

# Matching with Short Preference Lists

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A stylized fact: in matching markets participants usually submit short preference lists.

- ▶ The market is too large: difficult to express preferences over all possible choices.
- ▶ Choice is constrained by the mechanism:
  - ▶ New York City School Match (12 choices max)
  - ▶ College admission in Spain (8 choices max)
  - ▶ Academic job market in France (5 choices max for departments, until 2009)
- ▶ Participants cannot include someone/institution without a prior interview.
- ▶ Participants find many choices as unacceptable.

Constrained choice is the most disturbing case, we lose strategyproofness (revealing one's true (complete) preferences is no longer an option).

Advantages?

- ▶ Gives a “target” of the number of choices one would expect
- ▶ Easier to think about one's preferences over a small set of alternatives than a large one.
- ▶ By limiting choice participants only put alternatives they really care about  
⇒ less “no-show” when enrolling.

# This lecture

- ▶ Theoretical & Experimental investigation of **constrained choice** in school choice problems.
- ▶ See how short preference lists bring additional information and how we can use it.

## First part: Constrained choice

Study the effects of a **quota**  $k$  on the length of submittable ordered lists for:

- ▶ Boston
- ▶ Gale-Shapley
- ▶ Top Trading Cycle

base on

- ▶ Haeringer & Klijn, **Journal of Econ. Theory**, 2009
- ▶ Calsamiglia & Haeringer & Klijn, **American Econ. Rev.**, 2010.

(First account: Romero-Medina, *Rev. Econ. Design*, 1998).

# The model

A **school choice problem** (Abdulkadiroğlu & Sönmez, *AER*, 2005) consists of

- ▶ a set of **students**  $I = \{i_1, \dots, i_n\}$
- ▶ a set of **schools**  $S = \{s_1, \dots, s_m\}$
- ▶ a **capacity vector**  $q = (q_{s_1}, \dots, q_{s_m})$
- ▶ a profile of **students preferences**  $P = (P_{i_1}, \dots, P_{i_n})$
- ▶ a **priority structure**  $f = (f_{s_1}, \dots, f_{s_m})$ .

## Results (Informally)

Constrained School Choice – Main questions for the three prominent mechanisms  $\beta$  (Boston),  $\gamma$  (Gale-Shapley),  $\tau$  (TTC):

- ▶ Is there a dominant strategy?

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- ▶ Are NE outcomes always stable?

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YES.
- ▶ Are NE outcomes always stable?  
Boston: YES, but DA and TTC: NO.
- ▶ Can stability be recovered?  
DA and TTC: via well-known but restrictive conditions on priorities.

## Matching: definition

An outcome of a school choice problem is called a **matching** and is a mapping  $\mu : I \cup S \rightarrow 2^I \cup S$  such that for any  $i \in I$  and any  $s \in S$ ,

- ▶  $\mu(i) \in S \cup \{i\}$ ;
- ▶  $\mu(s) \in 2^I$ ;
- ▶  $\mu(i) = s$  if and only if  $i \in \mu(s)$ ;
- ▶  $|\mu(s)| \leq q_s$ .

# The quota game

Fix the priority structure  $f$  and the capacity vector  $q$ . Let  $\varphi \in \{\beta, \gamma, \tau, \dots\}$  be a mechanism.



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("The quota is  $k$ .")

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We obtain a strategic form game

$$G^\varphi(P, k) = \langle I, Q(k)^n, P \rangle.$$

Notation:

$\mathcal{E}^\varphi(P, k)$  = set of  $k$ -Nash equilibria

$\mathcal{O}^\varphi(P, k)$  = set of  $k$ -Nash equilibrium outcomes

# Incentives

## Proposition

*$\varphi$  a strategyproof mechanism,  $\varphi^k$  its “constrained version”.  
Ordering the declared acceptable school in the true order  
dominates any other re-ordering of those schools.*

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- ▶ etc.

Boston and Gale-Shapley differ on the notion of “rejection”.

- ▶ A school  $s$  chooses the students who applied to it that have the highest priority, up to the capacity  $q_s$ .

If quota attained, reject all other students who applied to  $s$ .

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- ▶ New applications (from students rejected by other schools):  
Repeat the first step with considering **only the remaining available slots and the new applications.**

# Deferred Acceptance

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If quota attained, reject all other students who applied to  $s$ .

- ▶ New applications (from students rejected by other schools):  
Repeat the first step with considering **all the  $q_s$  slots and the students previously accepted.**

# The Boston Mechanism

## Theorem

Let  $P$  be a school choice problem.

For any quota  $k$ ,

$$\emptyset \neq S(P) = \mathcal{O}^\beta(P, k).$$

**Proof** straightforward adaptation of Ergin and Sönmez's (*J. Pub. Econ.*, 2006)

# Gale-Shapley Mechanism

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*For any quota  $k$ ,*

$$S(P) \subseteq \mathcal{O}^\gamma(P, k).$$

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*For any quotas  $k < k'$ ,*

$$\mathcal{E}^\gamma(P, k) \subseteq \mathcal{E}^\gamma(P, k').$$

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## Proof

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- ▶ Let  $\hat{Q}_i = \gamma(Q'_i, Q_{-i})(i)$ .

