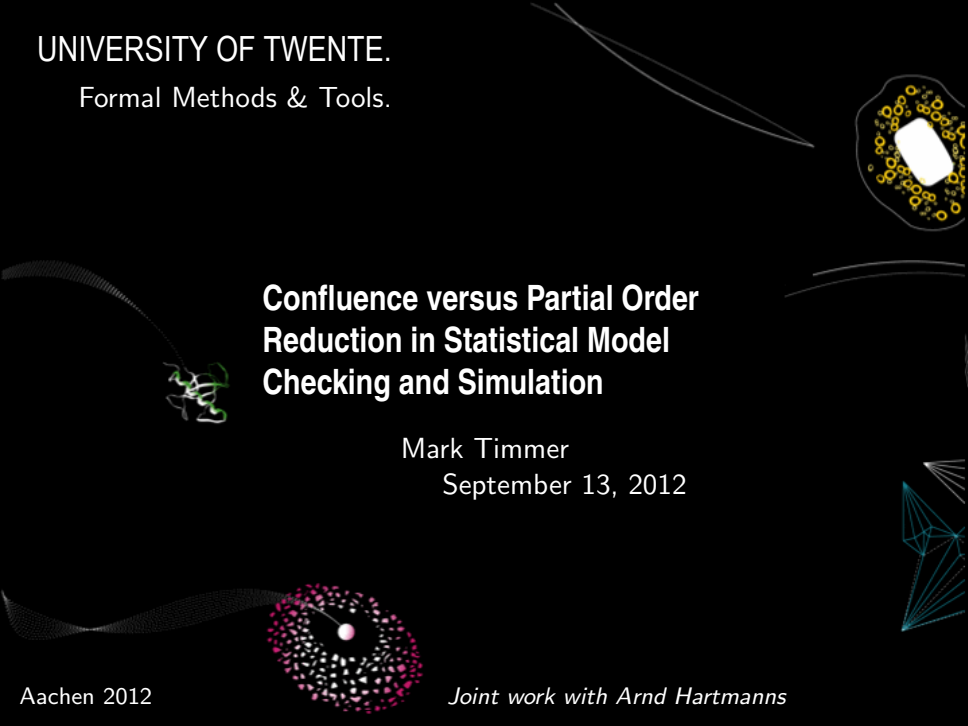


UNIVERSITY OF TWENTE.

Formal Methods & Tools.

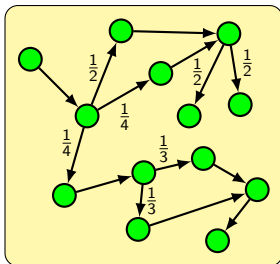


## Confluence versus Partial Order Reduction in Statistical Model Checking and Simulation

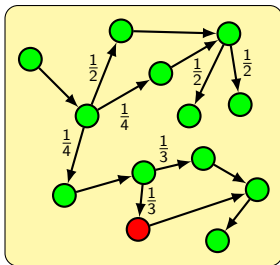
Mark Timmer

September 13, 2012

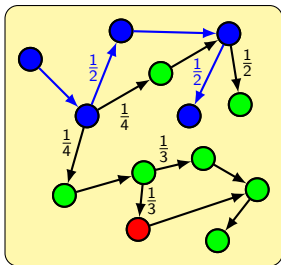
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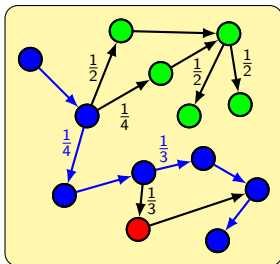
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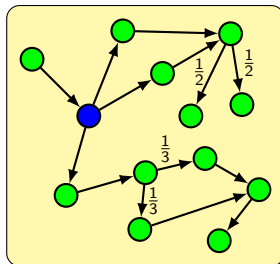
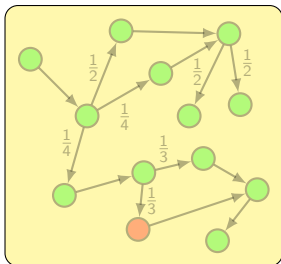
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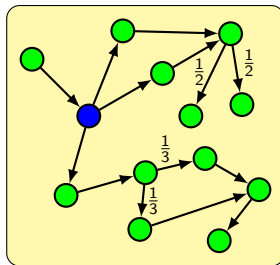
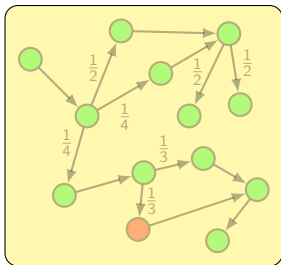
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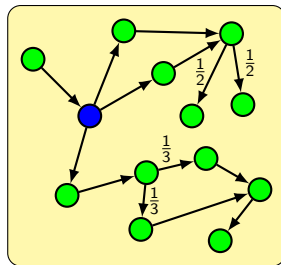
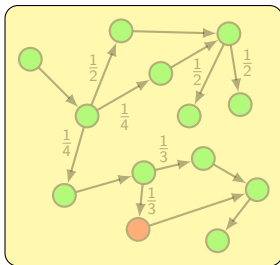
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Problem with the presence of nondeterminism:

