

#### ETAPS Test-of-Time Tool Award 2024

#### Marta Kwiatkowska, Gethin Norman, Dave Parker

ETAPS'24, Luxembourg, April 2024





#### What is PRISM?

• PRISM: <u>Probabilistic</u> (<u>symbolic</u>) <u>model checker</u>



- PRISM today
  - 12 types of probabilistic models, many probabilistic temporal logics
  - uses: logic, automata, Markov models, optimisation,
     SMT, simulation, game theory, artificial intelligence, learning...
  - >400 case studies across a broad range of application domains
- PRISM development: driven by challenges, applications, users



## **PRISM: A brief history**

- 1998: tool development begins (Birmingham)
  - symbolic probabilistic model checking
- 2001: first official public release of PRISM
- 2004 & 2006: PRISM 2.0 & 3.0
  - new GUI, logics, cost/reward models, simulator engines
- 2011: PRISM 4.0
  - probabilistic real-time systems, PRISM benchmark suite
  - multi-objective model checking & assume-guarantee
- 2013: first release of PRISM-games
- 2016 & 2020: PRISM-games 2.0 & 3.0
  - multi-objective, concurrent stochastic games, equilibria
- 2020-2024: policy/strategy synthesis, POMDPs, uncertain MDPs, ...

![](_page_2_Picture_13.jpeg)

![](_page_2_Picture_14.jpeg)

![](_page_2_Picture_15.jpeg)

## **PRISM: A brief history**

- 1998: tool development begins (Birmingham)
  - symbolic probabilistic model checking [TACAS'00,'02]
- 2001: first official public release of PRISM
- 2004 & 2006: PRISM 2.0 & 3.0 [TACAS'06]
  - new GUI, logics, cost/reward models, simulator engines [TACAS'04]
- 2011: PRISM 4.0
  - probabilistic real-time systems, PRISM benchmark suite
  - multi-objective model checking & assume-guarantee [TACAS'07,'10,'11]
- 2013: first release of PRISM-games [TACAS'12,'13]
- 2016 & 2020: PRISM-games 2.0 & 3.0
  - multi-objective, concurrent stochastic games, equilibria [TACAS'15,'16,'22]
- 2020-2024: policy/strategy synthesis, POMDPs, uncertain MDPs, ...

![](_page_3_Picture_13.jpeg)

![](_page_3_Picture_14.jpeg)

![](_page_3_Figure_15.jpeg)

# Early applications of PRISM

- Randomised distributed algorithms/protocols
  - modelled as MDPs/probabilistic automata
  - key motivating example for probabilistic verification

![](_page_4_Figure_4.jpeg)

![](_page_4_Figure_5.jpeg)

- Performance modelling & biochemical reactions
  - modelled as Markov chains

![](_page_4_Figure_8.jpeg)

Multiple flaws, bugs, anomalies found...

### **Enabling technologies**

- Challenge-driven tool development
  - Symbolic model checking
    - [TACAS'00] [TACAS'02] [STTT'04] [CAV'06] ...
  - Real-time probabilistic verification
    - [TCS'02] [FMSD'06] [Info&Comp'07] [FORMATS'09] ...
  - Game-based abstraction refinement
    - [QEST'06] [VMCAI'09] [FMSD'10] [QEST'11] ...
  - Multi-objective & compositional verification
    - [TACAS'10] [QEST'10] [FASE'11] [Info&Comp'13] ...
  - Multi-agent model checking (stochastic games)
    - [TACAS'12] [Inf-&Comp'17] [FMSD'21] [TACAS'22] ...

![](_page_5_Figure_12.jpeg)

#### **PRISM models**

- Increasing variety (and complexity) of probabilistic models supported
  - discrete-time Markov chains
  - probabilistic automata
  - continuous-time Markov chains
  - Markov decision processes (MDPs)
  - probabilistic timed automata
  - partially observable MDPs
  - stochastic multi-player games
  - concurrent stochastic games
  - interval Markov chains & MDPs

#### + concurrency

- + exponential delays
- + policies / control
- + real-time clocks
- + observability
- + multi-agent & strategies
- + concurrency & equilibria
- + epistemic uncertainty

![](_page_6_Figure_19.jpeg)

![](_page_6_Picture_20.jpeg)

# **PRISM** applications

- Increasing variety (and complexity) of applications tackled
  - discrete-time Markov chains
  - probabilistic automata
  - continuous-time Markov chains
  - Markov decision processes
  - probabilistic timed automata
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- Long-running autonomous mobile robots [IJRR'19]
  - via multi-objective MDPs

![](_page_7_Figure_13.jpeg)

• via multi-objective POMDPs

![](_page_7_Figure_15.jpeg)

From verification to control problems

Real-time task scheduling with faulty processors [FMSD'13]

mata

### **PRISM applications**

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![](_page_8_Figure_12.jpeg)

stochastic games strategies

![](_page_8_Figure_14.jpeg)

Verification + game theory

#### **PRISM** applications

- Increasing variety (and complexity) of applications tackled
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Robust AUV control [JAIR'23]

continuous-space + unknown

![](_page_9_Picture_14.jpeg)

Robust anytime learning [NeurIPS'22]

Verification &

epistemic uncertainty

- MDP policies learnt from samples
- IMDPs used for robust guarantees

Trajectory

- Deep reinforcement learning
  - verified probabilistic policies from neural nets, via IMDPs

![](_page_9_Figure_20.jpeg)

