Overview
Probabilistic Transition Systems
Logics for probabilistic systems
Algorithmics
Practical information
conclusion

#### Probabilistic Model Checking

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#### Overview

- Ingredients necessary for model checking
  - representation of systems of interest
  - language to describe properties of these systems
  - a way to automatically check whether the system has the specified property
- From regular MC to probabilistic MC:

Let's take a peek at the ingredients one at a time

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#### Probabilistic Transition Systems

- Transitions labeled with probabilities.
- Sum of probabilities of outgoing arrows equals one.
- Can be either deterministic OR nondeterministic.
- Both discrete- and continuous-time variants exist.
- May be labeled with costs and/or rewards.

TODO: PICTURE OF DTMC and MDP

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Running example will be DTMC (Knuth-Yao algorithm)

#### Logics for probabilistic systems

 The regular interpretation of CTL and LTL asks questions of the form:

Do all possible traces satisfy  $\varphi$ ?

Does some trace satisfy  $\varphi$ ?

The probabilistic variants of CTL and LTL ask:

What is the "fraction" of all possible traces satisfying  $\varphi$ ?

- PROBLEMS...
  - How to compute the fraction of an infinite set???
  - All traces are not equally likely...

- Instead the space of traces is augmented with a probability measure.
- Given a property of traces one may then ask:

What is the probability of choosing a trace satisfying the property?

- The probability measure should reflect the probability of the system choosing a specific trace.
- The probability measure is generated by "cylinder sets".

## Probabilistic Computation Tree Logic

- Probabilistic CTL is a variant of CTL where:
  - Path quantifiers A and E are replaced with probability operators  $\mathbb{P}_{<\rho}(\varphi)$  and  $\mathbb{P}_{<\rho}(\varphi)$ .
  - Expectation operators  $\mathbb{E}_{< c}(\Diamond \Phi)$  and  $\mathbb{E}_{\le c}(\Diamond \Phi)$  may also be defined.
- Semantics:
  - $\mathbb{P}_{\leq p}(\varphi)$  "Is the probability of choosing a path satisfying  $\varphi$  at most p?"
  - $\mathbb{E}_{\leq c}(\Diamond \Phi)$  "Is the expected cost of reaching a state satisfying  $\Phi$  at most c?"
- Apart from these new operators PCTL is like CTL.

## Linear Temporal Logic

- LTL describes properties of linear traces.
- Instead of checking whether all(some) linear traces of a system satisfy an LTL formula...
- The probability for choosing a trace satisfying an LTL formula is computed.

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PCTL LTL

TODO: examples of interesting properties PCTL/LTL can express...

## Checking PCTL properties of DTMCs

TODO: describe PCTL checking of DTMCs

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## Checking LTL properties of DTMCs

TODO: Describe idea of LTL checking algorithm

## Applications

- Analysis of randomized algorithms
- Analysis of randomized protocols
  - communication
  - security
  - consensus
- systems biology
- reliability engineering

# **Tool Support**

- PRISM
- Probmela
- ...

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#### Conclusion

- active research area:
  - parameter synthesis!!
- qualitative VS quantitative
- absolute VS relative guarantees
- relevance
- usefulness