

# Graduate AI

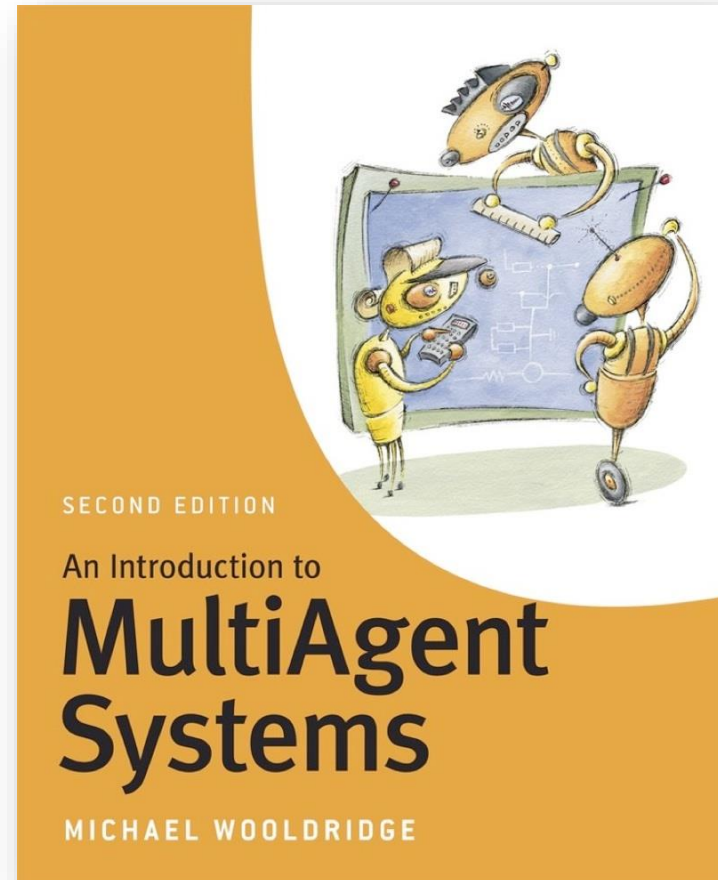
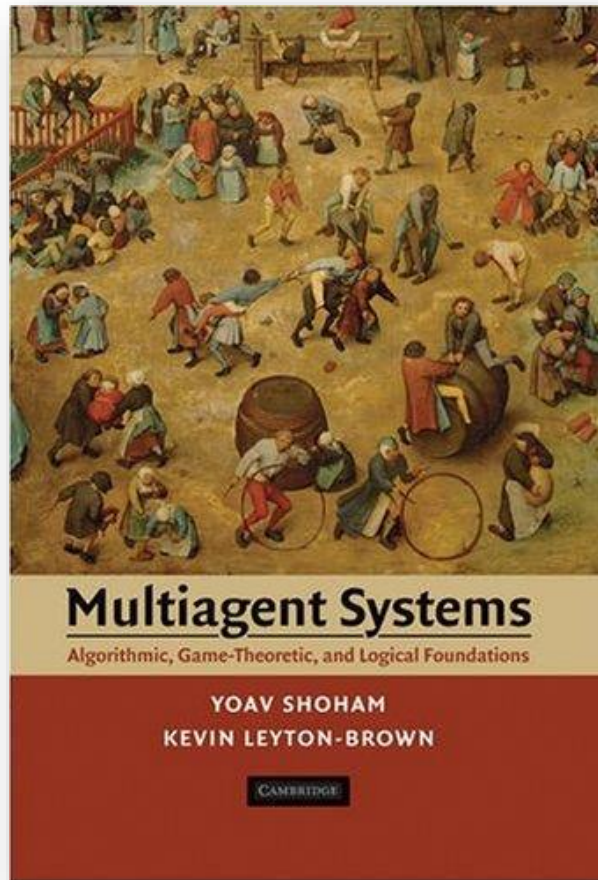
## Lecture 18: Game Theory I

Teachers:

Zico Kolter

Ariel Procaccia (this time)