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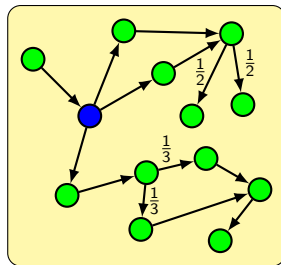
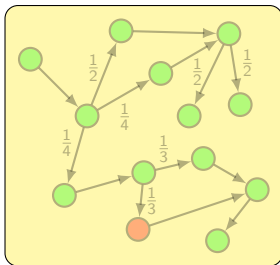
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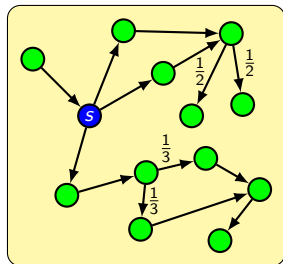
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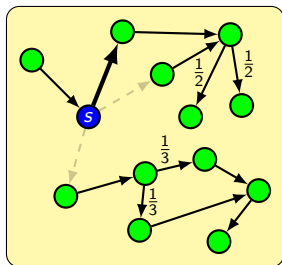
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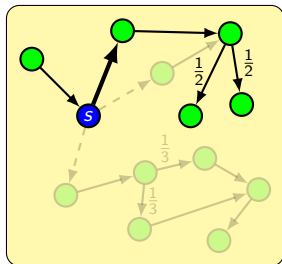
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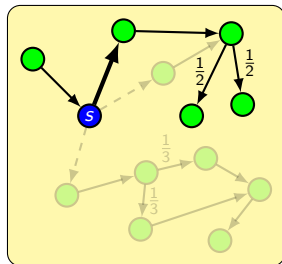
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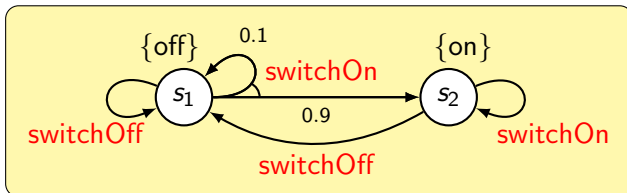


Important:

reduced system should be **equivalent**

# The model: Probabilistic Automata

Probabilistic Automaton:

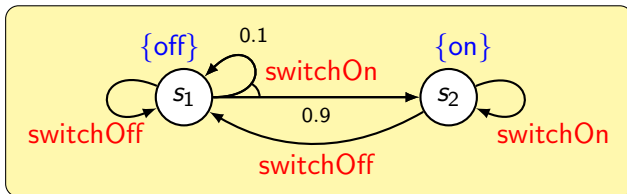


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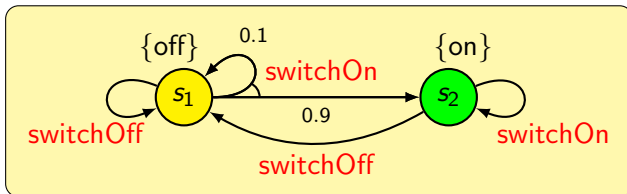
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# Contents

- 1 Introduction
- 2 Confluence
- 3 On-the-fly detection
- 4 Case studies
- 5 Conclusions

# Behaviour preservation by invisible steps

Invisible transitions in confluence reduction:

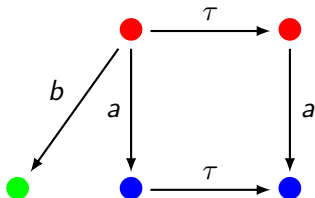
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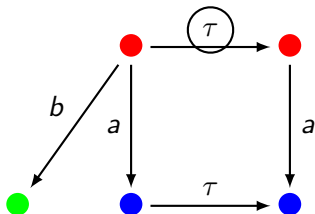


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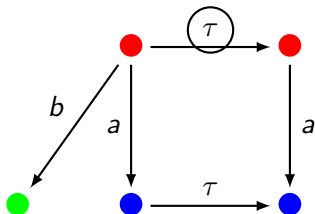
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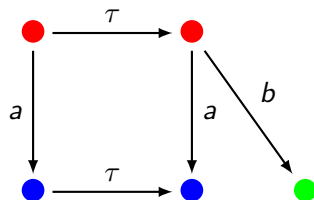
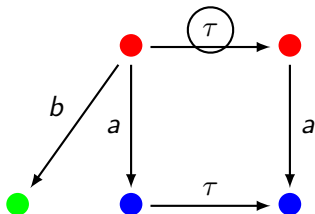
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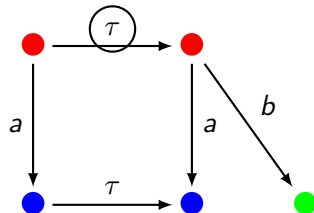
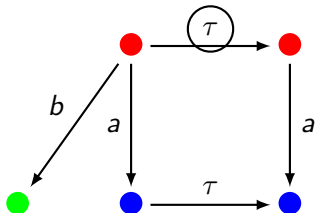
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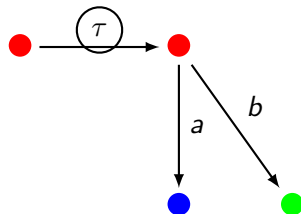
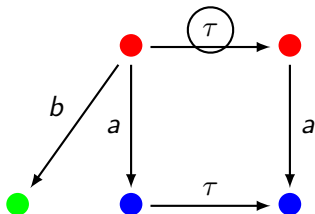
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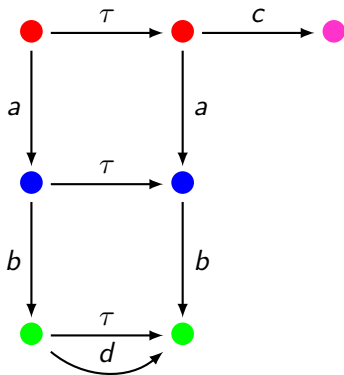
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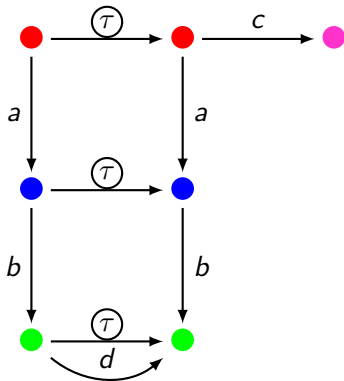


