

# STOCHASTIC PROCESS ALGEBRA:

linking process descriptions with  
performance

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joint work with :

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*Formal methods & Tools*



**University of Twente**

*The Netherlands*

# Contents

- Introduction to Stochastic Process Algebra  
motivation, concepts of PA & SPA
- Markovian Process Algebra  
Interactive Markov Chains
- Non-Markovian Process Algebra  
GSMPs, Discrete Event Simulation:
- Conclusion  
current developments

TIPTool



spades.

# MOTIVATION

## Central Issue

Can the **qualitative** and **quantitative** aspects of reactive systems be **modelled** and **analysed** within one **compositional** framework?

- increasing importance of quantitative behaviour
- need for integrated design disciplines
- cross-fertilization
- theory of approximate correctness

# Process Algebra

- a formalism to specify the **behaviour** of systems in a
  - systematic,
  - modular, and
  - hierarchical way.
- building blocks
  - processes,
  - actions,
    - atomic activities that processes can perform
- process algebra provides **compositionality**, by means of
  - operators to compose processes out of smaller ones, and
  - operators and transformations to reduce internal complexity

➔ **Modelling of complex systems becomes manageable**

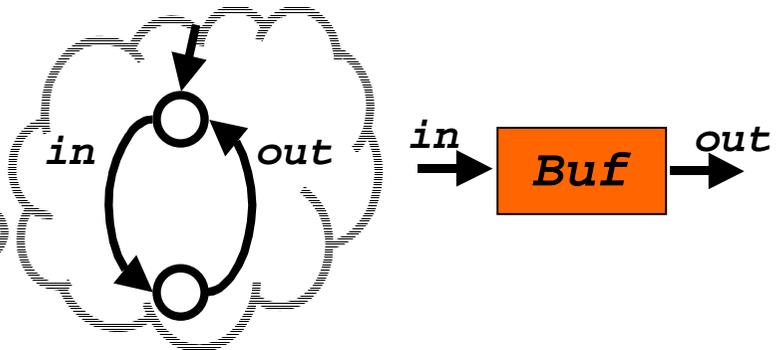
# Basic Process Algebraic Operators

- inaction: **stop**
- action-prefix:  **$a ; B$  or  $\tau ; B$**
- choice:  **$B + C$  or  $\Sigma_I B_i$**
- composition:  **$B \parallel_A C$  or  $B \text{ / } [A] \text{ / } C$**
- hiding:  **$B \setminus A$  or **hide  $A$  in  $B$****
- definition:  **$p := B$**
- application:  **$p$**

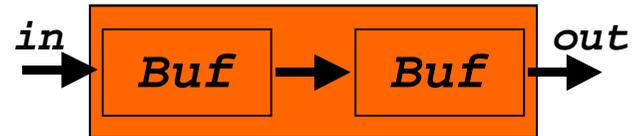
# A very basic example

- A simple one-place buffer

```
Buf := in ; out ; Buf
```



- Two instances of this buffer

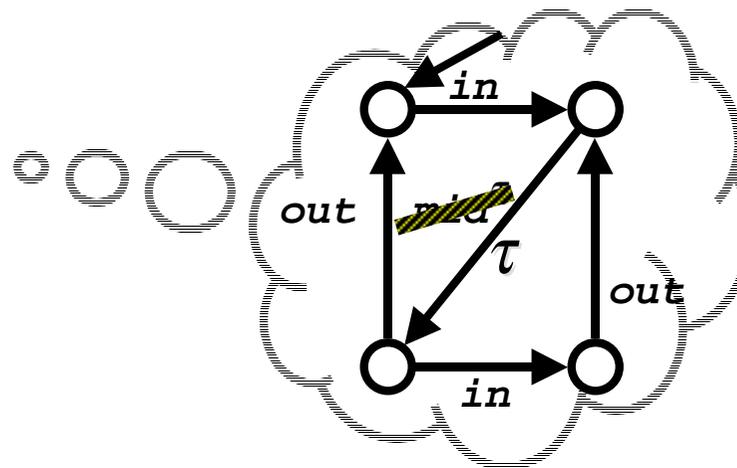


```
hide mid in
```

```
Buf[out/mid]
```

```
| [mid] |
```

```
Buf[in/mid]
```

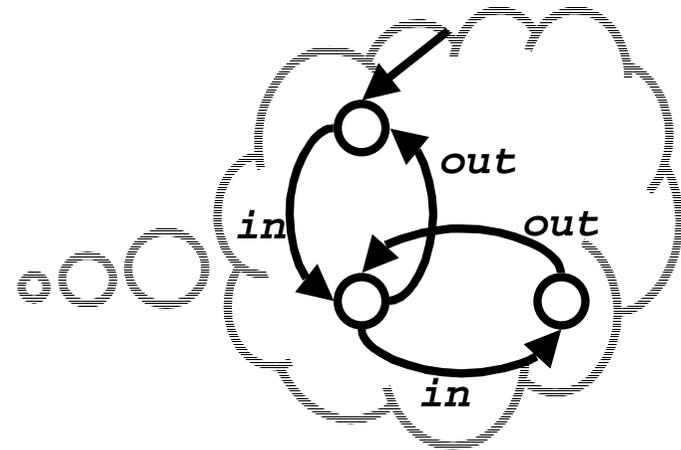


# A very basic example I I

- A two-place buffer

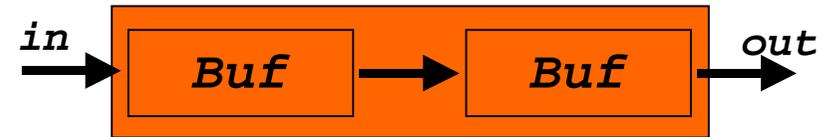


```
Buf2 := in; Half  
Half := in; Full + out; Buf2  
Full := out; Half
```



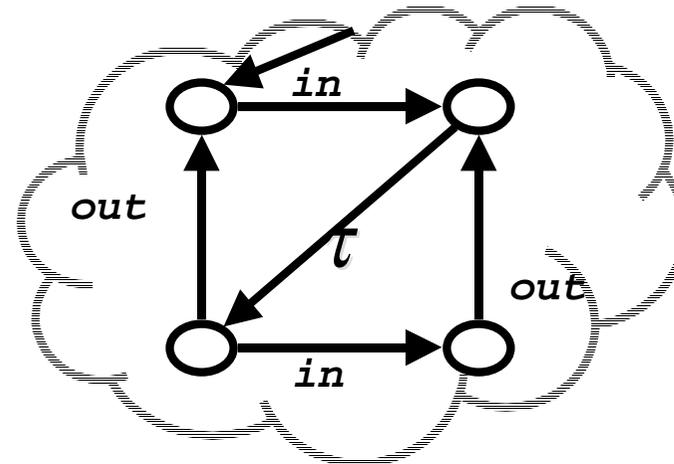
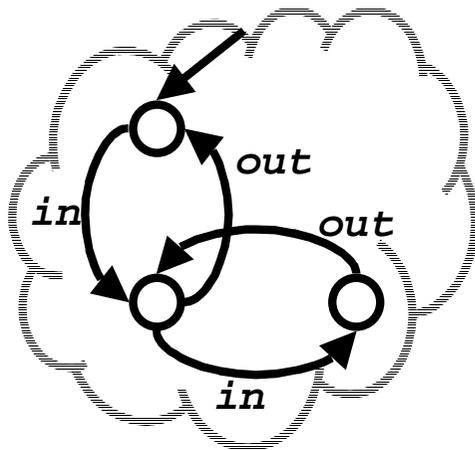
# Equivalence

Two ways to represent a **two-place** buffer:



- by enumerating the detailed behaviour

- by coupling two one place buffers



Examples for the need to study **equivalences**

# Equivalence

- Process algebraic equivalences are based on different answers to the question:

What is the **observable** part of process behaviour?