# MULTIAGENT SYSTEMS



# MULTIAGENT SYSTEMS

## Chapters of the Shoham and Leyton-Brown book:

1. Distributed constraint satisfaction
2. Distributed optimization
3. Games in normal form
4. Computing solution concepts of normal-form games
5. Games with sequential actions
6. Beyond the normal and extensive forms
7. Learning and teaching
8. Communication
9. Social choice
10. Mechanism design
11. Auctions
12. Coalitional game theory
13. Logics of knowledge and belief
14. Probability, dynamics, and intention

### Legend:

- “Game theory”
- Not “game theory”

# MULTIAGENT SYSTEMS

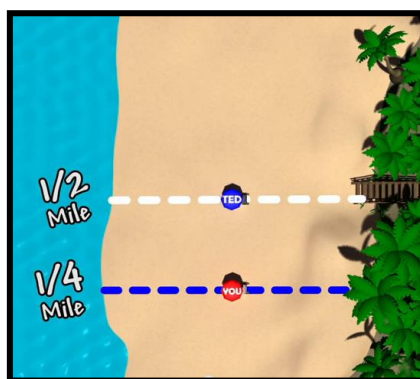
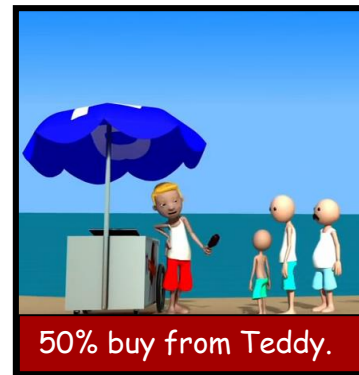
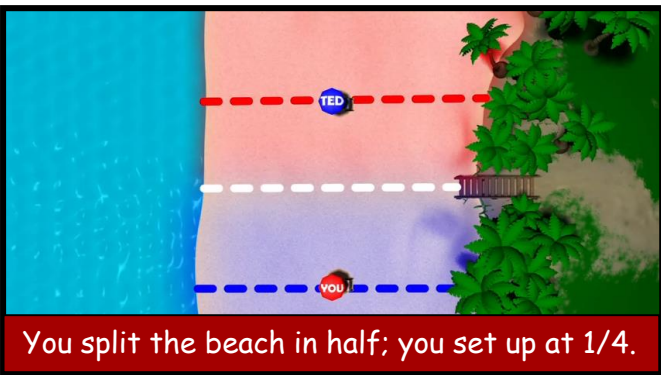
## Mike Wooldridge's 2016 publications:

