

# Process Algebras for Quantitative Analysis

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28th June 2005

# Outline

Introduction

Compositionality: Interaction and Independence

Applications and Acceptance

Conclusions

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Compositionality: Interaction and Independence

Applications and Acceptance

Conclusions

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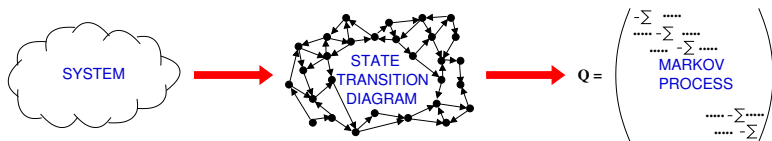
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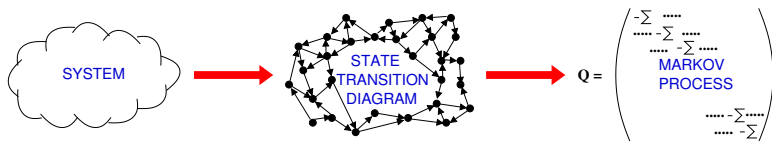
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- ▶ Process algebras offered a compositional description technique supported by apparatus for formal reasoning.
- ▶ Performance Evaluation Process Algebra (PEPA) sought to address these problems by the introduction of a suitable process algebra.
- ▶ We have sought to investigate and exploit the **interplay** between the **process algebra** and the continuous time **Markov chain** (CTMC).



# Performance Modelling using CTMC



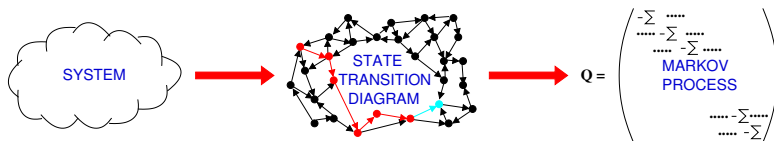
# Performance Modelling using CTMC



A stochastic process  $X(t)$  is a Markov process iff for all  $t_0 < t_1 < \dots < t_n < t_{n+1}$ , the joint probability distribution of  $(X(t_0), X(t_1), \dots, X(t_n), X(t_{n+1}))$  is such that

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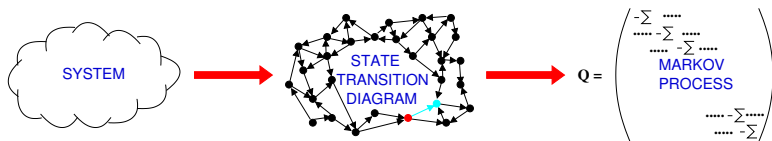
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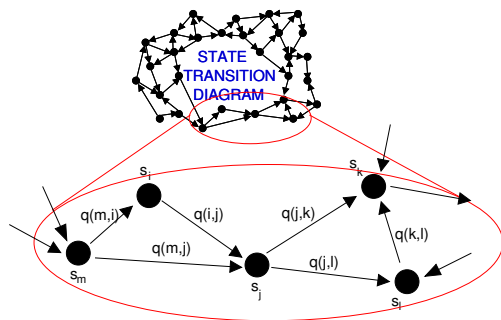
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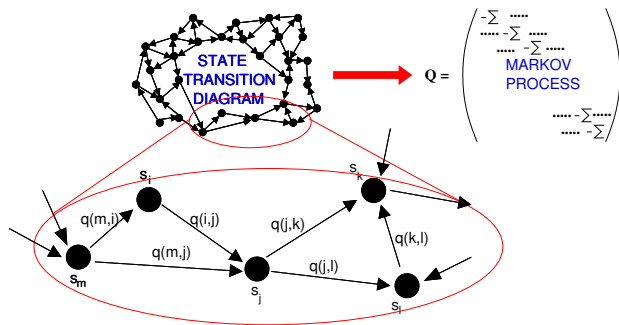
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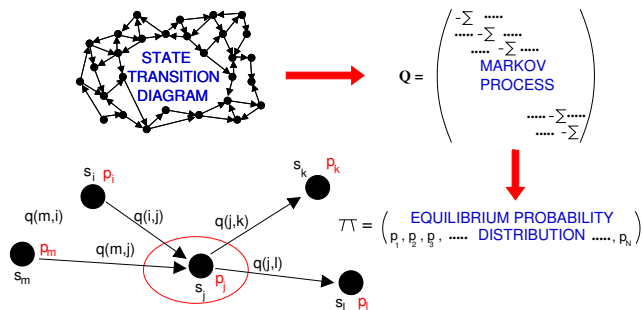
A negative exponentially distributed duration is associated with each transition.

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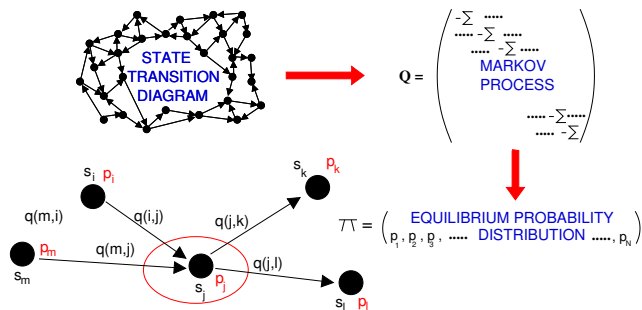
these parameters form the entries of the infinitesimal generator matrix  $Q$

# Performance Modelling using CTMC



In steady state the probability flux out of a state is balanced by the flux in.

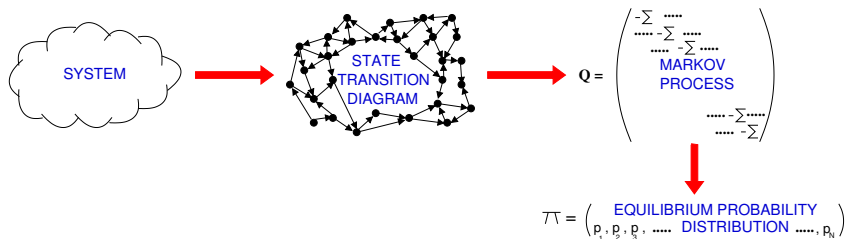
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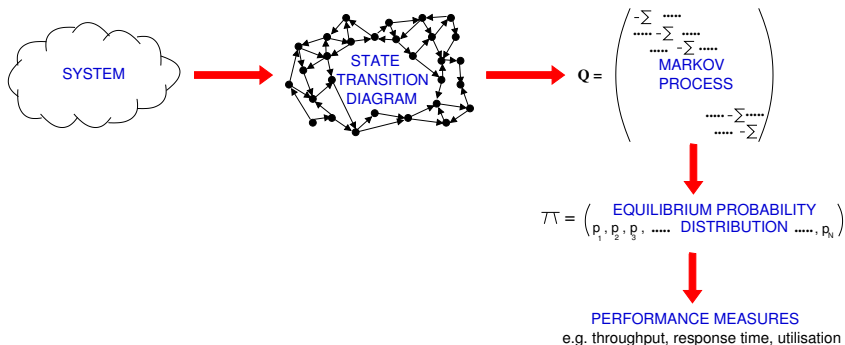
"Global balance equations" captured by  $\pi Q = 0$  solved by linear algebra



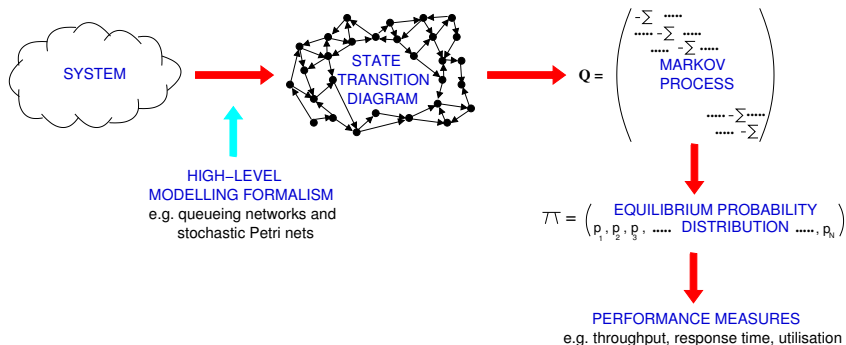
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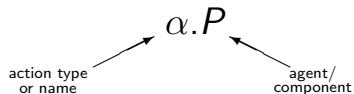


