

FEP3301

# Computational Game Theory

## Lecture 1

P2/2023

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# Course objectives



- Upon completion you should be able to
  - Differentiate between GT models of multi-agent decision making
  - Formulate game theoretical models of problems
  - Solve decision making problems
  - Perform a critical evaluation of the literature

# Course format



- Contact hours
  - 9 lectures of 2 hours each
  - 2-4 student presentation sessions
  - Starting today
- Non-contact hours
  - 3 homework assignments
  - 1 take home exam

# Student presentations



- Goal
  - Peruse a research paper
    - Explain main results
    - Appropriateness of the model
    - Validity of the results
- List of papers
  - <https://people.kth.se/~gyuri/teaching/FEP3301/paperlist.shtml>
- Expression of interest via e-mail
  - Favorite topic
  - Ordered list of 3 papers you are interested in
    - pick from the list
    - or propose a paper you like (complexity welcome)
- Pairing process
  - FCFS – Greedy algorithm

# Needed to pass...



- Active participation
    - at the lectures and during the presentations
  - Homework and take home exam
    - To be handed in approx. every two weeks
      - Peer-reviewed
    - Worth 66 pts in total
  - Good presentation
    - Worth 10 pts
- 
- You need **55** points to pass (~72%)

8 ECTS

# Course schedule - Lectures



<https://people.kth.se/~gyuri/teaching/FEP3301/schedule.shtml>

# Course schedule

## Student presentations



Occasion	Date	Time	Location
1	Wed. 22 Nov 2023	13.15-15.00	Ivar Herlitz
2	Wed. 6 Dec 2023	13.15-15.00	Gustaf Dahlander
3?			



# Computational Game Theory

## Lecture 1

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# The door-opening game



# Other Examples

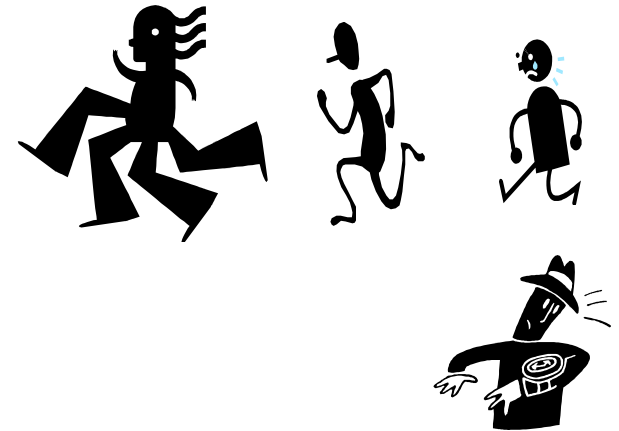


- Resource management
  - Allocation:
    - Communication/computing system (Internet) – bandwidth, computing power – fairness?
    - Radio spectrum: allocation of spectrum so as to maximize some notion of welfare
  - Placement: Storage and caching - peering between ASs in the Internet: establishment of links
  - Transportation/routing: Given a capacitated network and traffic demands, how to choose routes
  - Scheduling: loads in smart distribution grids
- Security
  - Wireless communication: Jamming
  - Intrusion detection:
    - Passive: Investment in mitigation/detection schemes
    - Active: How to perturb system state so that an attack can be detected at a low cost
- Economics
  - Online advertising: design mechanism for pricing ad locations and maximize click-through rate
  - Electricity markets

# What is a game?



- A set of players
- A set of actions
- Likes – preferences over outcomes
- Many assumptions
  - Around the players
    - Rationality
    - Strategic reasoning
    - Available information - uncertainty
  - Around the actions
    - Timing



# What is game theory about?

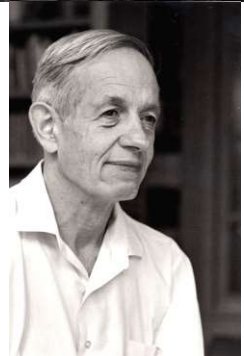


- Model decision making behavior of individuals
  - Outcome depends on the behavior of other individuals
  - Individuals seek their self interests
- Questions to be answered
  - What is the solution?
    - How many are there (existence)?
  - How to reach a solution (learning)?
    - What solution will emerge?
  - Computational complexity of finding a solution?
  - Efficiency of the solution?

