

Week 2 - Friday

**COMP 4500**

# Last time

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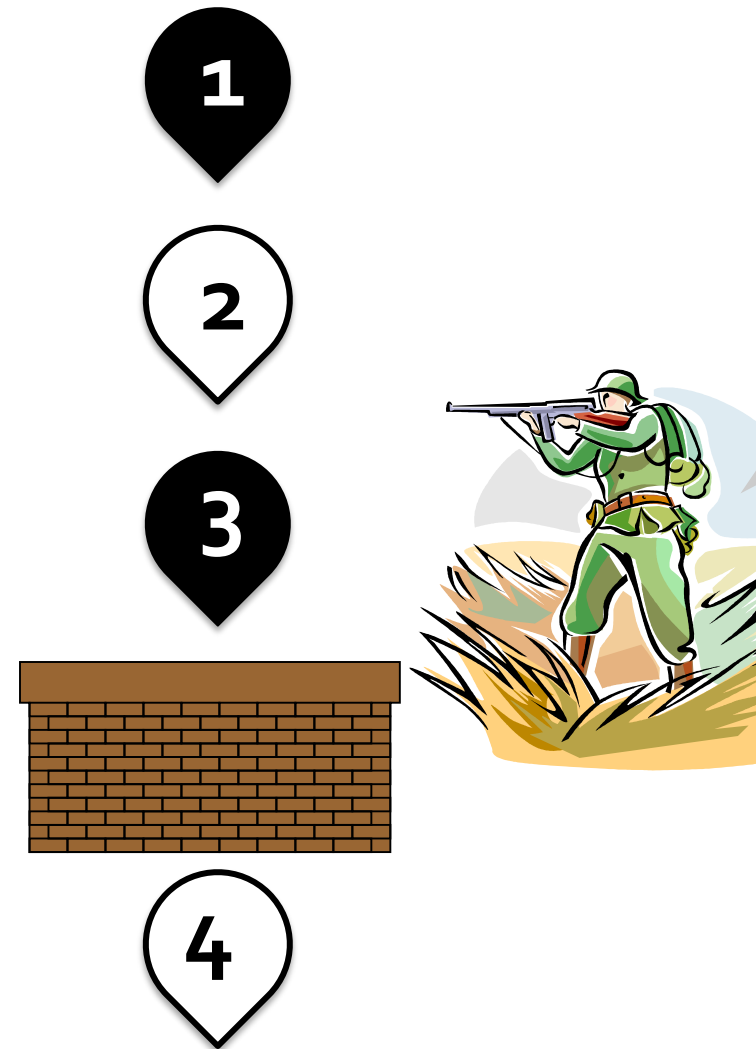
- What did we talk about last time?
- More proof techniques
- Asymptotic orders of growth
- Started stable marriage

# Questions?

# Assignment 1

# Logical warmup

- Four men are standing in front of a firing-squad
- #1 and #3 are wearing black hats
- #2 and #4 are wearing white hats
- They are all facing the same direction with a wall between #3 and #4
- Thus,
  - #1 sees #2 and #3
  - #2 sees #3
  - #3 and #4 see no one
- The men are told that two white hats and two black hats are being worn
- The men can go if one man says what color hat he's wearing
- No talking is allowed, with the exception of a man announcing what color hat he's wearing.
- Are they set free? If so, how?



# Stable Marriage

# Imagine $n$ men and $n$ women

- All  $2n$  people want to get married
- All of them are *willing* to marry any of the  $n$  members of the opposite gender
- Each woman has ranked all  $n$  men in order of preference
- Each man has ranked all  $n$  women in order of preference
- We want to match them up so that the marriages are **stable**

# Stability

- Consider two marriages:
  - Anna and Bob
  - Caitlin and Dan
- This pair of marriages is unstable if
  - Anna likes Dan more than Bob **and** Dan likes Anna more than Caitlin  
**or**
  - Caitlin likes Bob more than Dan **and** Bob likes Caitlin more than Anna
- We want to arrange all ***n*** marriages such that none are unstable