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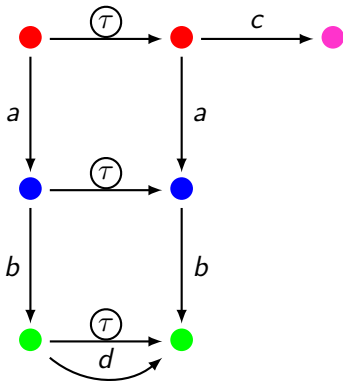


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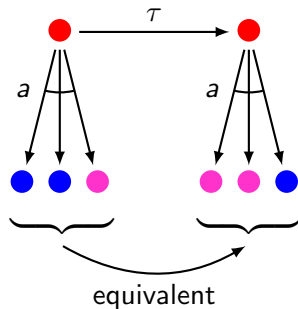
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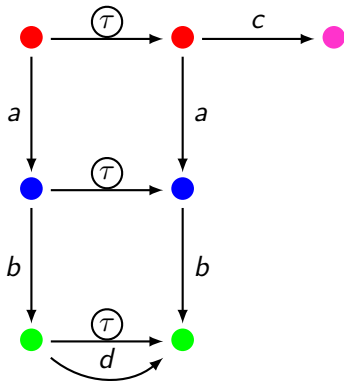


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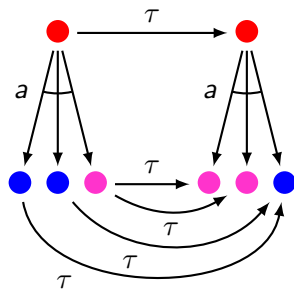
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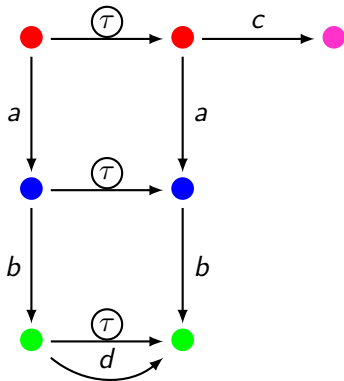


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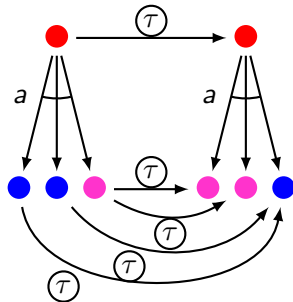
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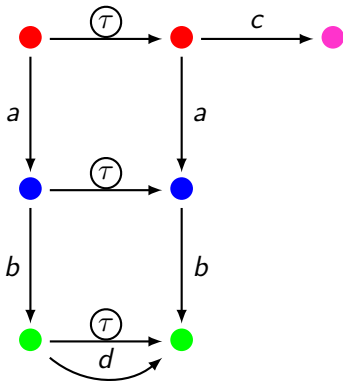


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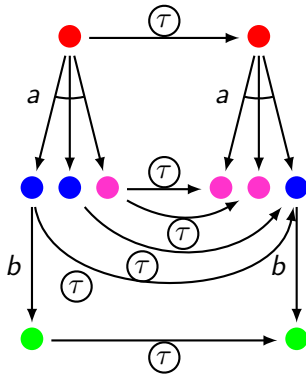
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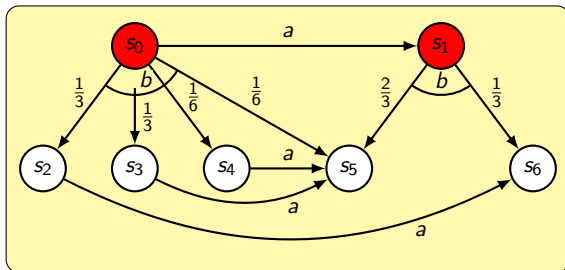
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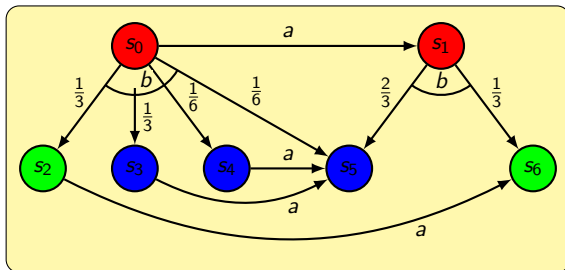
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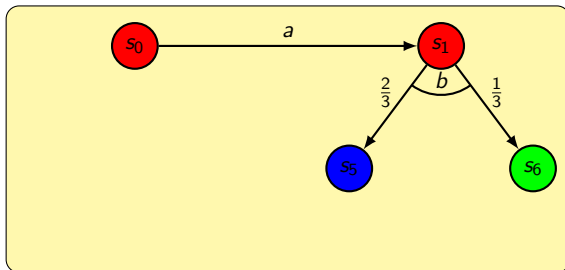
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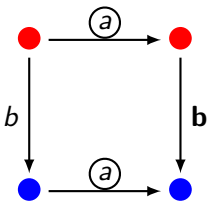


