

# Analysing mobile networks via probabilistic model checking

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# Background

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- **FGUC: Foundations of Global Ubiquitous Computing**
  - EU activity & this workshop
- **SGUC: Science for Global Ubiquitous Computing (GC2)**
  - One of 7 UK Grand Challenges (GC2), related to FGUC
  - **Rigorous foundation** for tools and techniques
- **Also GC4: Scalable Ubiquitous Computing Systems**
  - Design, engineering, managing ubiquitous systems
  - Tools and techniques
- **This talk, focus on a component of GC2**
  - **Mobile** ad hoc network protocols
  - **Probability**: why needed, challenges
  - **Verification** techniques and tools

# Ubiquitous computing: the trends...

- Devices, ever smaller
  - Laptops, phones, PDAs, ...
  - Sensors, motes, ...
- Networking, wireless, wired & global
  - Mobile ad hoc
  - Wireless everywhere
  - Internet everywhere
  - Global connectivity
- Systems/software
  - Decentralised
  - Self-organising
  - Self-configuring
  - Autonomous
  - Adaptive
  - Context-aware



# Ubiquitous computing: users expect...

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- ...assurance of

- safety
- correctness
- performance
- reliability

- For example:

- Is my e-savings account **secure**?
- Can someone **bluesnarf** from my phone?
- How **fast** is the communication from my PDA to printer?
- Is my mobile phone **energy efficient**?
- Is the operating system **reliable**?
- Can the laptop recover from faults with **no effort on** my part?





# Probability helps

- In distributed (de-centralised) co-ordination algorithms
  - As a **symmetry breaker**
    - "leader election is eventually resolved **with probability 1**"
  - In **gossip-based** routing and multicasting
    - "the message will be delivered to all nodes **with high probability**"
- When modelling uncertainty in the environment
  - To **quantify failures**, express **soft deadlines**, **QoS**
    - "probability of frame being delivered **within 5ms** is **at least 0.91**"
  - To **quantify environmental factors** in decision support
    - "expected cost of reaching the goal is **100**"
- When analysing system performance
  - To **quantify arrivals**, **service**, etc. characteristics
    - "in the long run, **mean waiting time** in a lift queue is **30 sec**"

# Real-world protocol examples

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- Protocols featuring **randomisation**
  - Randomised back-off schemes
    - IEEE 802.11 (WiFi) Wireless LAN MAC protocol
  - Random choice of waiting time
    - Bluetooth, device discovery phase
  - Random choice of routes to destination
    - Crowds, anonymity protocol for internet routing
  - Random choice of a timing delay
    - Root contention in IEEE 1394 FireWire
  - Random choice over a set of possible addresses
    - IPv4 dynamic configuration (link-local addressing)
  - and more
- **Continuous** probability distribution needed to model network traffic, node mobility, random delays...

# Probability elsewhere

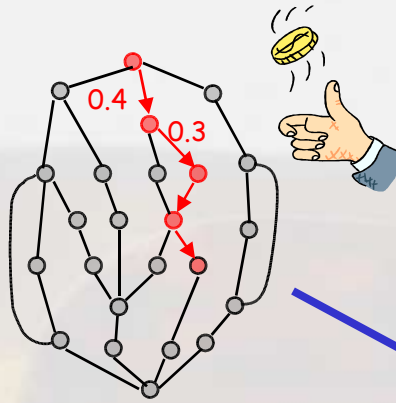
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- In performance modelling
  - Pioneered by Erlang, in telecommunications, ca 1910
  - Models: typically continuous-time Markov chains
  - Emphasis on steady-state and transient probabilities
- In stochastic planning
  - Cf Bellman equations, ca 1950s
  - Models: Markov decision processes
  - Emphasis on finding optimum policies
- Our focus, probabilistic model checking
  - Distinctive, on automated verification for probabilistic systems
  - Temporal logic specifications, automata-theoretic techniques
  - Shared models
  - Exchanging techniques with the other two areas

