

# PATHWAY ANALYSIS OF BIOCHEMICAL NETWORKS WITH PETRI NETS

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## CONTENTS

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### BASIC NOTIONS

- ❑ proper T-invariants                          -> Pascoletti 1986
- ❑ minimal T-invariants                          -> Lautenbach 1973
- ❑ elementary modes                                  -> Schuster 1991
- ❑ extreme pathways                                  -> Schilling, Schuster, Palson 1999
- ❑ generic pathways                                  -> Bockmayr 2005

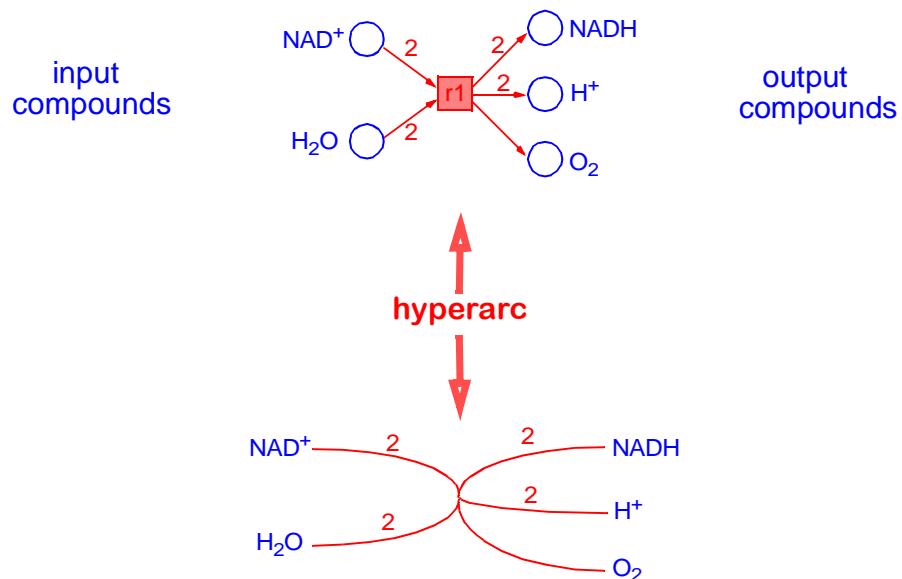
### MODULAR COMPUTATION

- ❑ approach    -> Zaitsev 2005
- ❑ (preliminary) results                                  -> Lehrack 2006 (to appear)

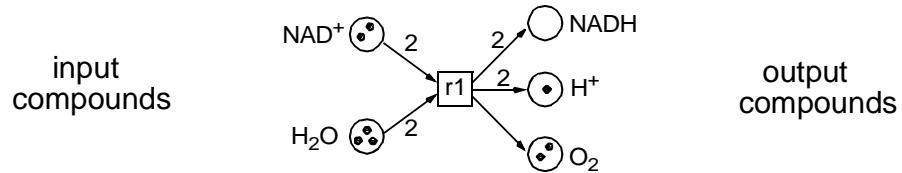
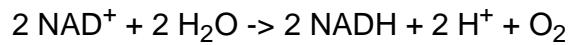
# PETRI NETS - BASICS

