



Computational Game Theory (BE4M36MAS)

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in Artificial Intelligence, we often use **agent(s)**



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agents autonomously act in an environment in order to reach their goal



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agents **autonomously** act in an environment in order to reach their goal
Agent is fully accountable for its state. Agent accepts requests and

individually decides about its actions



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agents autonomously **act in an environment** in order to reach their goal

Agent perceives the environment and it is able to react to observed changes.



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agents autonomously act in an environment in order to reach their goal

We are considering intelligent agents that can evaluate the state of the environment (e.g., using a utility function) and they act such that their goal is fulfilled (utility is maximized)



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Why **computational** game theory?

We want to know how to implement such agents \rightarrow we are interested in algorithms that find optimal behavior.

What kind of problems we are going to solve?

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Non-cooperative game theory

Cooperative game theory





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One-shot games





Sequential / Dynamic



What kind of problems we are going to solve?

Generic games

 formal representations and domain-independent algorithms for many problems Auctions, social choice, ...

 modeling and solving specific games (the restriction allow us to reason about larger problems)



Topics			
Normal-form games	Non-cooperative	Domain- independent	One-shot
Extensive-form games			sequential
Stochastic games			sequential
Resource allocation		Domain-specific	One-shot
Auctions			One-shot / sequential
Social choice			One-shot / sequential
Cooperative games	cooperative	Domain- independent	One-shot

So why do we study game theory (MAS) at all? What is it good for?

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- Chess (1998)
- AlphaGo (2015)
- DeepStack (2017)
- AlphaStar (2019)
- •



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Game-theoretic algorithms can be applied in a range of problems:

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- auctions (e.g., to search keywords)
- voting (preference aggregation)





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Game Theory steps in:

- well-defined formalisms
- it is challenging from the optimization perspective
 - single-agent problem is one level optimization (maximum/minimum)
 - games are about seeking a saddle point (bilevel optimization)

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 - e.g., during the course you will have to formalize a complex sequential game with imperfect information
- define objective criteria to optimize
 - capture correctly desired utilities and verify (is this something you (your algorithm) really want to achieve?)
- new algorithms
 - many of them based on linear programming

Lecturers:



Branislav Bošanský



Tomáš Kroupa



Michal Jakob

Tutors:









Dominik Seitz Michal Šustr Tomáš Votroubek

Aditya Aradhye

Assessment (zápočet) from the labs: get at least 25 pts. (out of 50)

- 2 homework assignments
- 1 midterm test

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Study from the books!

- Shoham, Y. and Leyton-Brown, K.: Multiagent Systems: Algorithmic, Game-Theoretic, and Logical Foundations.
- Weiss, G. (eds): Multiagent Systems, second edition, MIT Press, 2013
- Russel, S. a Norvig, P.: Artificial Intelligence: A Modern Approach (2nd edition), Prentice Hall, 2003