# Alterations to the concept of confluence

- Transitions may be mimicked by **differently-labelled** transitions
- Transitions only have to be **invisible locally**
- More liberal notion of **equivalence of distributions**

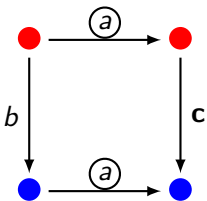
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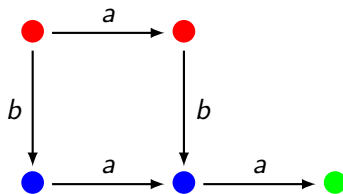
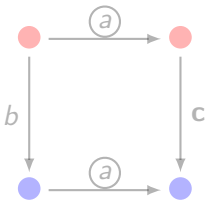
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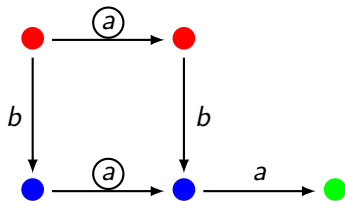
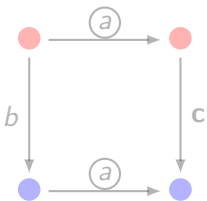
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Distributions  $\mu$  and  $\nu$  are  $\mathcal{T}$ -equivalent, if there exists a **partitioning**  $\text{spt}(\mu) = \bigsqcup_{i=1}^n S_i$  of the support of  $\mu$  and an **ordering**  $\text{spt}(\nu) = \{s_1, \dots, s_n\}$  of the support of  $\nu$ , such that  $\forall 1 \leq i \leq n$

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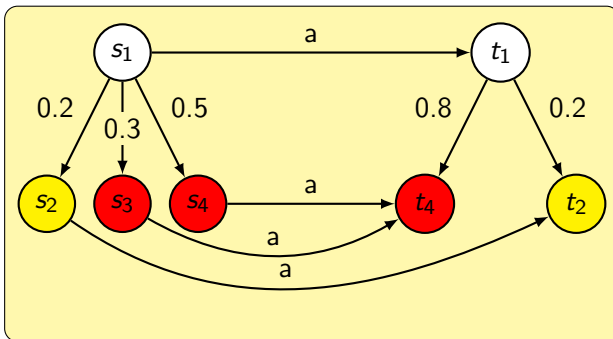
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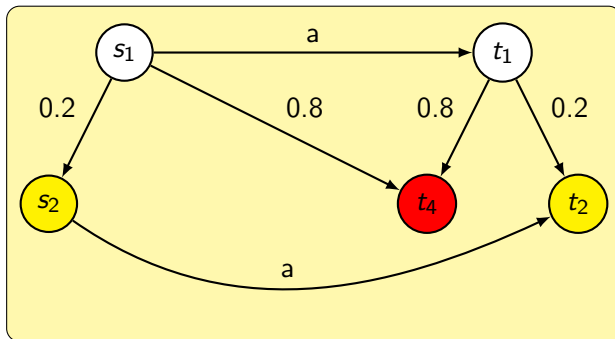
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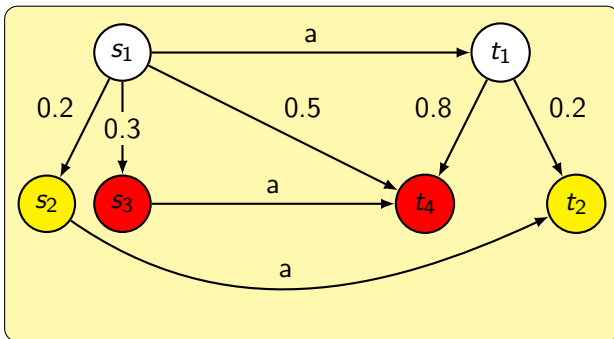
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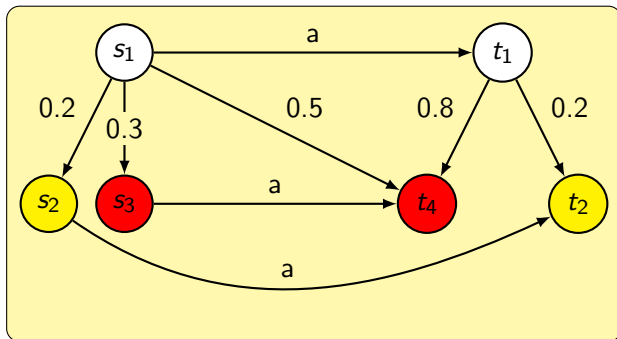
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Even though