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- ▶  $\gamma(\hat{Q}_i, Q_{-i})(i) = \gamma(Q'_i, Q_{-i})(i)$  —Roth (1982), Roth and Sotomayor (1990).

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- ▶  $\gamma(\hat{Q}_i, Q_{-i})(i) = \gamma(Q'_i, Q_{-i})(i)$  —Roth (1982), Roth and Sotomayor (1990).
- ▶  $\hat{Q}_i \in \mathcal{Q}(k)$ . So  $Q$  is not a  $k$ -Nash equilibrium, contradiction.

# Gale-Shapley Mechanism: stability?

## Proposition

$$S(P) = \mathcal{O}^\gamma(P, 1).$$

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$$S(P) = \mathcal{O}^\gamma(P, 1).$$

## Proof

If  $k = 1$  then Gale-Shapley = Boston. Since Boston implements stable matchings so does Gale Shapley for  $k = 1$ .

## Gale-Shapley Mechanism: stability?

$P_{i_1}$	$P_{i_2}$	$P_{i_3}$	$f_{s_1}$	$f_{s_2}$
$s_2$	$s_1$	$s_1$	$i_1$	$i_3$
$s_1$	$s_2$	$s_2$	$i_2$	$i_1$
			$i_3$	$i_2$

For any profile  $Q = (P_{i_1}, Q_{i_2}, P_{i_3})$  with  $Q_{i_2} \in \mathcal{Q}(2)$ ,  $\gamma(Q)(i_2) = i_2$ .

Take  $Q_{i_2} = s_2$ , then  $\gamma(Q) = \{\{i_1, s_2\}, \{i_3, s_1\}, \{i_2\}\}$ .

So,  $Q \in \mathcal{E}^\gamma(P, 2)$ , but...  $\gamma(Q^*)$  is not stable w.r.t.  $P$ .



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- ▶  $\gamma(P)$  is a stable matching (Gale and Shapley, 1962).
- ▶  $\gamma(P)$  may not be efficient.
- ▶ Ergin (*Econometrica*, 2002) introduces the concept of **weak acyclicity** (of school priorities).  
    Priorities weakly acyclic  $\Rightarrow \gamma(P)$  efficient.

# Gale-Shapley Mechanism: stability?

Given  $f$ , an **Ergin-cycle** is constituted of distinct  $s, s' \in S$  and  $i, j, l \in I$  such that:

- ▶ **cycle condition**  $f_s(i) < f_s(j) < f_s(l)$  and  $f_{s'}(l) < f_{s'}(i)$ ;

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- ▶ **scarcity condition** there exist disjoint sets  $I_s, I_{s'} \subseteq I \setminus \{i, j, l\}$  such that  $I_s \subseteq U_s^f(j)$ ,  $I_{s'} \subseteq U_{s'}^f(i)$ ,  $|I_s| = q_s - 1$ , and  $|I_{s'}| = q_{s'} - 1$ .

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A priority structure is **Ergin-acyclic** if no cycles exist.

# Gale-Shapley Mechanism: stability?

## Theorem

Let  $k \neq 1$ .

$f$  Ergin-acyclic



$\Gamma^{\gamma}(P, k)$  implements  $S(P)$  in Nash equilibria for any  $P$ .

# Gale-Shapley Mechanism: stability?

**Proof of  $\Rightarrow$**

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- ▶ There are  $i$  and  $j$  such that  $sP_i\gamma(Q)(i)$  and  $f_s(i) < f_s(j)$ .

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- ▶ Define  $Q'_i = \gamma(P_i, Q_{-i})(i)$ .
- ▶ Since  $\gamma(P_i, Q_{-i})R_i\gamma(Q)$  and  $\gamma(Q'_i, Q_{-i})(i) = \gamma(P_i, Q_{-i})(i)$ , we have  $\gamma(Q'_i, Q_{-i})(i) = \gamma(Q_i, Q_{-i})(i)$ .  
 $\gamma$  strategy-proof +  $Q$  equilibrium.

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- ▶  $f$  Ergin-acyclic, so  $\gamma$  non-bossy (Ergin, 2002).

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 $\gamma$  strategy-proof +  $Q$  equilibrium.
- ▶  $f$  Ergin-acyclic, so  $\gamma$  non-bossy (Ergin, 2002).
- ▶ Rewriting we get  $\gamma(P_i, Q_{-i}) \notin S(P_i, Q_{-i})$ , contradiction.

## Theorem

*For any quotas  $k < k'$ ,*

$$\mathcal{E}^T(P, k) \subseteq \mathcal{E}^T(P, k').$$

**proof**

- ▶ We first show that if a mechanism  $\varphi$  is *individually idempotent* then the equilibria are nested:

$$\varphi(\varphi(Q)(i), Q_{-i}) = \varphi(Q) \Rightarrow \mathcal{E}^\varphi(P, k) \subseteq \mathcal{E}^\varphi(P, k')$$

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- ▶ TTC is individually idempotent: show that under  $Q$  and  $(\tau(Q)(i), Q_{-i})$  the same cycles form.



## Theorem

For any quota  $k \geq 2$ ,

$$\emptyset \neq \mathcal{O}^\tau(P, 1) = \mathcal{O}^\tau(P, k).$$

Note: we can have  $S(P) \cap \mathcal{O}^\tau(P, 1) = \emptyset$ .

