

# Algorithms and Data Structures with Applications in Machine Learning

The Stable Matching Problem and The Gale-Shapley algorithm



December 8, 2024

Introducing the Stable Matching problem

The Gale-Shapley Algorithm

Optimality of The Gale-Shapley Algorithm



Introducing the Stable Matching problem

The Gale-Shapley Algorithm

Optimality of The Gale-Shapley Algorithm



## Bipartite Graph:

- ▶ A bipartite graph  $G = (U, V, E)$  consists of:
  - ▶ Two disjoint sets of vertices:  $U$  and  $V$ .
  - ▶ Edges  $E$ : Connect vertices in  $U$  to vertices in  $V$ , representing potential pairings.



## Bipartite Graph:

- ▶ A bipartite graph  $G = (U, V, E)$  consists of:
  - ▶ Two disjoint sets of vertices:  $U$  and  $V$ .
  - ▶ Edges  $E$ : Connect vertices in  $U$  to vertices in  $V$ , representing potential pairings.

## Objective:

- ▶ Find a matching between  $U$  and  $V$  such that:
  - ▶ Each vertex is matched to at most one vertex from the other set.
  - ▶ The matching satisfies a property called **stability** (to be defined later).



Stability is achieved using the **Gale-Shapley Algorithm**. This groundbreaking work led to the 2012 Nobel Prize in Economics for Lloyd Shapley and Alvin Roth.

Stability is achieved using the **Gale-Shapley Algorithm**. This groundbreaking work led to the 2012 Nobel Prize in Economics for Lloyd Shapley and Alvin Roth.

## Applications:

- ▶ Assigning students to universities (e.g., Parcoursup in France).



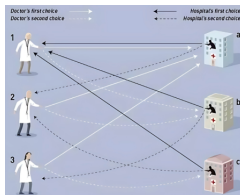
Stability is achieved using the **Gale-Shapley Algorithm**. This groundbreaking work led to the 2012 Nobel Prize in Economics for Lloyd Shapley and Alvin Roth.

## Applications:

- ▶ Assigning students to universities (e.g., Parcoursup in France).



- ▶ Matching medical residents to hospitals.







## Vocabulary:

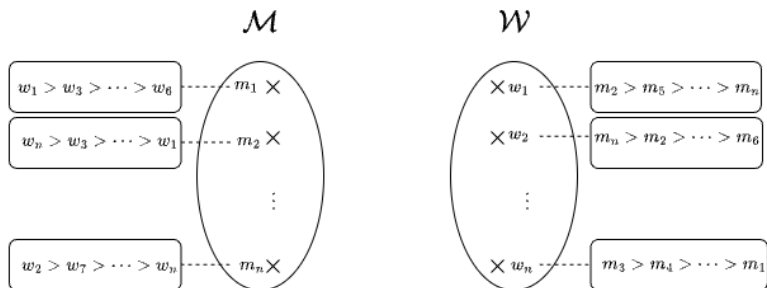
- ▶ To stay consistent with the original paper [1] by Gale and Shapley, we will use the terminology of “men” and “women” to describe the matching process.

## Vocabulary:

- ▶ To stay consistent with the original paper [1] by Gale and Shapley, we will use the terminology of “men” and “women” to describe the matching process.

## Philosophical Caveat:

- ▶ As Vladimir Jankélévitch reminds us in [2]: *‘L’amour ne veut rien savoir sur ce qu’il aime ; ce qu’il aime, c’est le centre de la personne vivante, parce que cette personne est pour lui une fin en soi, ipséité incomparable, mystère unique au monde.’*
- ▶ Translation: “Love doesn’t care to know what it loves; what it loves is the core of the living person, because this person is an end in itself, an incomparable selfhood, a unique mystery in the world.”