- 2016
- ➔ [j126] [i] [d] [c] [e] Shaheen Fatima, Michael Wooldridge:  
**Majority bargaining for resource division.** *Autonomous Agents and Multi-Agent Systems* 30(2): 331-363 (2016)
  - ➔ [j125] [i] [d] [c] [e] Shaheen Fatima, Tomasz P. Michalak, Michael Wooldridge:  
**Power and welfare in bargaining for coalition structure formation.** *Autonomous Agents and Multi-Agent Systems* 30(5): 899-930 (2016)
  - [j124] [i] [d] [c] [e] Tomasz P. Michalak, Talal Rahwan, Edith Elkind, Michael Wooldridge, Nicholas R. Jennings:  
**A hybrid exact algorithm for complete set partitioning.** *Artif. Intell.* 230: 14-50 (2016)
  - ➔ [j123] [i] [d] [c] [e] Paul Harrenstein, Paolo Turrini, Michael Wooldridge:  
**Hard and Soft Preparation Sets in Boolean Games.** *Studia Logica* 104(4): 813-847 (2016)
  - ➔ [j122] [i] [d] [c] [e] Julian C. Bradfield, Julian Gutierrez, Michael Wooldridge:  
**Partial-order Boolean games: informational independence in a logic-based model of strategic interaction.** *Synthese* 193(3): 781-811 (2016)
  - [c208] [i] [d] [c] [e] Mateusz Krzysztof Tarkowski, Piotr L. Szczepanski, Talal Rahwan, Tomasz P. Michalak, Michael Wooldridge:  
**Closeness Centrality for Networks with Overlapping Community Structure.** *AAAI 2016*: 622-629
  - ➔ [c207] [i] [d] [c] [e] Michael Wooldridge, Julian Gutierrez, Paul Harrenstein, Enrico Marchioni, Giuseppe Perelli, Alexis Toumi:  
**Rational Verification: From Model Checking to Equilibrium Checking.** *AAAI 2016*: 4184-4191
  - ➔ [c206] [i] [d] [c] [e] Oskar Skibski, Szymon Matejczyk, Tomasz P. Michalak, Michael Wooldridge, Makoto Yokoo:  
**k-Coalitional Cooperative Games.** *AAMAS 2016*: 177-185
  - ➔ [c205] [i] [d] [c] [e] Julian Gutierrez, Paul Harrenstein, Giuseppe Perelli, Michael Wooldridge:  
**Expressiveness and Nash Equilibrium in Iterated Boolean Games.** *AAMAS 2016*: 707-715
  - ➔ [c204] [i] [d] [c] [e] Piotr L. Szczepanski, Tomasz P. Michalak, Talal Rahwan, Michael Wooldridge:  
**An Extension of the Owen-Value Interaction Index and Its Application to Inter-Links Prediction.** *ECAI 2016*: 90-98
  - ➔ [c203] [i] [d] [c] [e] Oskar Skibski, Henryk Michalewski, Andrzej Nagórko, Tomasz P. Michalak, Andrew James Dowell, Talal Rahwan, Michael Wooldridge:  
**Non-Utilitarian Coalition Structure Generation.** *ECAI 2016*: 1738-1739
  - ➔ [c202] [i] [d] [c] [e] Michael Wooldridge:  
**From model checking to equilibrium checking.** *GI-Jahrestagung 2016*: 35
  - ➔ [c201] [i] [d] [c] [e] Haris Aziz, Paul Harrenstein, Jérôme Lang, Michael Wooldridge:  
**Boolean Hedonic Games.** *KR 2016*: 166-175
  - ➔ [c200] [i] [d] [c] [e] Julian Gutierrez, Giuseppe Perelli, Michael Wooldridge:  
**Imperfect Information in Reactive Modules Games.** *KR 2016*: 390-400
  - [i11] [i] [d] [c] [e] Marcin Waniek, Tomasz P. Michalak, Talal Rahwan, Michael Wooldridge:  
**Hiding Individuals and Communities in a Social Network.** *CoRR abs/1608.00375* (2016)

# NORMAL-FORM GAME

- A **game in normal form** consists of:
  - Set of players  $N = \{1, \dots, n\}$
  - Strategy set  $S$
  - For each  $i \in N$ , utility function  $u_i: S^n \rightarrow \mathbb{R}$ : if each  $j \in N$  plays the strategy  $s_j \in S$ , the utility of player  $i$  is  $u_i(s_1, \dots, s_n)$
- Next example created by taking screenshots of  
[http://youtu.be/jILgxeNBK\\_8](http://youtu.be/jILgxeNBK_8)





# THE ICE CREAM WARS

- $N = \{1,2\}$
- $S = [0,1]$
- $u_i(s_i, s_j) = \begin{cases} \frac{s_i + s_j}{2}, & s_i < s_j \\ 1 - \frac{s_i + s_j}{2}, & s_i > s_j \\ \frac{1}{2}, & s_i = s_j \end{cases}$
- To be continued...



# THE PRISONER'S DILEMMA

- Two men are charged with a crime
- They are told that:
  - If one rats out and the other does not, the rat will be freed, other jailed for nine years
  - If both rat out, both will be jailed for six years
- They also know that if neither rats out, both will be jailed for one year





# THE PRISONER'S DILEMMA

	Cooperate	Defect
Cooperate	-1,-1	-9,0
Defect	0,-9	-6,-6

What would you do?

# UNDERSTANDING THE DILEMMA

- Defection is a **dominant** strategy
- But the players can do much better by cooperating
- Related to the **tragedy of the commons**



# IN REAL LIFE

- Presidential elections
  - Cooperate = positive ads
  - Defect = negative ads
- Nuclear arms race
  - Cooperate = destroy arsenal
  - Defect = build arsenal
- Climate change
  - Cooperate = curb CO<sub>2</sub> emissions
  - Defect = do not curb



# ON TV



<http://youtu.be/S0qjK3TWZE8>

# THE PROFESSOR'S DILEMMA

		Class	
		Listen	Sleep
Professor	Make effort	$10^6, 10^6$	$-10, 0$
	Slack off	$0, -10$	$0, 0$

Dominant strategies?

