



# CMU 15-251

## GAME THEORY

TEACHERS:

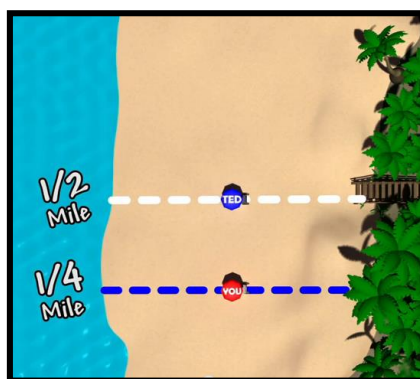
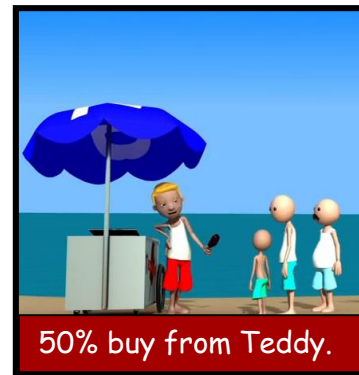
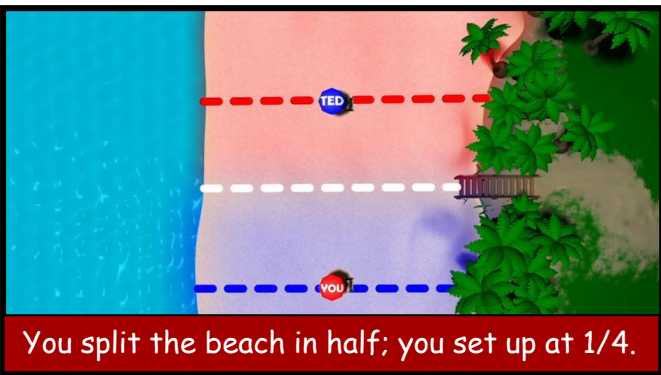
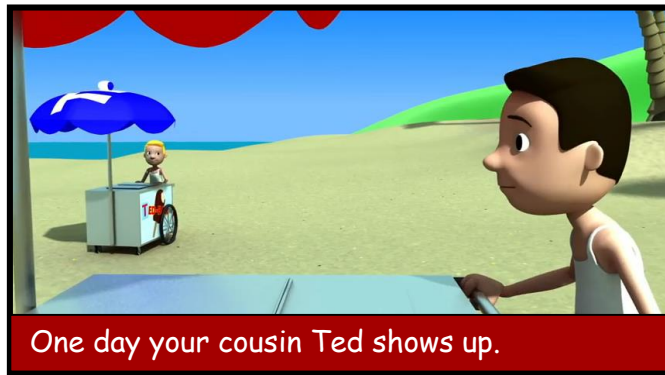
ANIL ADA

ARIEL PROCACCIA (THIS TIME)