# An example



Ross



Rachel > Phoebe > Monica

Chandler



Monica > Phoebe > Rachel

Joey



Rachel > Phoebe > Monica

Rachel



Ross > Chandler > Joey

Monica



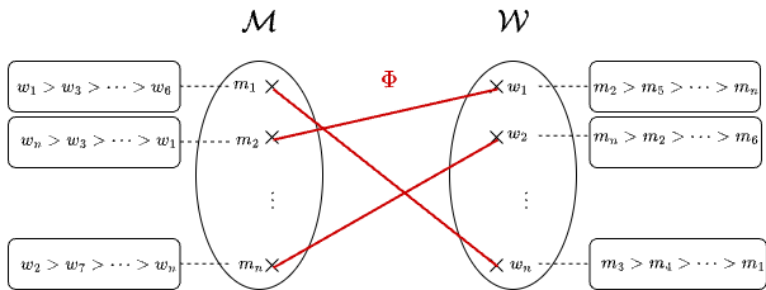
Chandler > Joey > Ross

Phoebe



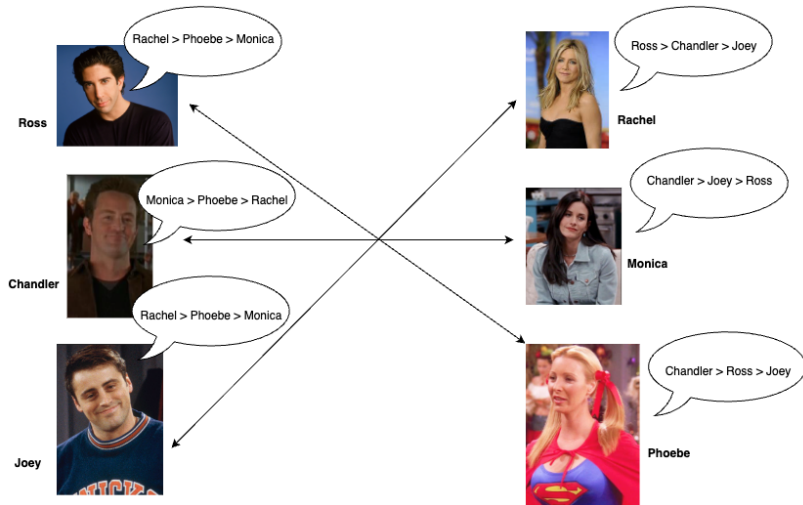
Chandler > Ross > Joey

# Defining a Matching



The resulting couples:  $\{(m, \Phi(m)), m \in \mathcal{M}\}$

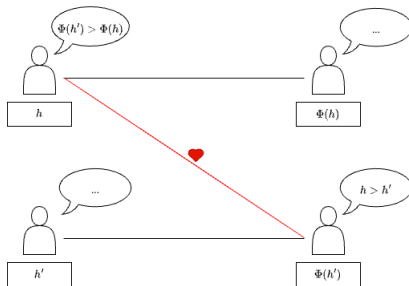
# An example of a Matching



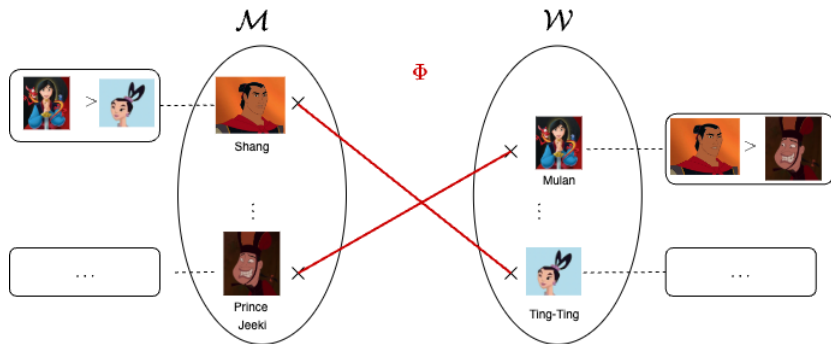
## Definition

A matching is said to be unstable if there exists a pair of individuals who would prefer to be matched with each other over their current partners.

## An example:



# An example of an instability

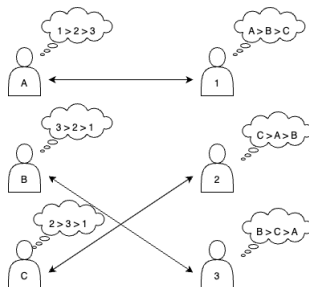




## Definition

A matching  $\phi : \mathcal{H} \rightarrow \mathcal{W}$  is said to be **stable** if there is no instability within the pairs  $\{m, \phi(m), m \in \mathcal{M}\}$ .

## An example:



# How Do We Build Stable Matchings?



**Question:** How do we construct a matching that satisfies the **stability** property?

**Naive Approach:** What if we take a *laissez-faire* approach and resolve every instability **iteratively**?

**For instance:**

# How Do We Build Stable Matchings?



- ▶ Iteratively addressing each instability might seem promising.
- ▶ However, could this process guarantee a **stable matching** in all cases?



Introducing the Stable Matching problem

The Gale-Shapley Algorithm

Optimality of The Gale-Shapley Algorithm

---

## Algorithm Gale-Shapley Algorithm

---

**Input:** Lists of preferences (men, women)

**Output:** Stable matching

```
1: All people start as free
2: while  $\exists$  free man  $m$  who hasn't proposed to all do
3:   Pick such a man  $m$ 
4:   Let  $w$  be next woman on  $m$ 's list
5:   if  $w$  is free then
6:     Engage  $m$  and  $w$ 
7:   else if  $w$  prefers  $m$  to current  $m'$  then
8:     Engage  $m$  and  $w$ , free  $m'$ 
9:   else
10:     $w$  rejects  $m$ 
11:   end if
12: end while
```

---

# The Gale-Shapley Algorithm: an Example



Introducing the Stable Matching problem

The Gale-Shapley Algorithm

Optimality of The Gale-Shapley Algorithm



- [1] David Gale and Lloyd S Shapley. “College admissions and the stability of marriage”. In: *The American Mathematical Monthly* 69.1 (1962), pp. 9–15.
- [2] Vladimir Jankélévitch and Béatrice Berlowitz. “Quelque part dans l’inachevé”. In: (1978).



**Thank you for your attention**