

UNIVERSITY OF TWENTE.

Formal Methods & Tools.

Confluence Reduction for Probabilistic Systems

Mark Timmer
September 4, 2010

*Joint work with
Mariëlle Stoelinga and Jaco van de Pol*

Contents

- 1 Introduction
- 2 Confluence
- 3 State space reduction using confluence
- 4 Detecting confluence
- 5 Case study
- 6 Conclusions

Table of Contents

1 Introduction

2 Confluence

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The context: probabilistic model checking

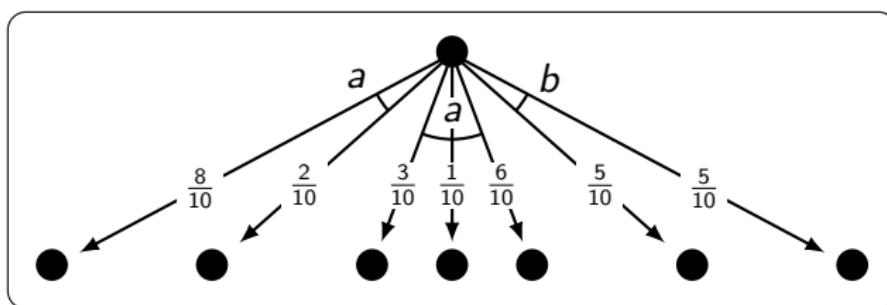
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- Verifying quantitative properties,
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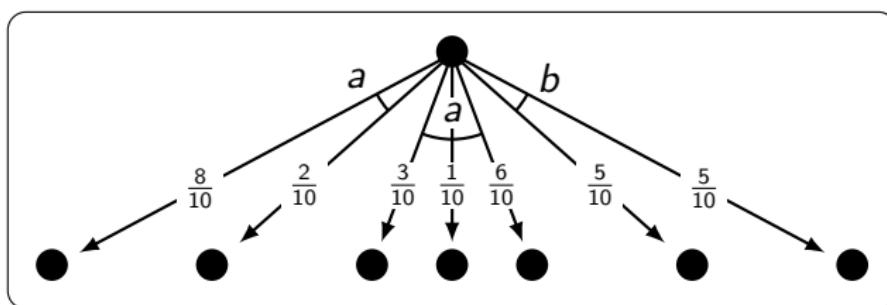


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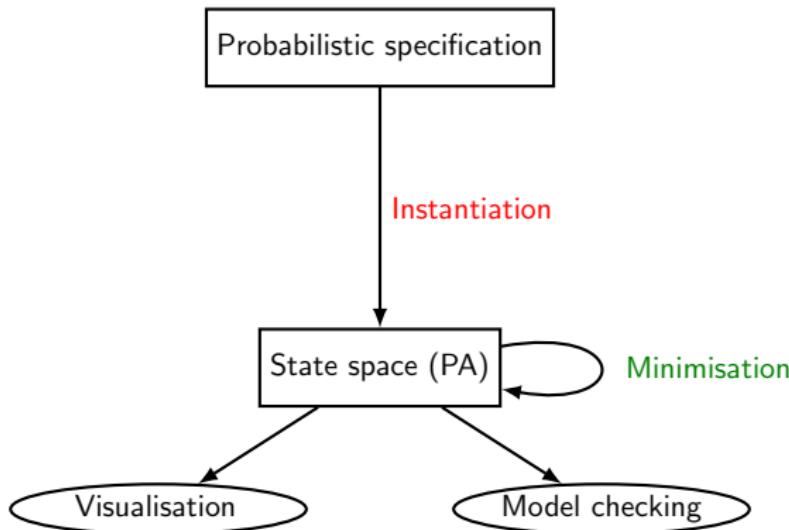


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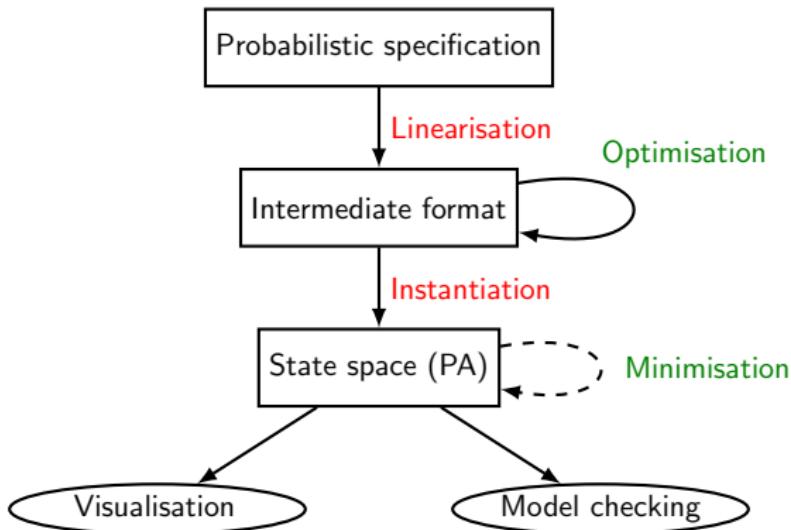
Limitations of previous approaches:

- Susceptible to the state space explosion problem
- Restricted treatment of data