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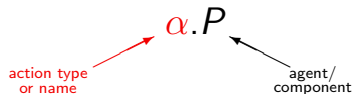
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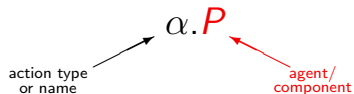
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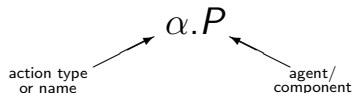
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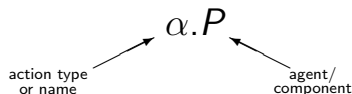
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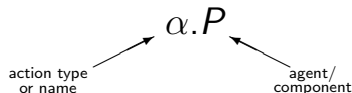
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## Process algebra model



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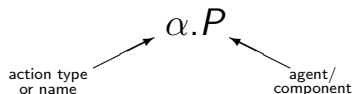


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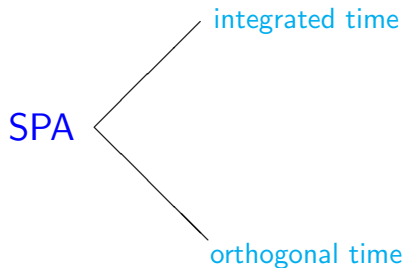
**Compositionality:** Established benefits for decomposed qualitative analysis as well as model construction for complex systems. Compositionality for quantitative analysis would address the state space explosion problem.

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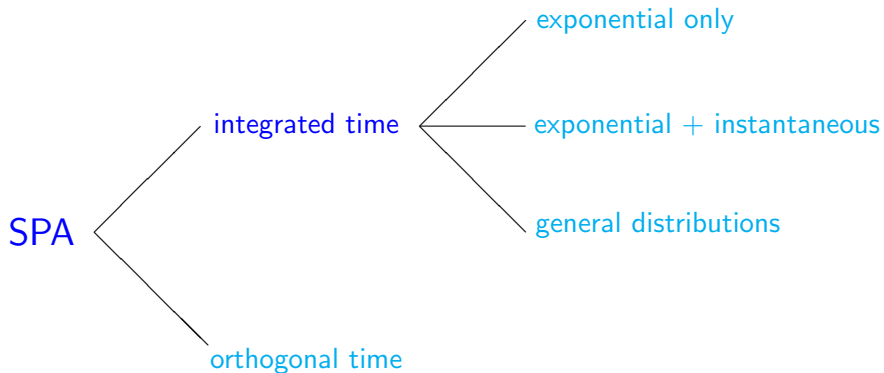
# SPA Languages

SPA

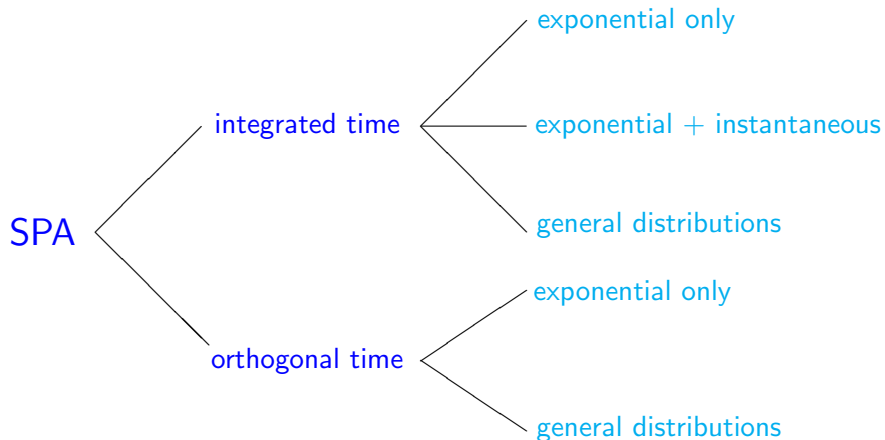
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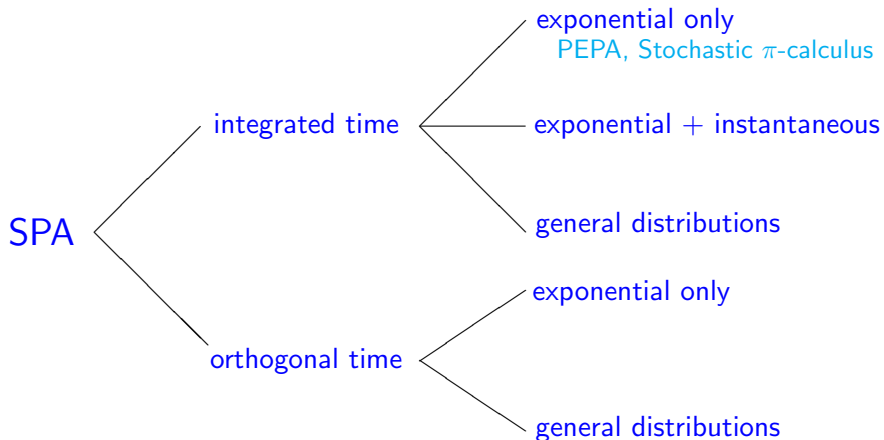
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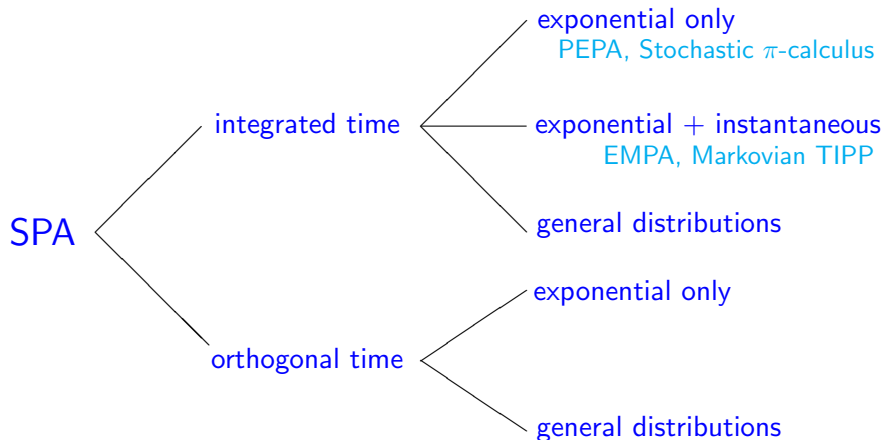
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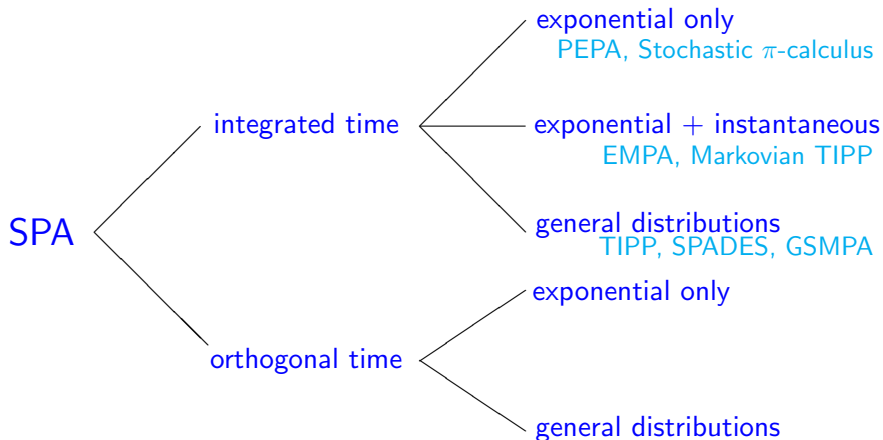
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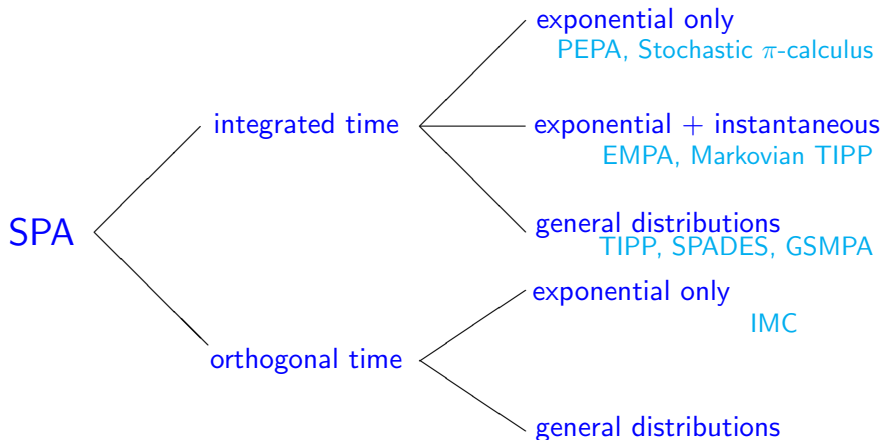