- Various notions have been studied [van Glabbeek]

Examples:

- trace equivalence
- testing equivalence
- **bisimulation** equivalence

Distinguishing features:

- **strong** vs. **weak** equivalences
- **congruence** property

# Algebraic Laws

Equivalences (congruences) induce **algebraic laws**

- $B+C = C+B$
- $(B+C)+D = B+(C+D)$
- $B+C = C+B$
- $B+\text{stop} = B$
- $B+B = B$
- $B \parallel_A C = C \parallel_A B$
- $(B \parallel_A C) \parallel_A D = B \parallel_A (C \parallel_A D)$

# Expansion Laws

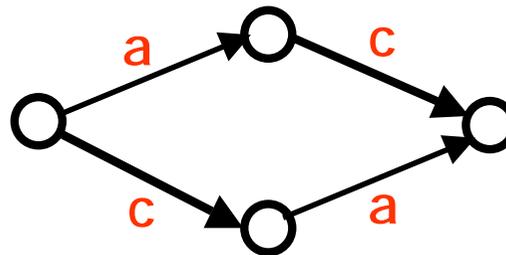
In the interleaving **interpretation** parallelism can be **removed** step by step:

Let  $B = \sum_k a_k ; B_k$  and  $C = \sum_l c_l ; C_l$

$$B \parallel_A C = \sum \{ a_k ; (B_k \parallel_A C) \mid a_k \notin A \} + \\ \sum \{ c_l ; (B \parallel_A C_l) \mid c_l \notin A \} + \\ \sum \{ d ; (B_k \parallel_A C_l) \mid d = a_k = c_l \in A \}$$

Example:

$a ; \text{stop} \parallel_{\emptyset} c ; \text{stop} = a ; c ; \text{stop} + c ; a ; \text{stop}$

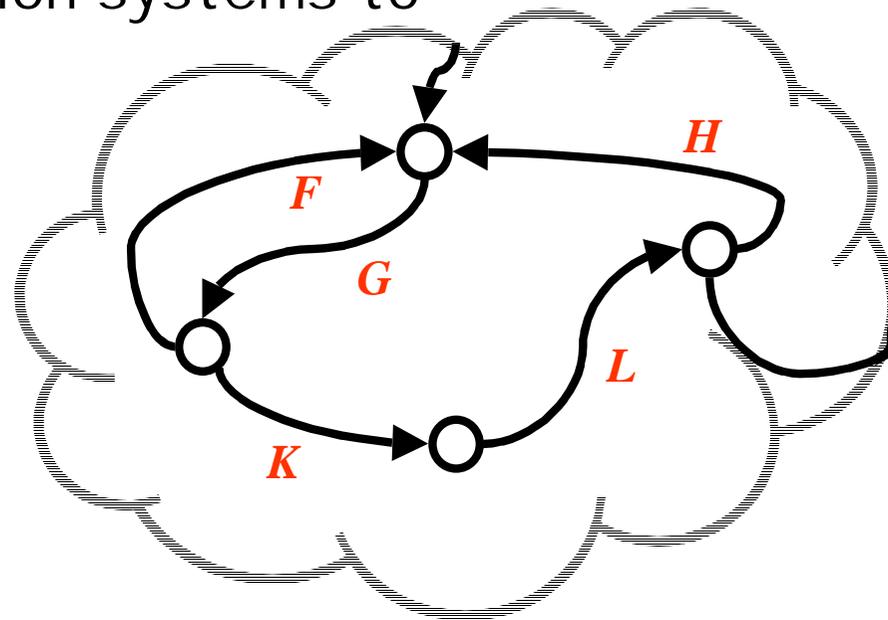


# Adding Stochastic Features

Naive idea: decorate actions with

distribution functions:

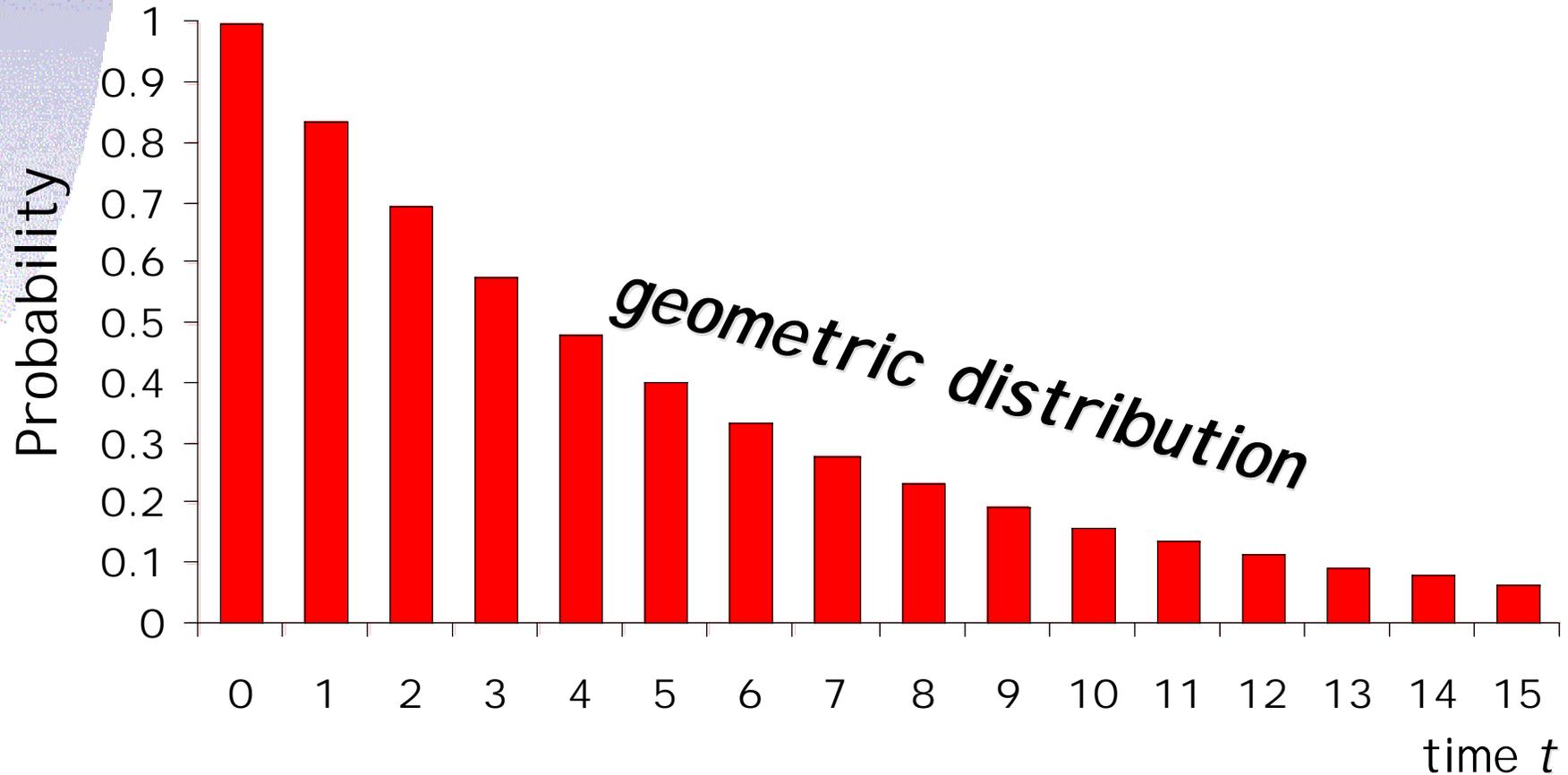
- $\alpha_F$  the time between enabling and occurrence of  $a$  is distributed according to  $F$
- linking labelled transition systems to (semi) Markov chains