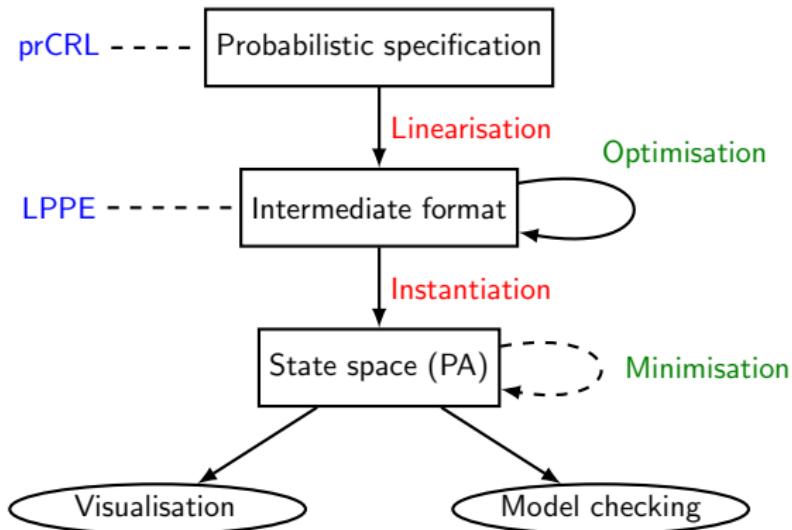
Overview of our approach



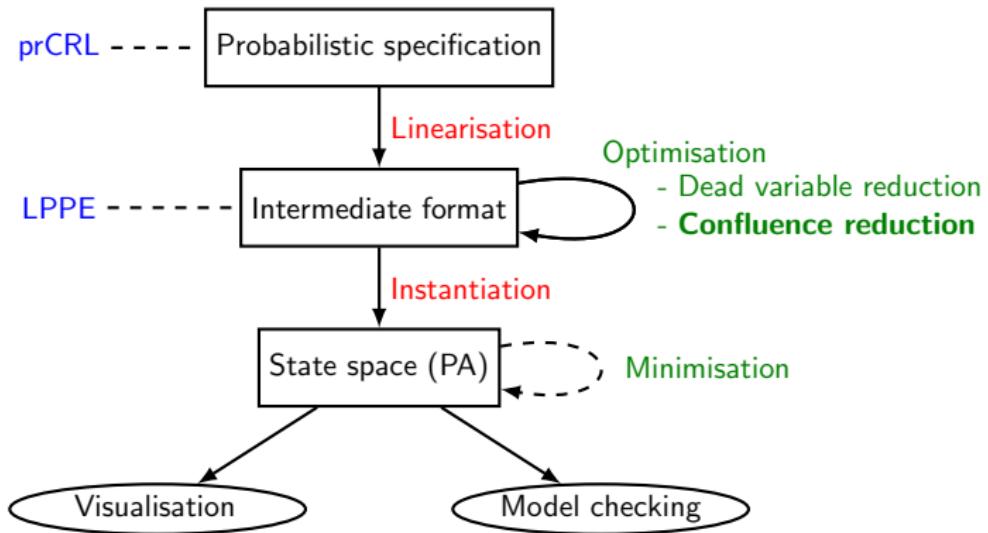
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Branching probabilistic bisimulation

Notion of equivalence: **branching probabilistic bisimulation**



Branching probabilistic bisimulation

Notion of equivalence: **strong bisimulation**



Branching probabilistic bisimulation

Notion of equivalence: **strong bisimulation**



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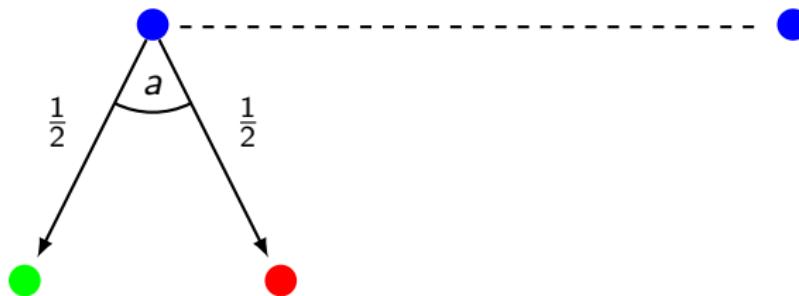
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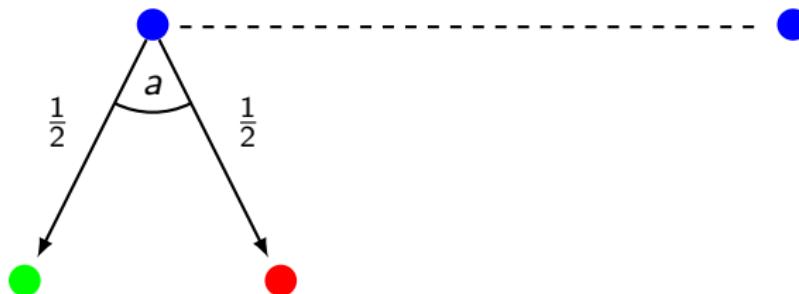
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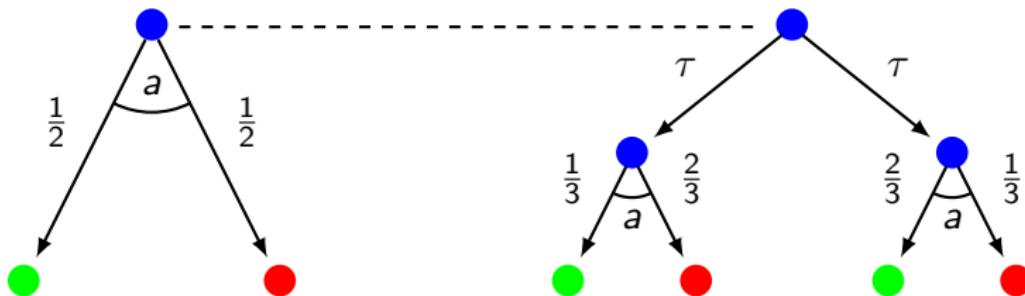
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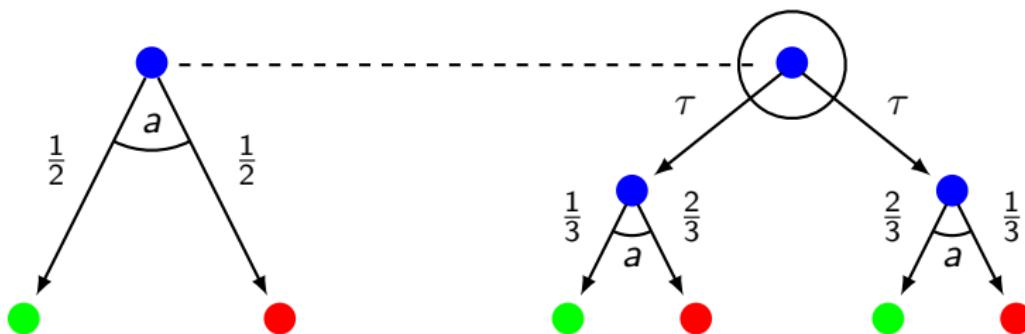
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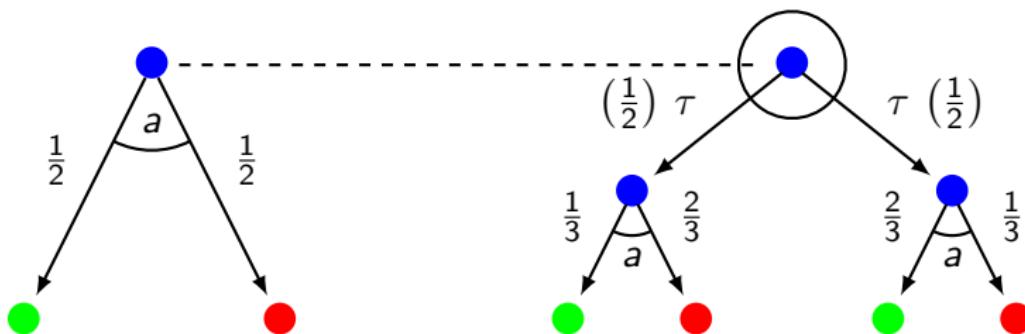
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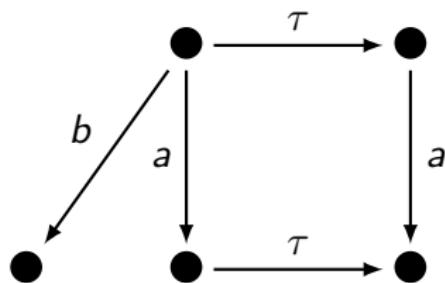
$$\text{Probability of green: } \frac{1}{2} \cdot \frac{1}{3} + \frac{1}{2} \cdot \frac{2}{3} = \frac{1}{2}$$

