
- PN can be expressed in analytical terms (in the form of the linear discrete system) as well as in the graphical form
- PN properties can be tested by means of the reachability tree and invariants
- PN allow to use analytical approach to the DEDS control synthesis
- PN make possible to quantify (model) problems that
  - are given e.g. only verbally

#### An example of a Petri net

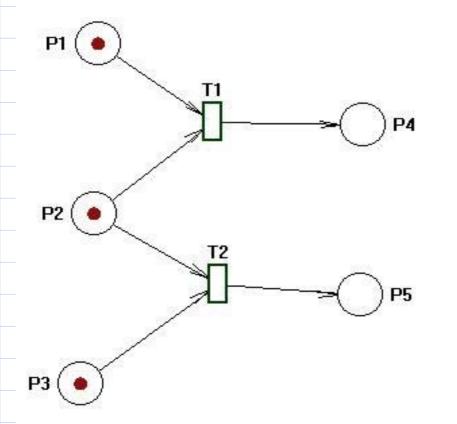


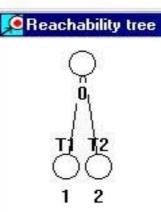
Parallelism





#### **Conflict situation**





Formal expression of the Petri net structure

 $\langle P, T, F, G \rangle; \quad P \cap T = \emptyset; \quad F \cap G = \emptyset$  $P = \{p_1, ..., p_n\}$ Set of the PN places  $T = \{t_1, ..., t_m\}$ Set of PN transitions  $F \subset P \times T$  – Set of PN arcs from places to transitions Set of PN arcs from transitions to  $G \subset T \times P$ places

Formal expression of the Petri net dynamics

$$\langle X, U, \delta, \mathbf{x}_0 \rangle; \quad X \cap U = \emptyset$$
  
 $X = \{\mathbf{x}_0, \mathbf{x}_1, \dots, \mathbf{x}_N\}$  Set of state vectors  
 $U = \{\mathbf{u}_0, \mathbf{u}_1, \dots, \mathbf{u}_N\}$  Set of control vectors  
 $\delta: X \times U \longrightarrow X$  Transition function  
 $\mathbf{x}_0$  is an initial state

Mathematical model of the Petri net

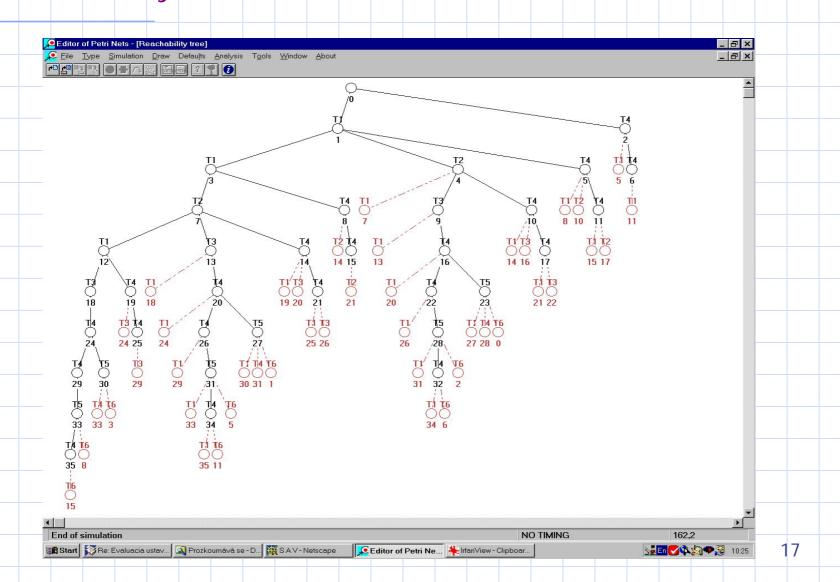
$$egin{aligned} \mathbf{x}_{k+1} &= & \mathbf{x}_k + \mathbf{B}.\mathbf{u}_k \ \mathbf{B} &= & \mathbf{G}^T - \mathbf{F} \ \mathbf{B} &= & \mathbf{G}^T - \mathbf{F} \ \mathbf{F}.\mathbf{u}_k &\leq & \mathbf{x}_k \ \mathbf{x}_k &= & (\sigma_{p_1}^k,...,\sigma_{p_n}^k)^T \ \sigma_{p_i}^k \in \{0,c_{p_i}\},\,i=1,n \ \mathbf{u}_k &= & (\gamma_{t_1}^k,...,\gamma_{t_m}^k)^T \ \gamma_{t_j}^k \in \{0,1\},\,j=1,m \ \mathbf{u}_k \ \mathbf{u}_k &= & (\mathbf{u}_k^k,...,\mathbf{u}_k^k)^T \ \mathbf{u}_k \in \{0,1\},\,j=1,m \ \mathbf{u}_k \ \mathbf{u}_k &= & (\mathbf{u}_k^k,...,\mathbf{u}_k^k)^T \ \mathbf{u}_k \in \{0,1\},\,j=1,m \ \mathbf{u}_k \ \mathbf{$$

A more general PN-based mathematical model of DEDS (with the multiplicity of arcs)

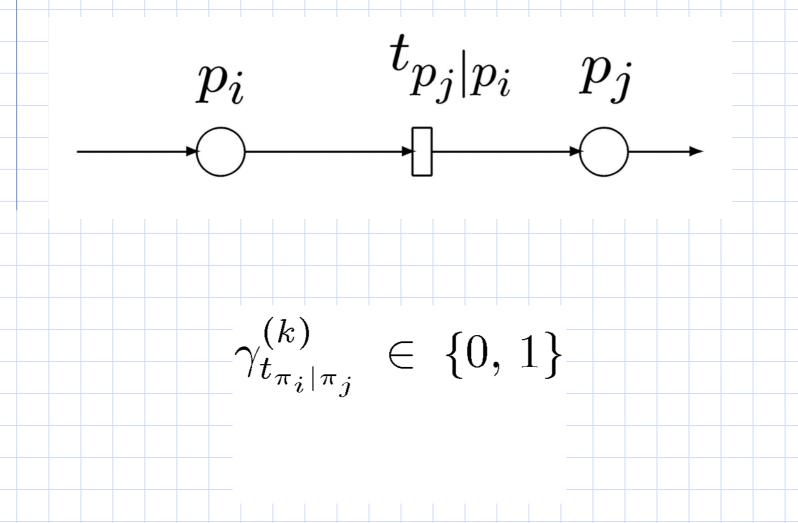
 $\mathbf{x}_{k+1} = \mathbf{x}_k + \mathbf{B} \cdot \mathbf{u}_k, \quad k = 0, ..., N$ (1) $\mathbf{B} = \mathbf{G}^T - \mathbf{F}$ (2) $\mathbf{F}_{k} \mathbf{u}_{k} < \mathbf{x}_{k}$ (3) $\mathbf{x}_{k} = (\sigma_{p_{1}}^{k}, ..., \sigma_{p_{n}}^{k})^{T} - \sigma_{p_{i}}^{k} \in \{0, c_{p_{i}}\}$  $\mathbf{u}_{k} = (\gamma_{t_{1}}^{k}, ..., \gamma_{t_{m}}^{k})^{T}, \gamma_{t_{j}}^{k} \in \{0, 1\}$  $\mathbf{F} = \{f_{ij}\}; i = 1, ..., n, j = 1, ..., m; f_{ij} \in \{0, M_{f_{ij}}\}$  $\mathbf{G} = \{g_{ij}\}; i = 1, ..., m, j = 1, ..., n; g_{ij} \in \{0, M_{g_{ij}}\}$ 

16

#### Reachability tree of the above introduced Petri net



#### Directed graphs (DG) in DEDS modelling



18

$$\begin{split} \mathbf{X}(k+1) &= \mathbf{\Delta}_{k} \cdot \mathbf{X}(k) \quad , \quad k = 0, N \\ \mathbf{X}(k) &= (\sigma_{\pi_{1}}^{(k)}(\gamma), ..., \sigma_{\pi_{n_{RT}}}^{(k)}(\gamma))^{T}, \, k = 0, N \\ \mathbf{\Delta}_{k} &= \{\delta_{ij}^{(k)}\}_{n_{RT} \times n_{RT}} \\ \delta_{ij}^{(k)} &= \gamma_{t_{\pi_{i} \mid \pi_{j}}}^{(k)}, \, i = 1, n_{RT}, \, j = 1, n_{RT} \end{split}$$

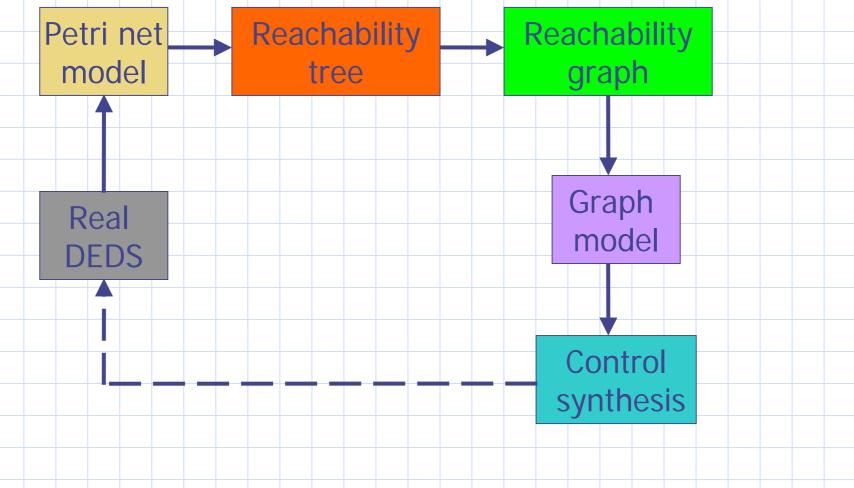
#### State machines

Petri nets where each transition has only one input and only one output position are named state machines. They can be modelled by directed graphs (DG) without any problem.

Petri nets with general structure

In case of the general structure, when any transition is allowed to have more input positions and more output ones, the PN reachability graph has to be used.

#### Transforming the PN model to the DG model



#### **DEDS control synthesis**

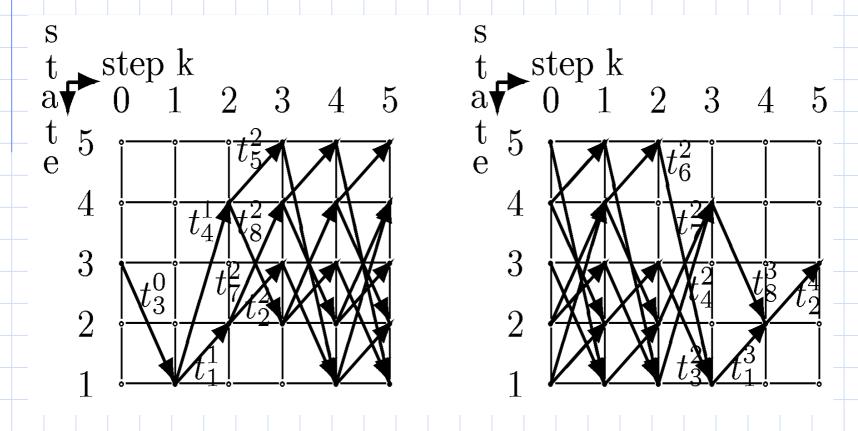
#### Definition of the control synthesis

Control synthesis = finding the most suitable sequence of discrete events (control interferences) which is able to ensure the transition (transformation) of the system from a given initial state into a prescribed terminal state at simultaneous fulfilling control task specifications that are imposed on the control task.

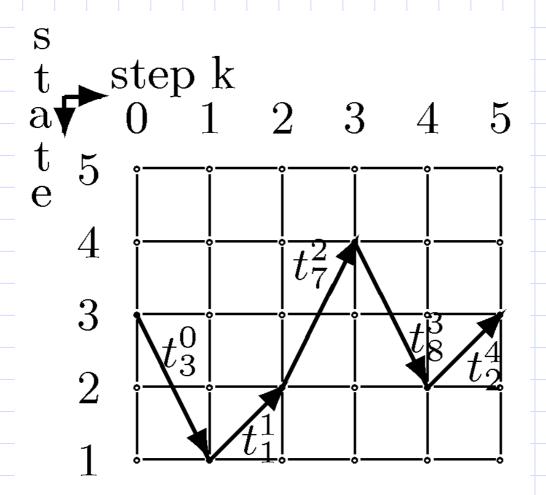
Control task specifications = criteria, constraints, etc. Usually, they are not given in analytical terms. Even, often they are given only verbally.