# TTC: stability?

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# TTC: stability?

- ▶  $\tau(P)$  is an efficient matching.  
(Gale and Shapley, 1962)
- ▶  $\tau(P)$  may not be stable.
- ▶ Priorities Kesten-acyclic  $\Rightarrow \tau(P)$  stable.  
(Kesten, *JET*, 2006)

Given  $f$ , a **Kesten-cycle** (Kesten, JET, 2006) is constituted of distinct  $s, s' \in S$  and  $i, j, l \in I$  such that:

- ▶ **cycle condition**  $f_s(i) < f_s(j) < f_s(l)$  and  $f_{s'}(l) < f_{s'}(i), f_{s'}(j)$ ;

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- ▶ **scarcity condition** there exists a set  $I_s \subseteq I \setminus \{i, j, l\}$  with  $I_s \subseteq U_s^f(i) \cup [U_s^f(j) \setminus U_{s'}^f(l)]$  and  $|I_s| = q_s - 1$ .

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A priority structure is **Kesten-acyclic** if no cycles exist.

# TTC: stability?

## Theorem

Let  $k \geq 1$ .

$f$  Kesten-acyclic



$\Gamma^\tau(P, k)$  implements  $S(P)$  in Nash equilibria for any  $P$ .



# TTC: stability?

**Proof of  $\Rightarrow$**

- ▶  $f$  Kesten-acyclic  $\Rightarrow \tau = \gamma$  (Theorem 1 of Kesten, 2006).

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- ▶  $f$  Kesten-acyclic  $\Rightarrow \tau = \gamma$  (Theorem 1 of Kesten, 2006).
- ▶  $f$  is Ergin-acyclic (Lemma 1 of Kesten, 2006).

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## Proof of $\Rightarrow$

- ▶  $f$  Kesten-acyclic  $\Rightarrow \tau = \gamma$  (Theorem 1 of Kesten, 2006).
- ▶  $f$  is Ergin-acyclic (Lemma 1 of Kesten, 2006).
- ▶ Since  $O^\gamma(P, k) \in S(P)$  (our result about  $\gamma$ ), we have  $O^\tau(P, k) \in S(P)$ .

# TTC: stability?

## Proof of $\Leftarrow$

- ▶  $f$  Kesten-cyclic  $\Rightarrow$  there exists  $P$  such that  $\tau(P) \notin S(P)$   
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- ▶  $\tau$  strategy-proof, so  $P$  is an  $m$ -equilibrium.

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- ▶  $\tau$  strategy-proof, so  $P$  is an  $m$ -equilibrium.
- ▶ For each  $k \leq m$ , there exists a  $k$ -equilibrium  $Q$  such that  $\tau(Q) = \tau(P) \notin S(P)$  (our result about  $\tau$ ).

## Eq. of undominated “truncations”

$P_{i_1}$	$P_{i_2}$	$P_{i_3}$	$P_{i_4}$	$f_{s_1}$	$f_{s_2}$	$f_{s_3}$
$s_1$	$s_2$	$s_3$	$s_1$	$i_3$	$i_1$	$i_2$
$s_2$	$s_3$	$s_1$	$s_2$	$i_1$	$i_2$	$i_4$
$s_3$	$s_1$	$s_2$	$s_3$	$i_2$	$i_3$	$i_3$
				$i_4$	$i_4$	$i_1$

Let  $k = 2$ . Let  $Q$  be such that each student submits his 2 best schools. Then,

$$\gamma(Q) = \tau(Q) = \{\{i_1, s_1\}, \{i_2, s_2\}, \{i_3, s_3\}, \{i_4\}\}.$$

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$P_{i_1}$	$P_{i_2}$	$P_{i_3}$	$P_{i_4}$	$f_{s_1}$	$f_{s_2}$	$f_{s_3}$
$s_1$	$s_2$	$s_3$	$s_1$	$i_3$	$i_1$	$i_2$
$s_2$	$s_3$	$s_1$	$s_2$	$i_1$	$i_2$	$i_4$
$s_3$	$s_1$	$s_2$	$s_3$	$i_2$	$i_3$	$i_3$
				$i_4$	$i_4$	$i_1$

Let  $k = 2$ . Let  $Q$  be such that each student submits his 2 best schools. Then,

$$\gamma(Q) = \tau(Q) = \{\{i_1, s_1\}, \{i_2, s_2\}, \{i_3, s_3\}, \{i_4\}\}.$$

So, even (strong) Nash equilibria in (undominated) “truncations” may yield unstable matchings!



# Conclusion

Nash Implementation of the stable correspondence through mechanism

- ▶ Boston: for  $k \geq 1$ : YES.

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- ▶ DA: for  $k = 1$ : YES;  
for  $k > 1$ : if and only if priority structure is acyclic à la Ergin (Econometrica, 2002).
- ▶ TTC: for  $k \geq 1$ : if and only if priority structure is acyclic à la Kesten (JET, 2006).

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 $\beta$  implements set of stable matchings in NE  
→ transition from  $\beta$  to  $\gamma$  would lead to unambiguous efficiency gains.
- ▶ As the acyclicity conditions are restrictive, current transitions from  $\beta$  to  $\gamma$  or  $\tau$  with quota are unlikely to be as successful as they could be.