Table of Contents

- 1 Introduction
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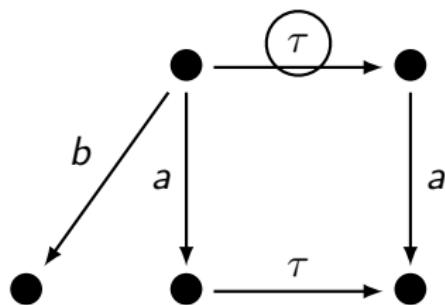
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Unobservable τ -steps **might** disable behaviour...



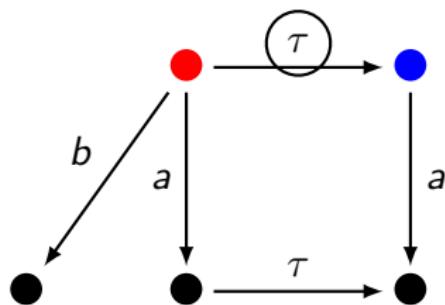
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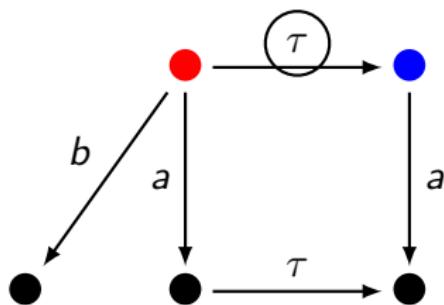
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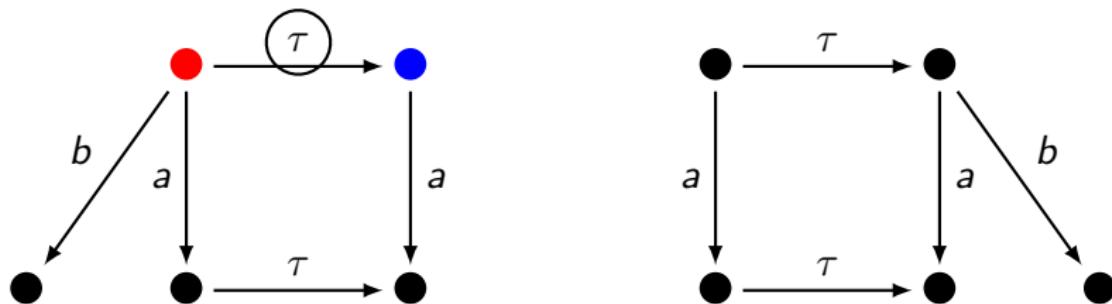
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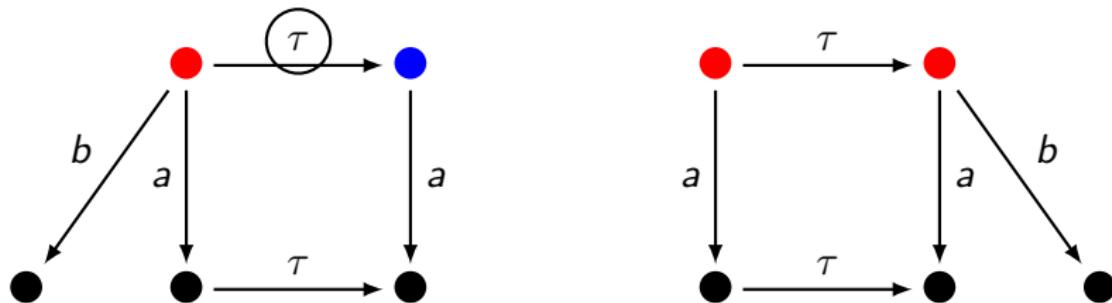
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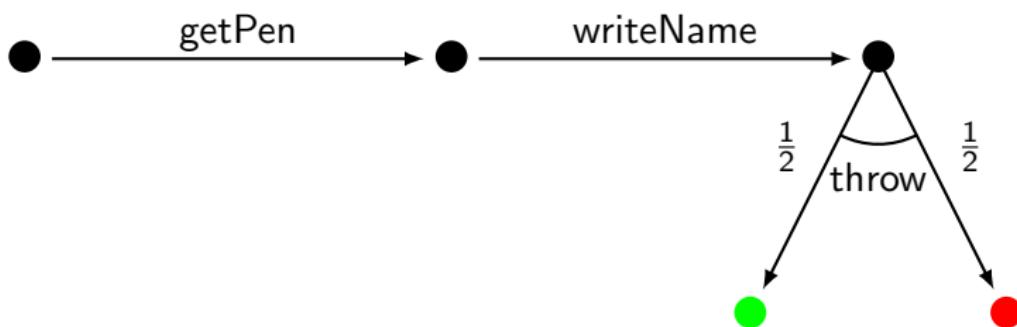
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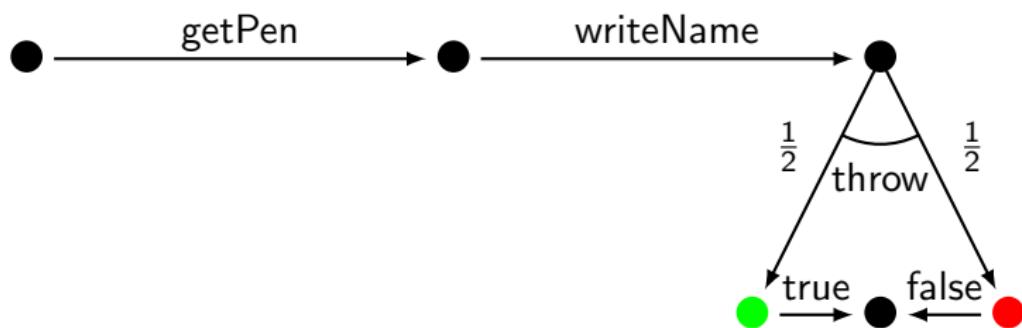
Confluence: an introductory example