# Gale-Shapley Pseudocode

- While there is man  $m$  who is free and hasn't proposed to every woman
  - Choose any such man  $m$
  - Let  $w$  be the highest-ranked woman in  $m$ 's preferences that  $m$  hasn't proposed to yet
  - If  $w$  is free then
    - $(m, w)$  become engaged
  - Else  $w$  is engaged to some man called  $m'$ 
    - If  $w$  prefers  $m'$  to  $m$ 
      - $m$  remains free
    - Else
      - $(m, w)$  become engaged
      - $m'$  becomes free
- Return the set of engaged pairs

# Observations

- Once a woman is engaged, she'll stay engaged
  - Maybe her engagement will change to a man she likes more, but she will never become free again
- The sequence of women that a particular man proposes to will get lower and lower on his preference list

# Progress

- We want to **bound** the time that an algorithm takes
- Sometimes that means coming up with some kind of **indirect** measurement of the operations
- We can define  $P(t)$ , the **progress** at time  $t$ , as the set of unique proposals of  $m$  to  $w$  on the  $t^{\text{th}}$  iteration of the algorithm
- Note that on every iteration, a unique proposal  $(m, w)$  happens, so the size of  $P(t + 1)$  is always one more than  $P(t)$

# Running time

- The algorithm runs at most  $n^2$  iterations of the While loop.
- **Proof:**
  - No men will propose after they have proposed to all the women.
  - There are a maximum of  $n^2$  ways for any man to propose to any woman.
  - At each iteration, the progress increases.
  - Thus, it's impossible for the algorithm to run more than  $n^2$  iterations.
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# If $m$ is free, there is a woman he hasn't proposed to

## ■ Proof by contradiction:

- Suppose that  $m$  is free but has already proposed to every woman.
- We have already established that a woman can never become unengaged once she's been proposed to.
- Since  $m$  has proposed to all women, they're all engaged.
- But then there would be  $n$  women who are engaged to  $n$  different men.
- Since  $m$  is one of those  $n$  men, he must not be free, which is a contradiction.



# Everyone is matched when the algorithm terminates

- **Proof by contradiction:**

- Suppose that there is at least one man  $m$  who is unmatched at the end of the algorithm.
- He must have proposed to every woman or the While loop would not have terminated.
- However, this contradicts the previous proof that any free man must have a woman he hasn't proposed to.



# The algorithm gives a stable matching

## ■ Proof by contradiction:

- Suppose that the matching is not stable.
- Thus, there are pairs  $(m, w)$  and  $(m', w')$  such that  $m$  prefers  $w'$  and  $w'$  prefers  $m$ .
- It must be the case that  $m$ 's last proposal was to  $w$ .
- Case 1:  $m$  never proposed to  $w'$ 
  - Since  $m$  proposed to women in descending order of preference, he must prefer  $w$  more than  $w'$ , a contradiction.
- Case 2:  $m$  did propose to  $w'$ 
  - If so,  $w'$  preferred some later proposer  $m''$  to  $m$ .
  - But for  $w'$  to end up with  $m'$ ,  $m' = m''$  or  $m'$  is someone she preferred even more than  $m''$ , and thus more than  $m$ , a contradiction.
- Since all cases lead to contradictions, the matching must be stable.