### Basic principle of the proposed control synthesis method

Straight-lined reachability tree and the backtracking one



Intersection of the trees yields the state trajectory(-ies)



Procedure in analytical terms

The staight-lined reachability tree (SLRT)

 $\{\mathbf{X}_1\} = \mathbf{\Delta}.\mathbf{X}_0$  $\{\mathbf{X}_2\} = \mathbf{\Delta}.\{\mathbf{X}_1\} = \mathbf{\Delta}.(\mathbf{\Delta}.\mathbf{X}_0) = \mathbf{\Delta}^2.\mathbf{X}_0$ 

 $\{\mathbf{X}_N\} = \mathbf{\Delta}.\{\mathbf{X}_{N-1}\} = \mathbf{\Delta}^N.\mathbf{X}_0$ 

The backtracking (backward) reachability tree (BTRT)

$$egin{array}{rl} \{\mathbf{X}_{N-1}\} &=& \mathbf{\Delta}^T.\mathbf{X}_N \ \{\mathbf{X}_{N-2}\} &=& \mathbf{\Delta}^T.\{\mathbf{X}_{N-1}\} = (\mathbf{\Delta}^T)^2.\mathbf{X}_N \end{array}$$

 $\{\mathbf{X}_0\} = \mathbf{\Delta}^T \cdot \{\mathbf{X}_1\} = (\mathbf{\Delta}^T)^N \cdot \mathbf{X}_N$ 

The intersection of the SLRT and BTRT

$$\begin{split} \mathbf{M}_1 &= & (\mathbf{X}_0, {}^1\{\mathbf{X}_1\}, \dots, {}^1\{\mathbf{X}_{N-1}\}, {}^1\{\mathbf{X}_N\}) \\ \mathbf{M}_2 &= & ({}^2\{\mathbf{X}_0\}, {}^2\{\mathbf{X}_1\}, \dots, {}^2\{\mathbf{X}_{N-1}\}, \mathbf{X}_N) \\ \mathbf{M} &= & \mathbf{M}_1 \ \cap \ \mathbf{M}_2 \\ \mathbf{M} &= & (\mathbf{X}_0, \{\mathbf{X}_1\}, \dots, \{\mathbf{X}_{N-1}\}, \mathbf{X}_N) \end{split}$$

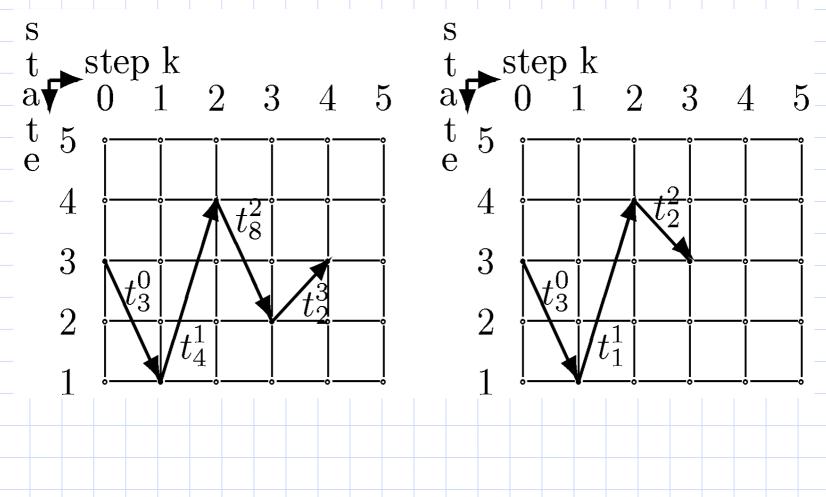
#### Using the principle of causality

Due to the principle of causality any shorter feasible solution is involved in the longer feasible one. Hence, when

 ${
m M}_2$  is shifted to the left before the intersection.

$$^{-1}M = (x_0, \{x_1\}, \dots, \{x_{N-2}\}, x_{N-1})$$
 (18)

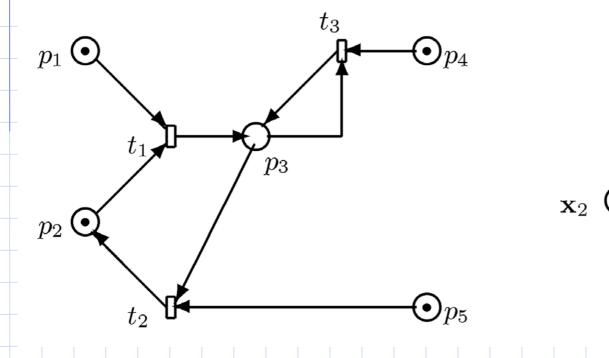
where  $\mathbf{x}_{N-1} = \mathbf{x}_t$ . Shifting (finding the  $(n \times (N - k + 1))$  matrices  ${}^{-k}\mathbf{M}, k = 1, 2, ...$ ) can continue until the intersections exists, i.e. until  $\mathbf{x}_0 \in {}^2{\{\mathbf{x}_k\}}$  and  $\mathbf{x}_t \in {}^1{\{\mathbf{x}_{N-k}\}}$ . Shorter trajectories obtained by shifting

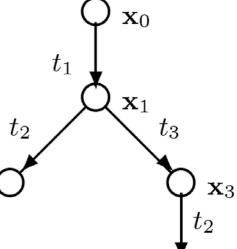


#### **Example 1** – Client-server connection

- The places of the PN-based model
- p1 the client (C) requests for the connection
- p2 the server (S) is listening
- p3 the connection of C with S
- p4 the data sent by C to S
- p5 the disconnection of C by the C himself
- The transitions of the PN-based model
- t1, t2, t3 discrete events realizing the system dynamics

#### PN-based model and corresponding reachability tree





 $\mathbf{x}_4$ 

Parameters of the PN-based model

# $\mathbf{F} = \begin{pmatrix} 1 & 0 & 0 \\ 1 & 0 & 0 \\ 0 & 1 & 1 \\ 0 & 0 & 1 \\ 0 & 1 & 0 \end{pmatrix} \quad \mathbf{G} = \begin{pmatrix} 0 & 0 & 1 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 \end{pmatrix}$ $\mathbf{x}_0 = (1, \ 1, \ 0, \ 1, \ 1)^T$

```
MATLAB procedure for enumerating the RT
```

```
Xreach=x0
Art=[0]
[n,m]=size(F);
B=Gt-F
i=0
while i < size(Xreach,2)</pre>
         i=i+1;
         for k=1:m
             x(k)=all(Xreach(:,i) >= F(:,k));
         end
         findx=find(x)
         for k=1:size(findx,2)
```

```
bb = Xreach(:,i)+B(:,findx(k));
    matrix=[];
    for j=1:size(Xreach,2)
        matrix=[matrix,bb];
    end:
    v=all(matrix == Xreach);
    j=find(v);
    if any(v)
        Art(i,j)= findx(k);
    else
        Xreach=[Xreach,bb];
        Art(size(Art,1)+1,size(Art,
        Art(i,size(Art,2))=findx(k)
    end;
end:
```

34

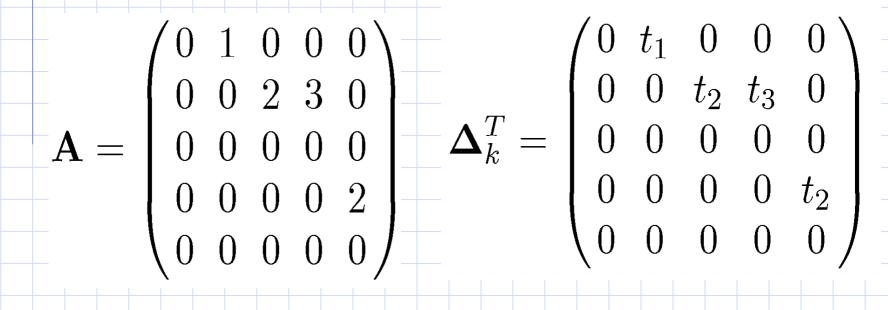
Xreach;

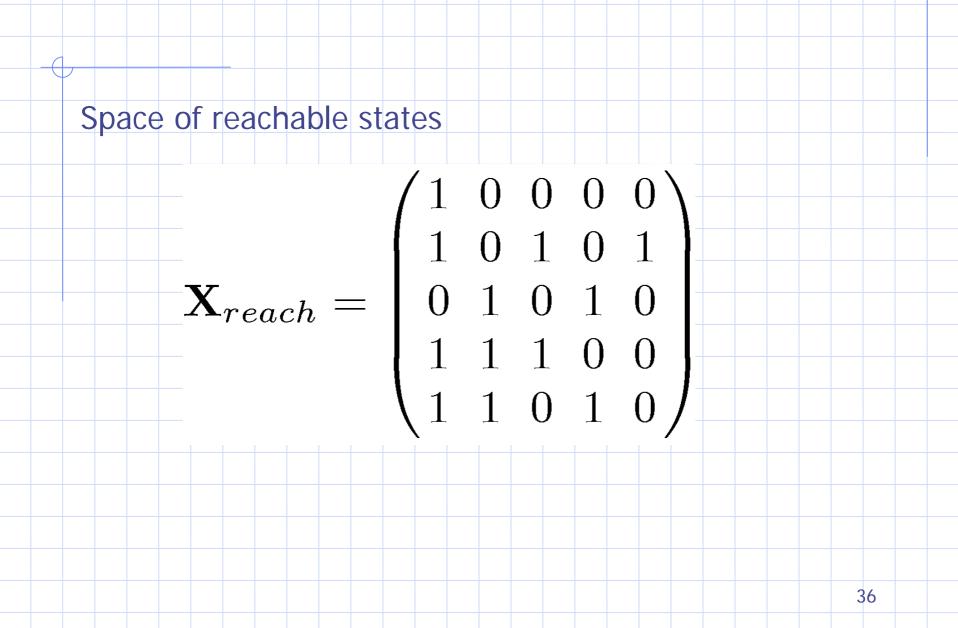
Art;

end

**Enumerated RT** 

Quasi-functional adjacency matrix of RT





## Example 2 – Two agents cooperation

The agent A needs to do the activity (i.e. to solve a problem) P. However, A is not able to do P. Consequently, A requests the agent B to do P for him.

The places of the PN-based model:

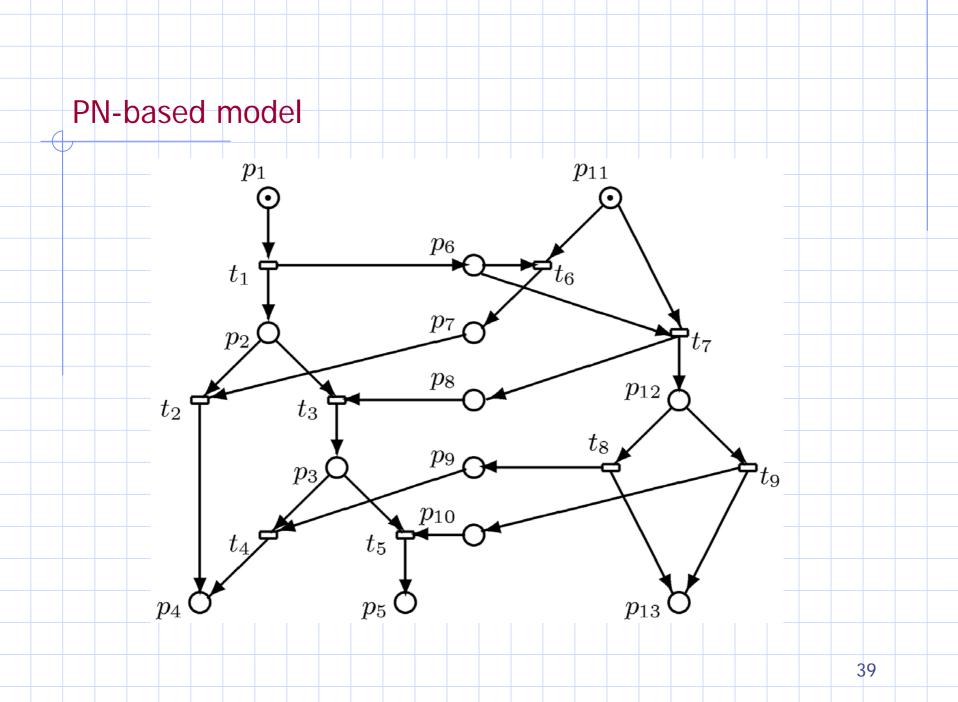
p1 – A wants to do P

- p2 A waits for an answer from B
- p3 A waits for a help from B
- p4 the failure of the cooperation
- p5 the satisfying cooperation
- p6 A requests B to do P
- p7 B refuses to do P

- p8 B accepts the request of A to do P
  p9 B is not able to do P
  p10 doing P by B
- p11 B receives the request of A
- p12 B is willing to do P for A
- p13 the end of the work of B

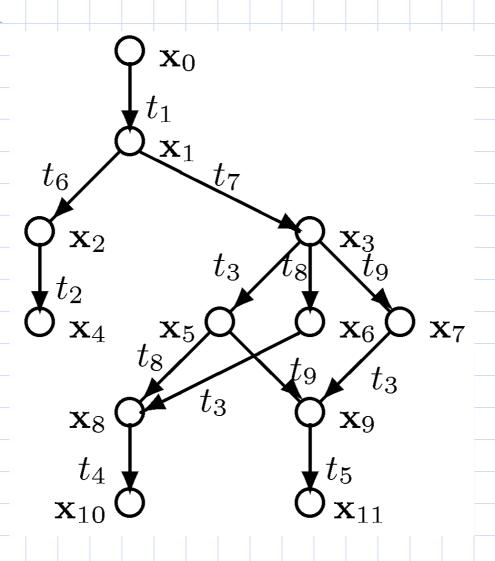
The transitions of the PN-based model:

t1 – t9 represent discrete events realizing the system dynamics

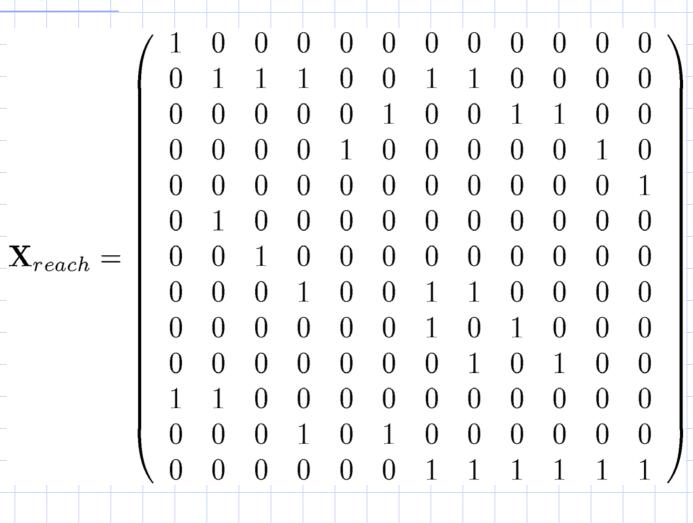


**Enumerated RT** 

The reachability graph



#### The space of reachable states



#### **Control synthesis**

#### The initial state

 $\mathbf{x}_0 = (1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0)^T$ 

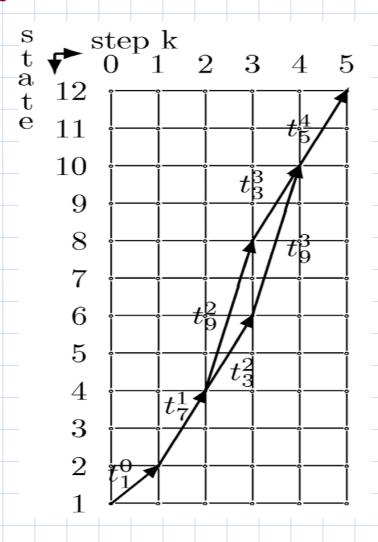
The terminal state – the successful cooperation

 $\mathbf{x}_{N} = (0, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 0, 1)^{T}$ 

