

# Matching markets and interval order preferences: strategy-proofness vs efficiency

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June 4, 2014

# Gale-Shapley college admission problem

## Players

- Set of applicants  $A$ , set of universities  $B$
- Each applicant  $a \in A$  can be admitted to at most one university
- Each university  $b \in B$  can admit no more than  $q_b$  students.
- Each player has linear order preferences over players on the other side

## Definition

Matching  $\mu$  is a mapping from  $A \cup B$  to subsets of  $A \cup B$  such that:

- 1  $a \in \mu(b) \Leftrightarrow b = \mu(a)$
- 2  $\forall a \in A \mu(a) = \{b\} (b \in B)$  or  $\mu(a) = a$
- 3  $\forall b \in B \mu(b) \subseteq A$  or  $\mu(b) = b$
- 4  $\forall b \in B |\mu(b)| \leq q_b$

# Stability of matching

Matching is called stable if the following properties hold (Gale, Shapley, 1962):

- individual rationality of students: no student is matched to an unacceptable university,
- individual rationality of universities: no university admits an unacceptable student,
- "empty seats" stability: no university-student pair exists such that an applicant prefers this university to her current match and the university finds applicant acceptable and has empty seats
- pairwise stability: no university-student pair exists such that an applicant prefers this university to her current match and the university prefers this student to at least one of currently admitted students.

# Deferred acceptance procedure

Gale and Shapley provided a constructive proof of existence of a stable matching.

## Deferred acceptance procedure (students proposing)

- Step 1. Each student applies to her most preferred university. Each university temporary admits no more than  $q_b$  best students and rejects the others.
- ...
- Step  $k$ . Each rejected student applies to her second most preferred university. Each university considers all currently applying students (both remaining from the previous steps and applied at the  $k$ -th), temporary admits no more than  $q_b$  among them and rejects the others.

When each student is temporary assigned to university or is rejected by all acceptable universities, procedure stops.

# Properties of DA procedure

- DA procedure always produces a stable matching, call it  $\mu_A$ ,
- For students  $\mu_A$  is a unique Pareto-optimal stable matching,
- Reporting preferences truthfully is a weakly-dominant strategy for each student.

Unfortunately, when preferences of agents are **not linear orders**:

- DA procedure is not well-defined in case of ties
- Even If DA procedure is redefined, efficiency do not necessary hold

# The Model

## Players

- Each student  $a \in A$  can be admitted to one university
- Each university  $b \in B$  can admit no more than  $q_b$  students.

## Preferences

- $R$  - the profile of students' preferences over universities.  
 $\forall a \in A R_a$  is a linear order on  $B \cup a$ .
- $\succeq$  - the profile of universities' preferences over students.  
 $\forall b \in B \succeq_b$  is an interval order on  $A \cup b$ .
- $\forall b \succeq_b$  satisfies "no indifference with empty set" property, i.e.  
 $\forall b \in B, \forall a \in A$  either  $a \succ_b \emptyset$  or  $a \prec_b \emptyset$ .
- preference relation of each university over the sets of applicants satisfies the responsiveness to the preference relation over individuals:  $\forall b \in B, \forall a_1, a_2 \in A, A' \subset A$  if  $a_1 \succ_b a_2$  then  $A' \cup a_1 \succ_b A' \cup a_2$ .

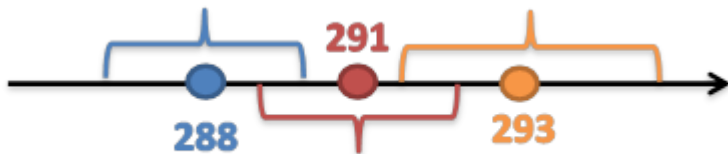
# The interval order preferences: motivating example

Three students apply to a university  $b$

- $a_1$ 's exam score is 293
- $a_2$ 's exam score is 291
- $a_3$ 's exam score is 288

University  $b$  has the following preferences:

$a_1$  is indifferent to  $a_2$ ,  
 $a_2$  is indifferent to  $a_3$ ,  
but  $a_1$  is preferred to  $a_3$ .



This

is an example of a natural situation, where negative transitivity property for preference relation does not hold.

# The interval order preference relation

## Interval order

Binary relation  $\succeq$  on the set  $A$  is an **interval order**, if there exists an interval function  $l : A \rightarrow R^2$ , such that for each element in  $A$  it chooses an interval  $[l, u]$ , such that  $a_1 \succ a_2$  if and only if  $l(a_1) > u(a_2)$ .

## Semiorder

Semiorder  $\succeq$  is an interval order with an interval function such that  $(u_a - l_a) = \text{const}$ . In other words, in case of a semiorder, the length of the 'error' interval does not depend on the alternative.

## Simplest semiorder

Simplest semiorder is a semiorder such that  $\forall a_1, a_2$  there exists no more than one  $a_3$  such that negative transitivity condition does not hold.



# Existence of stable matching

## Theorem

*Stable matching always exists in case, when universities have interval order preferences over students*

## Theorem

*For each stable matching  $\mu$  there exists such universities' preference profile  $\succ$ , which consists of linear order preferences and doesn't contradict original profile  $\underline{\succ}$ , such that matching  $\mu$  is also stable under this strict preference profile.*

# Applicant Pareto-efficient stable matching

Erdil and Ergin, 2006, propose a procedure which allows to find student Pareto-optimal stable matching in case of universities' weak order preferences.

We modify it for the case of the interval order preferences and prove, that it works in our model.