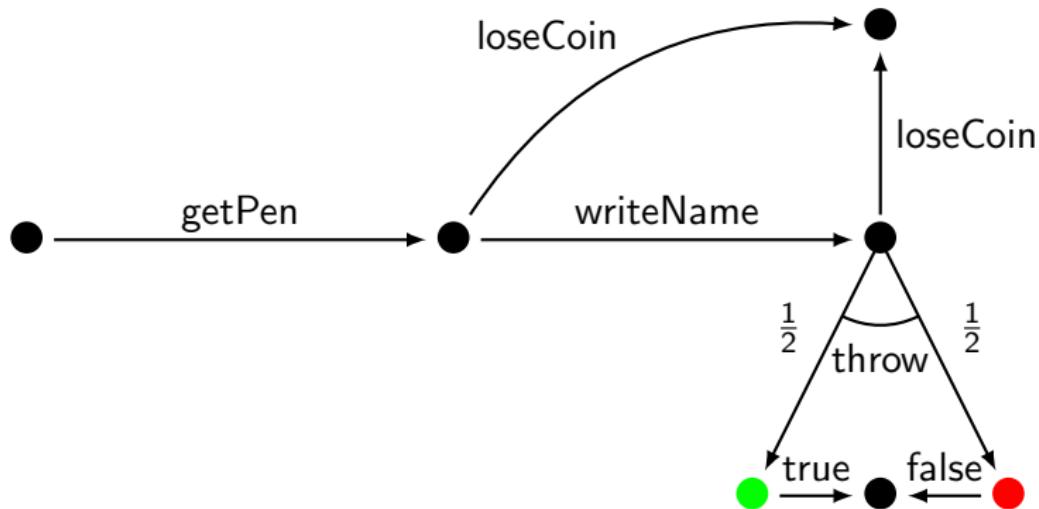
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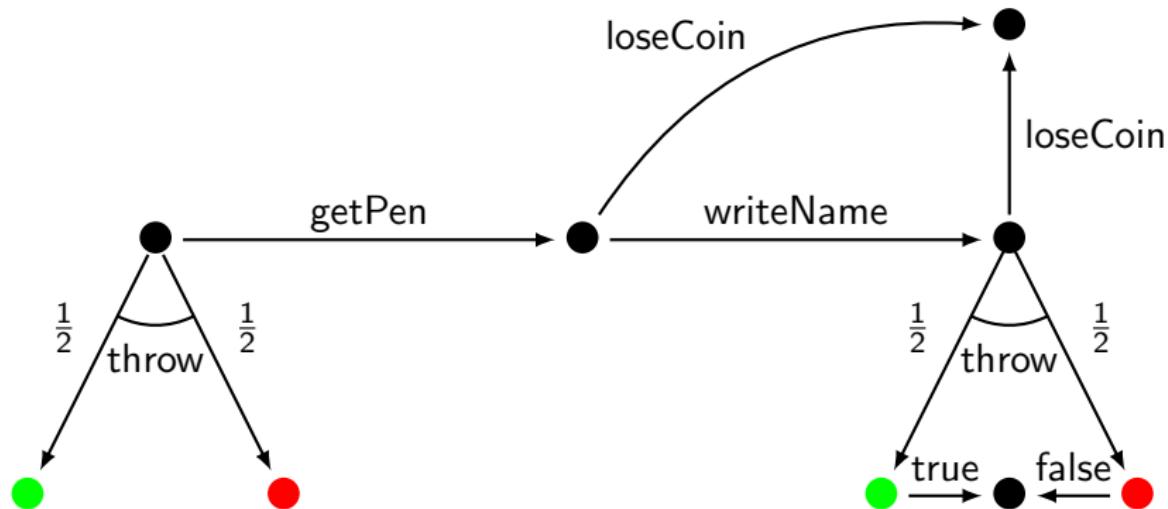
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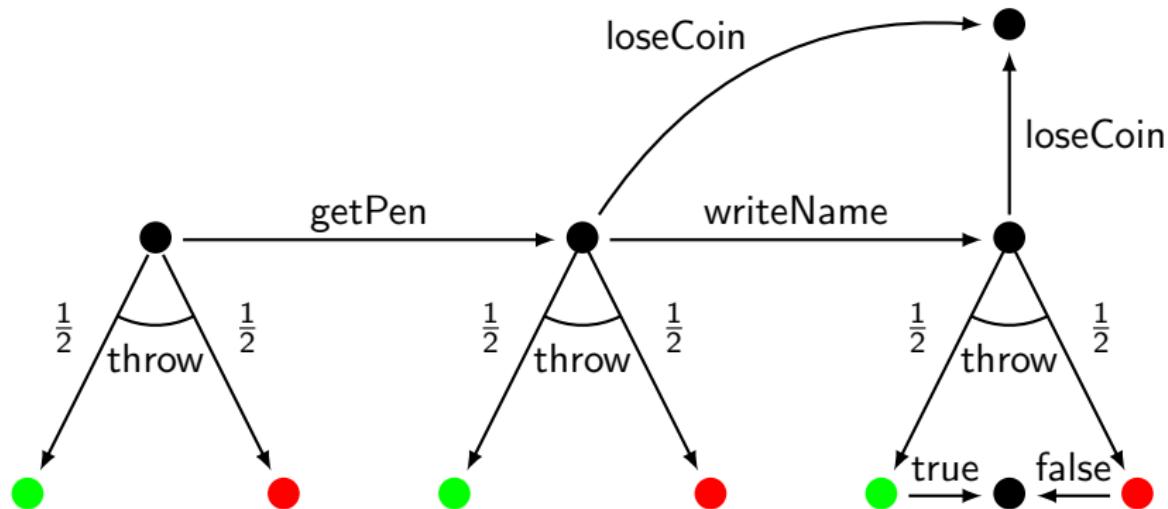
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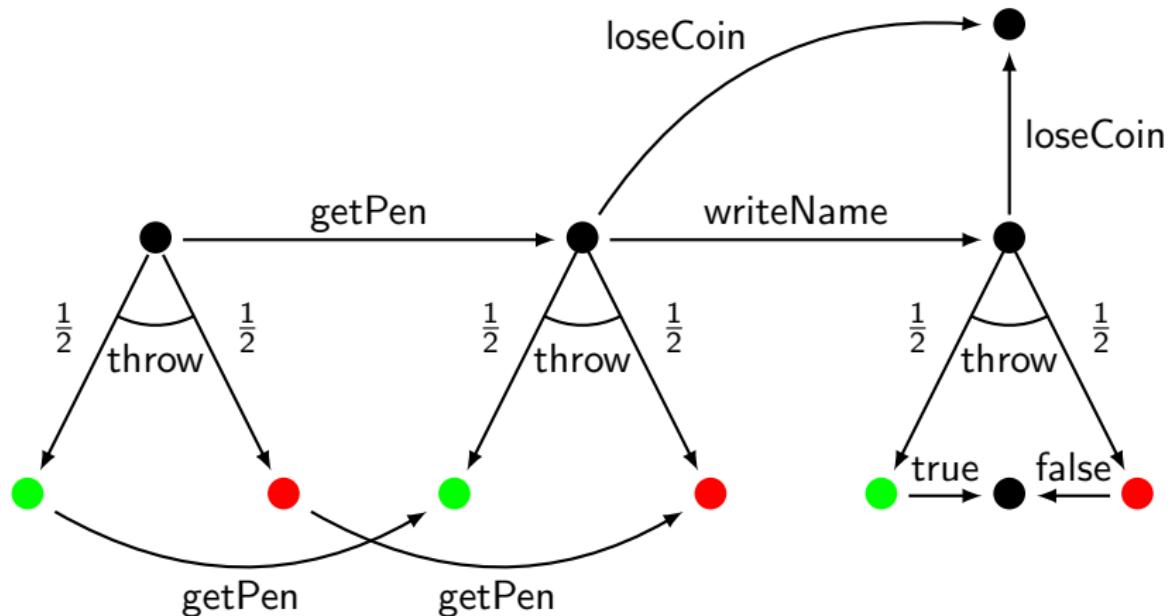
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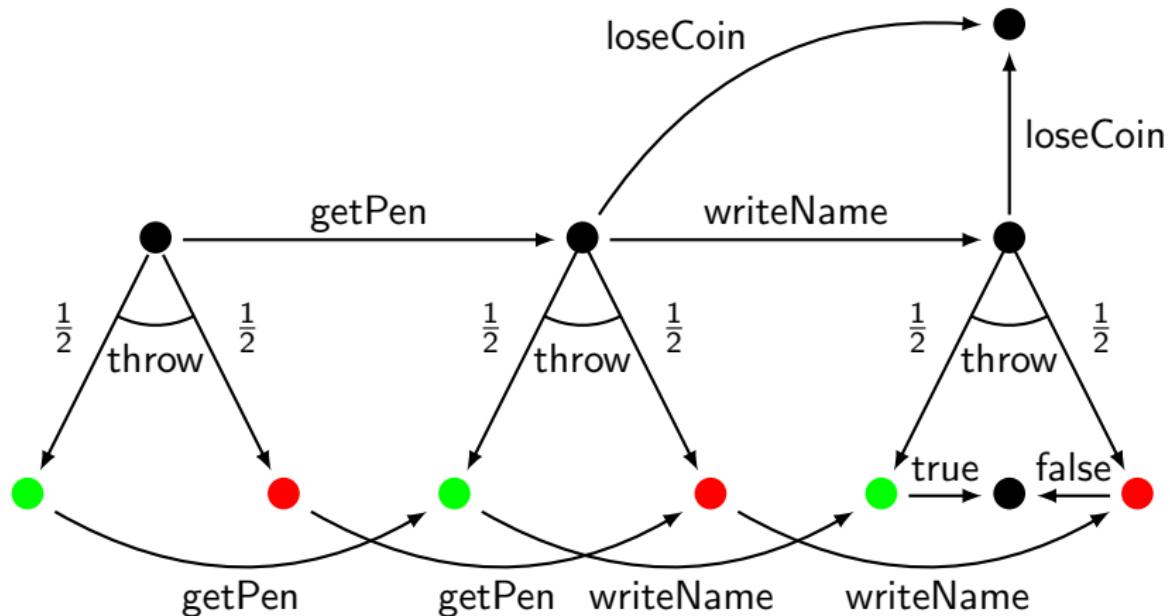
