# Matching Problems 

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## Summary of the slides

(1) Matching problems
© Stable matching

- Partial order on stable matching
- Extensions


## Background setting

Problems introduced in 1962 by Gale and Shapley for the study of two sided markets:
(1) workers \& employers
© interns \& hospitals

- students \& universities
- women \& men
- pairs of donor patients in a kidney transplant program
- ...

First basic question: what does mean find a (efficient) solution in this case?

## First basic version

## WOMEN \& MEN

Basic ingredients

- Two groups: $\mathcal{W}$ and $\mathcal{M}$
- Each element of $\mathcal{W}(\mathcal{M})$ has a ranking on the elements of $\mathcal{M}(\mathcal{W})$
- Goal: forming efficient pairs

This is called one to one matching
Further assumptions (to be used here, not necessary for the results)

- The two groups have the same number of elements
- All elements of a group rank all elements of the other group

Typical example: matching women and men, with the further assumption of having the same number of women and men and better to be matched in any case than being alone

## More definitions

## Definition

A matching problem is given by:
(1) a pair of sets $\mathcal{W}$ and $\mathcal{M}$ with the same cardinality
(2) a pair of preference profiles $\left(\left\{\succcurlyeq_{w}\right\}_{w \in \mathcal{W}},\left\{\succcurlyeq_{m}\right\}_{m \in \mathcal{M}}\right)$, with $\succcurlyeq_{m}$ defined on $\mathcal{W}$ and conversely $\succcurlyeq_{w}$ defined on $\mathcal{M}$

## Definition

A matching is a bijection $b: \mathcal{W} \rightarrow \mathcal{M}$

## An example

From now on men small letters in blue, women capital letters in red

$$
\begin{aligned}
\mathcal{W} & =\{\text { Anna, Giulia, Maria }\} \\
\mathcal{M} & =\{\text { Bob, Frank, Emanuele }\}
\end{aligned}
$$

The following is a matching
[(Anna, Emanuele), (Giulia, Bob), (Maria, Frank)].

## Stable matching

## Definition

A pair $W-m$ objects to the matching $\Lambda$ if $m$ and $W$ both prefer each other to the person paired to them in the matching $\Lambda$.

For instance:

$$
\Lambda=\{(m, Z),(b, W), \ldots\}
$$

and

$$
m \succ_{w} b \quad \wedge \quad W \succ_{m} Z .
$$

$W-m$ is an objecting pair.

## Definition

A matching $\wedge$ is called stable provided there is no pair woman-man objecting to $\Lambda$

## Example

$$
\mathcal{M}=\{a, b, c, d\}, \mathcal{W}=\{A, B, C, D\}
$$

Preferences men:

- $D \succ_{a} C \succ_{a} B \succ_{a} A, \quad B \succ_{b} A \succ_{b} C \succ_{b} D$
- $D \succ_{c} A \succ_{c} C \succ_{c} B, \quad A \succ_{d} D \succ_{d} C \succ_{d} B$.

Preferences women:

- $b \succ_{A} a \succ_{A} c \succ_{A} d, \quad b \succ_{B} d \succ_{B} a \succ_{B} c$
- $b \succ_{c} d \succ_{c} c \succ_{c} a, \quad b \succ_{D} c \succ_{D} d \succ_{D} a$.

Two matchings:
$\Lambda=\{(a, A),(b, C),(c, B),(d, D)\} \Omega=\{(a, C),(b, B),(c, D),(d, A)\}$
$\Lambda$ unstable a-B objecting pair
$\Omega$ stable

## Existence of stable matching

## Theorem

Every matching problem admits a stable matching

## Proof

Constructive proof: algorithm night by night
(1) Stage 1a) Every woman visits, the first night, her most preferred choice. Stage 1b) Every man chooses among the women he finds in front of his house (if any). If every woman is matched, the algorithm ends, otherwise go to stage 2
(2) Stage 2a) Every woman dismissed at the previous stage visits her second choice. Stage 2b) Every man chooses among the women he finds in front of his house (if any), he dismisses the woman already in the house, if someone at the door is better for him. If every woman is matched, the algorithm ends, otherwise go to stage $k$
(3) Stage ka) Every woman dismissed at the previous stage visits her choice after the man dismissing her. Stage kb) Every man chooses among the women he finds in front of his house (if any), he dismisses the woman already in the house, if someone at the door is better for him. If every woman is matched, the algorithm ends, otherwise go to stage $k$.

Claim. The algorithm ends and the resulting matching is stable

## Preliminary remarks

Easy to see
(1) The women go down with their preferences along the algorithm
(2) The men go up with their preferences along the algorithm

- If a man is visited at stage $r$, then from stage $r+1$ on, he will never be alone
- The algorithm generically provides two matchings


## Proof: continued

Fact 1 The algorithm ends, and every man is matched to a woman. Actually every woman can at most visit $n$ men. Thus a first estimate is that at most $n^{2}$ days are needed. An immediate better estimate is available noticing that the first night all women are involved, thus $n^{2}-n+1$ is a better estimate (yet, it is not sharp). Moreover, every man is visited at some stage since every woman likes better to be paired than to remain alone

Fact 2 No woman can be part of an objecting pair for the resulting matching
Consider the woman W
(1) She cannot be part of an objecting pair with a man $m$ she did not visit: she is married to a man preferred to all of them
(2) She cannot be part of an objecting pair with a man $m$ she already visited either: dismissed in favor of another woman, by transitivity she cannot be preferred to the woman matched to $m$

The matching built by the algorithm is stable

## Example revisited

Preferences men:

- $D \succ_{a} C \succ_{a} B \succ_{a} A, \quad B \succ_{b} A \succ_{b} C \succ_{b} D$
- $D \succ_{c} A \succ_{c} C \succ_{c} B, \quad A \succ_{d} D \succ_{d} C \succ_{d} B$.