# A Bit of History



- Origins
  - Decision theory
- Some notable works
  - A. Cournot "Recherches sur les principes mathématiques de la théorie des richesses", 1838
  - E. Borel "La théorie du jeu et les equations intégrales a noyau symétrique " 1921, (two player games)
  - J. von Neumann, "Zur Theorie der Gesellschaftsspiele", *Mathematische Annalen*, 100, pp. 295–300 (1928).
  - J. von Neumann, O. Morgenstern, "Theory of Games and Economic Behavior", 1944
    - Two person zero-sum games
  - J. Nash, "Non-cooperative Games", *The Annals of Mathematics*, Second Series, Vol. 54, No. 2, (Sep., 1951), pp. 286-295
- Nobel Prizes
  - 1995 - John Harsányi, John Nash, Reinhard Selten (Non-cooperative games)
  - 2005 - Robert Aumann, Thomas Schelling (Cooperative and NC games)
  - 2007 - Leonid Hurwicz, Eric Maskin, Roger Myerson (Mechanism design)
  - 2012 – Alvin E. Roth, Lloyd S. Shapley (Stable allocations and market design)
  - 2014 – Jean Tirole (Market power and regulation, Mech.design)



# Types of games



- Possibility of binding agreements
  - Non-cooperative vs. cooperative/coalitional
- Timing and type of feedback
  - Static - Strategic
  - Dynamic - Extensive, repeated, stochastic, differential, evolutionary, ...
- Information available for decision making
  - Perfect vs. imperfect vs. incomplete information
- Cardinality of the set of actions and players
  - Finite vs. infinite
  - Discrete vs. continuous



# Strategic games

# Strategic games



- Players
- Players know each others' possible decisions
  - And the effects of those decisions on themselves
- Players prefer some outcomes over others
  - Goal: obtain best outcome  
maximize own utility
- Each player makes a decision
  - Once
  - Simultaneously



# Formal definition

- A strategic game  $\langle N, (A_i), (\succsim_i) \rangle$  consists of
  - The set of players
    - A finite set  $N$
  - The set of actions available to player  $i$ 
    - For each player a non-empty set  $A_i$
  - The preference relation of player  $i$ 
    - $\forall i \in N$  a preference relation  $\succsim_i$  on  $A = \prod_{j \in N} A_j$

Preference relation: complete, reflexive, transitive binary relation

?



# Actions, consequences, payoff



- Consequences often more important than the actions
- Extend the definition with consequences
  - Define function  $A \rightarrow C$
  - Preference relation over  $C$
- The consequence can be non-deterministic
  - Probability space  $\Omega$
  - $A$  and  $\Omega$  induce a lottery on  $C$ 
    - $A \times \Omega \rightarrow C$
  - Preference relation interpreted over the lottery
- Introduce payoff function
  - $u_i: A \rightarrow \mathcal{R}$ , such that  $u_i(a) \geq u_i(b) \Leftrightarrow a \succsim_i b$

*Example: wireless uplink power allocation*

# Games in Normal Form

- Representation of a game  $G = \langle N, (A_i), (u_i) \rangle$ 
  - $N = \{1, 2\}$
  - $A_1 = \{a_{11}, a_{12}, a_{13}\}, A_2 = \{a_{21}, a_{22}\}$
  - $u_1(\cdot, \cdot), u_2(\cdot, \cdot)$