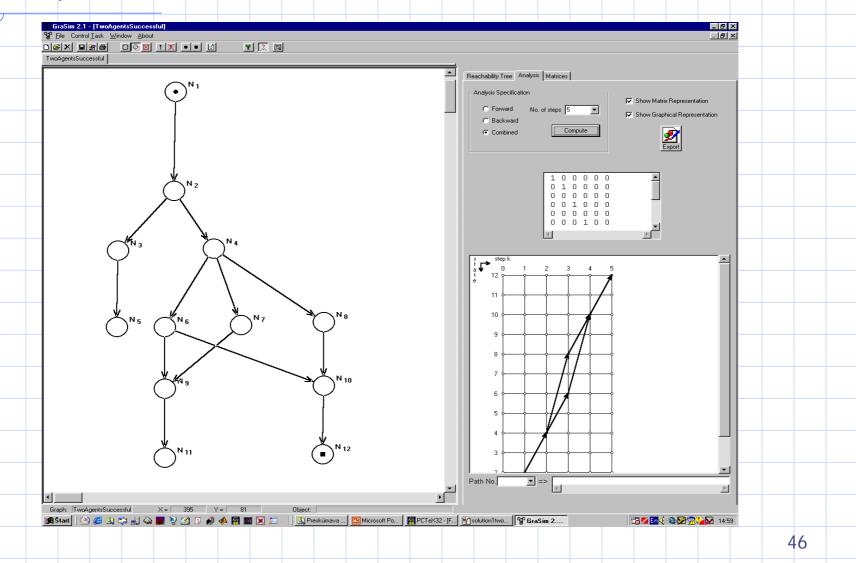
The intersection of the SLRT and BTRT

 $-\mathbf{M} =$ 

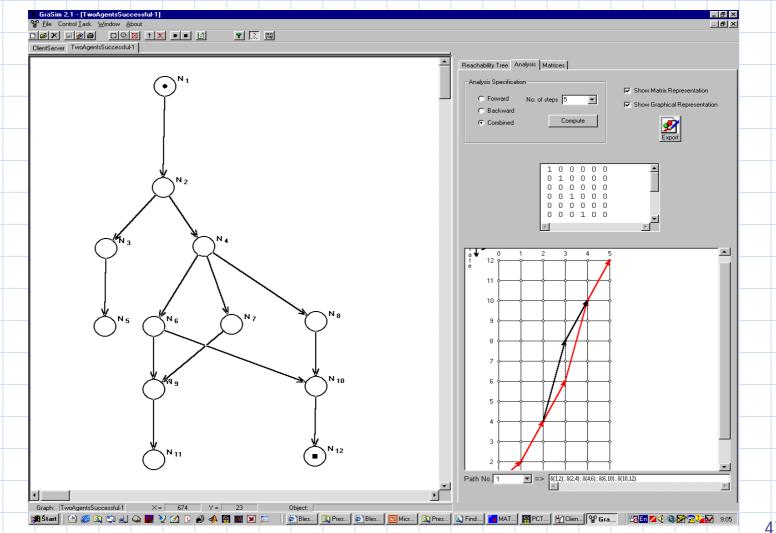
#### The state trajectories – the successful cooperation



#### Graphic tool - GraSim

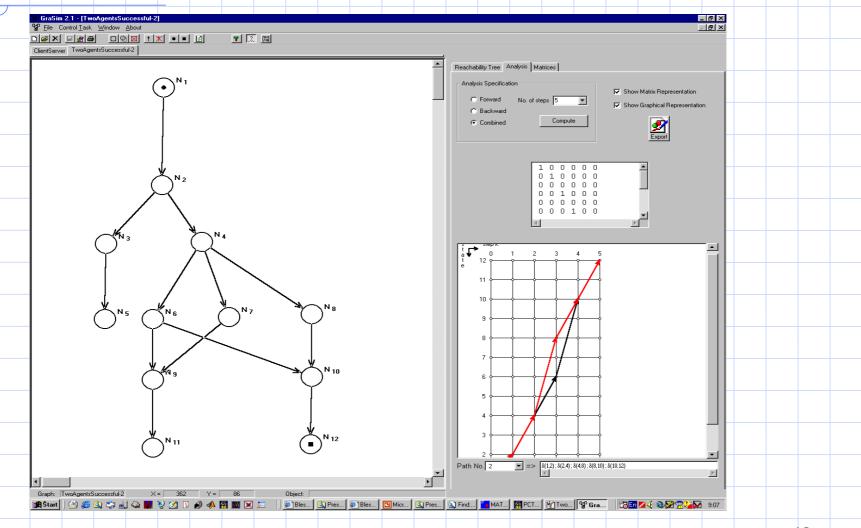


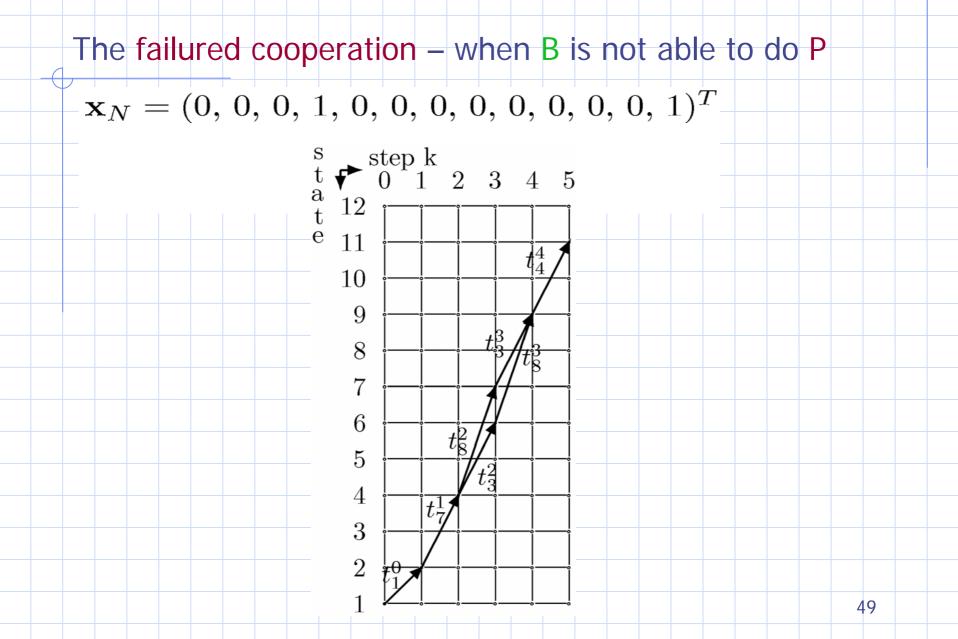
#### Succesfull cooperation 1



47

#### Succesfull cooperation 2





## Adaptivity (flexibility)

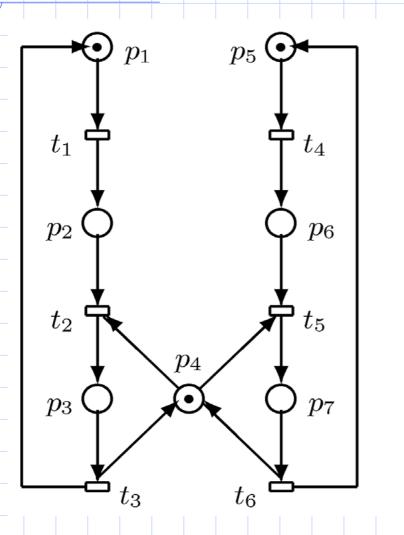
There are two kinds of the adaptivity in the DEDS control synthesis

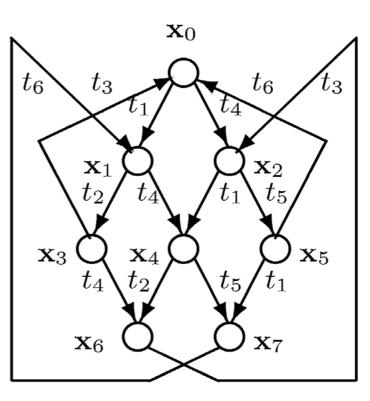
Choosing the most suitable trajectory from the feasible ones in order to adapt the system behaviour to external demands (conditions)

Changing the structure of the system model in order to express more kinds of the system behaviour.

 Choosing the most suitable behaviour from the feasible ones. It is illustrated in the next example.

#### Example 3 – Two processes





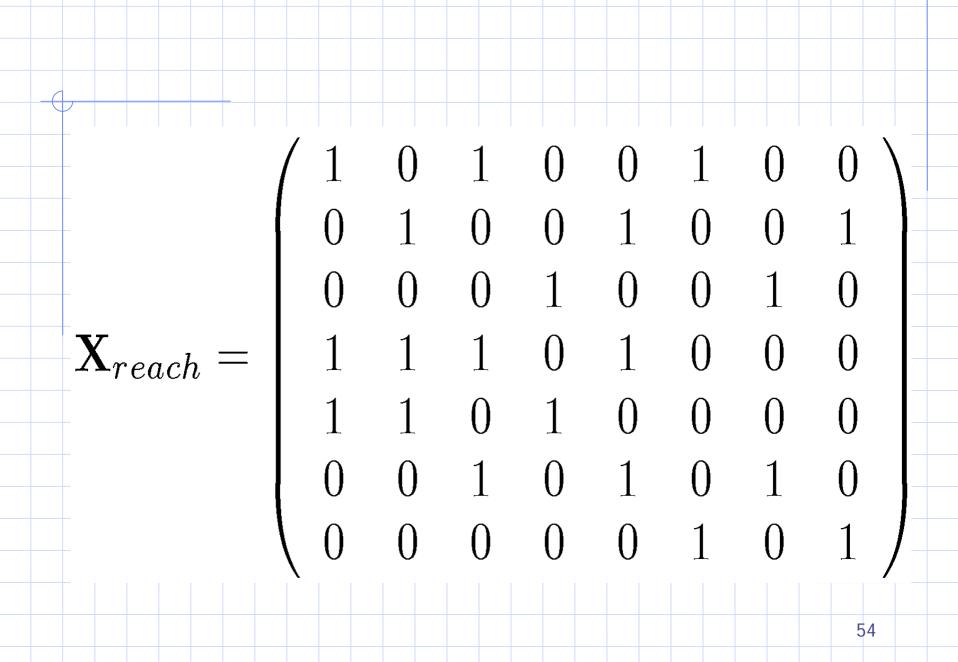
{p1, p2, p3} – 1<sup>st</sup> process *P1* {p5, p6, p7} – 2<sup>nd</sup> process *P2* 

- p4 the structural element that is able to influence
  the mutual exclusion of *P1* and *P2*the sequencing of *P1* and *P2*
- the re-running of *P1* and *P2*

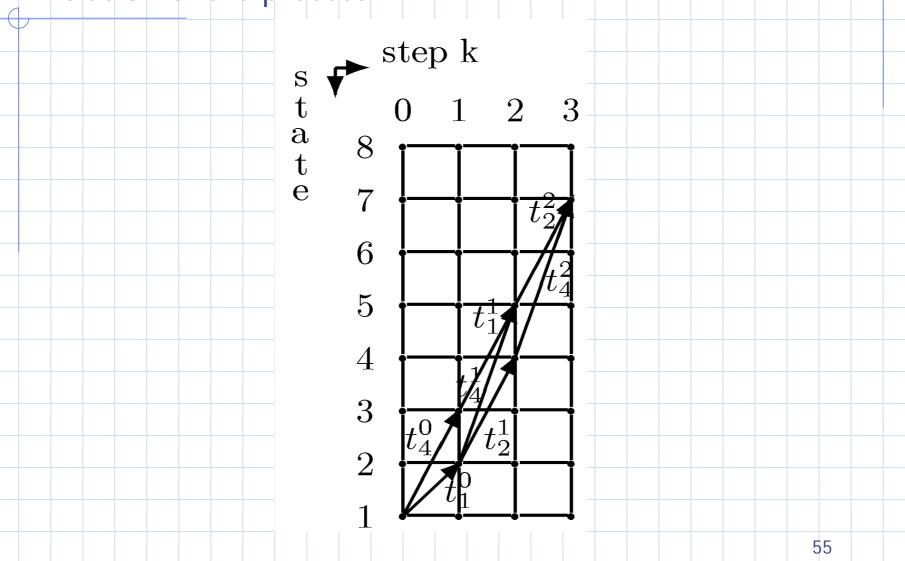
$$\mathbf{x}_0 = (1, 0, 0, 1, 1, 0, 0)^T$$
  $\mathbf{x}_6 = (0, 0, 1, 0, 0, 1, 0)^T$ 

#### $\left( \right)$ $\left( \right)$ $\mathbf{0}$ $\mathbf{0}$ $\left( \right)$ $\left( \right)$

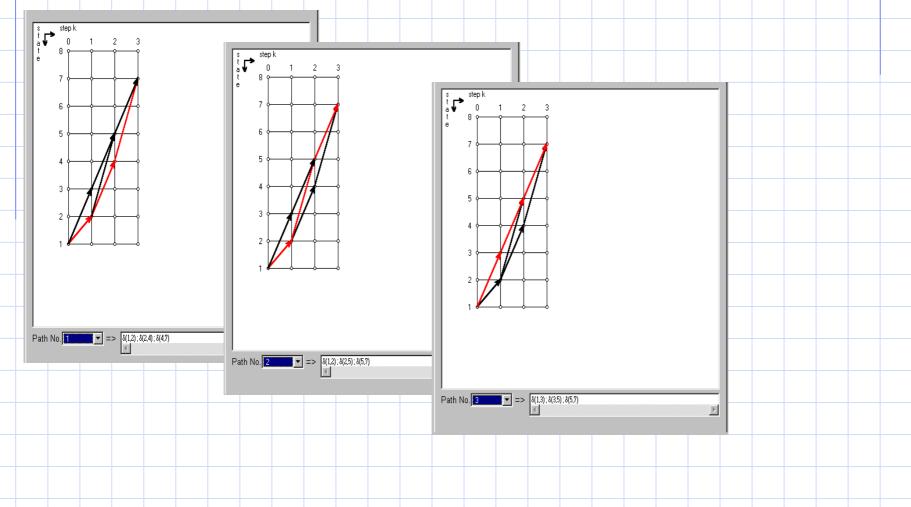
 $\mathbf{A}_k =$ 



#### Exclusion of the process *P2*

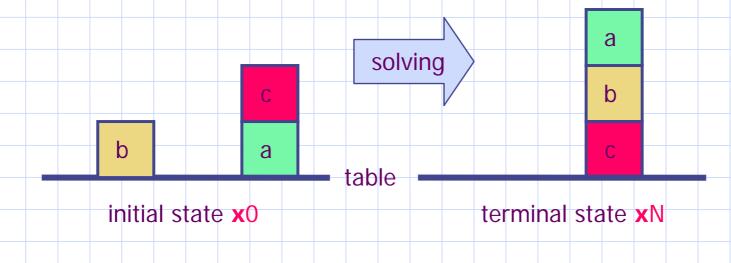


#### Three possibilities of the P2 exclusion

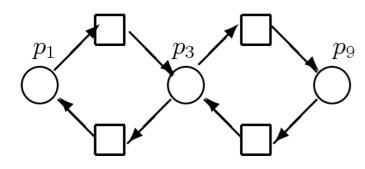


## Petri nets in problem solving

- Causality and problem solving
- STRIPS (<u>STanford Research Institute Problem Solver</u>) [Fikes and Nilsson] is associated with the so called *block world* paradigm.

