Two-sided problems with choice functions, matroids and lattices

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A competition problem

Prove that any finite subset H of the planar grid has a subset K with the property that

- 1. any vertical or horizontal line intersects K in at most 2 points,
- 2. any point of $H \setminus K$ lies on a vertical or horizontal segment determined by K.



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In a certain country intercity traffic is served by trains and coaches. Both the railway and bus company runs its lines between certain pairs of cities, but between two cities there migth be no line that goes both ways. We know that no matter how we pick two cities, one can travel from one city to the other either by bus or by train, perhaps with changes, and the opposite travel is not necessarily possible. Prove that there exists a city from which any other city is reachable with possible changes by using only one mean of transport such that for different cities we might need different kind of transport.



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Hey! Who cares about obscure competion problems??? We wanna learn about two-sided markets. Give us value for the money!!!

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student-dominated applications $\mathcal{D}_{A}(S)$

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Property:

If students are offered $S \cup \mathcal{D}_A(S)$ then they choose S, if colleges are offered $S \cup \mathcal{D}_C(S)$ then they choose S. That is, $\mathcal{C}_A(S \cup \mathcal{D}_A(S)) = S$ and $\mathcal{C}_C(S \cup \mathcal{D}_C(S)) = S$.



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The deferred acceptance algorithm

Gale-Shapley Theorem: There always exists a stable matching.

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Gale-Shapley Theorem: There always exists a stable matching. **Proof** Boys propose, girls reject alternatingly until no rejection. Generalization for choice functions.

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Kelso-Crawford Theorem: If ch fns C_A and C_C are substitutable and path independent then the above algorithm finds a stable set. **Stupid question**: What makes this algorithm work?

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Corollaries and applications

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Both C_W and C_M are substitutable and PI. So GS works.



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The man-oriented GS algorithm finds the man-optimal stable solution: the "widest" set of gridpoints. The woman-optimal solution would be the "tallest" such set.

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Def: $C_{\preceq}(U)$: the set of \preceq -minima of U for partial order \preceq on V. **Fact**: C_{\preceq} is substitutable and path independent. **Corollary**: If \preceq and \preceq' are partial orders on V then there is a subset S of V such that no two elements of S are comparable in \preceq or in \preceq' and for any element $x \in V \setminus S$ there is an element s of Ssuch that $s \preceq x$ or $s \preceq' x$ holds.

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Stronger lattice property: If both C_A and C_C are increasing and substitutable then lattice operations in Blair's thm are $S_1 \wedge S_2 = C_A(S_1 \cup S_2)$ and $S_1 \vee S_2 = C_C(S_1 \cup S_2)$.

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Gale-Shapley: in the college admissions model (strict preferences and college-quotas) there always exists a stable assignment. (DA, college and student-optimality and lattice property.)
Hamada-Miyazaki-Iwama: if colleges have lower quotas as well then the number of blocking edges is inapproximable.
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NP-completeness: an efficient algorithm for the problem would imply an efficient algorithm for many truly difficult problems.

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Further, if no lower quotas, but common quotas for sets of colleges, then again, the problem is NP-complete.

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Explanation: An applicant might be refused if her admission would imply the violation of some (seemingly independent) lower quota.

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Explanation: An applicant might be refused if her admission would imply the violation of some (seemingly independent) lower quota. **Next goal**: generalization of Huang's framework. **Main tool**: matroid-based choice functions.

A crash course on matroids

Matroid: $\mathcal{M} = (E, \mathcal{I})$ st (1) $\emptyset \in \mathcal{I}$, (2) $A \subseteq B \in \mathcal{I} \Rightarrow A \in \mathcal{I}$, (3) $A, B \in \mathcal{I}$, $|A| < |B| \Rightarrow \exists b \in B \setminus A : A \cup \{b\} \in \mathcal{I}$.

Examples: (1) Linear matroid (vectors with linear independence)

- (2) Graphic matroid (edges of a graph with no cycles)
- (3) Trivial matroid $(\mathcal{I} = 2^E)$
- (4) Uniform matroid truncation of a trivial matroid
- (5) Partition matroid

 $(E = E_1 \cup E_2 \cup ... \cup E_k$ is a partition. $I \in \mathcal{I}$ iff $|I \cap E_i| \leq 1$). (6) Direct sum of uniform matroids $(E = E_1 \cup E_2 \cup ... \cup E_k$ is a partition, $b_1, b_2, ..., b_k$ given. $I \in \mathcal{I}$ iff $|I \cap E_i| \leq b_i \forall i$). Basis: maximal independent set of E (same cardinality) Rank fn: $rk(A) = \max\{|A'| : A' \subseteq A \text{ independent}\}$. Span: $sp(A) := \{e \in E : rk(A \cup \{e\}) = rk(A)$. Greedy prop: maxweight indep set can be constructed greedily deciding on the elements one by one in the order of decr weights. Fact: The matroid greedy alg is a substitutable increasing ch fn.

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"Rural hospitals" Thm: If both C_C and C_A are greedy choice fn's then stable assignments have the same span.

Problem input: Two-sided market between *C* and *A* with set *E* of possible contracts, nested systems $Q_C, Q_A \subseteq 2^E$ of common quota sets, $I, u : Q_A \cup Q_A \rightarrow \mathbb{N}_+$ lower and upper quotas and preferences \prec_C and \prec_A st any common quota set is linearly ordered.

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▶ $F \cup \{e\}$ observes all quotas of Q_C or there is a contract $e \prec_C f \in F$ st $F \cup \{e\} \setminus \{f\}$ obeys all quotas of Q_C and

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Solution: Application of the choice function framework.

Key question: how do colleges decide on accepted contracts if contracts are coming in the order of preference.



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Trick: As span is always the same, either all $C_C C_A$ -stable solutions obey the lower quotas or none of them does. So if Gale-Shapley solution violates a lower quota then no stable assignment exists whatsoever. Otherwise GS outputs a solution.

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• Lesson for Mathematicians:

a practical model might motivate a class of interesting matroids

Thank you for the attention!

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