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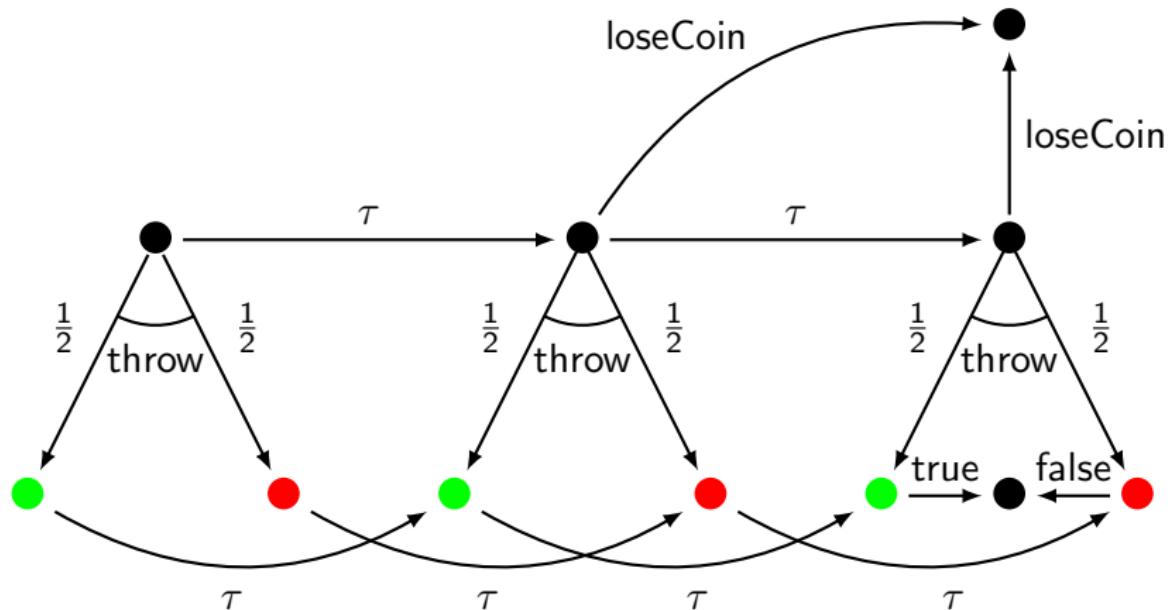
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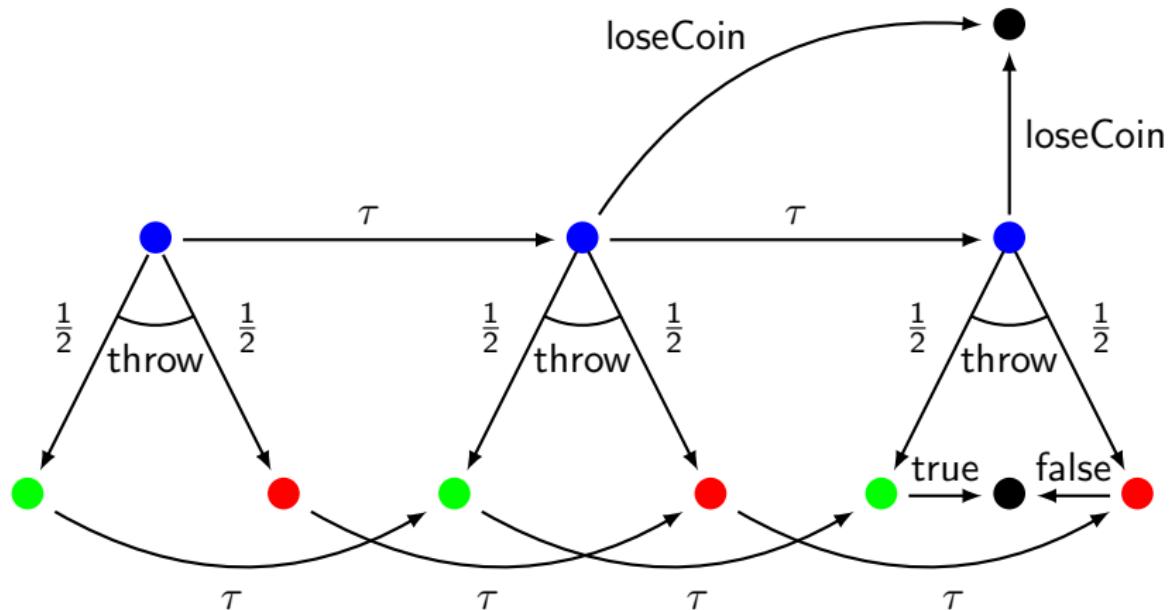
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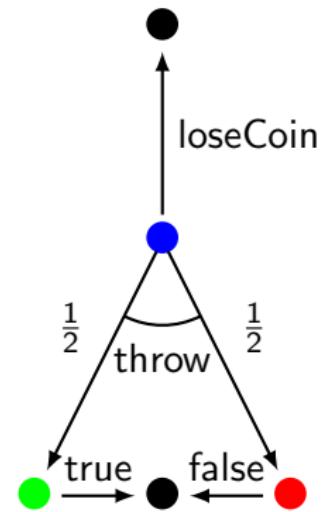
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Confluence: an introductory example



