



# Example Problem: Stable Matching

CS 4104: Data and Algorithm Analysis

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Yoseph Berhanu Alebachew

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Virginia Tech

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# The Problem

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- Originated in 1962 by David Gale and Lloyd Shapley
- They wanted to implement a self-enforcing college admissions process
- This is also called Gale-Shapley Matching
- National Resident Matching Program had been using a very similar procedure

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## Example: Input 1

- Each man ranks all the women in order of preference.
- Each woman ranks all the men in order of preference.
- Each person uses all ranks from 1 to  $n$ , i.e., no ties, no incomplete lists.

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Men	1	2	3	4
Alex	Callie	Christina	Meredith	Miranda
Derek	Meredith	Miranda	Christina	Callie
Jackson	Meredith	Miranda	Christina	Callie
Preston	Christina	Miranda	Callie	Meredith

## Example: Input 2

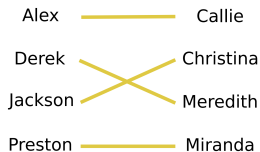
<b>Women</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>
<b>Callie</b>	Alex	Derek	Jackson	Preston
<b>Christina</b>	Derek	Preston	Jackson	Alex
<b>Meredith</b>	Derek	Jackson	Preston	Alex
<b>Miranda</b>	Derek	Jackson	Alex	Preston



## Example: Matching

	Callie	Christina	Meredith	Miranda
Alex	1	2	3	4
Derek	4	3	1	2
Jackson	4	3	1	2
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	Alex	Derek	Jackson	Preston
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- **Matching:** each man is paired with  $\leq 1$  woman and vice versa.
- **Perfect matching:** each man is paired with exactly one woman and vice versa.

### Note

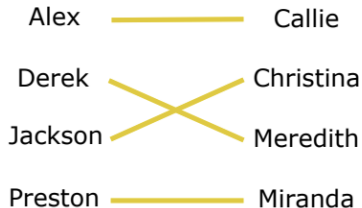
**"Perfect":** only means one-to-one mapping, not that people are happy with matches or its stable.

## Other "matching"

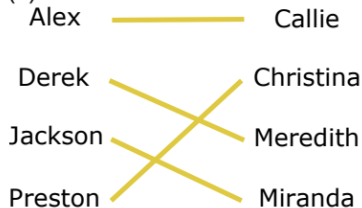
(a)



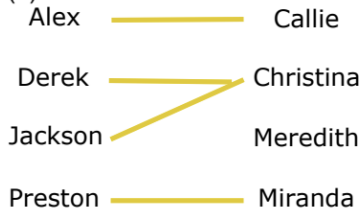
(b)



(c)



(d)

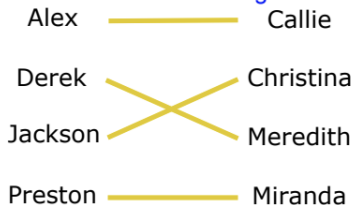


## Other "matching"

(a) Matching, not perfect



(b) Perfect matching



(c) Perfect matching



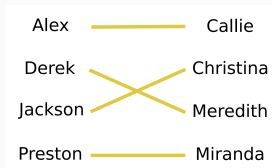
(d) Not a matching



# Our Matching

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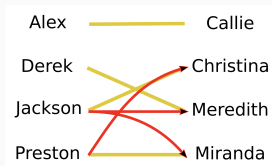


Are there problems with this matching?

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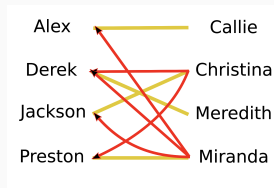


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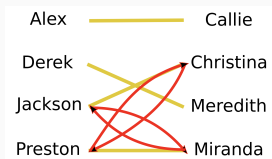


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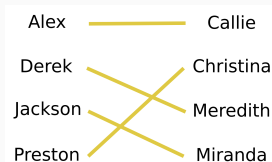


**Rogue couple:** a man and a woman who are not matched but prefer each other to their current partners.

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1. Given preferences for every woman and every man, does a stable matching exist?