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Still we find:

## Theorem

*Confluent transitions can be given priority, preserving  $PCTL_X^*$ .*

# On-the-fly detection of confluence

Simulation using on-the-fly confluence detection:

- 1 Simulate until reaching a nondeterministic choice

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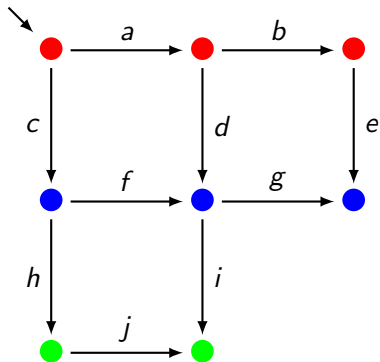
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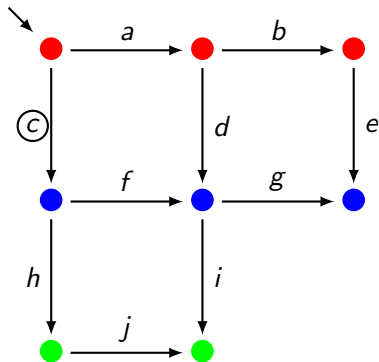
- Check if it is invisible
- Check if all its neighbouring transitions are mimicked
  - For this, additional transitions might need to be confluent

# Checking a transition for confluence



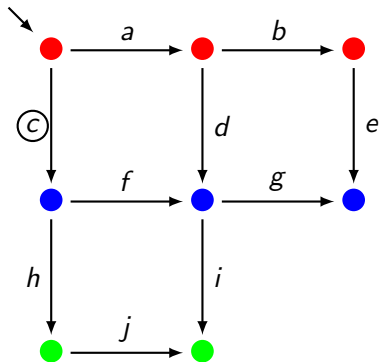


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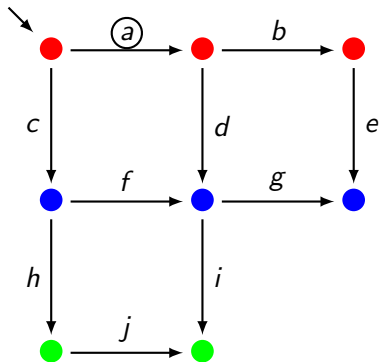
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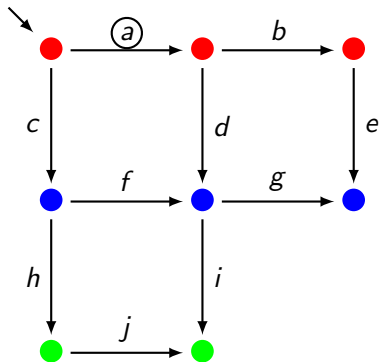
- Check if *c* is confluent
  - No; it is not invisible

# Checking a transition for confluence



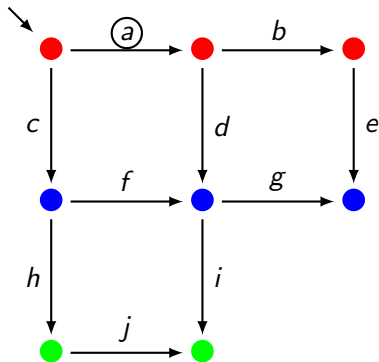
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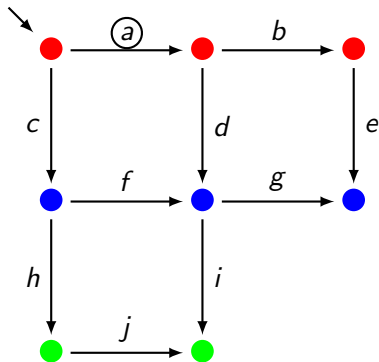
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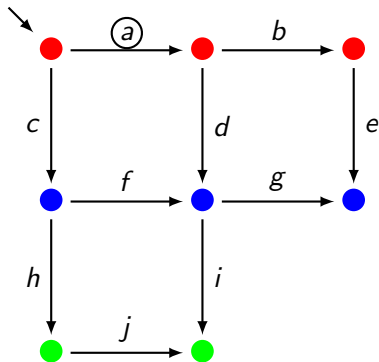
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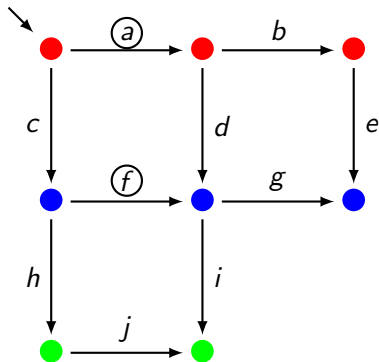
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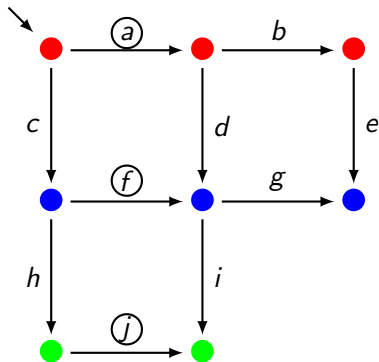
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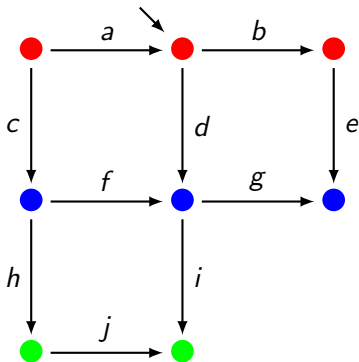