# NASH EQUILIBRIUM

- Each player's strategy is a **best response** to strategies of others
- Formally, a **Nash equilibrium** is a vector of strategies  $s = (s_1 \dots, s_n) \in S^n$  such that

$$\forall i \in N, \forall s'_i \in S, u_i(s) \geq u_i(s'_i, s_{-i})$$



# NASH EQUILIBRIUM

- **Poll 1:** How many Nash equilibria does the Professor's Dilemma have?

1. 0
2. 1
3. 2
4. 3

	Listen	Sleep
Make effort	$10^6, 10^6$	$-10, 0$
Slack off	$0, -10$	$0, 0$

# NASH EQUILIBRIUM



<http://youtu.be/CemLiSI5ox8>



# RUSSEL CROWE WAS WRONG

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## Turing's Invisible Hand


Computation, Economics, and Game Theory

« STOC Submissions: message from the PC Chair

### Russell Crowe was wrong

October 30, 2012 by Ariel Procaccia | Edit

Yesterday I taught the first of five algorithmic economics lectures in my [undergraduate AI course](#). This lecture just introduced the basic concepts of game theory, focusing on Nash equilibria. I was contemplating various ways making the lecture more lively, and it occurred to me that I could stand on the shoulders of giants. Indeed, didn't Russell Crowe already explain Nash's ideas in [A Beautiful Mind](#), complete with a 1940's-style male chauvinistic example?




The first and last time I watched the movie was when it was released in 2001. Back then I was an undergrad freshman, working for 20+ hours a week on the programming exercises of Hebrew U's Intro to CS course, which was taught by some guy called Noam Nisan. I didn't know anything about game theory, and Crowe's explanation made a lot of sense at the time.


I easily found the relevant [scene on youtube](#). In the scene, Nash's friends are trying to figure out how to seduce a beautiful blonde and her less beautiful friends. Then Nash/Crowe has an epiphany. The hubbub of the seedy Princeton bar is drowned by inspirational music, as Nash announces:

January 2012  
December 2011  
November 2011  
October 2011  
September 2011  
August 2011  
July 2011  
June 2011

HEY, DR. NASH, I THINK THOSE GALS OVERTHERE ARE EYEING US. THIS IS LIKE YOUR NASH EQUILIBRIUM, RIGHT? ONE OF THEM IS HOT, BUT WE SHOULD EACH FLIRT WITH ONE OF HER LESS-DESIRABLE FRIENDS. OTHERWISE WE RISK COMING ON TOO STRONG TO THE HOT ONE AND JUST DRIVING THE GROUP OFF.



WELL, THAT'S NOT REALLY THE SORT OF SITUATION I WROTE ABOUT. ONCE WE'RE WITH THE UGLY ONES, THERE'S NO INCENTIVE FOR ONE OF US NOT TO TRY TO SWITCH TO THE HOT ONE. IT'S NOT A STABLE EQUILIBRIUM.