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**Stable matching:** A perfect matching without any rogue couples.

## Questions

1. Given preferences for every woman and every man, does a stable matching exist?
2. If it does, can we compute it? How fast?

# The Algorithm

---

# Objective

- Given of preferences among employers (E) and applicants (A), can we come up with a stable matching?
- We will start with a simple version of the problem
  - Let's assume there are only two men and two women
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# Possible Matching

## Example

	W1	W2
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## Stable Matching

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## Stable Matching



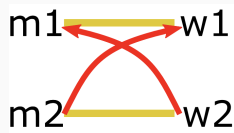
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## Stable Matching



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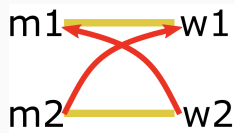
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	M1	M2
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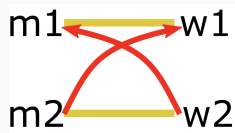
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M2	1	2

	M1	M2
W1	2	1
W2	2	1

## Stable Matching



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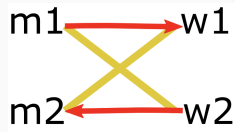
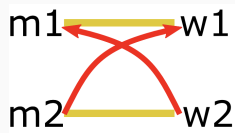
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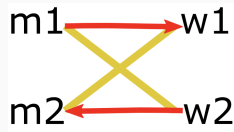
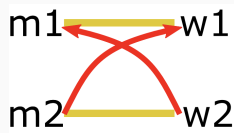
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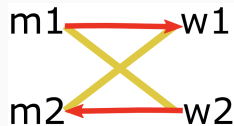
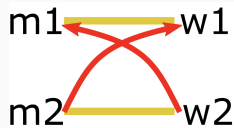
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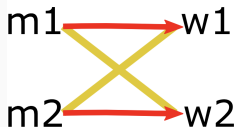
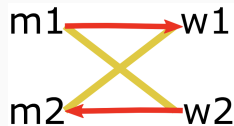
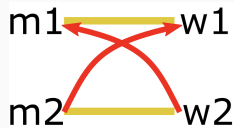
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## Stable Matching



## Challenge

Can you create an example that does not have a stable matching?



# GS Algorithm

```
Initially all men and women are free
while there is a man m who is free and hasn't proposed to ev
    Choose such a man m
    m proposes to the highest-ranked woman in m's preference
    if w is free then
        (m, w) become engaged -> Add (m,w) from S
    else if w is engaged to m' but prefers m to m' then
        m' becomes free -> Delete (m',w) from S
        (m, w) become engaged -> Add (m,w) from S
    else
        m remains free
return the set S of engaged pairs
```

# Does it work ?

## The Algorithm

- Each man proposes to each woman, in decreasing order of preference.
- Woman accepts if she is free or prefers new prospect to current fiancé.

## What can go wrong?

- Does the algorithm even terminate?
- If it does, how long does the algorithm take to run?
- If it does, is  $S$  a perfect matching? A stable matching ?

# Observations

- Gale-Shapley algorithm computes a matching, i.e., each woman paired with at most one man and vice versa.
- Man's status: Can alternate between being free and being engaged.
- Woman's status: Remains engaged after first proposal.
- Ranking of a man's partner: Remains the same or goes down.
- Ranking of a woman's partner: Can never go down.

## Proof?

Can we prove that that GS algorithm produces a **terminates** with **stable matching**

## Proof: Algorithm Terminates/Runtime

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    - No, since both can remain unchanged in an iteration.
  - Number of proposals made after  $k$  iterations?