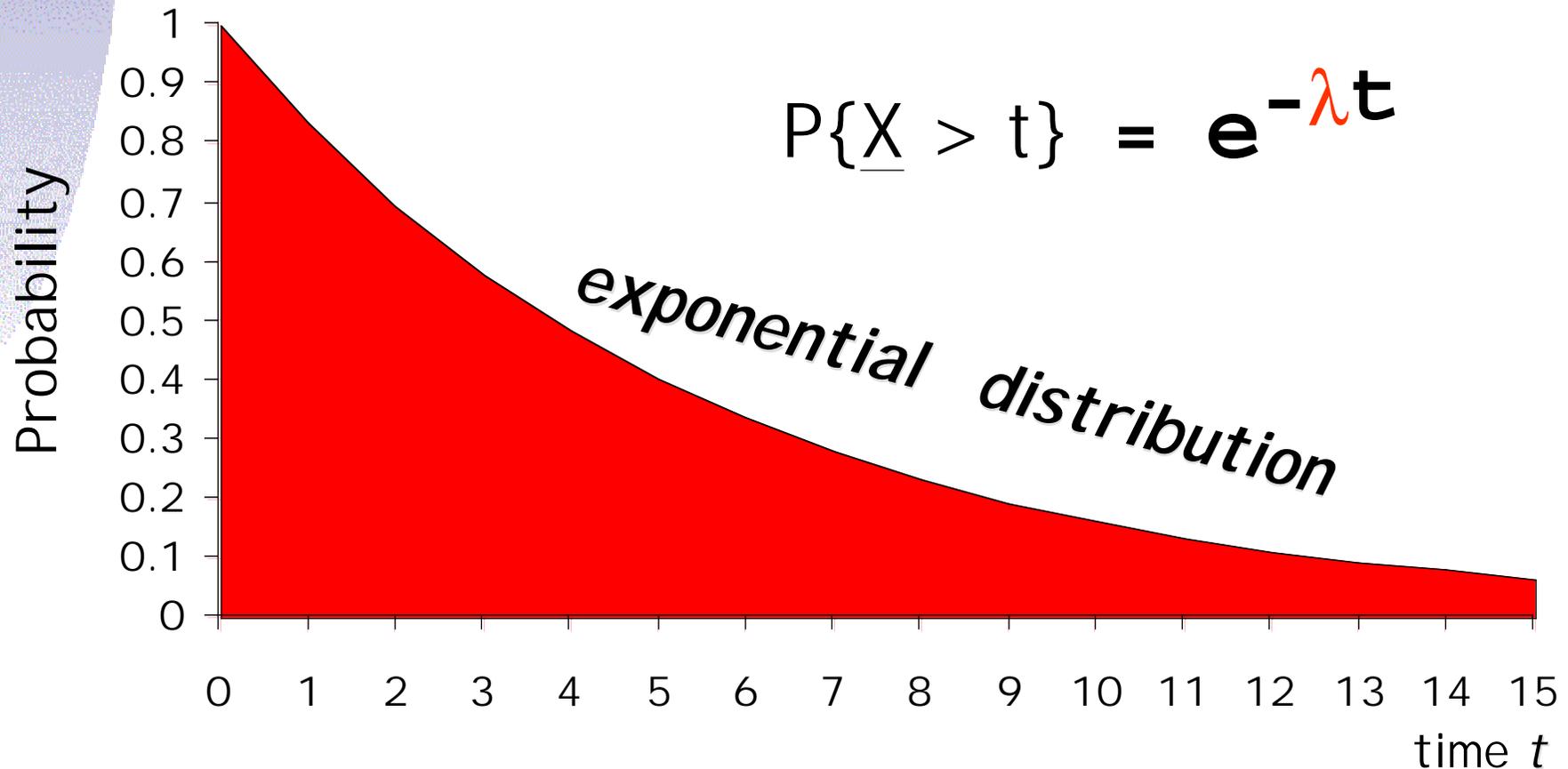
# Issues in SPA

- What **distributions** can be allowed?  
memoryless versus general distributions
- What is the meaning of **choice**?  
nondeterminism versus race conditions
- What is the meaning of **synchronization**?  
how to synchronize distributions
- What is the meaning of **concurrency**?  
how to expand parallelism

# Discrete time, no memory

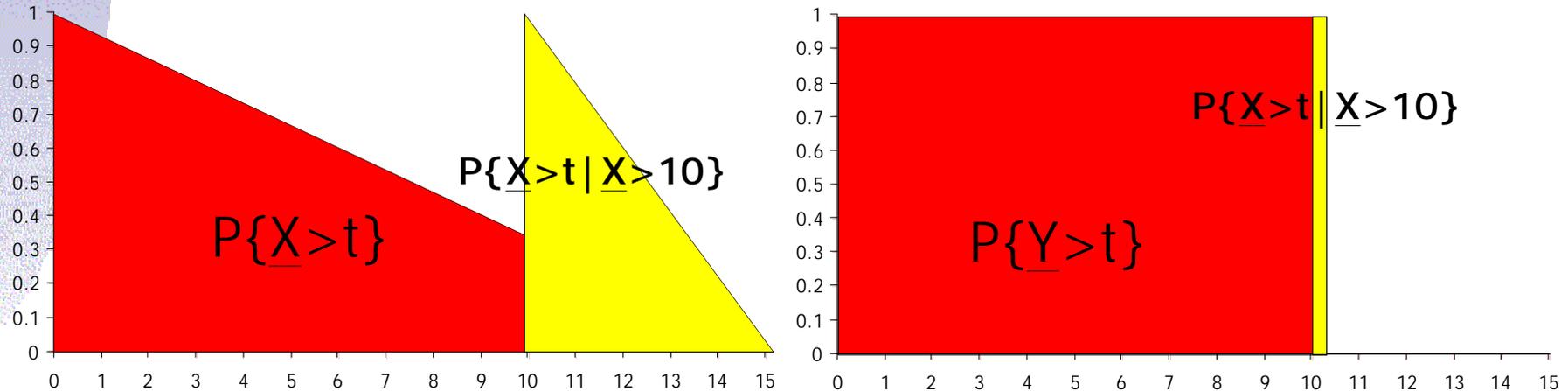


# Continuous time, no memory



stochastic models are usually developed in a  
**continuous time** domain.

# Continuous time **with** memory



- and **many** others
- absence of memory is **rare**,
- it makes modelling and analysis **a lot** simpler.

# Choice or Summation

- In ordinary PA choice is **nondeterministic**, i.e. we choose one behaviour or the other
  - the operator is **idempotent**:  $B+B = B$
  - we may refine **nondeterminism**:  $a;B$  refines  $a;B+a;C$
- In SPA choice is **capacitative**, i.e. both arguments add capacity to the behaviour
 

**Markovian nondeterminism** is **additive**  $a_{\lambda}; B+a_{\mu}; B = a_{\lambda+\mu}; B$

as a function of the exponential **rates**:

# Interleaving revisited

For **general distributions** we do **not** have the usual interleaving laws, e.g.:

$$a_F; B \parallel\parallel c_G; C \neq a_F; (B \parallel\parallel c_G; C) \parallel\parallel c_G; (a_F; B \parallel\parallel C)$$

The occurrence of **a after c** generally has another distribution than **a occurring initially**.

# Solutions

- restrict to the **Markovian** case

$$a_\lambda ; B \parallel c_\mu ; C = a_\lambda ; (B \parallel c_\mu ; C) + \\ c_\mu ; (a_\lambda ; B \parallel C)$$

Problem: less general

- **separate** actions from stochastic durations

$$\text{set}_{\{F,G\}}(F \rightarrow a ; B \parallel G \rightarrow c ; C) = \\ \text{set}_{\{F,G\}}(F \rightarrow a ; (B \parallel G \rightarrow c ; C) + \\ G \rightarrow c ; (F \rightarrow a ; B \parallel C))$$

This solution is elaborated in the rest of this talk

# Alternatives

- **drop** the interleaving law  
uses so-called **partial order semantics**

Problem: more complicated,  
but smaller state spaces

- use **conditional** distributions

$$\begin{aligned}
 \underline{a}_X ; B \parallel \underline{c}_Y ; C = \\
 \underline{a}_X ; (B \parallel \underline{c}_{(Y-X|X<Y)} ; C) + \\
 \underline{c}_Y ; (\underline{a}_{(X-Y|X>Y)} ; B \parallel C)
 \end{aligned}$$

Problem: costly and complicated

# Synchronization

What should be the **result** of synchronizing stochastic actions?

$$a_{\underline{X}} ; B \parallel a_{\underline{Y}} ; C = a_{\underline{X} * \underline{Y}} ; (B \parallel C)$$

Choices for \* :

- the **maximum** of the distributions of  $\underline{X}$  and  $\underline{Y}$
- the **average** of  $\underline{X}$  and  $\underline{Y}$
- ?

# Synchronization & Expansion

Problem: race condition interferes with classical expansion

- **no classical** expansion [Hillston:PEPA]  
apparent rates
- **passive** components [Gorrieri, Bernardo,MPA]  
master/slave synchronization
- defining  $\lambda^* \mu = \lambda.\mu$  [Herzog e.a.,TI PP;Buchholz]
- **separate** rates from actions [Hermanns,IMC]

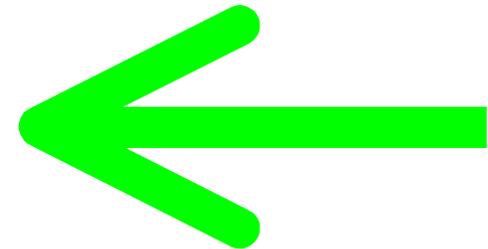
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Interactive Markov Chains



# Interactive Markov chains

- inaction: **stop**
- prefix:  $(\lambda); B$  or  $a; B$  or  $\tau; B$
- choice:  $B + C$  or  $\Sigma_i B_i$
- definition:  $p := B$
- application:  $p$
- composition:  $B ||_A C$  or  $B |[A]| C$
- hiding:  $B \setminus A$  or  
**hide A in B**

# Algebraic Laws for IMC

- $B + C = C + B$
- $(B + C) + D = B + (C + D)$
- $B + \text{stop} = B$
- $(\lambda);B + (\mu);B = (\lambda + \mu);B$
- $a;B + a;B = a;B$

*These are the algebraic laws for strong Markovian bisimulation, a straightforward combination of strong bisimulation and lumpability.*

# Algebraic Laws for IMC

- $B + C = C + B$
  - $(B + C) + D = B + (C + D)$
  - $B + \text{stop} = B$
  - $a;B + a;B = a;B$
- $a;\tau;B = a;B$
  - $B + \tau;B = \tau;B$
  - $a;(B + \tau;C) + a;C = a;(B + \tau;C)$
- $(\lambda);B + (\mu);B = (\lambda+\mu);B$

"maximal progress"

- $(\lambda);\tau;B = (\lambda);B$
  - $\tau;B + (\lambda);C = \tau;B$

*These are the algebraic laws for weak Markovian bisimulation, a (not so straightforward) combination of weak bisimulation and lumpability.*

# Expansion in IMC

The **delay** actions can be treated as **non-synchronizing** actions:

$$\text{Let } \mathbf{B} = \sum_k \mathbf{a}_k ; \mathbf{B}_k + \sum_m (\lambda_m) ; \mathbf{B}_m$$

$$\text{and } \mathbf{C} = \sum_l \mathbf{c}_l ; \mathbf{C}_l + \sum_n (\mu_n) ; \mathbf{B}_n$$