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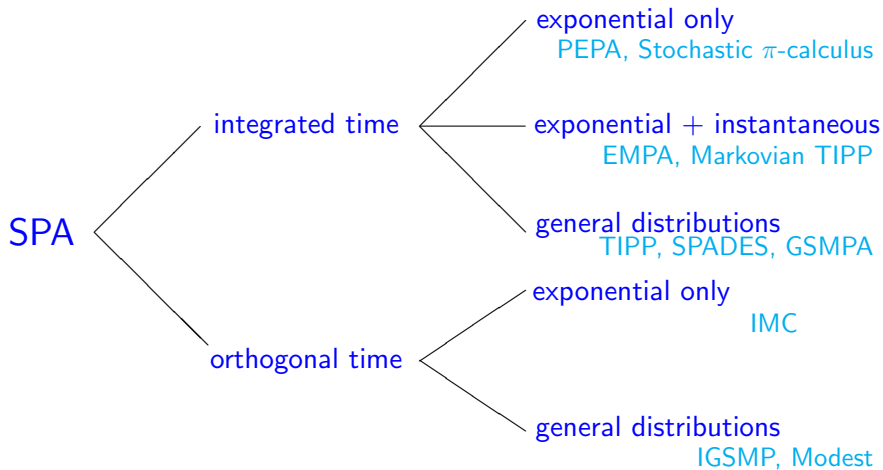




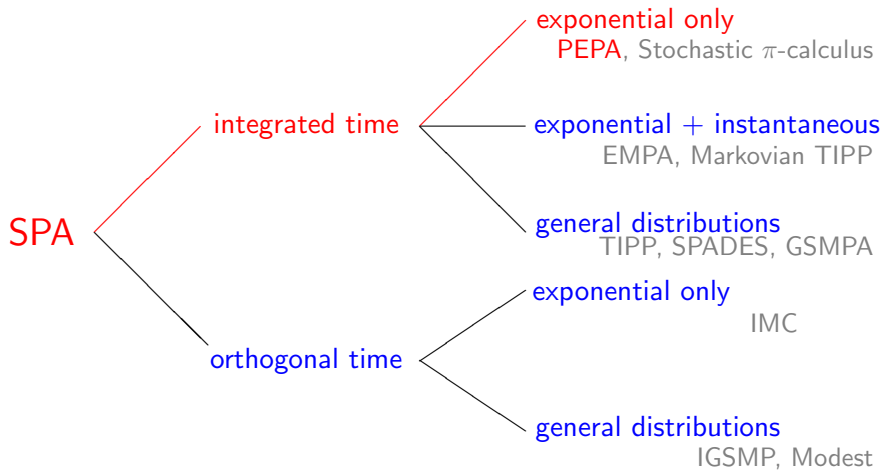
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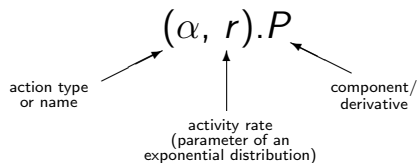


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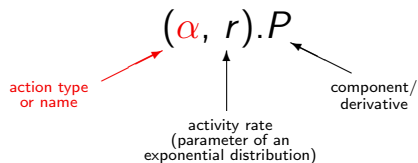
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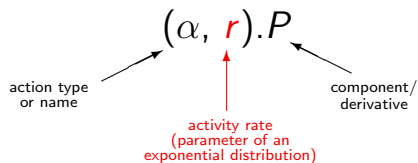
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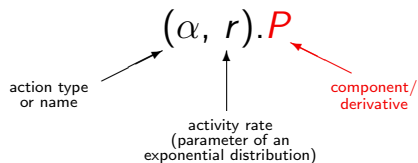
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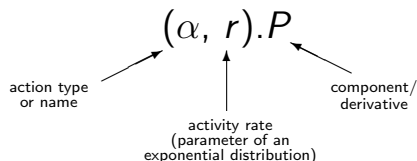
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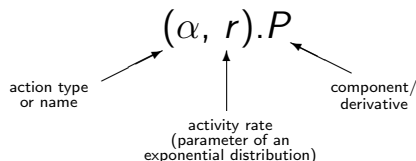


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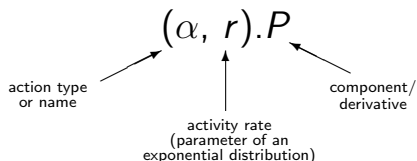


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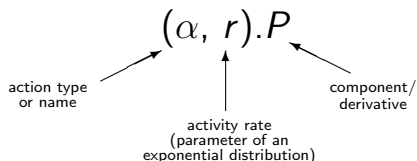


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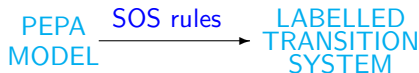
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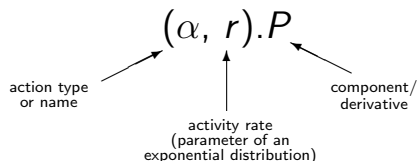


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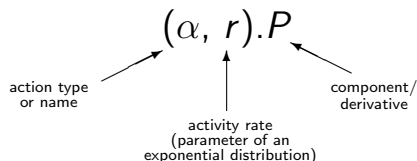


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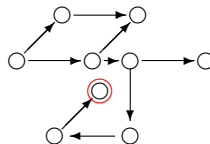
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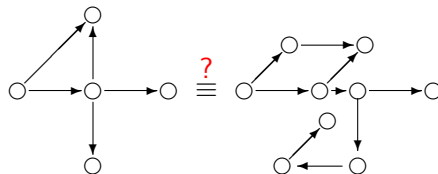
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Does system behaviour match its specification?

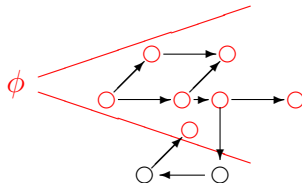




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Does a given property  $\phi$  hold within the system?



# Integrated analysis

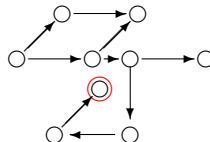
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# Integrated analysis

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## Reachability analysis

How long will it take  
for the system to arrive  
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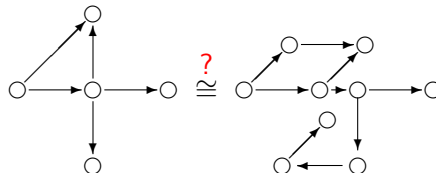


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## Specification matching

With what probability  
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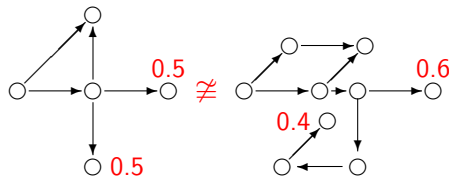


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Does the “*frequency profile*” of the system match that of the specification?

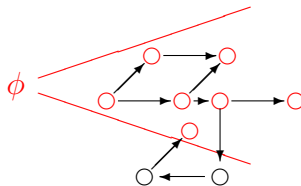


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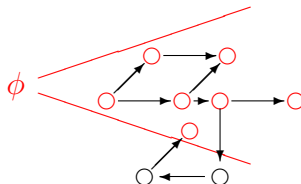


# Integrated analysis

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## Model checking

For a given starting state  
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- ▶ From the process algebra side the Markov chain had a profound influence on the design of the language and in particular on the interactions between components.
- ▶ From the Markov chain perspective the process algebra structure has been exploited to find aspects of **independence** even between interacting components.