## PETRI NETS, BASICS - THE STRUCTURE

□ atomic actions      -> Petri net transitions      -> chemical reactions

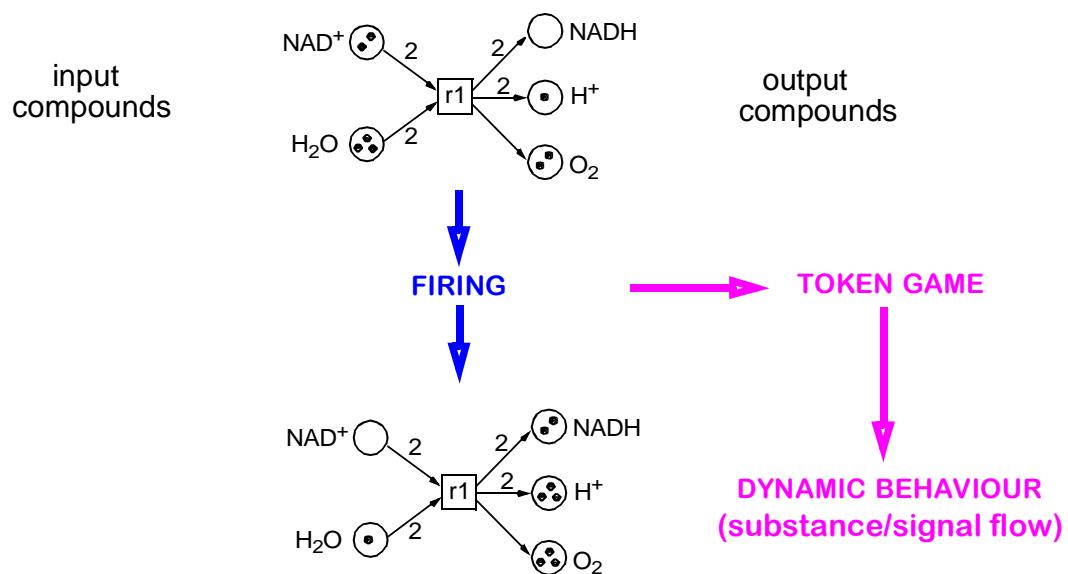
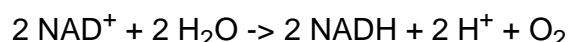


□ atomic actions → Petri net transitions → chemical reactions



- local conditions → Petri net places → chemical compounds
- multiplicities → Petri net arc weights → stoichiometric relations
- condition's state → token(s) in its place → available amount (e.g. mol)
- system state → marking → compounds distribution
- $\text{PN} = (\text{P}, \text{T}, \text{F}, \text{m}_0)$ ,  $\text{F}: (\text{P} \times \text{T}) \cup (\text{T} \times \text{P}) \rightarrow \text{N}_0$ ,  $\text{m}_0: \text{P} \rightarrow \text{N}_0$

□ atomic actions → Petri net transitions → chemical reactions



□ **biochemical networks**

-> *networks of (abstract) chemical reactions*

□ **biochemically interpreted Petri net**

-> *partial order sequences of chemical reactions (= elementary actions)  
transforming input into output compounds / signals  
[ respecting the given stoichiometric relations, if any ]*

-> *set of all pathways*

*from the input to the output compounds / signals  
[ respecting the stoichiometric relations, if any ]*

□ **pathway**

-> *self-contained partial order sequence of elementary (re-) actions*

# INVARIANT ANALYSES

## INCIDENCE MATRIX C

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- a representation of the net structure

=> stoichiometric matrix

P \ T	t1	...	tj	...	tm
p1					
pi			cij		
:					
pn			$\Delta t_j$		

$$c_{ij} = (p_i, t_j) = F(t_j, p_i) - F(p_i, t_j) = \Delta t_j(p_i)$$

$$\Delta t_j = \Delta t_j(*)$$

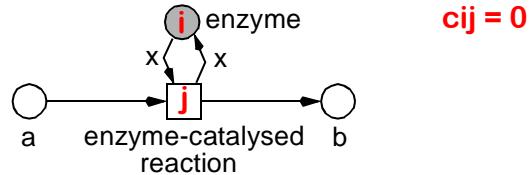
- matrix entry  $c_{ij}$ :

token change in place  $p_i$  by firing of transition  $t_j$

- matrix column  $\Delta t_j$ :

vector describing the change of the whole marking by firing of  $t_j$

- side-conditions are neglected



## T-INVARIANTS, BASICS I

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- Lautenbach, 1973

- T-invariants

-> integer solutions  $x$  of  $Cx = 0, x \neq 0, x \geq 0$

-> multisets of transitions

-> Parikh vector

- minimal T-invariants

-> there is no T-invariant with a smaller support

-> sets of transitions

-> gcd of all entries is 1

- any T-invariant is a non-negative linear combination of minimal ones

-> multiplication with a positive integer

$$kx = \sum_i a_i x_i$$

-> addition

-> Division by gcd

- Covered by T-Invariants (CTI)

