

Two-sided problems with choice functions, matroids and lattices

Tamás Fleiner¹ Naoyuki Kamiyama²

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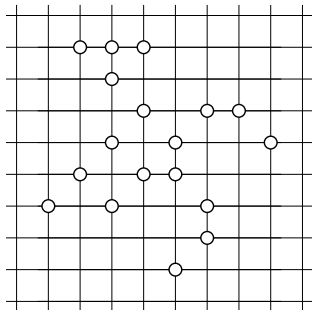
¹Budapest University of Technology and Economics

²Kyushu University

A competition problem

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

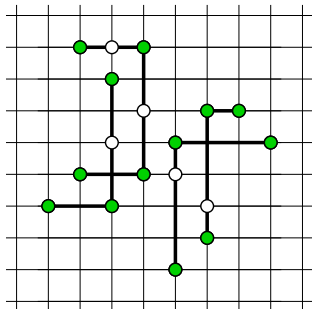
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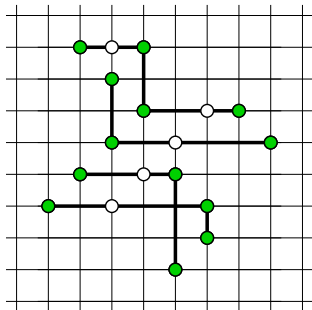
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Two-sided markets: college admissions and graphs

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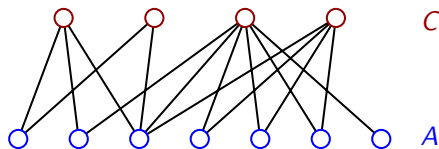
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Model:

Color classes *A* and *C* are applicants and colleges

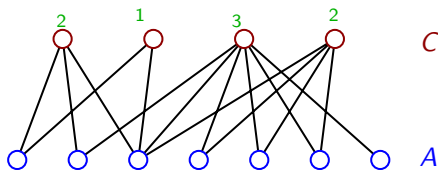
Two-sided markets: college admissions and graphs



Model:

Color classes A and C are applicants and colleges
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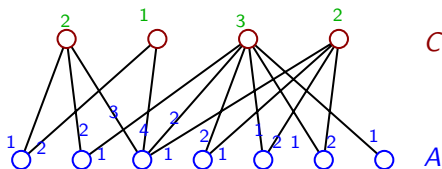
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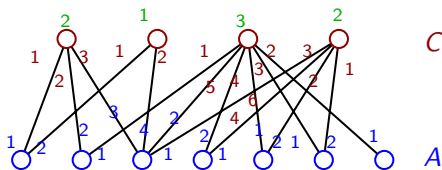
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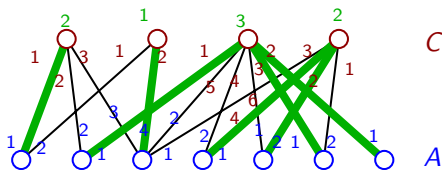
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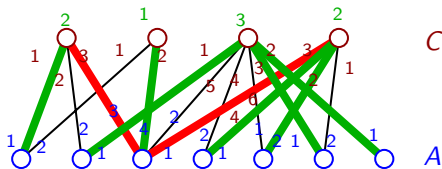
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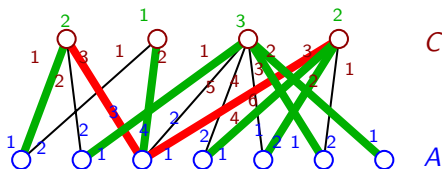
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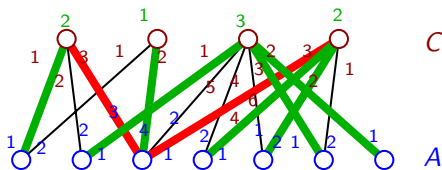
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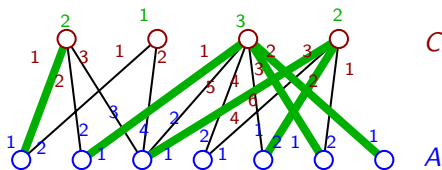
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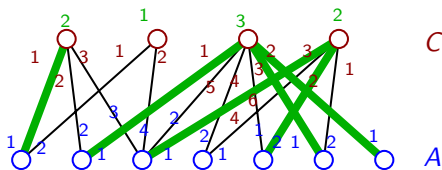
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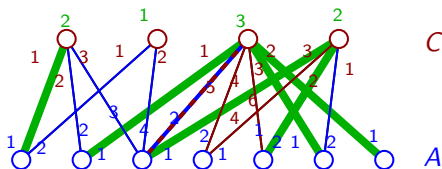
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Or, in other words, an assignment is stable if it dominates all other applications: either the student has a better place or the college has quota many students, each of them is better than the applicant.