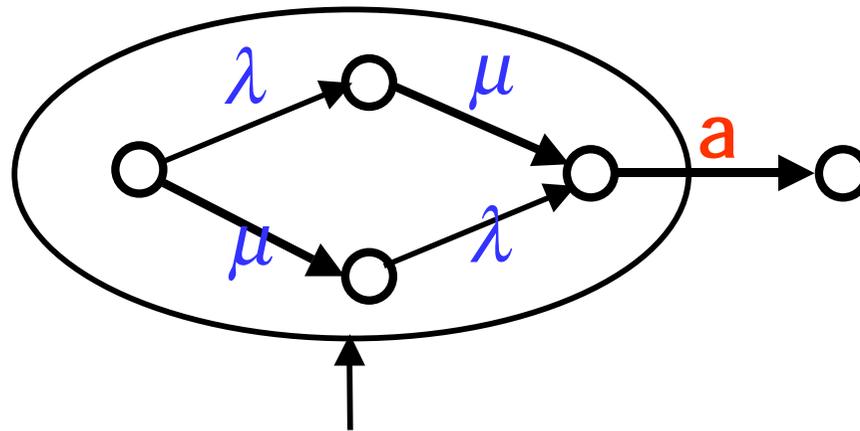
then

$$\begin{aligned} \mathbf{B} \parallel_A \mathbf{C} = & \sum \{ \mathbf{a}_k ; (\mathbf{B}_k \parallel_A \mathbf{C}) \mid \mathbf{a}_k \notin A \} + \\ & \sum_m \{ (\lambda_m) ; (\mathbf{B}_m \parallel_A \mathbf{C}) \} + \\ & \sum \{ \mathbf{c}_l ; (\mathbf{B} \parallel_A \mathbf{C}_l) \mid \mathbf{c}_l \notin A \} + \\ & \sum_n \{ (\mu_n) ; (\mathbf{B} \parallel_A \mathbf{C}_n) \} + \\ & \sum \{ \mathbf{d} ; (\mathbf{B}_k \parallel_A \mathbf{C}_l) \mid \mathbf{d} = \mathbf{a}_k = \mathbf{c}_l \in A \} \end{aligned}$$

# Example

$$(\lambda); a; \text{stop} \parallel (\mu); a; \text{stop} =$$

$$(\lambda); (\mu); a; \text{stop} + (\mu); (\lambda); a; \text{stop}$$



This corresponds to delaying with the **maximum** of two exponential delays, e.g. **waiting for the slowest**

# Queuing Systems in IMC

**hide** enter,serve **in**

CUSTOMER |[enter]| QUEUE(0) |[serve]| SERVER

arriving customers:

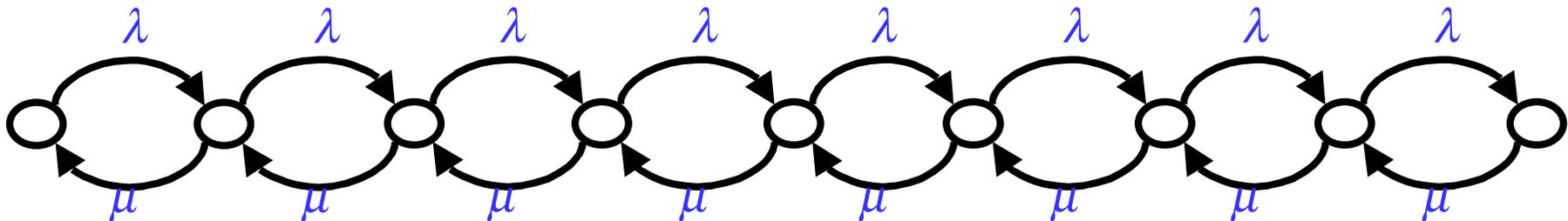
```
process CUSTOMER := ( $\lambda$ ); enter ; CUSTOMER
endproc
```

queue:

```
process QUEUE(i) := [i<6]-> enter; QUEUE(i+1)
                  [i>0]-> serve; QUEUE(i-1)
endproc
```

service clerk:

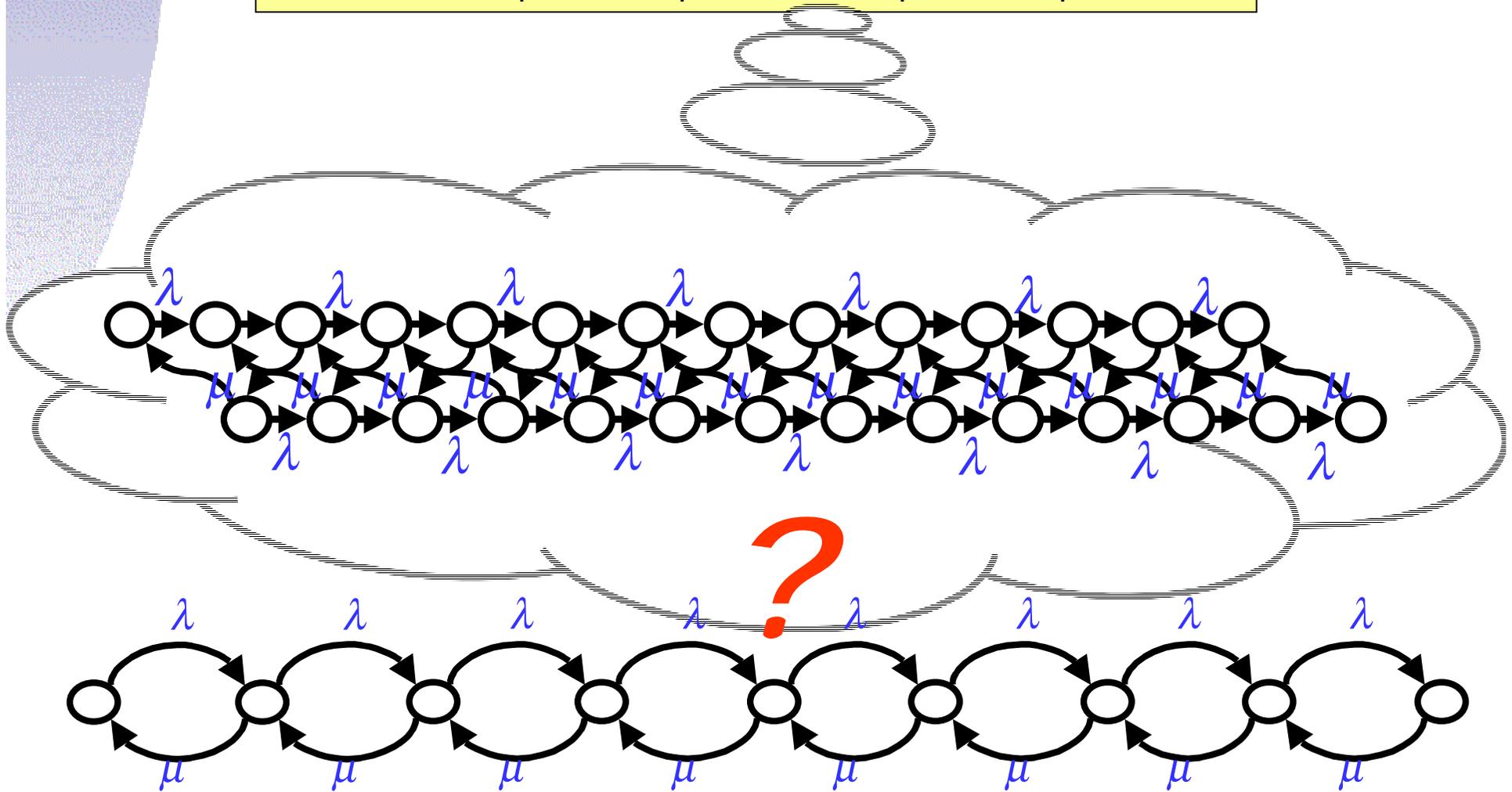
```
process SERVER := serve ; ( $\mu$ ) ; SERVER
endproc
```