-> each transition belongs to a T-invariant

- ❑ a T-invariant defines a subnet -> partial order structure
    - > the T-invariant's transitions (the support),  
+ all their pre- and post-places  
+ the arcs in between
    - > pre-sets of supports = post-sets of supports

## -> ANALOGUE DEFINITIONS FOR P-INVARIANTS

$$yC = 0, y \neq 0, y \geq 0$$

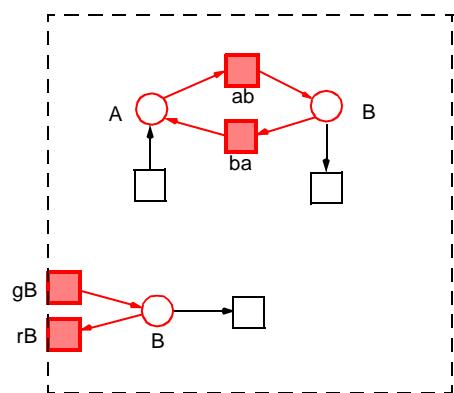
- T-invariants = (multi-) sets of transitions = Parikh vector
    - > zero effect on marking
    - > reproducing a marking / system state
  - partially ordered transition sequence      -> behaviour understanding of transitions occurring one after the other
    - > substance / signal flow
    - > signal transduction networks, gene regulatory networks
  - relative transition firing rates of transitions occurring permanently & concurrently
    - > steady state behaviour
    - > metabolic networks

□ trivial minimal T-invariants

- > *reversible reactions*
- > *boundary transitions* of auxiliary compounds

□ non-trivial minimal T-invariants

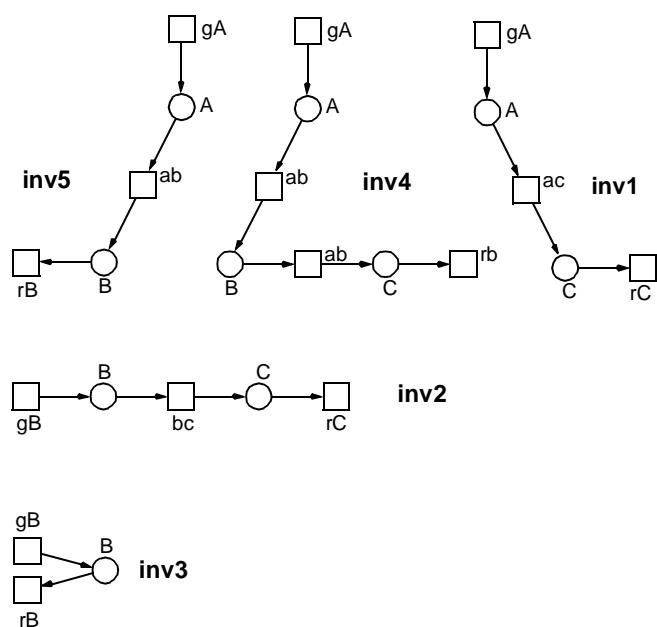
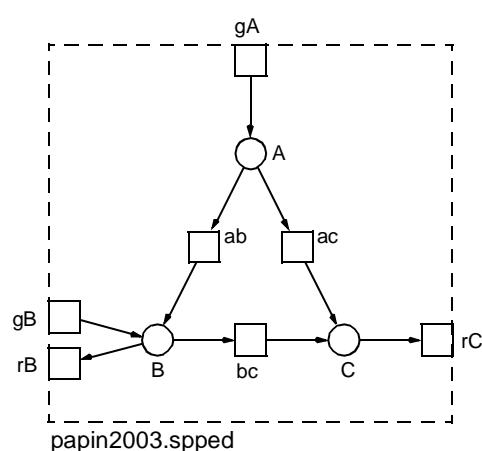
- > *i/o-T-invariants*  
covering boundary transitions of input / output compounds
- > *inner cycles*



