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# Equitable Top Trading Cycles mechanism

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## Motivation

- Since 1987, school choice programs have been growing in popularity across the US, aiming to overcome the **inequality gap** between students from rich and poor families.
  
- Main issues of concern:
  - fairness/equity
  - efficiency
  - incentive compatibility

## Motivation

- Equity and welfare conflict
  - Fairness: DA
  - Pareto efficiency: TTC
  
- San-Francisco, Denver, New Orlean put TTC in practice.
  
  
- Can we improve on equity of TTC?

## School Choice Problem

- *A school choice problem*
  - *Preference profile* of students
  - *Priority orders* for schools.
  - *Quotas*
- As a result: **matching**

## Properties of mechanisms

- A matching is ***Pareto efficient*** if there is no matching which assigns each student a weakly better school and at least one student a strictly better school.
- A matching  $\mu$  eliminates ***justified envy*** if there is no unmatched student–school pair  $(i, s)$  such that:
  - student  $i$  prefers school  $s$  to her assignment under  $\mu$  and
  - student  $i$  has a higher priority at school  $s$  than some other student who is assigned a seat at school  $s$  under  $\mu$ .
- The mechanism is ***strategy-proof*** if no student can possibly benefit by misrepresenting her preferences.

## TTC

- Step 1:
  - The highest priority student of each school is assigned all slots of that school.
  - Each student points to the student (possibly himself) who is assigned (all slots of) his best choice.
  - There is at least one cycle. Corresponding trades in cycles are performed.
  
- In general, Step  $k$ ,  $k > 1$ :
  - Step 1 with remaining students and slots.

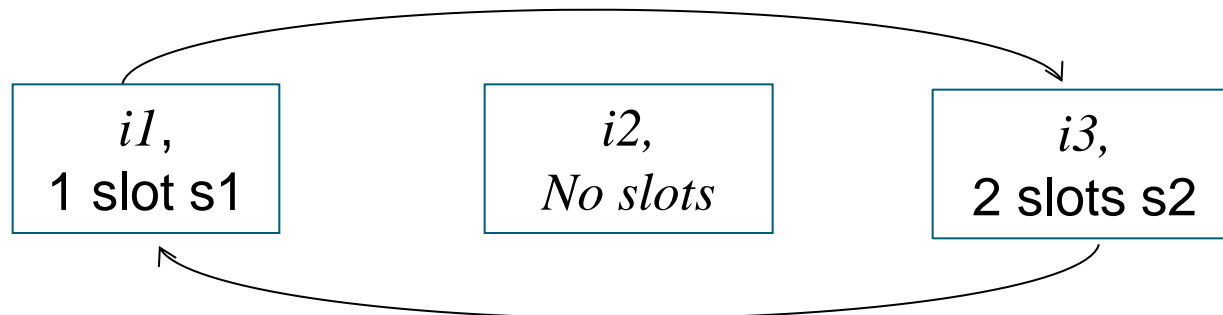
# Example

$\succ_{s_1}$	$\succ_{s_2}$
$i_1$	$i_3$
$i_2$	$i_2$
$i_3$	$i_1$

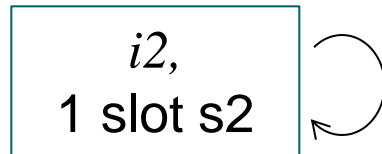
$P_{i_1}$	$P_{i_2}$	$P_{i_3}$
$\boxed{s_2}$	$s_1$	$\boxed{s_1}$
$s_1$	$\boxed{s_2}$	$s_2$

TTC:

Step 1



Step 2



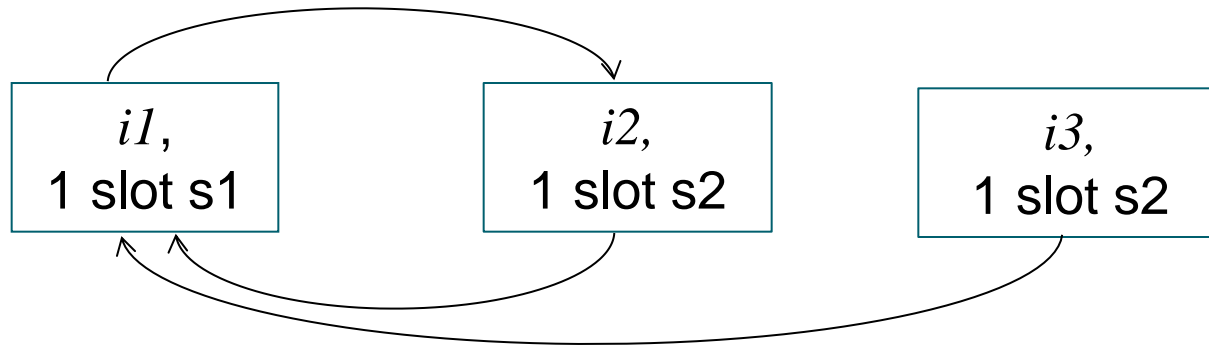
TTC result in allocation above, which is Pareto efficient, but priority of student  $i_2$  for school  $s_1$  is violated by student  $i_3$ .

This kind of justified envy can be avoid at no cost in terms of welfare or incentives - ETTC

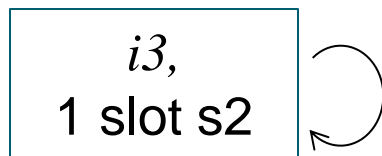
# Example

ETTC:

Step 1:



Step 2:



Allocation:

S1: Student 2

S2: Student 1, 2, student 3.

No justified envy



## ETTC

- Step 1: For each school, all available slots are assigned to students *one by one* following their priority order to form **student-school pairs**. Each student-school pair  $(i; s)$  points to the student-school pair  $(i_0; s_0)$  such that:
  - (i) school  $s_0$  is the best choice of student  $i$  and,
  - (ii) student  $i_0$  is the student with the highest priority for school  $s$  among the students who are assigned a slot from school  $s_0$ .
- There is at least one cycle. In each cycle, corresponding trades are performed, and all student-school pairs which participate in a cycle are removed

## ETTC

- In general, Step  $k$ ,  $k > 1$ : For each school  $s$  such that (i) there are slots of school  $s$  which remained to be inherited from previous steps, and (ii) there are no such students who were assigned a slot of school  $s$  at a previous steps of algorithm, its slots which remained to be inherited from previous steps are assigned to the remaining students one by one following the priority order for school  $s$  to form new student-school pairs. Each student-school pair  $(i; s)$  points to the student-school pair  $(i_0; s_0)$  such that
  - (i) school  $s_0$  is the best choice of student  $i$  and,
  - (ii) student  $i_0$  is the student with the highest priority for school  $s$  among the students who are assigned a slot from school  $s_0$ .
- There is at least one cycle. In each cycle, corresponding trades are performed, and all student-school pairs which participate in a cycle are removed.

## ETTC

**Proposition 1:** ETTC is Pareto efficient

**Proposition 2:** ETTC is strategy-proof

## ETTC vs TTC

**Proposition 3:** Suppose there are two schools. If student  $i$  is in top  $q_s$  priority group for school  $s$ . Then, under ETTC student  $i$  never has justified envy. This is not the case under TTC.

**Proposition 4:** Suppose there are two schools. If ETTC selects an unfair allocation for a problem, then TTC also selects an unfair allocation for the same problem. The converse is not necessarily true.

## Experiment

- The aim: compare TTC and ETTC from equity criterion in lab.
- The design is based on Chen and Sönmez, 2006.
- Two treatments: TTC and ETTC
- Three environments under complete information
  - Designed
  - Random correlated
  - Random uncorrelated
- 7 sessions for each algorithm, total 140 subjects.
- Each session took about 90 min, average payoff of €15.32.