Confluence: non-probabilistic versus probabilistic

Three notions of confluence:

- weak confluence
- confluence
- strong confluence

Confluence: non-probabilistic versus probabilistic

Three notions of confluence:

- weak confluence
 - confluence
 - strong confluence
- ⇒
- weak probabilistic confluence
 - probabilistic confluence
 - strong probabilistic confluence

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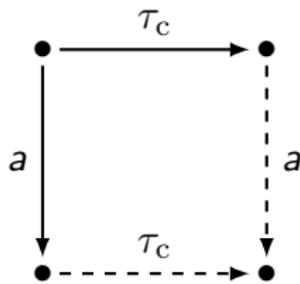
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Strong confluence

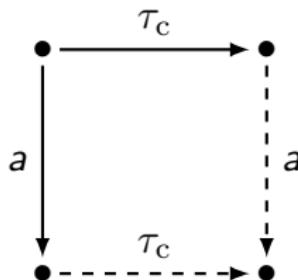
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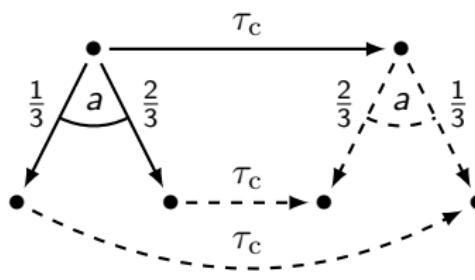
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⇒

- weak probabilistic confluence
- probabilistic confluence
- **strong probabilistic confluence**