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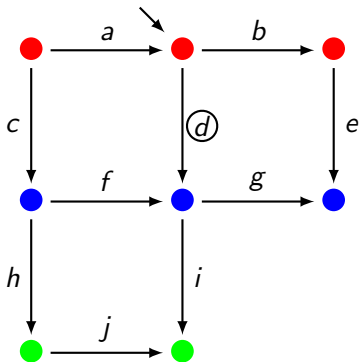
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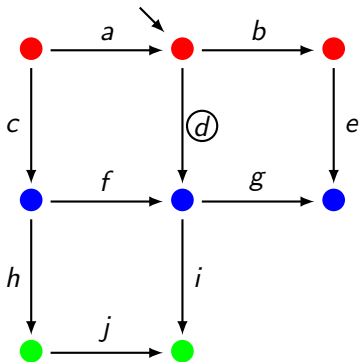
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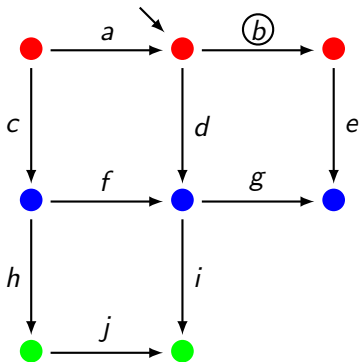
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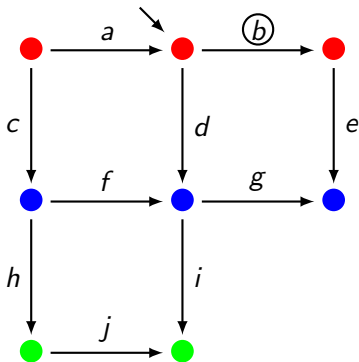
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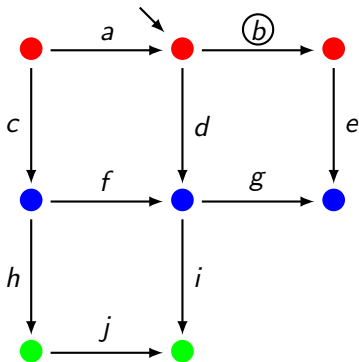
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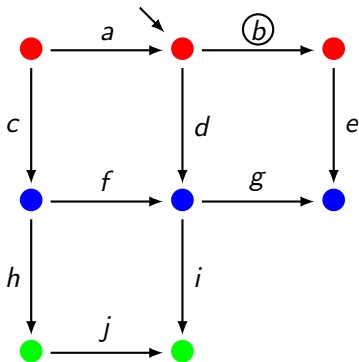
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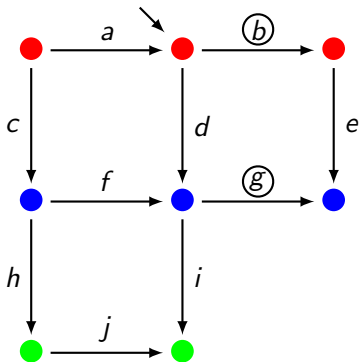
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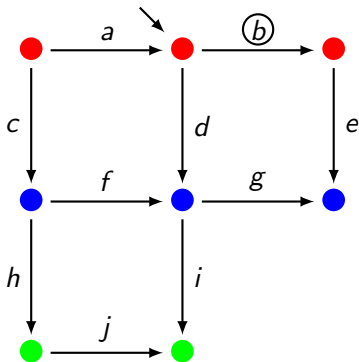


