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### Citation for published version:

Eteessami, K 2013, The complexity of analyzing infinite-state Markov chains, Markov decision processes, and stochastic games (Invited talk). in *30th International Symposium on Theoretical Aspects of Computer Science, STACS 2013, February 27 - March 2, 2013, Kiel, Germany*. Schloss Dagstuhl - Leibniz-Zentrum fuer Informatik, Germany, pp. 1-2. <https://doi.org/10.4230/LIPIcs.STACS.2013.1>

### Digital Object Identifier (DOI):

[10.4230/LIPIcs.STACS.2013.1](https://doi.org/10.4230/LIPIcs.STACS.2013.1)

### Link:

[Link to publication record in Edinburgh Research Explorer](#)

### Document Version:

Peer reviewed version

### Published In:

30th International Symposium on Theoretical Aspects of Computer Science, STACS 2013, February 27 - March 2, 2013, Kiel, Germany

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# The complexity of analyzing infinite-state Markov chains, Markov decision processes, and stochastic games

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## Abstract

In recent years, a considerable amount of research has been devoted to understanding the computational complexity of basic analysis problems, and model checking problems, for finitely-presented countable infinite-state probabilistic systems. In particular, we have studied *recursive Markov chains* (RMCs), *recursive Markov decision processes* (RMDPs) and *recursive stochastic games* (RSGs). These arise by adding a natural recursion feature to finite-state Markov chains, MDPs, and stochastic games. RMCs and RMDPs provide natural abstract models of probabilistic procedural programs with recursion, and they are expressively equivalent to probabilistic and MDP extensions of pushdown automata. Moreover, a number of well-studied stochastic processes, including multi-type branching processes, (discrete-time) quasi-birth-death processes, and stochastic context-free grammars, can be suitably captured by subclasses of RMCs.

A central computational problem for analyzing various classes of recursive probabilistic systems is the computation of their (optimal) *termination probabilities*. These form a key ingredient for many other analyses, including model checking. For RMCs, and for important subclasses of RMDPs and RSGs, computing their termination values is equivalent to computing the *least fixed point* (LFP) solution of a corresponding *monotone system of polynomial (min/max) equations*. The complexity of computing the LFP solution for such equation systems is a intriguing problem, with connections to several areas of research. The LFP solution may in general be irrational. So, one possible aim is to compute it to within a desired additive error  $\epsilon > 0$ . For general RMCs, approximating their termination probability within *any* non-trivial constant additive error  $< 1/2$ , is at least as hard as long-standing open problems in the complexity of numerical computation which are not even known to be in NP. For several key subclasses of RMCs and RMDPs, computing their termination values turns out to be much more tractable.

In this talk I will survey algorithms for, and discuss the computational complexity of, key analysis problems for classes of infinite-state recursive MCs, MDPs, and stochastic games. In particular, I will discuss recent joint work with Alistair Stewart and Mihalis Yannakakis (in papers that appeared at STOC'12 and ICALP'12), in which we have obtained polynomial time algorithms for computing, to within arbitrary desired precision, the LFP solution of probabilistic polynomial (min/max) systems of equations. Using this, we obtained the first P-time algorithms for computing (within desired precision) the extinction probabilities of multi-type branching processes, the probability that an *arbitrary* given stochastic context-free grammar generates a given string, and the optimum (maximum or minimum) extinction probabilities for branching MDPs and context-free MDPs. For branching MDPs, their corresponding equations amount to Bellman optimality equations for minimizing/maximizing their termination probabilities. Our algorithms combine variations and generalizations of Newton's method with other techniques, including linear programming. The algorithms are fairly easy to implement, but analyzing their worst-case running time is mathematically quite involved.



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30th Symposium on Theoretical Aspects of Computer Science (STACS'13).  
Editors: Natacha Portier and Thomas Wilke; pp. 1–2

Leibniz International Proceedings in Informatics  
LIPICs Schloss Dagstuhl – Leibniz-Zentrum für Informatik, Dagstuhl Publishing, Germany



**1998 ACM Subject Classification** F.2.1 Theory of Computing, G.3 Probability and Statistics, G.1.5 Mathematics of Computing

**Keywords and phrases** recursive Markov chains, Markov decision processes, stochastic games, monotone systems of nonlinear equations, least fixed points, Newton's method, computational complexity, multi-type branching processes, stochastic context-free grammars

**Digital Object Identifier** 10.4230/LIPIcs.STACS.2013.1