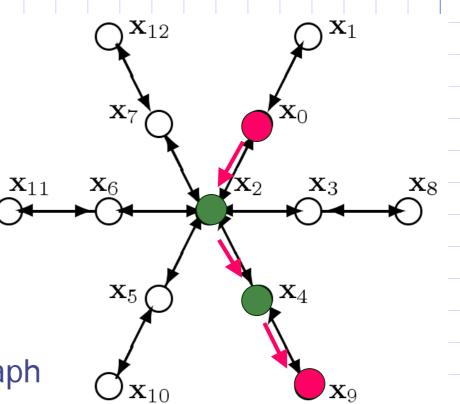


## Expressing causality by Petri nets and reachability graphs



#### A fragment of PN

#### Full reachability graph



#### Interpretation of the Petri net places wrt. the problem

p1 - a, b, c are separated on the table (T); {a,b,c}  $p_2 - a$ , b are separated on T; c is on b; {a,c/b} p3 - a, c are separated on T; b is on c; {a,b/c} p4 - a, b are separated on T; c is on a; {c/a,b} p5 - b, c are separated on T; a is on c; {b,a/c} p6 - b, c are separated on T; a is on b;  $\{a/b,c\}$ p7 - a, c are separated on T; b is on a; {b/a,c} p8 - b is on T; c is on b; a is on c; {a/c/b} p9 - c is on T; b is on c; a is on b; {a/b/c} p10 - c is on T; a is on c; b is on a; b/a/cp11 - a is on T; c is on a; b is on c; b/c/ap12 - b is on T; a is on b; c is on a;  $\{c/a/b\}$ p13 - a is on T; b is on a; c is on b;  $\{c/b/a\}$ 

States as the nodes of the reachability tree Solution of the problem

 $\mathbf{x}0 = (0,0,0,1,0,0,0,0,0,0,0,0)'$  - the initial state  $\mathbf{x}9 = (0,0,0,0,0,0,0,0,0,0,0,0,0)'$  - the terminal state

The solution is

$$x_0 \rightarrow x_2 \rightarrow x_4 \rightarrow x_9$$

where

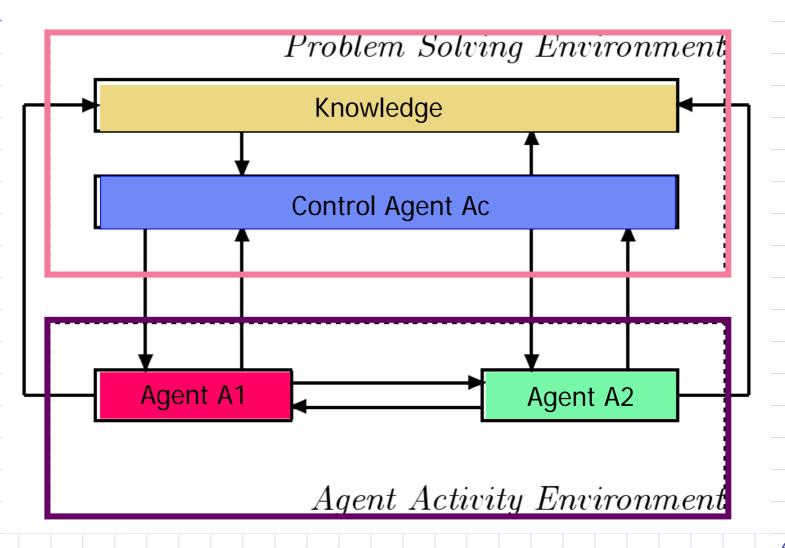
 $\mathbf{x}^2 = (1,0,0,0,0,0,0,0,0,0,0,0,0)'$ 

 $\mathbf{x}4 = (0,0,1,0,0,0,0,0,0,0,0,0,0)'$ 

# Solving the DES control synthesis problems

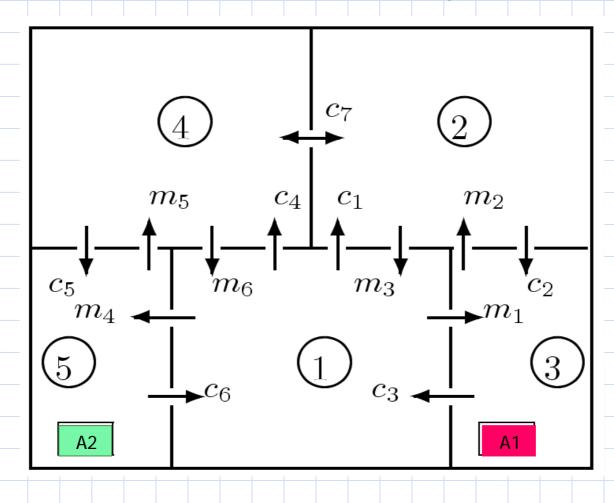
- Agent-based approach
- Engineering applications of AI methods
  - Block world paradigm
  - Hanoi tower paradigm
  - Control of the flexible manufacturing system

#### Agent-based approach to DES control synthesis



#### **Example 4 – Agent-based control synthesis**

Problem to be solved – the maze problem



## **Problem formulation**

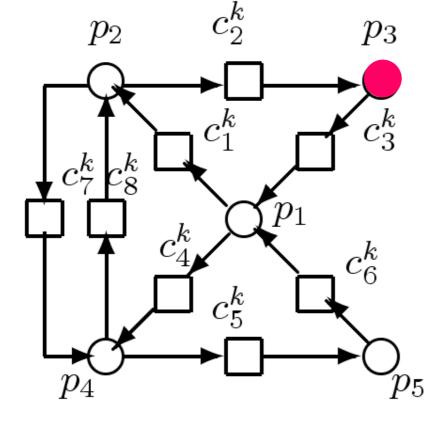
Maze consists of 5 rooms denoted as 1, 2, 3, 4, 5 connected by doors c1, c2, ..., c7, c8 for A1 and doors m1, m2, ..., m6 for A2. Initially, A1 is in the room 3, A2 is in the room 5. Doors can be open (closed) by the control agent Ac. Only door c7 is permanently open (uncontrollable). Agent Ac observes only discrete events from sensors built-in the doors. The control synthesis problem is the following:

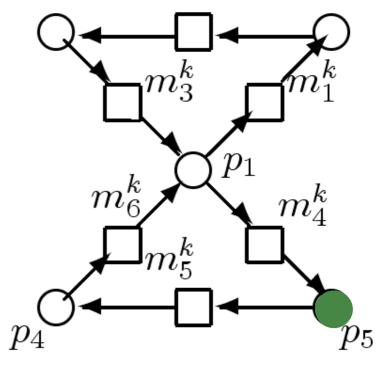
### Control synthesis problem to be solved

- To find the feedback controller (a policy of the
- agent Ac) that will fulfil the conditions:
- 1. A1, A2 never occupy the same room simultaneously
- 2. It is always possible for both of them to return to their initial position
- 3. The agent Ac should enable both of them to behave as freely as possible (with respect to (1.), (2.))

## Petri net-based model of the agents A1, A2

 $p_2$ 





 $m_2^k$ 

Agent A1

Agent A2

66

 $p_3$ 

### Parameters of the mathematical models

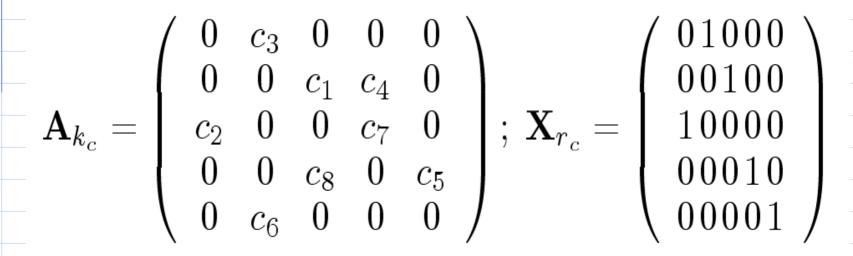
;  $\mathbf{G}_c =$ 

Agent A1 Parameters of the PN-based model

 $\mathbf{F}_c = \left( \begin{array}{c} 10010000\\ 01000010\\ 00100000\\ 00001001\\ 000001001 \end{array} \right.$ 

 $\begin{pmatrix} 01000\\ 00100\\ 10000\\ 00010\\ 00001\\ 10000\\ 00010\\ 00010\\ 01000 \end{pmatrix}$ 

## Adjacency matrix of RG and the space of reachable states





#### Parameters of the PN-based model

 $\mathbf{F}_m = \left( \begin{array}{c} 100100\\001000\\010000\\000001\\000010 \end{array} \right)$ 

 $; \mathbf{G}_m =$ 

## Adjacency matrix of RG and the space of reachable states

## Approaches to solving the problem

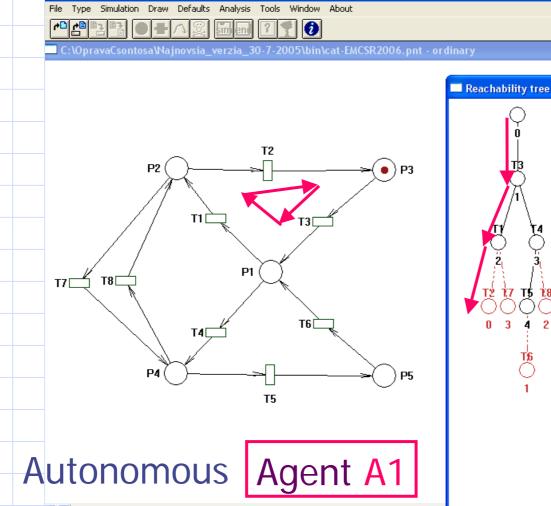
I. Mutual intersection of autonomous solutions

II. Solving the global problem in the whole

III. Utilizing the invariants of the Petri nets model

### Illustrative example

#### I. Mutual intersection of autonomous solutions Editor of Petri Nets



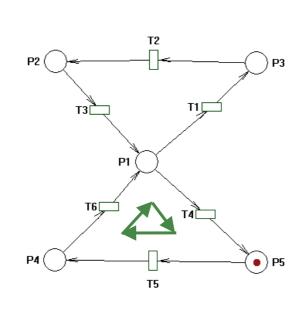
#### Editor of Petri Nets

<

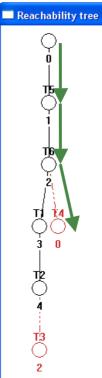
File Type Simulation Draw Defaults Analysis Tools Window About

	ð
--	---

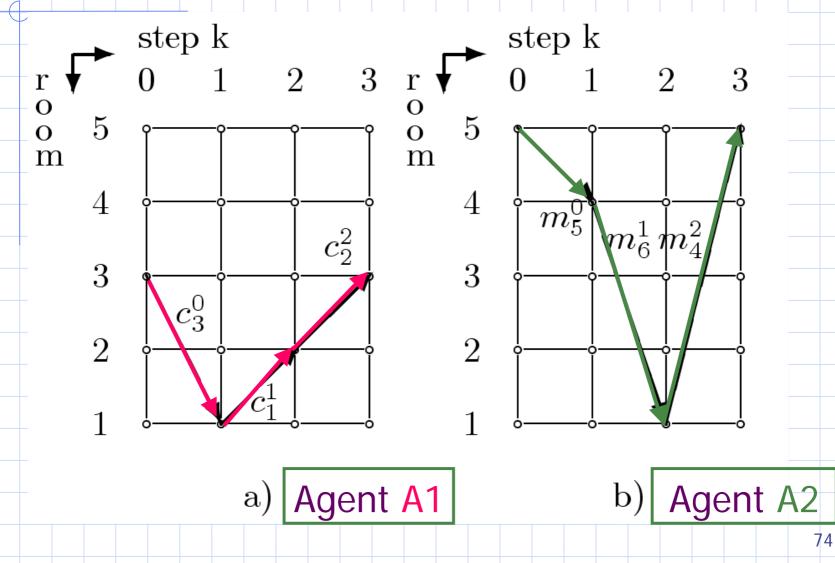
C:\OpravaCsontosa\Najnovsia\_verzia\_30-7-2005\bin\mouse-EMCSR2006.pnt - ordinary