# Conclusion

## Equilibrium analysis of matching games

	Students	Players Students-Schools	Schools
$\beta$	Ergin-Sönmez ( <i>J. Pub. Econ.</i> , 2005)	$\emptyset$	$\emptyset$
$\gamma$	This paper	Alcalde ( <i>JET</i> , 1996) $IR(P)$	Roth ( <i>JET</i> , 1984) $S(P)$
$\tau$	This paper	$\emptyset$	$\emptyset$



# The experiment

Reconduct the Chen-Sönmez experiment with two treatments:

- ▶ First treatment: like Chen-Sönmez, no constraint.
- ▶ Second treatment: a **quota**  $k$  on the length of submittable ordered lists is imposed.

**Note:** No after market for unassigned students.

# The experiment

- ▶ 36 students to be matched to 7 schools  
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- ▶ For each mechanism (BOS, SOSM, TTC) and each payoff matrix, 2 sessions.
- ▶ A total of  $2 \times 3 \times 2 \times 2 \times 36 = 872$  subjects

# The district school and priorities

Each student was assigned a “district school”

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- ▶ Once subjects' choices were collected, a random order of the student was drawn from an urn.
- ▶ For each school, the students of the district were placed on the top of the school priority list, in the order given by the draw.
- ▶ Other students were ranked in the school priority list below the district students in the order given by the draw.

# District Schools

- ▶ For SOSM and TTC, the district school is a “safety” school.
- ▶ For Boston, the district school is a “safety” school only if put first in choices.

# Sub-samples

We split the set of subjects into two sub-samples:

- ▶ **High district:** the district school is ranked 1st, 2nd or 3rd in the subject's preferences.
- ▶ **Low district:** the district school is ranked 4th or less in the subject's preferences.

# The experiment

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- ▶ Subjects were given a mini-course on about the mechanism at hand.
- ▶ Subjects had to make a choice list (7 schools in one treatment and 3 schools in another treatment).
- ▶ Choices were collected and a matching was computed. Subjects were paid just at the end of the experiment. Average duration: 45 minutes.

# Hypothesis 1

For SOSM and TTC:

Constraint implies more **rational** behavior.

(relative order of schools in choices same as in preference)

## Hypothesis 2

For SOSM and TTC:

Constraint implies less **truncated truthtelling**.  
(choices are the 3 most preferred.)

For BOS:

Constraint implies less (but not significant) **truncated truthtelling**.

## Hypothesis 3

For SOSM and TTC:

Constraint implies more **District School Bias** and more **Small School Bias**.

For BOS:

Constraint implies more (but not significant) **District School Bias** and more **Small School Bias**.

## Hypothesis 4

For BOS, SOSM and TTC:

Constraint implies more **Safety School Effect**.

Effect smaller for BOS than for SOSM and TTC.

## Hypothesis 5

Under all three mechanisms, the constraint produces an efficiency loss.

The inefficiency of the three mechanisms in the constrained case is similar.

## Hypothesis 6

SOSM is “more stable” than TTC or Boston in the unconstrained case.

SOSM more stable in the unconstrained case.

## Hypothesis 7

Individuals will be assigned to their district school more often in the constrained than in the unconstrained case.



# Rational Behavior

More rationality under constrained SOSM and TTC

	Constrained	Unconstrained	$p$ -value
$BOS_d$	34.7	37.5	.37
$BOS_r$	37.5	44.4	.2
$SOSM_d$	95.8	73.6	.0001
$SOSM_r$	91.7	81.9	.043
$TTC_d$	93.1	84.7	.057
$TTC_r$	90.3	88.9	.4

# Rational Behavior

Low-district subjects more sensitive to the constraint.

	Low-district sample		High-district sample	
	Cons.	Uncons.	Cons.	Uncons.
$SOSM_d$	95.2	57.1	96.7	96.7
$SOSM_r$	88.6	81.8	96.4	82.1
$TTC_d$	90.5	78.6	96.7	93.3
$TTC_r$	90.9	86.4	89.3	92.9

# Rational behavior

Without low capacity schools

Treat.	$SOSM_d$	$SOSM_r$	$TTC_d$	$TTC_r$
Cons. (%)	100	100	100	100
Unons. (%)	100	100	100	100

# Truncated truthtelling

Less truncated truthtelling under constrained choice

	Constrained	Unconstrained	$p$ -value
$BOS_d$	18.1	18.1	.5
$BOS_r$	8.3	22.2	.0102
$SOSM_d$	25.0	58.3	.000
$SOSM_r$	18.1	56.9	.000
$TTC_d$	22.2	62.5	.000
$TTC_r$	19.4	73.6	.000

In the constrained setting, the level of truncated truthtelling does not significantly vary among SOSM, TTC and BOS-d.

# Truncated truth-telling

Low-district optimize more.

	Low-district sample		High-district sample	
	Cons.	Uncons.	Cons.	Uncons.
$BOS_d$	16.7	19.0	20.0	16.7
$BOS_r$	9.1	25.0	7.1	17.9
$SOSM_d$	2.4	45.2	56.7	76.7
$SOSM_r$	6.8	26.8	35.7	57.1
$TTC_d$	0	64.3	53.3	60.0
$TTC_r$	6.8	79.5	39.3	64.3

## Two types of misrepresentation

- ▶ **District School Bias (DSB)**

A participant puts his district school into a higher position than that in the true preference order.