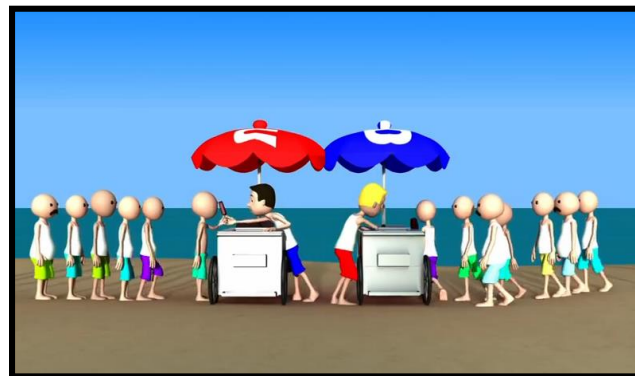
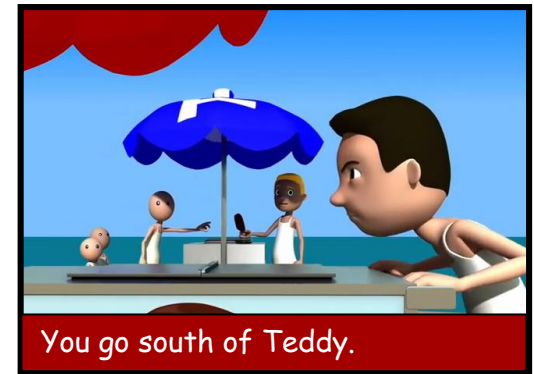
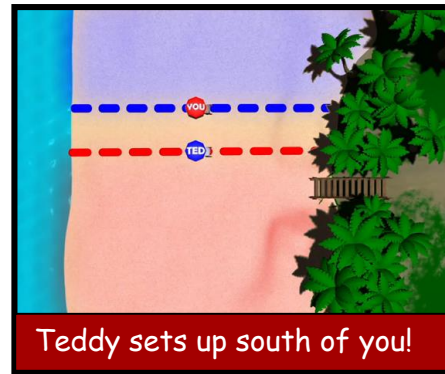
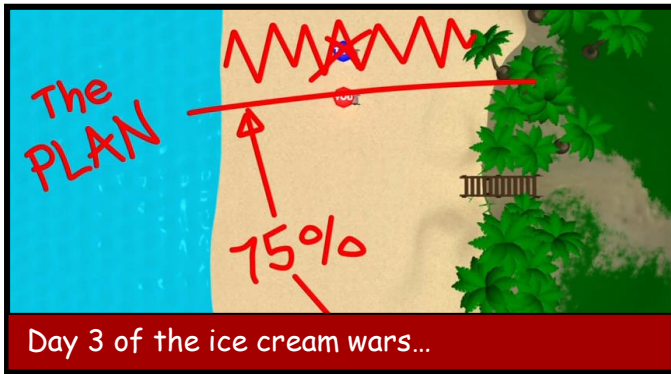


CRAP, FORGET IT. LOOKS LIKE ALL THREE ARE LEAVING WITH ONE GUY.

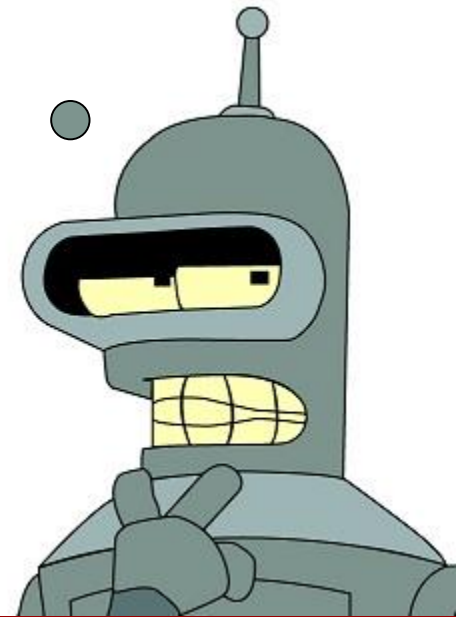
DAMMIT, FEYNMAN!



# END OF THE ICE CREAM WARS



This is why  
competitors open  
their stores next  
to one another!



# ROCK-PAPER-SCISSORS

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

Nash equilibrium?

# MIXED STRATEGIES

- A **mixed strategy** is a probability distribution over (pure) strategies
- The mixed strategy of player  $i \in N$  is  $x_i$ , where

$$x_i(s_i) = \Pr[i \text{ plays } s_i]$$

- The utility of player  $i \in N$  is

$$u_i(x_1, \dots, x_n) = \sum_{(s_1, \dots, s_n) \in S^n} u_i(s_1, \dots, s_n) \cdot \prod_{j=1}^n x_j(s_j)$$



# EXERCISE: MIXED NE

- **Exercise:** player 1 plays  $\left(\frac{1}{2}, \frac{1}{2}, 0\right)$ , player 2 plays  $\left(0, \frac{1}{2}, \frac{1}{2}\right)$ . What is  $u_1$ ?
- **Exercise:** Both players play  $\left(\frac{1}{3}, \frac{1}{3}, \frac{1}{3}\right)$ . What is  $u_1$ ?

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

# EXERCISE: MIXED NE

- Poll 2: Which is a NE?

