

# Incentives in Computer Science

# Your professor and TA



Anna  
Karlin

karlin@cs

Office: CSE 586

Office hours: Monday 3:30-4:30



Aditya  
Saraf

sarafa@cs

Office hours: Wednesdays, 3-4 pm

**TODAY: 3:30-4pm**

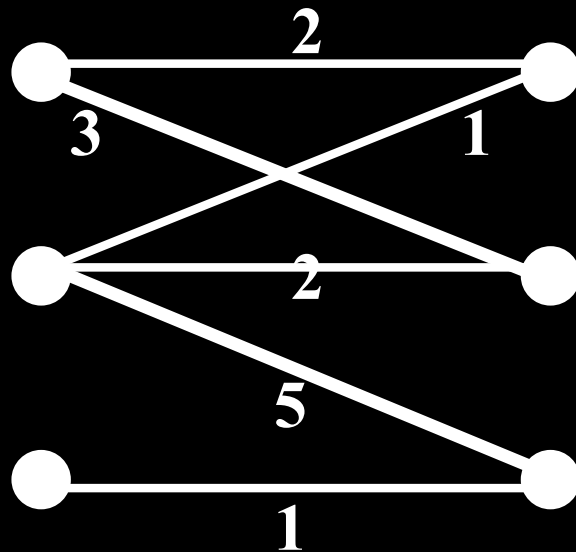
# An Example

Classical Optimization Problem:

Maximum Weighted Matching

Input: Weighted Bipartite Graph

Output: Matching that maximizes the sum of matched edge weights.



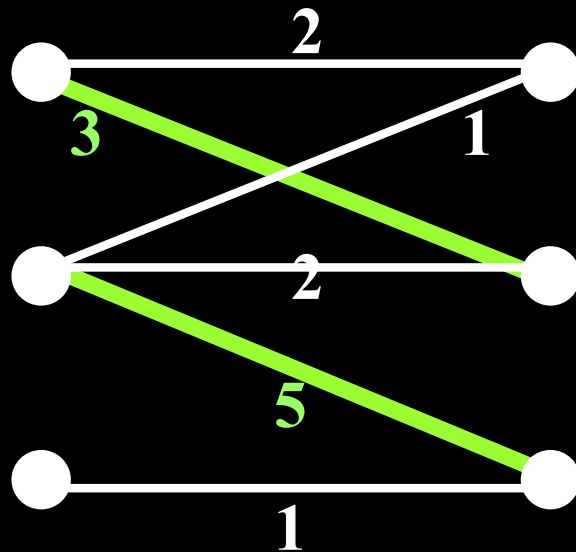
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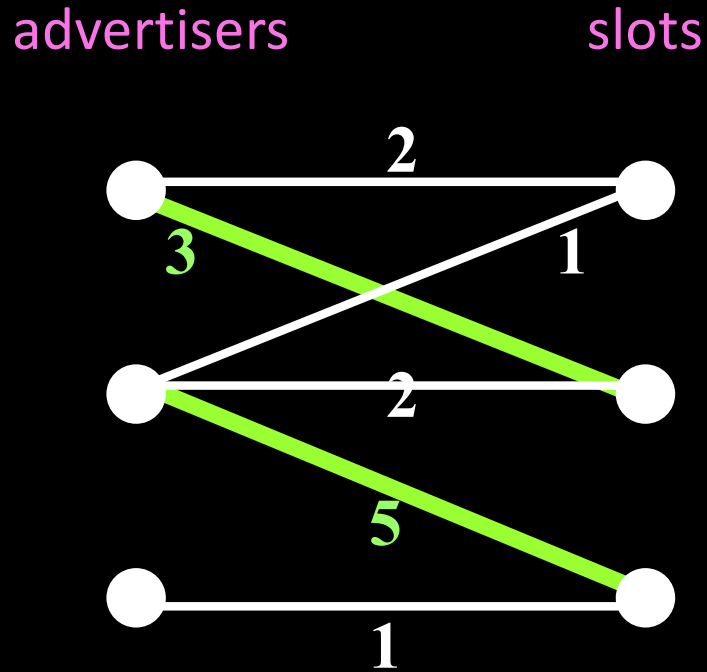
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# Example Application