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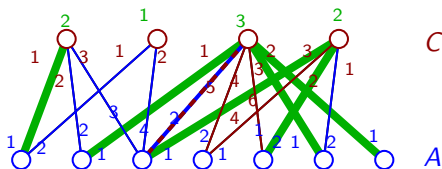
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We can define three sets:

- admitted applications S ,
- student-dominated applications $\mathcal{D}_A(S)$
- and college-dominated applications $\mathcal{D}_C(S)$.

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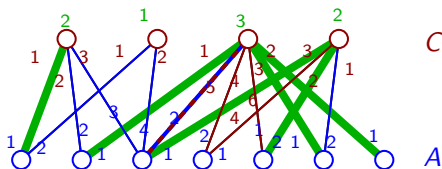
Property:

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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Goal: A choice-function based approach to two-sided markets.

Stability and choice functions

Contract: application (edge of the underlying graph).

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Choice function model: applicants and colleges have choice functions on the contracts: $\mathcal{C}_A(F) \subseteq F$ and $\mathcal{C}_C(F) \subseteq F \quad \forall F \subseteq E$.

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Example: $\mathcal{C}_A(F) :=$ each applicant's best contract from F .

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Abstract definition: Set E of contracts, choice fns \mathcal{C}_A and \mathcal{C}_C .

Subset S of E is **stable** if $\exists X, Y \subseteq E$ st
 $X \cup Y = E, \quad X \cap Y = S \quad \text{and} \quad \mathcal{C}_A(X) = \mathcal{C}_C(Y) = S$.

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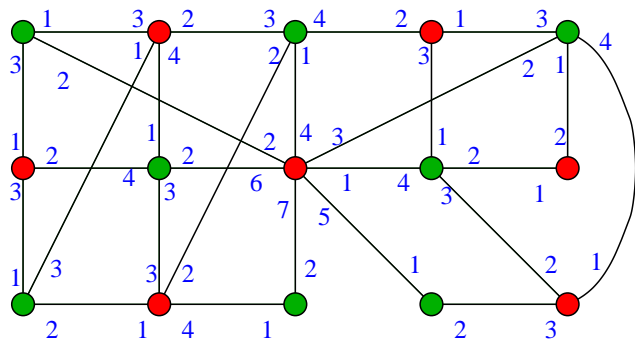
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Fact: If \mathcal{C} is substitutable and increasing then \mathcal{C} is PI.

The deferred acceptance algorithm

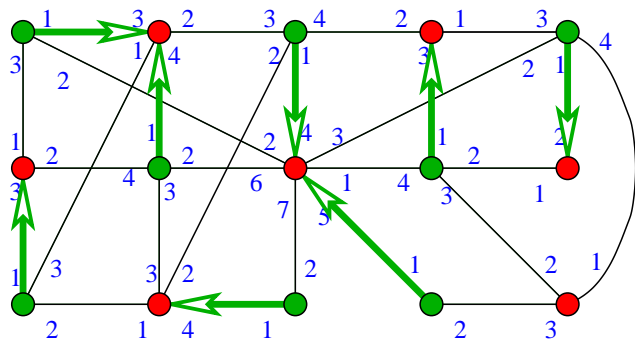
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The deferred acceptance algorithm