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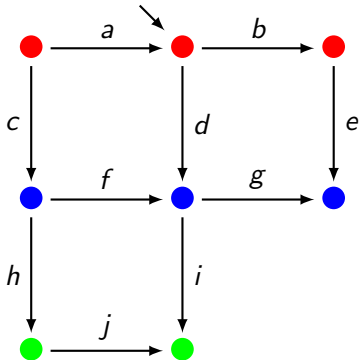
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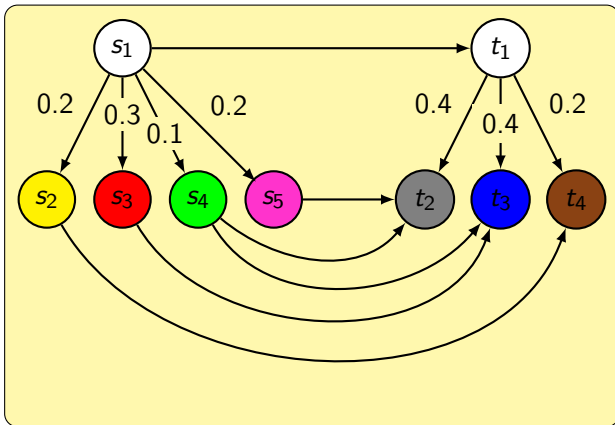
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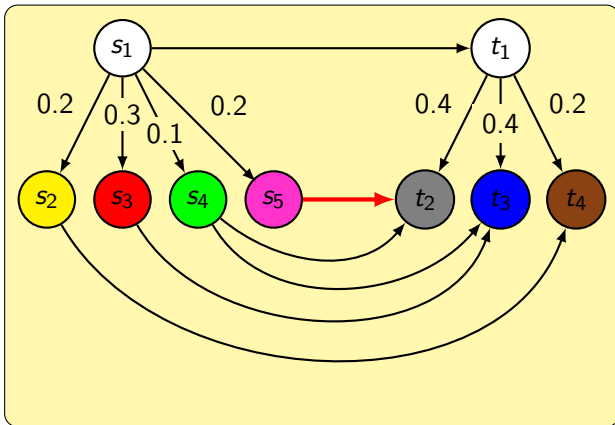
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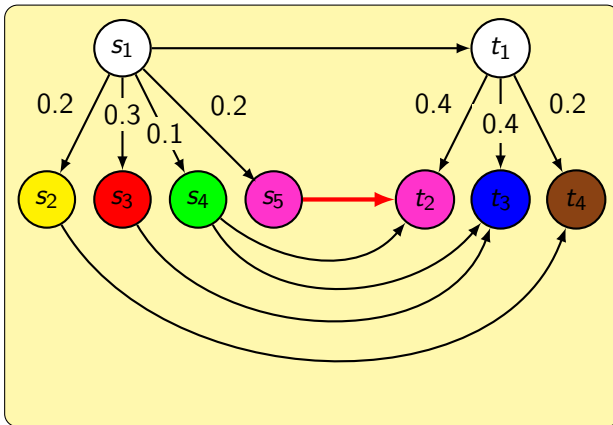
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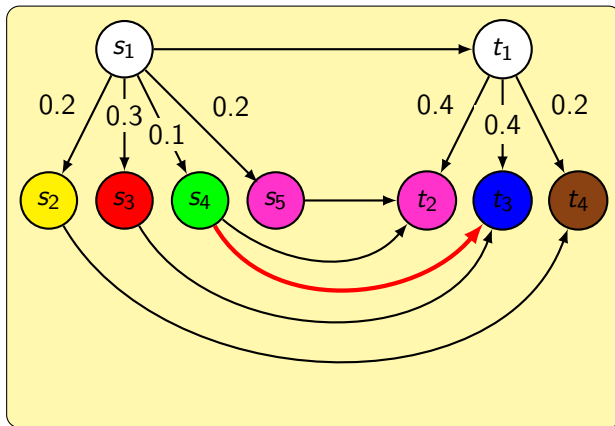
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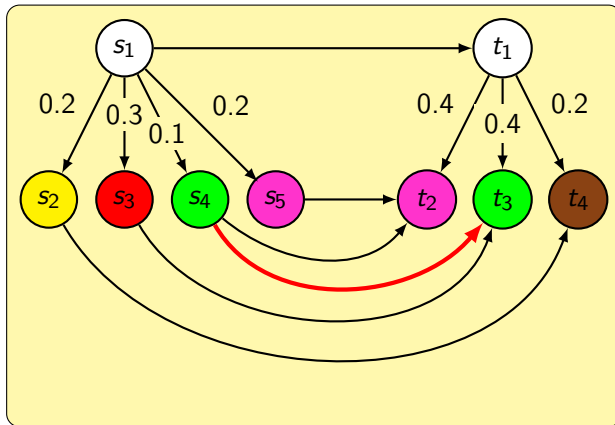
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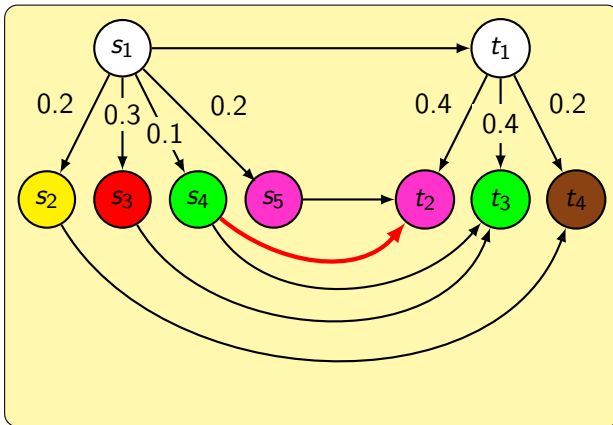
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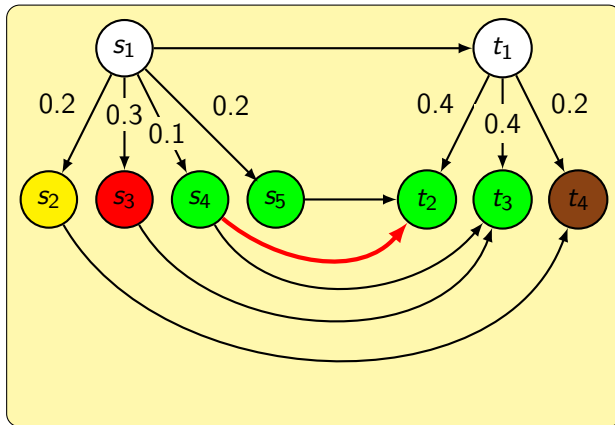


