## Stable Matching

Selected Topics in Algorithms

А $\Lambda \mathrm{MA}, \Sigma \mathrm{HMM} \mathrm{\Upsilon}$



## Matchings

Match (optimally) a set of applicants to a set of open positions.

- Applicants to summer internships
- Applicants to graduate school
- Medical school graduate applicants to residency programs
- Eligible males wanting to marry eligible females

Input: males and females with their preference lists

- Every male has a preference list for women
- Every female has a preference list for men

Output: a matching with specific properties

## Stablity and Instability

Consider a matching $S$ between men and women

## Unstable Pair

Male $x$ and female $y$ are unstable in $S$ if:

- $x$ prefers $y$ to its matched female
- $y$ prefers $x$ to its matched male


## Stable Matching

$S$ is stable if there are no unstable pairs in $S$.

## Formulating the Problem

Consider a set $M=\left\{m_{1}, \ldots, m_{n}\right\}$ of $n$ men and a set $W=\left\{w_{1}, \ldots, w_{n}\right\}$ of $n$ women.

- A matching $S$ is a set of ordered pairs, each from $M \times W$, s.t. each member of $M$ and each member of $W$ appears in at most one pair in $S$.
- A perfect matching $S^{\prime}$ is a matching s.t. each member of $M$ and each member of $W$ appears in exactly one pair in $S^{\prime}$.
- Each man $m \in M$ ranks all of the women; $m$ prefers $w$ to $w$ if $m$ ranks $w$ higher than $W$. We refer to the ordered ranking of $m$ as his preference list.
- Each woman ranks all of the men in the same way.
- An instability results when a perfect matching $S$ contains two pairs $(m, w)$ and $\left(m^{\prime}, W\right)$ s.t. $m$ prefers $W$ to $w$ and $W$ prefers $m$ to $m^{\prime}$.

GOAL: A perfect matching with no instabilities.

## An Example

Is the assignment $\mathrm{X}-\mathrm{C}, \mathrm{Y}-\mathrm{B}, \mathrm{Z}-\mathrm{A}$ stable?

|  | favorite <br> $\downarrow$ |  | least favorite <br> $\downarrow$ |
| :---: | :---: | :---: | :---: |
|  | $1^{\text {st }}$ | $2^{\text {nd }}$ | 3rd |
| Xavier | Amy | Bertha | Clare |
| Yancey | Bertha | Amy | Clare |
| Zeus | Amy | Bertha | Clare |

Men's Preference Profile


Women's Preference Profile

No. Bertha and Xavier would hook up.

## Questions About Stable Marriage

(1) Does there exist a stable matching for every set of preference lists?
(2) Given a set of preference lists, can we efficiently construct a stable matching if there is one?

## The Gale-Shapley Algorithm

Initially set all $m \in M$ and $w \in W$ to free.
While $\exists m$ who is free and hasn't proposed to every $w \in W$ do

- Choose such a man $m$;
- $w$ is highest ranked in $m$ 's preference list to whom $m$ has not yet proposed
- If $w$ is free
then ( $m, w$ ) become engaged
else let $m^{\prime}$ be her current match
- If $w$ prefers $m^{\prime}$ to $m$
then $m$ remains free
else ( $m, w$ ) become engaged and $m^{\prime}$ becomes free
endWhile return the set $S$ of engaged pairs


## But Does it Work?

## Some Observations

- w remains engaged from the point at which she receives her first proposal
- the sequence of partners with which $w$ is engaged gets increasingly better (in terms of her preference list)
- the sequence of women to whom $m$ proposes get increasingly worse (in terms of his preference list)

Men propose to women in decreasing order of preference (men "optimistic").

Once a woman is matched, she never becomes unmatched (only "trades up").

## Termination

## Theorem

The G-S algorithm terminates after at most $n^{2}$ iterations of the while loop.

What is a good measure of progress?

- the number of free men?
- the number of engaged couples?
- the number of proposals made?