# Five Representative Problems

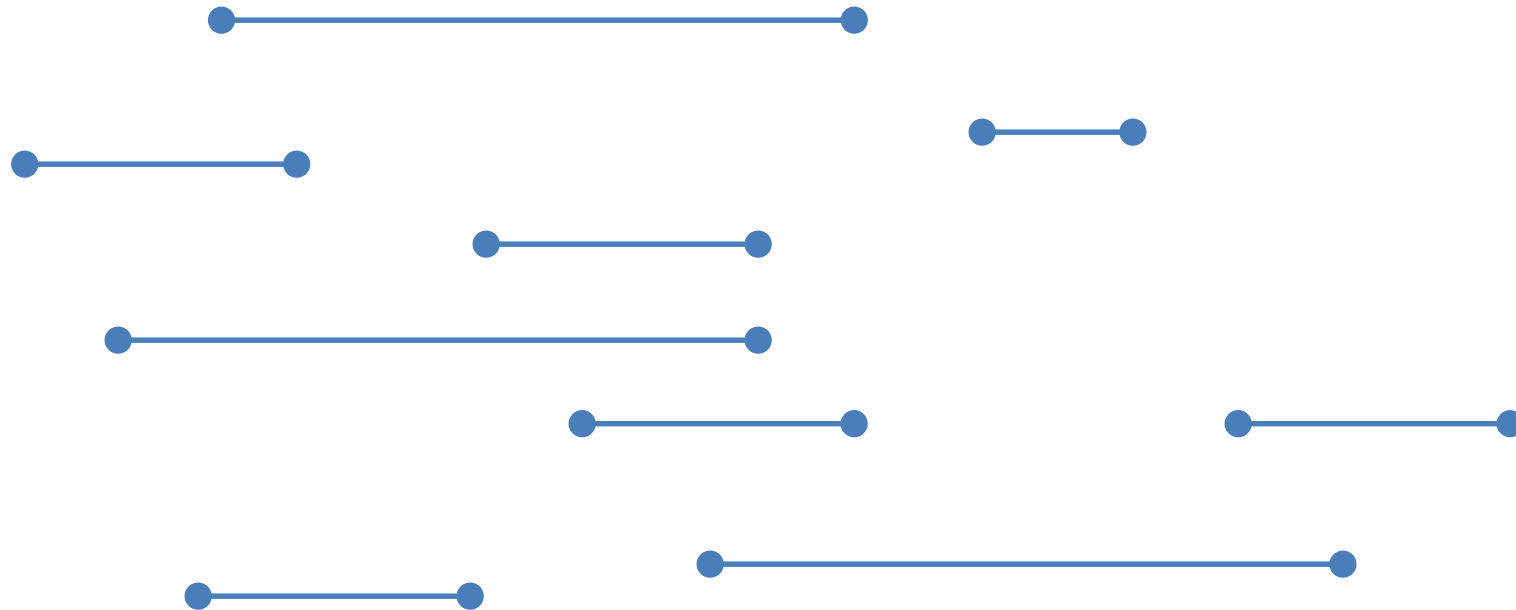
# Interval scheduling

- In the interval scheduling problem, some resource (a phone, a motorcycle, a toilet) can only be used by one person at a time.
- People make requests to use the resource for a specific time interval  $[s, f]$ .
- The goal is to schedule as many uses as possible.
- There's no preference based on who or when the resource is used.

# Interval scheduling algorithm

- Interval scheduling can be done with a **greedy** algorithm
- While there are still requests that are not in the compatible set
  - Find the request  $r$  that ends earliest
  - Add it to the compatible set
  - Remove all requests  $q$  that overlap with  $r$
- Return the compatible set