# Queuing Systems in IMC

**hide enter,serve in**

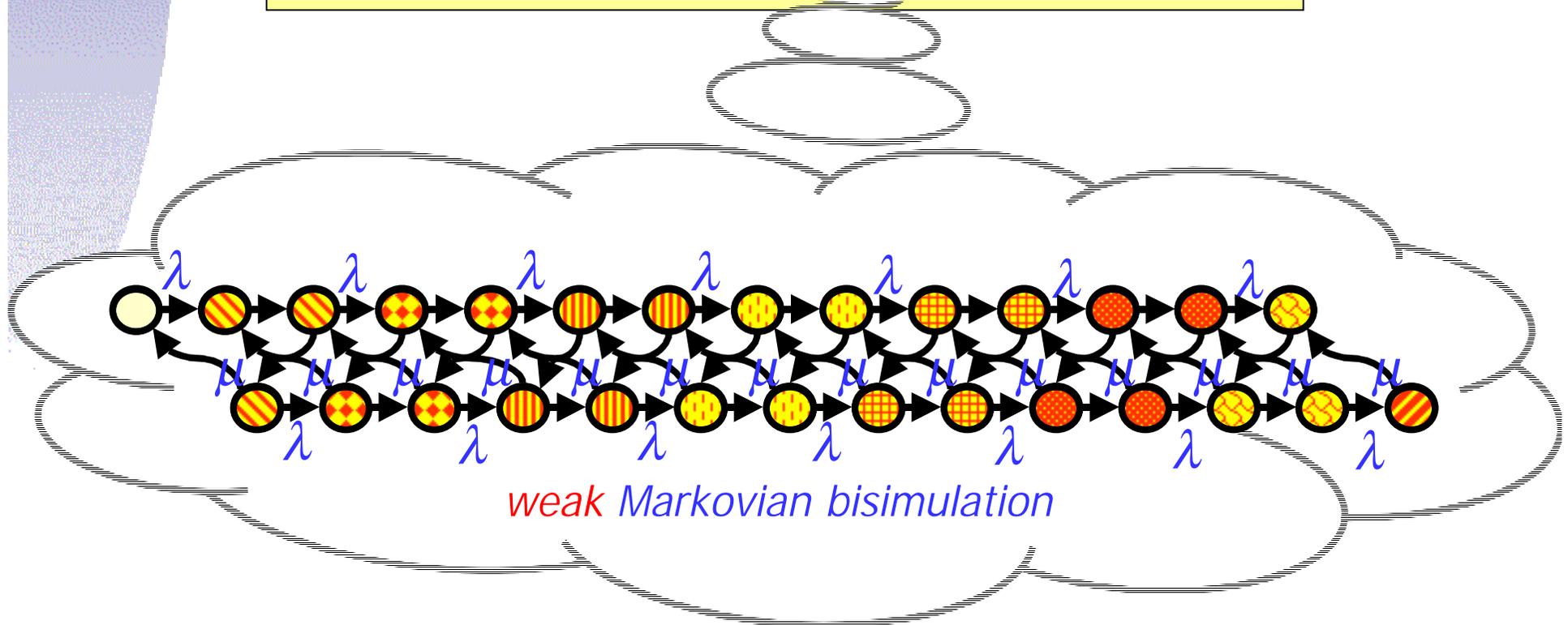
**CUSTOMER | [enter] | QUEUE(0) | [serve] | SERVER**



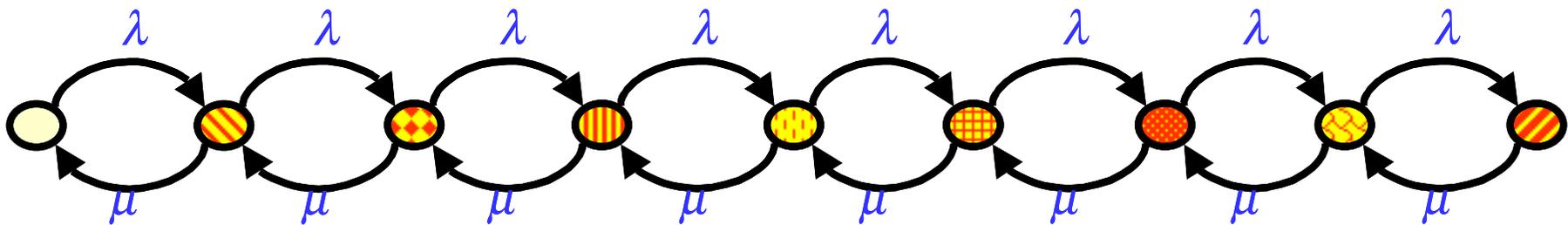
# Queuing Systems in IMC

**hide** enter,serve in

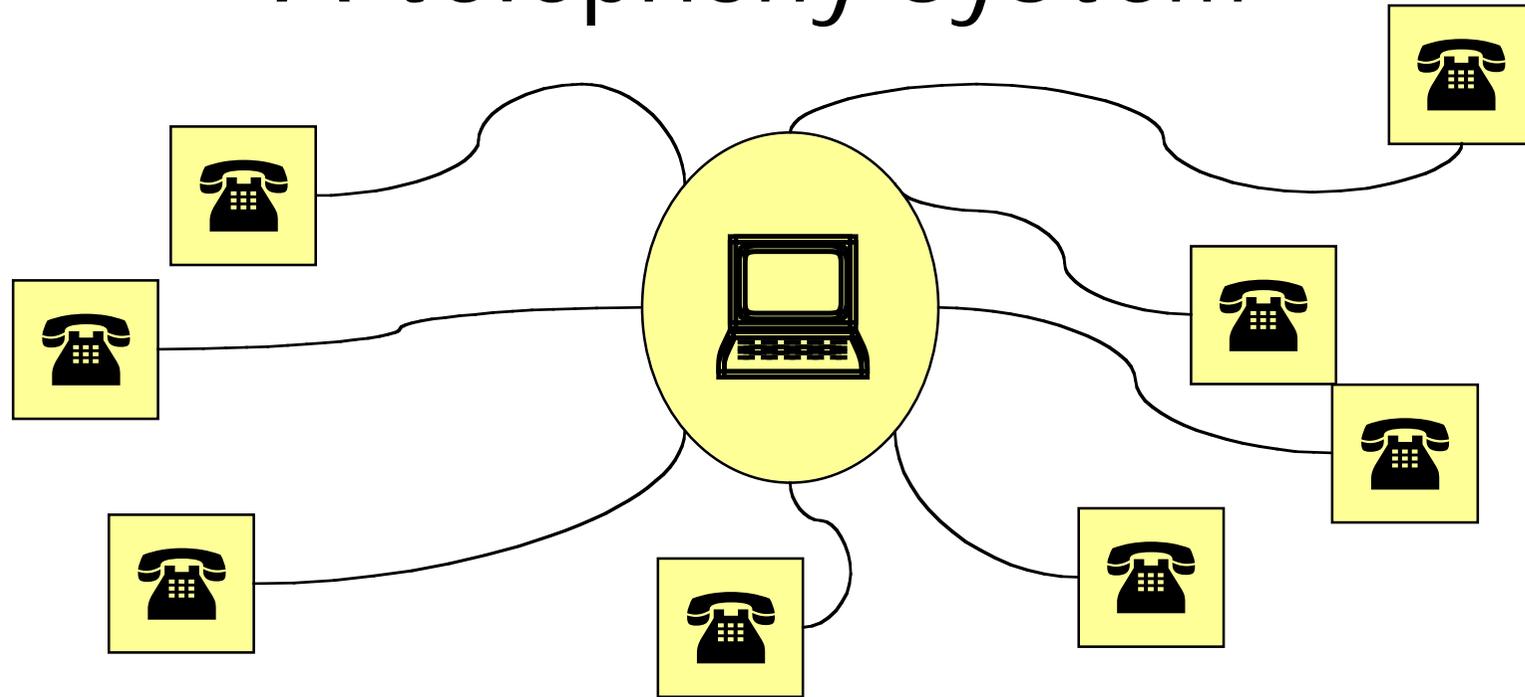
CUSTOMER | [enter] | QUEUE(0) | [serve] | SERVER



*weak Markovian bisimulation*



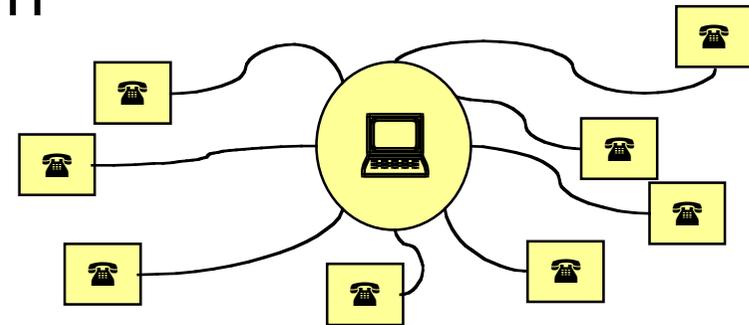
# A telephony system



- Original specification developed by P. Ernberg (SICS), further studied in the French/Canadian *Eucalyptus* project: more than 1500 lines of LOTOS.
- Extensively verified using state-of-the-art techniques
  - model checking
  - equivalence checking