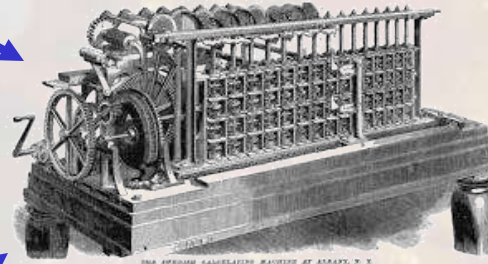


# Probabilistic model checking...

in a nutshell



Probabilistic model



Probabilistic Model Checker

send  $\rightarrow P_{>0.9}(\diamond \text{deliver})$

Probabilistic temporal logic specification



or



or

The probability

State 5: 0.6789
State 6: 0.9789
State 7: 1.0
...
State 12: 0
State 13: 0.1245



# Probabilistic model checking with PRISM

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- **Models**

- Discrete-Time Markov Chains (DTMCs)
- Markov Decision Processes (MDPs)
- Continuous-Time Markov Chains (CTMCs)
- Probabilistic Time Automata (PTAs)

- **Specifications (informally)**

- “**probability** of shutdown occurring is at most...”
- “probability of delivery **within time deadline** is ...”
- “**expected time** to message delivery is ...”
- “**expected power consumption** is ...”

- **Specifications (formally)**

- Probabilistic extensions of temporal logic (PCTL, CSL, PTCTL)
- Probability, time, cost/rewards

# Extending PRISM with mobility

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- **Models in PRISM**
  - are described in reactive modules
    - :: extend with **mobility**, **dynamic** topology
    - :: extend with **geographical** positioning
    - :: extend with **context**-awareness
  - are **finite-state**, **static** and often **huge**
    - :: verification support for **compositionality**, **abstraction**
    - :: techniques for **infinite state** systems
    - :: combine with **simulation-based** methods
- **Specifications**
  - are temporal logic based:
    - :: add **location**-awareness
    - :: more expressive logics?

# PRISM real-world case studies

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- **MDPs/DTMCs**
  - Bluetooth device discovery [ISOLA'04]
  - Crowds anonymity protocol (by Shmatikov) [JCS 2004]
  - Randomised consensus [CAV'01]
  - Randomised Byzantine Agreement [FORTE'02]
  - NAND multiplexing for nanotechnology (with Shukla) [VLSI'04]
- **CTMCs**
  - Dynamic Power Management (with Shukla and Gupta) [HLDVT'02]
  - Dependability of embedded controller [INCOM'04]
- **PTAs**
  - IPv4 Zeroconf dynamic configuration [FORMATS'03]
  - Root contention in IEEE 1394 FireWire [FAC 2003, STTT 2004]
  - IEEE 802.11 (WiFi) Wireless LAN MAC protocol [PROBMIV'02]

