

# An Extension of the Inverse Method to Probabilistic Timed Automata

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# Context: Verification of Timed Probabilistic Systems

- Verification of timed systems with stochastic behaviour
  - ▶ Need to express **probabilities**
  - ▶ Use of **Probabilistic Timed Automata** [Jen96, KNSS02]
- Need for adjusting some delays of the system
  - ▶ Use of **parameters** (unknown constants)
  - ▶ Definition of a zone of good behaviour for the parameters

# Motivation: Model reduction

- Model checking Probabilistic Timed Automata
  - ▶ Use of the [Prism](#) model checker [[HKNP06](#), [wp](#)]
  - ▶ Difficult to model-check systems with large constants
- Use [rescaling of constants](#)
  - ▶ Consider [smaller values](#) for all the constants of the system
  - ▶ Problem of discrete time
  - ▶ No formal justification for correctness
- Require a [formal justification](#) for rescaling of constants

# Outline

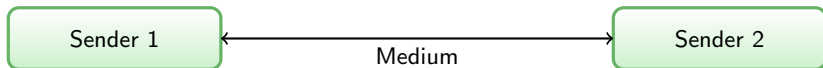
- 1 The CSMA/CD Protocol
  - Description
  - The Model of Probabilistic Timed Automata
  - The Problem
- 2 The Extension of the Inverse Method
  - Probabilistic Parametric Timed Automata
  - Our Method
  - Correctness
- 3 Implementation and Case Studies
- 4 Final Remarks

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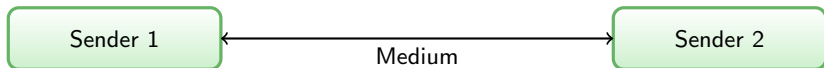
# The CSMA/CD Protocol (1/2)

- Protocol of communication between 2 stations through 1 medium
  - ▶ Carrier Sense Multiple Access with Collision Detection [CSM02, KNSW07]



# The CSMA/CD Protocol (1/2)

- Protocol of communication between 2 stations through 1 medium
  - ▶ Carrier Sense Multiple Access with Collision Detection [CSM02, KNSW07]



- Overall principle: Sender 1 tries to communicate
  - 1 Sender 1 listens to the medium
  - 2 If the medium is free, Sender 1 starts to communicate (duration  $\lambda$ )
  - 3 Since there is a non-null delay for a signal to go through the medium (duration  $\sigma$ ), Sender 2 may have started to communicate in the meanwhile, which leads to a collision
  - 4 Both senders then wait a random number of time slots (duration *slot*) before trying again

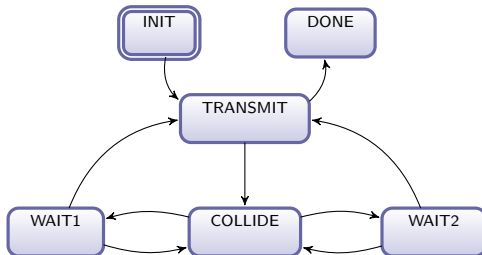
# Timed Parameters of the System

- **Parameters** of the system
  - ▶  $\sigma$ : propagation time between 2 stations
  - ▶  $\lambda$ : time to send a data
  - ▶ *slot*: time unit for the random time to wait before retransmitting
- Classical problem: Computation of **minimum and maximum probabilities of reaching a certain state**
  - ▶  $P_1$ : Minimum probability that sender 1 transmits its message after exactly 1 collision.
  - ▶  $P_{\leq 3}$ : Minimum probability that sender 1 transmits its message after 3 collisions or less.
  - ▶ Depend on the values of the parameters



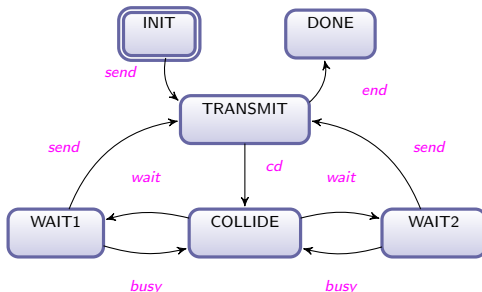
# Probabilistic Timed Automaton (PTA)

