

Qualitative Modelling of Regulated Metabolic Pathways: Application to the Tryptophan Biosynthesis in *E. coli*

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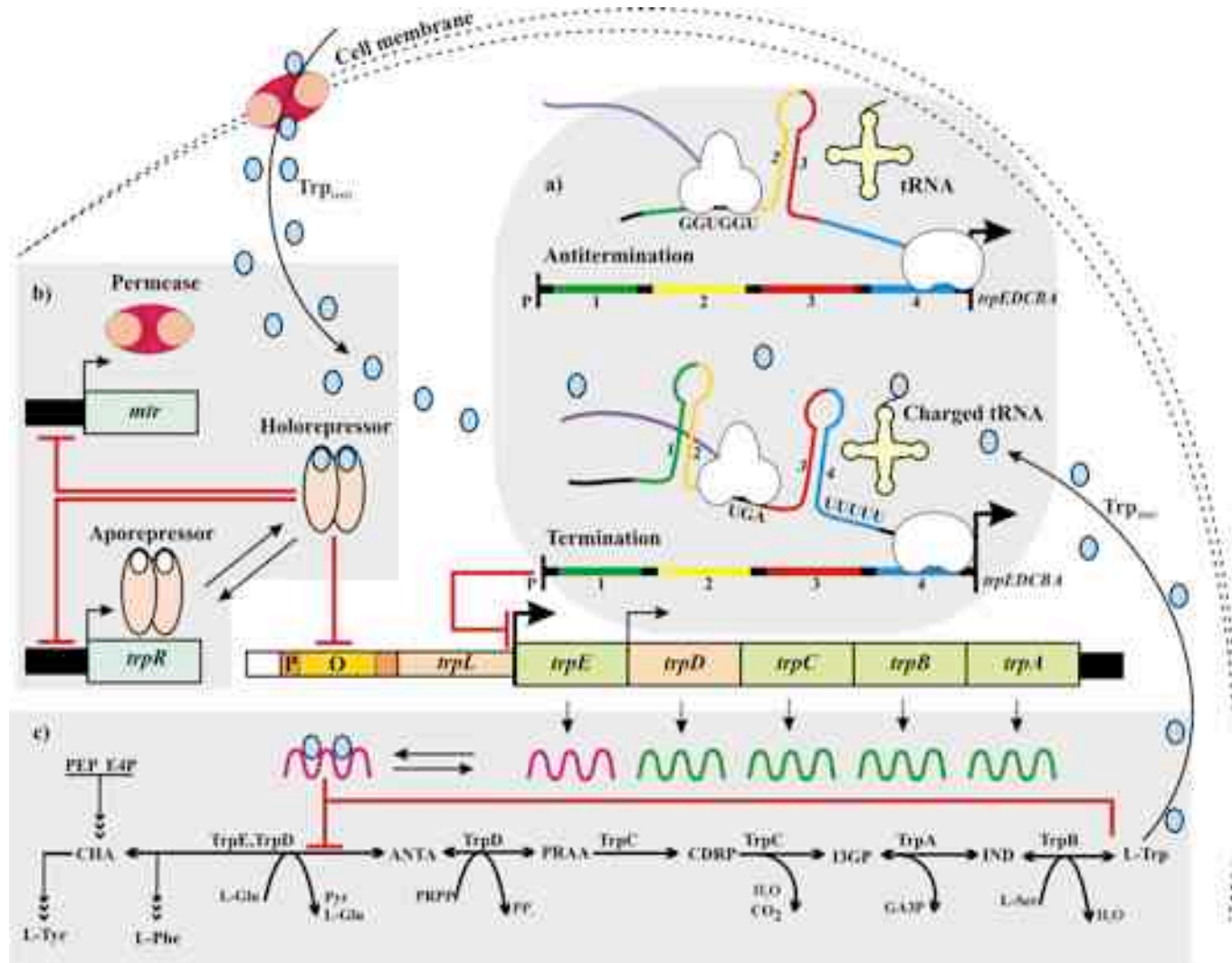
Outline

- Motivation
- Petri nets, basics
- PN representation of *logical* regulatory networks

- Integrated modelling of the regulated Trp biosynthesis in *E. coli*

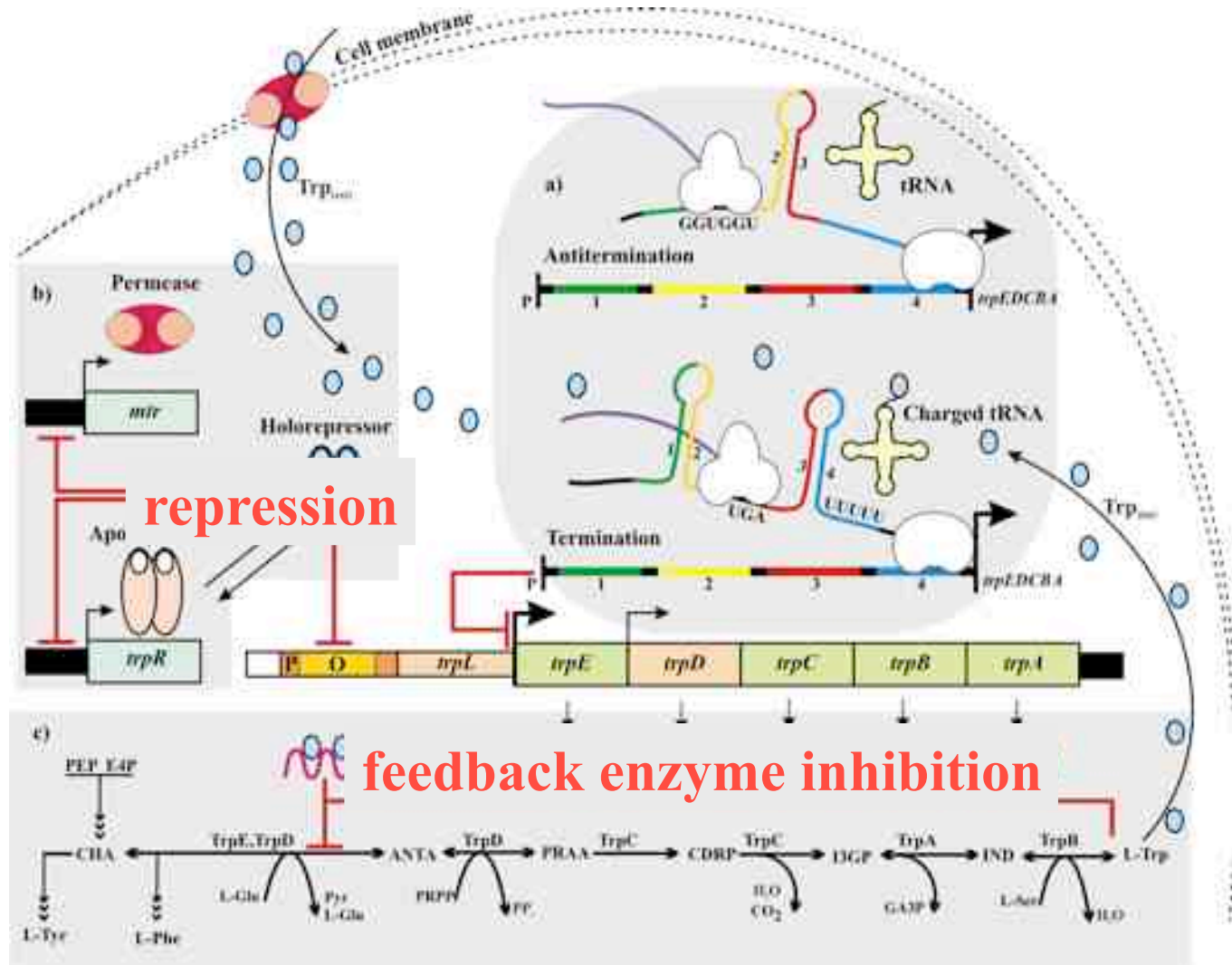
Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*



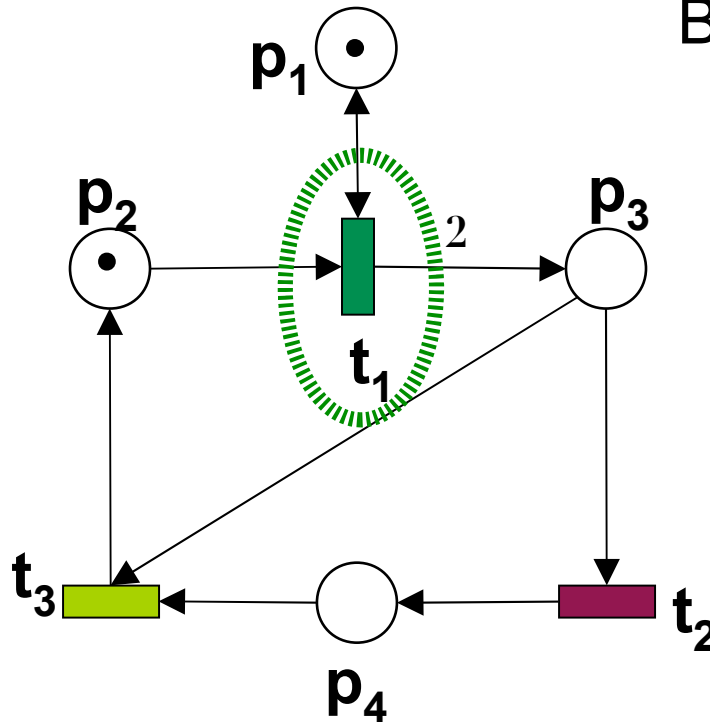
Integrated modelling of regulated metabolic pathways

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Petri net basics

Bipartite graph: places and transitions



- places resources
- marking state (number of tokens)
- transitions events
- weighted arcs connecting places \leftrightarrow transitions
- token game evolution of the system

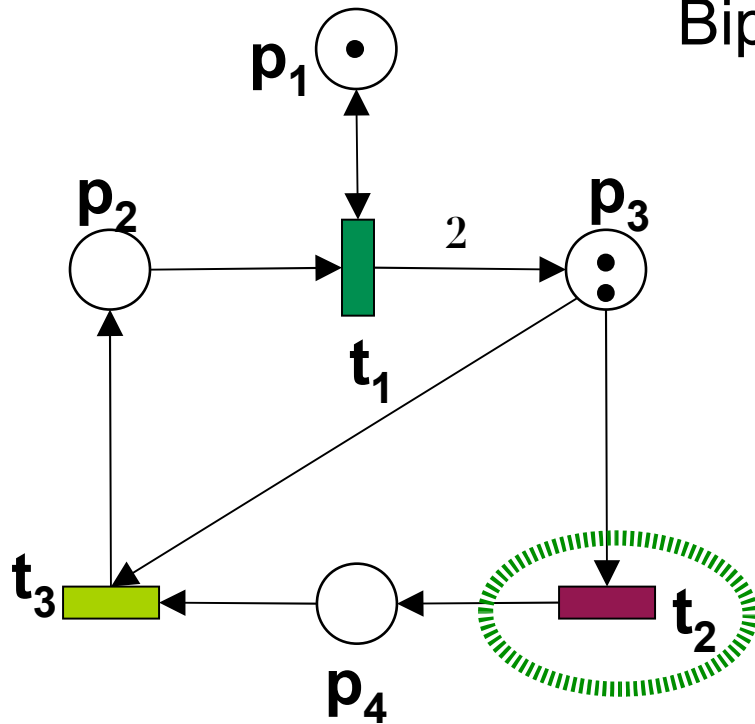
Transition t is **enabled** if its input places are *sufficiently* marked

The **firing** of t leads to the required

- 1/ consumption of tokens of input places
- 2/ production of tokens in output places