# PEPA

$$\begin{aligned} S &::= (\alpha, r).S \mid S + S \mid A \\ P &::= S \mid P \boxtimes_L P \mid P/L \end{aligned}$$

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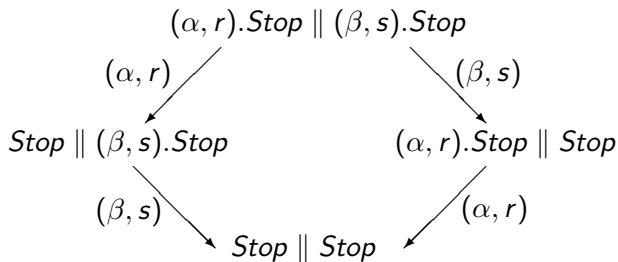
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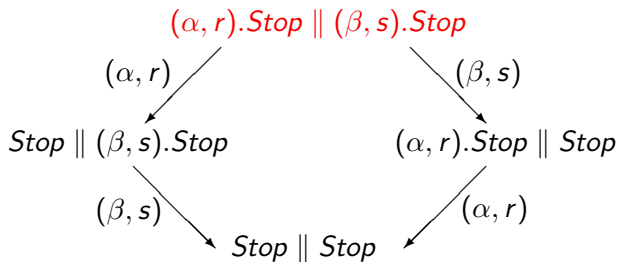
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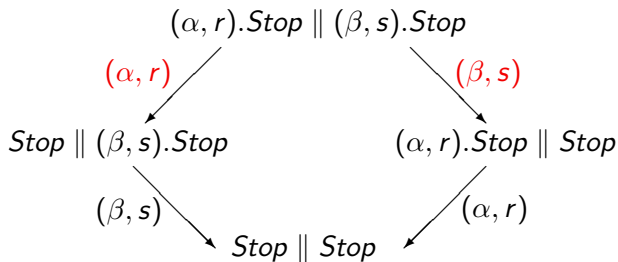
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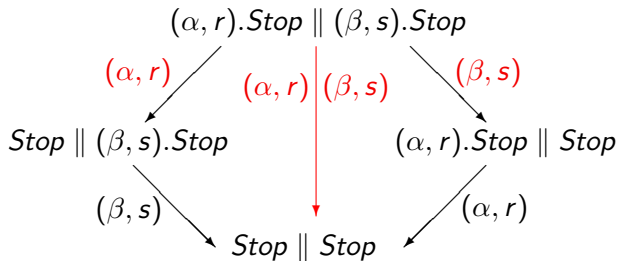
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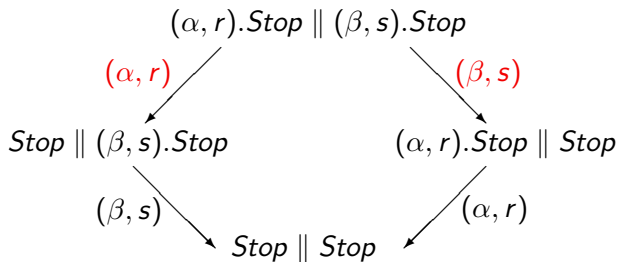
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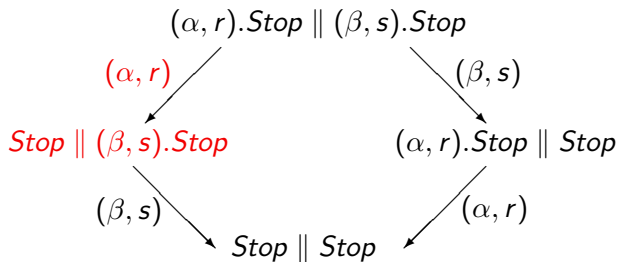
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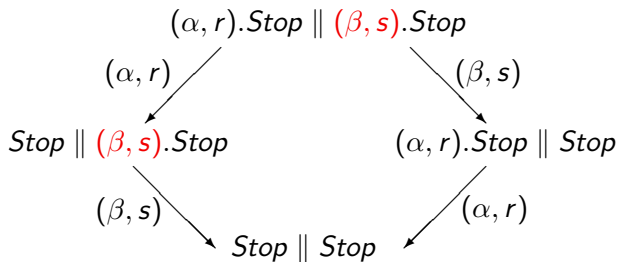
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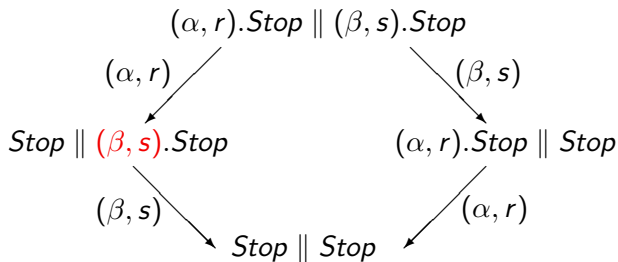


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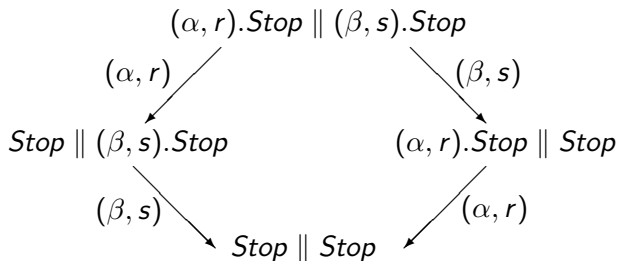


# The Importance of Being Exponential



The **memoryless property** of the negative exponential distribution means that **residual times** do not need to be recorded.

# The Importance of Being Exponential



We retain the **expansion law** of classical process algebra:

$$\begin{aligned}
 (\alpha, r).Stop \parallel (\beta, s).Stop = \\
 (\alpha, r).(\beta, s).(Stop \parallel Stop) + (\beta, s).(\alpha, r).(Stop \parallel Stop)
 \end{aligned}$$

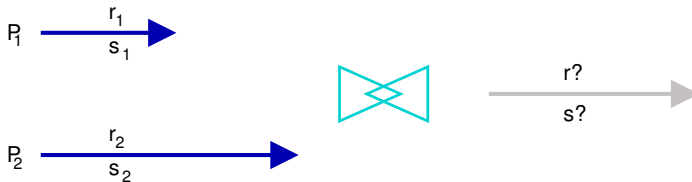
**only** if the **negative exponential distribution** is assumed.

# Timed synchronisation

- ▶ The issue of what it means for two timed activities to synchronise is a vexed one....

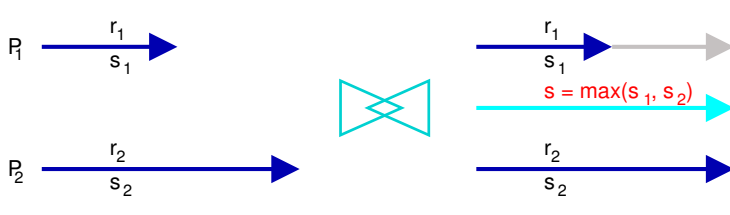
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# Timed synchronisation

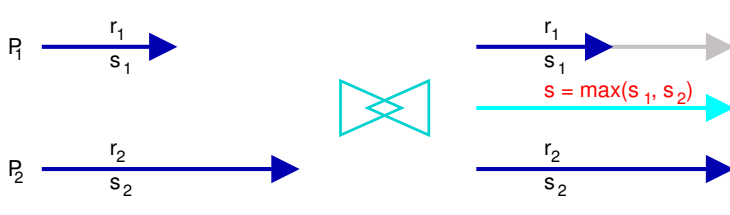
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Barrier Synchronisation

# Timed synchronisation

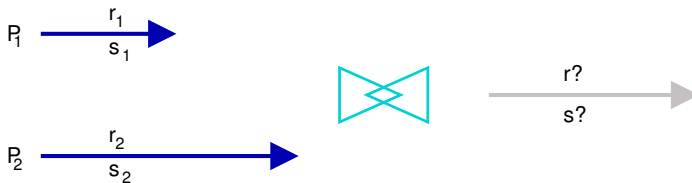
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$s$  is no longer exponentially distributed

# Timed synchronisation

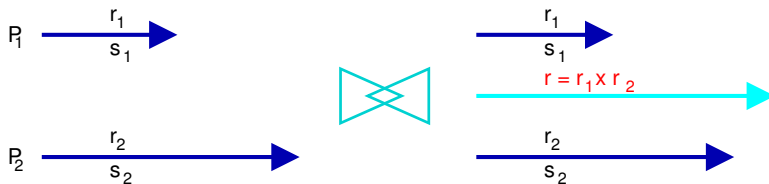
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algebraic considerations limit choices

# Timed synchronisation

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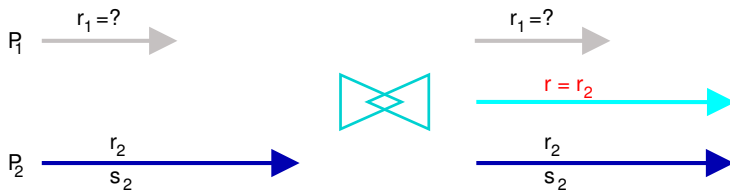


TIPP: new rate is product of individual rates



# Timed synchronisation

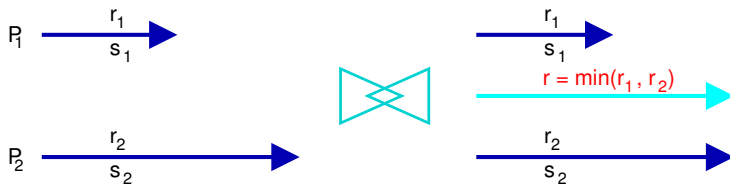
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EMPA: one participant is passive

# Timed synchronisation

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bounded capacity: new rate is the minimum of the rates

# Cooperation in PEPA

- ▶ In PEPA each component has a **bounded capacity** to carry out activities of any particular type, determined by the **apparent rate** for that type.