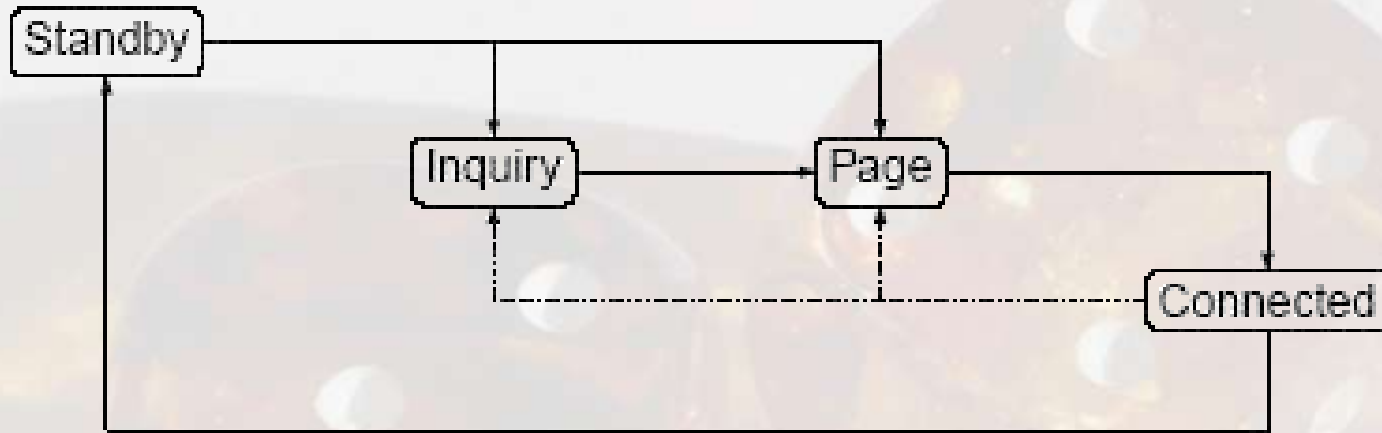
# Bluetooth protocol overview

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- **Short-range low-power wireless protocol**
  - Personal Area Networks (PANs)
  - Open standard, versions 1.1 and 1.2
  - Widely available in phones, PDAs, laptops, ...
- **Uses frequency hopping scheme**
  - To avoid interference (uses unregulated 2.4GHz band)
  - Pseudo-random frequency selection over 32 of 79 frequencies
  - Inquirer hops faster
  - Must synchronise hopping frequencies
- **Network formation**
  - **Piconets** (1 master, up to 7 slaves)
  - Self-configuring: devices **discover** themselves
  - Master-slave roles

# States of a Bluetooth device

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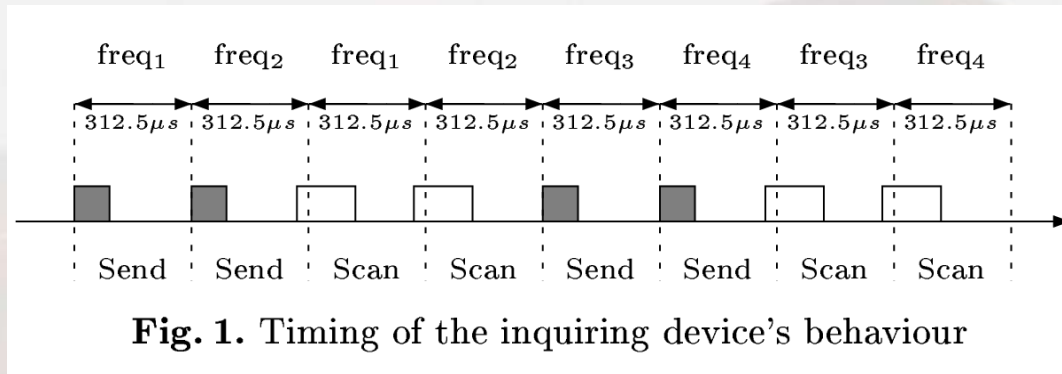
- Master looks for device, slave listens for master
- Standby: default operational state
- Inquiry: **device discovery**
- Page: establishes connection
- Connected: device ready to communicate in a piconet

# Why focus on device discovery?

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- Performance of device discovery crucial
  - No communication before initialisation
  - First mandatory step: **device discovery**
- Device discovery
  - Exchanges information about slave clock times, which can be used in later stages
  - Has considerably higher power consumption
  - Determines the speed of piconet formation

# Frequency hopping



- **Clock CLK**, 28 bit free-running, ticks every 312.5 μs
- **Inquiring device (master)** broadcasts inquiry packets on two consecutive frequencies, then listens on the same two (plus margin)
- Potential **slaves** want to be discovered, scan for messages
- **Frequency sequence** determined by formula, dependent on bits of clock CLK (k defined on next slide):

$$\text{freq} = [\text{CLK}_{16-12} + k + (\text{CLK}_{4-2,0} - \text{CLK}_{16-12}) \bmod 16] \bmod 32$$



# Frequency hopping sequence

$$\text{freq} = [\text{CLK}_{16-12} + k + (\text{CLK}_{4-2,0} - \text{CLK}_{16-12}) \bmod 16] \bmod 32$$