- Timed Automaton (TA) [AD94]
  - ▶ Set of locations



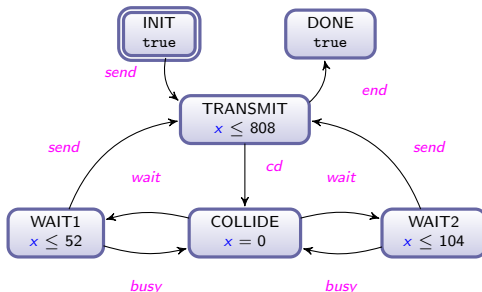
# Probabilistic Timed Automaton (PTA)

- Timed Automaton (TA) [AD94]
  - ▶ Set of locations, set of actions



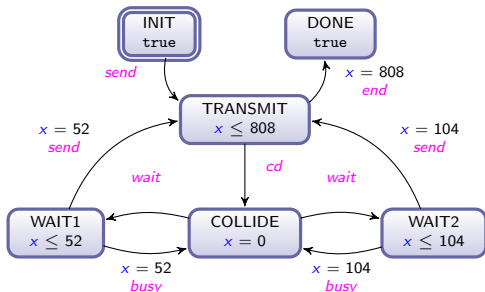
# Probabilistic Timed Automaton (PTA)

- Timed Automaton (TA) [AD94]
  - ▶ Set of **locations**, set of **actions**
  - ▶ Set of **clocks** (real-valued variables increasing at the same linear rate)
    - ★ Operations: Location invariant



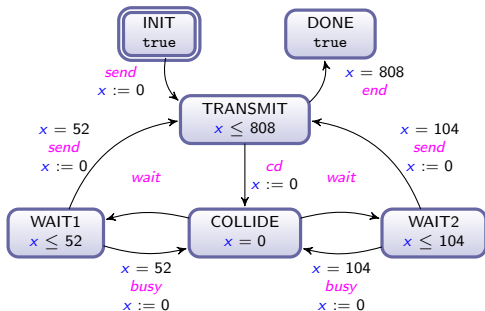
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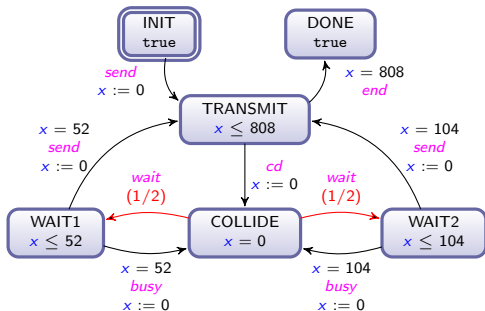
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# Probabilistic Timed Automaton (PTA)

- Timed Automaton (TA) [AD94]
  - ▶ Set of **locations**, set of **actions**
  - ▶ Set of **clocks** (real-valued variables increasing at the same linear rate)
    - ★ Operations: Location invariant, transition guard, clock reset
- Augmented with **probabilities** [Jen96, KNSS02]
  - ▶ The sum of the probabilities leaving a given location through a given action is equal to 1



# Problem (1/2)

- Model CSMA/CD with **Probabilistic Timed Automata**
- **Instantiation** of the parameters
  - ▶ IEEE standard 802.3 for 10 Mbps Ethernet  
 $\pi_0 := \{\lambda = 808 \mu s, \text{ slot} = 52 \mu s, \sigma = 26 \mu s\}$
  - ▶ Values **too large** for Prism (state-space explosion)
  - ▶ Use a set of **rescaled** values  
 $\pi_1 := \{\lambda = 95 \mu s, \text{ slot} = 6 \mu s, \sigma = 3 \mu s\}$
- Computation of **min/max probabilities** using Prism with  $\pi_1$ 
  - ▶  $P_1$ : Minimum probability that sender 1 transmits its message after exactly 1 collision.  $P_1 = 0.5$
  - ▶  $P_{\leq 3}$ : Minimum probability that sender 1 transmits its message after 3 collisions or less.  $P_{\leq 3} = 0.96875$

## Problem (2/2)

- Prism does not formally guarantee that the rescaling does not affect the probabilities
  - ▶ Are the probabilities for  $\pi_1$  the same as for  $\pi_0$ ?
  - ▶ Need for a formal justification for rescaling



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  - ▶ Need for a formal justification for rescaling
- More generally:

### Goal

Given an instantiation  $\pi_0$ , compute a constraint  $K_0$  on the parameters s.t.

