CS698W: Topics in Game Theory and Collective Choice

Teacher: Swaprava Nath

Introduction

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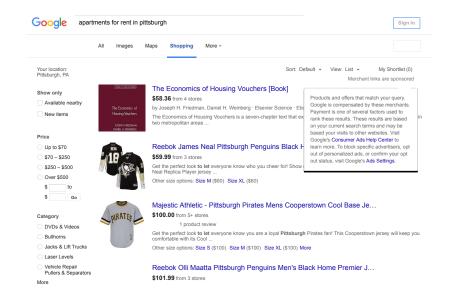
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Social Network Advertisements



Advertisement Revenues

- Google's revenue from the AdWords: US\$ 67.39bn (2015)
- Facebook's revenue from advertisements: US\$ 17.08bn (2015)

Source: statista.com

Resource Allocation

1800 MHz									
Circle / Operator •	Vodafone •	Airtel •	Rel Jio +	Idea +	Aircel •	Uninor •	RCom •	Tata •	Total ¢
Andhra Pradesh	1	1	1	1	X	1	X	X	5
Assam	X	X	1	X	X	1	X	X	2
Bihar	X	X	X	X	X	1	X	X	1
Delhi	1	1	1	1	X	X	X	X	4
Gujarat	1	X	1	1	X	X	X	X	3
Haryana	1	X	X	1	X	X	X	X	2
Himachal Pradesh	X	1	X	X	X	X	X	X	1
Jammu & Kashmir	X	1	X	X	1	X	X	X	2
Karnataka	1	1	1	1	X	X	X	X	4
Kerala	1	1	1	1	X	X	X	X	4
Kolkata	1	1	1	X	X	X	X	X	3
Madhya Pradesh	X	1	1	1	X	X	X	X	3
Maharashtra & Goa	X	X	1	1	X	X	X	X	2
Mumbai	1	1	1	1	X	X	1	X	5
North East	X	1	1	1	1	X	X	X	4
Orissa	X	1	1	X	X	X	X	X	2
Punjab	1	1	X	1	X	X	X	X	3
Rajasthan	1	1	X	X	1	X	X	X	3

2015 spectrum auction [edit]

11

The 2015 spectrum auction concluded on March 25, after 19 days and 115 rounds of bidding. [29] Spectrum in the 800 MHz, 900 MHz, 1800 MHz and 2100 MHz bands was auctioned. The Government accrued a total of \$109874 crore (US\$16 billion) [30] from the auction. Approximately, 11% of the spectrum available for auction remained unshalf [31].

Source: wikipedia.org

Tamil Nadu

Uttar Pradesh (East)
Uttar Pradesh (West)
West Bengal
Total

15 14 11

2

62

Crowdsourcing

"Crowdsourcing is a type of participative online activity in which an individual, an institution, a non-profit organization, or company proposes to a group of individuals of varying knowledge, heterogeneity, and number, via a flexible open call, the voluntary undertaking of a task." $^{\rm 1}$

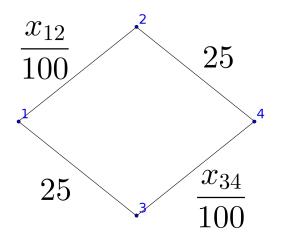




¹Enrique Estellés-Arolas and Fernando González-Ladrón-de Guevara. Towards an integrated crowdsourcing definition. Journal of Information science. 38(2):189200. 2012.

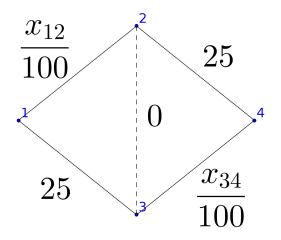
Traffic Routing

2000 cars every day travels from node 1 (source) to 4 (destination)



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Fair Division

One cake: two kids

Mother decides how to divide the cake

• Question: ensure that each kid is happy with his/her portion?



Fair Division (Contd.)

- Kid 1 thinks he got at least half in his view
- Kid 2 thinks she got at least half in her view
- The division is "fair" envy-free
- Notions of fairness is subjective
- If the mother knows that the kids see the division the same way as she does, the solution is simple – She can divide it and give to the children

Fair Division (Contd.)

- What if Kid 1 has a different notion of equality than that of the mother
- Mother thinks she has divided it equally
- Kid 1 thinks his piece is smaller than Kid 2's

Difficulty:

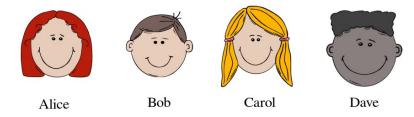
- ► Mother wants to achieve a fair division
- ▶ But does not have enough information to do this on her own
- ▶ Does not know which division is fair

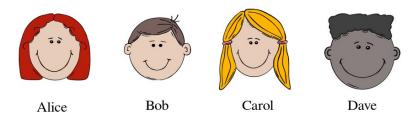
Question:

Can she design a mechanism under the incomplete knowledge that achieves fair division?