- Two trains (=lines)
- k is offset that determines which train
- Swaps between trains every 2.56 sec
- Each line repeated 128 times

```

1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
17 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
1 2 19 20 21 22 23 24 25 26 27 28 29 30 31 32
1 2 3 20 21 22 23 24 25 26 27 28 29 30 31 32
17 18 19 20 5 6 7 8 9 10 11 12 13 14 15 16
17 18 19 20 21 6 7 8 9 10 11 12 13 14 15 16
1 2 3 4 5 6 23 24 25 26 27 28 29 30 31 32
1 2 3 4 5 6 7 24 25 26 27 28 29 30 31 32
17 18 19 20 21 22 23 24 9 10 11 12 13 14 15 16
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17 18 19 20 21 22 23 24 25 26 27 28 13 14 15 16
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1 2 3 4 5 6 7 8 9 10 11 12 13 14 31 32
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17 18 19 20 21 22 23 24 25 26 27 28 29 30 15 16
17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 16
    
```

# Sending and receiving in Bluetooth

- **Sender:** **broadcasts** inquiry packets, sending according to the frequency hopping sequence, then **listens**, and repeats
- **Receiver:** follows the frequency hopping sequence, **own** clock



- **Listens continuously** on one frequency
- If **hears** message sent by the sender, then **replies** on the same frequency
- **Random wait** to avoid collision if **two** receivers hear **on same** frequency

# Bluetooth modelling

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- Very complex interaction
  - Genuine randomness, **probabilistic** modelling essential
  - Devices make contact only if listen on the **right** frequency at the **right** time!
  - Sleep/scan periods unbreakable, much longer than listening
  - **Cannot** scale constants (approximate results)
  - **Cannot** omit subactivities, otherwise oversimplification
- Huge model, even for one sender and one receiver!
  - Initial configurations dependent on 28 bit clock
  - **Cannot** fix start state of receiver, clock value could be arbitrary
  - 17,179,869,184 **possible initial states**
- But is a realistic future **ubiquitous** computing scenario!

# What about other approaches?

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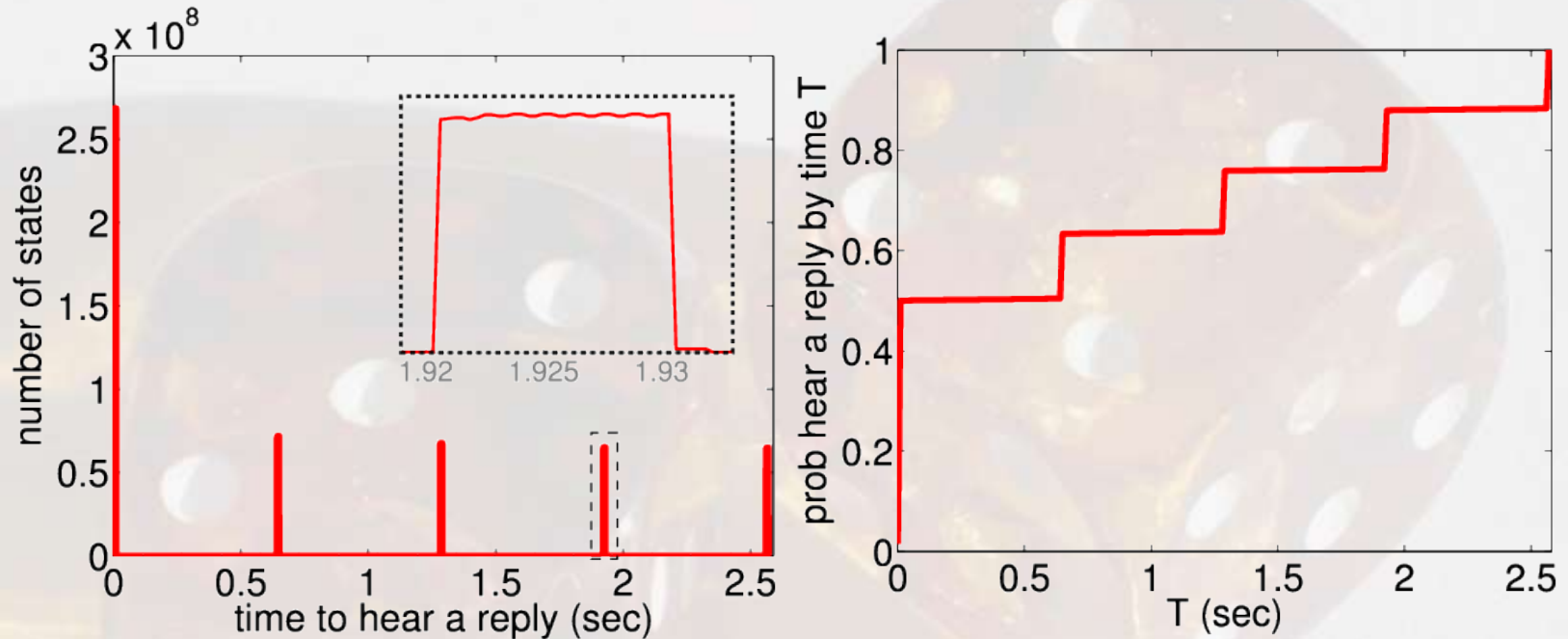
- Indeed, others have tried...
  - network **simulation** tools (BlueHoc)
  - **analytical** approaches
- But
  - **simulations** obtain **averaged** results, in contrast to **best/worst** case analysis performed here
  - **analytical** approaches require simplifications to the model
  - it is easy to make **incorrect probabilistic assumptions**, as we can demonstrate
- There is a case for all types of analyses, or their combinations...