- 1  $\pi_0 \models K_0$ , and
- 2 for all  $\pi \models K_0$ , the minimum and maximum probabilities for reachability properties are the same for  $\pi_0$  and  $\pi$ .

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Inst.	$\lambda$	slot	$\sigma$	$\models K_0$	$P_1$	$P_{<3}$
$\pi_0$	808	52	26	yes	0.5	0.96875
$\pi_1$	95	6	3	yes	0.5	0.96875

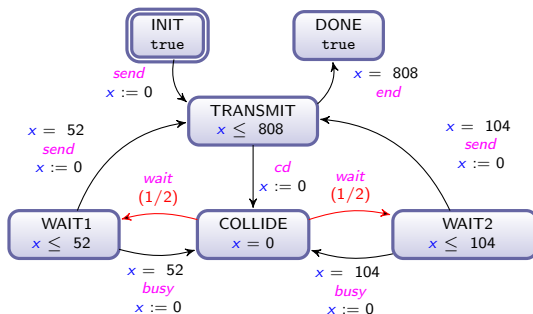
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## Probabilistic

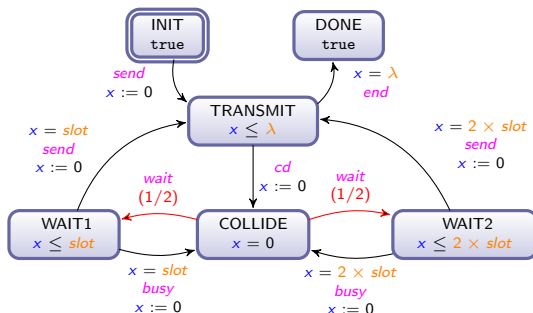
## Timed Automaton

- Probabilistic Timed Automaton [Jen96, KNSS02]
  - ▶ Set of locations, set of actions, set of clocks
  - ▶ probabilities



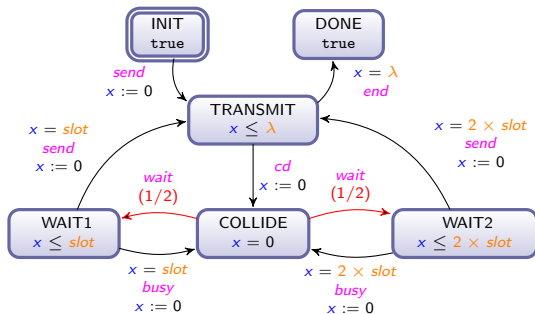
# Probabilistic Parametric Timed Automaton (PPTA)

- Probabilistic Timed Automaton [Jen96, KNSS02]
  - ▶ Set of **locations**, set of **actions**, set of **clocks**
  - ▶ **probabilities**
  - ▶ Set of **parameters** (unknown constants) [AFS09]



# Probabilistic Parametric Timed Automaton (PPTA)

- Probabilistic Timed Automaton [Jen96, KNSS02]
  - ▶ Set of **locations**, set of **actions**, set of **clocks**
  - ▶ **probabilities**
  - ▶ Set of **parameters** (unknown constants) [AFS09]



- ▶ Given a PPTA  $\mathcal{A}$  and an instantiation  $\pi$  of the parameters, we denote by  $\mathcal{A}[\pi]$  the (non-parametric) PTA where all parameters were replaced by their value as defined by  $\pi$

# The Inverse Problem for PPTAs

- Inputs

- ▶ A Probabilistic Parametric Timed Automaton  $\mathcal{A}$
- ▶ A reference instantiation  $\pi_0$  of all the parameters of  $\mathcal{A}$