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- ▶ **District School Bias (DSB)**

A participant puts his district school into a higher position than that in the true preference order.

- ▶ **Small School Bias (SSB)**

A participant puts school A or B (or both) into lower positions than those in the true preference ordering.

# Misrepresentations

## **District School Bias:**

SOSM and TTC: 15 (d) – 20 (r) %  $\rightarrow$  70 (d) – 75 (r)%

BOS: 60 (r) – 70 (d) %  $\rightarrow$  75 (r) – 80 (d) %

## **Small School Bias:**

SOSM and TTC: 20 (d) – 35 (r) %  $\rightarrow$  60 (d) – 40 (r)%

BOS: 37 (r) – 70 (d) %  $\rightarrow$  52 (r) – 77 (d) %

Low-district more biased than high-district.



# Misrepresentations

Low-district and high-district subjects exhibit different patterns of manipulation:

- ▶ Low-district subjects: DSB dominates in the constrained case, SSB dominates in the unconstrained case.
- ▶ High-district subjects: DSB dominates in both cases (const./unconst.), and  $SSB \Rightarrow DSB$ .

## Safety school effect

Proportion of subjects having the district school ranked 4th or more in preferences (low-district subjects) and ranked 3rd or less in choices.

Mechanism	Constrained	Unconstrained	$p$ -value
SOSM <sub>d</sub>	91	12	<b>0.009</b>
SOSM <sub>r</sub>	89	18	<b>0.0076</b>
TTC <sub>d</sub>	86	14	<b>0.00</b>
TTC <sub>r</sub>	89	9	<b>0.00</b>
BOS <sub>d</sub>	81	57	<b>0.000</b>
BOS <sub>r</sub>	75	50	<b>0.000</b>

# Safety School effect

- ▶ Constrained case:  $DSB \equiv$  Safety School Effect (by definition).
- ▶ Unconstrained case: DSB and Safety School Effect do **not** measure the same thing.

However, we observe  $DSB \approx$  Safety School Effect.

$\Rightarrow$  First three choices are “focal”.

Safety School Effect even if the district school is the worst school (constrained case).

# Recombinant technique

- ▶ Each treatment = one shot game
- ▶ Each treatment was run twice, so we have two strategy profiles.

⇒ to compute the outcomes for a treatment, we can use any combination of the two strategy profiles, i.e.,  $2^{36}$  different combinations (Mullin-Reiley, *Games Econ. Behav.*, 2006).

We use 14,400,000 recombinations.

# Efficiency

	Observed	1-2	2-3	1-3
Uncons.-d	TTC > SOSM > Bos	R	R	A
Uncons.-r	TTC $\gg$ SOSM > Bos	A	R	A
Cons.-d	TTC > SOSM $\gg$ Bos	R	A	A
Cons.-r	TTC > SOSM $\gg$ Bos	R	A	A

The efficiency loss between the unconstrained and constrained cases is significant for the three mechanisms.

# Stability

Average number of blocking pairs.

	Constrained	Unconstrained	$p$ -value
$BOS_d$	10.6	11.4	.2
$BOS_r$	14.9	12.6	.05
$SOSM_d$	7.6	4.7	.001
$SOSM_r$	9.6	7.8	.07
$TTC_d$	10.4	15.5	.04
$TTC_r$	13.4	9.8	.01

# Segregation

Proportion of students assigned to their district school.

Mechanism	Constrained	Unconstrained	$p$ -value
SOSM <sub><i>d</i></sub>	65	54	<b>0.008</b>
SOSM <sub><i>r</i></sub>	44	28	<b>0.0002</b>
TTC <sub><i>d</i></sub>	59	46	<b>0.007</b>
TTC <sub><i>r</i></sub>	31	23	<b>0.039</b>
BOS <sub><i>d</i></sub>	68	31	<b>0.026</b>
BOS <sub><i>r</i></sub>	45	50	<b>0.008</b>

Increase milder than for District School Bias.

# Conclusion

- ▶ Experimental study of a situation in which agents are constrained: some of their strategies are “deleted” .
- ▶ Agents tend to choose “safe” strategies:
  - ▶ Secure their prospects (district school),
  - ▶ Flee competition (small school bias).
- ▶ Subjects without easily (easily identifiable) dominant strategy tend to show greater signs of optimizing behavior.
- ▶ Trade-off when restricting agents’ strategies:
  - ▶ Increase agents’ rationality,
  - ▶ Efficiency loss.



# Two-Sided Matching with One-Sided Preferences

(or how take advantage short preference lists)

with Vincent Iehlé (Université Paris-Dauphine)

# The student-optimal stable matching $\mu_I$

- ▶ students' most preferred stable matching;
- ▶ Strategyproof (for the students)
- ▶ **Not necessarily Pareto optimal**

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- ▶ students' most preferred stable matching;
- ▶ Strategyproof (for the students)
- ▶ **Not necessarily Pareto optimal**

## Proposition (Kesten, 2010, QJE)

*There is no Pareto-efficient and strategy-proof mechanism that selects the Pareto-efficient and stable matching whenever it exists.*

# The origin of inefficiency

$i_1$	$i_2$	$i_3$
$s_2$	$s_1$	$s_1$
<u><math>s_1</math></u>	<u><math>s_2</math></u>	<u><math>s_3</math></u>

$s_1$	$s_2$	$s_3$
$i_1$	$i_2$	$i_3$
$i_3$	$i_1$	
$i_2$		

## The origin of inefficiency

$i_1$	$i_2$	$i_3$	$s_1$	$s_2$	$s_3$
<u><math>s_2</math></u>	<u><math>s_1</math></u>		$i_1$	$i_2$	$i_3$
$s_1$	$s_2$	<u><math>s_3</math></u>	$i_3$	$i_1$	
			$i_2$		

Not asking a school I won't get can make other students better off.