Petri net basics

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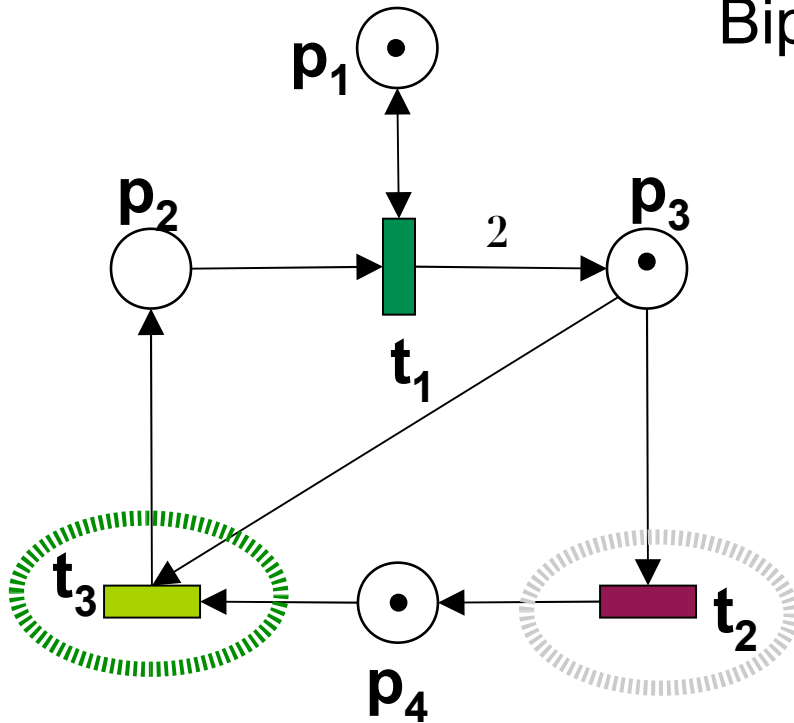
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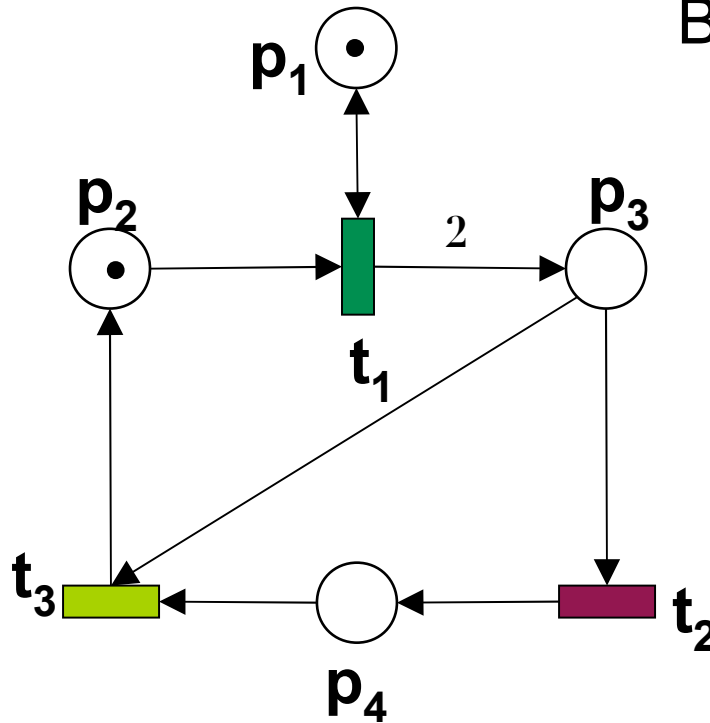
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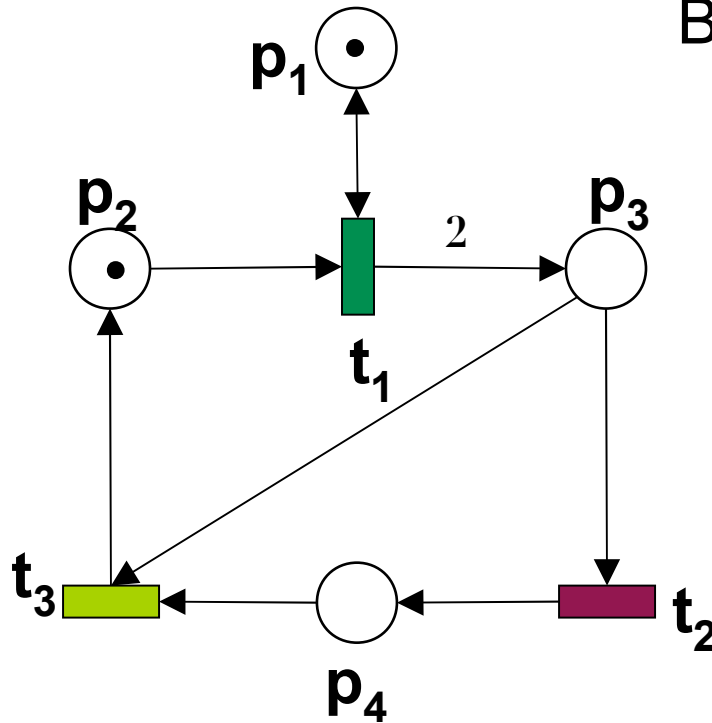
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Petri net basics

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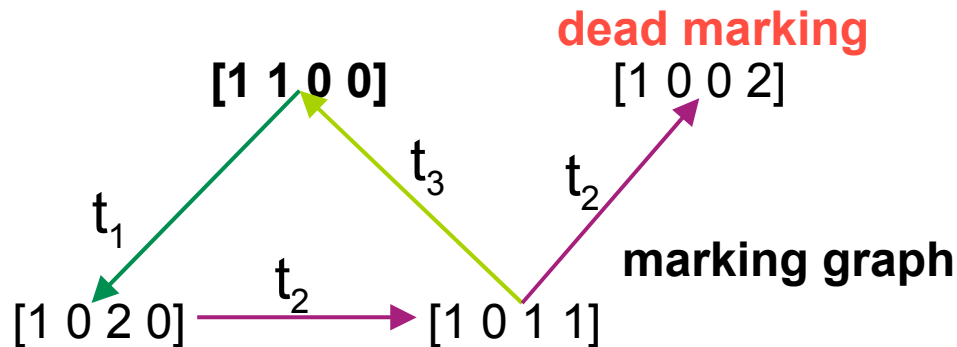


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- marking → state (number of tokens)
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- weighted arcs connecting places ü transitions
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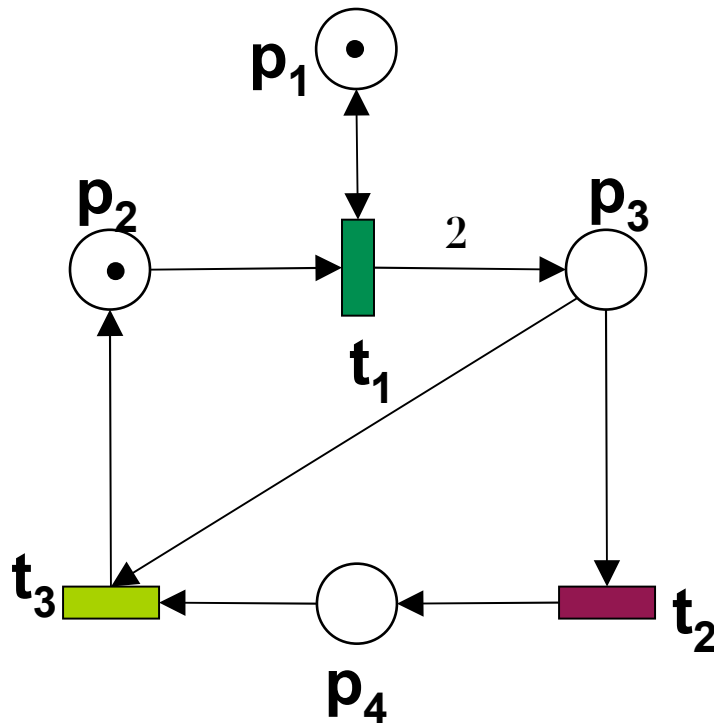
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The **firing** of t leads to the required

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Petri net basics



Mathematical representation

$$M_0 = \begin{bmatrix} 1 \\ 1 \\ 0 \\ 0 \end{bmatrix} \quad \begin{array}{l} \text{Initial} \\ \text{marking} \end{array}$$

$$Pre = \begin{bmatrix} 1 & 0 & 0 \\ 1 & 0 & 0 \\ 0 & 1 & 1 \\ 0 & 0 & 1 \end{bmatrix}$$

$$Post = \begin{bmatrix} 1 & 0 & 2 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 \end{bmatrix}$$

PxT IN

TxP IN

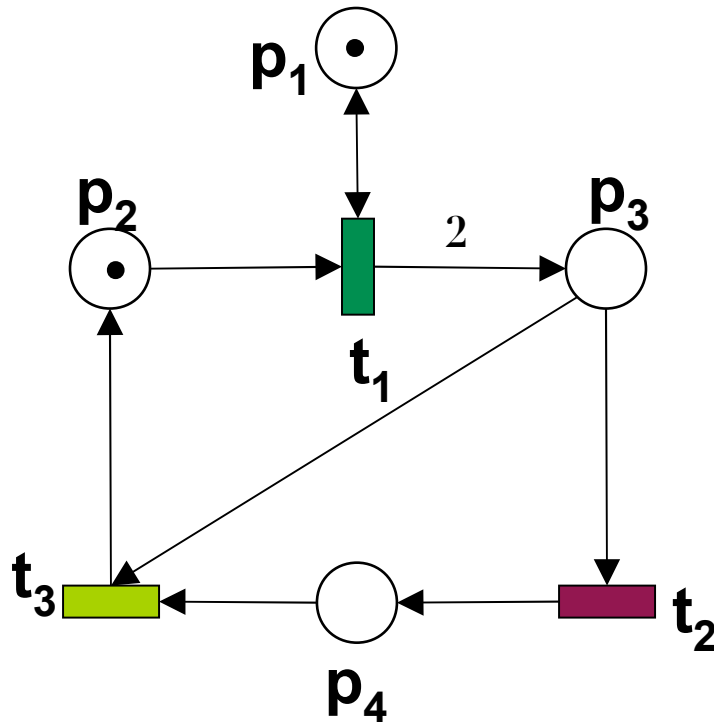
Incidence matrix
(PxT IN)

$$C = Post^T - Pre = \begin{bmatrix} 0 & 0 & 0 \\ -1 & 0 & 1 \\ 2 & -1 & -1 \\ 0 & 1 & -1 \end{bmatrix}$$

$$\begin{array}{l} [1 \ 1 \ 0 \ 0] \\ \swarrow t_1 \\ [1 \ 0 \ 2 \ 0] \end{array}$$

$$M_1 = M_0 + C \begin{bmatrix} 1 \\ 0 \\ 0 \\ 0 \end{bmatrix} = \begin{bmatrix} 1 \\ 0 \\ 2 \\ 0 \end{bmatrix}$$

Petri net basics



Mathematical representation

$$M_0 = \begin{bmatrix} 1 \\ 1 \\ 0 \\ 0 \end{bmatrix} \quad \text{Initial marking}$$

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TxP IN

Incidence matrix
(PxT IN)

$$C = Post^T - Pre = \begin{bmatrix} 0 & 0 & 0 \\ -1 & 0 & 1 \\ 2 & -1 & -1 \\ 0 & 1 & -1 \end{bmatrix}$$

$$M_2 = M_0 + C \begin{bmatrix} 2 \\ 2 \\ 1 \end{bmatrix} = \begin{bmatrix} 1 \\ 0 \\ 1 \\ 1 \end{bmatrix}$$

A transition firing diagram showing the sequence of transitions t_1, t_2, t_3 and the resulting marking M_2 . The initial marking $M_0 = [1, 1, 0, 0]^T$ is shown at the bottom left. A green arrow labeled t_1 points to a marking $[1, 1, 0, 0]^T$. A purple arrow labeled t_2 points to a marking $[1, 0, 1, 1]^T$. A yellow arrow labeled t_3 points to the final marking $M_2 = [1, 0, 1, 1]^T$.

Petri net basics

- Mathematical and graphical formalism
- Representation of conflict/parallelism

Properties

- Structural
 - P-invariants (conservative components)
 - T-invariants (repetitive components)
- Dynamical
 - liveness
 - boundness
 - reachability

Tools

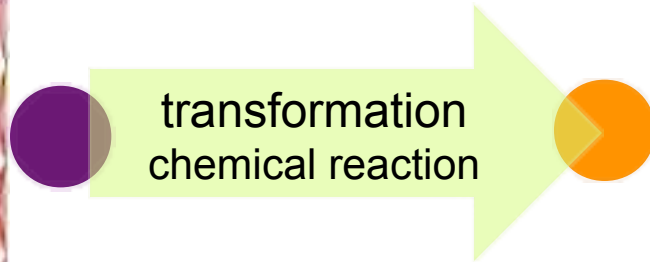
- Analytical approaches
 - state equations
 - transition equations, graph analysis...
- Model checking
- Simulation
 - a variety of analysis tools and simulation shells available

Extensions

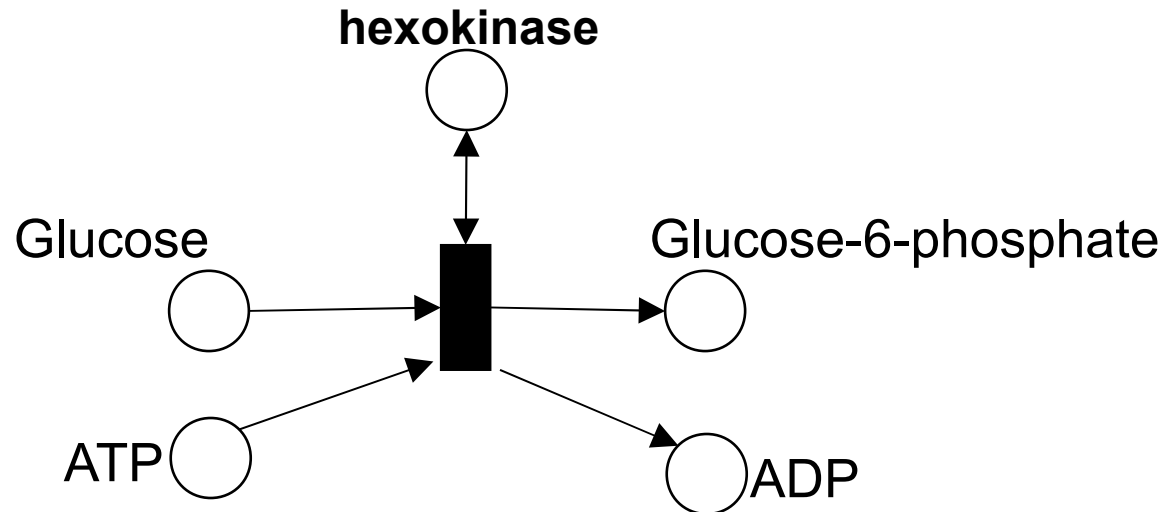
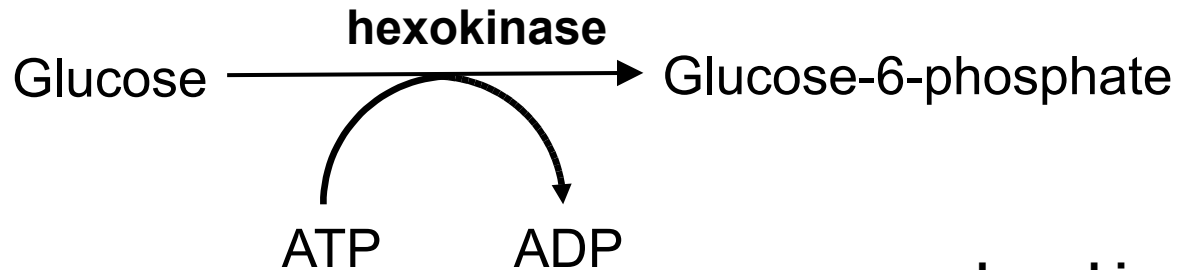
Stochastic PN, Coloured nets, Hybrid nets...