Selling advertising slots

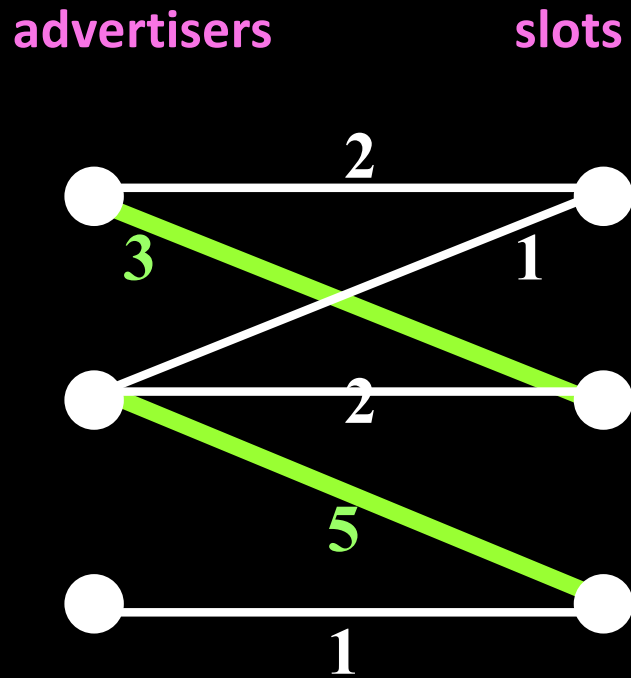
- A search engine has advertising slots for sale
- Advertisers are willing to pay different amounts to have their ad shown in a particular slot