### Who uses PRISM? (and how/why)

- PRISM bibliography<sup>1</sup> lists >850 papers relating to PRISM
  - 375 "case studies", >100 "extensions", >250 "connections"
- PRISM applications & users
  - very wide (often non-expert) user base
  - broad applicability of PMC techniques/models

  - user interface: model editor, simulator, debugger, graph plotting, ...
  - documentation, tutorials, examples
- General aims
  - stable, usable, flexible, coherent framework

![](_page_10_Figure_11.jpeg)

#### • PRISM for teaching

 common basis for the practical component of taught courses on (non-)probabilistic model checking

## **Diverse applications of PRISM**

- Cloud computing
  - live migration of VMs
  - plan optimisation for performance guarantees

![](_page_11_Picture_4.jpeg)

[Kikuchi/Matsumoto (Fujitsu), CLOUD'11] (Best paper)

#### Football tactics

- team strategies learnt from data
- tactical efficiency analysed via probabilistic model checking

![](_page_11_Picture_9.jpeg)

[Van Roy et al., JAIR'23, MIT-SSAC'24]

- Human-cell conversion
  - for disease models, gene therapies
  - design tool for optimisation and prediction, based on model checking

![](_page_11_Picture_14.jpeg)

[Jung et al., Nature Communications'21]

### **Building on PRISM**

- Extending PRISM
  - open-source codebase (GPL) O
  - primarily implemented in Java
    - (some C code and various native libraries)
  - accessibility for student/external contributors
    - "explicit" engine is an easy entry point
- Connections & tool chains
  - via PRISM modelling language
    - e.g. PEPA, bigraphs, RoboChart, SBML
  - via explicit (textual) model files
  - programmatically via API
    - Java, Python, model generators

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	prism-examples	Model checking for IDTMCs/IMDPs.	last year	
	prism-tests	Small IMDP/IDTMC solution optimisation (and bu	ugfix). last month	
	🖿 prism	Small IMDP/IDTMC solution optimisation (and bu	ugfix). last month	
	🗋 .classpath	Add unit testing via JUnit.	2 years ago	
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	CHANGELOG.txt	Update CHANGELOG.	3 months ago	♥ v4.8.1 (Latest) on Jan 13
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	···	25		

## The PRISM language

- PRISM modelling language
  - simple textual language based on guarded commands
  - inspired by: SMV language, Reactive modules
  - de-facto standard for probabilistic verification
- Key ingredients
  - the basics: modules (variables + guarded commands), parallel composition, costs/rewards, parameters (constants)
  - also: clocks, observations, players, epistemic uncertainty, ...
- Some design decisions
  - consistent modelling language for many model types
  - (deliberately) simple/low-level, general-purpose language

![](_page_13_Picture_11.jpeg)

## The PRISM language

- PRISM modelling language
  - simple textual language based on guarded commands
  - inspired by: SMV lar
  - de-facto standard PRISM models as benchmarks
    - open data: >15 years of supplementary materials pages on PRISM publications (~60)

csq

vaver p] user1 endplayer

ver 1 sent?

energy level of player 1

; 1) & (e1'=e1-1); // transmit

2, e1=e2, w1=w2, t1=t2 ] endmodule

e joint probability distribution for transmission failure

'=false) + (1-q1) : (c'=true); // only user 1 transmits

'=false) + (1-q1) : (c'=true); // only user 2 transmits

:'=false) + (1-q2) : (c'=true); // both users transmit

benchmark suite: 36 scalable benchmarks & property queries classified by type<sup>1</sup>

<sup>1</sup>See also: Quantitative Verification Benchmark Set

Some design decisions 

the basics: module

also: clocks, obser

parallel compositi

Key ingredients

- consistent modelling language for many model types
- (deliberately) simple/low-level, general-purpose language

CTMC, CSG,

DTMC, LTS, MDP, POMDP. POPTA.

PTA, STPG, SMG,

TPTG, IDTMC,

IMDP

#### PRISM: Where next?

![](_page_15_Figure_1.jpeg)

#### Summary

- PRISM (& PRISM-games)
  - approx. 25 years of continuous development
  - challenge-, application- and user-driven tool evolution
  - stable, usable, coherent framework for wide user base
  - many enhancements to come and challenges to tackle

![](_page_16_Picture_6.jpeg)

#### PRISM supporters:

![](_page_16_Picture_8.jpeg)

Aistis Simaitis, Alberto Puggelli, Alistair John Strachan, Alessandro Bruni, Andrew Hinton, Carlos Bederian, Charles Harley, Chris Novakovic, Christian von Essen, Christoph Weinhuber, Clemens Wiltsche, Dave Parker, Edoardo Bacci, Ernst Moritz Hahn, Frits Dannenberg, Gabriel Santos, Gethin Norman, Hongyang Qu, Ingy Elsayed-Aly, Joachim Klein, Joachim Meyer-Kayser, Kenneth Chan, Ludwig Pauly, Mark Kattenbelt, Marta Kwiatkowska, Mateusz Ujma, Max Kurze, Mike Arthur, Nishan Kamaleson, Paolo Ballarini, Rashid Mehmood, Sebastian Vermehren, Steffen Märcker, Stephen Gilmore, Vincent Nimal, Vojtech Forejt, Xueyi Zou, Zak Cohen

(and many more contributors to underlying theory and techniques)

![](_page_16_Picture_11.jpeg)