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Tansu Alpcan · Yevgeniy Vorobeychik · John S. Baras · György Dán (Eds.)

# Decision and Game Theory for Security

10th International Conference, GameSec 2019 Stockholm, Sweden, October 30 – November 1, 2019 Proceedings



*Editors* Tansu Alpcan University of Melbourne Melbourne, VIC, Australia

John S. Baras University of Maryland, College Park College Park, MD, USA Yevgeniy Vorobeychik D Washington University in St. Louis St. Louis, MO, USA

György Dán D KTH Royal Institute of Technology Stockholm, Sweden

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## Preface

It is difficult today to imagine the modern world without connectivity, information, and computing. We are now entering a new era in which typically isolated residential, commercial, and industrial devices form Cyber-Physical Systems (CPS) or Internet of Things (IoT). An important aspect of this modern connected world is complex interactions and decisions between humans, devices, and networks. Game theory, which studies multi-agent or person decision making provides a solid mathematical foundation for models investigating decisions in these emerging connected, distributed, and complex systems.

Ubiquitous connectivity creates enormous value, but also comes at a cost: connected devices and people are also more vulnerable, as malicious parties are now able to gain access to them in ways that would have been impractical only a decade ago. Consequently, information security and privacy has gained paramount importance. Traditional approaches to security and privacy view this largely as a system engineering problem, focusing on specific applications and systems. The GameSec conference, in contrast, aims to study it from a more holistic perspective, using the tools borrowed from decision theory (including optimization and control theories) and game theory, as well as, more recently, from AI and machine learning.

This volume contains the papers presented at GameSec 2019, the 10th Conference on Decision and Game Theory for Security held during October 30–November 1, 2019, in Stockholm, Sweden. The GameSec conference series was inaugurated in 2010 in Berlin, Germany. GameSec 2019 was the 10th instantiation, and in this span, it has become widely recognized as an important venue for interdisciplinary security research. The previous conferences were held in College Park (Maryland, USA, 2011), Budapest (Hungary, 2012), Fort Worth (Texas, USA, 2013), Los Angeles (USA, 2014), London (UK, 2015), New York (USA, 2016), Vienna (Austria, 2017), and Seattle (Washington, USA, 2018).

As in past years, the 2019 edition of GameSec featured a number of high-quality novel contributions. The conference program included 21 full paper presentations, as well as 11 short papers. The program contained papers on traditional GameSec topics such as game-theoretic models of various security problems, as well as an increasing number of papers at the intersection of AI, machine learning, and security, particularly in reinforcement learning, some of which were presented at the Adversarial AI special track. There is, in addition, a clear increase in the interest in this GameSec program of modeling and studying deception through a game-theoretic lens.

Several organizations supported GameSec 2019. We thank, in particular, KTH Digitalisation Research Platform, Association for Computing Machinery (ACM), Springer, Ericsson, SAAB, and F-Secure.

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We hope that the readers will find this volume a useful resource for their security and game theory research.

October 2019

Tansu Alpcan Yevgeniy Vorobeychik John S. Baras György Dán

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