## Proof: Algorithm Terminates/Runtime

- Is there some quantity that we can use to measure the progress of the algorithm in each iteration?
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  - Number of free women?
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  - Number of proposals made after  $k$  iterations?
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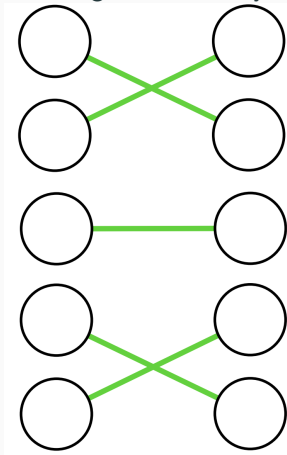
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    - Must increase by one in each iteration.
  - How many total proposals can be made?
    - $n^2$
    - The algorithm must terminate in  $n^2$  iterations

## Correctness Proof: Matching Computed is Perfect

- Suppose the set  $S$  of pairs returned by the GS algorithm is not perfect.
- $S$  is a matching. Therefore, there must be at least one free man  $m$ .
- $m$  has proposed to all the women (since algorithm terminated).
- Therefore, each woman must be engaged (since she remains engaged after the first proposal to her).
- Therefore, all men must be engaged, contradicting the assumption that  $m$  is free.
- **Proof that matching is perfect relies on**
  - proof that the algorithm terminated and
  - the very specific termination condition.

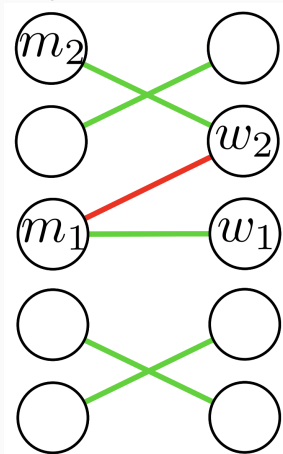
## Correctness Proof: Matching Computed is Stable

Perfect matching  $S$  returned by algorithm



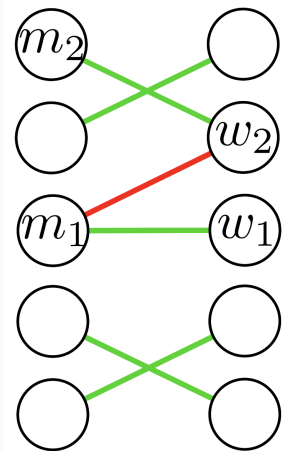
## Correctness Proof: Matching Computed is Stable

- Not stable:  $m_1$  paired with  $w_1$  but prefers  $w_2$ ;
- $w_2$  paired with  $m_2$  but prefers  $m_1$



## Correctness Proof: Matching Computed is Stable

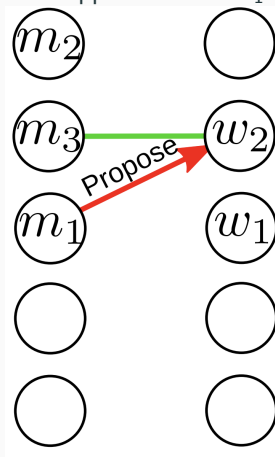
$m_1$  proposed to  $w_2$  before proposing to  $w_1$





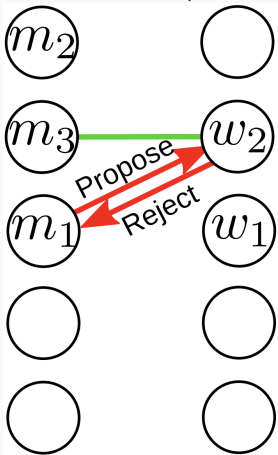
## Correctness Proof: Matching Computed is Stable

**Remember:** What happened when  $m_1$  proposed to  $w_2$ ?



## Correctness Proof: Matching Computed is Stable

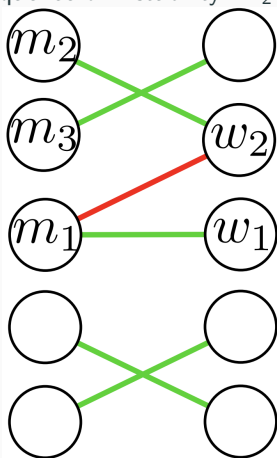
**Case 1:**  $w_2$  rejected  $w_1$  because she preferred current partner  $m_3$ ?