$\pi_0$

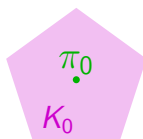
# The Inverse Problem for PPTAs

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- ▶ A Probabilistic Parametric Timed Automaton  $\mathcal{A}$
- ▶ A reference instantiation  $\pi_0$  of all the parameters of  $\mathcal{A}$

## Output: generalisation

- ▶ A constraint  $K_0$  on the parameters such that
  - ★  $\pi_0 \models K_0$
  - ★ For all instantiation  $\pi \models K_0$ , the sets of probabilistic traces (alternating sequences of locations with probabilities, and actions) of  $\mathcal{A}[\pi]$  and  $\mathcal{A}[\pi_0]$  are equal





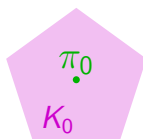
# The Inverse Problem for PPTAs

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  - ★ For all instantiation  $\pi \models K_0$ , the sets of probabilistic traces (alternating sequences of locations with probabilities, and actions) of  $\mathcal{A}[\pi]$  and  $\mathcal{A}[\pi_0]$  are equal



As a consequence, the minimum and maximum probabilities for reachability properties in  $\mathcal{A}[\pi]$  are the same as in  $\mathcal{A}[\pi_0]$

# Our Method: Overall Principle

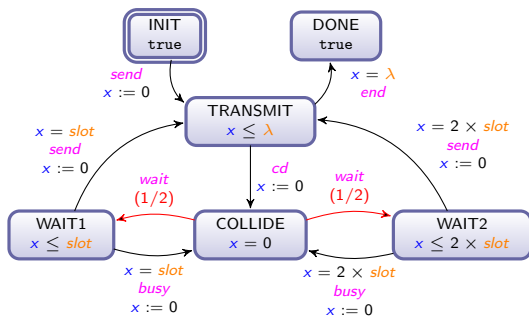
Starting with a PPTA  $\mathcal{A}$ , and an instantiation  $\pi_0$  of the parameters:

- 1 Construct a **non-probabilistic** version  $\mathcal{A}^*$  of  $\mathcal{A}$
- 2 Compute a constraint  $K_0^*$  by applying the **inverse method for classical parametric timed automata** to  $\mathcal{A}^*$  and  $\pi_0$

Then,  $K_0^*$  also solves the inverse problem for  $\mathcal{A}$  ( $K_0 = K_0^*$ ).

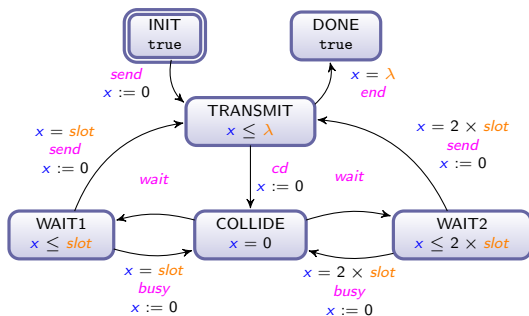
# Non-probabilistic version $\mathcal{A}^*$ of a PPTA $\mathcal{A}$

- Replace stochastic distributions by **non-determinism**



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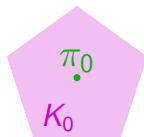
# Overview of the Inverse Method for Classical TAs

- Algorithm *InverseMethod* [ACEF09]
- Inputs
  - ▶ A Parametric Timed Automaton  $\mathcal{A}^*$
  - ▶ A reference instantiation  $\pi_0$  of all the parameters of  $\mathcal{A}^*$

$\pi_0$

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- Algorithm *InverseMethod* [ACEF09]
- Inputs
  - ▶ A Parametric Timed Automaton  $\mathcal{A}^*$
  - ▶ A reference instantiation  $\pi_0$  of all the parameters of  $\mathcal{A}^*$
- Output: generalisation
  - ▶ A constraint  $K_0$  on the parameters such that
    - ★  $\pi_0 \models K_0$
    - ★ For all instantiation  $\pi \models K_0$ , the set of traces (alternating sequences of locations and actions) under  $\pi$  is the same as the set of traces under  $\pi_0$



# Correctness of our Method

## Theorem (Correctness)

Let  $\mathcal{A}$  be a PPTA, and  $\pi_0$  be an instantiation of the parameters of  $\mathcal{A}$ . Let  $K_0 = \text{InverseMethod}(\mathcal{A}^*, \pi_0)$ .