1.  $\left( \left( \frac{1}{2}, \frac{1}{2}, 0 \right), \left( \frac{1}{2}, \frac{1}{2}, 0 \right) \right)$

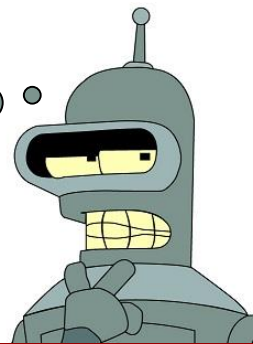
2.  $\left( \left( \frac{1}{2}, \frac{1}{2}, 0 \right), \left( \frac{1}{2}, 0, \frac{1}{2} \right) \right)$

3.  $\left( \left( \frac{1}{3}, \frac{1}{3}, \frac{1}{3} \right), \left( \frac{1}{3}, \frac{1}{3}, \frac{1}{3} \right) \right)$

4.  $\left( \left( \frac{1}{3}, \frac{2}{3}, 0 \right), \left( \frac{2}{3}, 0, \frac{1}{3} \right) \right)$

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

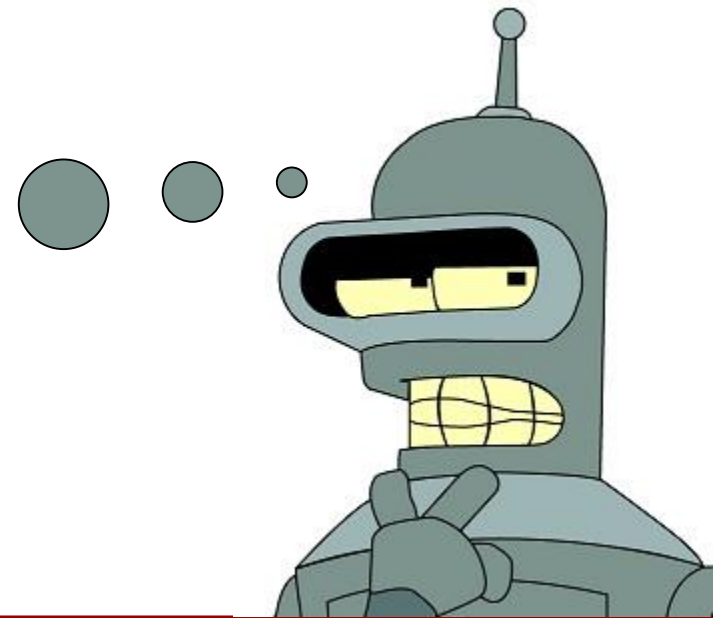
Any other  
NE?



# NASH'S THEOREM

- **Theorem [Nash, 1950]:** In any (finite) game there exists at least one (possibly mixed) Nash equilibrium

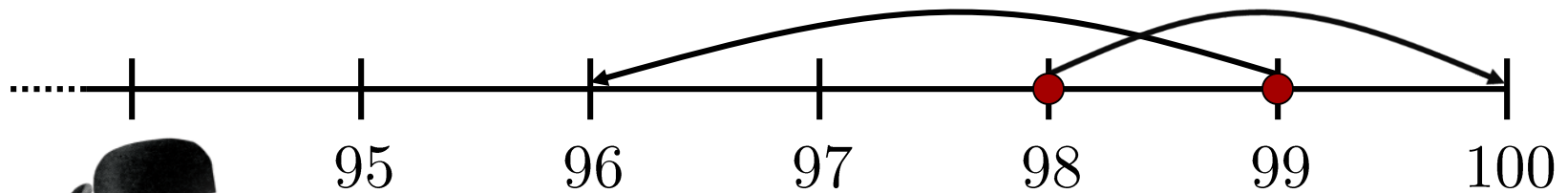
What about computing a Nash equilibrium?





# DOES NE MAKE SENSE?

- Two players, strategies are  $\{2, \dots, 100\}$
- If both choose the same number, that is what they get
- If one chooses  $s$ , the other  $t$ , and  $s < t$ , the former player gets  $s + 2$ , and the latter gets  $s - 2$
- **Poll 3:** What would you choose?



# SUMMARY

- Terminology:
  - Normal-form game
  - Nash equilibrium
  - Mixed strategies
- Nobel-prize-winning ideas:
  - Nash equilibrium 😊