## Correctness Proof: Matching Computed is Stable

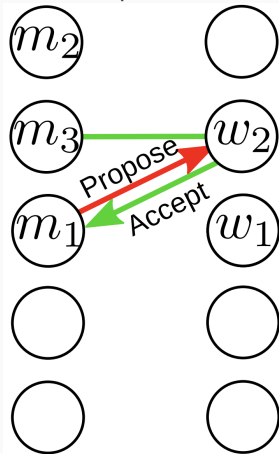
**Case 1:** At termination  $w_2$  must prefer her final partner  $m_2$  to  $m_3$ .

Contradicts consequence of instability:  $m_2$  prefers  $m_1$  to  $m_2$ ?



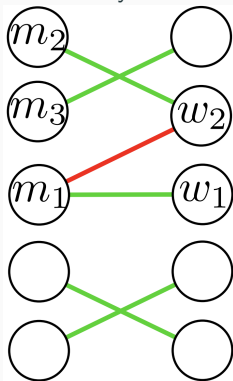
## Correctness Proof: Matching Computed is Stable

**Case 2:**  $w_2$  accepted  $m_1$  because she had no partner or preferred  $m_1$  to current partner  $m_3$ ?



## Correctness Proof: Matching Computed is Stable

**Case 2:** By instability, we know  $w_2$  prefers  $m_1$  to  $m_2$ . But at termination,  $w_2$  is matched with  $m_2$ , which contradicts property that a woman switches only to a better match.



## Correctness Proof: In Words

- Suppose  $S$  is not stable,
  - there are two pairs  $(m_1, w_1)$  and  $(m_2, w_2)$  in  $S$  such that  $m_1$  prefers  $w_2$  to  $w_1$  and  $w_2$  prefers  $m_1$  to  $m_2$ .
- $m_1$  must have proposed to  $w_2$  before  $w_1$
- At that stage  $w_2$  must have rejected  $m_1$ 
  - otherwise, the algorithm would pair  $m_1$  and  $w_2$ ,
  - would prevent the pairing of  $m_2$  and  $w_2$  in a later iteration of the algorithm.
- When  $w_2$  rejected  $m_1$ , she must have been paired with some man, say  $m_3$ , whom she prefers to  $m_1$ .
- Since  $m_2$  is paired with  $w_2$  at termination,  $w_2$  must prefer to  $m_2$  to  $m_3$  or  $m_2 = m_3$ ,
  - contradicts our conclusion that  $w_2$  prefers  $m_1$  to  $m_2$ .

## Variants: Hospitals and residents

- Multiple residents
  - Each hospital can take multiple residents.
  - Modification of Gale-Shapley algorithm works.
  - Some residents may not be matched.
  - Some hospitals may not fill quota.
- Hospitals and residents with couples
  - Each hospital can take multiple residents.
  - A couple must be assigned together, either to the same hospital or to a specific pair of hospitals chosen by the couple
  - **NP-Complete**

- Stable roommates
  - There is only one pool of people
  - Stable matching may not exist.
  - Irving's algorithm; more complex than Gale-Shapley.
- Complex preferences
  - Preferences may be incomplete or have ties or people may lie.
  - Several variants are NP-hard, even to approximate.