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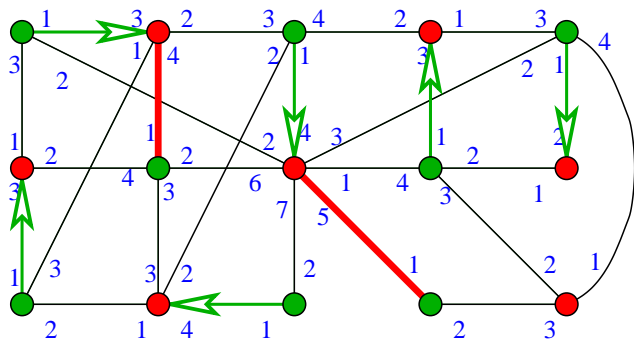
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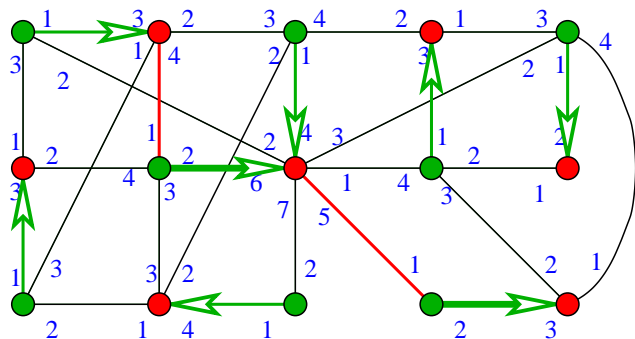
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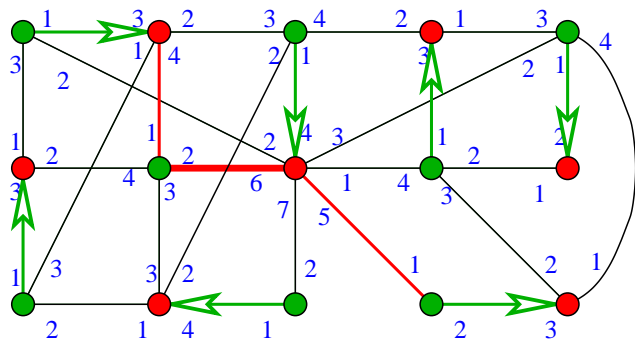
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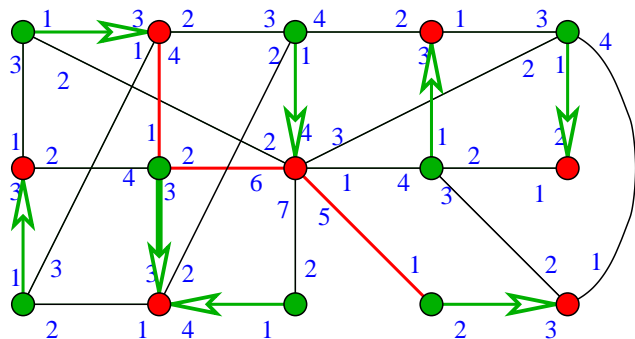
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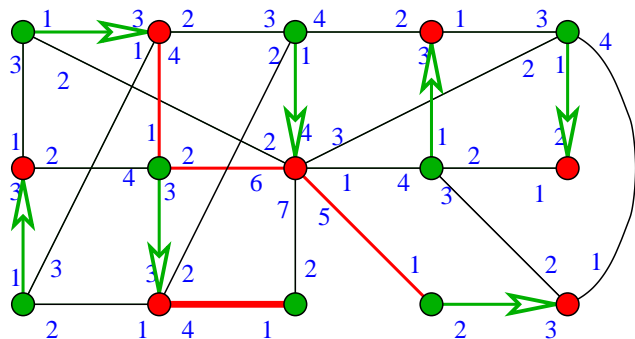