# Interval scheduling example



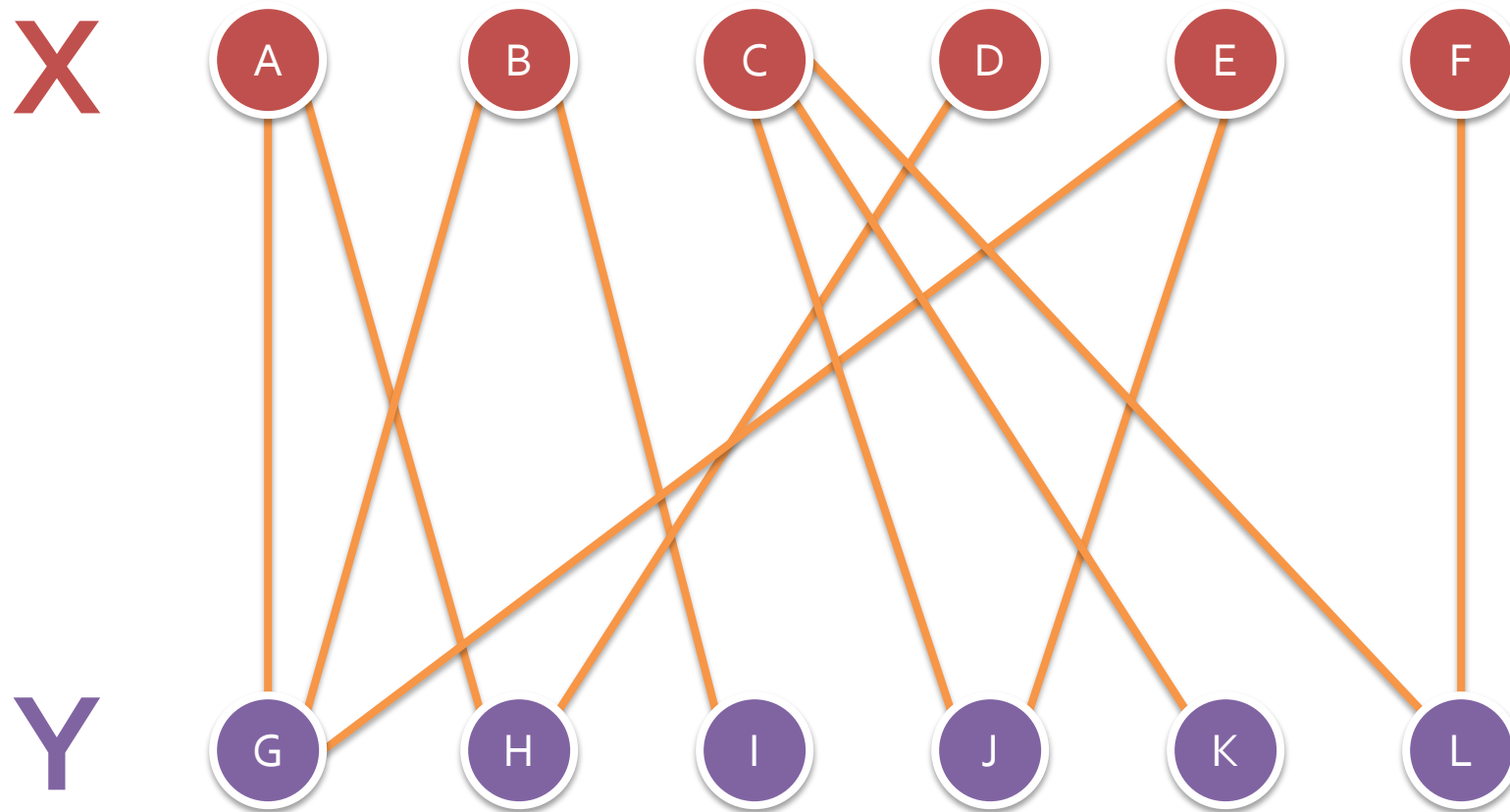
# Weighted interval scheduling

- The **weighted interval scheduling** problem extends interval scheduling by attaching a weight (usually a real number) to each request
- Now the goal is not to maximize the **number** of requests served but the total **weight**
- Our greedy approach is worthless, since some high value requests might be tossed out
- We could try all possible subsets of requests, but there are **exponential** of those
- **Dynamic programming** will allow us to save parts of optimal answers and combine them efficiently

# Bipartite graphs

- A bipartite graph is one whose nodes can be divided into two disjoint sets  $X$  and  $Y$
- There can be edges between set  $X$  and set  $Y$
- There are no edges inside set  $X$  or set  $Y$
- A graph is bipartite if and only if it contains no odd cycles