## A Few More Problems

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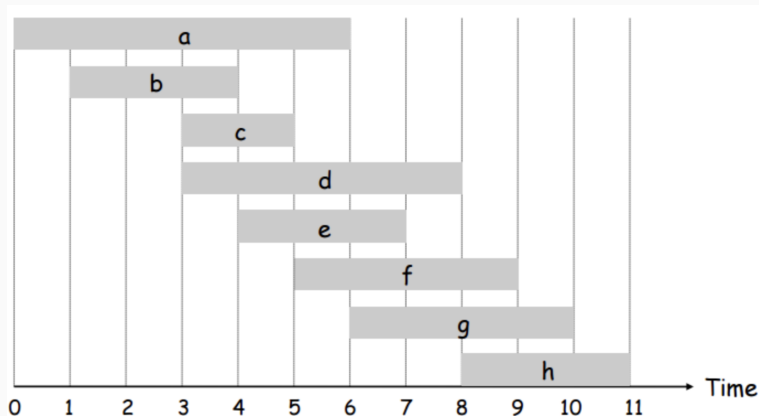
# Interval Scheduling: Idea

- Say you have a resource to be scheduled for
  - It may be a lecture room, a supercomputer, or an electron microscope
- Many people request to use the resource for periods of time.
- A request takes the form:
  - Can I reserve the resource starting at time  $s$ , until time  $f$  ?
- We will assume that the resource can be used by at most one person at a time.
- A scheduler wants to accept a subset of these requests, rejecting all others, so that the accepted requests do not overlap in time.
- The goal is to maximize the number of requests accepted.

# Interval Scheduling: Formally

- There will be  $n$  requests labeled  $1, \dots, n$
- Each request  $i$  specifying a start time  $s_i$  and a finish time  $f_i$
- We have  $s_i < f_i$  for all  $i$
- Two requests  $i$  and  $j$  are compatible if the requested intervals do not overlap:
  - either request  $i$  is for an earlier time interval than request  $j$  ( $f_i \leq s_j$ ),
  - or request  $i$  is for a later time than request  $j$  ( $f_j \leq s_i$ ).
- Generally that a subset  $A$  of requests is compatible if all pairs of requests  $i, j \in A, i \neq j$  are compatible.
- The goal is to select a compatible subset of requests of maximum possible size.
- Interval Scheduling has a **Greedy Algorithm Solution**

# Interval Scheduling: Visually



Visualization of Interval Scheduling <sup>1</sup>

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<sup>1</sup>Image Credit: [https://stumash.github.io/Algorithm\\_Notes/greedy/intervals/intervals.html](https://stumash.github.io/Algorithm_Notes/greedy/intervals/intervals.html)

# Weighted Interval Scheduling

- A modification to Interval Scheduling Problem
- Suppose more generally that each request interval  $i$  has an associated value, or weight,  $v_i > 0$ 
  - We could picture this as the amount of money we will make from the  $i^{th}$  individual if we schedule his or her request.
- Our goal will be to find a compatible subset of intervals of maximum total value.
- The case in which  $v_i = 1$  for each  $i$  is simply the basic Interval Scheduling Problem
- The appearance of arbitrary values changes the nature of the maximization problem quite a bit.

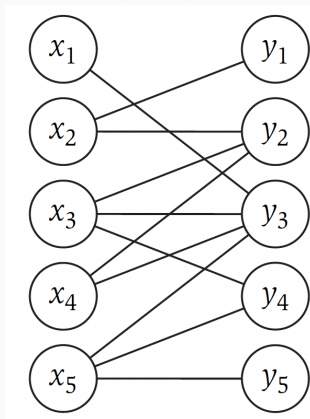
# Weighted Interval Scheduling

- Consider, for example, that if  $v_1$  exceeds the sum of all other  $v_i$ , then the optimal solution must include interval 1 regardless of the configuration of the full set of intervals.
- So any algorithm for this problem must be very sensitive to the values, and yet degenerate to a method for solving (unweighted) interval scheduling when all the values are equal to 1.
- There appears to be no simple greedy rule that walks through the intervals one at a time, making the correct decision in the presence of arbitrary values.
- Instead, we employ a technique, **dynamic programming**
- It builds up the optimal value over all possible solutions in a compact, tabular way that leads to a very efficient algorithm.

# Bipartite Matching

- A bipartite graph is a graph whose vertices can be divided into two disjoint sets  $U$  and  $V$  such that every edge connects a vertex in  $U$  to one in  $V$ .
- Bipartite matching involves finding a maximum matching, which is the largest subset of edges such that no two edges share a common vertex.
- Used in job assignments, network flows, and resource allocation.