G. Balbo & M. Heiner lectures tomorrow!

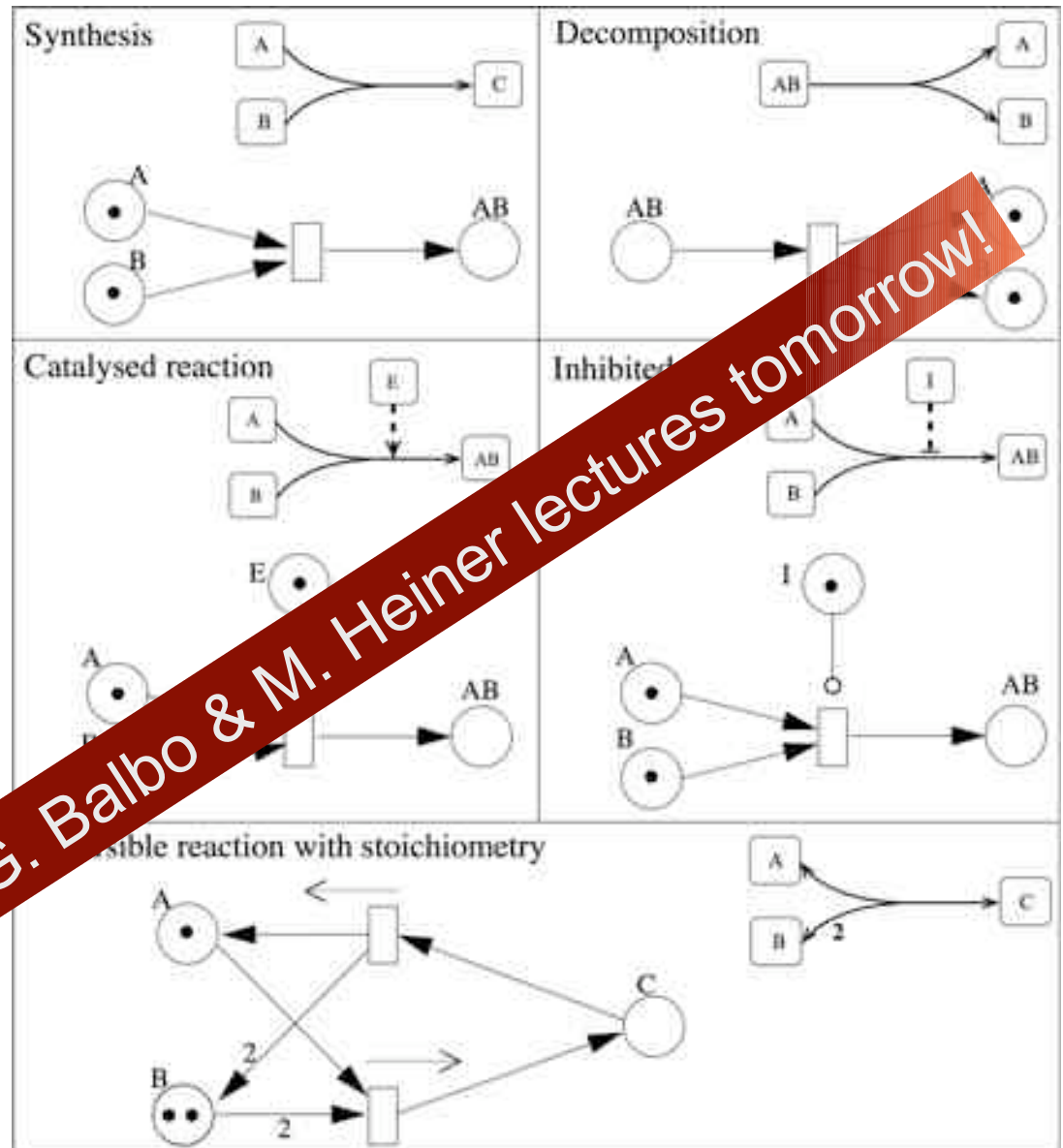
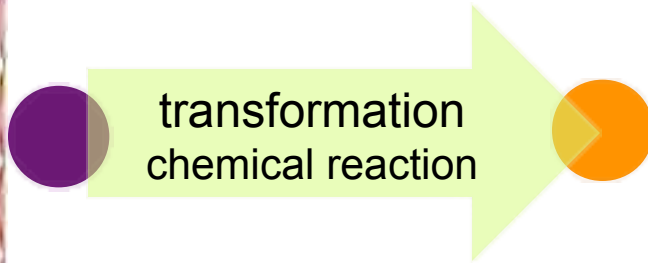
PN modelling of reaction networks



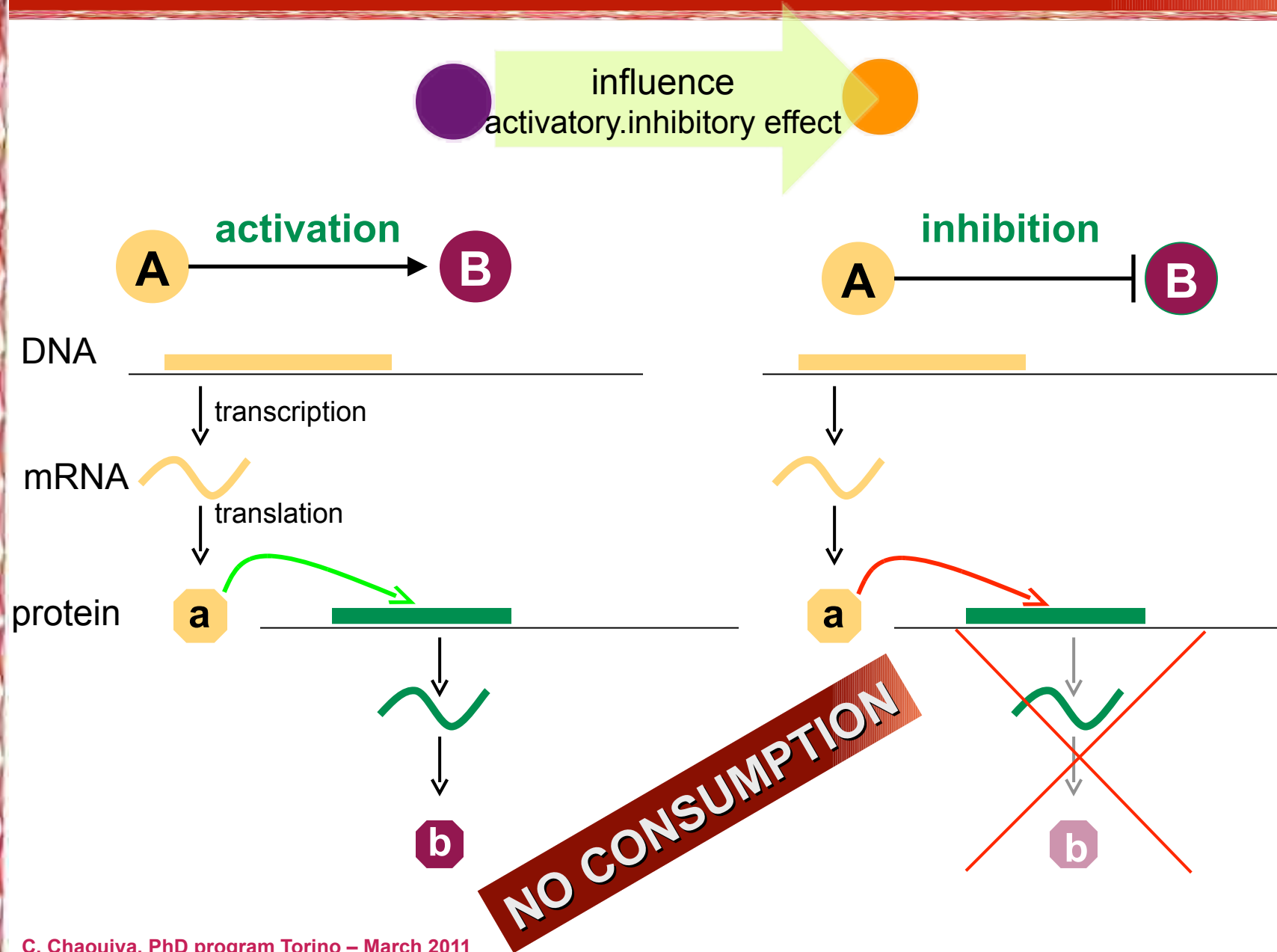
places: reactants, products, enzymes...
transitions: reactions, catalysis ...
weighted arcs: stoichiometry



PN modelling of reaction networks

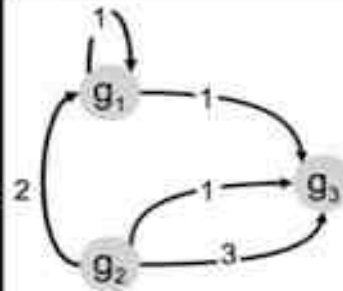


Genetic regulatory networks, a schematic view



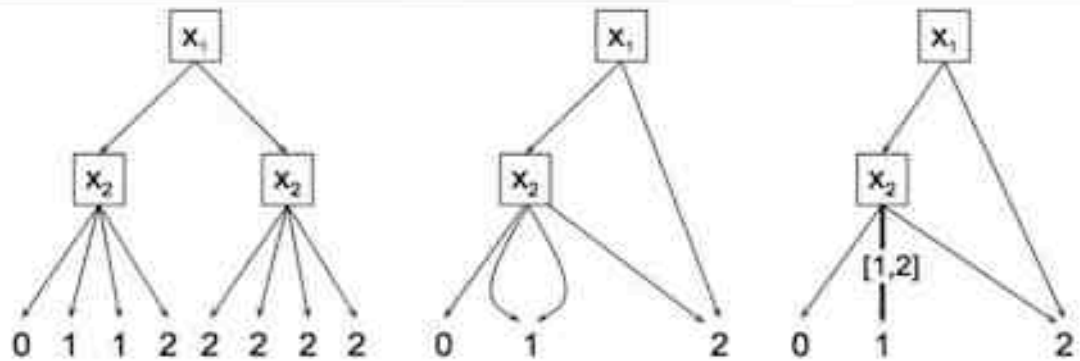
PN modelling of *logical* regulatory networks

Multi-valued Regulatory Petri Nets



$Reg(g_1) = Reg(g_3) = \{g_1, g_2\}$, $Reg(g_2) = \emptyset$
 $Max_1 = 1$, $m_{1,1} = m_{1,3} = 1$, $\theta_{1,1,1} = \theta_{1,3,1} = 1$
 $Max_2 = 3$, $m_{2,1} = 1$, $m_{2,3} = 2$, $\theta_{2,1,1} = 2$, $\theta_{2,3,1} = 1$, $\theta_{2,3,2} = 3$
 $Max_3 = 2$

x_1	x_2	Interactions acting on g_3	K_3
0	0	None	0
0	1	From g_2 at level 1 or 2	1
0	2		
0	3	From g_1 at level 3	2
1	0	From g_1	2
1	1	From g_1 and from g_2 at level 1 or 2	2
1	2		
1	3	From g_1 and from g_2 at level 3	2



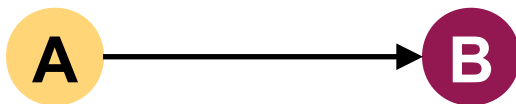
PN modelling of *logical* regulatory networks

Multi-valued Regulatory Petri Nets

Genetic regulatory networks described in terms of logical models

- two complementary places for each gene
- two transitions for each logical parameter (effect of interactions on a given gene)