# Bipartite graph



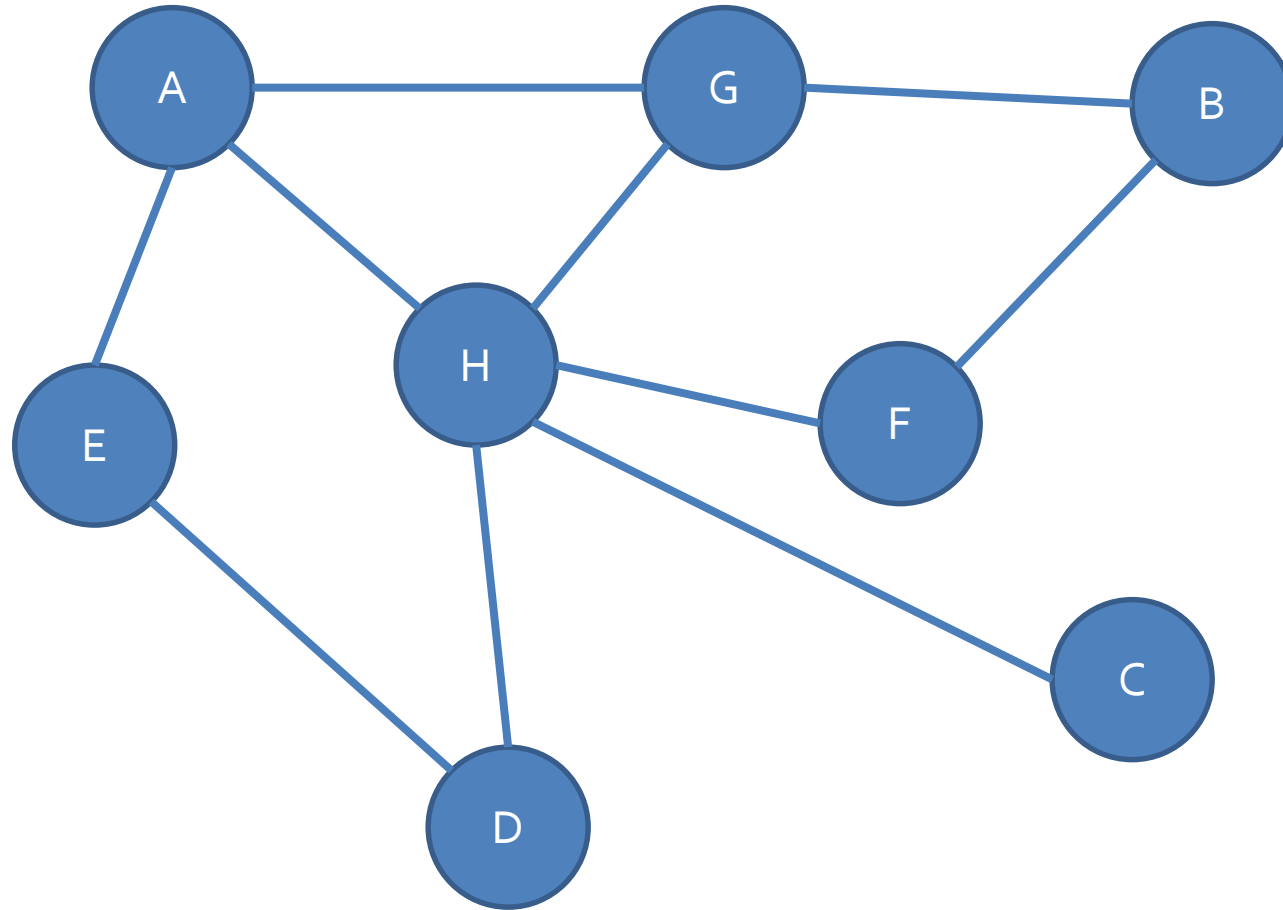
# Bipartite matching

- A **perfect matching** is when every node in set  $X$  and every node in set  $Y$  is matched
- It is not always possible to have a perfect matching
- We can still try to find a **maximum matching** in which as many nodes are matched up as possible
- Our algorithm will use the idea of an augmenting path, which is useful in many network flow problems
- This technique is neither greedy nor dynamic programming

# Independent set

- Independent set is another graph problem
- Given an undirected graph, find the largest set of nodes that are not connected to each other
- Doesn't sound too bad, right?
- Practical application:
  - Nodes represent friends of yours
  - An edge between those two nodes means they hate each other
  - What's the largest group of friends you could invite to a party if you don't want any to hate each other?