# Cooperation in PEPA

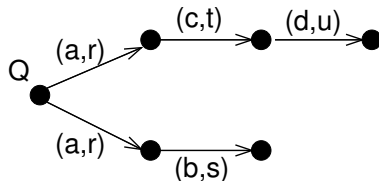
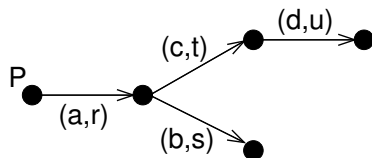
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# Cooperation in PEPA

- ▶ In PEPA each component has a bounded capacity to carry out activities of any particular type, determined by the apparent rate for that type.
- ▶ Synchronisation, or cooperation cannot make a component exceed its bounded capacity.
- ▶ Thus the apparent rate of a cooperation is the **minimum** of the apparent rates of the co-operands.

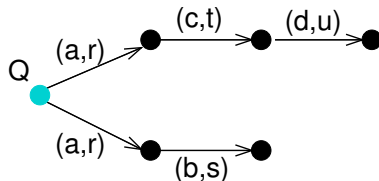
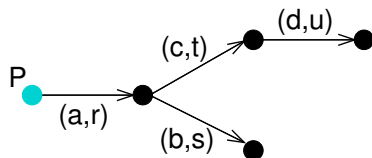
# Equivalence Relations

In process algebra equivalence relations are defined based on the notion of **observability**:



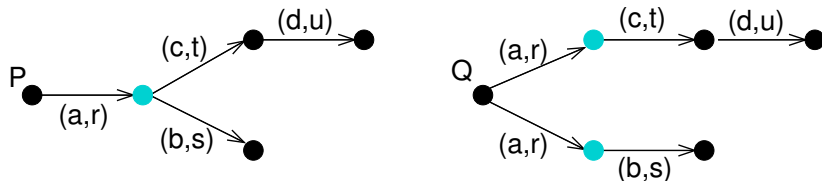
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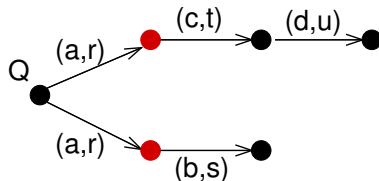
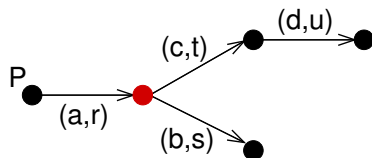
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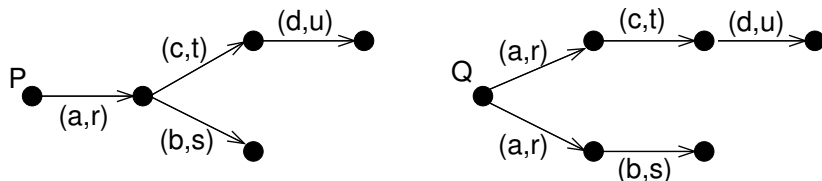
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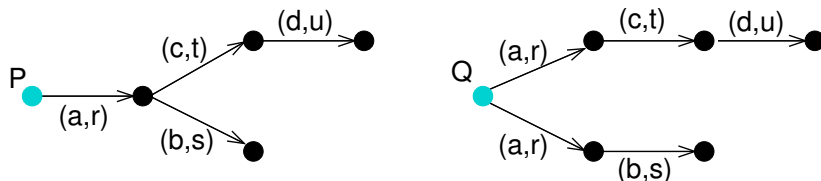
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In PEPA **observation** is assumed to include the ability to record **timing** information over a number of runs.

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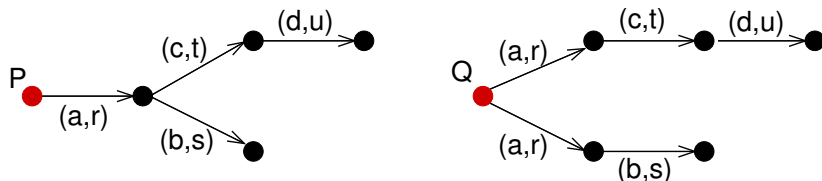
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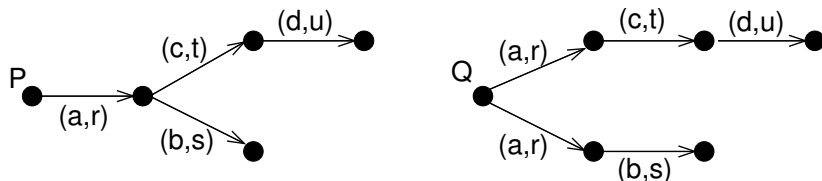
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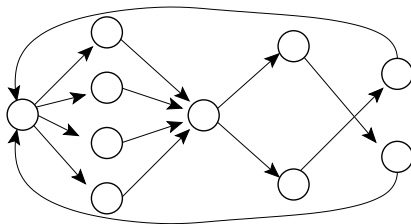
The resulting equivalence relation is a **bisimulation** in the style of Larsen and Skou, and coincides with the Markov process notion of **lumpability**.

# Aggregation and lumpability

**Model aggregation:** use a **state-state** equivalence to establish a partition of the state space of a model, and replace each set of states by one **macro-state**, i.e. take a different stochastic representation of the same model.

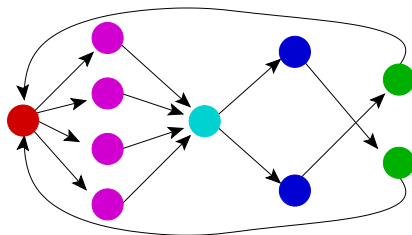
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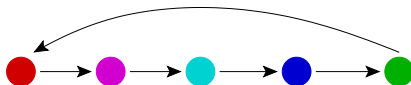
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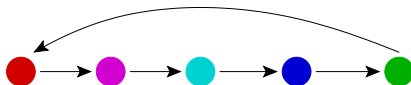
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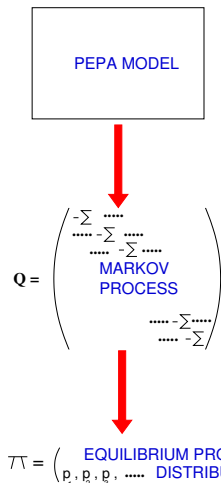
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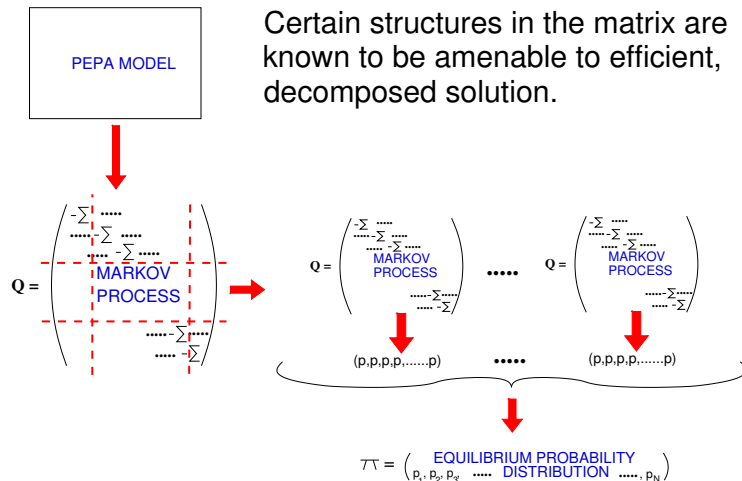
**A lumpable partition** is the only partition of a Markov process which preserves the Markov property.