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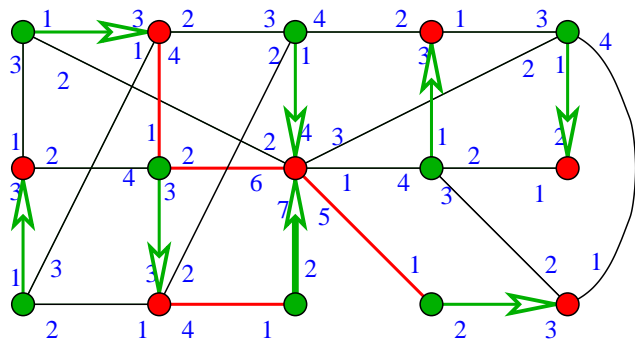
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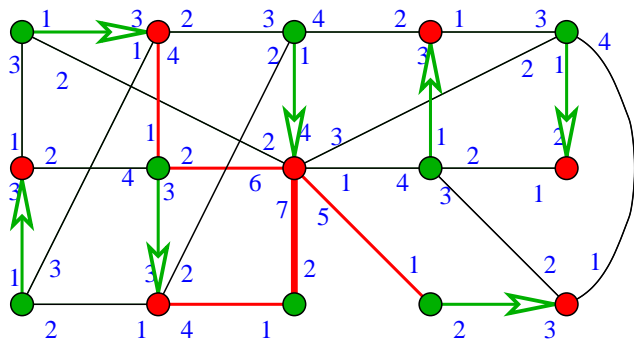
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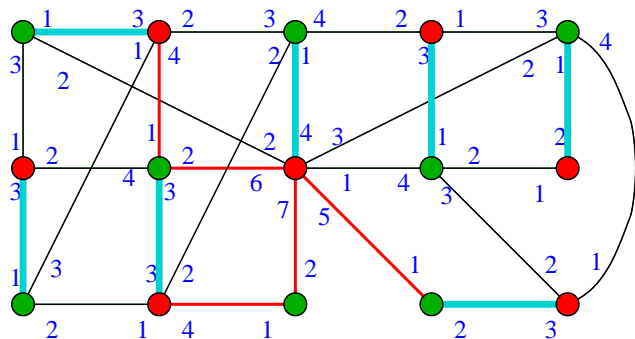
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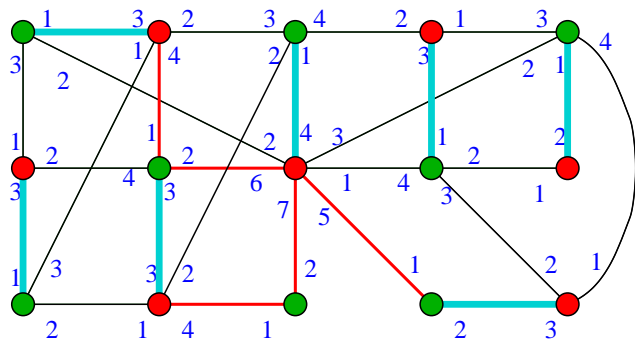
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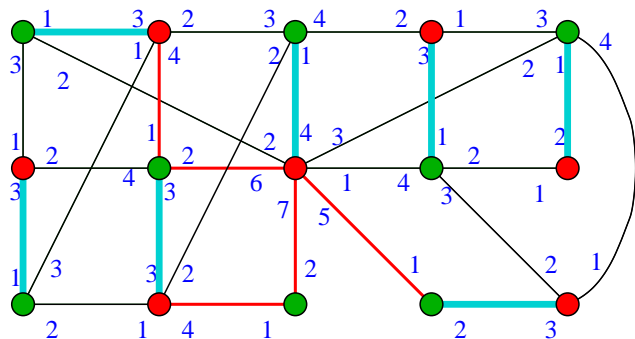