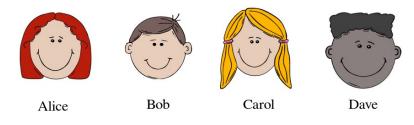
Fair Division: Solution

- Ask Kid 1 to divide the cake into two pieces
- Ask Kid 2 to pick her piece Why does this work?
- Kid 1 will divide it into two pieces which are equal in his eyes
 - Because if he does not, Kid 2 will pick the bigger piece
 - ▶ So, he is indifferent among the pieces
 - , 🙂
- Kid 2 will pick the piece that is bigger in her eyes
 - _ 🙂

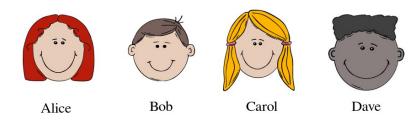




7 voters

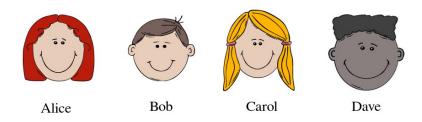


7 voters



7 voters

And the winner is:



7 voters

And the winner is: A (plurality)

```
3 voters: A \succ D \succ B \succ C
2 voters: B \succ A \succ C \succ D
2 voters: C \succ D \succ B \succ A
```

- Give each of the voters a ballot
- Ask to pick one candidate
- Run the *plurality rule*

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- Notice the preferences of the last 2 voters
- They prefer B over A

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Perhaps the voting rule is flawed?



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```

- How about a different voting rule
- Ask the voters to submit the whole preference profile
- Give scores to the ranks:
 - ▶ m-1 for top, m-2 for the next, ... , 0 to the last
 - $\blacktriangleright \ \ \mathsf{Here} \ m=4$

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- B wins!

Is it manipulable?

Coincidence?

 $\begin{array}{ll} \text{3 voters:} & \mathsf{A} \succ \mathsf{D} \succ \mathsf{B} \succ \mathsf{C} \\ \text{2 voters:} & \mathsf{B} \succ \mathsf{A} \succ \mathsf{C} \succ \mathsf{D} \\ \text{2 voters:} & \mathsf{C} \succ \mathsf{D} \succ \mathsf{B} \succ \mathsf{A} \end{array}$

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• Answer: No!



Allan Gibbard



Mark Satterthwaite

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Allan Gibbard



Mark Satterthwaite

Theorem (Gibbard 73, Satterthwaite 75): With unrestricted preferences and three or more distinct alternatives, no rank order voting system can be unanimous, truthful, and non-dictatorial

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- Teams are put in groups every team plays each other in the group, top 2 teams advance to knock-out stages
- Is this a good tournament design?

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- In group A: whoever wins the group will face QW in quarterfinals losers will face them only in the final

Similar Applications

- Combinatorial auctions agents' preferences over combinations of items
- Matching one sided (students to hostel rooms), two sided (candidates to universities)
- Facility location placing a hospital / public school in a locality
- Social networks flow of information, elicitation of private skills

Course Outline and Goals

- Economics: study of consumption, production and the balance between the two
- Branches Macro and Micro
- Focus: Microeconomics individual decisions agents having personal objectives, central planner having a collective goal, the interaction is strategic
 - What happens in an equilibrium? Does it exist?
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 - What happens in an equilibrium? Does it exist?
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- Computer science: representation and processing information in 'efficient' manner
- Design algorithms, analyse using mathematical tools, deploy in real world
- A lot of applications have economic flavors and those problems need different algorithm design techniques

Course Plan

Part 1: Refresher on Game Theory

Inverse Game Theory OR Engineering approach to Economic Theory

- Part 2: Social choice theory (mechanisms without money) classical and computational with and without threats of manipulation – impossibilities
 - voting
 - matching
- Part 3: Mechanism Design with money Money as transferrable utility
- Part 4: Back to Game Theory: Cooperative Games agents are forming teams and playing together against other groups of agents
- Part 5: Applications to real life online advertising, recommender systems, reputation systems, prediction markets, combinatorial auctions

Take aways from this class

- Apply principles of economics and computation to
 - Understand the interplay between incentives and computation in the design of socio-economic systems
 - Develop applicable models of complex Internet systems
 - Analyze the behavior of systems that include people, computational agents, and firms, and involve strategic behavior
 - Solve both mathematical and conceptual problems involving such systems, including problems you have not seen before
 - Write programs that implement strategic agents and mechanisms

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- Make a deployable Al system that does this automatically
 - As a product or a deliverable for industrial applications building systems that are guaranteed to perform
 - Research front: push the frontiers of research with the knowledge of current state-of-the-art

Expectations

- What you can expect from us
 - We will work hard to make this course useful for you (but we cannot do the work and learn the material for you)
 - We will be available for assistance throughout the semester and look forward to meeting you in person
 - ► We will do our best to promptly answer your questions via Piazza
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- What we expect from you
 - Attend classes regularly, come to class on time, and ask questions if something is unclear
 - ▶ Return the assigned tasks, i.e., scribe notes etc., on time
 - Adopt academic integrity (see: https://www.cse.iitk.ac.in/pages/AntiCheatingPolicy.html)
 - ▶ Have a positive attitude towards learning topics of this course

Class times and venue: Tue Fri 12.00 – 13.00, Wed 14.00 – 15.00, KD 102

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Virtual classroom:

 Piazza: register yourself and post questions/clarifications there – check the course homepage for details Thank you! Questions?