## EXAMPLE, T-INVARIANTS

□ substances involved

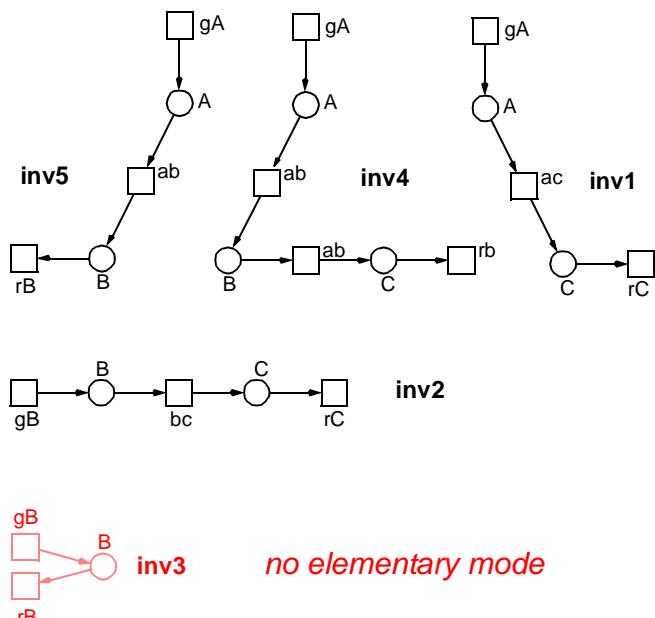
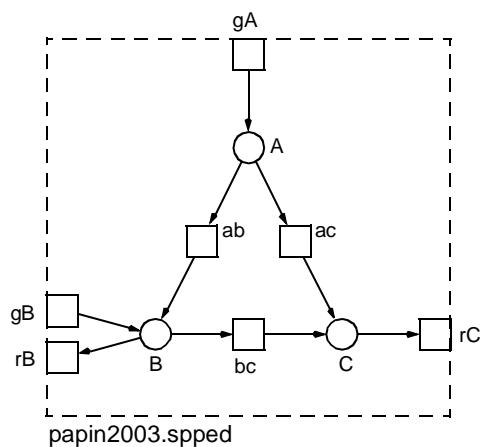
- > *input substance A*
- > *output substance C*
- > *auxiliary substance B*



## EXAMPLE, ELEMENTARY MODES

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- substances involved
  - > *input substance A*
  - > *output substance C*
  - > *auxiliary substance B*