## Proof by counting proposals

- Each iteration consists of one man proposing to a woman he has never proposed to before.
- After each iteration of the while loop, the number of proposals increases by one
- Every man proposes at most once to a woman: $\mid$ proposals $\mid \leq n^{2}$


## A Perfect Matching Returned

## Theorem

The set $S$ returned at termination is a perfect matching.

## Proof

- It is a matching since it only trades pairs with the same woman
- Women only trade up, thus once matched, remain matched.
- There is no free man at the end: He has proposed to all women so all of them should be matched.


## and Stable

## Theorem

If the algorithm returns a matching $S$, then $S$ is a stable matching.

## Proof (by contradiction)

- Let pairs $(m, w)$ and $\left(m^{\prime}, w\right)$ in $S$ be s.t.
- $m$ prefers $w$ to $w$, i.e., $W>_{m} w$, and
- $w$ prefers $m$ to $m^{\prime}$, i.e., $m>_{w^{\prime}} m^{\prime}$.
- $m$ proposed to $W$ in the past and at some point got rejected for $m^{\prime \prime}$.
- In the preference list of $W: m^{\prime \prime}>_{w^{\prime}} m$ and $m^{\prime} \geq_{w^{\prime}} m^{\prime \prime}$.
- $m$ is below $m^{\prime}$ in the preference list of $W$, contradiction.


## and Stable

## Theorem

If the algorithm returns a matching $S$, then $S$ is a stable matching.

## Proof (by picture)

## ( $\mathrm{m}, \mathrm{w}$ ) an arbitrary pair in S

m's list for women

- Women in blue:
rejected m in the algorithm only trade up

prefer their current match, no unstable pair here
- A yellow woman $<_{\mathrm{m}} \mathrm{W}$ m preferes his current match, no unstable pair here

| $W_{1}$ |
| :---: |
| $W_{2}$ |
| $\vdots$ |
| $W_{k}$ |
| $W$ |
| $W_{k+2}$ |
| $W_{k+3}$ |
| $\vdots$ |
|  |
| $W_{n}$ |

## Summary

The Gale-Shapley algorithm guarantees to find a stable matching.

- Are there multiple stable matchings?
- If multiple stable matchings, which to choose??
- Which one does the algorithm find? (Any properties?)


## Understanding the Solution

For a given problem instance, there may be several stable matchings. Do all executions of Gale-Shapley yield the same stable matching? If so, which one?

An instance with two stable matchings:
A-X, B-Y, C-Z
A-Y, B-X, C-Z

|  | $1^{\text {st }}$ | $2^{\text {nd }}$ | $3^{\text {rd }}$ |
| :---: | :---: | :---: | :---: |
| Xavier | A | B | C |
| Yancey | B | A | C |
| Zeus | A | B | C |


|  | $1^{\text {st }}$ | $2^{\text {nd }}$ | $3^{\text {rd }}$ |
| :---: | :---: | :---: | :---: |
| Amy | Y | X | $Z$ |
| Bertha | $X$ | Y | $Z$ |
| Clare | $X$ | Y | $Z$ |

## Proposer Optimal Solution Returned

- Man $m$ and woman $w$ are valid partners if there exists some stable matching in which they are matched
- A man-optimal matching is one in which every man receives the best valid partner
- Claim 1: All executions of GS yield man-optimal assignment, which is a stable matching.
- Claim 2: All executions of GS yield woman-pessimal assignment, which is a stable matching (i.e., each woman receives the worst possible valid partner).


## Claim 1: man-optimality

By contradiction: Let $S^{\prime}$ be a stable matching where $m$ is better off.