Strong confluence

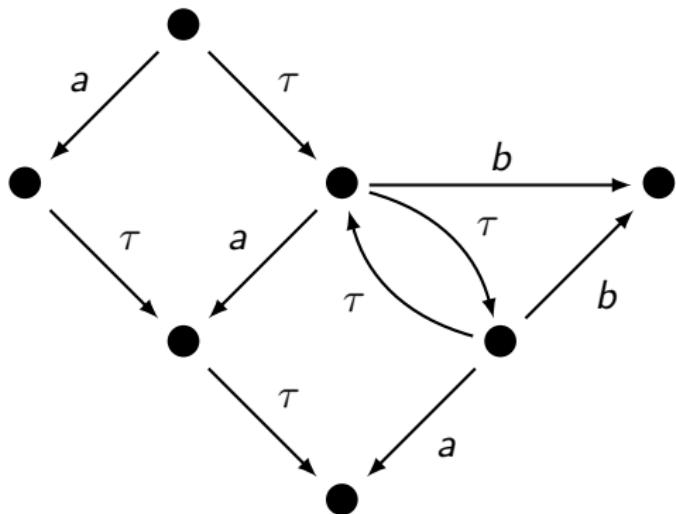


Strong probabilistic confluence

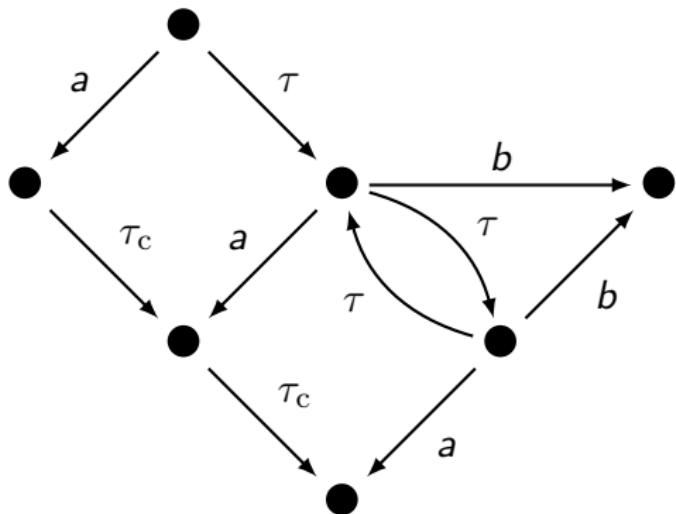
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- 3 State space reduction using confluence
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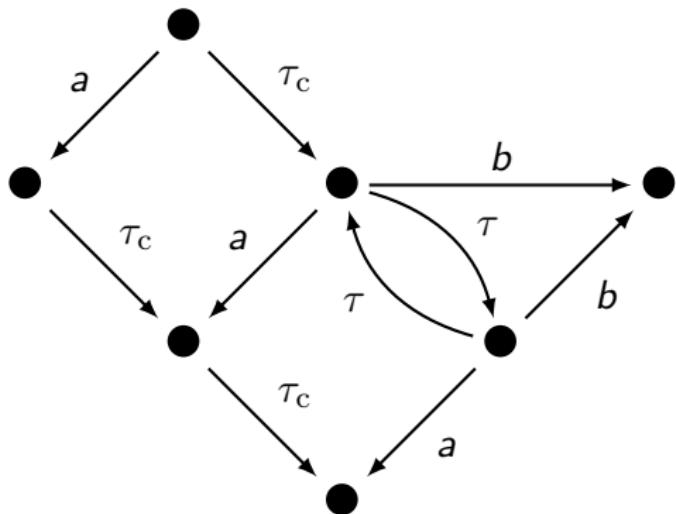
State space reduction using confluence



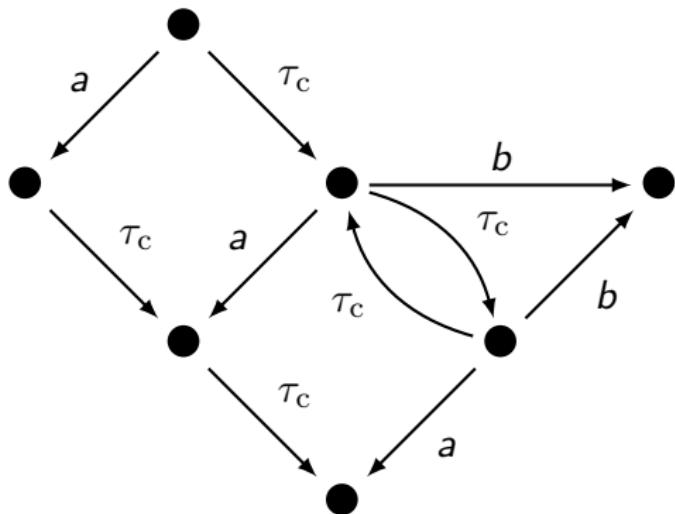
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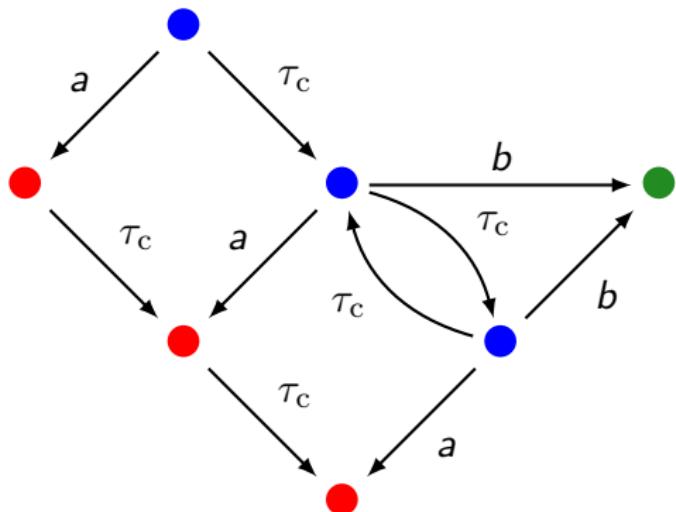
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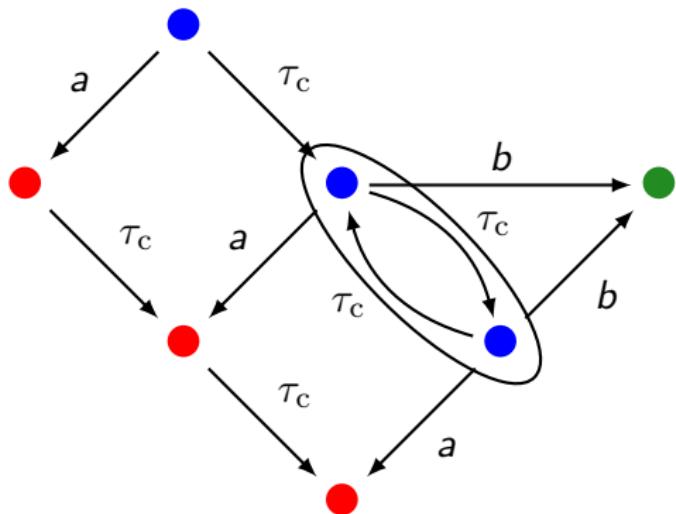
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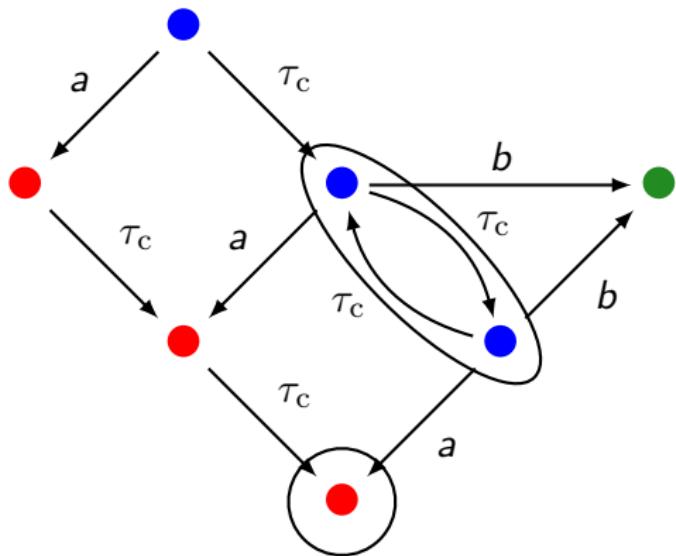
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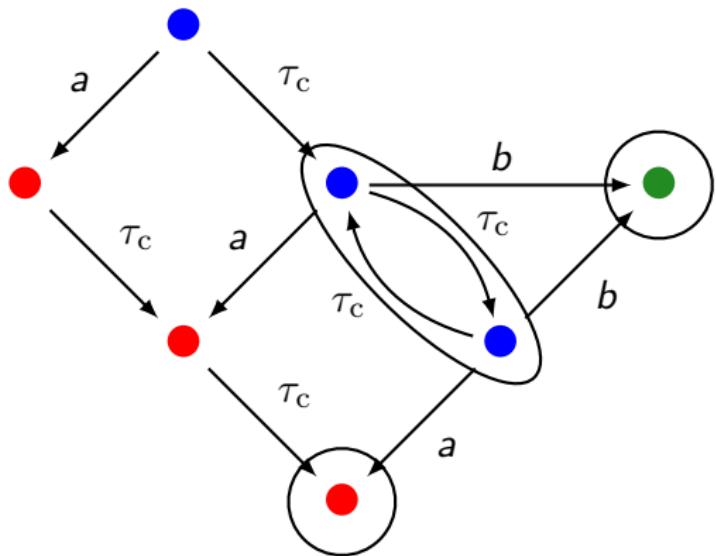
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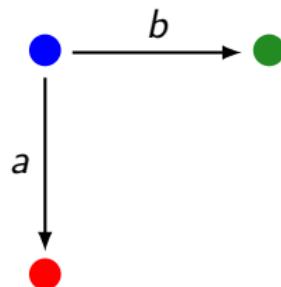
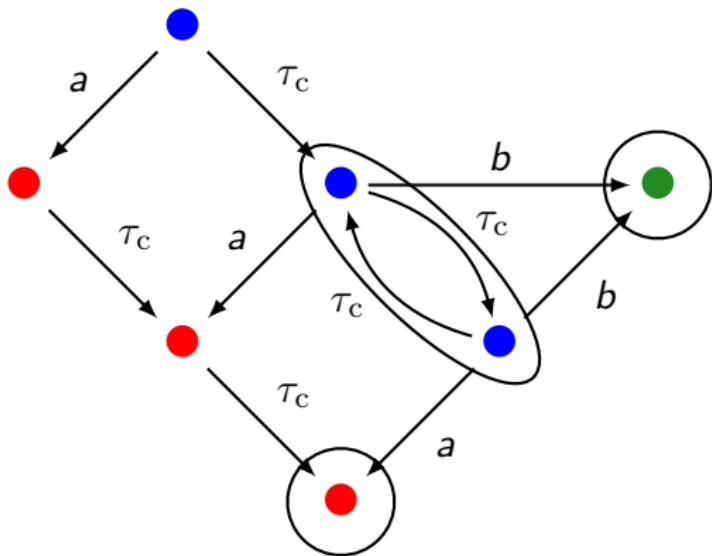