# 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?

# 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  $\mathbf{s} = (s_1, \dots, s_n) \in S^n$  such that

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

where  $\mathbf{s}_{-i} = (s_1, \dots, s_{i-1}, s_{i+1}, \dots, s_n)$



# 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.

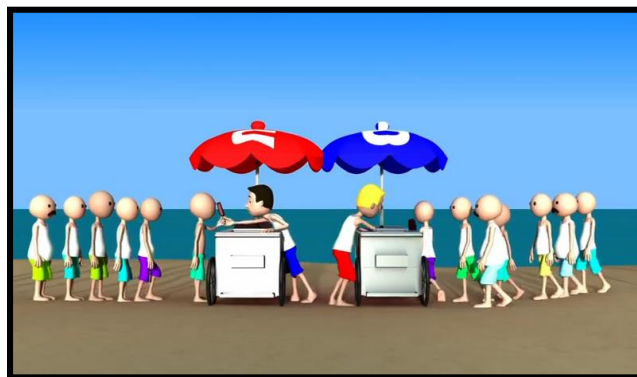
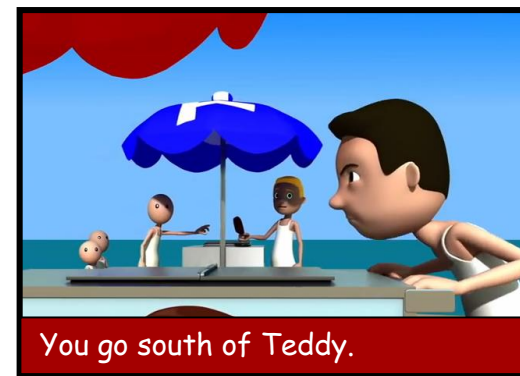
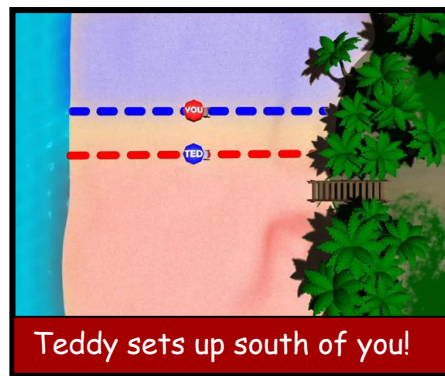
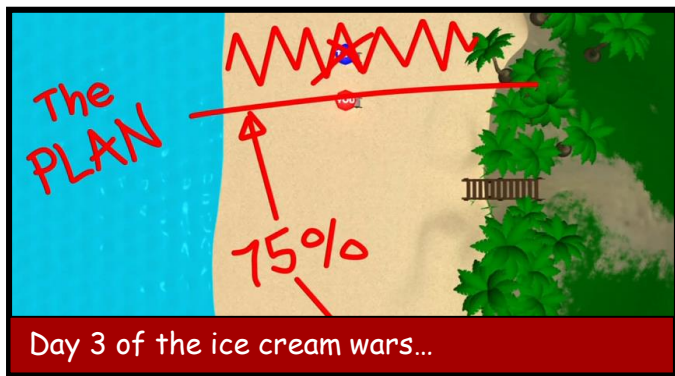


CRAP, FORGET IT. LOOKS LIKE ALL THREE ARE LEAVING WITH ONE GUY.

DAMMIT, FEYNMAN!



# END OF THE ICE CREAM WARS

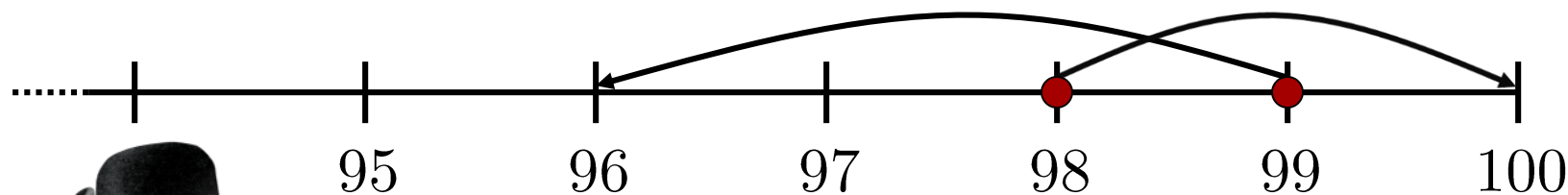


This is why  
competitors open  
their stores next  
to one another!



# 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 2: what would you choose?





# BACK TO PRISON

- The only Nash equilibrium in Prisoner's dilemma is bad; but how bad is it?
- **Objective function:** social cost = sum of costs
- NE is six times worse than the optimum

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



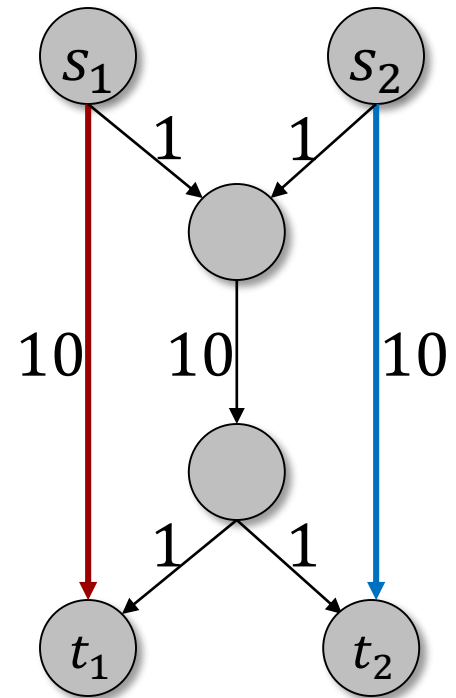
# ANARCHY AND STABILITY

- Fix a class of games, an objective function, and an equilibrium concept
- The **price of anarchy (stability)** is the **worst-case ratio** between the **worst (best)** objective function value of an equilibrium of the game, and that of the optimal solution
- In this lecture:
  - Objective function = social cost
  - Equilibrium concept = Nash equilibrium