Example

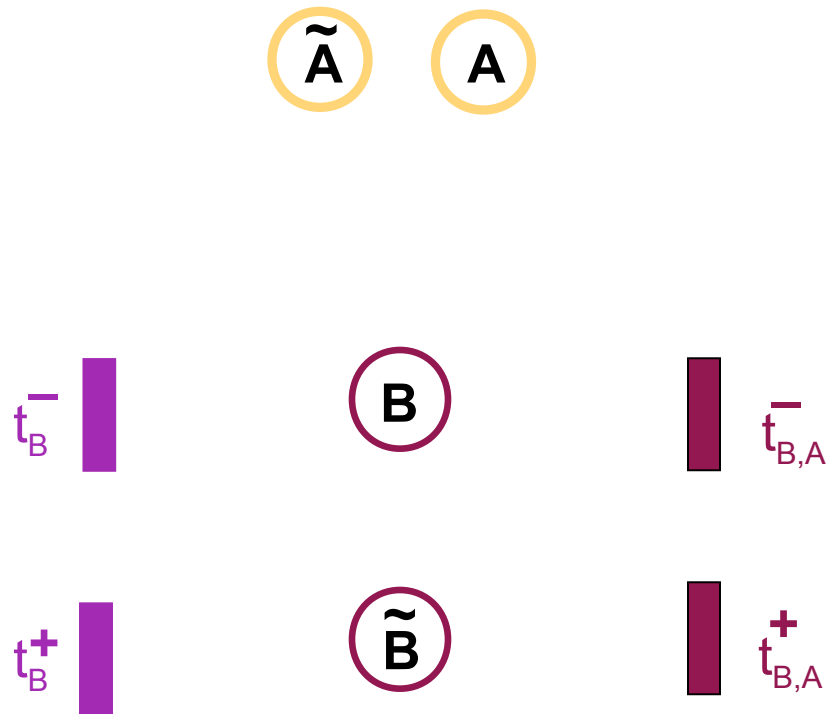


$$\max_A = 1 \quad \max_B = 3$$

$$K_B(A) = 2 \quad K_B(\tilde{A}) = 1$$

$$M(A) + M(\tilde{A}) = 1$$

$$M(B) + M(\tilde{B}) = 3$$



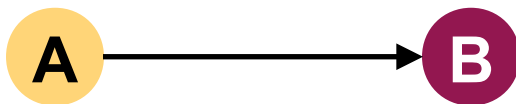
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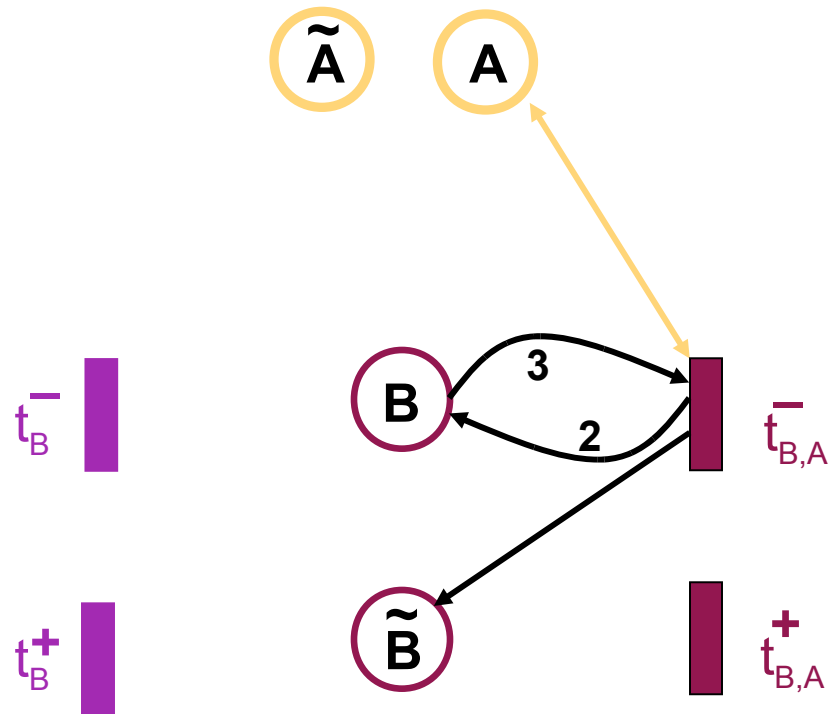


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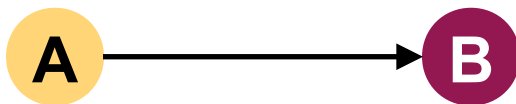
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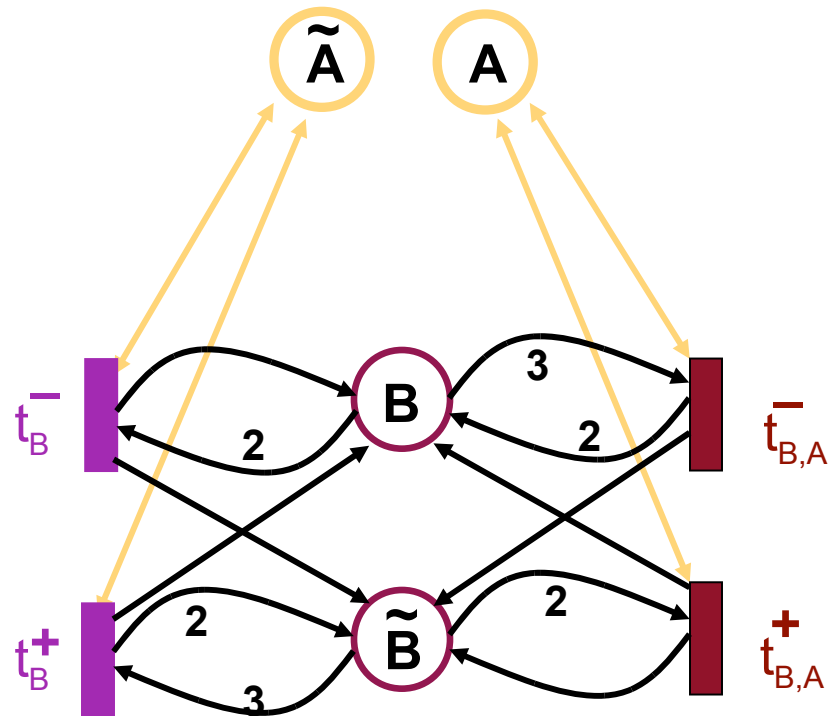


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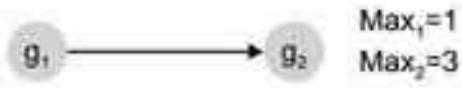
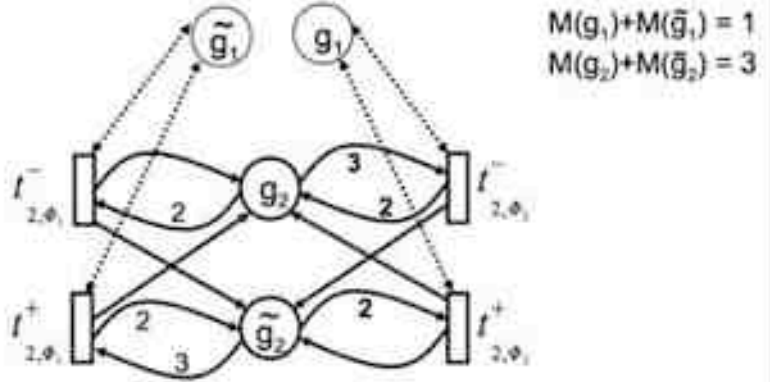
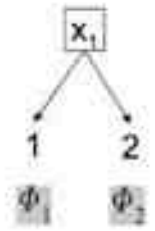
Definition

Given a LRG $\mathcal{R} = (\mathcal{G}, Max, \mathcal{E}, \Theta, \mathcal{K})$, the corresponding *Multi-valued Regulatory Petri Net* (MRPN) is defined by:

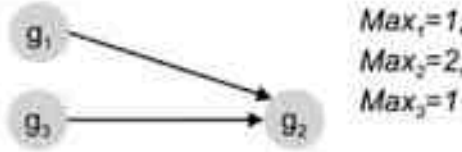
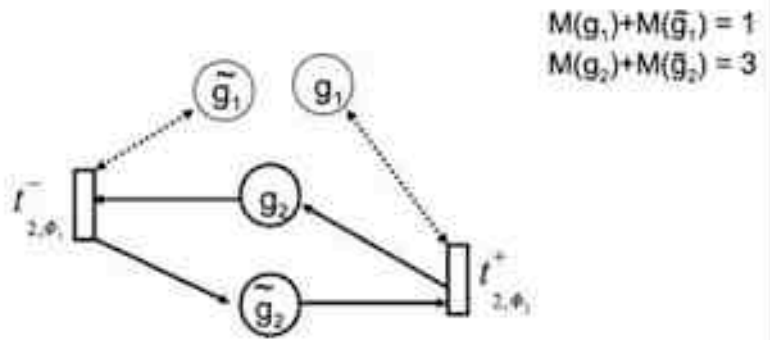
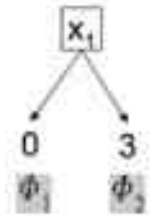
- $\forall g_i \in \mathcal{G}$, two places g_i and \tilde{g}_i s.t $\forall M, M(g_i) + M(\tilde{g}_i) = Max_i$.
- $\forall g_i \in \mathcal{G}$, for each path Φ of the MDD \mathcal{K}_i , at most two transitions: $t_{i,\Phi}^+$ and $t_{i,\Phi}^-$. Recall that Φ defines assignment intervals of the levels of g_j in $Reg(i)$: $x_j \in [\phi_j, \phi'_j]$, where $\phi_j, \phi'_j \in [0, Max_j]$ and $\phi_j \leq \phi'_j$.
- Transitions $t_{i,\Phi}^+$ and $t_{i,\Phi}^-$ are connected to:
 - place $g_j, j \in Reg(i)$, with a test arc weighted ϕ_j ,
 - place $\tilde{g}_j, j \in Reg(i)$, with a test arc weighted $Max_j - \phi'_j$.
- Transition $t_{i,\Phi}^+$ is further connected to:
 - place g_i , with an outgoing arc (increasing the level of g_i),
 - place \tilde{g}_i , with an incoming arc weighted $Max_i - v_\Phi + 1$ and an outgoing arc weighted $Max_i - v_\Phi$.
- Symmetrically, transition $t_{i,\Phi}^-$ is further connected to:
 - place \tilde{g}_i , with an outgoing arc (decreasing the level of g_i),
 - place g_i , with an incoming arc weighted $v_\Phi + 1$ and an outgoing arc



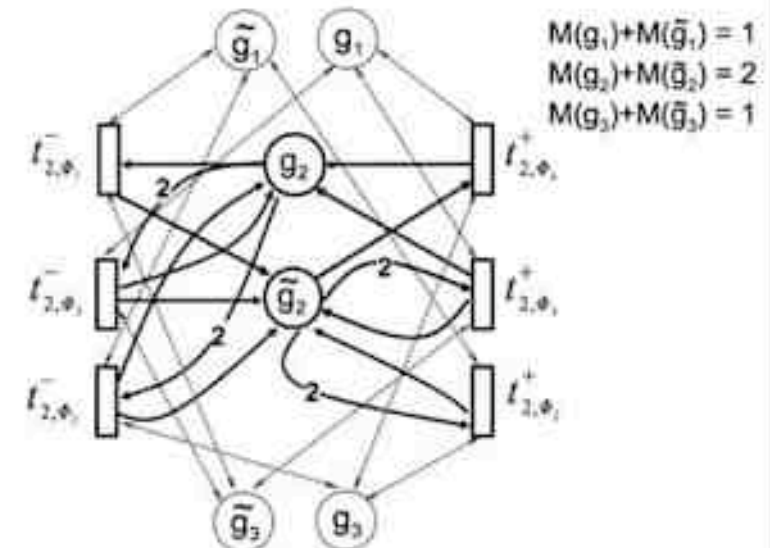
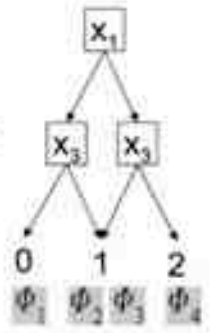
x_1	\mathcal{K}_2
0	1
1	2



x_1	\mathcal{K}_2
0	0
1	3



x_1	x_3	\mathcal{K}_2
0	0	0
0	1	1
1	0	1
1	1	2



PN modelling of *logical* regulatory networks

Multi-valued Regulatory Petri Nets

Property

In the state transition graph (S, T) of a LRG $\mathcal{R} = (\mathcal{G}, Max, \mathcal{E}, \Theta, \mathcal{K})$, there exists a transition between two states x and x' iff there exists an enabled transition t in the associated MRPN such that $M[t]M'$ (t is enabled by the marking M and its firing leads to the new marking M') with, for all $k = 1, \dots, n$:

$$M(g_k) = x_k$$

$$M(\tilde{g}_k) = Max_k - x_k,$$

$$M'(g_k) = x'_k$$

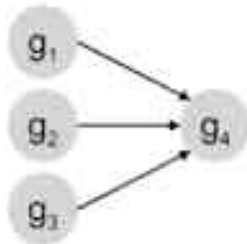
$$M'(\tilde{g}_k) = Max_k - x'_k.$$

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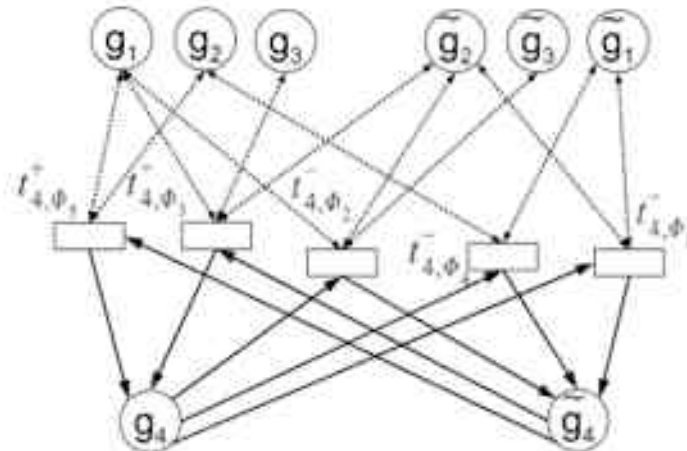
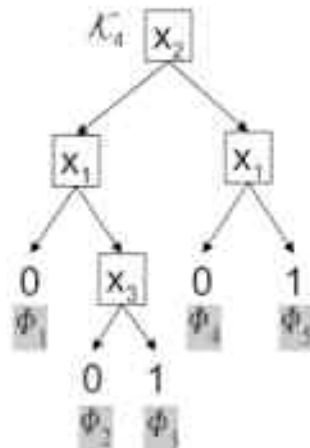
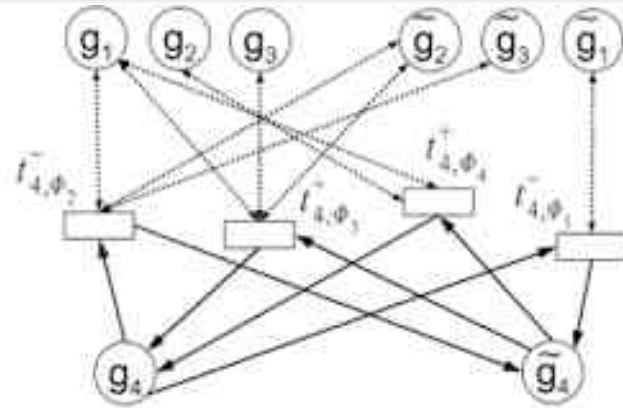
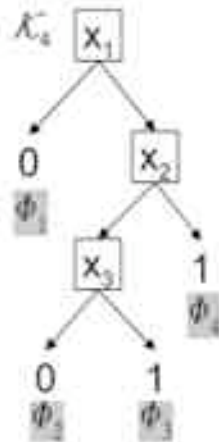
Multi-valued Regulatory Petri Nets