# Characterising efficient solution

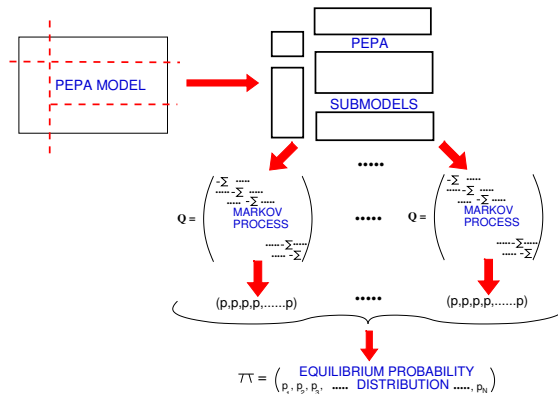


Storing and manipulating the matrix which represents the Markov process places limitations on the size of model which can be analysed.

# Characterising efficient solution

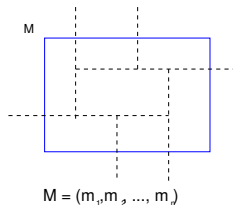


# Characterising efficient solution

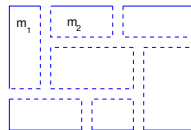


Finding the corresponding structures in the process algebra means that these techniques can be applied automatically, before the monolithic matrix is formed.

# Decomposed solution: product form models



Partition the model  $M$  into  $n$   
**statistically independent**  
 submodels  $m_1, m_2, \dots, m_n$



In isolation, find the steady  
 state distribution  $p$  for  
 each of the submodels  $m_i$

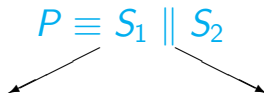
$$p(M)$$

$$p(M) = G \times p(m_1) \times p(m_2) \times \dots \times p(m_n)$$

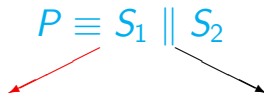
Form the steady state  
 distribution of  $M$  as the product of  
 the solutions for each submodel  $m_i$   
 and a normalising constant

When do PEPA components behave as if they were statistically independent...?

# Product Form PEPA Models

$$P \equiv S_1 \parallel S_2$$


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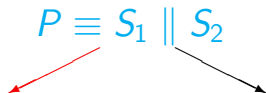
Add restricted **direct interaction**  
between components with a  
particular structure

$$P \equiv S_1 \boxtimes_L S_2$$

$S_1, S_2$  and  $L$  all restricted



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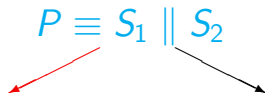
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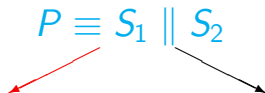
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$$P \equiv (S_1 \parallel S_2) \boxtimes_L R$$

$L$  and  $R$  restricted (wrt  $S_1$  and  $S_2$ )

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$$P \equiv S_1 \parallel S_2$$

The diagram shows the equation  $P \equiv S_1 \parallel S_2$  in blue. A black arrow points from the parallel composition symbol  $\parallel$  down and to the left towards the text 'Add restricted direct interaction between components with a particular structure'. A red arrow points from the same symbol  $\parallel$  down and to the right towards the text 'Add indirect interaction via a third component with a particular structure and type of interaction'.

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# Outline

Introduction

Compositionality: Interaction and Independence

Applications and Acceptance

Conclusions

# Applications and Acceptance

- ▶ Developing models of real applications has always been an integral part of the PEPA project.
- ▶ This allows us to demonstrate to ourselves and others that the theory we have developed is useful.
- ▶ It serves to promote the acceptance of both stochastic process algebra itself and performance modelling more generally.
- ▶ It is also a valuable source of inspiration for new theory and future directions.

# PEPA Case Studies (1)

- ▶ Multiprocessor access-contention protocols ([Gilmore, Hillston and Ribaudo](#), [Edinburgh and Turin](#))
- ▶ Protocols for fault-tolerant systems ([Clark, Gilmore, Hillston and Ribaudo](#), [Edinburgh and Turin](#))
- ▶ Multimedia traffic characteristics ([Bowman et al](#), [Kent](#))
- ▶ Database systems ([The STEADY group](#), [Heriot-Watt University](#))
- ▶ Software Architectures ([Pooley, Bradley and Thomas](#), [Heriot-Watt and Durham](#))
- ▶ Switch behaviour in active networks ([Hillston, Kloul and Mokhtari](#), [Edinburgh and Versailles](#))

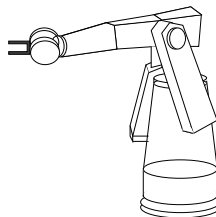
## PEPA Case Studies (2)

- Locks and movable bridges in inland shipping in Belgium ([Knapen](#), [Hasselt](#))



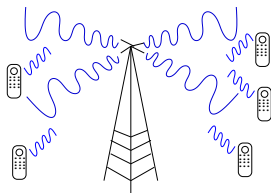
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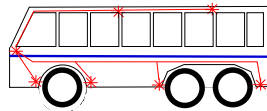
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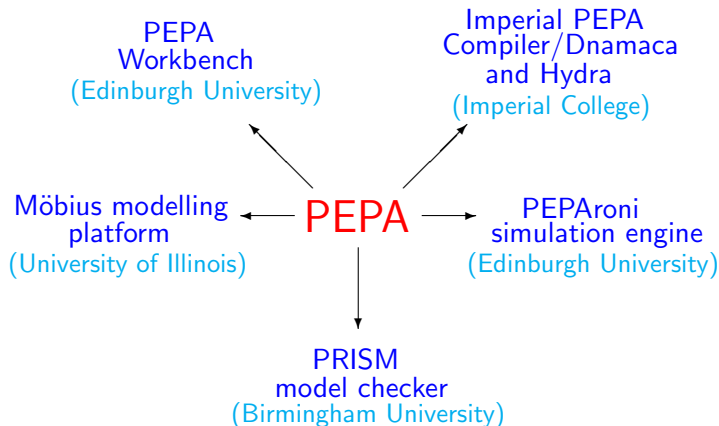


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- ▶ Automotive diagnostic expert systems ([Console, Picardi and Ribaudo, Turin](#))