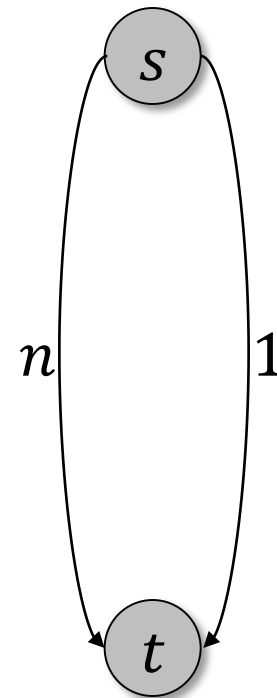
# EXAMPLE: COST SHARING

- $n$  players in weighted directed graph  $G$
- Player  $i$  wants to get from  $s_i$  to  $t_i$ ; strategy space is  $s_i \rightarrow t_i$  paths
- Each edge  $e$  has cost  $c_e$
- Cost of edge is split between all players using edge
- Cost of player is sum of costs over edges on path



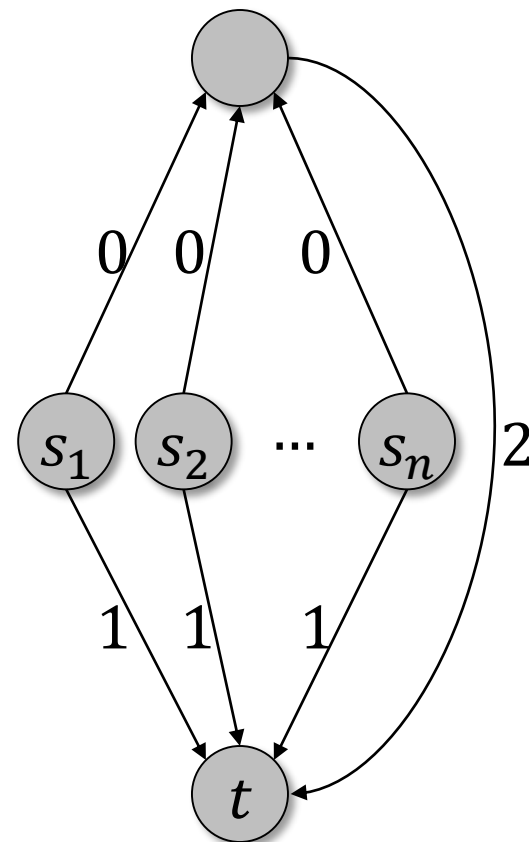
# EXAMPLE: COST SHARING

- With  $n$  players, the example on the right has an NE with social cost  $n$
- Optimal social cost is 1
- $\Rightarrow$  Price of anarchy  $\geq n$
- Price of anarchy is also  $\leq n$ 
  - Each player can always deviate to his strategy at the optimal solution, and pay for it alone; the cost is at most OPT
  - At equilibrium, no player wants to deviate, so each player pays at most OPT