Then, for all  $\pi \models K_0$ , the sets of *probabilistic traces* (alternating sequences of locations with probabilities, and actions) of  $\mathcal{A}[\pi]$  and  $\mathcal{A}[\pi_0]$  are *equal*.

# Idea of the Proof

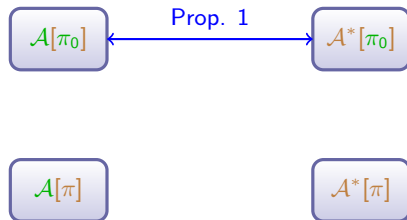
- Given  $\pi \models K_0$ :

 $\mathcal{A}[\pi_0]$  $\mathcal{A}^*[\pi_0]$  $\mathcal{A}[\pi]$  $\mathcal{A}^*[\pi]$



# Idea of the Proof

- Given  $\pi \models K_0$ :

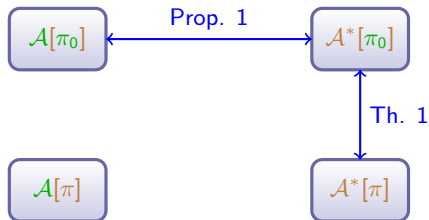


- Justification

- ▶ **Prop. 1:** The sets of **non-probabilistic traces** of  $\mathcal{A}[\pi_0]$  and  $\mathcal{A}^*[\pi_0]$  are equal [AFS09]

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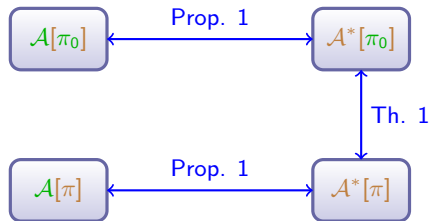


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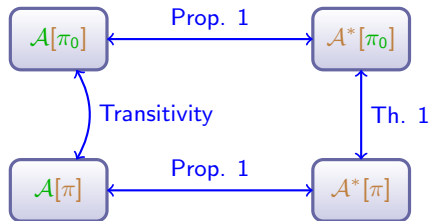


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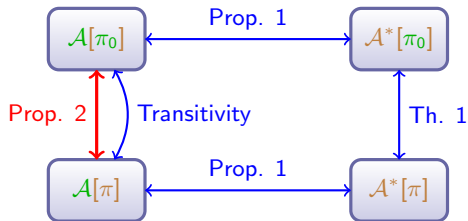


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- ▶ **Th. 1:** The sets of (non-probabilistic) traces of  $\mathcal{A}^*[\pi_0]$  and  $\mathcal{A}^*[\pi]$  are equal [ACEF09]
- ▶ **Prop. 2:** If the sets of non-probabilistic traces of  $\mathcal{A}[\pi]$  and  $\mathcal{A}[\pi_0]$  are equal, then the sets of probabilistic traces of  $\mathcal{A}[\pi]$  and  $\mathcal{A}[\pi_0]$  are equal [KNS02, KNS03]

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# Implementation

- Inverse method implemented in **IMITATOR** [And09]
  - ▶ IMITATOR: “Inverse Method for Inferring Time Abstract Behavior”
  - ▶ 1500 lines of code in Python
  - ▶ 4 man-months of work
  - ▶ Calls the parametric model checker **HYTECH** [HHWT95]
    - ★ Used by IMITATOR for the computation of the *Post* operation
  - ▶ Web page: <http://www.lsv.ens-cachan.fr/~andre/IMITATOR>

