

## Stable Marriage

Suppose five men ( $A, B, C, D, E$ ) and five women ( $1, 2, 3, 4, 5$ ) enter a matchmaking service.<sup>1</sup>

The men and women have preferences:

Men	Preferences	Women	Preferences
$A$	$5 > 4 > 3 > 1 > 2$	$1$	$B > D > C > A > E$
$B$	$3 > 4 > 1 > 5 > 2$	$2$	$B > D > A > E > C$
$C$	$5 > 4 > 1 > 3 > 2$	$3$	$B > A > D > E > C$
$D$	$5 > 2 > 3 > 1 > 4$	$4$	$B > C > E > A > D$
$E$	$5 > 1 > 3 > 2 > 4$	$5$	$D > B > E > A > C$

How should we match the men and women?

<sup>1</sup>Apologies for the heteronormativity.

## 2 × 2 Stable Matchings

Men preferences match women preferences perfectly:

Men	Preferences	Women	Preferences
$A$	$1 > 2$	$1$	$A > B$
$B$	$2 > 1$	$2$	$B > A$

There is a unique stable matching:  $(A, 1), (B, 2)$ .

Men have the same preferences:

Men	Preferences	Women	Preferences
$A$	$1 > 2$	$1$	$A > B$
$B$	$1 > 2$	$2$	$B > A$

$(A, 1)$  and  $(B, 2)$  is stable, since  $A$  and  $1$  are happy.

- ▶ Observation: If a man and woman both like each other best, they must be together in any stable matching.

## Rogue Couples

Suppose that we pair together  $(A, 1)$  and  $(B, 2)$ .

- ▶ What happens if  $A$  likes  $2$  better than his current partner, and  $2$  likes  $A$  better than her current partner?
- ▶ There is an incentive to cheat, of course!

This is called a **rogue couple**.

A **matching** is when we pair each man with a unique woman.

The matching is called **stable** when there are no rogue couples.

Question for today: How can we find a stable matching? Do stable matchings even exist?

## 2 × 2 Stable Matchings

Men and women preferences clash:

Men	Preferences	Women	Preferences
$A$	$1 > 2$	$1$	$B > A$
$B$	$2 > 1$	$2$	$A > B$

Here, there are two stable pairings:

- ▶  $(A, 1), (B, 2)$ . Stable because the men are happy.
- ▶  $(A, 2), (B, 1)$ . Stable because the women are happy.

So, there may be multiple stable matchings. But, so far we have always been able to find at least one stable matching.

## Stable Matching Example

Men	Preferences	Women	Preferences
$A$	$5 > 4 > 3 > 1 > 2$	$1$	$B > D > C > A > E$
$B$	$3 > 4 > 1 > 5 > 2$	$2$	$B > D > A > E > C$
$C$	$5 > 4 > 1 > 3 > 2$	$3$	$B > A > D > E > C$
$D$	$5 > 2 > 3 > 1 > 4$	$4$	$B > C > E > A > D$
$E$	$5 > 1 > 3 > 2 > 4$	$5$	$D > B > E > A > C$

Is the matching  $(A, 1), (B, 2), (C, 3), (D, 4), (E, 5)$  stable?

- ▶ Do you spot any rogue couples?
- ▶ One example of a rogue couple:  $(D, 5)$ .

## Stable Roommates

It is not obvious that stable matchings always exist.

Consider a variant: in the **stable roommates** problem we no longer have men/women.

Person	Preference
$A$	$B > C > D$
$B$	$C > A > D$
$C$	$A > B > D$
$D$	$A > B > C$

No matter how we assign roommates, we have a rogue pair.

- ▶  $(A, B), (C, D)$ :  $(B, C)$  is a rogue pair.
- ▶  $(A, C), (B, D)$ :  $(A, B)$  is a rogue pair.
- ▶  $(A, D), (B, C)$ :  $(A, C)$  is a rogue pair.

## Gale-Shapley Algorithm

Gale and Shapley gave an algorithm for finding a stable matching. Their work led to a Nobel Prize in Economics.

Since then, the algorithm has found many applications:

- ▶ Match new doctors to hospital residency programs.
- ▶ Match organ transplant patients to organs.
- ▶ And more...

Here is the algorithm (men propose version).

- ▶ On each "day", each man without a partner proposes to the women highest up in his list.
- ▶ At the end of each "day", each woman *tentatively* accepts her most preferred suitor and rejects every other man.
- ▶ Terminate when every woman has a suitor.

## Algorithm Example, Day 3

Men	Preferences	Women	Preferences
A	5 > 4 > 3 > 1 > 2	1	B > D > C > A > <b>E</b>
B	3 > 4 > 1 > 5 > 2	2	B > D > A > E > C
C	5 > 4 > 1 > 3 > 2	3	<b>B</b> > A > D > E > C
D	5 > 2 > 3 > 1 > 4	4	B > <b>C</b> > E > A > D
E	5 > 1 > 3 > 2 > 4	5	<b>D</b> > B > E > A > C

Men propose:

- ▶ A proposes to 3.

Women respond:

- ▶ 3 rejects A in favor of B.

