

# On Stable and Efficient Mechanisms for Priority-based Allocation Problems

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Workshop on Matching, Search and Market Design  
National University of Singapore (IMS)  
July 24, 2018

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- $S$  : the set of schools (objects) to be assigned; each  $s \in S$  has  $q_s$  seats
- $I$  : the set of students (agents)
- $P_i$  : the strict **preference** of student  $i$  on  $S \cup \{\emptyset\}$
- $\mu : I \rightarrow S \cup \{\emptyset\}$  is an **assignment** if  $|\mu^{-1}(s)| \leq q_s, \forall s$

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A **mechanism**  $\varphi$  maps every reported preference profile  $P$  to an assignment  $\varphi(P)$

## "Good" mechanisms

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- Top Trading Cycles (TTC)-Based Mechanisms, include serial dictatorships, priority-based TTC, hierarchical exchange rules, and trading cycles mechanisms.<sup>1</sup> They all follow endow-then-trade and have a recursive structure
- Deferred Acceptance Mechanisms, when the priority structure is acyclic (Ergin, 2002)

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Our questions: What is driving the efficiency and GSP of these DA mechanisms? How are these DA and TTC related?

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Step 1. Each student applies to her most favorite school. Each school tentatively accepts the best students up to its quota and rejects the rest.

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$DA^{\succ, q}$  always produces the student-optimal stable assignment, but it is efficient only when  $(\succ, q)$  is acyclic (Ergin, 2002)

## A simple example

Suppose  $S = \{s_1, s_2\}$ ,  $I = \{1, 2, 3\}$ ,  $q_{s_1} = 1$ , and  $q_{s_2} = 2$ . Schools' priority lists and students' top preferences are as follows:

$\succ_{s_1}$	$\succ_{s_2}$
1	3
2	2
3	1
<span style="border: 1px solid black; padding: 2px;">2, 3</span>	<span style="border: 1px solid black; padding: 2px;">1</span>

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2	2	2	2
3	1	3	1
<hr/>		<hr/>	
2, 3	1	2	1, 3

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<hr/>		<hr/>	
2, 3	1	2	1, 3

- $\{1, 2\}$  satisfies the following: assigning students in it to their favorite schools is not objectable by student 3, no matter what  $P_3$  is
- We will (iteratively) identify sets like  $\{1, 2\}$ , then assign and remove them. We show that this process is solvable iff  $DA^{\succ, q}$  is efficient

## Related literature

(Efficient) DA: Gale and Shapley (1962), Ergin (2002), Kojima and Manea (2010)

TTC-based mechanisms: Shapley and Scarf (1974), Abdulkadiroglu and Sonmez (2003), Papai (2000), Pycia and Unver (2017)

Vary TTC for stability: Kesten (2004), Kesten (2006), Morrill (2015), Abdulkadiroglu et al. (2017)

## Assignment criteria

### Definition

Assignment  $\nu$  Pareto dominates  $\mu$  if  $\forall i \in I, \nu(i) R_i \mu(i)$  and  $\nu \neq \mu$ .  
An assignment is **(Pareto) efficient** if it is not Pareto dominated

### Definition

$\varphi$  is **group strategy-proof** if there is no  $\emptyset \neq J \subset I, P$ , and  $P'_J$ , such that  $\forall i \in J, \varphi(P'_J, P_{-J})(i) R_i \varphi(P)(i)$  and for some  $j \in J, \varphi(P'_J, P_{-J})(j) P_j \varphi(P)(j)$

### Definition

At assignment  $\mu, i$ 's **priority at  $s$  is violated** if  $i$  desires  $s$  but someone with lower priority is assigned;  $\mu$  is **fair** if there is no priority violation

### Definition

An assignment  $\mu$  is **stable** if it is fair and nonwasteful (all desired schools are fully assigned)

## Top fair set (TFS)

Fix  $(\succ, q; P)$ . A set of students  $T$  form a TFS if assigning them to their favorite schools violates no priority, no matter what  $P_{-T}$  is



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### Definition

A nonempty set of students  $T \subset I$  is a **TFS** if  $\forall i \in T$  and her favorite school  $s \cup \{\emptyset\}$ ,

$$r_s(i) - |\{i' \in T : i' \succ_s i, i' \text{ favors } s' \neq s\}| \leq q_s.$$

where  $r_s(i)$  denote  $i$ 's rank at  $s$ ;

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where  $r_s(i)$  denote  $i$ 's rank at  $s$ ; or equivalently, if

$$|\{j \notin T : j \succ_s i\}| \leq q_s - |\{i' \in T : i' \text{ favors } s\}|.$$

## Example

Suppose  $I = \{1, 2, 3, 4, 5\}$ ,  $S = \{s_1, s_2, s_3\}$ ,  $q_{s_1} = 2$ , and  $q_{s_2} = q_{s_3} = 3$ . Assume schools' priority lists and students' top preferences are as follows:

$\succ_{s_1}$	$\succ_{s_2}$	$\succ_{s_3}$
1	2	5
2	5	3
3	3	1
4	4	4
5	1	2
3, 4, 5	1	2

TFS	
$T_1$	{1, 2, 3}
$T_2$	{1, 2, 4}
$T_3$	{1, 2, 3, 4}

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- $4 \in T_2$ , but 4 is not ranked among top-quota at any school