Property

Given a LRG \mathcal{R} , two different orderings of the regulatory nodes can lead to different MRPNs, which have the same dynamical behaviour (i.e. their marking graphs are isomorph for a given initial state x).



x_1	x_2	x_3	\mathcal{K}_x
0	0	0	0
0	0	1	0
0	1	0	0
0	1	1	0
1	0	0	0
1	0	1	1
1	1	0	1
1	1	1	1



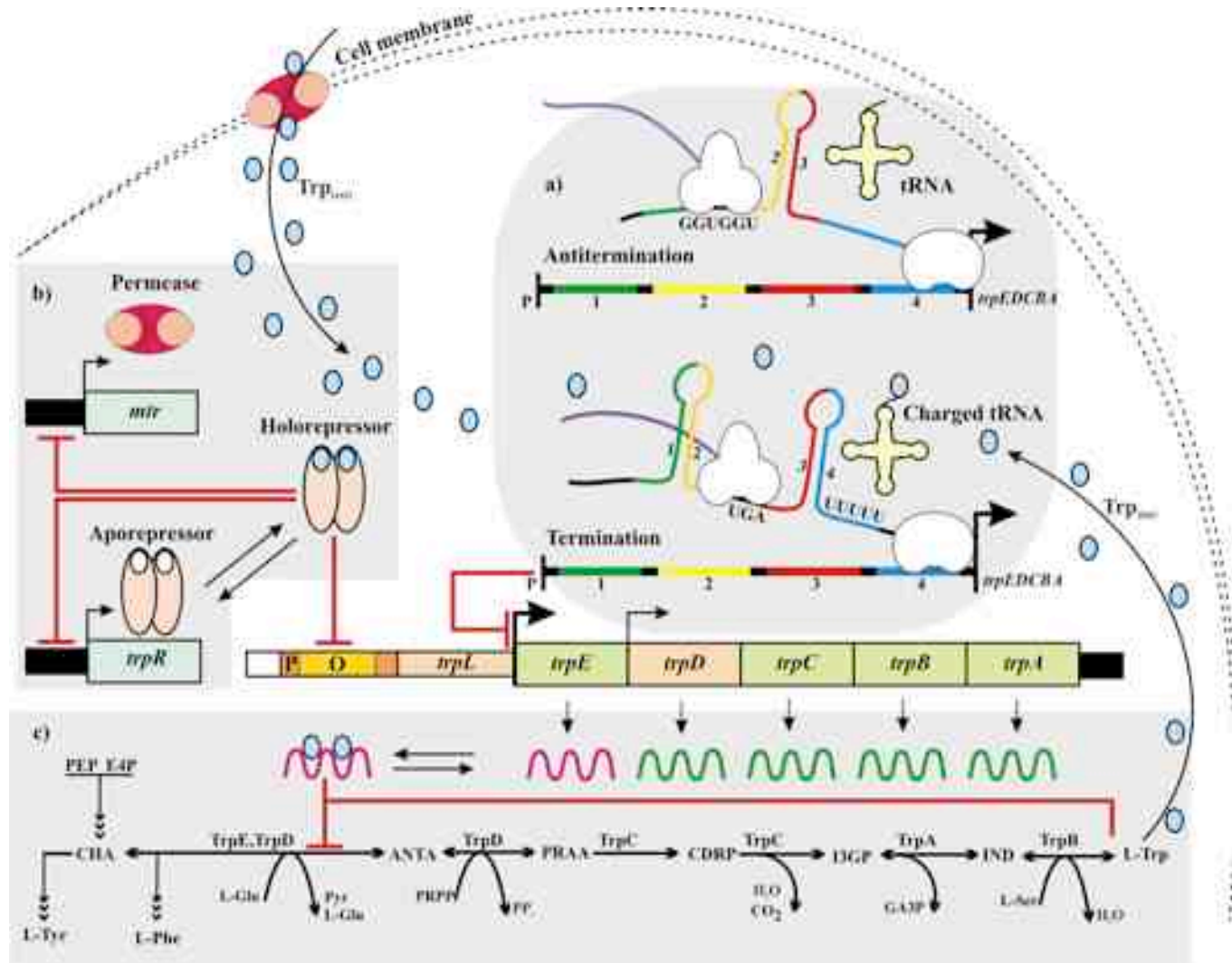
PN modelling of *logical* regulatory networks

Multi-valued Regulatory Petri Nets

- Export of logical models in several PN formats
- Use of existing tools for PN analysis
- Consideration of PN extensions
 - Coloured PN for compositional modelling
 - Timed or stochastic PN to sort out relevant dynamics
- Integrated modelling of metabolic pathways and their regulation

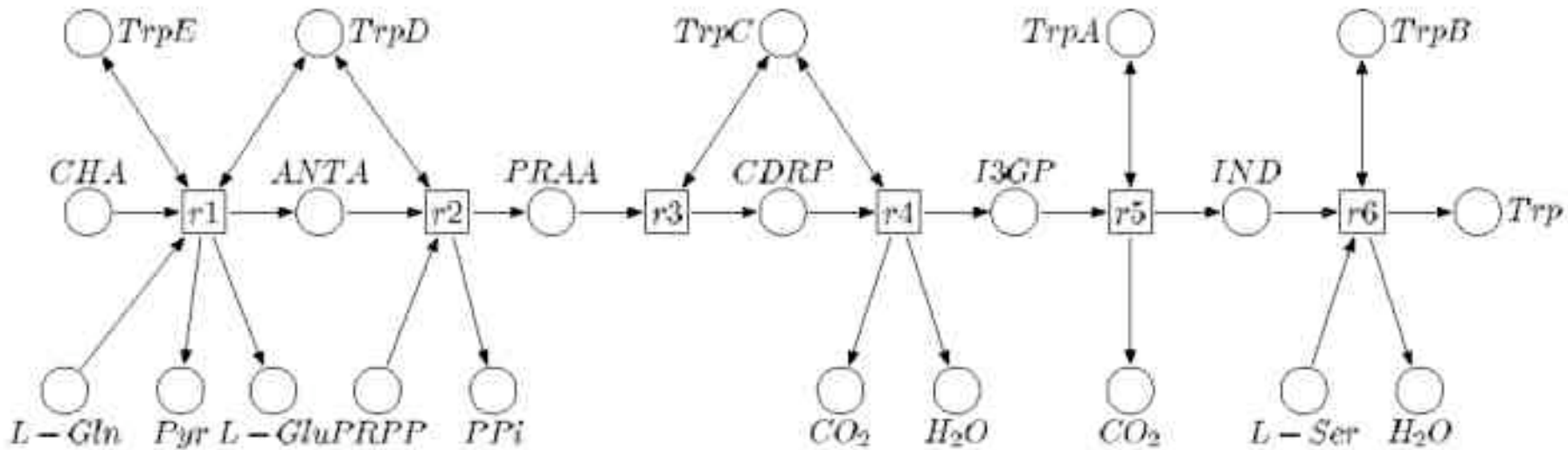
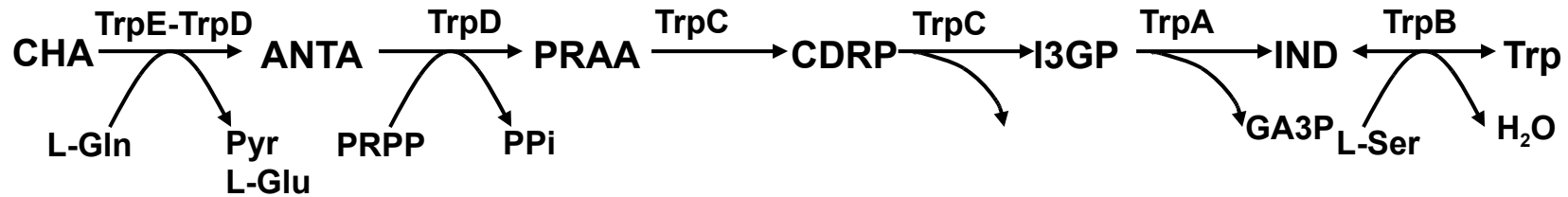
Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

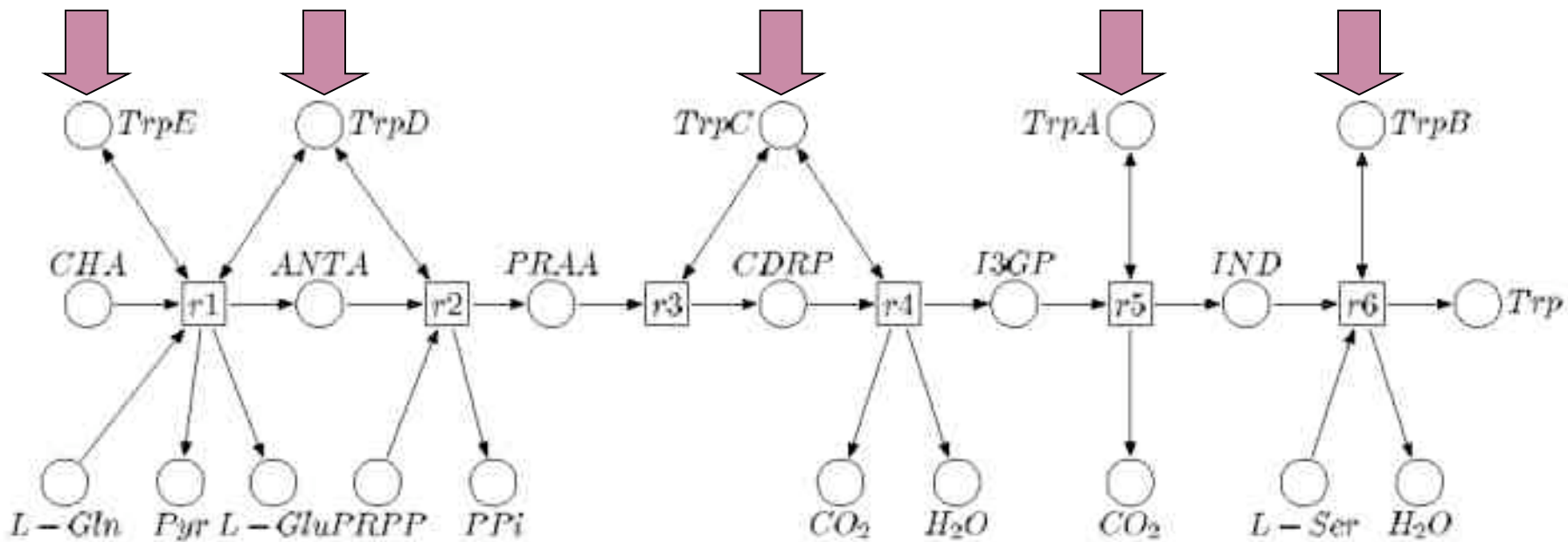


Integrated modelling of regulated metabolic pathways

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REGULATION ???