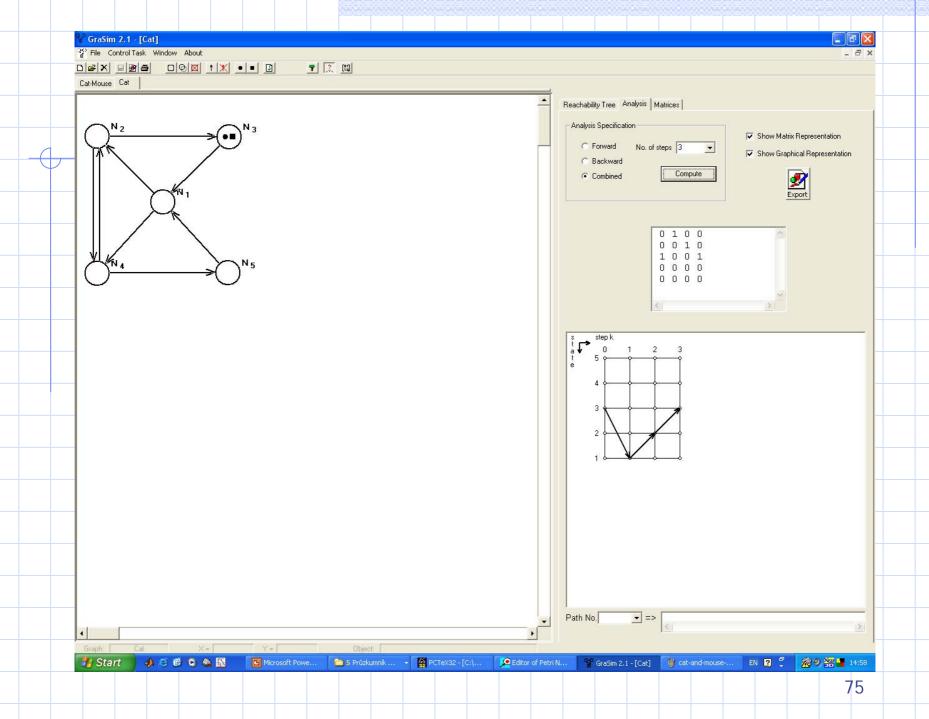


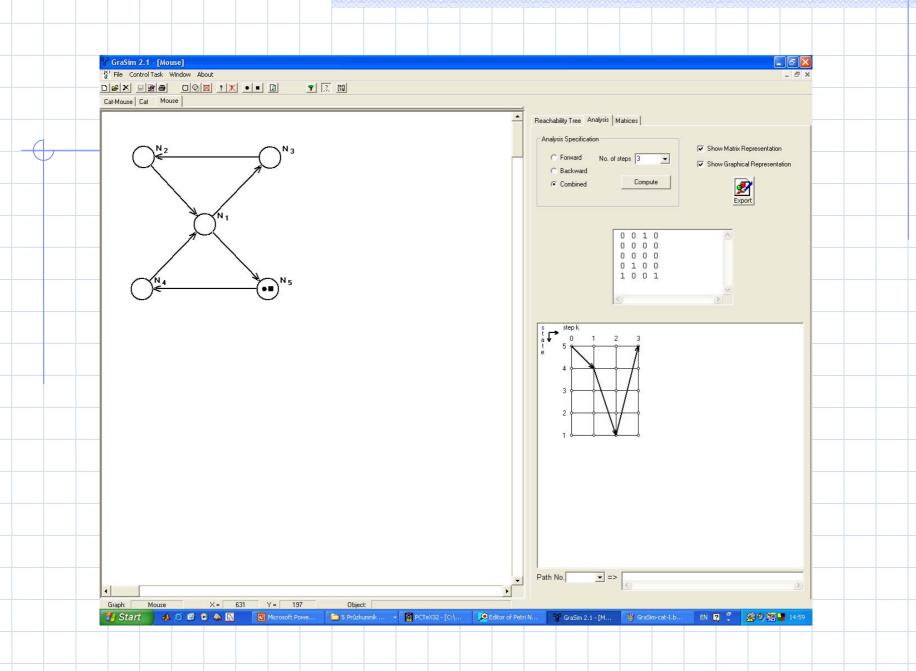
Autonomous Agent A2



# The final solution







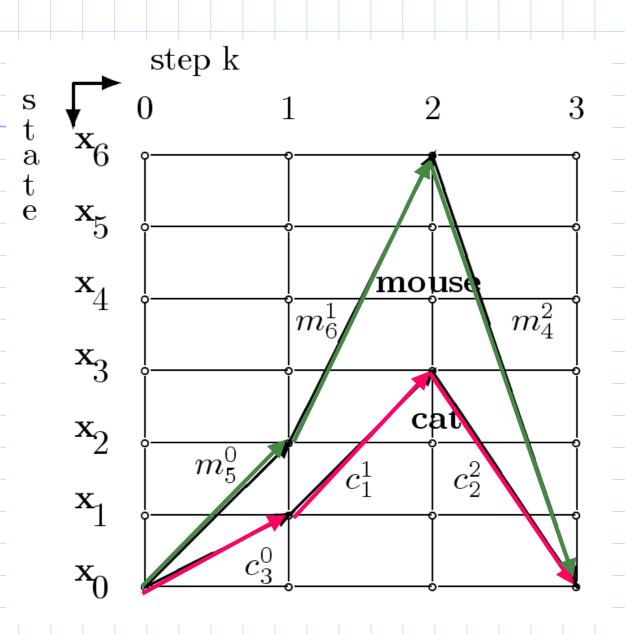
#### II. Solving the global problem in the whole

The PN-based mathematical model

$$\mathbf{F} = \begin{pmatrix} \mathbf{F}_{c} & \emptyset \\ \emptyset & \mathbf{F}_{m} \end{pmatrix}, \quad \mathbf{G}^{T} = \begin{pmatrix} \mathbf{G}_{c}^{T} & \emptyset \\ \emptyset & \mathbf{G}_{m}^{T} \end{pmatrix}$$
$$\mathbf{x} = \begin{bmatrix} \mathbf{x}_{c} \\ \mathbf{x}_{m} \end{bmatrix}, \quad \mathbf{u} = \begin{bmatrix} \mathbf{u}_{c} \\ \mathbf{u}_{m} \end{bmatrix}$$

# The global solution

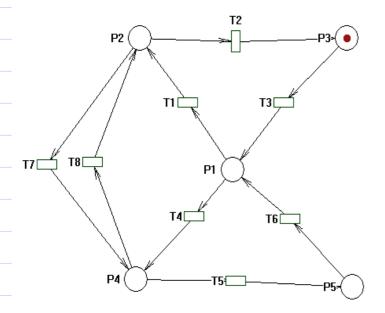
$$\begin{array}{rcl} \text{Agent A1} & \text{Agent A2} \\ \mathbf{x}_{0} & = & (\mathbf{x}_{0_{c}}^{T}, \, \mathbf{x}_{0_{m}}^{T})^{T} = (00100 \, | \, 00001)^{T} \\ \mathbf{x}_{1} & = & (\mathbf{x}_{1_{c}}^{T}, \, \mathbf{x}_{1_{m}}^{T})^{T} = (10000 \, | \, 00001)^{T} \\ \mathbf{x}_{2} & = & (\mathbf{x}_{2_{c}}^{T}, \, \mathbf{x}_{2_{m}}^{T})^{T} = (00100 \, | \, 000010)^{T} \\ \mathbf{x}_{3} & = & (\mathbf{x}_{3_{c}}^{T}, \, \mathbf{x}_{3_{m}}^{T})^{T} = (01000 \, | \, 00001)^{T} \\ \mathbf{x}_{6} & = & (\mathbf{x}_{6_{c}}^{T}, \, \mathbf{x}_{6_{m}}^{T})^{T} = (00100 \, | \, 10000)^{T} \end{array}$$

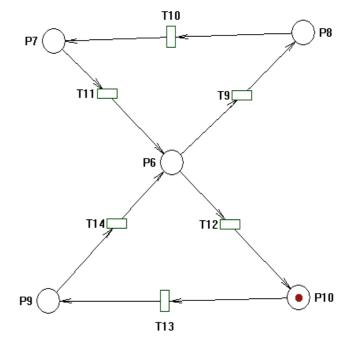


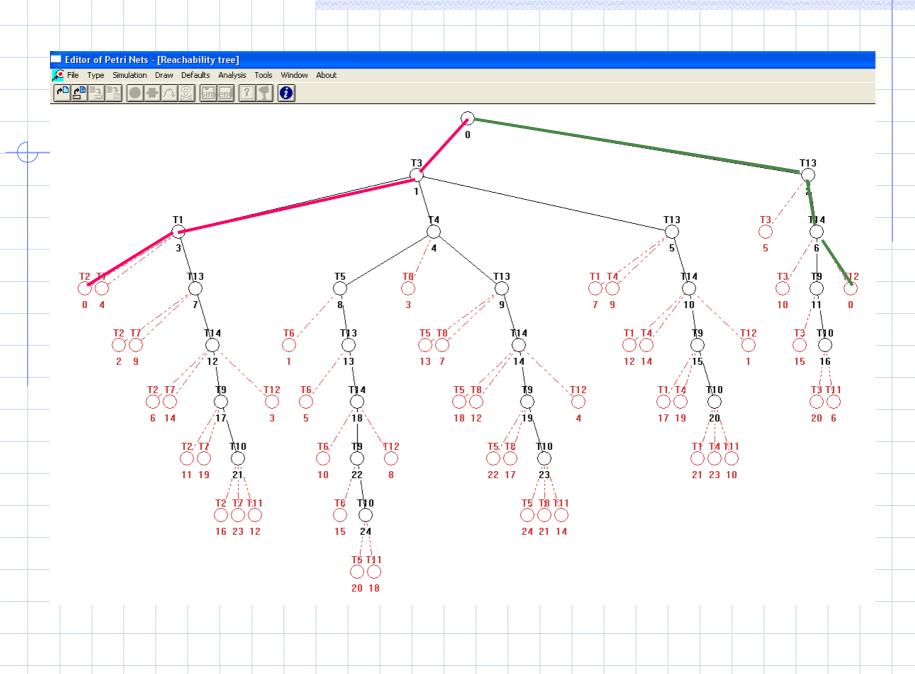
Editor of Petri Nets - [C:\OpravaCsontosa\Najnovsia\_verzia\_30-7-2005\bin\cat-and-mouse-EMCSR2006.pnt]

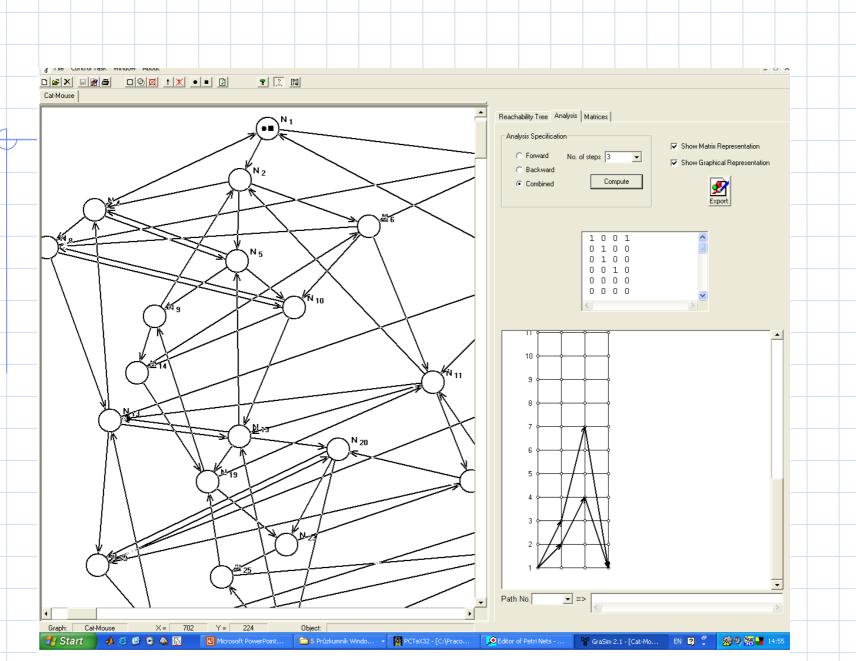
🔎 File Type Simulation Draw Defaults Analysis Tools Window About

- 4 B B O O O A 🕱 🖬 🖬 🤉 🍎









III. Utilizing the invariants of the Petri nets model

Additional PN places – the so called slacks – are introduced

$$\mathbf{x}_a = \left[ egin{array}{c} \mathbf{x} \ \mathbf{x}_s \end{array} 
ight]; \ \mathbf{F}_a = \left( egin{array}{c} \mathbf{F} \ \mathbf{F}_s \end{array} 
ight); \ \mathbf{G}_a^T = \left( egin{array}{c} \mathbf{G}^T \ \mathbf{G}_s^T \end{array} 
ight)$$

i.e. in our example

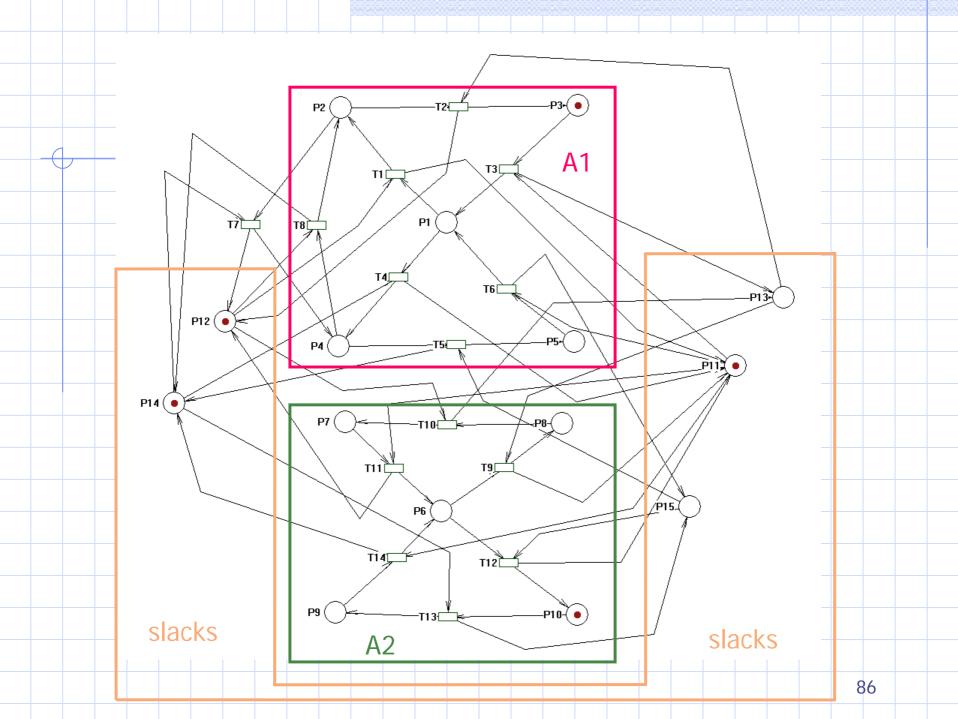
$$\sigma_{p_i} + \sigma_{p_{i+5}} \le 1$$

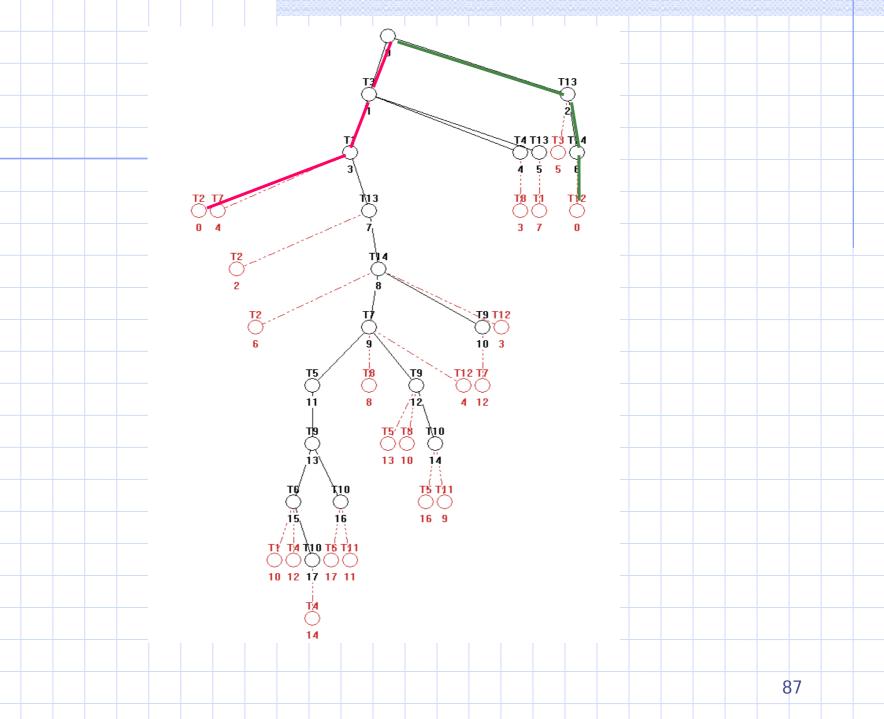
$$\sigma_{p_i} + \sigma_{p_{i+5}} + \sigma_{s_i} = 1; \quad i = 1, 2, ..., 5 \quad (5)$$