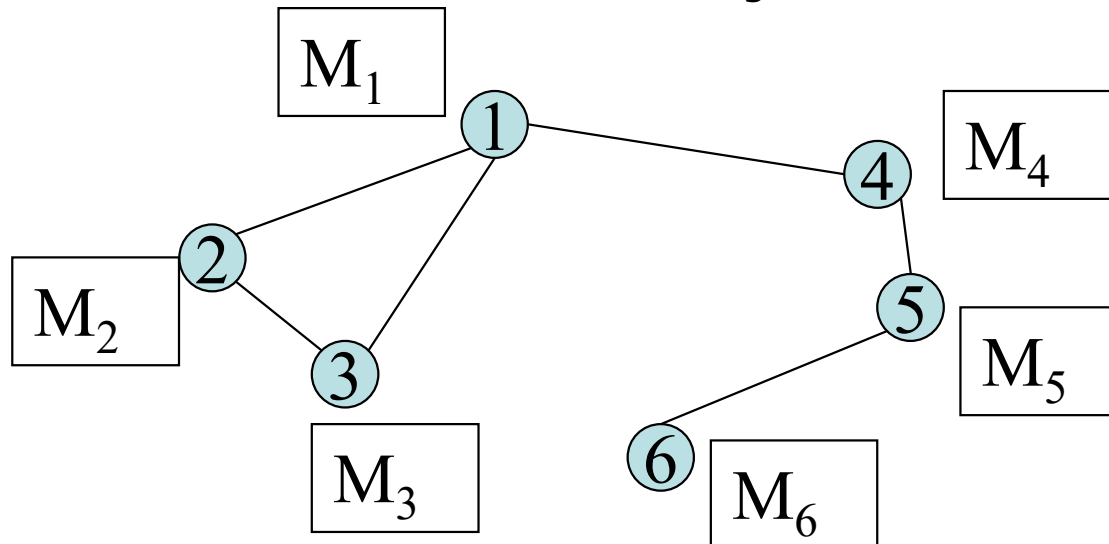
		Player 2's actions	
		$a_{21}$	$a_{22}$
Player 1's actions	$a_{11}$	$u_1(a_{11}, a_{21}), u_2(a_{11}, a_{21})$	$u_1(a_{11}, a_{22}), u_2(a_{11}, a_{22})$
	$a_{12}$	$u_1(a_{12}, a_{21}), u_2(a_{12}, a_{21})$	$u_1(a_{12}, a_{22}), u_2(a_{11}, a_{22})$
	$a_{13}$	$u_1(a_{13}, a_{21}), u_2(a_{13}, a_{21})$	$u_1(a_{13}, a_{22}), u_2(a_{11}, a_{22})$

- Requires  $O(|N|(\max |A_i|)^{|N|})$  entries

# Graphical games



- Not all players influence each others' payoff directly
- Represent players as vertices of a graph  $G$
- Payoffs in local game matrices (normal form)
  - contains only actions of neighboring players
- Requires  $O(|N|(\max|A_i|)^d)$  entries
  - $d$  is the maximum local neighborhood



# An example

- Prisoner's dilemma



	Do not confess	Confess
Do not confess	3,3	0,4
Confess	4,0	1,1

$$\text{Payoff} = 4 - (\text{\#years in prison})$$

- What should they do?

# Another example

- Stag hunt game by R.J. Aumann



	L	R
U	9,9	0,8
D	8,0	7,7

- What should they do?

Aumann, R.J. (1990), "Nash Equilibria are not Self-Enforcing," in J-J Gabsewicz, J-F Richard, and L. Wolsey (eds), *Economic Decision-Making: Games, Econometrics, and Optimisation*, Amsterdam: North-Holland, 201-206.

# Strong Pareto Efficiency



- For someone to win others have to lose
- An action  $a^*$  is strongly Pareto efficient if there is no action  $a$  for which
  - $a \succsim_i a^*$  for  $\forall i \in N$  and
  - $a \succ_i a^*$  for some  $i \in N$
- Can we reach such a solution in a game?

# Example revisited

- Prisoner's dilemma



	Do not confess	Confess
Do not confess	3,3	0,4
Confess	4,0	1,1

- Which outcomes are Pareto efficient?
- Would players choose those?

