

# CS 473ug: Algorithms

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# Part I

## Administrivia

# Instructional Staff

- **Instructor:** Chandra Chekuri (chekuri)
  - **Office Hours:** 11–12am on Monday, 1-2pm Tuesday, and by appointment.
- **Teaching Assistants:** Charles Blatti (blatti), Tracy Graumann (tgrauman2), Chia-chi Lin (lin36)
  - **Office Hours:** To be determined; see course webpage

# Electronic Bulletin Boards

- **Webpage:** `www.cs.uiuc.edu/class/fa07/cs473ug`
- **Newsgroup:** `uiuc.class.cs473ug`

# Textbooks

- **Prerequisites:** All material in CS 173, CS 225 and CS 273
- **Text-book:** Algorithm Design by Jon Kleinberg and Éva Tardos
- **Lecture Notes:** Available on the web-page after every class
- **Additional References**
  - Introduction to Algorithms: Cormen, Leiserson, Rivest, Stein
  - Algorithms: Dasgupta, Papadimitriou, and Vazirani.
  - Computers and Intractability: Garey and Johnson
  - Previous class notes of Jeff Erickson, Sarel Har-Peled and Mahesh Viswanathan.

# Grading Policy: Overview

## Total Grade and Weight

- **Homeworks:** 25%
- **Midterms:** 40% ( $2 \times 20$ )
- **Finals:** 35%

## Additional Component

- **Extra Credit:** “Head Banging Sessions”
- **Extra Credit:** “Special problems on homeworks”

# Homeworks

- One homework every week: Assigned on Friday and due the following Friday.
- Homeworks can be worked on in groups of up to 3 and each group submits *one* written solution (except Homework 0).
- Groups can be changed a *few* times in the course of the semester.
- Homeworks will be “turned in” orally every third week; the rest of the times you will turn in a written homework
  - **Oral:** Explain (verbally) to TA the solution to problems that are asked for.
  - **Written:** Write solutions to every problem and turn in the written solutions.

# Head Banging Sessions

- 1 hour sessions, led by TAs, where you solve problems in groups
- Attendance optional, but (small) extra credit for those who attend
- When and where?



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- When and where? **Fill Survey! Details soon.**

# User Manual to Performing Badly

- Skip lectures
- Skip homework or copy homework solutions
- Skip reading assignments
- Fail to clarify doubts immediately
- Study right before exams

## Part II

# Course Goals and Overview

# Topics

- Some useful basic algorithms and data structures
- Broadly applicable techniques in algorithm design
  - Greedy methods
  - Divide and Conquer
  - Dynamic Programming
  - Randomization and Approximation
- Analysis techniques
  - Recurrences
  - Amortization and elementary potential functions
- Reductions, NP-Completeness, Heuristics

# Goals

- Appreciate the importance of algorithms in computer science and beyond (engineering, mathematics, natural sciences, social sciences, ...)
- Algorithmic thinking.
- Understand/appreciate limits of computation.
- Learn/remember some basic tricks, algorithms, problems.

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- Learn/remember some basic tricks, algorithms, problems.
- Have fun!!!

## Part III

# Primality Testing

## Problem

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Simple Algorithm:

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endfor
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Correctness? If  $n$  is composite, at least one factor in  $\{2, \dots, \sqrt{n}\}$   
Running time?  $O(\sqrt{n})$  divisions? Sub-linear in input size! **Wrong!**

How many bits does it take to represent  $n$  in decimal or binary?  
 $O(\log n)$  bits.

Simple Algorithm takes *exponential time* in the input size.

Modern cryptography deals with binary numbers with 128, 256, 512 bits.

Simple Algorithm will take  $2^{64}$ ,  $2^{128}$ ,  $2^{256}$  steps!

Fastest computer today: about 3 petaFlops  $\simeq 3 \times 2^{50}$  ops/sec.

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## Lesson

Representation size very important, especially in *number* problems.



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Short answer: polynomial time is the single, robust, mathematically sound way to define efficiency.

# Primes is in P!

## Theorem (Agrawal-Kayal-Saxena'02)

*There is a polynomial time algorithm for primality.*

First polynomial time algorithm for testing primality. Running time is  $O(\log^{12} n)$  further improved to about  $O(\log^6 n)$  by others.

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Neeraj Kayal and Nitin Saxena were undergraduates at IIT-Kanpur!

# What about before 2002?

Primality testing a key part of cryptography. What was the algorithm being used before 2002?