Principle of the invariants method

 $\mathbf{X}^T \cdot \mathbf{B} = \mathbf{0}$  ... in the general Petri net  $[\mathbf{L},\mathbf{I}_s]$ .  $\begin{pmatrix} \mathbf{B} \\ \mathbf{B}_s \end{pmatrix} = \mathbf{0}$  ... in case of a Petri net with slacks  $\mathbf{L} \cdot \mathbf{B} + \mathbf{B}_s = \mathbf{0}$  $\mathbf{B}_{s} = -\mathbf{L}.\mathbf{B}$  $\mathbf{B}_s = \mathbf{G}_s^T - \mathbf{F}_s$ 

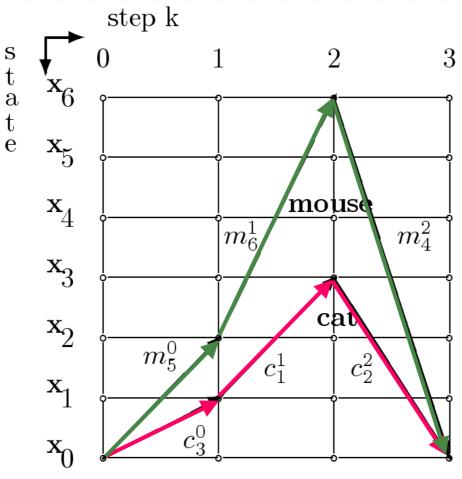
$$\mathbf{F}_{s}^{T} = \begin{pmatrix} 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \end{pmatrix}; \ \mathbf{G}_{s} = \begin{pmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 & 0 \end{pmatrix}$$

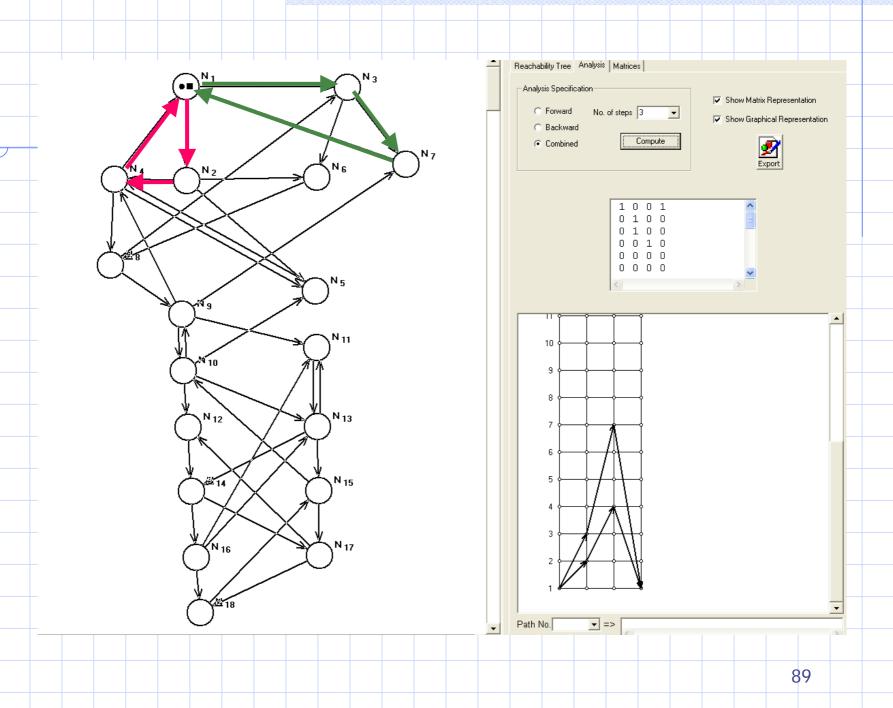




# The final solution

#### It is the same as in case II, i.e.:

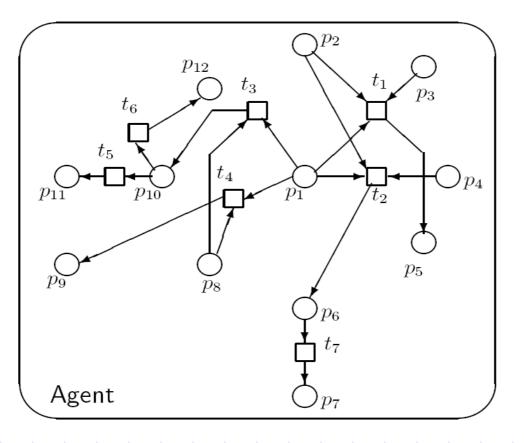




### Comparison of the approaches

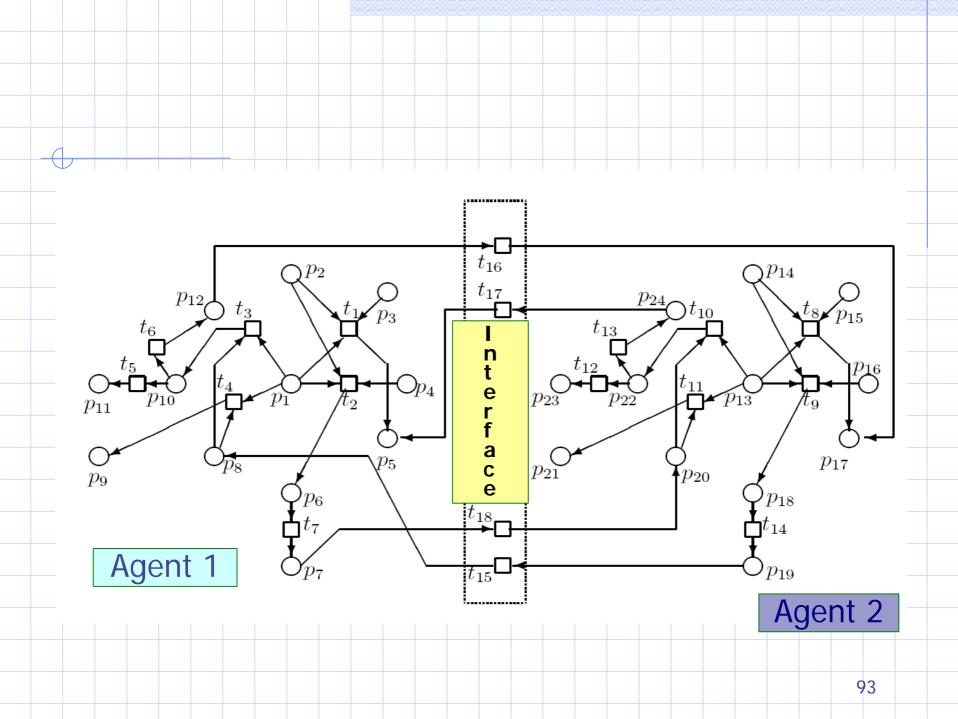
(I) The approach based on the intersection of the autonomous solutions is simple but multiplicative – i.e. the autonomous solution has to be found for any agent. In addition to this the process of the intersection has to be performed (II) The global approach solves the problem simultaneously, together with the interconnections among agents. It saves the computational time, but the problem dimensionality is greater (III) The approach based on invariants decreases (in comparison with (II)) the RG, in spite of the fact that it increases the number of the PN places (it adds the slacks) 90

# Modular approach to agents modelling



# Interpretation of PN places

p1 – A is free p11 – A is not able to help p2 – A has to solve a problem P p12 – A is able to help p3 – A is able to solve P p4 – A is not able to solve P p5 – P is solved p6 – A contacts another agent p7 – A asks another agent for help p8 – A is asked by another agent for help to solve its problem p9 – A refuses the help p10 – A accepts the request for help



#### Incidence matrix F of the PN model of MAS

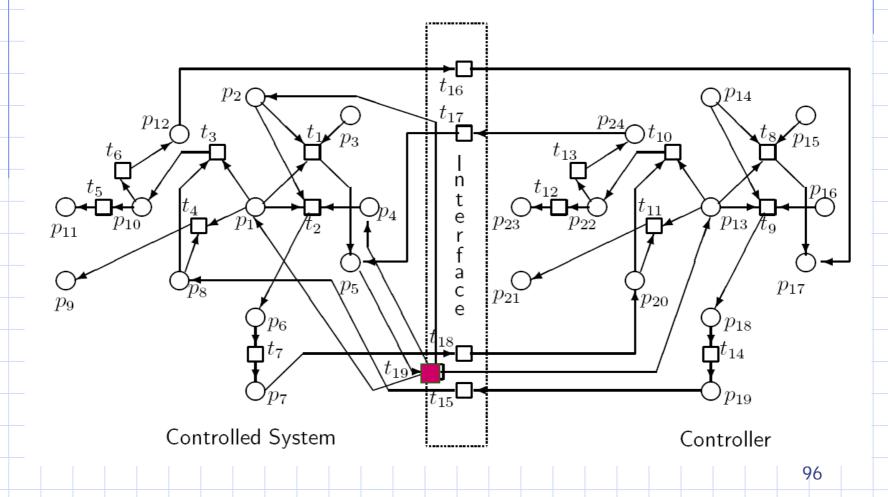
$$\mathbf{F} = egin{pmatrix} \mathbf{F}_1 & \mathbf{0} & \dots & \mathbf{0} & \mathbf{0} & \mid \mathbf{F}_{c_1} \ \mathbf{0} & \mathbf{F}_2 & \dots & \mathbf{0} & \mathbf{0} & \mid \mathbf{F}_{c_2} \ dots & dots & \ddots & dots &$$

#### Incidence matrix G of the PN model of MAS

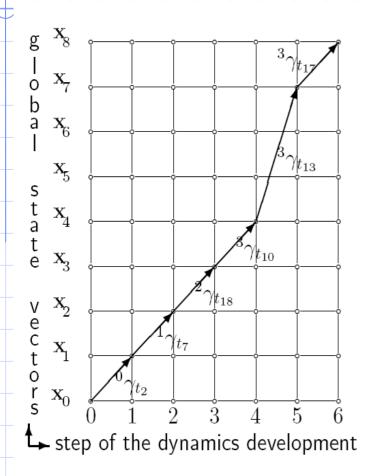
$$\mathbf{G} = \begin{pmatrix} \mathbf{G}_{1} & \mathbf{0} & \dots & \mathbf{0} & \mathbf{0} \\ \mathbf{0} & \mathbf{G}_{2} & \dots & \mathbf{0} & \mathbf{0} \\ \vdots & \vdots & \ddots & \vdots & & \vdots \\ \mathbf{0} & \mathbf{0} & \dots & \mathbf{G}_{N_{A}-1} & \mathbf{0} \\ \mathbf{0} & \mathbf{0} & \dots & \mathbf{0} & \mathbf{G}_{N_{A}} \\ \hline \mathbf{G}_{c_{1}} & \mathbf{G}_{c_{2}} & \dots & \mathbf{G}_{c_{N_{A}-1}} & \mathbf{G}_{c_{N_{A}}} \end{pmatrix}$$

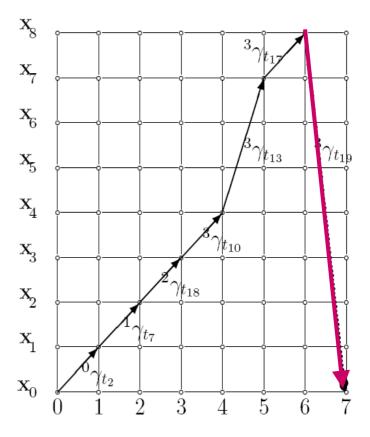
### The feedback control

#### A1 is the controlled system , A2 is the controller



The feedback

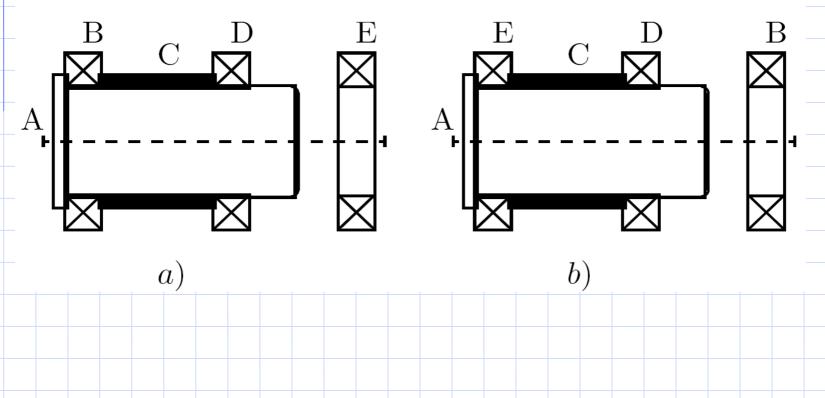




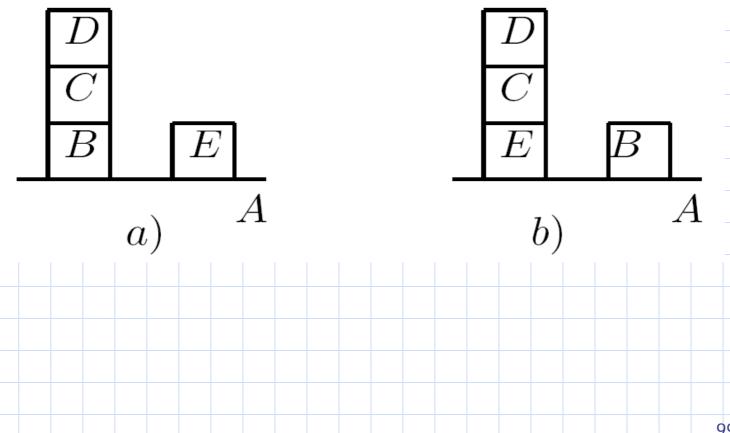
# Engineering applications of AI

Assembly & disassembly problem solving:

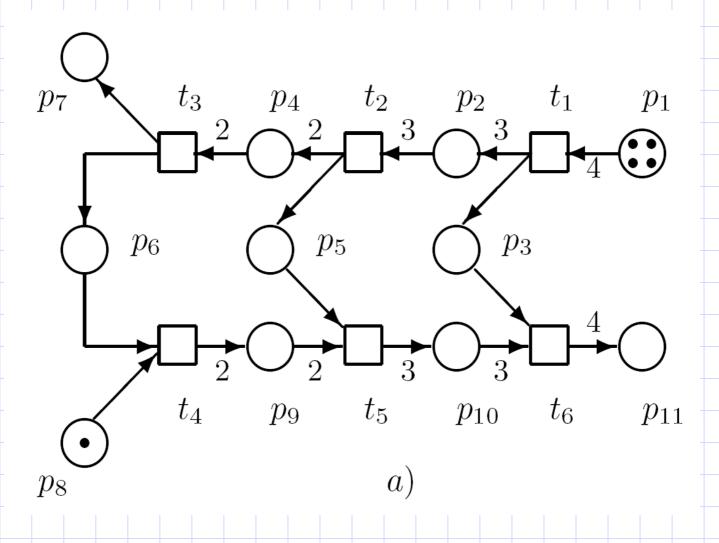
Exchange of the bad bearing B



# Utilizing the block world paradigm



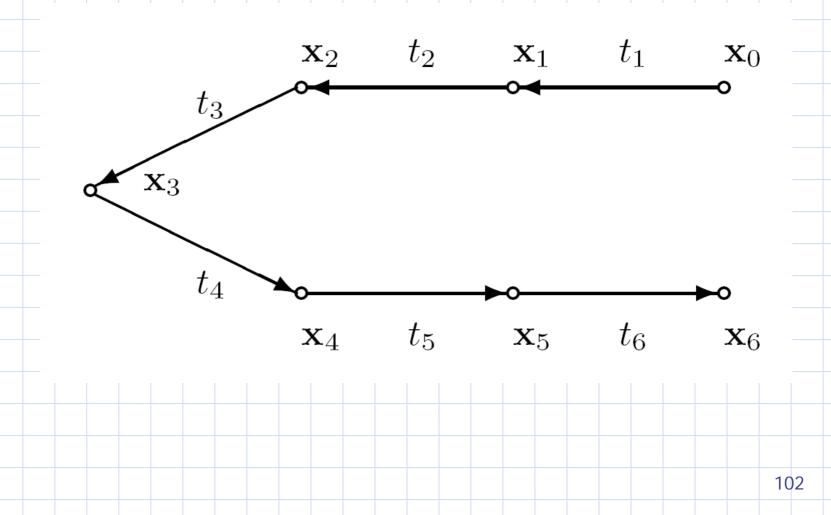
Petri net-based model



The interpretation of PN places

- p1 the initial configuration p10 – C is put on E p2 – D is disassembled p11 – D is put on C p3 – D is put aside p4 – C is disassembled p5 – C is put aside p6 – A is free of parts p7 – B is disassembled and put aside p8 – E is prepared for using
  - p9 E is put on A

The reachability graph

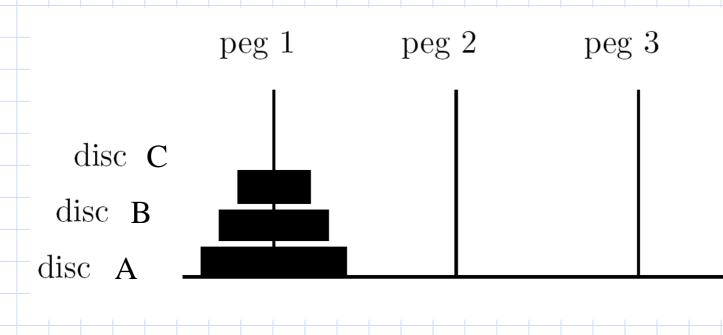


### The state space

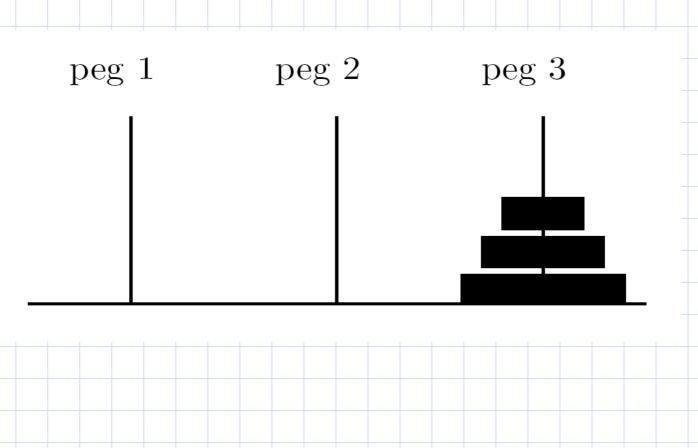
$$\mathbf{X}_{reach}^{blocks} =$$

# Utilizing the Hanoi tower paradigm

#### The initial state of the Hanoi tower puzzle



#### The terminal state of the Hanoi tower puzzle

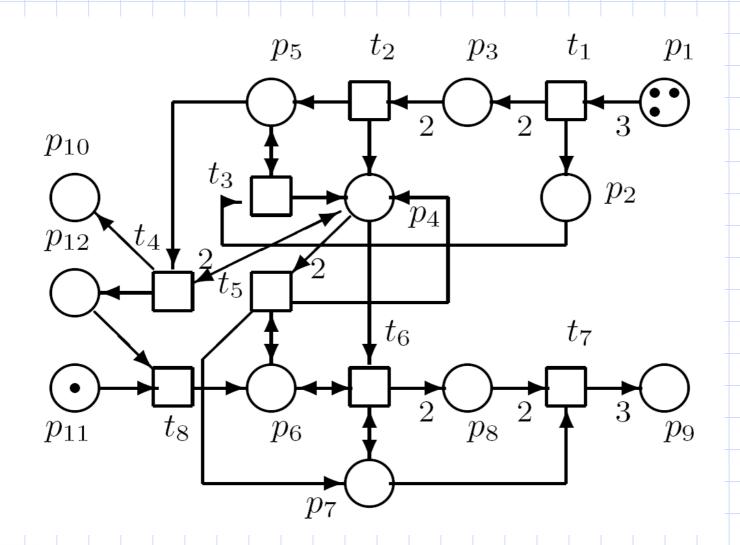


- Usage of this paradigm
- This paradigm can be utilized in assembly when
- the space for putting parts is limited
- the assembled parts have very different mass
- the parts are fragile, etc.

#### Comparing the puzzle and the assembly process

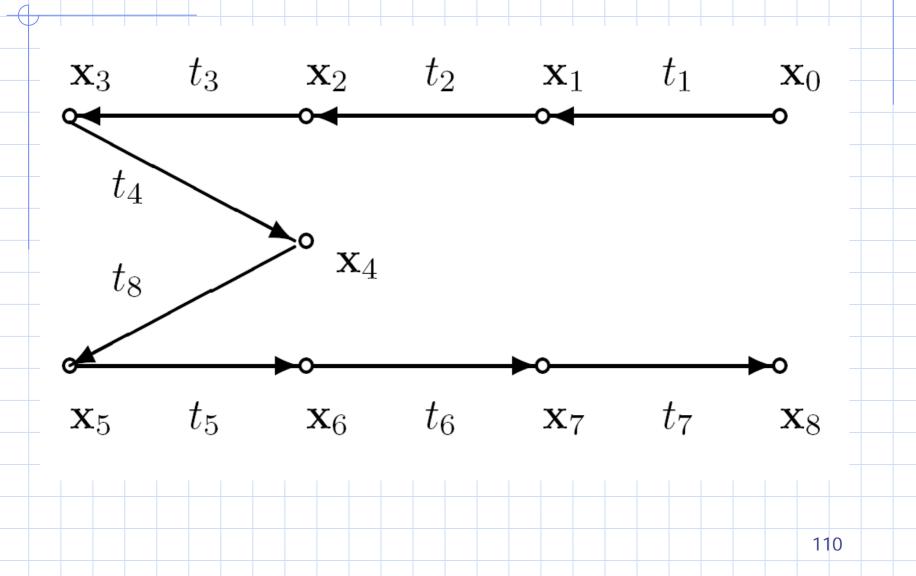
	Stop	Onicir	al Uana	; Towar	Stop	2000				
_	Step	Origin	nal Hano	1 Tower	Step	Assembly Process				
	1	peg 1	$\stackrel{disc}{\longrightarrow}^{C}$	$peg \ 3$	1	peg 1		$\stackrel{bearing}{\to} D$	$peg \ 3$	
	2	peg 1	$\stackrel{disc}{\longrightarrow} B$	peg 2	2	peg 1		$\stackrel{sleeve}{\rightarrow} ^{C}$	peg 2	
	3	peg 3	$\stackrel{disc}{\longrightarrow}^{C}$	peg 2	3	peg 3		$\stackrel{bearing}{\longrightarrow} D$	peg 2	
	4	peg 1	$\stackrel{disc}{\longrightarrow} A$	$peg \ 3$	4	peg 1		$\stackrel{bearing}{\longrightarrow} B$	eject bearing B	
	-	_	-		5	enter b	bearing E	$\stackrel{bearing}{\longrightarrow} E$	peg 3	
	5	peg 2	$\stackrel{disc}{\longrightarrow}^{C}$	peg 1	6	peg 2		$\stackrel{bearing}{\longrightarrow} D$	peg 1	
	6	peg 2	J := D	$peg \ 3$	7	peg 2		$\stackrel{sleeve}{\longrightarrow} ^{C}$	peg 3	
	7		$\stackrel{disc}{\longrightarrow} ^{C}$		0	nor 1		bearing D	n	
	(	peg 1	$\rightarrow$	$peg \ 3$	8	peg 1		$\rightarrow$	peg 3	

The PN-based model



### The interpretation of the PN-places

- p1 the initial configuration p10 B is ejected
- p2 D is put on (symbolic) peg 1 p11 E is available
- p3 the configuration without D p12 A is free of parts
- p4 the situation on the peg 2
- p5 the configuration without C
- p6 E is put on A
- p7 D is added
- p8 C is added
- p9 the final configuration



## The state space

 $\mathbf{2}$  $\mathbf{2}$ 

 $\mathbf{X}_{reach}^{Hanoi}$ 

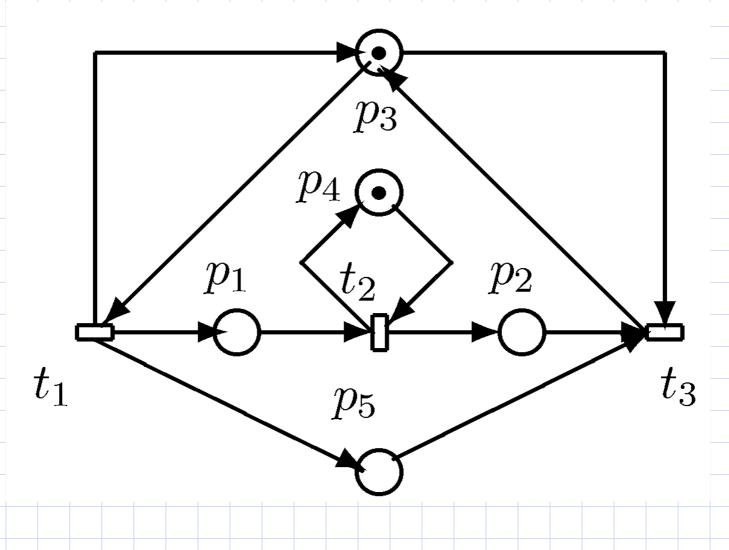
## The flexible manufacturing system

Consider the robotic cell with two conveyors C1, C2, the NC-machine M, with the buffer B (having the input part B1 and the output part B2), and the robot R.

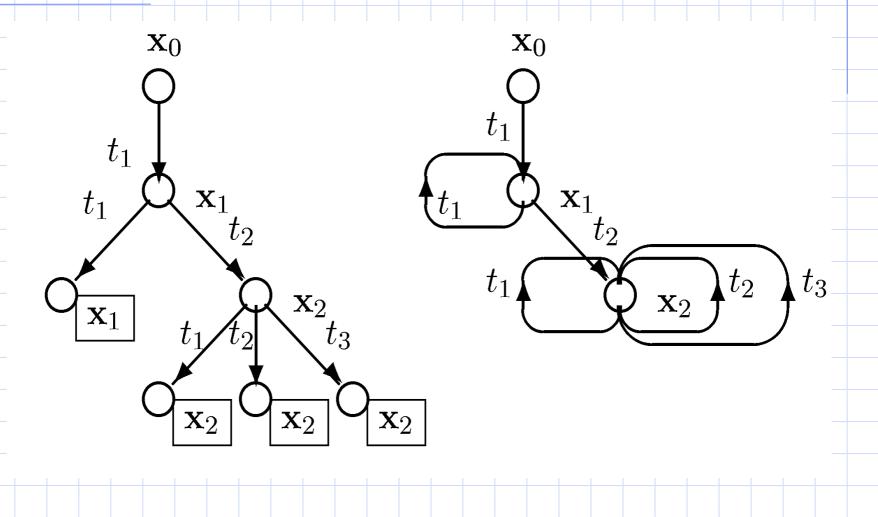
Defining the PN places and transitions:

p1 = waiting the input partst1 = taking from C1 by Rp2 = waiting the output partst2 = machining by Mp3 = R is availablet3 = putting on C2 by Rp4 = M is available $rac{1}{2} =$  machining by Rp5 = contents of B $rac{1}{2} =$  machining by R

### The PN-based model of the FMS



### The reachability tree and reachability graph



The model parameters

$$\mathbf{F} = \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 1 & 0 & 1 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \mathbf{G} = \begin{pmatrix} 1 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 & 0 \end{pmatrix}$$