Table of Contents

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Detecting confluence: LPPEs

We detect confluence symbolically using LPPEs:

$$\begin{aligned} X(\vec{g} : \vec{G}) &= \sum_{\vec{d}_1 : \vec{D}_1} c_1 \Rightarrow a_1 \sum_{\vec{e}_1 : \vec{E}_1} f_1 : X(\vec{n}_1) \\ &\quad \dots \\ &+ \sum_{\vec{d}_k : \vec{D}_k} c_k \Rightarrow a_k \sum_{\vec{e}_k : \vec{E}_k} f_k : X(\vec{n}_k) \end{aligned}$$

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Example of an LPPE

$$\begin{aligned} X(\text{pc} : \{1..2\}, \text{active} : \text{Bool}) &= \\ \sum_{n:\{1,2,3\}} \text{pc} = 1 &\Rightarrow \text{output}(n) \sum_{\text{b:Bool}} \frac{1}{2} : X(2, \text{b}) \\ + \quad \text{pc} = 2 \wedge \text{active} &\Rightarrow \text{beep} \cdot X(1, \text{active}) \end{aligned}$$

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How to know whether a summand is confluent?

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How to know whether a summand is confluent?

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How to know whether a summand is confluent?

- Its action should be τ
- Its next state should be chosen nonprobabilistically
- It should commute with all the other summands
 - Never enabled at the same time
 - Not touching the same variables

Table of Contents

- 1 Introduction
- 2 Confluence
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Case study: leader election protocol

| Specification | Original | | Reduced | | Running time | |
|---------------|----------|--------|---------|--------|--------------|-----------|
| | States | Trans. | States | Trans. | Before | After |
| leader | 3763 | 6158 | 1399 | 1922 | 1.86 sec | 0.72 sec |
| leaderReduced | 1693 | 2438 | 589 | 722 | 0.90 sec | 0.44 sec |
| leader-2-2 | 67 | 94 | 27 | 32 | 0.04 sec | 0.65 sec |
| leader-2-6 | 535 | 710 | 199 | 212 | 0.36 sec | 0.81 sec |
| leader-2-36 | 18325 | 23690 | 6589 | 6662 | 516.23 sec | 43.11 sec |
| leader-3-2 | 1018 | 1815 | 376 | 561 | 1.61 sec | 3.81 sec |
| leader-3-6 | 21664 | 36519 | 7936 | 10233 | 221.22 sec | 44.92 sec |



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Conclusions

Related work

- Confluence reduction for non-probabilistic systems
- Partial-order reduction for probabilistic systems

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Conclusions / results

- We developed three new **notions of confluence** for probabilistic automata that preserve branching probabilistic bisimulation;
- We showed how confluence can be used for **state space reduction**;
- We discussed how to **detect confluence** based on a probabilistic **process algebra**;
- We illustrated the power of our method using a **case study**.

Questions

Questions?