# Performance analysis of the telephony system

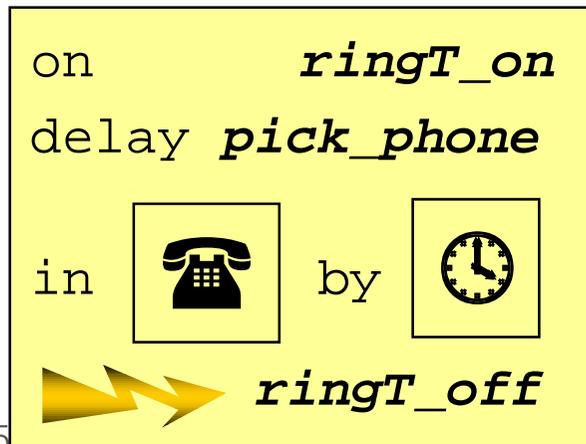
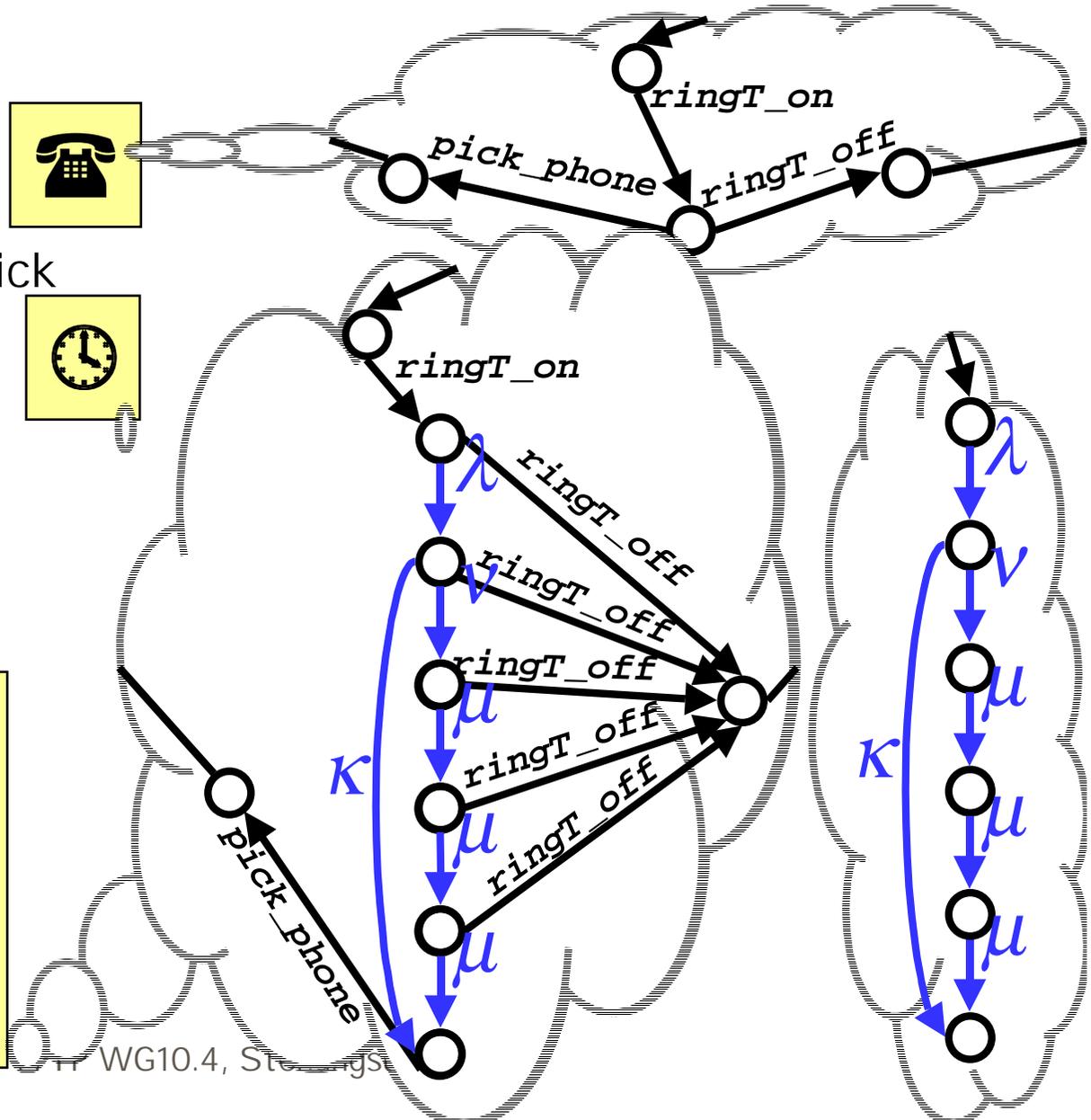
- Takes the original specification *without changes*.
- Stochastic delays are incorporated
  - in a compositional way, i.e. as additional constraints imposed on the specification.
  - *exponential, Erlang and phase-type* distributions.
- *Weak bisimulation* is used to factor out nondeterminism.
- State space  $> 10^7$  leads to a Markov Chain of **720** states with a *highly irregular* structure.



*using a dedicated operator,  
time constraints*

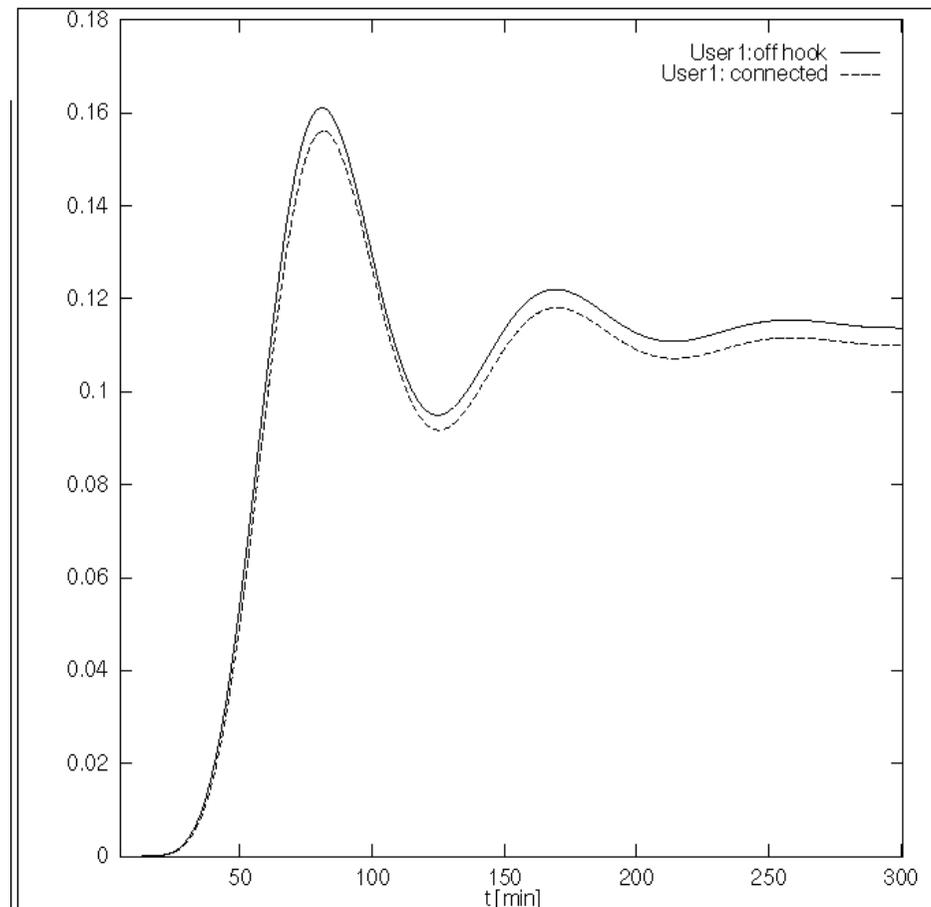
# Time constraints

- A particular phone:
- The time it takes to pick up the phone:
- The phone with time constraints:



# Analysis results

- 14 different time constraints incorporated.
- Compositional minimisation to avoid state space explosion.
- Here: two subscribers phoning each other.





# Tools used

- CAESAR/ALDEBARAN
  - original specification,
  - first minimisation steps.

- TIPtool
  - time constraints,
  - final minimisations,
  - numerical analysis.

5th July, 2001

The image shows a screenshot of the TIPtool 2.32 interface. The main window displays a Petri net specification for a queuing system with JSQ service strategy. The specification includes an arrival process, a scheduler, and two queues with servers. A graph window titled 'Probability of both queues empty' is overlaid on the bottom left, showing the probability  $P(n_1=0 \text{ and } n_2=0) \times 10^{-3}$  as a function of the number of arrivals. The graph shows a curve that starts at 0 and increases to approximately 500.00 at 15.00 arrivals.

```
Actual Model: jsq.tpp
(*
 * Queuing System with JSQ service strategy
 *)
specification JSQ

behaviour
Arrival I[arrive]]

(hide ask, repl, enq, deq in
 (Scheduler(2,1,1,100,100)
  I[ask,repl,enq]]
 ((Queue(1,0) I[deq]] Server(1)) III
 (Queue(2,0) I[deq]] Server(2))
 )
 )
```

Graph: Probability of both queues empty  
Y-axis:  $P(n_1=0 \text{ and } n_2=0) \times 10^{-3}$   
X-axis: mu

mu	Probability of both queues empty ( $\times 10^{-3}$ )
0	0.00
5.00	50.00
10.00	300.00
15.00	500.00

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- Non-Markovian Process Algebra