Miller-Rabin *randomized* algorithm:

- runs in polynomial time:  $O(\log^2 n \log \log n 2^{O(\log^* n)})$ .
- if  $n$  is prime correctly says “yes”.
- if  $n$  is composite it says “yes” with probability at most  $1/2^{100}$  (can be reduced further at the expense of more running time).

Based on Fermat’s little theorem and some basic number theory.  
More practical (the  $O(\log^3 n)$  version) and faster than the deterministic algorithm.



# Factoring

Modern public-key cryptography based on RSA (Rivest-Shamir-Adelman) system.

Relies on the difficulty of factoring a composite number into its prime factors.

There is a polynomial time algorithm that decides whether a given number  $n$  is prime or not (hence composite or not) but no known polynomial time algorithm to factor a given number.

## Lesson

Intractability can be useful!

# Quantum Computing

## Theorem (Shor'1994)

*There is a polynomial time algorithm for factoring on a quantum computer.*

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## Lesson

Pay attention to the model of computation.

# RAM Model

Random Access Memory model.

- data in memory can be accessed in one time step using an address
- simple arithmetic operations such as addition/multiplication of numbers can be done in one step

RAM model not valid for all problems, especially numerical problems (example: primality, multiplication, ...).

Why not Turing machines?

- RAM model better reflects the capabilities of a real computer for many common problems.
- TMs are too cumbersome

## Part IV

# The Mathematics of Dating

# Warning!!

This lecture is intended for a mature audience

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This lecture is intended for a mathematically mature audience  
This lecture contains material that may be shocking to some students



# Dating Scenario

- There are  $n$  boys and  $n$  girls
- Each girl has her own ranked preference list of all the boys
- Each boy has his own ranked preference list of all the girls
- The lists have no ties

**Question:** How do we pair the boys and girls?

## Dating Scenario: An Example

C, B, E, A, D (1) ↗

A, B, E, C, D (2) ↗

D, C, B, E, A (3) ↗

A, C, D, E, B (4) ↗

A, B, D, E, C (5) ↗

(A) 3, 5, 2, 1, 4  
+  
(B) 5, 2, 1, 4, 3  
+  
(C) 4, 3, 5, 1, 2  
+  
(D) 1, 2, 3, 4, 5  
+  
(E) 2, 3, 4, 1, 5  
+

# Stable Pairing

## Definition

Suppose we pair off all the boys and girls. Now if there is some boy  $b$  and some girl  $g$  who prefer each other to whom they are paired. Then  $(b, g)$  will be called a **unhappy pair**.

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- Unhappy pair motto: Why be with our partners when we can be with each other?

# Stable Pairing

## Definition

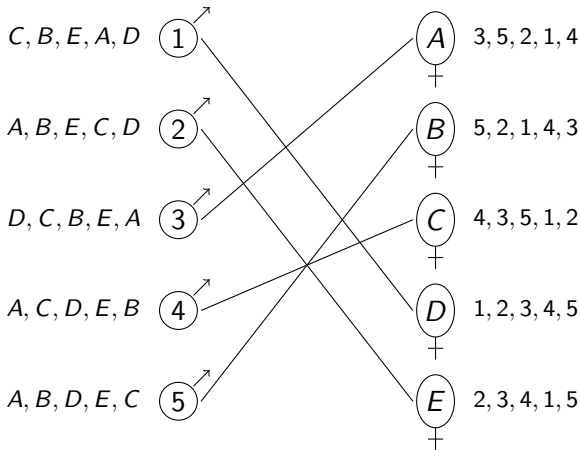
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## Definition

A pairing of boys and girls is called **stable** if it contains no unhappy pairs.

**Moral Code:** Sustainability must be prerequisite for “goodness”.

# Stable Pairing: An Example



# Stable Marriage Problem

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*Given a set of preference lists (one for each boy and girl), how do we find a stable pairing?*

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- But wait, how do we know that a stable pairing even exists!!
- Break up problem as follows
  - 1 Given a set of preference lists, does a stable pairing exist?
  - 2 Given a set of preference lists for which a stable pairing exists, design an algorithm to find a stable pairing.

## A Simpler Problem

- Does every set of preference lists have a stable pairing?

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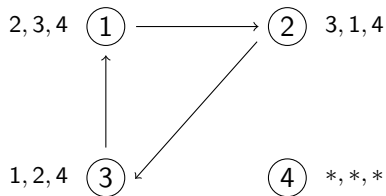
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  - **Response 1:** There are only finitely many pairings ...
- **Challenge 2:** Why can't we be cycling through the same pairings?