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- $4 \in T_2$ , but 4 is not ranked among top-quota at any school
- TTC involves trading among 1, 2, and 5; its assignment is not fair

## TFS vs. TTC

- Both identify students who should be assigned their favorite schools
- Both are decisive: their formations are independent of others' preferences
- TFS is justified by fairness, while TTC by trading (endowments or priorities)
- When  $q_s = 1, \forall s$ , TFS reduces to the union of TTCs

## Non-existence of TFS

Modify the first example by reducing  $q_{s_2}$  to one:

$\succ_{s_1}$	$\succ_{s_2}$			
1	3	$P_1$	$P_2$	$P_3$
2	1	$s_2$	$s_1$	$s_1$
3	2	$\emptyset$	$s_2$	$s_2$
2, 3	1			

Even though for the  $P$  above,  $DA^{\succ, q}(P)$  is an efficient assignment,  $TFS$  does not exist at  $(\succ, q; P)$

# Properties of TFS

## Proposition

Fix a school choice problem  $(\succ, q; P)$ :

(i) If both  $T$  and  $T'$  are TFS, then so is  $T \cup T'$ ;



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(i) implies the existence of a maximal TFS, if any TFS exists; (ii) shows that assigning by TFS has a form of consistency

## Finding TFS

For any school choice problem  $(\succ, q; P)$ , an **(iterative) elimination process** operates as follows:

Step 1. Let each student apply to her favorite school. Then let each school select the best applicants up to its quota; the rest are eliminated

Step  $t, t \geq 2$ . For each  $s \in S$ , operate the following: let **all** students who have ever been eliminated apply to  $s$ . Then let  $s$  select the best applicants among new applicants and accepted students; the rest are eliminated.

Stop when no new students are eliminated

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### Proposition

*The set of students who survive the elimination process, if nonempty, is the maximal TFS. If it is empty, then no TFS exists*

# TFS algorithm

For each preference profile  $P$  of students,  $TFS^{\succ, q}$  operates as follows:

Step 1. If  $(\succ, q; P)$  has no TFS, stop. Otherwise, find a TFS, assign and remove it

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## Definition

A priority structure  $(\succ, q)$  is **TFS-solvable** if at any  $P$ ,  $TFS^{\succ, q}$  produces a complete assignment

# Main result

## Theorem

$(\gamma, q)$  is TFS-solvable if and only if  $DA^{\gamma, q}$  is Pareto efficient

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$(\succ, q)$  is TFS-solvable if and only if  $DA^{\succ, q}$  is Pareto efficient

Moreover, if  $(\succ, q)$  is TFS-solvable, then  $TFS^{\succ, q}(\cdot) = DA^{\succ, q}(\cdot)$



## Ergin's characterization

### Definition (Ergin, 2002)

$(\succ, q)$  is **acyclic** if  $\nexists$  distinct schools  $s_1, s_2$  and distinct students  $i, j, k$  such that: (i)  $i \succ_{s_1} j \succ_{s_1} k \succ_{s_2} i$ ; and (ii)  $\exists$  disjoint  $I_{s_1}, I_{s_2} \subset I \setminus \{i, j, k\}$  such that  $I_{s_1} \succ_{s_1} j, I_{s_2} \succ_{s_2} i, |I_{s_1}| = q_{s_1} - 1$ , and  $|I_{s_2}| = q_{s_2} - 1$

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## Theorem (Ergin, 2002)

$(\succ, q)$  is acyclic iff  $DA^{\succ, q}$  is Pareto efficient (or GSP, or consistent)

## Corollary

$(\succ, q)$  is TFS-solvable if and only if it is acyclic

# Implications

- When  $(\succ, q)$  is acyclic, the TFS-decomposition of  $DA^{\succ, q}$  makes its efficiency, GSP, and consistency more intuitive
- TFS reveals that efficient DA mechanisms also have an iterative removal structure, as the TTC-like mechanisms
- Efficient DA vs. other good mechanisms reduces to TFS vs. TTC

## Extend TFS?

We do not yet know how to properly extend (weaken) TFS for priority structures that are not acyclic

This relates to finding a maximally stable good mechanism.

Attempts include Kesten's ETTC and Morrill's Clinch-and-Trade, but the goal has not been achieved (Abdulkadiroglu et. al, 2017)

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A natural way is to remove TFS if it exists and otherwise remove TTC. However, such a mechanism is not strategy-proof

$\succ_{s_1}$	$\succ_{s_2}$	$\succ_{s_3}$	$P_1$	$P_2$	$P_3$	$P_4$
1	3	4	$s_2$	$s_3$	$s_1$	$s_1$
2	2	3	$\vdots$	$s_1$	$\vdots$	$s_3$
3	1	2		$s_2$		$s_2$
4	4	1				
3, 4	1	2				

## Conclusion

- We discover a hidden structure, TFS, from existing DA mechanisms; it is the only known alternative to TTC
- TFS improves our understanding of efficient and GSP mechanisms
- When schools have substitutable (or more general) priority, the definition of TFS can be naturally extended
- We don't know how to properly extend the TFS algorithm to cyclic priority structures to design new mechanisms

Thank you.