## Environments

- Designed environment
  - 3 schools (3,3,4 slots). Designed to get an allocation without justified envy under ETTC.
- Random correlated environment
  - 5 school, 2 slots each. 6 students prefer schools D or E, other 4 students prefer A or C. Fair allocation is not feasible under ETTC nor TTC.
- Random uncorrelated environment
  - 4 schools (2,2,3,3 slots). Random preferences (But district school is never the first choice)

# Hypothesis

## Hypothesis 1:

Participants of the experiment choose to state their true preferences for allocations under both TTC and ETTC as both mechanisms are strategy proof.

## Hypothesis 2:

TTC and ETTC should not differ from the efficiency criteria, as both mechanisms are Pareto-efficient.

## Hypothesis 3:

On average, the number of justified envy outcomes generated by ETTC should be lower than those of TTC.

## Results

### Result 1 (Truthful Preference Revelation):

In all environments, the differences in proportions of truthful preference revelation under TTC and under ETTC are not statistically significant.

	Designed environment	Random- correlated environment	Random- uncorrelated environment
TTC	57%	30%	37%
ETTC	56%	27%	40%
Test of proportions, p value	0.865	0.708	0.728

proportions, p value

Test of proportions, p value

0.708

0.728

## Results

### Result 2 (Efficiency):

In all environments, the differences in efficiency under TTC and under ETTC are not statistically significant.

Mechanism		TTC	ETTC	p-value
Designed environment	Mean efficiency	86.38%	82.37%	0.70
	Asymptotic standard error	0.026	0.028	
Random-correlated environment	Mean efficiency	91.37%	89.30%	0.80
	Asymptotic standard error	0.015	0.019	
Random-uncorrelated environment	Mean efficiency	84.51%	84.65%	0.95
	Asymptotic standard error	0.001	0.001	



### Result 3 (Number of justified envy outcomes):

In the designed and random-correlated environments ETTC produces significantly less justified envy outcomes than TTC does. In random-uncorrelated environment, the difference in the number of justified envy outcomes produced by ETTC and TTC is not statistically significant.

Mechanism		TTC	ETTC	p-value
Designed environment	Mean number of justified envy outcomes	4.76	2.89	0.03
	Asymptotic standard error	0.66	0.58	
Random-correlated environment	Mean number of justified envy outcomes	9.62	8.43	0.00
	Asymptotic standard error	0.61	0.16	
Random-uncorrelated environment	Mean number of justified envy outcomes	3.80	3.42	0.25
	Asymptotic standard error	0.42	0.49	

## Result 4 (Number of students with justified envy):

In the designed and random-correlated environments ETTC produces significantly less students have justified envy to other students than under TTC. In random-uncorrelated environment, the difference in the number of justified envy under ETTC and TTC is not statistically significant.

Mechanism		TTC	ETTC	p-value
Designed environment	Mean number of students with justified envy outcomes	3.85	2.25	0.00
	Asymptotic standard error	0.48	0.42	
Random-correlated environment	Mean number of students with justified envy outcomes	7.04	5.61	0.00
	Asymptotic standard error	0.29	0.36	
Random-uncorrelated environment	Mean number of students with justified envy outcomes	2.97	2.98	0.98
	Asymptotic standard error	0.29	0.45	