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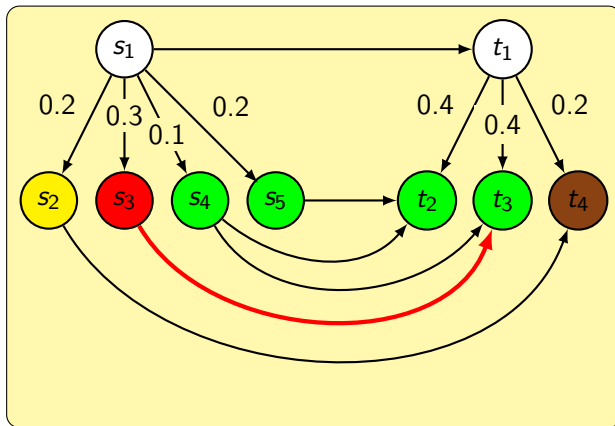
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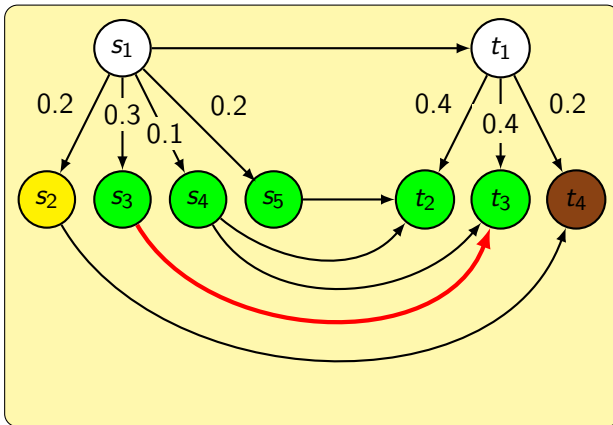
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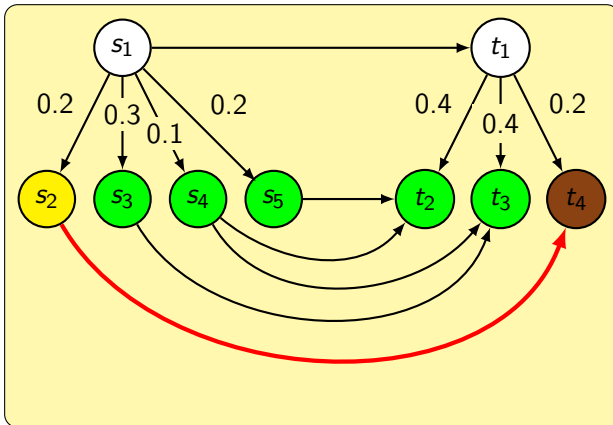
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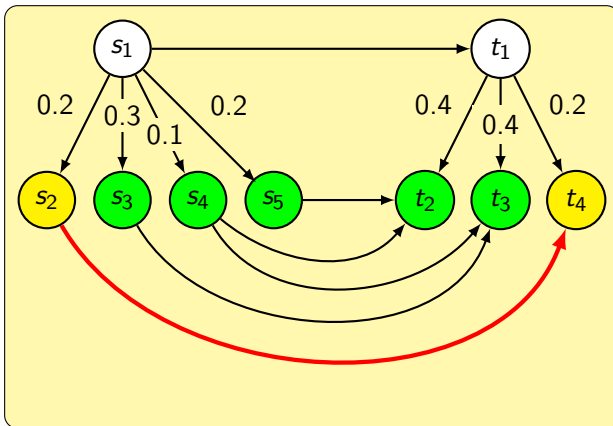
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# Implementation

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- Statistical model checking of deterministic systems
  - Partial order reduction
  - Confluence reduction

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Three case studies:

- Dining Cryptographers
- IEEE 802.3 CSMA/CD
- Binary Exponential Backoff



# Case study: Dining Cryptographers

Table : Confluence simulation runtime compared

model ( $N$ )	simulation	
	uniform	confluence
3	3 s	13 s
4	4 s	66 s
5	5 s	338 s

Partial order reduction was **not able** to resolve the nondeterminism.

# Case study: CSMA/CD

Table : Confluence simulation runtime compared

model ( $RED, BC_{MAX}$ )	simulation		model checking	
	uniform	confluence	states	time
(2, 1)	6 s	18 s	15283	11 s
(1, 1)	6 s	18 s	30256	51 s
(1, 2)	11 s	48 s	194818	214 s

Partial order reduction was **not able** to resolve the nondeterminism.  
(for confluence, probabilistic transitions needed to be synchronised)

# Case study: Binary Exponential Backoff

Table : Confluence simulation runtime compared

model ( $K, N, H$ )	simulation		
	uniform	partial order	confluence
(4, 3, 3)	1 s	2 s	2 s
(8, 7, 4)	14 s	18 s	16 s

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  - Independent of action labels
  - Independent of global behaviour
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- We provided an on-the-fly detection algorithm for SMC
- We implemented the new technique in MODEST
- Case studies show that confluence reduction reduces more and slightly faster than partial order reduction
- More models can now statistically be checked

# Questions

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