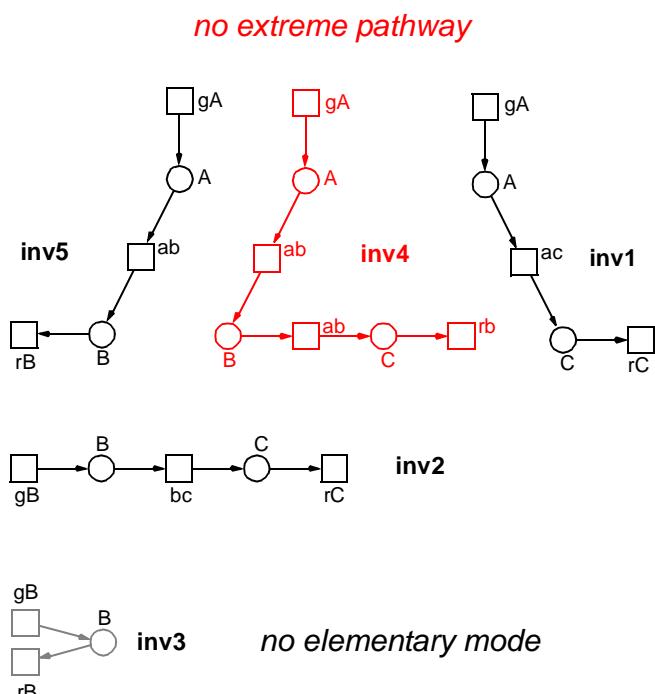
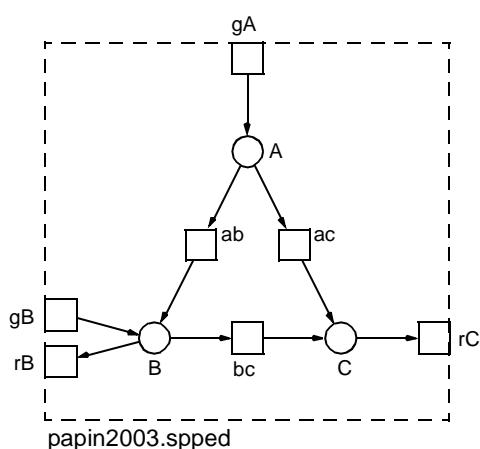
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## EXAMPLE, EXTREME PATHWAYS

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- substances involved
  - > *input substance A*
  - > *output substance C*
  - > *auxiliary substance B*



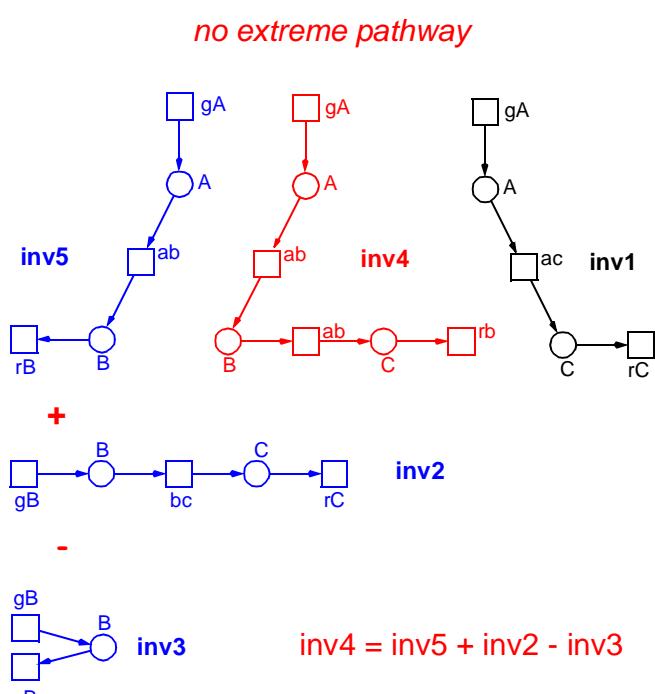
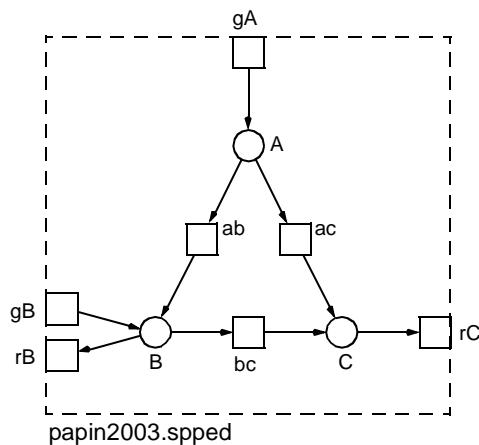
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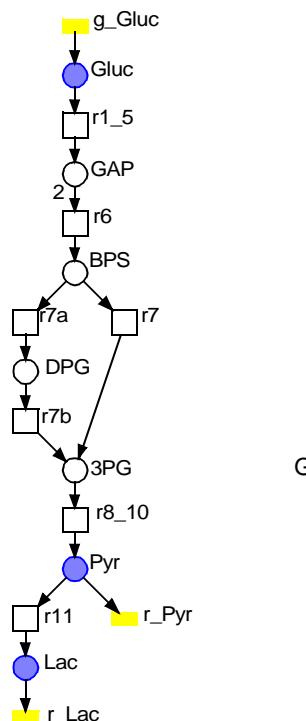