# Bipartite Matching



A bipartite graph <sup>2</sup>

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<sup>2</sup>Image Credit: "Algorithm Design" Jon Kleinberg and Eva Tardos - Addison Wesley (2005)



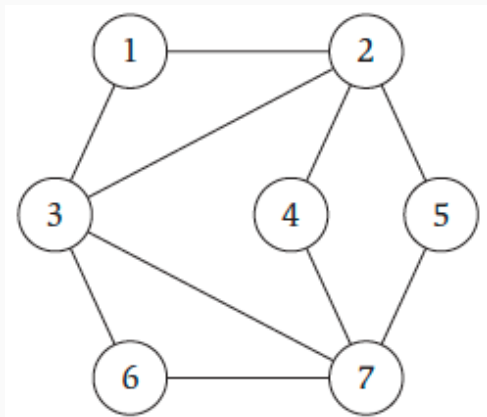
# Bipartite Matching

- **Maximum matching** is the largest set of edges with no shared vertices.
- **Perfect matching** a matching that covers every vertex in the graph.
- **Augmenting Path** a path that can increase the size of the current matching.
- **Algorithms for Bipartite Matching**
  - **Hungarian Algorithm:** Efficient for finding maximum matching in bipartite graphs.
  - **Hopcroft-Karp Algorithm:** Improves performance for large bipartite graphs.
- **Interval scheduling** can be transformed into a bipartite matching problem by representing intervals as nodes in a bipartite graph.

# Independent Set: The Problem

- Given a graph  $G = (V, E)$ , we say a set of nodes  $S \subseteq V$  is independent if no two nodes in  $S$  are joined by an edge.
- The Independent Set Problem is, then, the following: Given  $G$ , find an independent set that is as large as possible.
- The Independent Set Problem encodes any situation in which you are trying to choose from among a collection of objects and there are pairwise conflicts among some of the objects.
- Say you have  $n$  friends, and some pairs of them don't get along.
- How large a group of your friends can you invite to dinner if you don't want any interpersonal tensions?
- This is simply the largest independent set in the graph whose nodes are your friends, with an edge between each conflicting pair.

## Independent Set: Example



A graph whose largest independent set has size 4 (1,4,5,6).<sup>3</sup>

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<sup>3</sup>Image Credit: "Algorithm Design" Jon Kleinberg and Eva Tardos - Addison Wesley (2005)

## Independent Set: Runtime

- No efficient algorithm is known for the Independent Set problem, and it is conjectured that no such algorithm exists.
- The solution we have is the obvious brute-force algorithm
- Once a solution is found, we can check if it is correct in polynomial time
- This is a group of problems called NP-Complete

# Competitive Facility Location

- The Competitive Facility Location Problem is a strategic decision problem where companies compete to place their facilities (e.g., stores, warehouses) in a market.
- The goal is to maximize market share, profit, or another performance measure while considering the actions of competitors.
- Constraints to consider in location decisions:
  - Proximity to consumers to minimize transportation costs.
  - Legal and environmental regulations affecting feasible locations.
  - Spatial strategies to counteract competitors' locations.
- Solution
  - No efficient solution,
  - Not even an efficient way of check a solution
  - Heuristic methods
  - Approximation methods

# Conclusion

- In this lecture we discussed
  - Stable Matching Problem
  - A greedy algorithm as a solution
  - Analysis of the proposed algorithm (less formal)
  - Correctness
  - Runtime complexity
- Next lecture
  - No class on Monday
  - Algorithm Analysis
  - Read Chapter 2 of the textbook
  - Lecture note will be provided as a reference

**Questions?**

# Acknowledgment

Slide adapted from T. M. Murali with additional content from  
"Algorithm Design" Jon Kleinberg and Eva Tardos - Addison Wesley  
(2005)