## Algorithm Example, Day 1

Men	Preferences	Women	Preferences
A	5 > 4 > 3 > 1 > 2	1	B > D > C > A > E
B	3 > 4 > 1 > 5 > 2	2	B > D > A > E > C
C	5 > 4 > 1 > 3 > 2	3	B > A > D > E > C
D	5 > 2 > 3 > 1 > 4	4	B > C > E > A > D
E	5 > 1 > 3 > 2 > 4	5	D > B > E > A > C

Men propose:

- ▶ B proposes to 3.
- ▶ A, C, D, and E propose to 5.

Women respond:

- ▶ 3 tentatively accepts B.
- ▶ 5 tentatively accepts D; rejects A, C, E.

## Algorithm Example, Day 2

Men	Preferences	Women	Preferences
A	5 > 4 > 3 > 1 > 2	1	B > D > C > A > E
B	3 > 4 > 1 > 5 > 2	2	B > D > A > E > C
C	5 > 4 > 1 > 3 > 2	3	<b>B</b> > A > D > E > C
D	5 > 2 > 3 > 1 > 4	4	B > C > E > A > D
E	5 > 1 > 3 > 2 > 4	5	<b>D</b> > B > E > A > C

Men propose:

- ▶ E proposes to 1.
- ▶ A and C propose to 4.

Women respond:

- ▶ 1 tentatively accepts E.
- ▶ 4 tentatively accepts C; rejects A.

## Algorithm Example, Day 4

Men	Preferences	Women	Preferences
A	5 > 4 > 3 > 1 > 2	1	B > D > C > A > <b>E</b>
B	3 > 4 > 1 > 5 > 2	2	B > D > A > E > C
C	5 > 4 > 1 > 3 > 2	3	<b>B</b> > A > D > E > C
D	5 > 2 > 3 > 1 > 4	4	B > <b>C</b> > E > A > D
E	5 > 1 > 3 > 2 > 4	5	<b>D</b> > B > E > A > C

Men propose:

- ▶ A proposes to 1.

Women respond:

- ▶ 1 rejects E in favor of A.

## Algorithm Example, Day 5

Men	Preferences	Women	Preferences
A	5 > 4 > 3 > 1 > 2	1	B > D > C > <b>A</b> > E
B	3 > 4 > 1 > 5 > 2	2	B > D > A > E > C
C	5 > 4 > 1 > 3 > 2	3	<b>B</b> > A > D > E > C
D	5 > 2 > 3 > 1 > 4	4	B > <b>C</b> > E > A > D
E	5 > 1 > 3 > 2 > 4	5	<b>D</b> > B > E > A > C

Men propose:

- ▶ E proposes to 3.

Women respond:

- ▶ 3 rejects E in favor of B.

## Algorithm Example, Day 6

Men	Preferences	Women	Preferences
A	$B > A > E > 1 > 2$	1	$B > D > C > A > E$
B	$3 > 4 > 1 > 5 > 2$	2	$B > D > A > E > C$
C	$B > 4 > 1 > 3 > 2$	3	$B > A > D > E > C$
D	$5 > 2 > 3 > 1 > 4$	4	$B > C > E > A > D$
E	$B > A > E > 2 > 4$	5	$D > B > E > A > C$

### Men propose:

- ▶ E proposes to 2.

### Women respond:

- ▶ 2 tentatively accepts E.

Since all women now have a suitor, the algorithm terminates with the pairing (A, 1), (B, 3), (C, 4), (D, 5), (E, 2).

## Algorithm Correctness

**Theorem:** The Gale-Shapley algorithm output is stable.

### Proof.

- ▶ Suppose the result of the algorithm is not stable, i.e., there is a rogue couple  $(M, W)$ .
- ▶ Say that the algorithm pairs  $(M, W')$  and  $(W, M')$ .
- ▶ So,  $M$  prefers  $W$  over  $W'$ , and  $W$  prefers  $M$  over  $M'$ .
- ▶ So,  $M$  proposes to  $W$  before he proposes to  $W'$ .
- ▶ But, since  $M$  proposes to  $W'$  later, that means he must have gotten rejected by  $W$ .
- ▶ That means  $W$  must have found a better guy than  $M$ . But  $W$ 's suitors can only get better each day!
- ▶ This means  $W$  must end up with a guy she likes better than  $M$ . Contradiction.  $\square$

## Algorithm Termination

**Theorem:** The Gale-Shapley algorithm terminates in finite time for any stable marriage instance.

### Proof.

- ▶ Each day of the algorithm, at least one man is proposing.
- ▶ If no man gets rejected, the algorithm immediately terminates.
- ▶ So, each day that the algorithm runs, at least one man gets rejected.
- ▶ So, each day that the algorithm runs, at least one man crosses off one woman from his preference list.
- ▶ If there are  $n$  men, the men's preference lists have a total of  $n^2$  entries, so the algorithm terminates in  $\leq n^2$  days.  $\square$

## Algorithm Termination

If every man has a different first choice, how many days does the algorithm require? Just one!