- Let $(m, w)$ be a pair in $S^{\prime}$
- In the algorithm $m$ proposed to $w$ and got rejected for some $m^{\prime}$, thus

$$
m^{\prime}>_{w} m
$$

Assume this is the first rejection by a valid partner

- Let $\left(m^{\prime}, W\right)$ be a pair in $S^{\prime} \Rightarrow W^{\prime}$ valid for $m^{\prime}$

First rejection by a valid women: w rejected m for m '
Algorithm's Timeline


No rejection by a valid pair here

$\longrightarrow \mathrm{m}^{\prime}$ didn't propose to $\mathrm{w}^{\prime}$ here $\longrightarrow \mathrm{w} \underset{\mathrm{m},}{ } \mathrm{w}^{\prime}$ $\mathrm{w}^{\prime}$ valid for $\mathrm{m}^{\prime}$

- $S^{\prime}$ not stable: $\left[(m, w) \in S^{\prime}\right] \&\left[\left(m^{\prime}, w^{\prime}\right) \in S^{\prime}\right] \&\left[m^{\prime}>_{w} m\right] \&$ $\left[w>_{m^{\prime}} W^{\prime}\right]$


## Claim 2: woman-pessimality

By contradiction: Let $S$ be the algorithm's matching

- Let $(m, w) \in S$ and $m$ not worst valid for $w$.
- Exists $S^{\prime}$ with $\left(m^{\prime}, w\right) \in S^{\prime}$ and

$$
m>_{w} m^{\prime}
$$

- Let $\left(m, w^{\prime}\right) \in S^{\prime}$ be partner of $m$ in $S^{\prime}$. By man optimality

$$
w>_{m} W
$$

- $S^{\prime}$ not stable: $\left[(m, w) \in S^{\prime}\right] \&\left[\left(m^{\prime}, W\right) \in S^{\prime}\right] \&\left[m^{\prime}>_{w} m\right] \&$ $\left[w>_{m^{\prime}} W^{\prime}\right]$


## Incentives - Strategy Proofness

Slight extension where players can mark others as unacceptable

- Truthtelling is still proposer-optimal
- Proposal-receivers may benefit by misreporting

Truthful reporting

| Albert | Diane | Emily |  | Diane | Bradley |
| :--- | :--- | :--- | :--- | :--- | :--- |
| Albert |  |  |  |  |  |
| Bradley | Emily | Diane |  | Emily | Albert |
| Bradley |  |  |  |  |  |
| Albert | Diane | Emily |  | Diane | Bradley |
| Bradley | Emily | Diane |  | Emily | Albert |

Strategic reporting

| Albert | Diane | Emily |
| :--- | :--- | :--- |
| Bradley | Emily | Diane |
| Albert | Diane | Emily |
| Bradley | Emily | Diane |


| Diane | Bradley | $\Theta$ |
| :--- | :--- | :--- |
| Emily | Albert | Bradley |
| Diane | Bradley | $\Theta$ |
| Emily | Albert | Bradley |

## Impossibility results

There is no matching mechanism that
(1) is strategy proof for both sides and
(2) always results in a stable outcome (given revealed preferences)

Consider a many-to-one extension where "men" can have up to $q$ "women" (classes and students)

These problems look very similar yet

- No algorithm exists s.t. truthtelling is dominant strategy for "men"


## Leaving Bipartite Graphs

Consider the stable roommate problem. $2 n$ people each rank the others from 1 to $2 n-1$. The goal is to assign roommate pairs so that none are unstable.

|  | $1{ }^{s t}$ | $2{ }^{\text {nd }}$ | $3{ }^{\text {rd }}$ |  |
| :---: | :---: | :---: | :---: | :---: |
| Adam | B | C | D |  |
| Bob | $C$ | A | D | $A-B, C-D \quad \Rightarrow \quad B-C$ unstable <br> $A-C, B-D \Rightarrow A-B$ unstable |
| Chris | A | B | D | $A-D, B-C \Rightarrow A-C$ unstable |
| Doofus | A | B | C |  |

Observation: a stable matching doesn't always exist.

## Irving 1985

There exists an algorithm returning a matching or deciding non existence.
(Builds on Gale-Shapley ideas and work by McVitie and Wilson '71)