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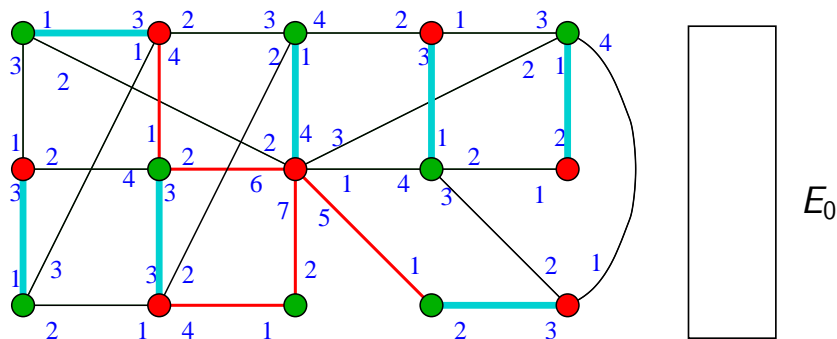
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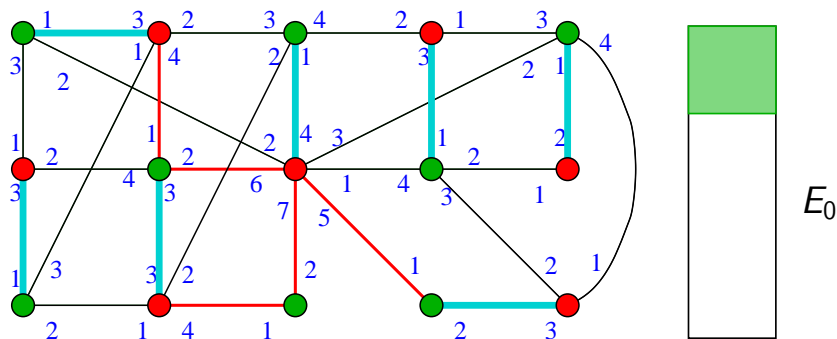
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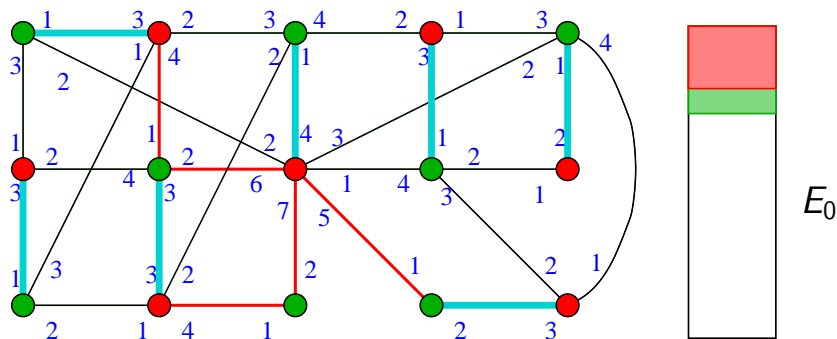
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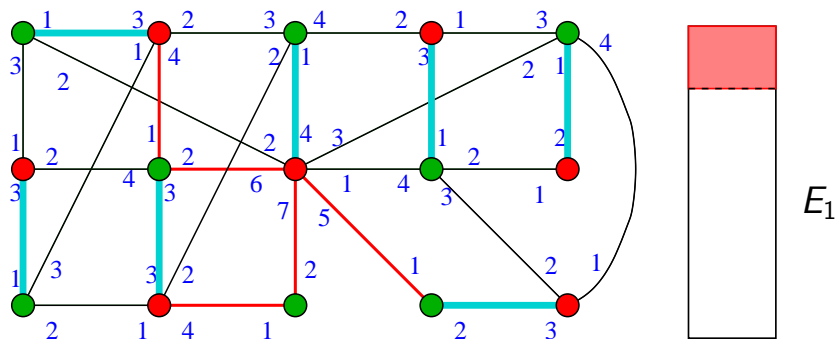
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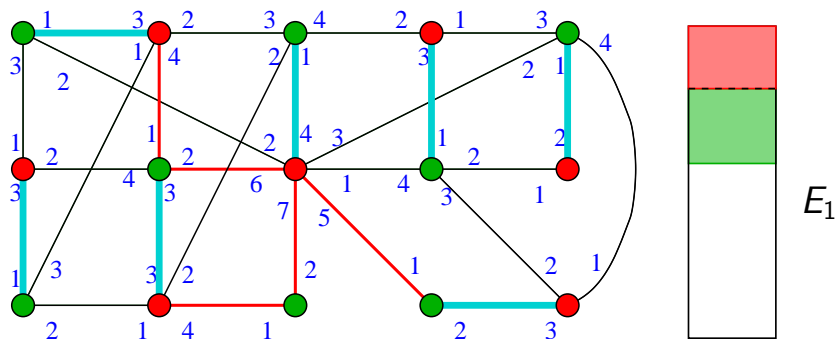
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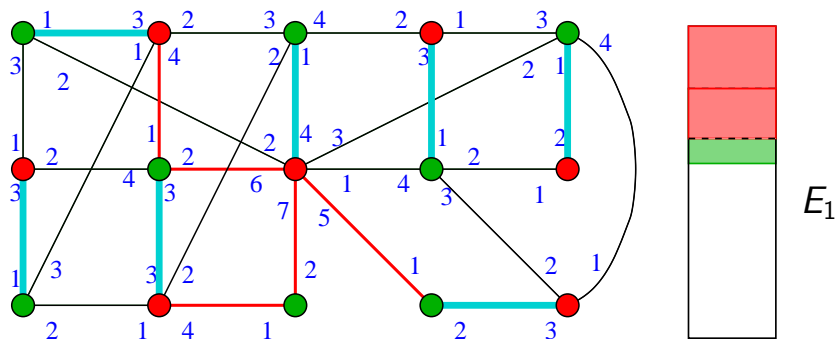
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$$E_0 = E \quad \text{and} \quad E_{i+1} = E_i \setminus (C_A(E_i) \setminus C_C(C_A(E_i))).$$