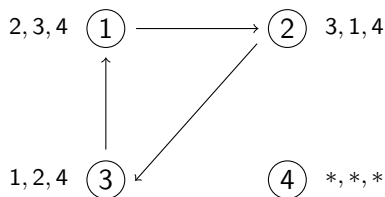
## Bisexual Dating (aka Stable Roommates Problem)



- Let  $x$  and  $y$  be paired with one other and let  $z$  be paired with 4

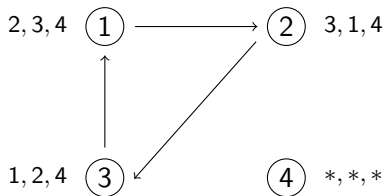


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- Observe,  $z$  prefers  $x$  and  $y$  to 4
- One among  $x$  and  $y$  (say  $x$ ) prefers  $z$
- $x$  and  $z$  form an unhappy pair; this process keeps repeating!

# Existence of Stable Pairings

Does the break up/reform algorithm work for heterosexual case?

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Does the break up/reform algorithm work for heterosexual case?

Not clear and not easy to analyze.

Instead, will show existence via a constructive algorithm.

Observation: multiple stable pairings possible

- $b$  prefers  $g$  to  $g'$  and  $b'$  prefers  $g'$  to  $g$ .
- $g$  prefers  $b'$  to  $b$  and  $g'$  prefers  $b$  to  $b'$ .
- $\{(b, g), (b', g')\}$  and  $\{(b, g'), (b', g)\}$  are both stable pairings.

# Traditional Marriage Algorithm (TMA)

The Gale-Shapley Algorithm (1962)

repeat

    Morning

        Each girl stands on her balcony

        Each boy proposes to the best girl whom he has not yet  
            crossed off his list

        (A boy with an empty list stays home doing homework)

    Afternoon (for those girls with at least one suitor)

        To today's best suitor: "Maybe I will marry you.

        Come back tomorrow"

        To all other suitors that day: "I will never marry you"

    Evening

        Any rejected boy crosses the girl off his list

until no boy is rejected

Each girl marries the boy to whom she last said "maybe"

# Examining TMA

## Questions:

- Does the algorithm terminate?
- Does the algorithm match each boy and girl (a perfect matching)?
- Does it produce a stable pairing?

# Termination Proof

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If  $g$  rejects  $b$  then  $b$  crosses  $g$  off his list and will never propose to her again.

Total number of possible proposals is  $n^2$  (each boy to each girl) and thus algorithm has to terminate after at most  $n^2$  days □

# Improvement Lemma

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*If a girl  $g$  has boy  $b$  on a string (i.e.,  $g$  has said maybe to  $b$ ), then she will always have someone at least as good on a string, or for a husband.*

## Informal Proof.

$g$  will let go of  $b$  only for a better suitor.

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Observation: If  $b$  courts  $g$  on day  $t$ , then  $b$  has already been rejected by day  $t - 1$  by all girls that he prefers to  $g$ . Continues to court  $g$  until she rejects (for a better boy) or marries him. □

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- On day  $q + k$ ,  $b_1$  also appears (by observation).
- Since  $b_1$  is better than  $b^*$ , there is at least one suitor on day  $q + k$  who is better than  $b^*$ .
- $g$  will therefore not pick  $b^*$  on day  $q + k$ , which contradicts the assumption that  $b^*$  is picked on day  $q + k$ . □

# Consequences of Improvement Lemma

## Corollary

*Each girl will marry her absolute favorite among all the boys who visit her during the TMA.*

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### Proof by Contradiction

- Suppose  $b$  is rejected by all the girls
- Each girl that rejects  $g$  has a suitor when rejecting  $b$ . By Improvement Lemma, she eventually marries some boy.
- That means, since we have  $n$  girls, we have at least  $n$  suitors not counting  $b$ . Thus, there are at least  $n + 1$  boys!



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- During TMA  $b$  proposed to  $g^*$  before he proposed to  $g$
- At some point,  $g^*$  rejected  $b$  for someone better. By the Improvement Lemma,  $g^*$  marries  $b^*$  who she prefers to  $b$
- Hence  $(b, g^*)$  is not an unhappy couple!

# Implementation

## Lemma

*The algorithm can be implemented in  $O(n^2)$  time.*

Note: input size is  $O(n^2)$  and hence time is linear in input size.