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## ELEMENTARY T-INVARIANTS / HILBERT BASIS

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four minimal T-invariants

1. Gluc  $\rightarrow$  r7  $\rightarrow$  2 Pyr
2. Gluc  $\rightarrow$  r7  $\rightarrow$  2 Lac
3. Gluc  $\rightarrow$  r7a, r7b  $\rightarrow$  2 Pyr
4. Gluc  $\rightarrow$  r7a, r7b  $\rightarrow$  2 Lac

$$\text{Gluc} \rightarrow \begin{bmatrix} r7 \\ r7a, r7b \end{bmatrix} \rightarrow \begin{bmatrix} 2 \text{ Lac} \\ 2 \text{ Pyr} \end{bmatrix}$$

five additional T-invariants

$$\begin{aligned} \text{inv5} &= (\text{inv1} + \text{inv3}) / 2 \\ \text{inv6} &= (\text{inv2} + \text{inv4}) / 2 \\ \text{inv7} &= (\text{inv1} + \text{inv2}) / 2 \\ \text{inv8} &= (\text{inv3} + \text{inv4}) / 2 \end{aligned}$$

$$\text{inv9} = (\text{inv1} + \text{inv2} + \text{inv3} + \text{inv4}) / 4$$

$$\text{Gluc} \rightarrow \begin{bmatrix} r7 \\ r7a, r7b \end{bmatrix} \rightarrow \begin{bmatrix} 1 \text{ Lac} \\ 1 \text{ Pyr} \end{bmatrix}$$

$$kx = \sum_i a_i x_i$$

$$x = \sum_i a_i x_i$$

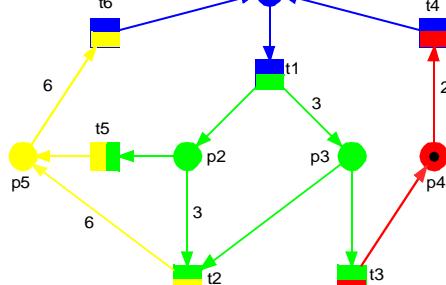
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# MODULAR COMPUTATION

## BASIC IDEA

- ❑ decomposition into subnets
- ❑ for each subnet: computation of (local) invariants
- ❑ computation of interface invariants
- ❑ calculation of system invariants
  - > by composition of subnet invariants
  - > guided by interface invariants



*subnet - transition-bordered conflict cluster C, defined by its places*

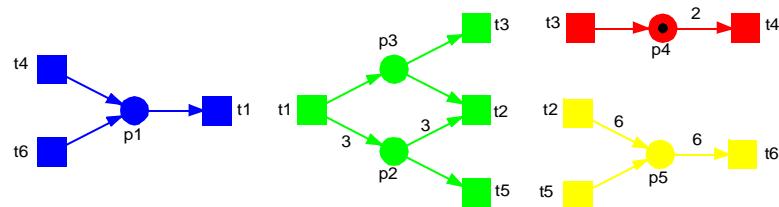
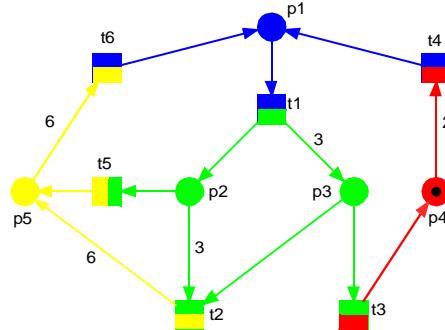
*all postplaces of input transitions belong to C  
all preplaces of output transitions belong to C*