# Lessons learnt...

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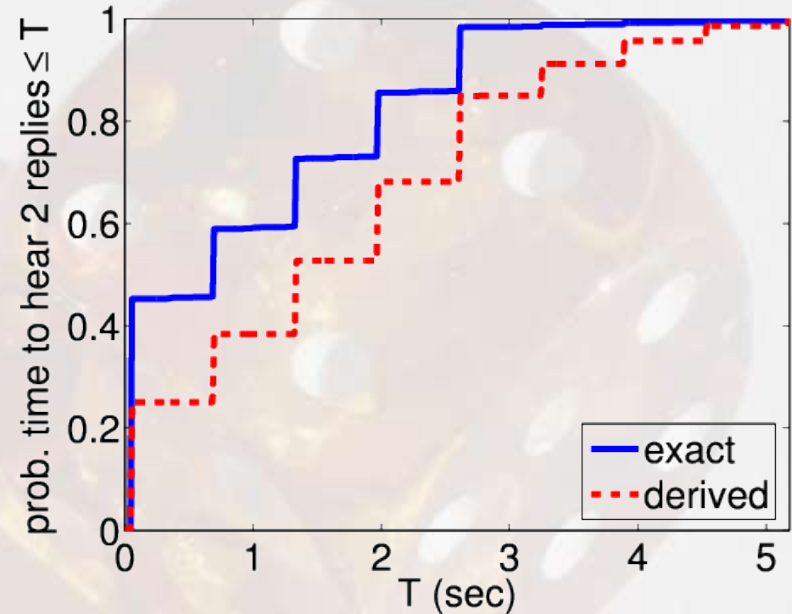
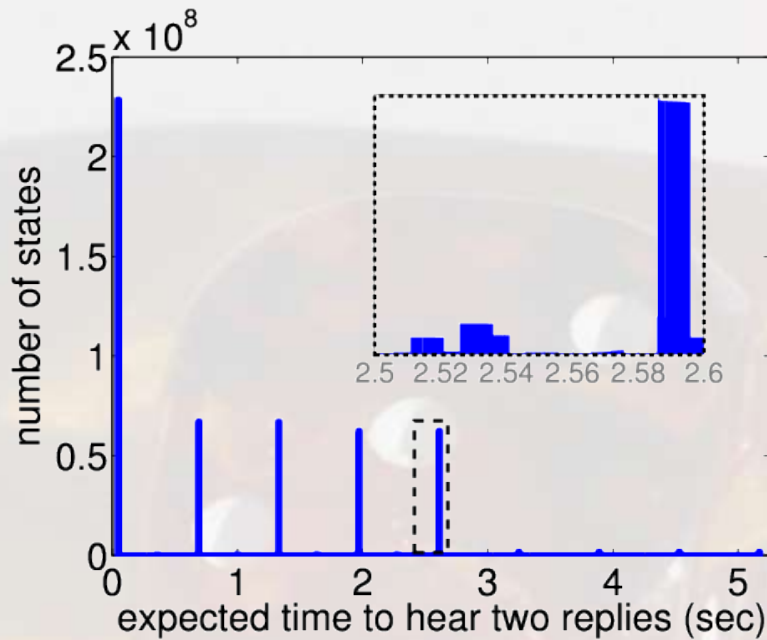
- **Must optimise/reduce model**
  - Assume negligible clock drift
  - Discrete time, obtain a DTMC
  - Manual abstractions, combine transitions, etc
  - Divide into 32 separate cases
  - Success (**exhaustive** analysis) with one/two replies
- **Observations**
  - Work with **realistic constants**, as in the standard
  - Analyse v1.2 and 1.1, confirm 1.1 slower
  - Show best/worst case values, can **pinpoint scenarios** which give rise to them
  - Also obtain **power consumption** analysis