On the other hand, there are instances which require  $\Omega(n^2)$  days to complete, where  $n$  is the number of men/women.

There can be exponentially many stable marriages.

## Which Stable Matching?

We saw that there can be multiple stable matchings. Which one does the Gale-Shapley algorithm output?

Men	Preferences	Women	Preferences
A	$1 > 2$	1	$B > A$
B	$2 > 1$	2	$A > B$

Recall: The stable matching  $(A, 1), (B, 2)$  favors the guys, and  $(A, 2), (B, 1)$  favors the gals.

Run Gale-Shapley. The algorithm ends in one day, and the pairing is  $(A, 1), (B, 2)$ .

Does the Gale-Shapley algorithm favor the men?

## Optimality

We say that a stable matching is **optimal** for a man if his partner in this matching is the best possible partner he can have, out of all possible stable matchings.

Men	Preferences	Women	Preferences
A	$1 > 2$	1	$B > A$
B	$2 > 1$	2	$A > B$

Which stable matchings are optimal for A?

- ▶ All possible stable matchings:  $(A, 1), (B, 2)$  and  $(A, 2), (B, 1)$ .
- ▶ What are all the possible women that A can end up with, out of the possible stable matchings?  $\{1, 2\}$
- ▶ Out of these women, which does A like best? 1
- ▶ Therefore, any stable matching in which A ends up with 1 is optimal for A.

## Optimality vs. Most Preferred

Is a man's optimal partner the same as the first person in his preference list?

Men Preferences		Women Preferences	
A	1 > 2	1	B > A
B	1 > 2	2	B > A

What are the stable matchings? Only (A,2), (B,1).

In *any* stable matching, A must be partnered with 2. So the best he can do is 2 (his optimal partner).

So, A's optimal partner is *not* the same as his most preferred partner. 1 is unattainable for A.

## Notes on the Optimality Result

How do we modify the Gale-Shapley algorithm to favor the women?

- ▶ Switch the roles of men and women.
- ▶ In other words, the women propose.

The Gale-Shapley algorithm is good for men. Is it necessarily bad for women?

- ▶ A man is **pessimal** for a woman if, out of all stable matchings, this man is her least preferred partner.
- ▶ A stable matching is **female pessimal** if every woman is with her pessimal partner.

## Male Optimality

We say that a stable matching is **male optimal** if *every* man is paired with his optimal partner.

- ▶ This is a pretty strong condition— all men are happy simultaneously!

Men Preferences		Women Preferences	
A	1 > 2	1	B > A
B	2 > 1	2	A > B

Here, (A,1), (B,2) is male optimal because it is stable and every man gets his first choice.

## Male Optimal Is Female Pessimal

**Theorem:** Consider two different stable matchings,  $\mu_1$  and  $\mu_2$ . If every man likes  $\mu_1$  as much as  $\mu_2$ , then every woman likes  $\mu_2$  as much as  $\mu_1$ .

*Proof.*

- ▶ Take a pair (M, W) in  $\mu_1$  which is not matched in  $\mu_2$ .
- ▶ If both M and W prefer  $\mu_1$ , that means M and W like each other more than their partners in  $\mu_2$ .
- ▶ This is a rogue couple!
- ▶ So, if M prefers  $\mu_1$ , then W prefers  $\mu_2$ . ◻

Every man prefers the male optimal matching over any other stable matching. So, every woman prefers any other stable matching over the male optimal matching.

- ▶ The male optimal matching is female pessimal.

## Male Optimality for Gale-Shapley

**Theorem:** The Gale-Shapley algorithm outputs a male optimal stable matching.

*Proof.*

- ▶ Suppose that the output is not male optimal.
- ▶ Consider the first day in which some man M is rejected by his optimal partner W (Well Ordering Principle).
- ▶ Since W rejects M, that means she had a man she likes better: call him M'.
- ▶ M' has not yet been rejected by his optimal woman. So, W is at least as good as the optimal woman for M'.
- ▶ Since W is optimal for M, there exists a **stable matching** in which M is paired with W.
- ▶ But W likes M' more than M, and M' likes W at least as much as his partner. This is a **rogue couple**. ◻

## Male Optimal Is Female Pessimal

More details:

- ▶ Every woman prefers any other stable matching over the male optimal matching.
- ▶ For a particular woman W, let her pessimal partner be M.
- ▶ There is some stable matching in which M and W are paired together.
- ▶ Since W prefers this matching over the male optimal matching, that means W must be matched with M in the male optimal matching.
- ▶ So, every woman is matched with her pessimal partner in the male optimal matching.

## Summary

- ▶ We are given  $n$  men and  $n$  women with preference lists. We want a matching: an assignment of men to women.
- ▶ A rogue couple is a pair who prefer each other to their partners. A matching without a rogue couple is stable.
- ▶ The Gale-Shapley algorithm outputs a stable matching.
- ▶ A stable matching is male optimal if every man prefers this matching over any other stable matching.
- ▶ A stable matching is female pessimal if every woman prefers any other stable matching over this matching.
- ▶ The Gale-Shapley algorithm (with men proposing) is male optimal and female pessimal.