# The origin of inefficiency

$i_1$	$i_2$	$i_3$	$s_1$	$s_2$	$s_3$
<u><math>s_2</math></u>	<u><math>s_1</math></u>		$i_1$	$i_2$	$i_3$
$s_1$	$s_2$	<u><math>s_3</math></u>	$i_3$	$i_1$	
			$i_2$		

Not asking a school I won't get can make other students better off.

Kesten's mechanism finds those "critical" students, eliminates them, but loses strategy-proofness.

A matching  $\mu$  is not stable if there exists a pair of agents  $(i, j)$  such that

$$i P_j \mu(j) \quad \text{and} \quad j P_i \mu(i),$$

or there is an agent  $i$  such that  $i P_i \mu(i)$ .

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or there is an agent  $i$  such that  $i P_i \mu(i)$ .

$\Rightarrow$  Checking stability involves preferences from **both** sides of the market.



# Objective of the paper

Propose a mechanism that:

- ▶ Pareto dominates the Student-Optimal Stable Matching (SOSM)
- ▶ Selects SOSM whenever it is efficient
- ▶ that is “pseudo strategyproof.”

# How we do it

Given a matching problem:

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Given a matching problem:

- ▶ We go to a more general problem where we ignore students' preferences
- ▶ Extract information about stable matchings
- ▶ Feed back that information to the original problem.

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- ▶ Consider only school's preferences and for each student the list of acceptable schools (**but not their preferences**)

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- ▶ Consider only school's preferences and for each student the list of acceptable schools (**but not their preferences**)
- ▶ for each pair student-school,  $(i, s)$ , say whether there exists **a** student preference profile such that  $i$  can be matched to  $s$  for **some** stable matching. If not,  $i$  is a **dummy** for  $s$ .



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- ▶ A new mechanism: If a student is a dummy for a school, delete that student from that school's preferences. Then run Gale-Shapley.

This paper adds to a series of paper that extract information from partial matching data:

- ▶ Stable matchings  $\longrightarrow$  preferences:  
Roth and Sotomayor (1985), Echenique, Lee, Shum and Yenmez (2012).
- ▶ Preferences  $\longrightarrow$  stable matchings:  
Martínez, Massó, Neme and Oviedo (2012), Rastegari, Condon, Immorlica, and Leyton-Brown (2012).

## Example

$P_{s_1}$	$P_{s_2}$	$P_{s_3}$	$P_{s_4}$
$i_1$	$\cdot$	$\cdot$	$\cdot$
$\cdot$	$i_2$	$i_3$	$i_4$
$\cdot$	$\cdot$	$\cdot$	$\cdot$
$\cdot$	$i_1$	$i_2$	$i_3$
$\cdot$	$\cdot$	$\cdot$	
$\cdot$	$i_4$	$\cdot$	

There is no preference profile and a stable matching (for that profile) such that  $i_1$  is matched to  $s_2$ .

A **matching problem**,  $(I, S, \succ_I, \succ_S, q_S)$ , is defined by:

- ▶ A set  $S$  of schools
- ▶ A set  $I$  of students.
- ▶ A vector  $q_S$  of schools' capacities.
- ▶ Each school  $s$  has a preference relation  $\succ_s$  over the set of students. (responsive prefs. over sets of students)
- ▶ Each student  $i$  has a preference relation  $\succ_i$  over the set of schools and himself.

A **pre-matching problem**,  $(I, S, P_S, q_S)$ , is defined by:

- ▶ A set  $S$  of schools
- ▶ A set  $I$  of students.
- ▶ A vector  $q_S$  of schools' capacities.
- ▶ Each school  $s$  has a preference relation  $P_s$  over a set  $A_s \subseteq I$  of students. (responsive prefs. over sets of students)

$A_s =$  set of students acceptable for  $s$

$\Rightarrow A_i =$  set of acceptable schools for  $i$ .