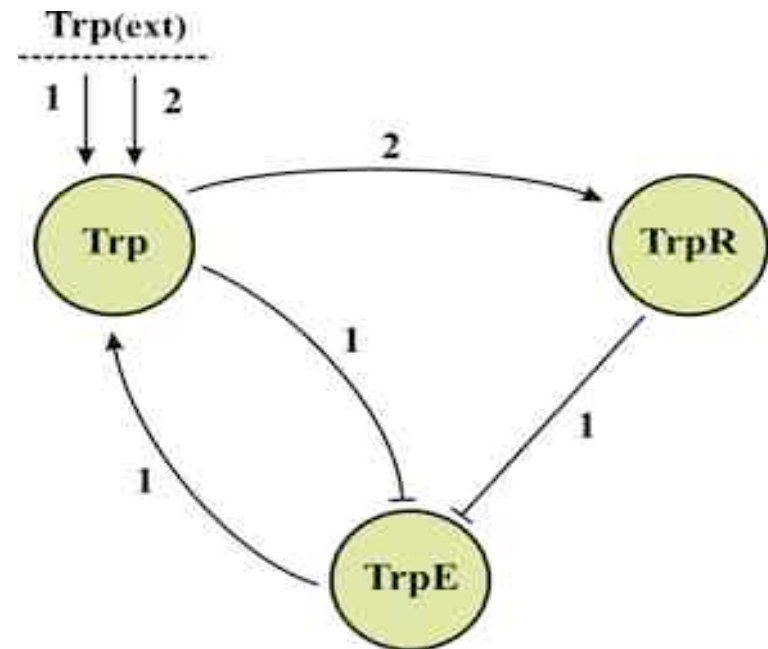


Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

A logical model of the regulation of the Tryptophan biosynthesis

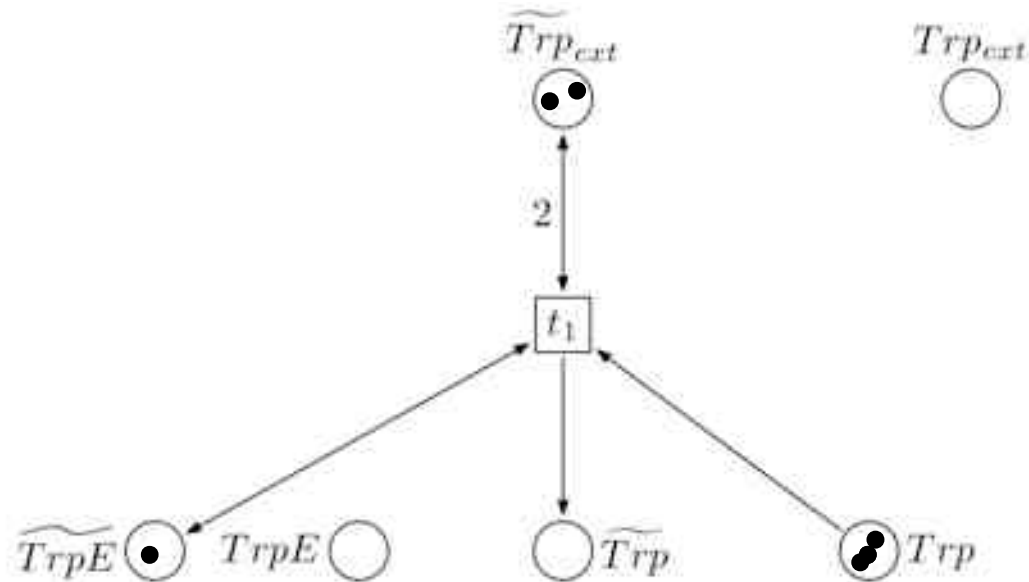
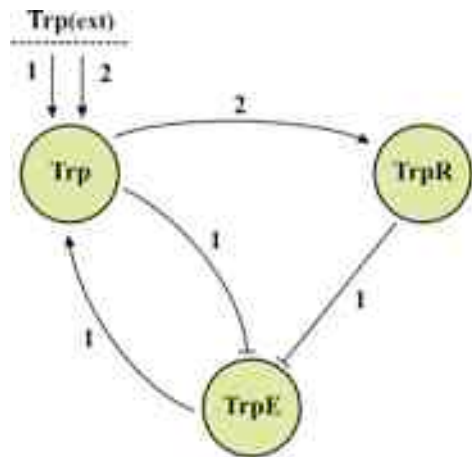
Context (input genes)	Parameter value
<i>TrpE</i>	
$TrpR = 0$ and $Trp = 0$	1
$TrpR = 1$ and $Trp = 0$	0
$TrpR = 0$ and $Trp \geq 1$	0
$TrpR = 1$ and $Trp \geq 1$	0
<i>TrpR</i>	
$Trp \leq 1$	0
$Trp = 2$	1
<i>Trp</i>	
$Trp_{ext} = 0$ and $TrpE = 0$	0
$Trp_{ext} = 0$ and $TrpE = 1$	1
$Trp_{ext} = 1$ and $TrpE = 0$	1
$Trp_{ext} = 1$ and $TrpE = 1$	1
$Trp_{ext} = 2$ and $TrpE = 0$	2
$Trp_{ext} = 2$ and $TrpE = 1$	2



Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

A logical model of the regulation of the Tryptophan biosynthesis
PN representation



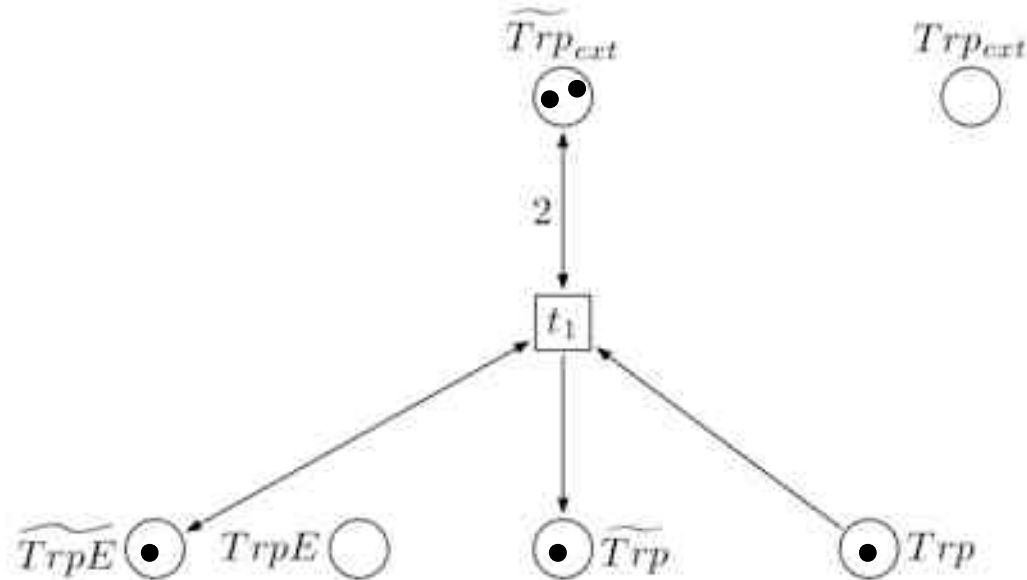
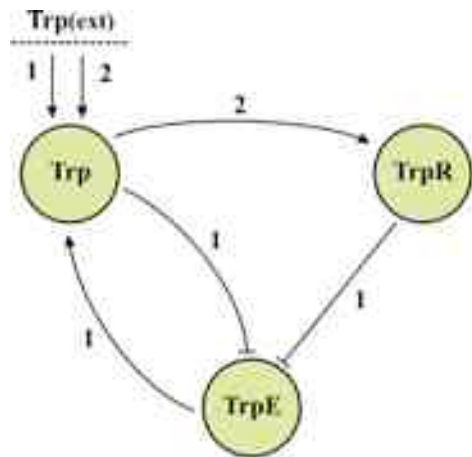
when $Trp_{ext}=0$ and $TrpE=0$, $Trp = 0$

gene or regulatory product ... \rightarrow 2 complementary places
combination of incoming interactions \rightarrow 1 or 2 transitions

Integrated modelling of regulated metabolic pathways

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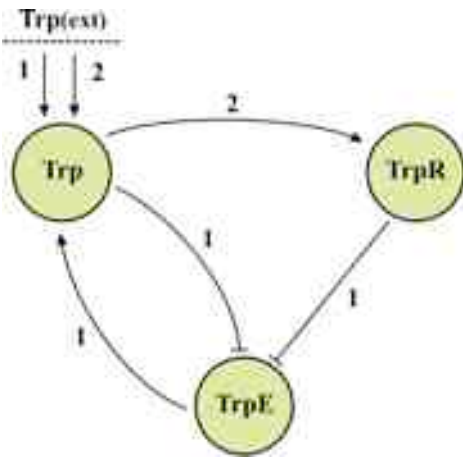
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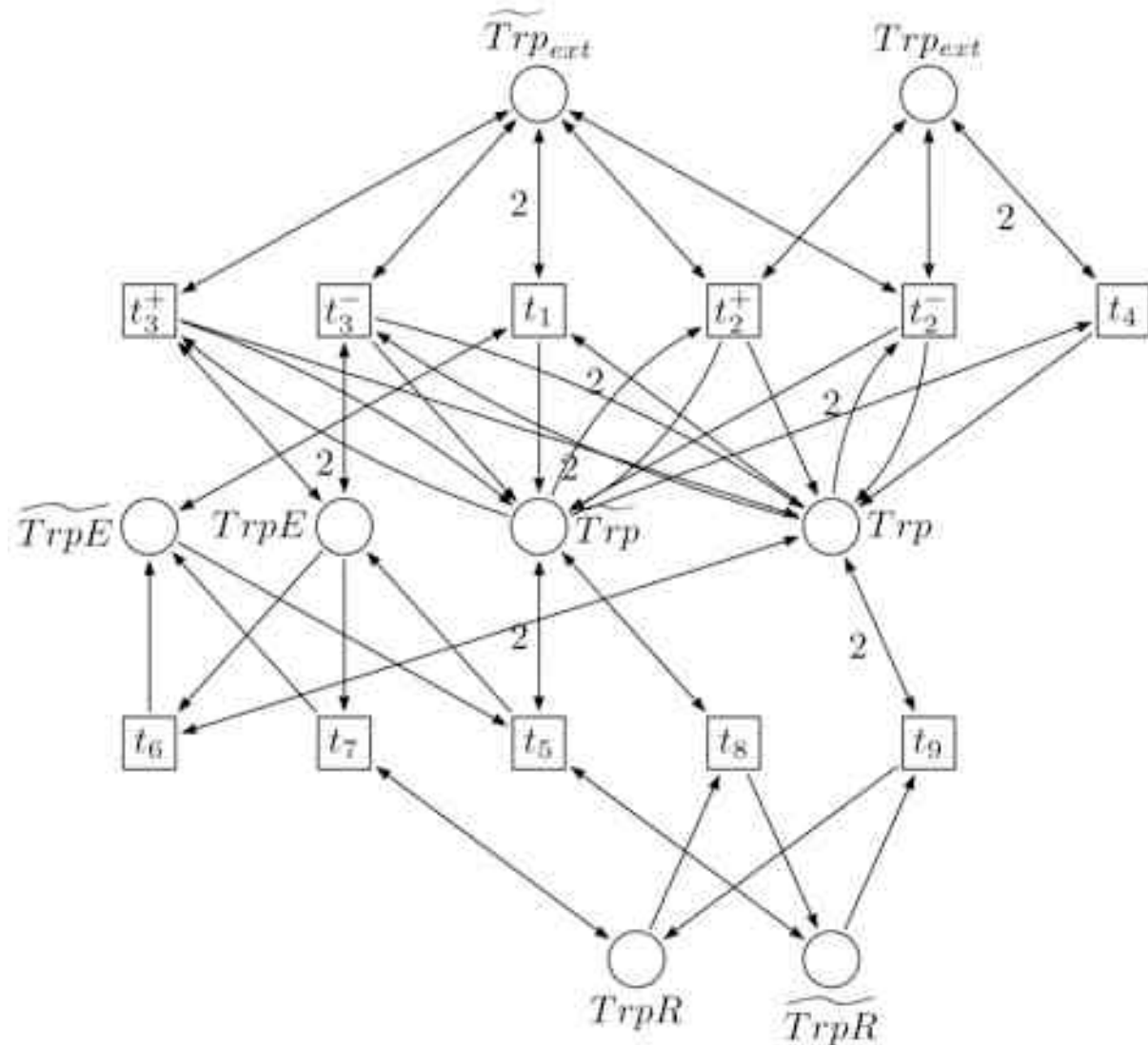
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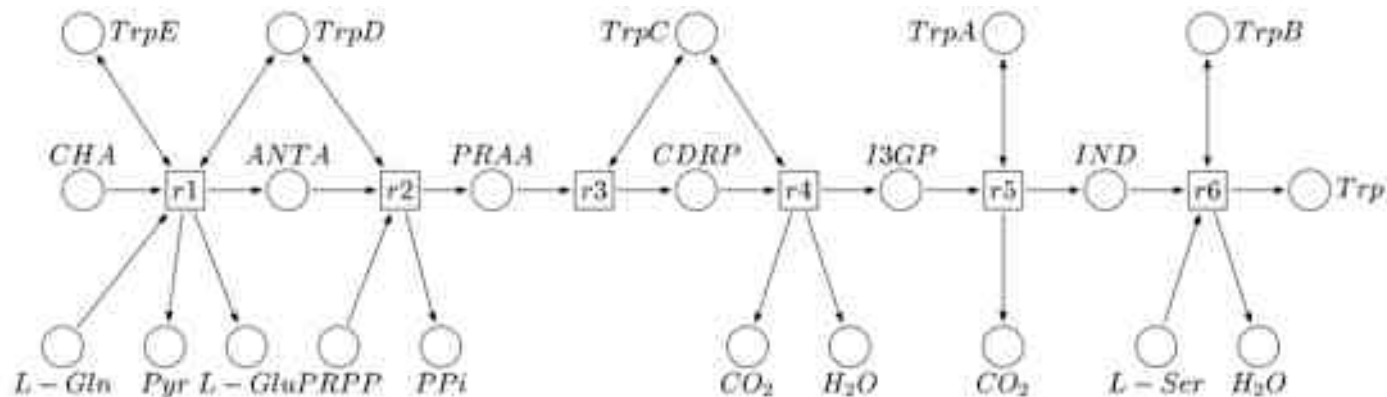
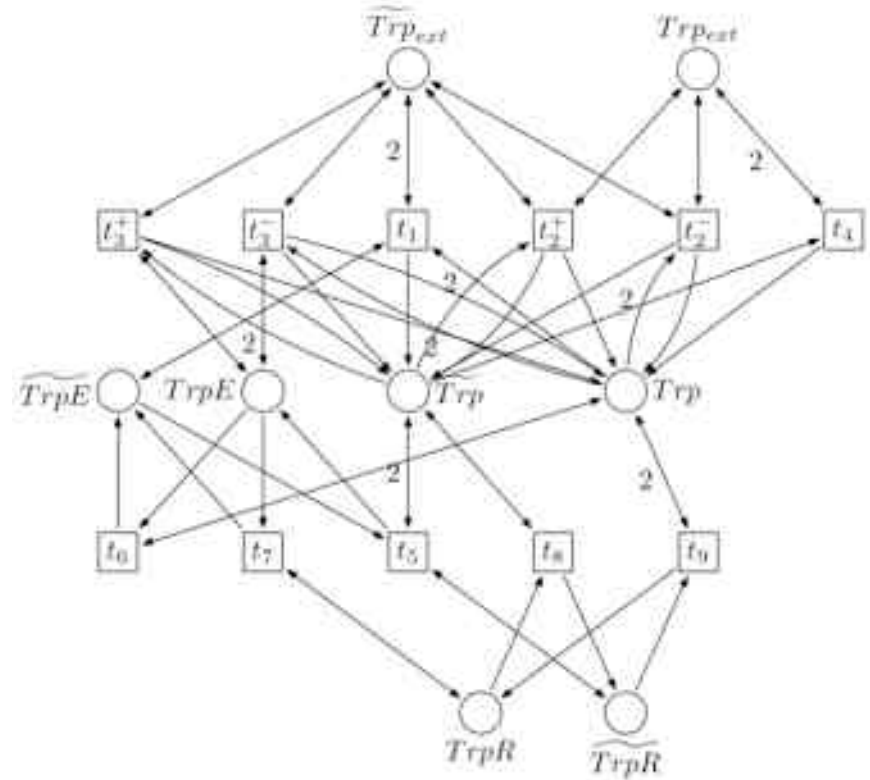
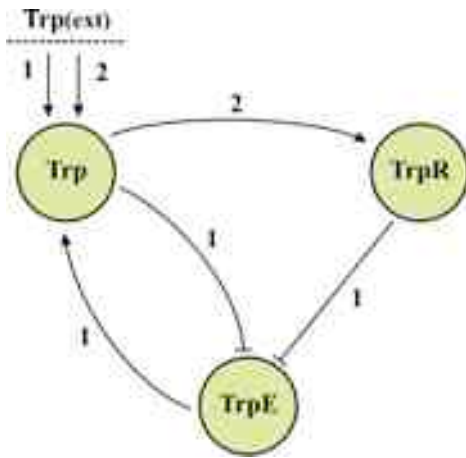
Context (input genes)	Parameter value	Corresponding PN transitions
$TrpE$		
$TrpR = 0$ and $Trp = 0$	1	t_3
$TrpR = 1$ and $Trp = 0$	0	t_3, t_7
$TrpR = 0$ and $Trp \geq 1$	0	
$TrpR = 1$ and $Trp \geq 1$	0	
$TrpE$		
$Trp \leq 1$	0	t_6
$Trp = 1$	1	t_6
Trp		
$Trp_{ext} = 0$ and $TrpE = 0$	0	t_5
$Trp_{ext} = 0$ and $TrpE = 1$	1	t_5, t_9
$Trp_{ext} = 1$ and $TrpE = 0$	1	
$Trp_{ext} = 1$ and $TrpE = 1$	1	
$Trp_{ext} = 2$ and $TrpE = 0$	2	
$Trp_{ext} = 2$ and $TrpE = 1$	2	



Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

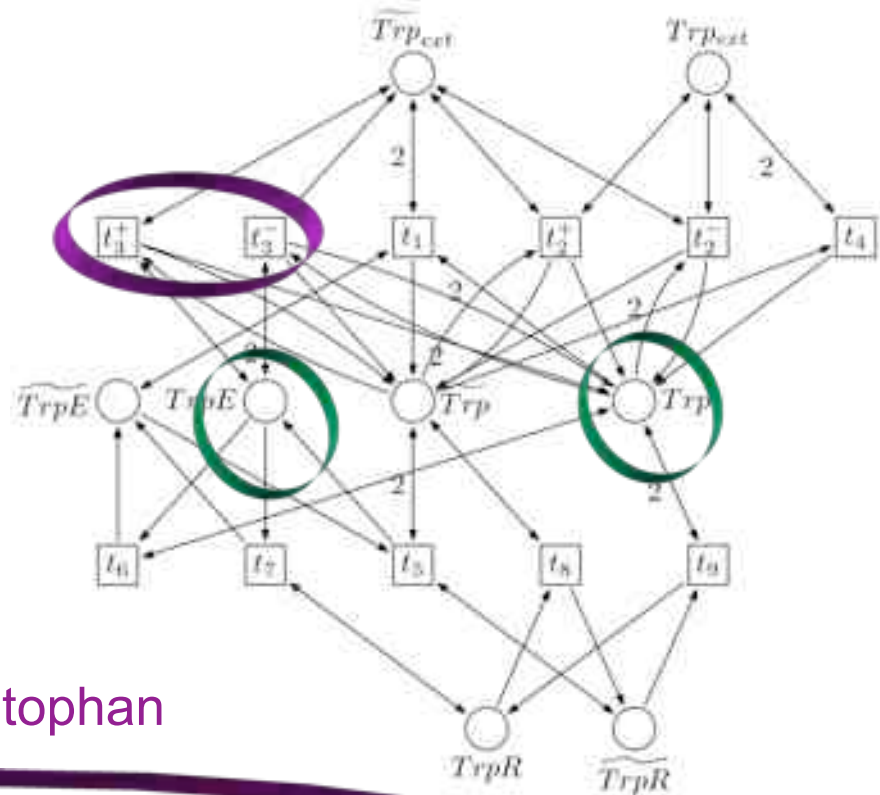
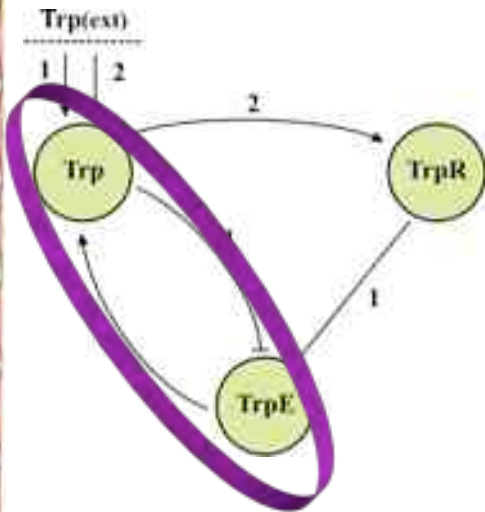
Integrated PN



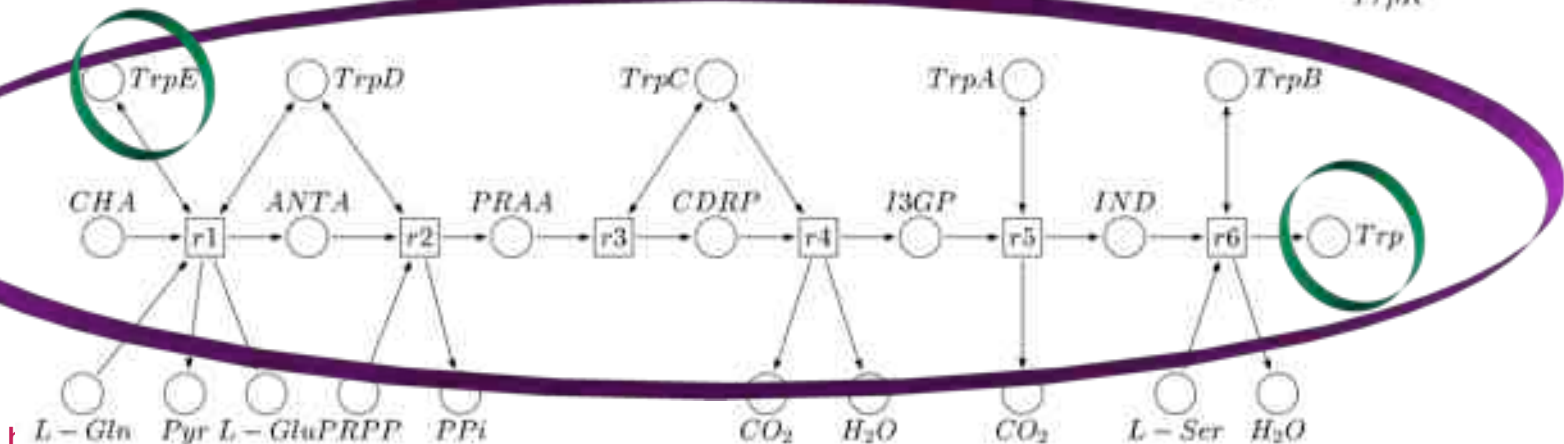
Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

Integrated PN



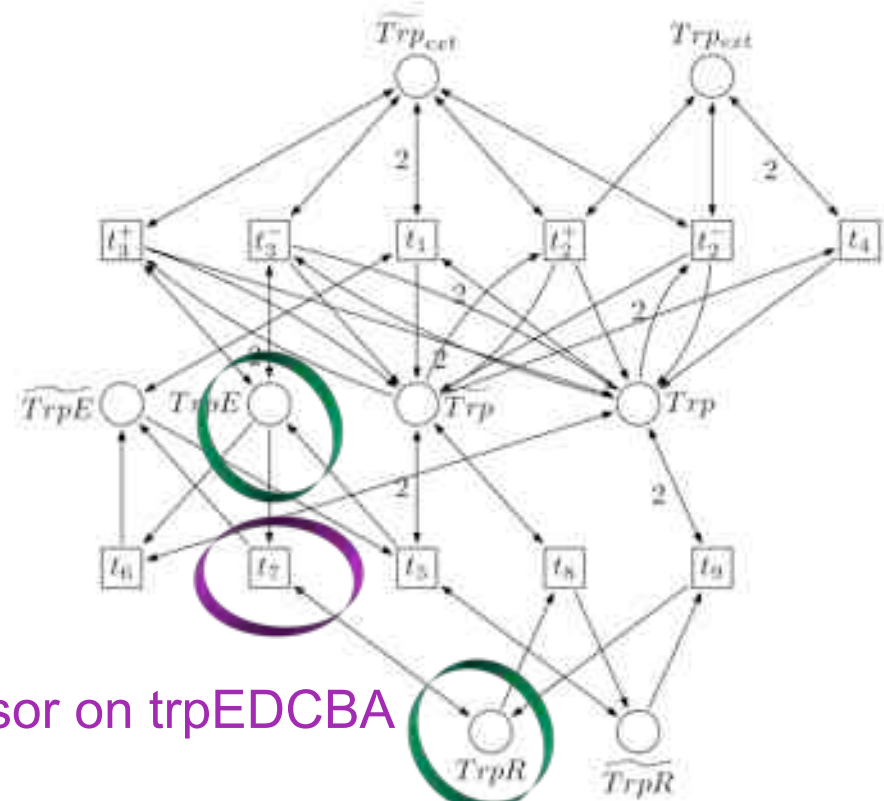
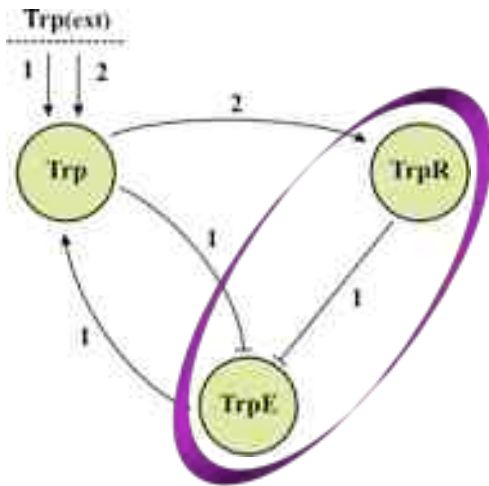
conversion of chorismate into tryptophan



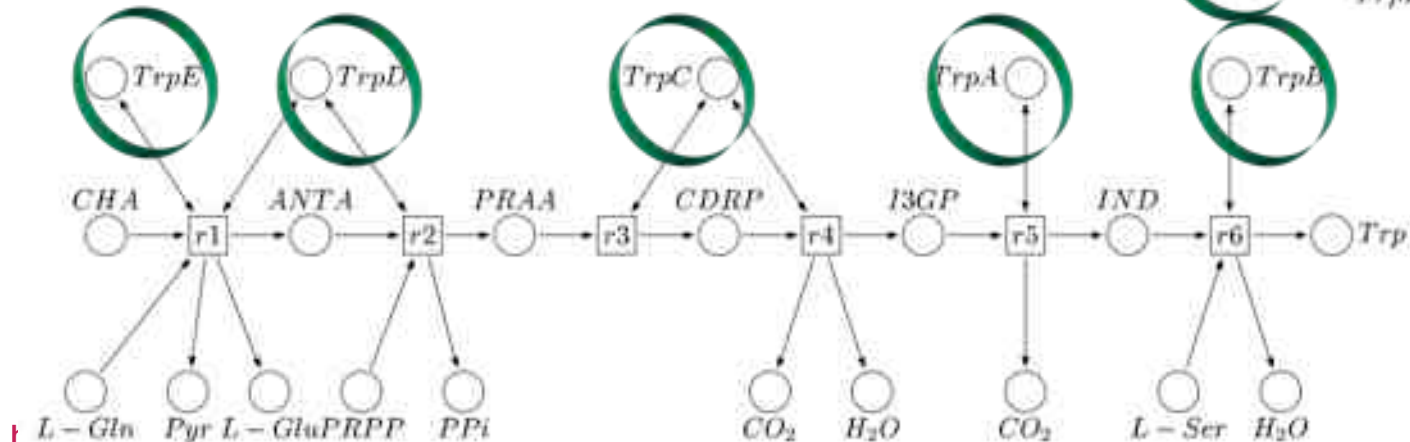
Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