*each interface transition has at most  
- one input subnet  
- one output subnet*

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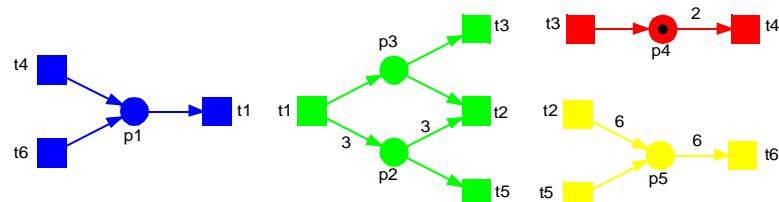
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$$\begin{aligned}
 x_1 &= (t_4, t_1) \\
 x_2 &= (t_6, t_1) \\
 x_3 &= (t_1, t_2) \\
 x_4 &= (t_1, t_3, 3t_5) \\
 x_5 &= (2t_3, t_4) \\
 x_6 &= (t_2, t_6) \\
 x_7 &= (6t_5, t_6)
 \end{aligned}$$



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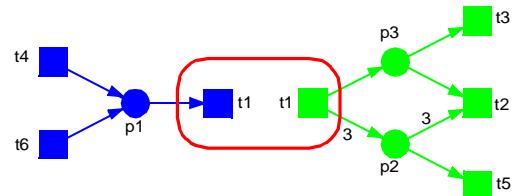
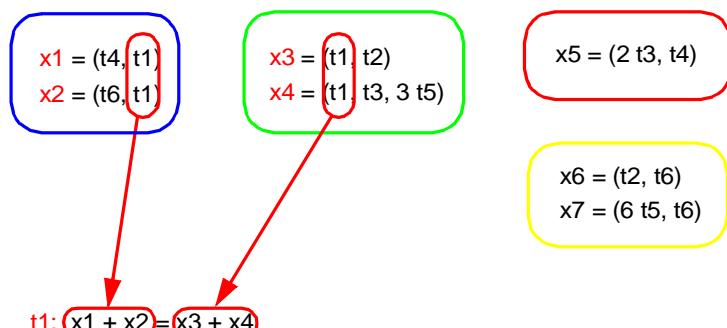
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FOR EACH CONTACT TRANSITION



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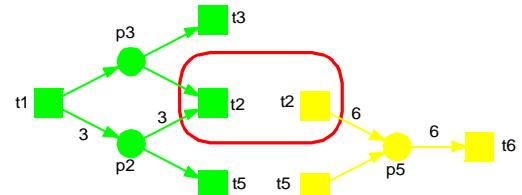
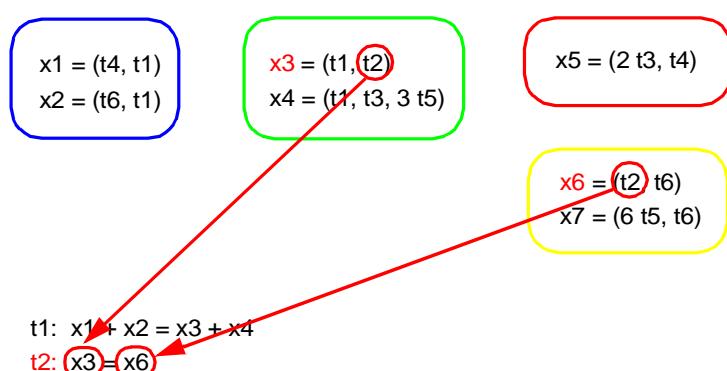
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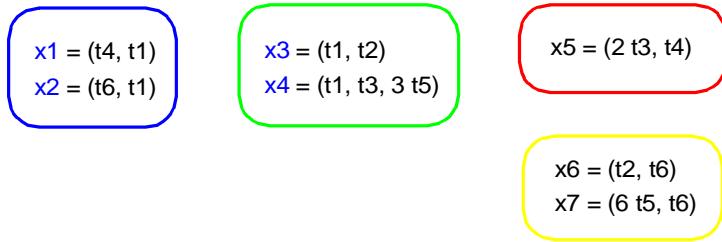
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$$\begin{array}{ll}
 \text{t1: } x_1 + x_2 = x_3 + x_4 & \longrightarrow \\
 \text{t2: } x_3 = x_6 & (x_2, x_3, x_6) \\
 \text{t3: } x_4 = 2 x_5 & (x_1, x_2, 2 x_4, x_5, x_7) \\
 \text{t4: } x_5 = x_1 & \\
 \text{t5: } 3 x_4 = 6 x_7 & \\
 \text{t6: } x_6 + x_7 = x_2 &
 \end{array}$$