# Independent set example



# NP-complete

- Independent set is NP-complete
- That means:
  - The best algorithm we know is exponential (try all subsets of vertices)
  - All other NP-complete problems can be turned into it
  - Even all polynomial time problems can be turned into it (though it's not always easy to see how)

# Solving interval scheduling with independent set

- Take your interval scheduling problem and make all the requests nodes
- If the nodes overlap, put an edge between them
- Then, run your independent set algorithm
- Magically, you'll get exactly those nodes corresponding to the largest set of non-overlapping requests

# Solving bipartite matching with independent set

- A little confusing!
- Make a new graph where there's a node corresponding to every edge from the bipartite graph
- Now, connect every node in the new graph to every other node (which was an edge) that shared endpoints in the original graph
- Running an independent set algorithm will now pick the largest set of nodes (which were edges) such that none of the nodes are connected
- Thus, only edges in the original graph will be selected if they don't share endpoints

# Competitive facility location

- Imagine that you have a graph where nodes represent locations
- There are edges between locations that are "too close" to both have coffee shops
- Each node has a value associated with it, giving how much coffee you can sell
- What if there are two companies that each take turns picking a location to build their next coffee shop?
- What algorithm should either company follow to guarantee the most value? Or to guarantee at least a certain amount of value?

# PSPACE-complete

- The competitive facility location problem is PSPACE-complete
  - Problems that can be solved using only polynomial space and unbounded time
- It is believed to be even harder than NP-complete
- Even though coffee chains don't play games like this, PSPACE-complete problems include generalizations of:
  - Almost every board game
  - Game theory problems
  - Serious AI problems

# Three-sentence summary of an efficient solution to Stable Marriage

# Implementing Stable Marriage

# Arrays

- An array is a random access list data structure available in many programming languages
- An array of length  $n$  has the following properties:
  - Retrieving the  $i^{\text{th}}$  element in the list takes  $O(1)$  time
  - Checking to see if an element appears in an unordered array takes  $O(n)$  time
  - Checking to see if an element appears in a sorted array takes  $O(\log n)$
  - Adding or removing elements can take  $O(n)$  time to move elements over or resize the array

# Linked lists

- A linked list is a sequential access list data structure available in most programming languages
- A list has the following properties:
  - Retrieving the  $i^{\text{th}}$  element in the list takes  $O(i)$  time
  - Checking to see if an element appears may always take  $O(n)$  time
  - Adding or removing elements from the beginning and end of the linked list usually takes  $O(1)$  time

# Gale-Shapley Pseudocode

- While there is man  $m$  who is free and hasn't proposed to every woman
  - Choose any such man  $m$
  - Let  $w$  be the highest-ranked woman in  $m$ 's preferences that  $m$  hasn't proposed to yet
  - If  $w$  is free then
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      - $m$  remains free
    - Else
      - $(m, w)$  become engaged
      - $m'$  becomes free
- Return the set of engaged pairs

# Steps in the loop

- Each iteration of the loop, we need to do four things efficiently:
  1. Find a free man  $m$
  2. Find the highest-ranked woman  $w$  that  $m$  hasn't proposed to
  3. See if  $w$  is currently engaged and, if so, her current partner
  4. For a woman  $w$ , decide whether she prefers  $m$  or  $m'$

# Finding a free man and his next proposal

- If we keep a linked list of free men, we can find a free man in constant time
- Each man has a list (presumably stored as an array) of his preferences
- We only need to keep the index of the next woman he should propose to
- Thus, we can keep all of the indexes for all of these men in a single array and increment the appropriate index whenever a man proposes, in constant time

# Finding a woman's partner and her preferences

- We can keep a separate array that lists which man each woman is engaged to
  - Most languages provide **null** or a similar value to represent no current partner
- Before the algorithm, we can create an  $n \times n$  array of ranks called **ranking**, where **ranking**[ $w$ ][ $m$ ] gives the  $w$ 's ranking of  $m$
- With this array, we can look up  $w$ 's ranking of  $m$  and  $m'$  in constant time

# Total running time

- Before, we proved that we needed a maximum of  $n^2$  iterations of the While loop to solve the Stable Marriage problem
- We just demonstrated that we can do  $\Theta(n^2)$  work before the loop and then do constant work inside each iteration
- Thus, the total work is  $\Theta(n^2) + \Theta(n^2)$ , which is  $\Theta(n^2)$

# Upcoming

# Next time...

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- Common running times
- Worked exercises
- Proofs by induction

# Reminders

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- Read section 2.4
- Work on Assignment 1
  - Due next Friday by midnight