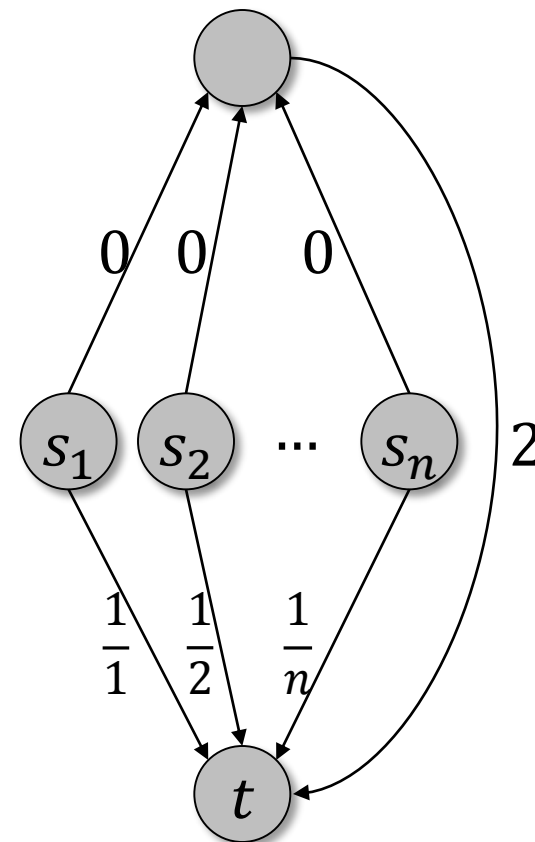
# EXAMPLE: COST SHARING

- Think of the 1 edges as cars, and the 2 edge as mass transit
- Bad Nash equilibrium with cost  $n$
- Good Nash equilibrium with cost 2
- Now let's modify the example...



# EXAMPLE: COST SHARING

- $OPT = 2$
- **Poll 3:** What is the social cost at Nash equilibrium?
- $\Rightarrow$  price of stability is at least this cost
- We will show a matching upper bound on the price of stability



# POTENTIAL GAMES

- A game is an **exact potential game** if there exists a function  $\Phi: \prod_{i=1}^n S_i \rightarrow \mathbb{R}$  such that for all  $i \in N$ , for all  $\mathbf{s} \in \prod_{i=1}^n S_i$ , and for all  $s'_i \in S_i$ ,  
$$\text{cost}_i(s'_i, \mathbf{s}_{-i}) - \text{cost}_i(\mathbf{s}) = \Phi(s'_i, \mathbf{s}_{-i}) - \Phi(\mathbf{s})$$
- Existence of an exact potential function implies the existence of a Nash equilibrium (why?)



# POTENTIAL GAMES \*

- **Theorem:** the cost sharing game is an exact potential game
- **Proof:**
  - Let  $n_e(\mathbf{s})$  be the number of players using  $e$  under  $\mathbf{s}$
  - Define the potential function
$$\Phi(\mathbf{s}) = \sum_e \sum_{k=1}^{n_e(\mathbf{s})} \frac{c_e}{k}$$
  - If player changes paths, pays  $\frac{c_e}{n_e(\mathbf{s})+1}$  for each new edge, gets  $\frac{c_e}{n_e(\mathbf{s})}$  for each old edge, so  $\Delta \text{cost}_i = \Delta \Phi$  ■



# POTENTIAL GAMES \*

- **Theorem:** The cost of stability of cost sharing games is  $O(\log n)$
- **Proof:**
  - It holds that
$$\text{cost}(\mathbf{s}) \leq \Phi(\mathbf{s}) \leq H(n) \cdot \text{cost}(\mathbf{s})$$
  - Take a strategy profile  $\mathbf{s}^*$  that minimizes  $\Phi$
  - $\mathbf{s}^*$  is an NE
  - $\text{cost}(\mathbf{s}^*) \leq \Phi(\mathbf{s}^*) \leq \Phi(\text{OPT}) \leq H(n) \cdot \text{cost}(\text{OPT})$  ■

# COST SHARING SUMMARY

- In every cost sharing game
  - $\forall \text{NE } \mathbf{s}, \text{cost}(\mathbf{s}) \leq n \cdot \text{cost}(\text{OPT})$
  - $\exists \text{NE } \mathbf{s}$  such that  $\text{cost}(\mathbf{s}) \leq H(n) \cdot \text{cost}(\text{OPT})$
- There exist cost sharing games s.t.
  - $\exists \text{NE } \mathbf{s}$  such that  $\text{cost}(\mathbf{s}) \geq n \cdot \text{cost}(\text{OPT})$
  - $\forall \text{NE } \mathbf{s}, \text{cost}(\mathbf{s}) \geq H(n) \cdot \text{cost}(\text{OPT})$

# WHAT WE HAVE LEARNED

- Terminology:
  - Normal-form game
  - Nash equilibrium
  - Price of anarchy/stability
  - Cost sharing games
  - Potential games
- Nobel-prize-winning ideas:
  - Nash equilibrium 😊