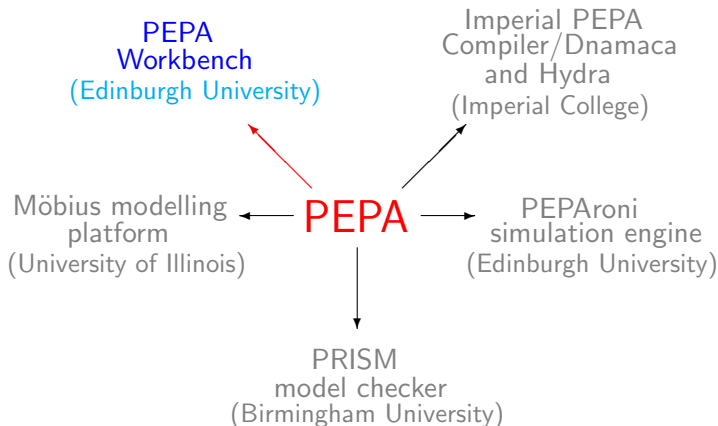


# Tool Support

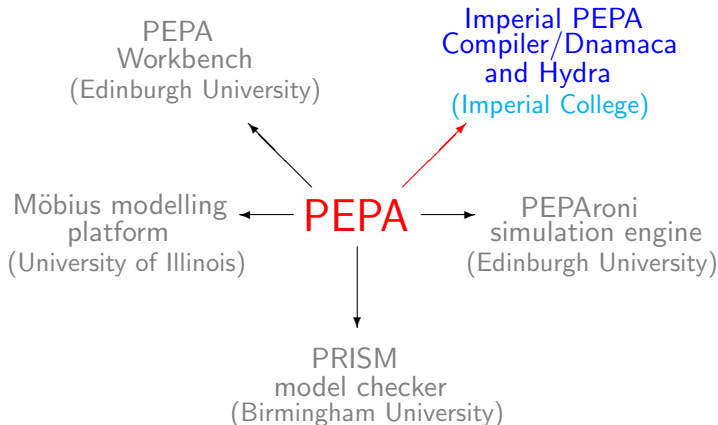




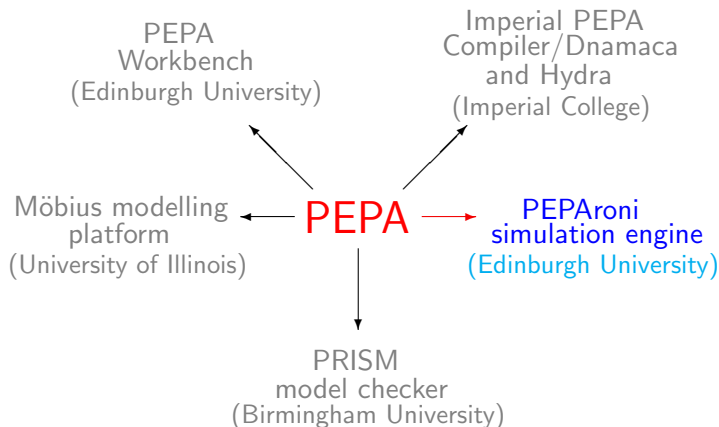
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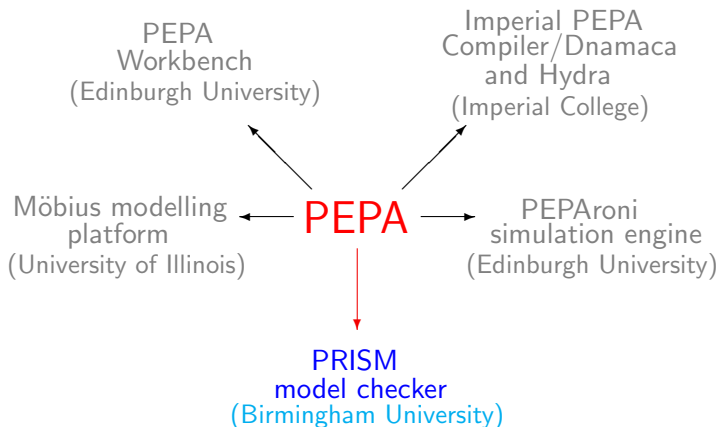
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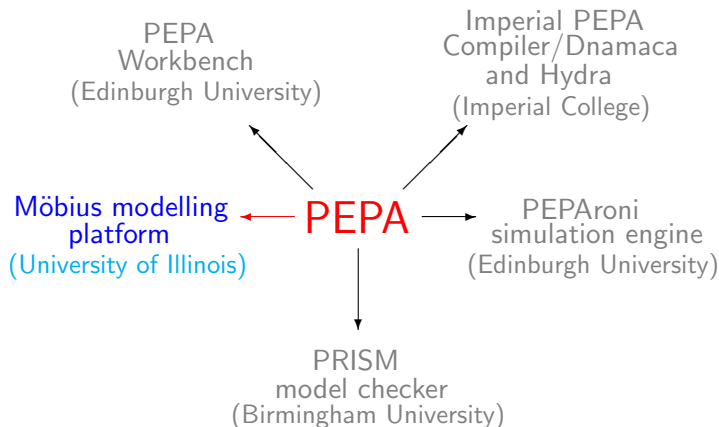
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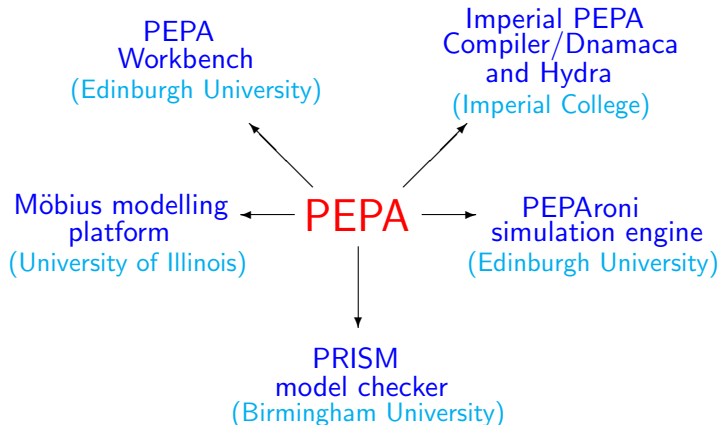
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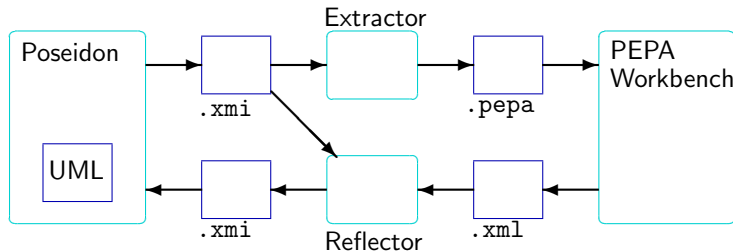


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- ▶ ...UML...
- ▶ Thus recent work has explored this route.

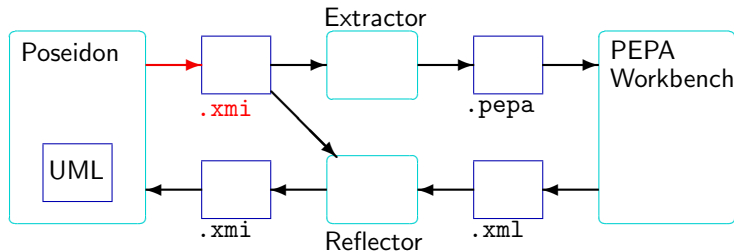
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In the European-funded **DEGAS** research project we have been investigating ways to make performance modelling using PEPA more accessible to software designers.



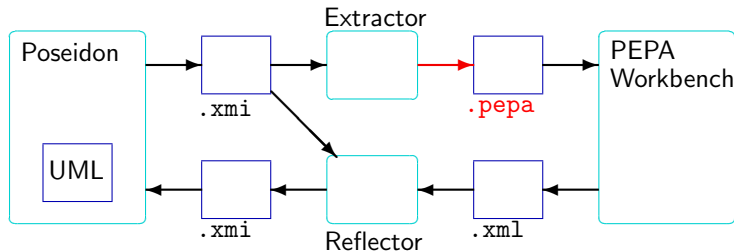
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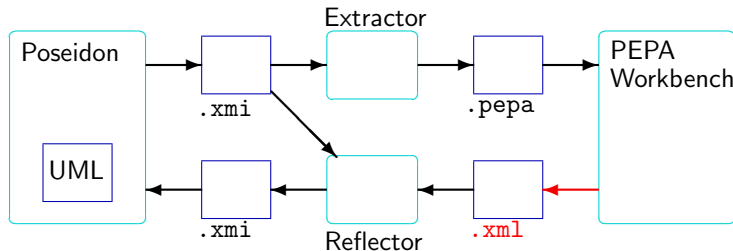
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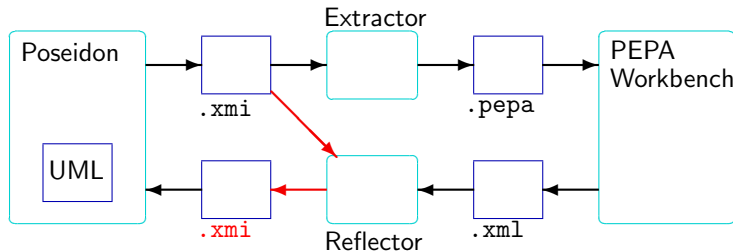
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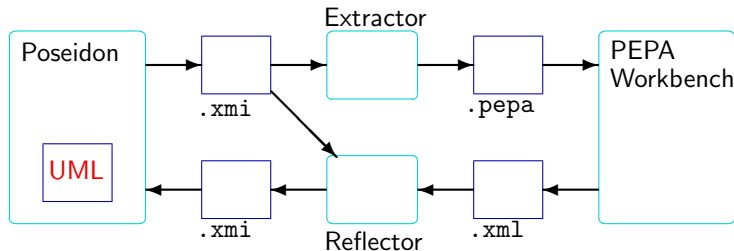
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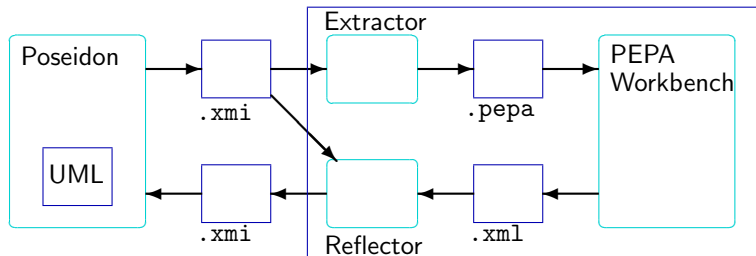
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It is essential that results are reported in terms which make sense to the software designer, i.e. in terms of the original UML model.