The RT and state space

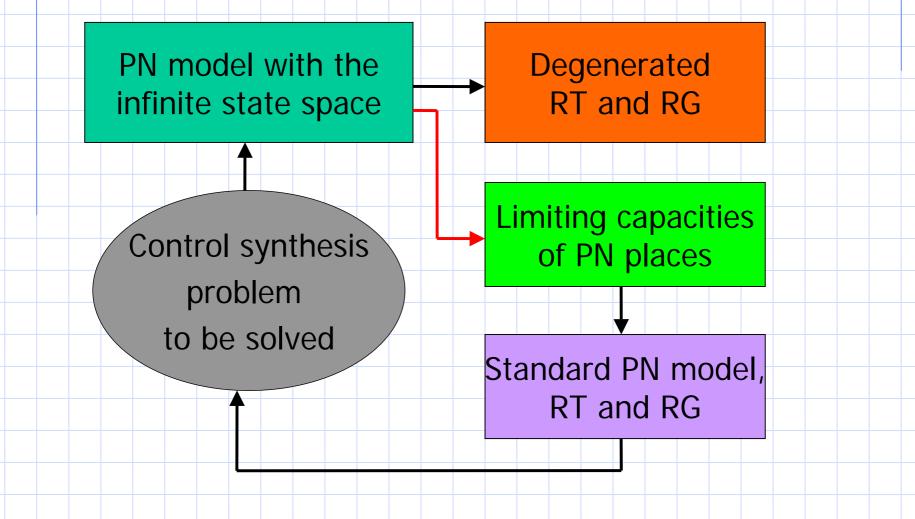
$$\mathbf{A}_{k} = \begin{pmatrix} 0 & 1 & 0 \\ 0 & 1 & 2 \\ 0 & 0 & (1, 2, 3) \end{pmatrix} \mathbf{\Delta}_{k} = \begin{pmatrix} 0 & 0 & 0 \\ t_{1} & t_{1} & 0 \\ 0 & t_{2} & (t_{1}, t_{2}, t_{3}) \end{pmatrix}$$

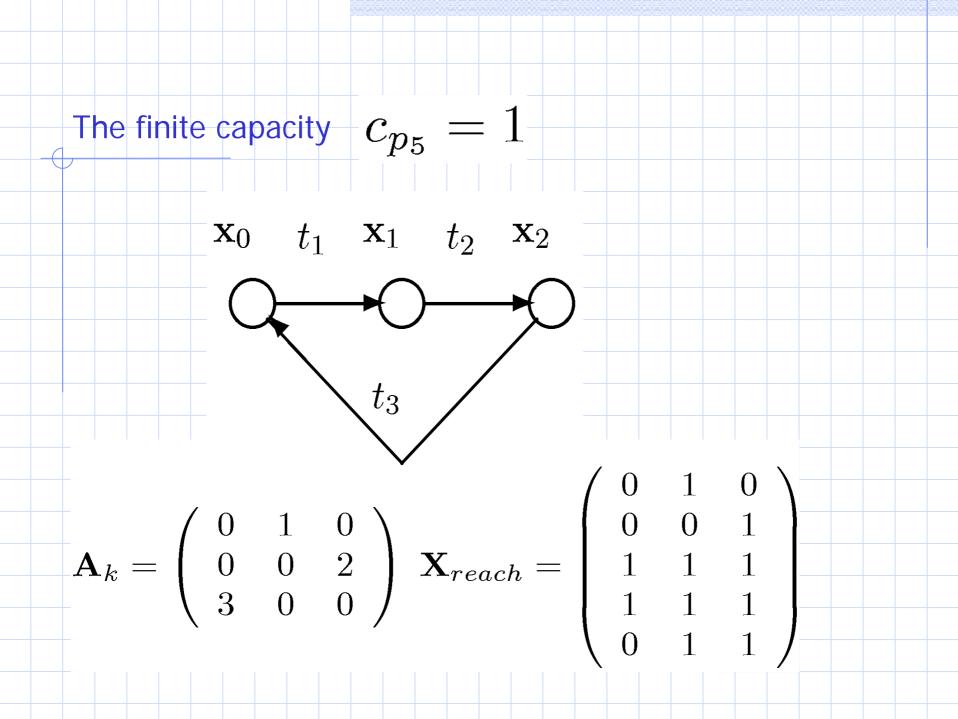
### The ambiguity and how to deal with it

When the capacities of places are infinite the ambiguity occurs in the matrix A. Namely, the cycles engender in the RT and RG. The state space of the reachable states is infinite. Infinity is expressed by the symbol  $\omega$ 

Hence, in order to find a reasonable solution, the finite capacities of the PN places have to be determined.

## Dealing with the ambiguity

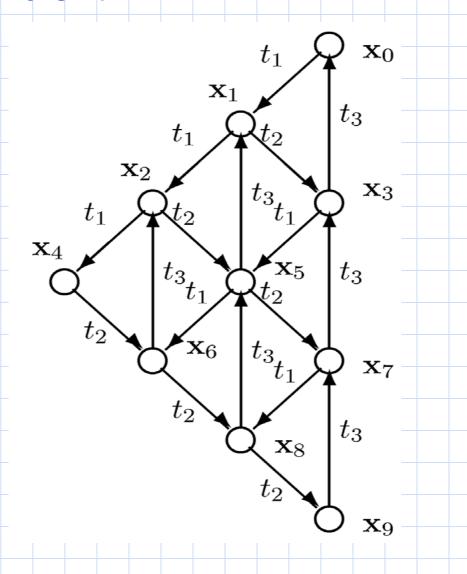




# The finite capacities $c_{p_i} = 3, i = 1, 2, 5$

()() () ()U  $\mathbf{2}$  $\mathbf{A}_k$  $\mathbf{0}$  $\mathbf{2}$  $\mathbf{0}$ () N 

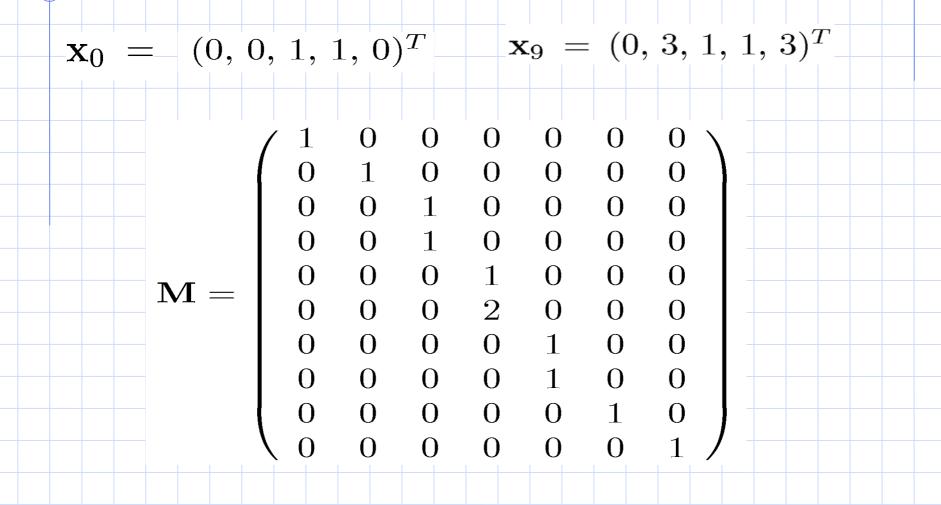
### The reachability graph



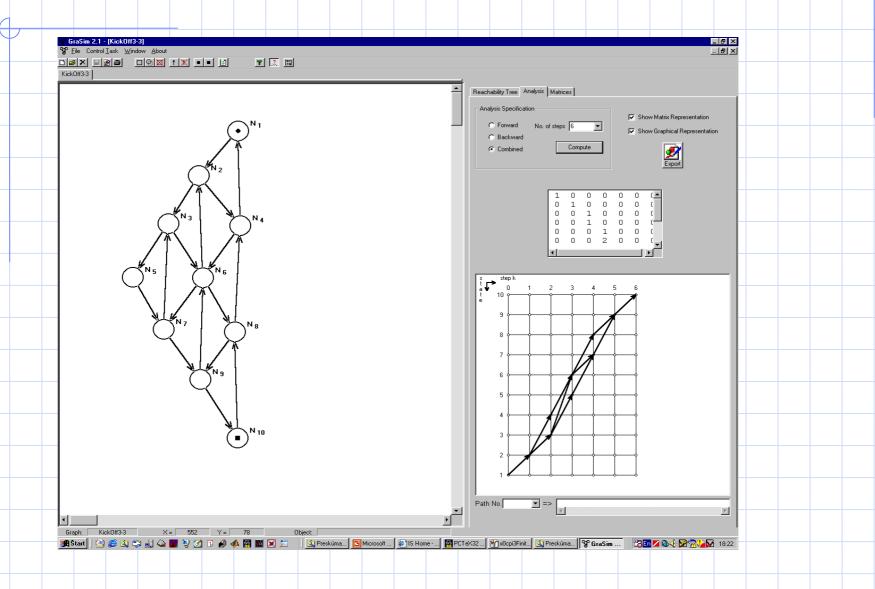
#### The state space of reachable states

# 

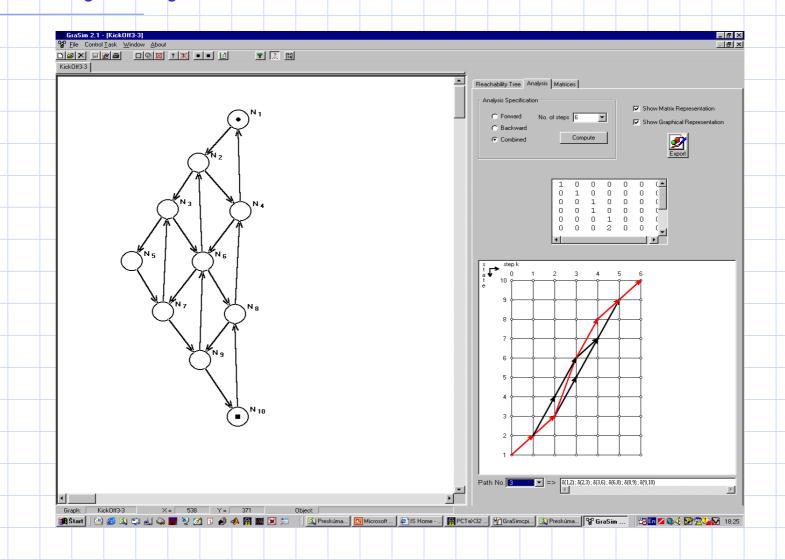
The control synthesis



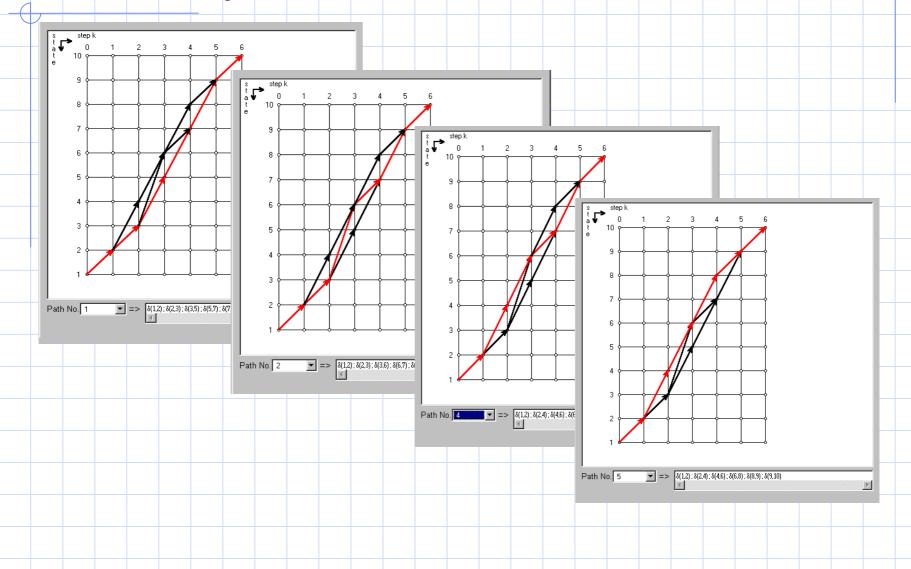
### Using the system GraSim



### The trajectory No. 3



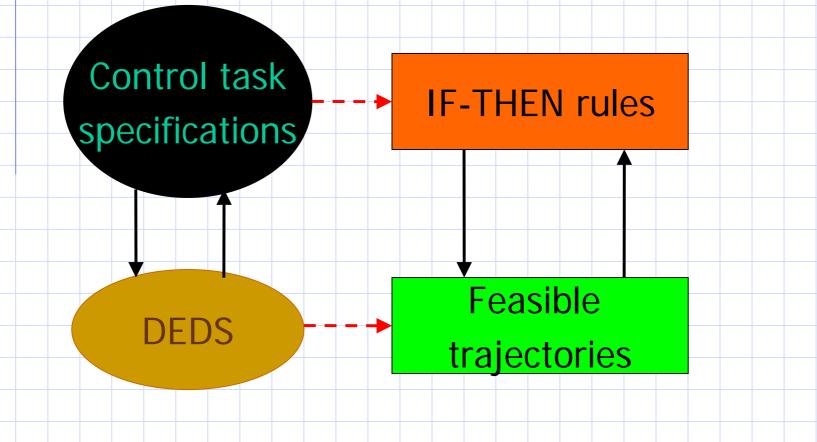
### The other trajectories



# Intelligent control synthesis

**DEDS** control task specifications are usually given in nonanalytical terms, often only verbally. To choose the most suitable trajectory knowledge-based approaches must be used. The knowledge base (KB) expressing the control task specifications in the form of IF-THEN rules can be modelled by means of the logical and/or fuzzy PN. Thus, the KB can be expressed in analytical terms.

### Knowledge-based choice of the trajectory



# Conclusions

Simple general method of DEDS modelling, analyzing and control synthesis was presented Its applicability to different kinds of systems  $\diamond$ was demonstrated A simple general method for agent-based  $\diamond$ problem solving was presented Its applicability to solving the problem of the DES control synthesis was demonstrated

Three different approaches to the control synthesis of the same DES were illustrated on the example:

- Mutual intersection of autonomous solutions of the elementary agents
- Solving the global problem in the whole Utilizing the invariants of Petri net-based

model

The approaches were compared and evaluated.

## and finally,

 Several engineering applications were presented to illustrate the applicability
 of the approach

# Future work on this way

 To innovate presented methods permanently
 To extend its reasonable applicability for larger and larger class of DES able to be modelled by Petri nets
 To find new methods, procedures and tools for DEDS modelling, analyzing and control