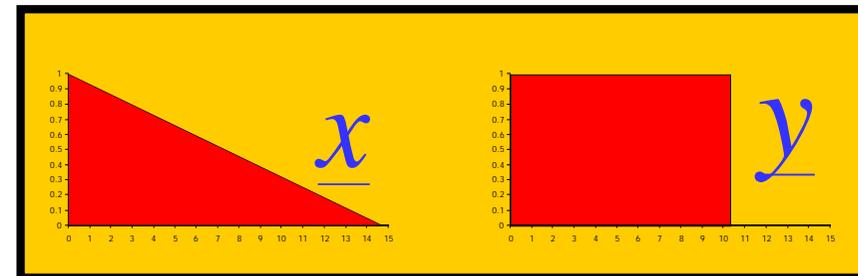
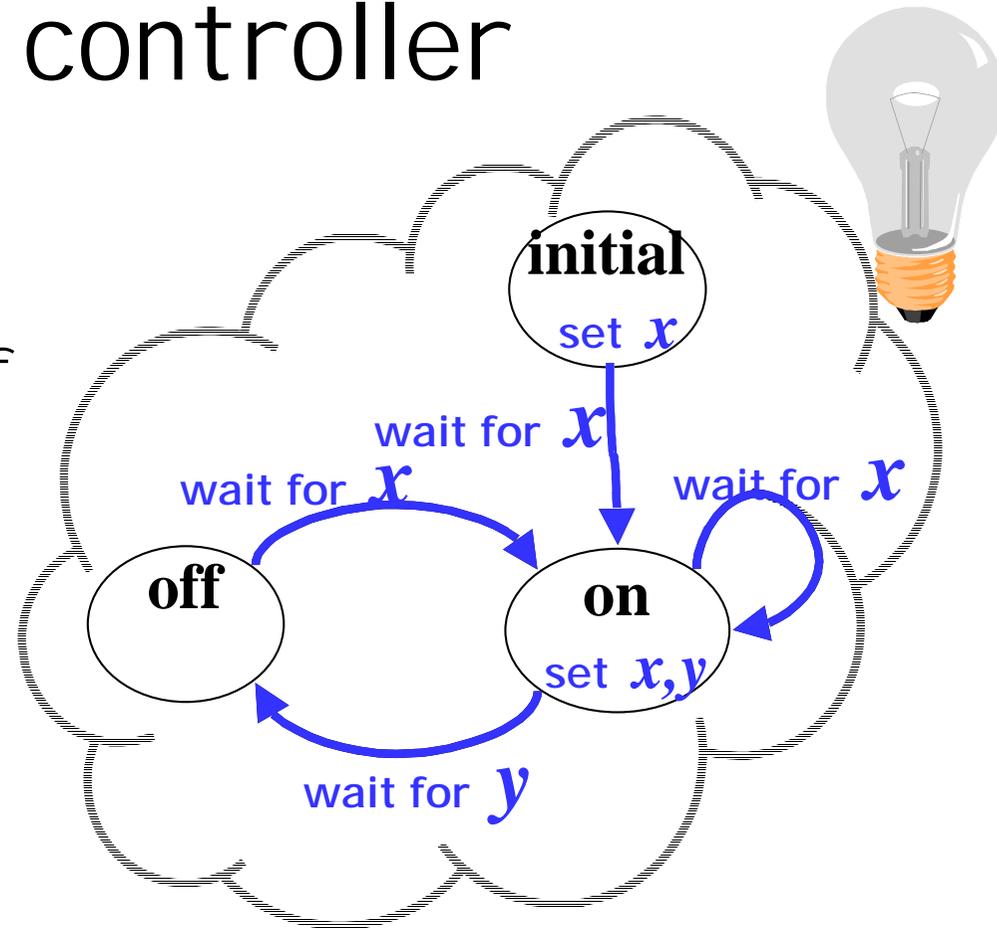
GSMPs, Discrete Event Simulation.

# Non-Markovian approaches

- Traditional methods:
  - queueing networks
  - stochastic Petri nets (SPN)
  - generalized semi-Markov processes (GSMP)
  - no compositionality
- General SPAs: **TIPP, GSPA,  $S\pi^+$** 
  - compositionality
  - no expansion law
  - infinite semantic objects for recursion

# A light controller

- The light is turned **on** if someone enters the stairway.
- It goes **off** after **10.3** minutes exactly.
- People arrive randomly, at least every **15** minutes, with **uniform** probability.



# A light controller

```

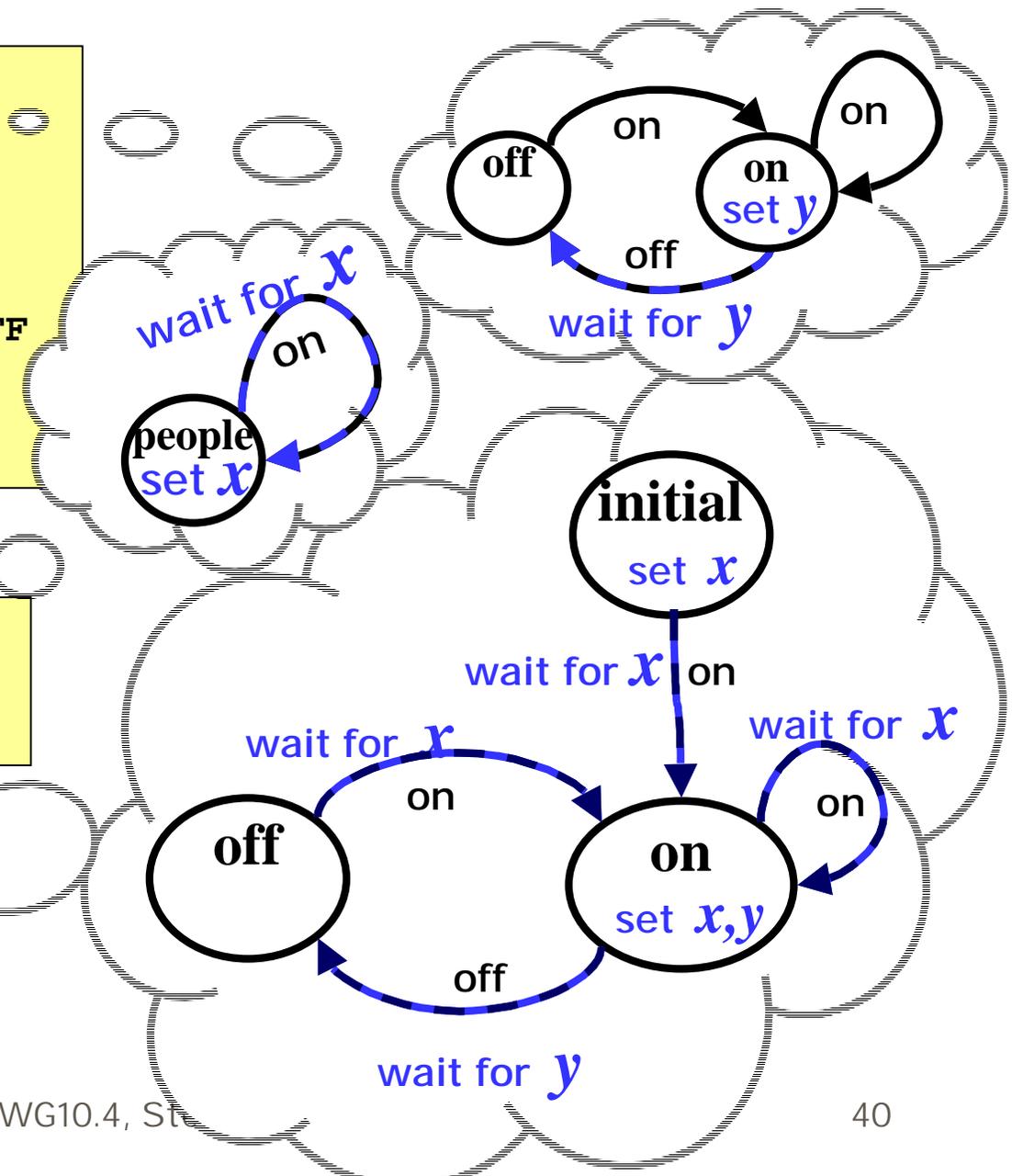
process LIGHT_OFF :=
  on ; LIGHT_ON
endproc

process LIGHT_ON :=
  {|y|}{y} -> off; LIGHT_OFF
  + on ; LIGHT_ON
endproc
  
```

```

process PEOPLE :=
  {|x|}{x} -> on; PEOPLE
endproc
  
```

*PEOPLE* |[on]| *LIGHT\_OFF*



# Stochastic automata (SA)

- model inspired by **Timed Automata** [Alur&Dill]
- close link to **GSMPs** [Whitt, Glynn]
- based on a notion **clocks**
- **compositional**
- **operational** model of a **process algebra** ♠
- **expansion laws** and **finite objects**

# Ingredients of an SA

$(S, s_0, C, A, \rightarrow, K, F)$

- control states or locations  $S$
- initial state  $s_0$
- finite set of clocks  $C$
- actions  $A$
- transition relation  $\rightarrow$
- clock assignment  $K$
- distribution assignment  $F$