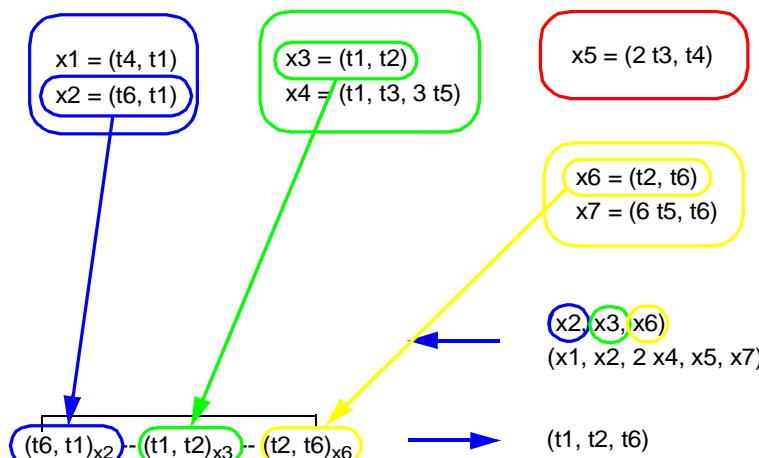
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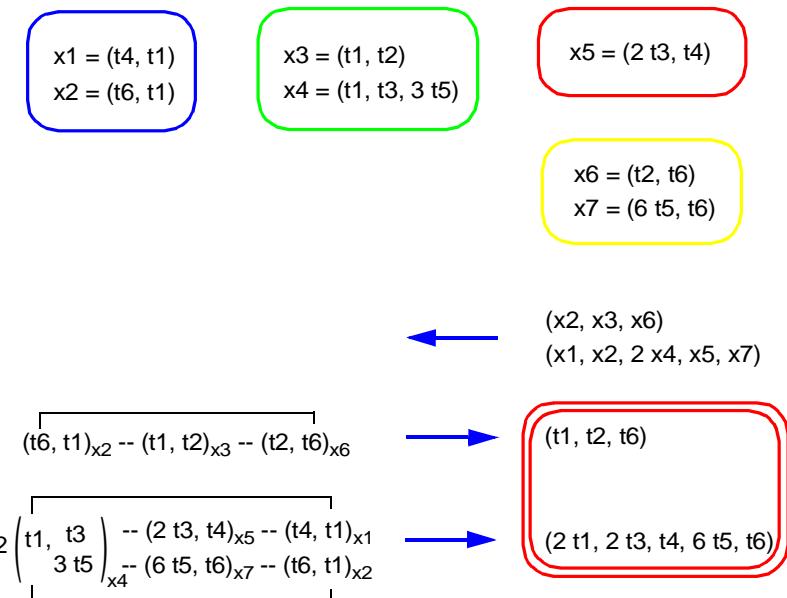
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## (PRELIMINARY) SUMMARY

### ASSUMPTION

- the solution of many small systems is less time/space consuming than the solution of a single larger one

### MAJOR (KNOWN) DRAWBACK

- the computation of system invariants does not only produce minimal invariants

### CASE STUDIES

- > excel file

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# THANKS !

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