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School Allocation with Observable Characteristics

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Question

- School Allocation Problem
- Deferred Acceptance (DA) with school priority to local students (or students with siblings)
- School priorities are designed by the social planner
- Why such priorities?
- Why DA not random priority or any other mechanism?

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Answer

- Maybe planer knows something about students' preferences, e.g. transportation cost,
- Students have observable characteristics, e.g. neighborhood, race, caste, tribe



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Properties

- We restrict to ordinal mechanisms because it is easier for the students who report ordinal preferences
- We restrict to mechanisms that satisfy the following properties:
- Standard: envy-freeness, efficiency
- New: group symmetry (relaxing symmetry)
 - We want to find the mechanism that maximizes expected cardinal utilities

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Results and Conjectures

- We show that such symmetric, envy-free and efficient mechanism exist and is given by a modified version of Probabilistic Serial (PS)
- We would like to find conditions under which this mechanism is equivalent to the DA algorithm with priorities

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Model

- L schools and K characteristics
- For example, if the characteristics is district the student lives in, then K = L
- c_l is the capacity for school l
- μ_k is the amount of students with characteristics k
- a profile of preferences is a distribution µ where µ (k, p) is the fraction of students who have characteristics k and preference p

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Ordinal Preferences

- Preferences *p* are permutations of {1,2,...,*L*} (i.e. they are strict), call the set of preferences $\mathcal{P}(L)$
- Preference profiles have full support (i.e. for each k and $p, \mu(k, p) > 0$)

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Cardinal utilities

- Students have cardinal utilities
- The utility distribution *f_k* needs to be consistent with the preference profile *µ*:

$$\int_{p(u)=p} f_k(u) \, du = \frac{\mu(k,p)}{\mu_k}$$

where p(u) is the ordinal preference induced by utility $u = (u_1, u_2, u_3..., u_L)$

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Allocations and FOSD

• An allocation is a lottery over schools $q \in \Delta(L)$:

$$\sum_{l}q(l)=1$$

• Preferences over allocations are given by First Order Stochastic Dominance:

$$q \succeq^{FOSD} q' \text{ if } \forall I, \sum_{l' \succeq s^{I}} q(l') \ge \sum_{l' \succeq s^{I}} q'(l')$$
$$q \succ^{FOSD} q' \text{ if } \forall I, \sum_{l' \succeq s^{I}} q(l') > \sum_{l' \succeq s^{I}} q'(l')$$

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Mechanisms

 A mechanism is a function q : I → Δ(L) that maps each student from the set of all students I to an allocation

Abuse of notation: q(l; i) is both the allocation and the mechanism that assigns this allocation to student i

• An mechanism is feasible if:

$$\int q\left(l;i\right)d\mu \leq c_l$$

Abuse of notation: $\mu(i)$ is the distribution of students

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Properties

• Formal definitions:

- Group symmetry: q (1; i) only depends on group k and reported preference p, not on identity
- ② Envy-free: there does not exist *j* such that $q(j) \succ_i^{FOSD} q(i)$, where *i*, *j* both have characteristics *k*
- Sefficient: there does not exist allocation q' such that q'(i) ≿^{FOSD}_i q(i) ∀ i, and q'(i) ≻^{FOSD}_i q(i) for i in a set of students with positive measure

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Notation

• Since we restrict to mechanisms that are group symmetric, define a mechanism as:

$$q: \mathcal{K} imes \mathcal{P}\left(L
ight)
ightarrow \Delta\left(L
ight)$$
 such that $\sum_{k,p} q\left(l;k,p
ight) \mu\left(k,p
ight) \leq c_{l}$

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Welfare Maximization

- The total welfare is the sum of expected utilities
- An allocation is optimal if it maximizes the total welfare

$$W(q) = \sum_{k=1}^{K} \int uq(l; k, p(u)) \mu(k, p(u)) f_k(u) du$$

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PS Mechanism

- Each school has size c_l
- Each student eats his or her favorite among the remaining (not completely eaten) schools at rate 1
- The amount of school *l* eaten by a student with preference *p* at time 1 is the probability he or she gets allocated to school *l*

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PS Example

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Bogomolnaia and Moulin (2001)

- Introduced the PS mechanism
- Characterized the mechanism by symmetry, envy-freeness and efficiency
- Any PS allocation is symmetric, envy-free and efficient
- Not all symmetric, envy-free and efficient allocation can be obtained by PS

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Liu and Pycia (2014)

- Added the full support condition
- All full support, envy-free and efficient allocation can be obtained by PS

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Modified PS Mechanism

• First assign capacities to group $k : c_l^k$ such that

$$\sum_{k=1}^{K} c_l^k = c_l \; \forall \; l \in L$$
$$\sum_{l=1}^{L} c_l^k = \mu_k \; \forall \; k \in K$$

• Then run PS for each group separately

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Modified PS Example

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Characterization of PS

Proposition

A mechanism is group symmetric, envy-free and efficient if and only if it is obtained by the modified PS for some capacities

- Group symmetry is implied by the definition q(l; k, p)
- $PS \Rightarrow envy$ -free and efficient (similar arguments from Bogomolnaia and Moulin (2001))
- envy-free and efficient \Rightarrow PS (similar arguments from Liu and Pycia (2014))

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Welfare function

- We restrict our attention to symmetric, envy-free and efficient mechanisms (i.e. PS with group capacities)
- Let $q^{PS}(c)$ be the allocation obtained by PS with group capacities c:

$$\max_{q} W\left(q\right) = \max_{c} W\left(q^{PS}\left(c\right)\right)$$

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Properties of Welfare function

• Define the welfare for group k:

$$W_{k}(q) = \int uq(I; k, p(u)) \mu(k, p(u)) f_{k}(u) du$$

• The welfare maximization is:

$$\max_{c}\sum_{k=1}^{K}W_{k}\left(q^{PS}\left(c
ight)
ight)$$
 such that $\sum_{k}c_{l}^{k}\leq c_{l}$ and $\sum_{l}c_{l}^{k}\geq \mu_{k}$

Proposition

 $W_{k}\left(q^{PS}\left(c
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ight)$ is non-decreasing and concave in c

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Two school case

- Only two schools and two characteristics (local students and non-local students)
- The welfare functions are piecewise linear, non-decreasing and concave in individual group capacities
- The resulting allocation is the same as the DA allocation

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Two school example, equal capacity

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Two school example, optimal capacity

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DA Mechanism

- Every student proposes to his or her favorite school that has not rejected him or her
- The schools temporarily reject equal fraction of students with less preferred characteristics

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Modified DA Mechanism

- We need to modify the algorithm for continuum of students
- Keep track of the fraction of students rejected with each characteristics
- At the beginning of each round, reject the same fraction of students who propose to this school for the first time

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Two-school example

- The modification is not needed for the K = L = 2 case
- The resulting allocation is the same as the PS allocation with optimal capacities

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Still working on showing

- Either DA can generate optimal capacities or DA is not optimal
- Characterize the utility distributions such that DA is equivalent to PS with optimal capacities
- Other suggestions?