Algorithmic Game Theory and Applications

Introduction to the Course

The Team



Aris Filos-Ratsikas course coordinator, lecturer

> Sreedurga Gogulapati lecturer





Charalampos Kokkalis tutor

Lectures and Tutorials

• Lectures:

Mondays 11.10 - 12.00, Weeks 1-10 Basement Theatre - Adam House

Thursdays 11.10 - 12.00, Weeks 1-10 Forrest Hill Drill Hall

• Tutorials:

Group 1 Fridays 14.10 - 15.00, Weeks 3-10 4.3. - Lister Learning and Teaching Centre

Group 2 Fridays 15.10 - 16.00, Weeks 3-10 4.3. - Lister Learning and Teaching Centre

"Are the tutorials important? Should I attend them really?"

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Yes! They are the best preparation for the assignments and the exam.

Past students have reported that actively engaging with the tutorials was a huge plus for their final performance/mark.

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It's always better to attend anyway!

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Still, the course is highly theoretical.

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 - You should have some mathematical maturity, concretely some background in linear algebra, discrete mathematics, and probability theory.
 - A background in algorithms and some exposure to computational complexity (NP-completeness, etc, approximation algorithms) is desirable but not required.

Assessment

- Written Exam (80%)
- Coursework (20%)
 - Coursework 1 (10%): Released: 31/01/2025
 Due: 27/02/2025
 - Coursework 2 (10%) Released: 04/03/2025
 Due: 28/03/2025
 - Submission via Gradescope (via Learn).

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- Still, these are some good references for algorithmic game theory.



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- Questions after the lectures are very much welcome!
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You are willing to spend up to a certain amount of money for this game, between $\pounds 0$ and $\pounds 100$. To figure out this amount, use the following link and generate a random number between 0 and 100.

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Rules of the auction: The highest bid wins, the payment is that bid.

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What are you going to report to your lecturer as your proposed temperature? Why?

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You were called to appear before the academic integrity officer, separately.
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- However, your classmate has been offered the same deal. If they provide evidence against you, then you will not be expelled, but you will have to repeat the whole year (all courses).









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"Algorithmic Game Theory is concerned with computational and algorithmic questions related to game theory. In particular, can we design efficient algorithms for finding good ways to play (for 'solving games') or prove that such algorithms are unlikely to exist? Can we use algorithmic measures (like approximation) to measure how good the outcome of a game is?".

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It is still very much an active area of research, and as relevant for applications as ever!





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3. For each player $i \in N$, there is a payoff (or utility) function $u_i : S \to \mathbb{R}$ which assigns a numerical value $u_i(s_1, s_2, ..., s_n)$ to player *i* for a given strategy profile $(s_1, s_2, ..., s_n)$.





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The support of a mixed strategy x_i is the set of all pure strategies that are played with strictly positive probability.

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$$s_{2} \xrightarrow{2/3} 5_{2}$$

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The expected utility of a player for a mixed strategy profile is $u_i[x_1, ..., x_n] = \mathbb{E}_{(s_1, ..., s_n) \sim (x_1, ..., x_n)}[u_i(s_1, ..., s_n)]$

Example 3: Cheating Partners



Assume that we have the mixed strategies (1/2,1/2), (1/2,1/2)

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