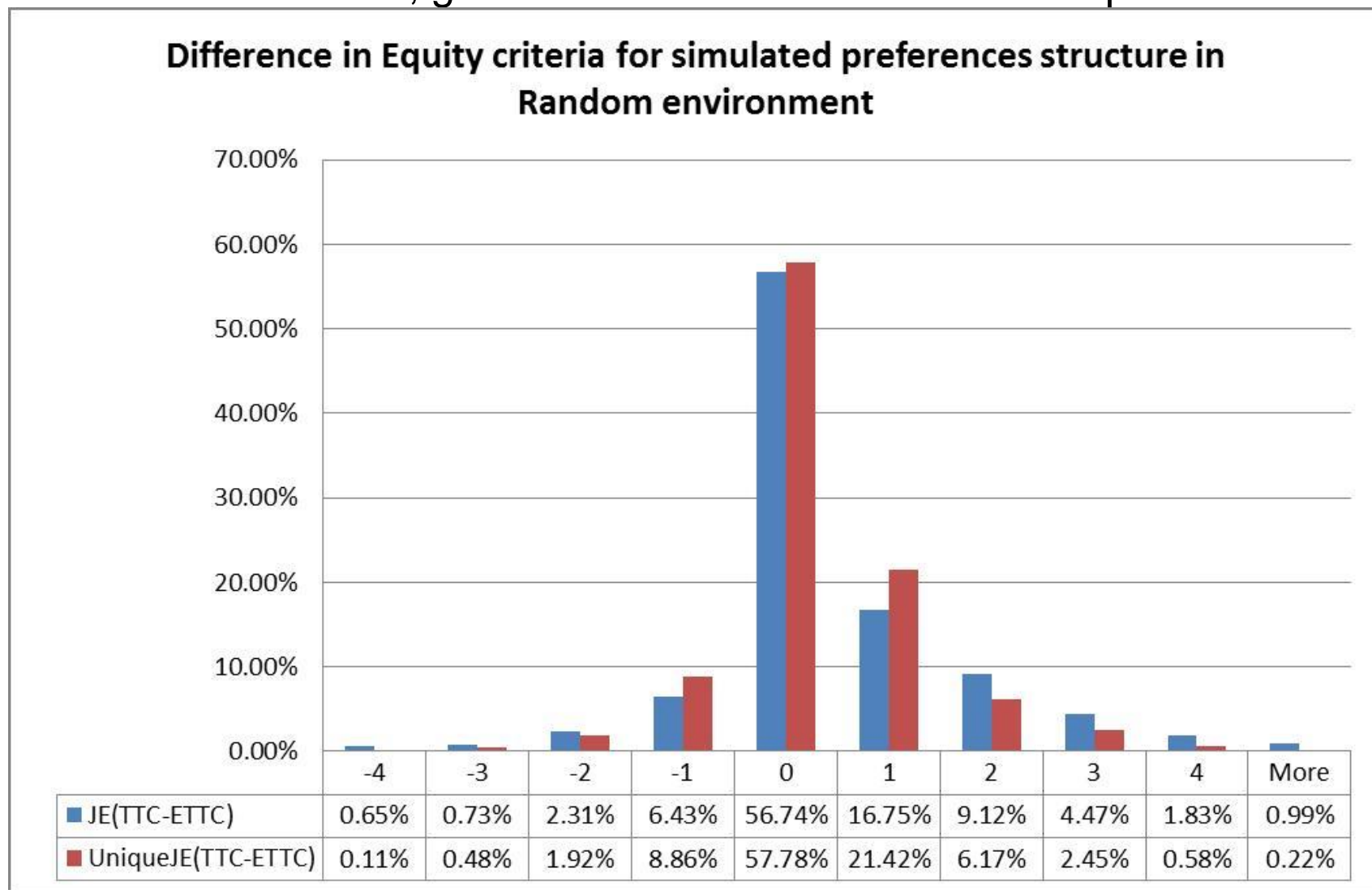
## Analyses with respect to stated preferences

- Designer's concern
- Long-run learning

Random environment (the least favorable for ETTC)

- Find allocation by ETTC and TTC for the same preference profiles and compare

**Result 5 (Equity dominance):** ETTC is more likely to generate less justified envy outcomes and less students with justified envy than TTC in all environments, given the students reveal their true preferences.



## Conclusions

- We introduced ETTC mechanism for fairness concern.
- ETTC significantly outperforms TTC in the lab by equity criteria.
- With respect to stated preferences even in case of uncorrelated preferences ETTC on average produces significantly less number of justified envy.

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## Thank you!



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