Optimal Search Engine Revenue = maximum weighted matching

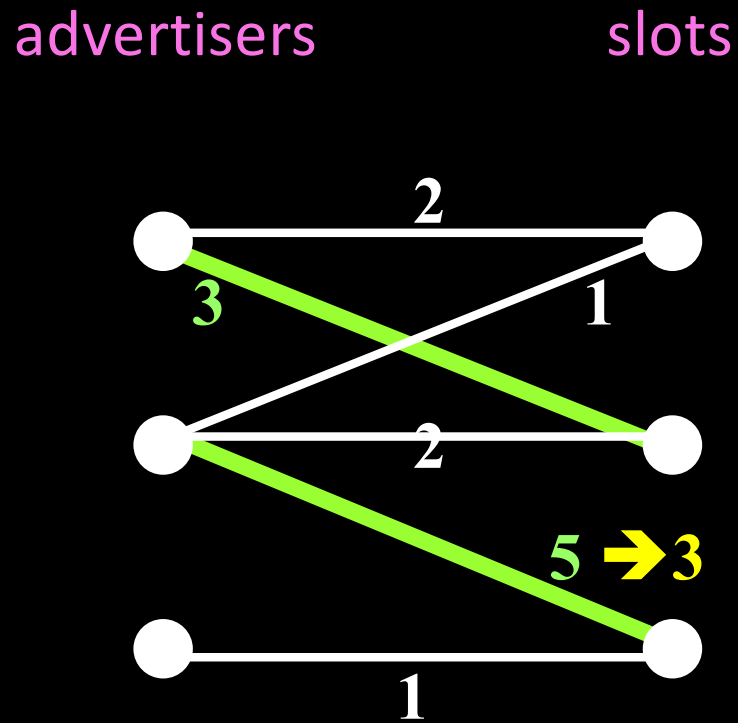
# Private Values

- Algorithm must solicit values
- Advertisers may lie to get a better deal



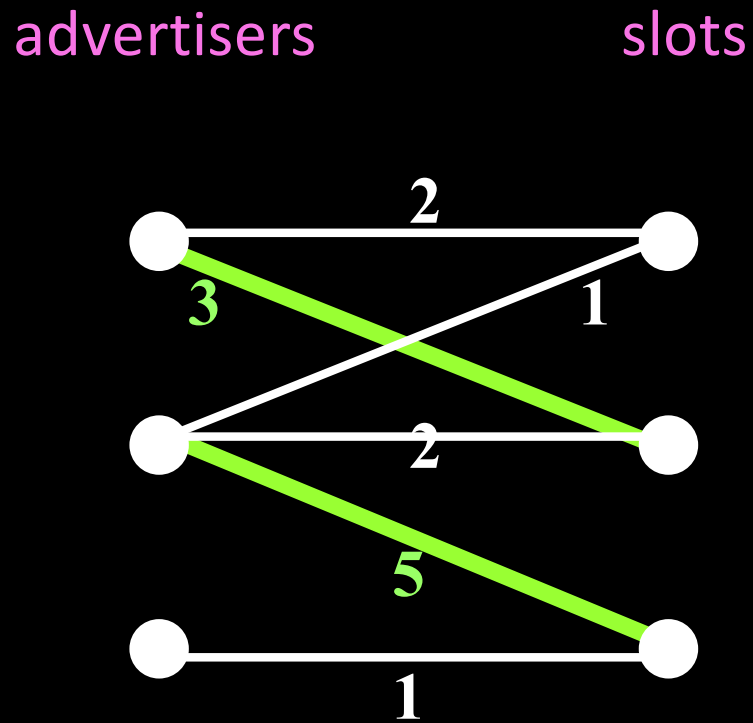
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# Private Values

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What if all advertisers speculate?



# Big Picture

Many problems where input is private data of agents who will act selfishly to promote best interests

- Resource allocation
- Routing and congestion control
- Electronic commerce

**Fundamental Question:**

**How do we optimize in a strategic world?**

Use ideas from game theory and economics.

# Game Theory

Game Theory studies the interaction between competing or cooperating individuals.

Key notion: **equilibrium**

## ALGORITHMIC GAME THEORY

Newish field at interface between theoretical computer science and game theory. Motivated by

- new applications in ecommerce, network applications, large scale resource allocation problems, myriad of nontraditional, computer-run auctions, etc.
- addresses fundamental problems about auctions, networks and human behavior using the tools of game theory, economics and algorithm design and analysis.

## Companies/systems that can be studied from this perspective

- eBay, Amazon
- Google, Yahoo!, Microsoft
- Facebook
- Twitter
- Uber, Lyft
- airBnb
- Quora
- Farecast
- Wikipedia
- ...

## Problems that can be studied from this perspective

- Auction design and analysis
- Reputation systems
- Recommendation systems
- Crowdsourcing
- Resource allocation problems
- Routing and congestion control
- Creating incentives in social and financial systems
- Prediction markets
- ...

# Themes

- Designing systems for strategic participants with good performance.
- Games that arise in the wild: when is selfish behavior benign?
- How do strategic players reach an equilibrium? Or do they?
- Goal: to expose you to a different way to think.

# Tentative list of topics

- Matching and allocation problems
- Intro to game theory, Nash equilibrium, etc.
- Markets, market-clearing prices, first welfare theorem
- Auctions (ads, spectrum)
- Price of anarchy
- Incentives in cryptocurrencies
- Online learning in markets
- Scoring rules and prediction markets
- Voting

# Note...

This is a theoretical class.

## EXPECTED BACKGROUND

- “mathematical maturity”
- Basics of probability, some background in algorithm design and analysis.
- I do not expect you to know any game theory or economics.

# The nuts and bolts

## COURSE WEBSITE

<http://www.cs.washington.edu/cse490z>

## GRADING

100% homework (mix of theoretical and programming)

## PARTICIPATION

- Please do it!!!!!!!
- Use the chat feature to either write a question or in the chat box, type “hand” and I will call on you soon thereafter.

LET'S GO AROUND THE “ROOM” AND INTRODUCE OURSELVES



# This week's lectures

- Covers some of the major results that resulted in the awarding of the 2012 Nobel Prize in economics to Lloyd Shapley and Al Roth
- *“The Prize concerns a central economic problem: how to match different agents as well as possible. For example, students have to be matched with schools, and donors of human organs with patients in need of a transplant. How can such matching be accomplished as efficiently as possible? What methods are beneficial to what groups? The prize rewards two scholars who answered these questions on a journey from abstract theory on stable allocations to practical design of market institutions.”*

# A basic definition

## MECHANISM

An algorithm whose inputs come from agents with a strategic interest in the output. Each agent's input is their own **private** information. Takes as **input** the reported preferences/data for a set of agents and produces as **output** an outcome, decision or action.

TODAY: MECHANISMS WITHOUT MONEY