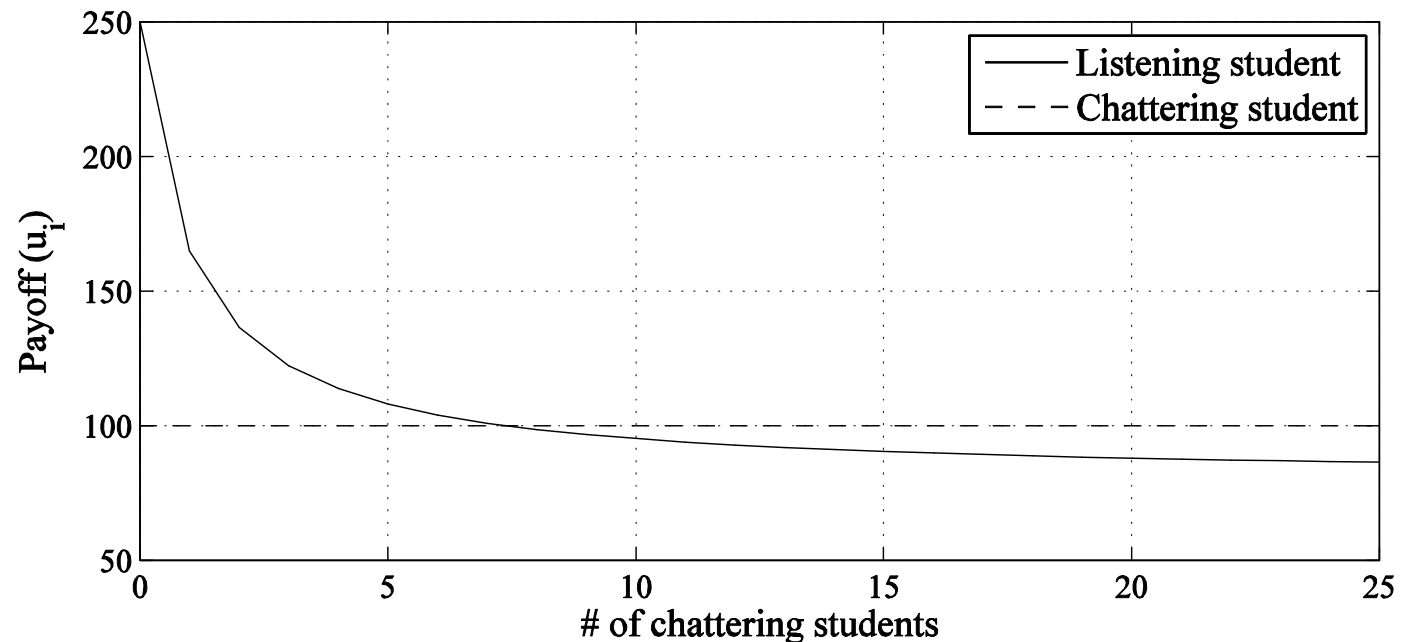


# An experiment



- Class of  $N$  students (you 😊 )
- Student  $i$  has two options during class
  - Chatter
    - $u_i=100$
  - Pay attention
    - $u_i=250-170 \times N_C / (N-1)$
    - $N_C = \#$  of chattering students
- Would you chatter or rather pay attention?

# The payoff of the experiment



2-person version

	Red (chatter)	Blue (listen)
Red (chatter)	100, 100	100, 80
Blue (listen)	80, 100	250, 250

# Solution concepts of games



- What is a reasonable solution for a game?
- Variety of solution concepts
  - Equilibria
    - Dominant strategy equilibrium
    - Nash equilibrium and its refinements
  - Iterated elimination of strictly dominated strategies
  - Rationalization
- Questions regarding the solutions
  - Existence
  - Uniqueness - cardinality
  - Complexity of the calculation
  - Feasibility/convergence/emergence
  - Efficiency