# Time to hear 1 reply



- **Max time** to hear is 2.5716sec, in 921,600 possible initial states, (**Min** 635 $\mu$ s)
- **Cumulative**: assume **uniform** distribution on states when receiver first starts to listen

# Time to hear 2 replies



- **Max time** to hear is 5.177sec (16,565 slots), in 444 possible initial states
- **Cumulative (derived)**: assumes time to reply to 2<sup>nd</sup> message is **independent** of time to reply to 1<sup>st</sup> (**incorrect**, compare with **exact curve** obtained from model checking)



# Related projects

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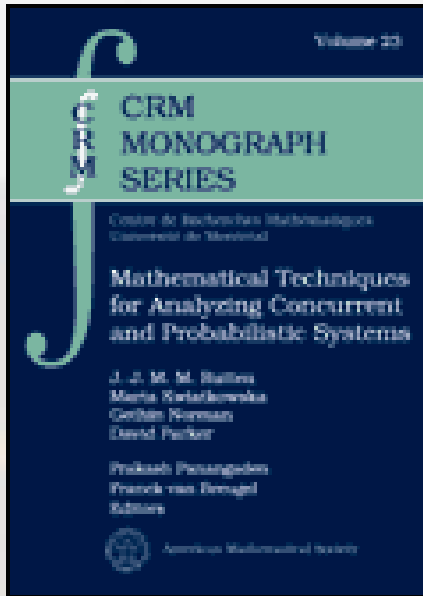
- FORWARD (this case study, see ISOLA'04)
  - Performance modelling of MAC layer of Bluetooth
  - Security analysis of Bluetooth
- Modelling and verification of mobile ad hoc network protocols
  - Modelling language with mobility and randomisation
  - Model checking algorithms & techniques
  - Tool development & implementation
  - Modelling timing properties of AODV
- Focus on properties
  - "probability of delivery **within time deadline** is ..."
  - "**expected time** to device discovery is ..."
  - "**expected power consumption** is ..."

# Challenges for future

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- Exploiting structure
  - **Abstraction, data reduction, compositionality...**
  - **Parametric** probabilistic verification?
- **Proof assistant** for probabilistic verification
- Extension for **mobility**
- Extension for **hybrid** systems
- Simulation, **statistical** testing [Younes]
- **Approximation** methods
- Continuous PTAs
  - Efficient model checking methods?
- More expressive specifications
  - Probabilistic LTL/PCTL\*/mu-calculus?
- **Real** software, not models!

# For more information...



J. Rutten, M. Kwiatkowska, G. Norman and D. Parker

**Mathematical Techniques for Analyzing C**

P. Panangaden and F. van Breugel (editors),  
CRM Monograph Series, vol. 23, AMS  
March 2004

The logo for PRISM, consisting of the word 'PRISM' in a bold, blue, 3D-style font with a white outline, set against a dark blue background.

[www.cs.bham.ac.uk/~dxp/prism/](http://www.cs.bham.ac.uk/~dxp/prism/)

- Case studies, statistics, group publications
- Download, version 2.0 (> 750 users)
- Publications by others and courses that feature PRISM...