# Example

$\gamma_{s_1}$	$\gamma_{s_2}$	$\gamma_{s_3}$	$\gamma_{s_4}$	$\gamma_{s_5}$	$\gamma_{s_6}$
$i_1$	$i_3$	$\cdot$	$i_2$	$i_2$	$i_2$
$i_2$	$i_2$	$i_3$	$i_4$	$i_3$	$\cdot$
$i_3$	$\cdot$	$\cdot$	$\cdot$	$\cdot$	$i_3$
$\cdot$	$i_1$	$i_2$	$i_3$	$i_4$	$\cdot$
$i_4$	$\cdot$	$i_1$	$\cdot$	$i_1$	$i_1$
$\cdot$	$i_4$	$i_4$	$i_1$	$\cdot$	$i_4$

$\gamma_{i_1}$	$\gamma_{i_2}$	$\gamma_{i_3}$	$\gamma_{i_4}$
$s_1$	$s_2$	$s_3$	$s_2$
$s_2$	$s_3$	$s_4$	$s_4$

# Example

$P_{s_1}$	$P_{s_2}$	$P_{s_3}$	$P_{s_4}$	$P_{s_5}$	$P_{s_6}$
$i_1$	.	.	.	.	.
.	$i_2$	$i_3$	$i_4$	.	.
.	.	.	.	.	.
.	$i_1$	$i_2$	$i_3$	.	.
.	.	.	.	.	.
.	$i_4$	.	.	.	.

Given a pre-matching problem  $P$ , a matching problem  $\succ$  is **P-compatible** if

- ▶ for each student  $i$  and each school  $s$ ,

$$s \succ_i i \Leftrightarrow i \in A_s$$



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- ▶ for each pair of students  $i, i' \in I$  such that  $i, i' \in A_s$ ,

$$i P_s i' \Leftrightarrow i \succ_s i'$$

Given a pre-matching problem  $P$ , a matching problem  $\succ$  is **P-compatible** if

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- ▶ for each pair of students  $i, i' \in I$  such that  $i, i' \in A_s$ ,

$$i P_s i' \Leftrightarrow i \succ_s i'$$

$\Theta(P)$  = the set of matching problems that are  $P$ -compatible.

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- ▶ it is **individually rational**: I prefer my match than being unmatched.
- ▶ it is **non wasteful**: If I prefer a school to my match, that school is full.
- ▶ there is no **justified envy**: If I prefer a school to my match, that school has no student less preferred than me.

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For a pre-matching problem  $P$ , a pre-matching  $\mu$  is **stable** if

- ▶ it is **non-wasteful**: If a school does not fill its capacity, all the students acceptable for that school are matched to some school.
- ▶ there is no **justified envy**: If a student is matched to a school, all the students preferred to him by that school are matched to a school.



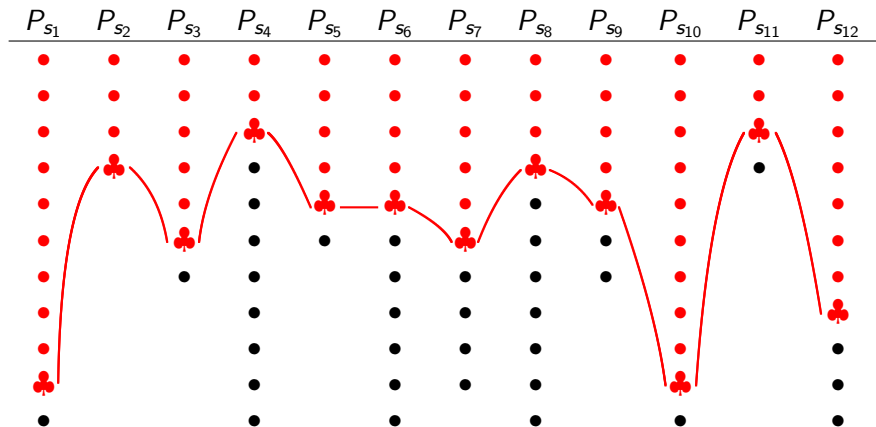
# Example

$P_{S_1}$	$P_{S_2}$	$P_{S_3}$	$P_{S_4}$	$P_{S_5}$	$P_{S_6}$	$P_{S_7}$	$P_{S_8}$	$P_{S_9}$	$P_{S_{10}}$	$P_{S_{11}}$	$P_{S_{12}}$
•	•	•	•	•	•	•	•	•	•	•	•
•	•	•	•	•	•	•	•	•	•	•	•
•	•	•	•	•	•	•	•	•	•	•	•
•	•	•	•	•	•	•	•	•	•	•	•
•		•	•	•	•	•	•	•	•		•
•		•	•	•	•	•	•	•	•		•
•			•		•	•	•	•	•		•
•			•		•	•	•	•	•		•
•			•		•	•	•	•	•		•
•			•		•	•	•	•	•		•
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●	●	●	●	●	●	●	●	●	●	●	●
●	●	●	●	●	●	●	●	●	●	●	●
●	●	●	♣	●	●	●	●	●	●	♣	●
●	♣	●	●	●	●	●	♣	●	●	●	●
●	●	●	●	♣	♣	●	●	♣	●	●	●
●	●	♣	●	●	●	♣	●	●	●	●	●
●	●	●	●	●	●	●	●	●	●	●	●
●	●	●	●	●	●	●	●	●	●	●	♣
●	●	●	●	●	●	●	●	●	●	●	●
♣	●	●	●	●	●	●	●	●	♣	●	●
●	●	●	●	●	●	●	●	●	●	●	●

# Example



# Dummy students

A student  $i$  is a **dummy** for school  $s$  at the pre-profile  $P$  if for any matching problem  $\succ \in \Theta(P)$ , there is no matching  $\mu$  stable for  $\succ$  such that  $\mu(i) = s$ .