# The algebra ♠

- signature of ordinary PA

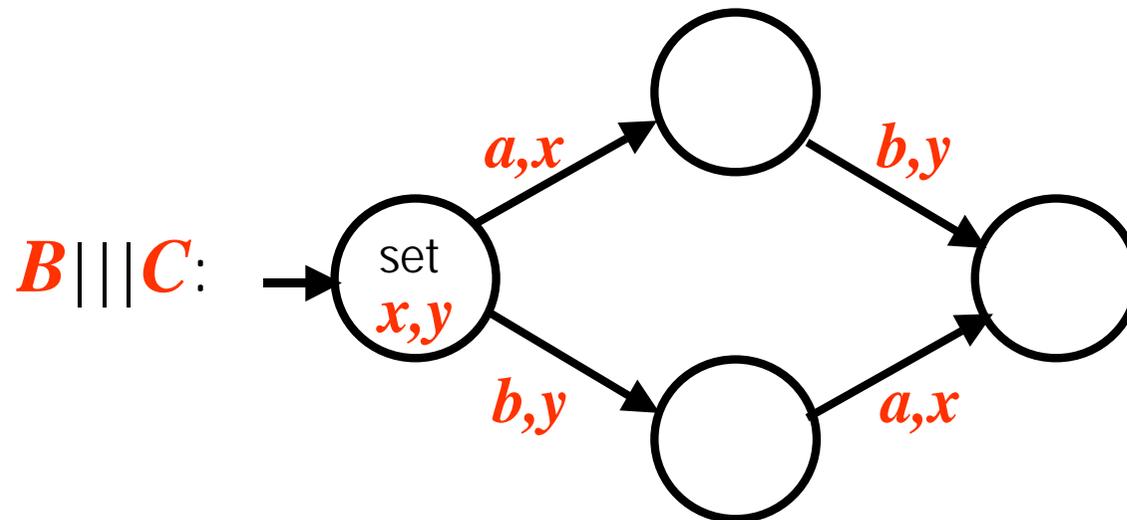
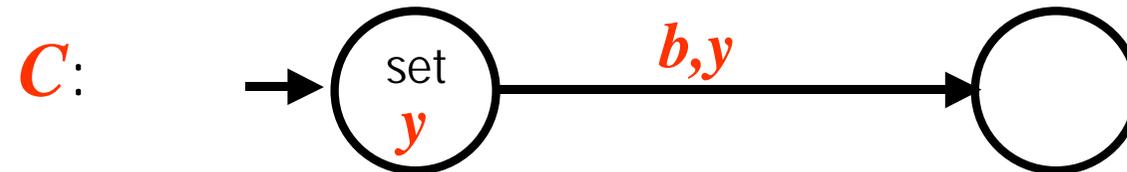
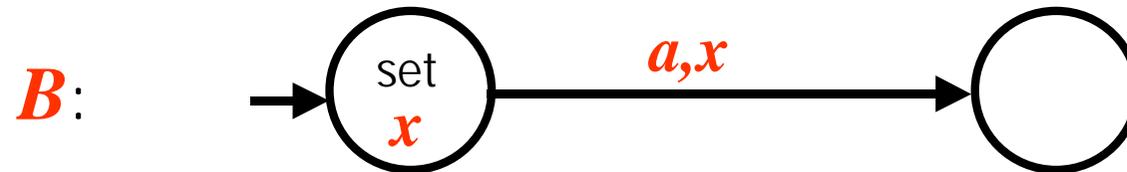
$a;B$  ,  $B + C$  ,  $B ||_A C$  ,  $B \setminus A$  , etc.

- clock related operators

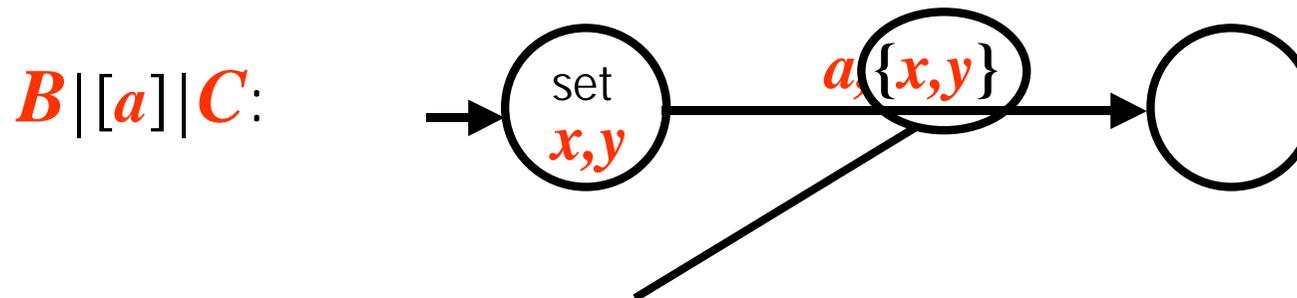
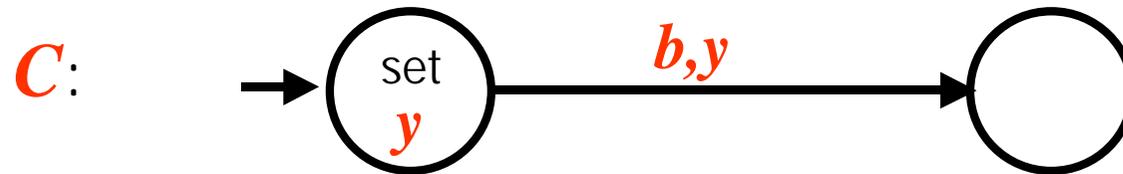
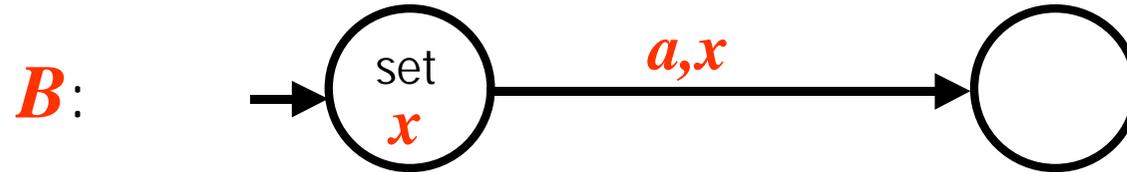
- **clock setting:**  $\{|C|\} B$

- **guarding:**  $C \rightarrow B$

# Parallel composition



# Synchronization



Synchronization by **union** of guards = **maximum** of distributions

# Expansion law

Let  $B = \{ |C| \} B'$  and  $D = \{ |C'| \} D'$

with  $B' = \sum_k C_k \rightarrow a_k ; B_k$  and  $D' = \sum_l C_l \rightarrow c_l ; D_l$

then

$B \parallel_A C =$

$\{ |C \cup C'| \}$

$( \sum \{ C_k \rightarrow a_k ; (B_k \parallel_A C) \mid a_k \notin A \} +$

$\sum \{ C_l \rightarrow c_l ; (B \parallel_A C_l) \mid c_l \notin A \} +$

$\sum \{ (C \cup C') \rightarrow d ; (B_k \parallel_A C_l) \mid d = a_k = c_l \in A \} )$

# An application

A multiprocessor mainframe

[Herzog & Mertsiotakis]

- different programming jobs
- different user transactions
- maintenance database
- occurrence of software failures

# A specification

System := Load ||<sub>L</sub> ( Mainframe ||<sub>F</sub> Maintain )

Load := PL<sub>1</sub> ||<sub>c</sub> UL<sub>1</sub> ||<sub>c</sub> FL<sub>1</sub> ||<sub>c</sub> ChangePhase

ChangePhase := change(x<sub>w(v,w)</sub>) ; ChangePhase

UL<sub>1</sub> := nextUserJob(xu<sub>exp(μ<sub>1</sub>)</sub>) ;  
 (userJob ; UL<sub>1</sub> + reject ; UL<sub>1</sub>)  
 + change ; UL<sub>2</sub>

UL<sub>2</sub> := ...      UL<sub>3</sub> := ...

Mainframe := Queues ||<sub>G ∪ F</sub> ( P<sub>1</sub> ||<sub>F</sub> P<sub>2</sub> ||<sub>F</sub> ... ||<sub>F</sub> P<sub>m</sub> )

Maintain := fail ; repair(z<sub>γ(c,c')</sub>) ; Maintain

a(z) ; P is shorthand for  
 { |z| } { z } → a ; P

# Simulation

- using **variable time advance** procedure
- relevant history of system stored in **finite** expressions in ♠
- calculate relevant parts of the SA **on-the-fly** using **expansion** theorem

# Conclusion

It is possible to **model** and **analyse** both **qualitative** and **quantitative aspects** of reactive systems in **one** (family of) **formalism(s)**

Markov chains  $\Leftrightarrow$  Markovian PA & TIPPtool  
**analytic techniques & numerical algorithms**

GSMPs  $\Leftrightarrow$  stochastic automata & ♠  
**discrete event simulation**

**+ qualitative analysis & nondeterminism**

# Current developments

- modelling language & toolset **MoDeST**
  - data structures
  - real time & stochastic time
  - open tool architecture
- model checking on CTMCs:  **$E_{\tau\theta}MC^2$** 
  - specification logic for performance measures
  - automated property-driven CTMC simplification & analysis