The algorithm in the book is essentially the same:

- maybe  $\equiv$  engaged
- each day only one unengaged boy proposes

# Opinion Poll

Who is better off in traditional dating, the boys or girls?

# Optimal Girl

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- The optimal girl for  $b$  maybe better than the girl  $b$  gets by TMA.

# Pessimal Girl

## Definition

$g$  is the **pessimal girl** for  $b$ , if she is the lowest ranked girl for whom there is *some* stable pairing in which  $b$  gets  $g$ .

- Pessimal Girl is the worst girl  $b$  can conceivably get in a stable world.

**Optimal boy** for a girl  $g$  and **pessimal boy** for a girl  $g$  can be similarly defined.

# Dating Heaven and Hell: Boy's Perspective

## Definition

A pairing is **male optimal** if every boy gets paired with his optimal girl.

- The best of all possible stable worlds for every boy simultaneously.

## Definition

A pairing is **male pessimal** if every boy gets paired with his pessimal girl.

- The worst of all stable worlds for every boy simultaneously.

# Dating Heaven and Hell: Girl's Perspective

## Definition

A pairing is **female optimal** if every girl gets paired with her optimal boy.

- The best of all possible stable worlds for every girl simultaneously.

## Definition

A pairing is **female pessimal** if every girl gets paired with her pessimal boy.

- The worst of all stable worlds for every girl simultaneously.

# Naked Truth!

The Traditional Marriage Algorithm always produces a **male-optimal**, and **female-pessimal** pairing.

# Male Optimality of TMA

## Theorem

*TMA produces a male-optimal pairing.*

## Proof.

By contradiction. Suppose some boy  $b$  gets rejected by his optimal girl  $g$  during TMA. Let  $t$  be the earliest time when a boy gets rejected by his optimal girl.



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- At time  $t$ ,  $b$  got rejected by  $g$  because she had on a string  $b^*$  whom she preferred.
- Since  $t$  is the earliest time,  $b^*$  at time  $t$  has not been rejected by his optimal girl.

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- Since  $t$  is the earliest time,  $b^*$  at time  $t$  has not been rejected by his optimal girl.
- Thus  $b^*$  likes  $g$  at least as much as his optimal girl. □

## Male Optimality of TMA (contd)

Proof.

$b^*$  likes  $g$  at least as much as his optimal girl. And  $b$  got rejected by his optimal girl  $g$  because of  $b^*$ .

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- Let  $S$  be a stable pairing where  $b$  gets paired with  $g$  (exists, because  $g$  is  $b$ 's optimal girl).
- $b^*$  would like to be with  $g$  over his wife in  $S$ , say  $g^*$

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  - $g$  is at least as good as  $b^*$ 's optimal girl and  $b^*$  is not with  $g$  in  $S$ .

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- $g$  likes  $b^*$  more than  $b$



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  - $g$  is at least as good as  $b^*$ 's optimal girl and  $b^*$  is not with  $g$  in  $S$ .
- $g$  likes  $b^*$  more than  $b$ 
  - $g$  rejected  $b$  because she had  $b^*$  on a string.
- $S$  is not stable since  $(b^*, g)$  are an unhappy pair. □

# Male Optimality of TMA

$optimal(b)$ : optimal girl for  $b$

## Corollary

*The pairs  $(b, optimal(b))$  is a perfect matching.*

# Female Pessimality of TMA

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*TMA produces a female-pessimal pairing.*

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Let  $T$  be produced by TMA. We know  $T$  is male-optimal. The proof proceeds by contradiction.

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- $S$  is not stable
  - By assumption,  $g$  likes  $b$  more than  $b^*$
  - $b$  likes  $g$  more than his mate in  $S$ , because  $g$  is his optimal girl.
  - $(b, g)$  are an unhappy pair in  $S$ .



$pessimal(g)$ : pessimal boy for  $g$ .

### Corollary

$$pessimal(optimal(b)) = b$$

# Stable Marriage in Practice: Medical Residencies

- World's most successful dating service: Matching doctors to Medical residencies
  - Students submit a ranked list of hospitals
  - Hospitals submit a ranked list of new doctors
  - Computer runs TMA (extended to handle Mormon marriages)
  - Until recently, it was hospital optimal
- Assigning traffic to web-servers: Akamai Inc.

# Reading Assignment

Chapters 1-3 from the textbook. At least half is prereq material.