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# Outline

Introduction

Compositionality: Interaction and Independence

Applications and Acceptance

Conclusions

# Initial Objectives

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**Compositionality:** In addition to the clear benefits for model construction, it has been established that compositionality can be exploited during Markovian analysis. There is more to do here e.g. with respect to model checking.

**Wide acceptance:** Initial hopes were perhaps naïve, but SPA is now playing a part in encouraging the wider adoption of performance analysis in software analysis.

# Future Work

Many possibilities, for example:

- ▶ The state space explosion problem still remains a major challenge.
- ▶ Extending the range of applicability of the modelling language for new application areas.
- ▶ Improving the analysis capabilities of the modelling tools.

# New mathematical structures

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The major limitations of the CTMC approach are the **state space explosion** problem and the reliance on **exponential distributions**.

# New mathematical structures: differential equations

In a PEPA model the state at any current time is the local derivative or state of each component of the model. When we have large numbers of repeated components it can make sense to represent each component type as a continuous variable, and the state of the model as a whole as the set of such variables. The evolution of each such variable can then be described by an ODE.

# New mathematical structures: differential equations

The PEPA definitions of the component specify the activities which can increase or decrease the number of components exhibited in the current state. The cooperations show when the number of instances of another component will have an influence on the evolution of this component.

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- ▶ Assume that these state variables are subject to continuous rather than discrete change.

Only appropriate for some models, but results are promising in those cases.



# New application domains: biochemical signalling pathways

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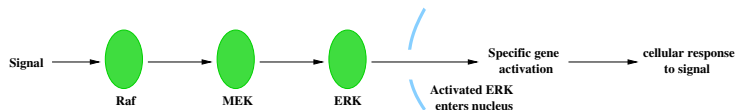
# New application domains: biochemical signalling pathways

- ▶ Biological advances mean that much more is now known about the components of cells and the interactions between them.
- ▶ Systems biology aims to develop a better understanding of the processes involved.
- ▶ Stochastic process algebras have found a new role in developing models for systems biology, allowing biologists to test hypotheses and prioritise experiments.

## Extracellular signalling

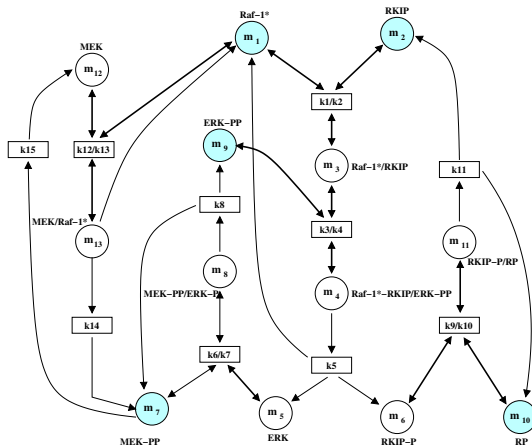
Extracellular signalling — communication between cells.

- ▶ signalling molecules released by one cell migrate to another;
- ▶ these molecules enter the cell and instigate a **pathway**, or series of reactions, which carries the information from the membrane to the nucleus;
- ▶ the Ras/Raf-1/MEK/ERK pathway conveys differentiation signals to the nucleus of a cell.



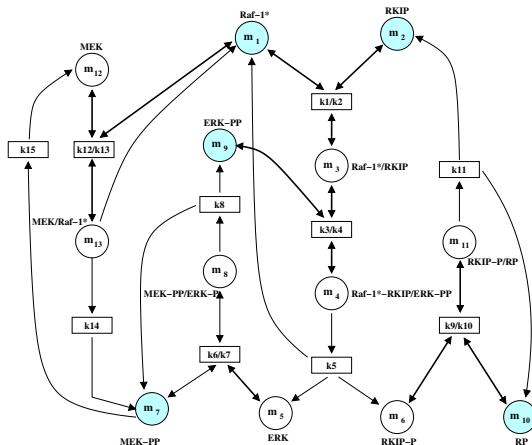
Special relevance to cancer research because when pathways operate abnormally cells divide uncontrollably.

# The Ras/Raf-1/MEK/ERK pathway



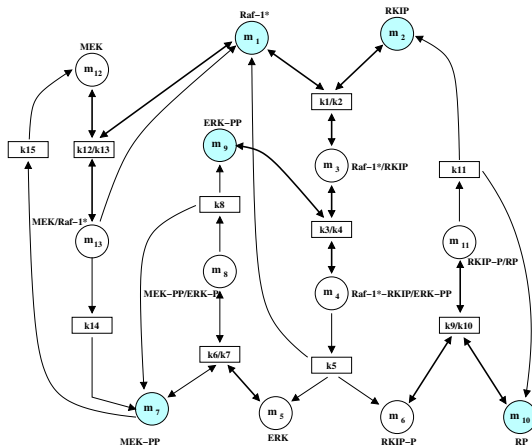
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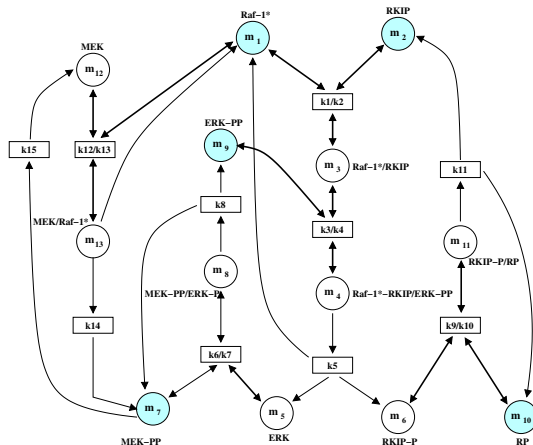
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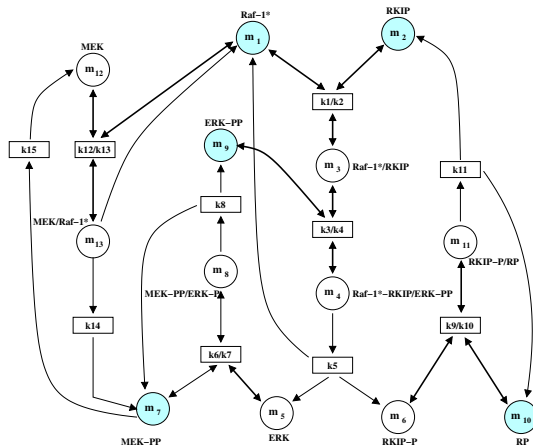


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- Reagents-centric
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and shown them to be equivalent.

## Acknowledgements

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Coauthors:

- ▶ Anne Benoit, Linda Brodo, Muffy Calder, Catherine Canevet, Murray Cole, Graham Clark, Pierpaolo Degano, Susanna Donatelli, Stephen Gilmore, Zully Grant-Duff, Valentin Haenel, Peter Harrison, Robert Holton, Leïla Kloul, Vassilis Mertsiotakis, Amdjed Mokhtari, Corrado Priami, Matthew Prowse, Laura Recalde, Michael Rettelbach, Marina Ribaud, Manuel Silva, Perdita Stevens, Jennifer Tenzer, Joanna Tomasik, Nigel Thomas.

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Tool developers:

- ▶ Ashok Argent-Katwala, Jeremy Bradley, Graham Clark, Nick Dingle, Ross Duncan, Stephen Gilmore, Valentin Haenel, Jon Hunter, Will Knottenbelt, Dave Parker, Matthew Prowse, Fotis Stathopoulos, Feng Wan.

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Other work on PEPA:

- ▶ Ashok Argent-Katwala, Howard Bowman, Jeremy Bradley, Jeremy Bryans, Aleksiy Burdakov, Luca Console, Lia Deotto, Nick Dingle, Kerstin Eder, James Edwards, Amani El-Rayes, Peter Harrison, Leïla Kloul, Luk Knapen, Will Knottenbelt, Marta Kwiatkowska, Ting Ting Lee, Steve Minton, Pete Mitton, Friedger Müffke, Gethin Norman, Claudia Picardi, Rob Pooley, Kris Powell, Marina Ribaud, Roman Samarov, Nigel Thomas, David Thornley, Fabrice Valois, Wim Vanderbauwhede.

# Thank you