- ▶ If  $\mu$  is stable for  $\succ$  then  $\mu$  is stable for  $P$ , with  $\succ \in \Theta(P)$ .
- ▶ If  $\mu$  is stable for  $P$ , then there exists  $\succ$  in  $\Theta(P)$  such that  $\mu$  is stable for  $\succ$ .

→

$i$  is dummy for  $s$



there is no pre-matching stable for  $P$  such that  $\mu(i) = s$ .

# Identifying dummy students

Given  $P$ , let  $P^{i,s}$  be  $P$  obtained by deleting  $i$  to each  $P_{s'}$  with  $s' \neq s$ .

## Proposition

*Student  $i$  is a dummy for  $s$  if, and only if, there is no maximum and stable matching  $\mu$  for  $P^{i,s}$  such that  $\mu(i) = s$ .*

# Proof

- ▶ Take  $\mu$ , stable for  $P^i$  but not maximum.

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$$\pi = (i_1, s_1, i_2, \dots, i_h, s_h, \dots, i_k, s_k),$$

$$\text{but } iP_{s_h}i_h, j \notin \pi, \text{ and } \mu(j) = j$$

$$\pi' = (j, s_h, \dots, i_k, s_k).$$

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Keep doing with  $\pi''$ ,  $\pi'''$ , etc. until we have a problem-free augmenting path.

## A sufficient condition

Intuition we want to capture:

$i$  is a dummy for  $s$  and  $\mu(i) = s \implies$  however we match the other students (filling schools' capacities) there is always a student  $i'$  and a schools' such that

$$\mu(i') = i' \quad \text{and} \quad i' P_{s'} i'' \text{ for some } i'' \in \mu(s').$$

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The **truncation of  $P$  at  $i$**  is the pre-profile  $\bar{P}^i$  such that

- ▶ If  $i \notin A_s$  then  $\bar{P}_s^i = P_s$ ,
- ▶ If  $i \in A_s$  then  $\bar{P}_s^i$  is a truncation of  $P_s$  at  $i$  (including  $i$ ).

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(c) If we match  $i_0$  to  $s_0$ , we need to “get rid” of some  $j \in \mathbf{J}$ .

$\Rightarrow$  For any  $j \in \mathbf{J}$ , it is not possible to match **all** students in  $\mathbf{J} \setminus \{j\}$  such that  $j$  does not block the matching.

$\Leftrightarrow$  For any  $j \in \mathbf{J}$ , it is not possible to match **all** students in  $\mathbf{J} \setminus \{j\}$  in the pre-profile  $\bar{P}^j$ .

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(c) for each  $i \in \mathbf{J} \setminus \mathbf{J}_0$ , for the pre-matching problem  $P^i$ ,

$$\exists T \subseteq \mathbf{J} \setminus \{i\} \text{ such that } |T| > \sum_{s \in A_T^i} \bar{q}_s \quad (\star)$$

where  $\bar{q}_s = q_s$  if  $s \neq s_0$  and  $\bar{q}_{s_0} = q_{s_0} - 1$ .

Illustration of condition ( $\star$ )

$P_{s_0}$	$P_{s_1}$	$P_{s_2}$	$P_{s_3}$
$a$	$b$	$b$	$b$
$i_0$	$c$	$c$	$d$
	$a$	$d$	$a$
	$\cdot$	$a$	$\cdot$
		$\cdot$	

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	<b><math>a</math></b>	$d$	$a$
	$\cdot$	$a$	$\cdot$
		$\cdot$	

There is no block at  $(i, s_1)$ :  $b$  and  $c$  can “eliminate”  $d$  and let  $a$  be matched to  $s_2$  so that  $i$  can be matched to  $s_1$ .

Here condition ( $c$ ) is not satisfied for  $d$ .

## Proposition

*Let  $P_S$  be a profile. If there is a block at  $(i_0, s_0)$  then student  $i_0$  is dummy for school  $s_0$ .*

# Proof

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- ▶ Repeat for  $j_4, j_5, \dots$  until we hit  $j_k \in \mathbf{J}_0$ , contradicting  $\mu$  being stable.

## Corrolary for school choice problems

School choice usually endow each student with a “district school”:  
a school for which the student has the highest priority.

### Assumption

*Each student always puts his district school in his submitted preference list.*

## Assumption

*There exists an order partition of schools,  $\{S_1, S_2, \dots, S_k\}$  such that students whose school district is in  $S_h$  only put in their submitted preferences schools that are in  $S_1, S_2, \dots, S_h$ .*



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## Proposition

*For any stable matching, students whose district school is in  $S_h$  are matched to a school in  $S_h$ .*

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2. Identify dummy students and delete the schools for which they are dummies in their preferences;
3. Run students' DA with with the “cleaned” preferences.  
Output =  $\bar{\mu}_I$ .

## Proposition

*The dummy-free mechanism weakly Pareto dominates the student-optimal matching.*

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*Once a student has chosen which schools to put in his submitted preferences, it is a dominant strategy to put them in the correct order.*

→ Students can manipulate but only by declaring some schools as unacceptable.

## Wrap up: Look at the data before doing anything

- ▶ Under not so severe circumstances, knowing preferences of both sides of the market is not necessary to identify unstable matchings;
- ▶ Stable mechanisms are not necessarily the best way to promote district mobility in school choice;
- ▶ Scrutinizing the data before running the algorithm can help to enhance one side's welfare.