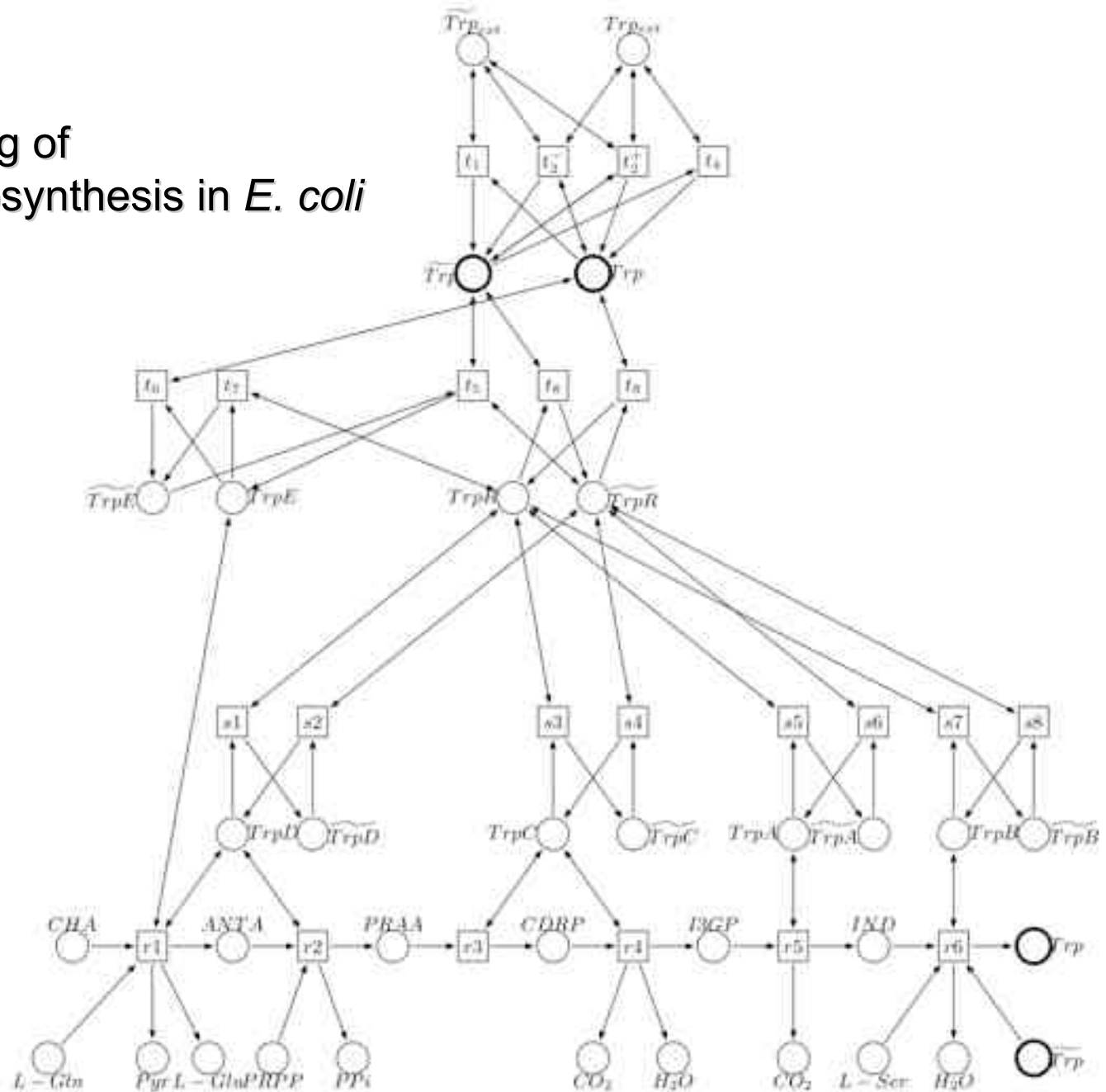
Integrated PN



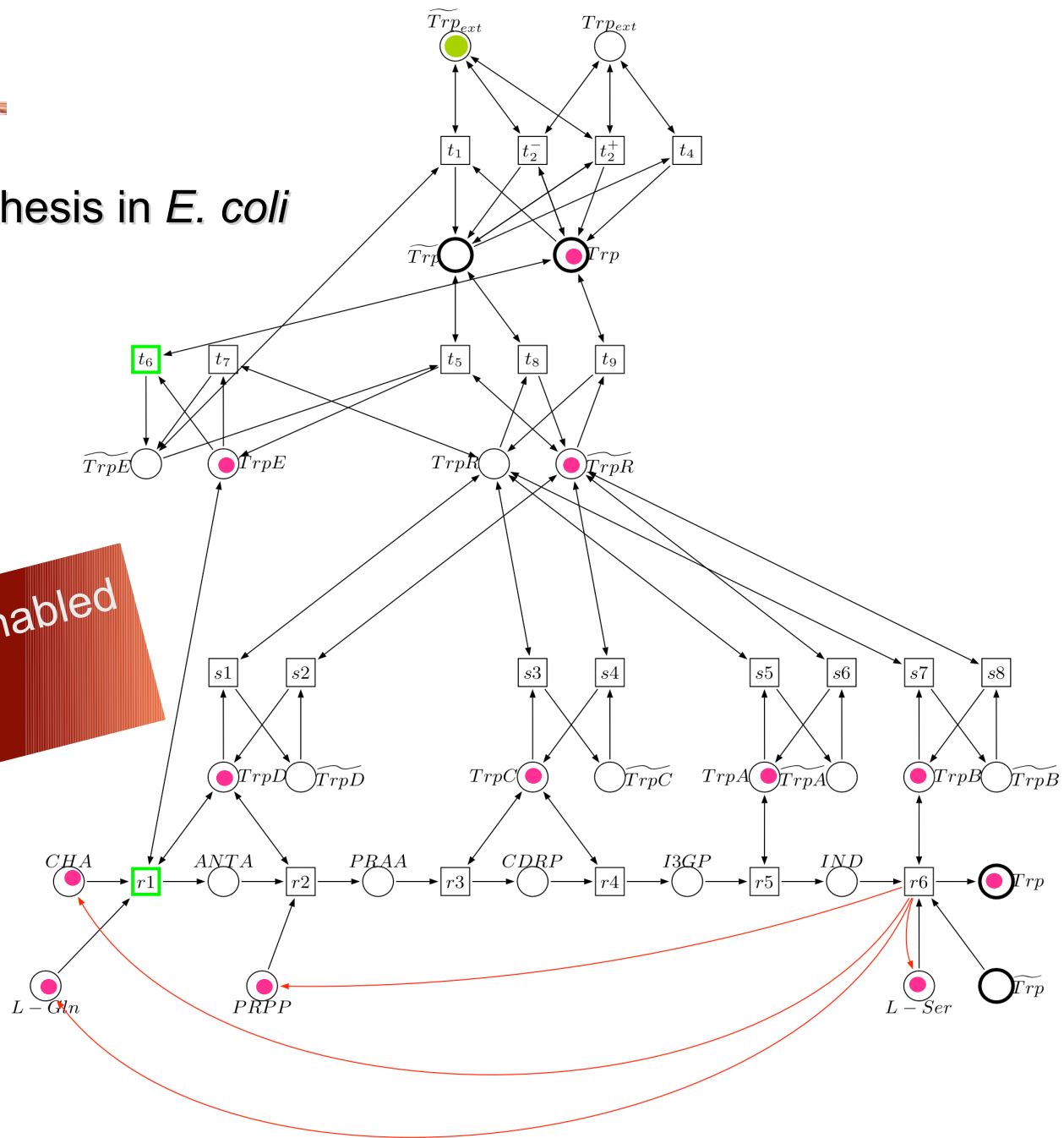
inhibitory effect of the holorepressor on trpEDCBA



Integrated modelling of The Tryptophan biosynthesis in *E. coli*



Integrated modelling of The Tryptophan biosynthesis in *E. coli*

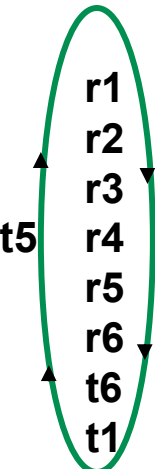


Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

Initial state **No external tryptophan**, all input compounds present, all enzymes active, no internal tryptophan, no holorepressor

Attractor **One cyclic attractor** denoting **homeostatic levels** of **internal tryptophan** and **TrpE activity**




	CHA	ANTA	PRAA	CRDP	I3GP	IND	TrpE	TrpD	TrpC	TrpB	TrpA	Trp	TrpR	Trp _{ext}
r1	1	0	0	0	0	0	1	1	1	1	1	0	0	0
r2	0	1	0	0	0	0	1	1	1	1	1	0	0	0
r3	0	0	1	0	0	0	1	1	1	1	1	0	0	0
r4	0	0	0	1	0	0	1	1	1	1	1	0	0	0
r5	0	0	0	0	0	1	1	1	1	1	1	0	0	0
r6	1	0	0	0	0	0	1	1	1	1	1	1	0	0
t6	1	0	0	0	0	0	0	1	1	1	1	1	0	0
t1	1	0	0	0	0	0	0	1	1	1	1	0	0	0

Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

Initial state **Low external tryptophan**, all input compounds present, all enzymes active, no internal tryptophan, no holorepressor

Attractor A **unique reachable dead marking** with a **moderate level of internal tryptophan**; both **repressor** and **TrpE** inactive



CHA	ANTA	PRAA	CRDP	I3GP	IND	TrpE	TrpD	TrpC	TrpB	TrpA	Trp	TrpR	Trp _{ext}
1	0	0	0	0	0	1	1	1	1	1	0	0	1
---	---	---	---	---	---	---	---	---	---	---	---	---	---
1	0	0	0	0	0	0	1	1	1	1	1	0	1

Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

Initial state **Low external tryptophan**, all input compounds present, all enzymes active, no internal tryptophan, no holorepressor

Attractor **A unique reachable dead marking** with a **moderate level of internal tryptophan**; both **repressor** and **TrpE** inactive

Computation of the reachability graph

.....Omit boundedness test? Y/N N

States generated: 624

.....Write the state numbers of the dead states? Y/N Y

The net has dead reachable states.

The net is not live.

The net is not reversible (resetable).

The net is bounded.

The net has dead transitions at the initial marking.

ORD	HOM	NBM	PUR	CSV	SCF	CON	SC	Ft0	tF0	Fp0	pF0	MG	SM	FC	EFC	ES
N	N	N	N	N	N	Y	Y	N	N	N	N	N	N	N	N	N
DTP	CPI	CTI	B	SB	REV	DSt	BSt	DTr	DCF	L	LV	L&S				
?	?	?	_Y	?	N	Y	?	Y	?	N	?	N				

Reachable scc's: 316,

Component nr. 316: 22, term.

State nr. 22

P.nr:	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22
:	23	24																					
toks:	1	0	0	0	0	0	1	1	1	1	1	0	1	1	1	1	1	1	1	0	1	0	0
:	0	0																					

Analysis performed using INA

Integrated modelling of regulated metabolic pathways

The Tryptophan biosynthesis in *E. coli*

Initial state **external tryptophan**, all input compounds present, all enzymes active, no internal tryptophan, no holorepressor
Attractor **Six reachable dead markings** with a **high level of internal tryptophan**, the **six enzymes inactive**, the **repressor active**

	CHA	ANTA	PRAA	CRDP	I3GP	IND	TrpE	TrpD	TrpC	TrpB	TrpA	Trp	TrpR	Trp _{ext}
	1	0	0	0	0	0	1	1	1	1	1	0	0	2
	---	---	---	---	---	---	---	---	---	---	---	---	---	---
→	1	0	0	0	0	0	0	0	0	0	0	2	1	2
→	0	1	0	0	0	0	0	0	0	0	0	2	1	2
→	0	0	1	0	0	0	0	0	0	0	0	2	1	2
→	0	0	0	1	0	0	0	0	0	0	0	2	1	2
→	0	0	0	0	1	0	0	0	0	0	0	2	1	2
→	0	0	0	0	0	1	0	0	0	0	0	2	1	2

Conclusions & prospects

- A systematic **translation of logical regulatory graphs in terms of PN** (available in GINsim)
- Use of PN tools (INA, invariant analyses, model checking)
- A generic approach based on the combination of PN representations of **metabolic pathways** and logical models of **regulatory networks**
- **Use of PN extensions** (coloured, stochastic,...)
- Tryptophan biosynthesis pathway
 - a faithful qualitative reproduction of the main behaviours for different influxes of external tryptophan
 - **extension of the model to cover the other regulatory mechanisms**
- **Automatise this approach?**