- 1 Preferences of universities are arbitrary transformed to linear orders and Deferred Acceptance procedure with students proposing is applied. Result is a matching  $\mu$ , stable but not necessarily Pareto-efficient.
- 2 We try to find so-called Stable Improvement Cycle. If SIC exists, then we can improve  $\mu$ .
- 3 Procedure ends, when we arrive to the matching  $\mu'$  which does not have Stable Improvement Cycle.

# Stable Improvement Cycle

$$C(b, \mu) = \{a : bR_a\mu(a)\}, D(b, \mu) = \{a \in C : \forall a' \in Ca \succeq_b a'\}.$$

## Definition

*Stable Improvement Cycle consists of distinct applicants  $a_1, \dots, a_n \equiv a_0$  ( $n \geq 2$ ) such that*

- $\mu(a_i) \in B$  (each student in a cycle is assigned to a university),
- $\forall a_i \mu(a_{i+1})R_{a_i}\mu(a_i)$
- $\forall a_i a_i \in D(\mu(a_{i+1}), \mu)$  ( $a_i$  is one of the best students among those who prefer  $\mu(a_{i+1})$  to her current match)

# Applicant Pareto-efficiency: necessary and sufficient condition

## Theorem

*Fix  $\succeq$  and  $R$ , and let  $\mu$  be a stable matching. If  $\mu$  is student-side Pareto-dominated by another stable matching, then it admits a Stable Improvement Cycle.*

# Applicant Pareto-efficient mechanism

- 1 Construct linear extensions of interval order preference relations
- 2 Apply DA procedure with transformed preference profile
- 3 Search for a Stable Improvement Cycle. If cycle is found, improve a matching by exchanging seats among students in the SIC.
- 4 Search for a SIC until Pareto-efficient matching is reached.

# Properties of the mechanism

- Applicant Pareto-efficient stable matching is always found
- Mechanism is not strategy-proof both for students and for universities

## Proposition (Abdulkadiroglu, Pathak, Roth, 2005)

There does not exist an applicant strategy-proof mechanism, which would produce a matching, that Pareto-dominates the result of DA procedure with some tie-breaking rule.

# Tie-breaking: example

Now we will check, how 'unfortunate' tie-breaking leads to an inefficient stable matching under applicant-proposing DA procedure

$$P(a_1) : b_1 \succ b_2 \succ b_3 \quad \succ (b_1) : a_3 \approx a_2 \approx a_1, a_3 \succ a_1$$

$$P(a_2) : b_2 \succ b_1 \succ b_3 \quad \succ (b_2) : a_1 \approx a_3 \approx a_2, a_1 \succ a_2$$

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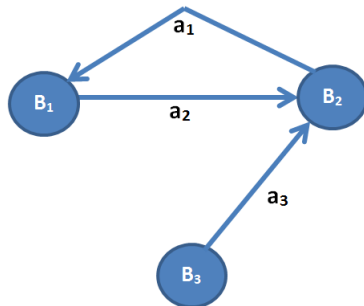
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Procedure is finished, a stable matching is constructed!

# Tie-breaking: example

Unfortunately, the matching is not efficient for applicants. There exists a Stable Improvement Cycle.



## Preferences

$P(a_1) : b_1 \succ \mathbf{b_2} \succ b_3 \quad \succ (b_1) : a_3 \approx a_2 \approx a_1, a_3 \succ a_1$

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# Mechanism with lower chances of an inefficient outcome

- Fix set of applicants  $A$  and set of universities  $B$ .
- Consider some particular university  $b$ .
- Suppose that preferences of all other applicants and universities are chosen randomly from uniform distribution.

## Lemma 1

Fix preference relation of university  $b$ . Under student-proposing DA-procedure specific tie-breaking rule does not affect the probability of receiving proposition from each particular applicant.

Therefore, when we compare different tie-breaking rules, only the number of possible edges in an improvement graph matters.

## 'Reversal' tie-breaking rule

- Step 1. Under preference relation  $\succ_b$  find a maximal set of undominated alternatives  $I_1 \in A$ . Let  $|I_1| = k$ .
- Step 1.0 Find an alternative (we'll call it  $a_k$ ) with the lowest  $I(a_k)$ . Let  $a_k \succ'_b a_i$  for each  $a_i$  in  $I_1$ .
- Step 1.i Choose an alternative ( $a_{k-i}$ ) with the lowest  $I_{a_{k-i}}$  among remaining and let this alternatives all other alternatives, remaining in the  $I_1$ .
- At the end of step 1 we will get  $a_k \succ' a_{k-1} \succ' \dots \succ' a_1$ .
- Step 2. Under preference relation  $\succ_b$  find a maximal set of undominated alternatives  $I_2 \in A \setminus I_1$ .

# Mechanism with lower chances of an inefficient outcome

## Definition

Regular semiorder is a semiorder preference relation, where each maximal set of incomparable alternatives (anti-chain) has the same cardinality.

## Theorem

*If university preference relation is a regular semiorder, then chances of forming an inefficient matching are the lowest with 'reversal' tie-breaking rule*



# Mechanism with lower chances of an inefficient outcome

## New stable mechanism

- 1 Break ties in preferences according to the rule described above
- 2 Apply student-proposing DA procedure

## Mechanism properties

- As it uses a tie-breaking rule before DA procedure, it is strategy-proof for students
- Outcome may be an Applicant-inefficient matching, but probability is lower than for GS with random tie-breaking rule.

Thank you!