- Some case studies

Example	# of PTAs	loc. per PTA	# of clocks	# of param.	# of iter.	$ Post^* $	$ K_0 $	CPU time
CSMA/CD [CSM02, KNSW07, wp]	3	[3, 8]	3	3	17	218	3	44 s
RCP [SS01]	5	[6, 11]	6	5	18	154	2	70 s
WLAN [wp, KNS02]	3	[1, 15]	2	8	21	294	13	108 s

# Case Studies (1/2)

- CSMA/CD Protocol [CSM02, KNSW07, wp]
  - ▶ IEEE standard 802.3 for 10 Mbps Ethernet  
 $\pi_0 := \{\lambda = 808 \mu s, \text{ slot} = 52 \mu s, \sigma = 26 \mu s\}$
  - ▶ Constraint computed by IMITATOR:  
 $K_0: \sigma < \text{slot} \wedge 15\text{slot} < \lambda < 16\text{slot}$
  - ▶ Recall that  $\pi_1 \models K_0$   
 $\pi_1 := \{\lambda = 95 \mu s, \text{ slot} = 6 \mu s, \sigma = 3 \mu s\}$
  - ▶ We can thus compute  $P_1$  and  $P_{\leq 3}$  using  $\pi_1$ , and apply the result to  $\pi_0$  (by correction of our method)



# Case Studies (2/2)

- Root Contention Protocol [SS01]

- ▶ Reference instantiation  $\pi_0$ :

$rc\_fast\_max = 85ns$      $rc\_fast\_min = 76ns$      $rc\_slow\_max = 167ns$   
 $rc\_slow\_min = 159ns$      $delay = 30ns$

- ▶ Constraint output by our method

$K_0 : 2delay < rc\_fast\_min \wedge rc\_fast\_max + 2delay < rc\_slow\_min$

- Wireless Local Area Network Protocol [wp, KNS02]

- ▶ Reference instantiation  $\pi_0$ :

$ASLOTTIME = 1\mu s$      $DIFS = 2\mu s$      $VULN = 1\mu s$      $TTMAX = 315\mu s$   
 $TTMIN = 4\mu s$      $ACK\_TO = 6\mu s$      $ACK = 4\mu s$      $SIFS = 1\mu s$

- ▶ Constraint output by our method

$VULN > 0$	$\wedge$	$SIFS > 0$	$\wedge$	$ACK\_TO + DIFS < 15ASLOTTIME$
$DIFS > 0$	$\wedge$	$ASLOTTIME > 0$	$\wedge$	$TTMIN + DIFS \leq TTMAX$
$ACK \leq 2DIFS$	$\wedge$	$DIFS < TTMIN$	$\wedge$	$ACK\_TO + DIFS \leq ACK + TTMIN$
$SIFS < TTMIN$	$\wedge$	$TTMIN \geq ACK$	$\wedge$	$TTMIN \leq ACK\_TO$
$VULN < ACK$				

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# Conclusion

- Generalisation method
  - ▶ Model a system with a **probabilistic parametric timed automaton**  $\mathcal{A}$
  - ▶ Starting with an **instantiation**  $\pi_0$  of the parameters, we synthesise a **constraint**  $K_0$  **on the parameters** guaranteeing that, for any  $\pi \models K_0$ , the min/max probabilities of reaching some state are equal for  $\mathcal{A}[\pi]$  and  $\mathcal{A}[\pi_0]$
- Advantages
  - ▶ Useful to determine probabilities (e.g., using Prism) for **systems with large constants**
  - ▶ Avoid the **repeated computation** of probabilities for many different values of the parameters
- Applications: Probabilistic systems
  - ▶ **Protocols of communication**
  - ▶ Hardware verification

# Future Works

- Deal with **soft deadline properties**
  - ▶ E.g., probability of reaching some state **within some deadline**
  - ▶ Fall beyond the class of properties considered here
- Consider methods to enlarge our constraint
  - ▶ The constraint output by the inverse method for classical parametric timed automata is not **maximal**
    - ★ **Not the weakest** constraint solving the inverse problem
  - ▶ Consider iterative methods **[ACEF09]**
- Consider **continuous probabilities**
  - ▶ For now, we considered continuous time with **discrete** probabilities
  - ▶ Allow to model more classes of systems

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