# Dominant Strategy

- $a_i^*$  is dominant strategy for player  $i$  in  $G = \langle N, (A_i), (\succsim_i) \rangle$   
 $(a_i^*, a_{-i}) \succsim_i (a_i, a_{-i}) \quad \forall a \in A$



	Do not confess	Confess
Do not confess	3,3	0,4
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# Dominant Strategy Equilibrium

- $a_i^*$  is dominant strategy for player  $i$  in  $G = \langle N, (A_i), (\succsim_i) \rangle$   
 $(a_i^*, a_{-i}) \succsim_i (a_i, a_{-i}) \quad \forall a \in A$



	Do not confess	Confess
Do not confess	3,3	0,4
Confess	4,0	1,1

- The profile  $a^* \in A$  is a dominant strategy equilibrium if  
 $(a_i^*, a_{-i}) \succsim_i (a_i, a_{-i}) \quad \forall a \in A, i \in N$ 
  - Best response to every collection of actions of the other players

	L	R
U	9,9	0,8
D	8,0	7,7

# Nash equilibrium

- A profile from which no player has an interest to deviate



	Do not confess	Confess
Do not confess	3,3	0,4
Confess	4,0	1,1

- If players reach a Nash equilibrium, they will stay there

# Nash equilibrium (pure)

- Nash equilibrium of a strategic game  $\langle N, (A_i), (\succsim_i) \rangle$  is a profile  $a^* \in A$  of actions such that

$$(a^*_{-i}, a^*_i) \succsim_i (a^*_{-i}, a_i) \text{ for } \forall a_i \in A_i$$

- No player can gain by deviating from  $a^*_i$  given that the others choose  $a^*_{-i}$



# Best response function



- Set valued function
  - $B_i(a_{-i}) = \{a_i \in A_i : (a_{-i}, a_i) \succsim_i (a_{-i}, a'_i) \text{ for } \forall a'_i \in A_i\}$
- Nash equilibrium is a profile  $a^*$  such that
  - $a_i^* \in B_i(a_{-i}^*)$  for all  $i \in N$