Preferences women:

- $b \succ_{A} a \succ_{A} c \succ_{A} d, \quad b \succ_{B} d \succ_{B} a \succ_{B} c$
- $b \succ_{c} d \succ_{c} c \succ_{C} a, \quad b \succ_{D} c \succ_{D} d \succ_{D} a$

Men visiting:

$$
\{(a, C),(b, B),(c, D),(d, A)\}
$$

Women visiting

$$
\{(a, A),(b, B),(c, D),(d, C)\}
$$

## One more example

Preferences men

- $A \succ_{a} B \succ_{a} C, \quad C \succ_{b} A \succ_{b} B, \quad B \succ_{c} A \succ_{c} C$

Preferences women

- $c \succ_{A} a \succ_{A} b, \quad b \succ_{B} a \succ_{B} c, \quad a \succ_{c} b \succ_{c} c$

Men visiting

$$
\{(a, A),(b, C),(c, B)\}
$$

Women visiting

$$
\{(c, A),(b, B),(a, C)\}
$$

One more?

$$
\{(a, B),(b, C),(c, A)\}
$$

## Some numbers

$\mid($ matching $) \mid=n!$
$\mid$ (stable matching) $\mid=$ ?
Usually not many!
However there is a method allowing to built many stable matching
For instance:

$$
n=8 \quad 269, \quad n=16 \quad 195472 \quad n=32 \quad 104310534400
$$

## Comparing matchings

Let us consider two matchings $\Delta$ and $\Theta$

## Definition

Write $\Delta \succeq_{m} \Theta$ if for every man
(1) either he is associated to the same woman in the two matchings
(2) or he is associated to a preferred woman in $\Delta$ than in $\Theta$

Write $\Delta \succeq_{w} \Theta$ interchanging men and women in the above

## Remark

Easy to see

- $\Delta \succeq_{m}\left(\succeq_{w}\right) \Delta \quad$ reflexivity
- $\Delta \succeq_{m}\left(\succeq_{w}\right) \Theta \wedge \Theta \succeq_{m}\left(\succeq_{w}\right) \wedge \Rightarrow \Delta \succeq_{m}\left(\succeq_{w}\right) \wedge \quad$ transitivity
- the two preorder relations are not complete


## Women versus men

## Theorem

Let $\Delta$ and $\Theta$ be stable matchings. Then $\Delta \succeq_{m} \Theta$ if and only if $\Theta \succeq_{w} \Delta$
Suppose $\Delta \succeq_{m} \Theta$, and $(a, A) \in \Delta,(b, A) \in \Theta$. Must show

$$
b \succ_{A} a
$$

Suppose in $(a, F) \in \Theta$. Since $\Delta \succeq_{m} \Theta$

$$
A \succ_{a} F
$$

Moreover

$$
\{(a, F),(b, A)\} \subset \Theta
$$

$$
b \succ_{A} a
$$

## Ordering stable matching

## Theorem

Let $\Lambda_{m}\left(\Lambda_{w}\right)$ be the men (women) visiting matching and let $\Theta$ be another stable matching. Then

$$
\Lambda_{m} \succeq_{m} \Theta \succeq_{m} \Lambda_{w} \quad \Lambda_{w} \succeq_{w} \Theta \succeq_{w} \Lambda_{m}
$$

Women visiting is the best for the women!

## The proof

Proving that a woman cannot be rejected by a man available to her, by induction on the days of visit

First day. Suppose $A$ is rejected by $a$ in favor of $B$ and that there is a stable set $\Delta$ such that

$$
\{(a, A),(b, B)\} \subset \Delta
$$

Then, since

$$
B \succ_{a} A
$$

then

$$
b \succ_{B} a
$$

Impossible. By assumption $B$ is visiting $a$ the first day, thus $a$ is her preferred man!

## The proof continued

Suppose no woman was rejected by an available man the days $1, \ldots, k-1$. See that no woman can be refused by an available man the day $k$. Using the same argument as before

By contradiction, suppose $A$ is rejected by $a$ in favor of $B$ in day $k$ and that there is a stable set $\Delta$ such that

$$
\{(a, A),(b, B\} \subset \Delta
$$

Then, since

$$
B \succ_{a} A
$$

implying

$$
b \succ_{B} a
$$

Since $B$ is visiting $a$, but likes better $b$, then $B$ visited $b$ some day before and was rejected, against the inductive assumption

## Proof finished

We must prove that for every stable matching $\Theta$ it is

$$
\Lambda_{w} \succeq_{w} \Theta
$$

Let $(a, A) \in \Lambda_{w}$. Must show that if $(b, A) \in \Theta$ then

$$
a \succ_{A} b
$$

Suppose the contrary. Then $A$ visited $b$ before $a$ and was rejected. Impossible!

To conclude, use previous theorem and symmetry between men and women.

## Further results and extensions

- It can be shown that the group visiting does not have incentive to lie to get a better pairing for some of them, while in the other group there could be incentive for somebody to lie
- Think how things change if we suppose:
(1) The number of men and women can be different
(2) The option of remianing alone is not necessarily the worst one for some agent
(3) Polygamous matching are possible: typical example, matching colleges and students, one college can accept more students
(ㄱ) Unisexual matching; there is only one group of people: typical example $2 n$ students must decide how to pair themselves in $n$ two bed rooms