# Example revisited

- Stag hunt game by R.J. Aumann

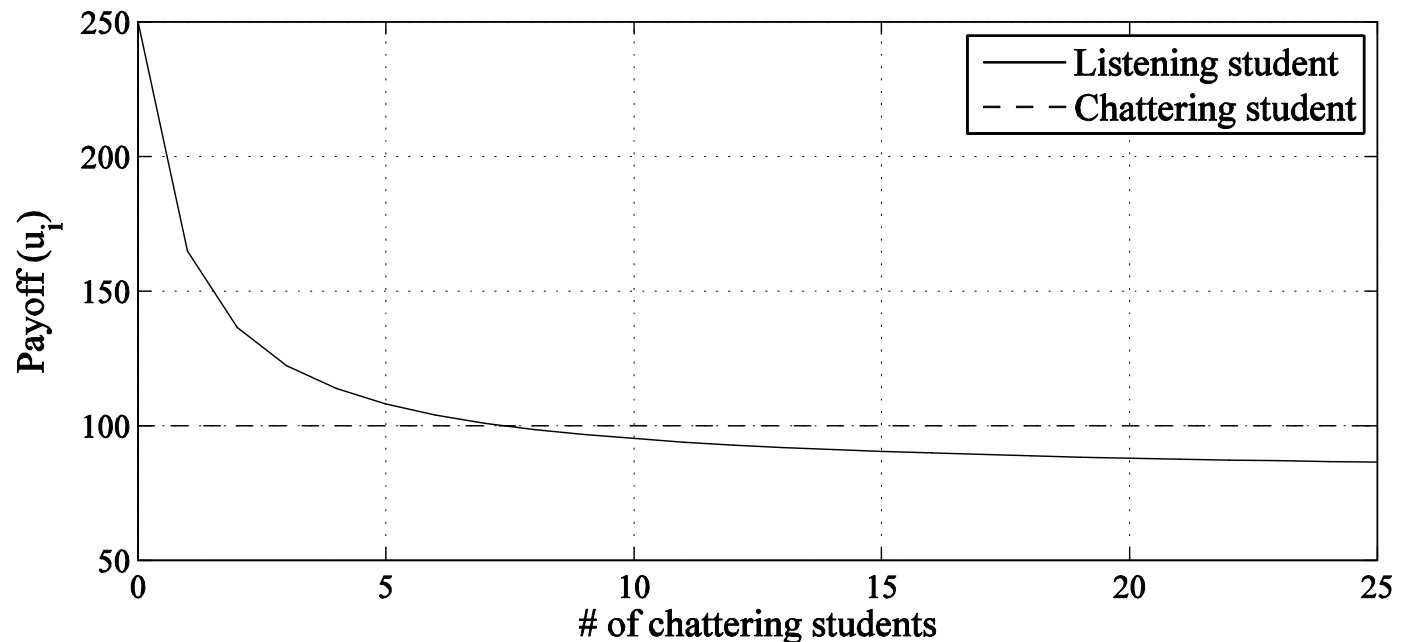


	L	R
U	9,9	0,8
D	8,0	7,7

- How many NE are there?
- Which NE is more likely to happen?
  - What if the players can communicate?

Aumann, R.J. (1990), “Nash Equilibria are not Self-Enforcing,” in J-J Gabsewicz, J-F Richard, and L. Wolsey (eds), *Economic Decision-Making: Games, Econometrics, and Optimisation*, Amsterdam: North-Holland, 201-206.

# Experiment revisited



2-person version

	Red (chatter)	Blue (listen)
Red (chatter)	100, 100	100, 80
Blue (listen)	80, 100	250, 250

N. J. Vriend, "Demonstrating the Possibility of Pareto Inferior Nash Equilibria", in Journal of Economic Education 31(4), pp. 358-362, 2000

# Example

- Battle of the Sexes (Bach or Stravinsky)



	Sports	Theatre
Sports	3,2	0,0
Theatre	0,0	2,3

- How many NE are there?

# Another example

- Hawk and Dove (aka, Game of chicken)



	Dove	Hawk
Dove	3,3	1,4
Hawk	4,1	0,0

- How many NE are there?

# Yet another example?

- Matching pennies



	Head	Tail
Head	1,-1	-1,1
Tail	-1,1	1,-1

- How many NE are there?

# Existence of Nash equilibria



- The strategic game  $\langle N, (A_i), (\succsim_i) \rangle$  has a Nash equilibrium if for all  $i \in N$ 
  - the set  $A_i$  of actions of player  $i$  is a nonempty compact convex subset of a Euclidean space

and the preference relation  $\succsim_i$  is

- continuous
  - convex on  $A_i$ .
- Proof
    - based on Kakutani's fixed point theorem  
(Debreu '52, Glicksberg '52, Fan '52)

# Notes on the existence results



- The equilibrium is not necessarily unique
  - Which equilibrium is an appropriate solution?
- The existence is not guaranteed for finite games!
  - For none of the examples considered before...
- Best response functions can be used to find equilibria
  - Not very efficient

# Summary



- Brief overview of game theoretic models
- Strategic games
  - Formal definition
  - Existence of Nash equilibria
- Next time
  - Strictly competitive games
    - Maxminimization vs. Nash equilibria
  - Mixed strategy equilibria
  - Rationalizability
  - IEDS, IEWS



# Literature



- M. Osborne, A. Rubinstein, "A Course in Game Theory", MIT press, 1994
- D. Fudenberg, J. Tirole, "Game Theory", MIT press, 1991
- Nisan, Roughgarden, Tardos, Vazirani (eds.), "Algorithmic Game Theory", Cambridge UP, 2007
- Kakutani, "A generalization of Brouwer's fixed point theorem". Duke Mathematical Journal 8 (3) pp. 457–459, 1941