If $E_i = E_{i+1}$ then $C_A(E_i)$ is the stable solution.

The deferred acceptance algorithm



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

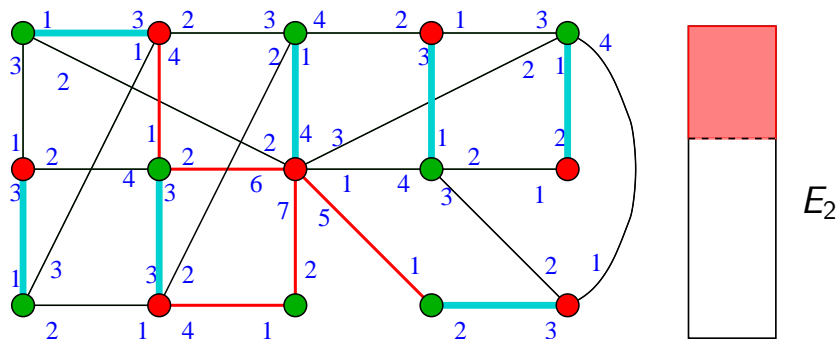
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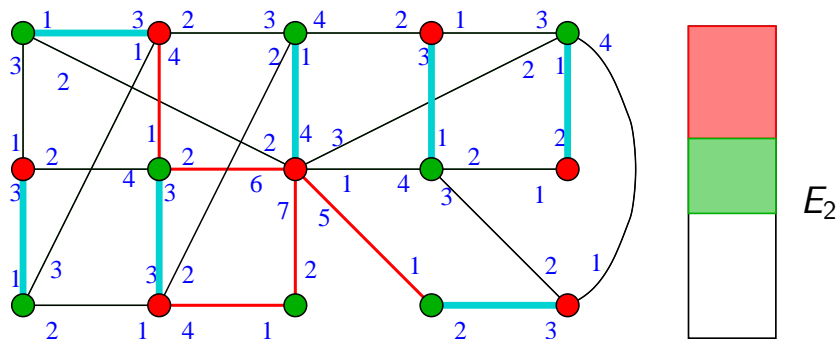
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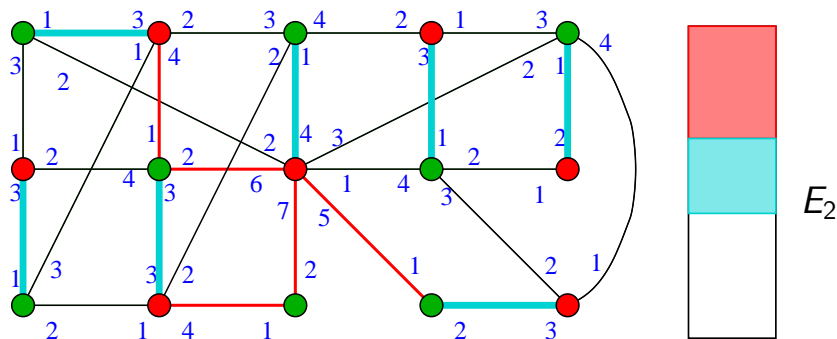
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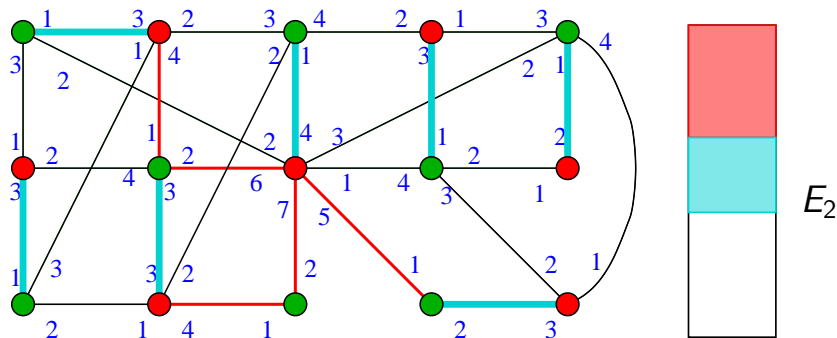
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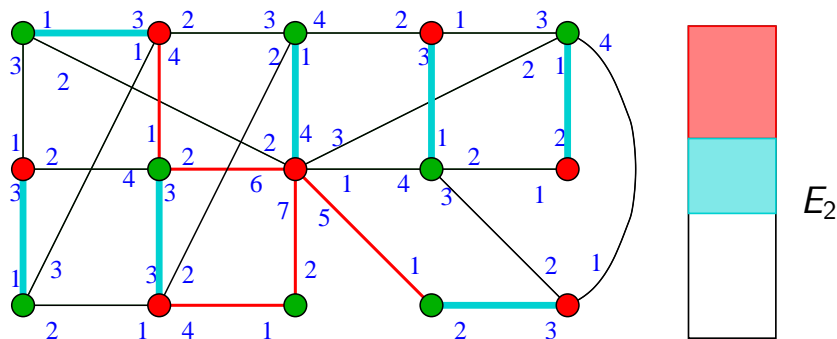
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Stupid question: What makes this algorithm work?

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Observation: The Gale-Shapely algorithm is an iteration of a monotone function. By definition,

$$E_{i+1} = \mathcal{F}(E_i), \text{ where}$$

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Stronger lattice property: If both \mathcal{C}_A and \mathcal{C}_C are increasing and substitutable then lattice operations in Blair's thm are $S_1 \wedge S_2 = \mathcal{C}_A(S_1 \cup S_2)$ and $S_1 \vee S_2 = \mathcal{C}_C(S_1 \cup S_2)$.

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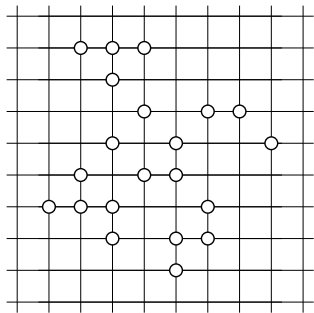
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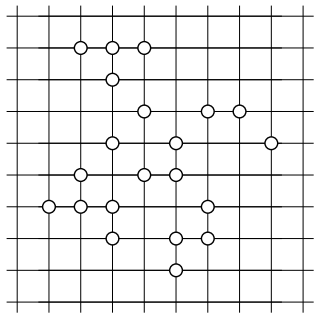
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Both \mathcal{C}_W and \mathcal{C}_M are substitutable and PI. So GS works. □

A special case

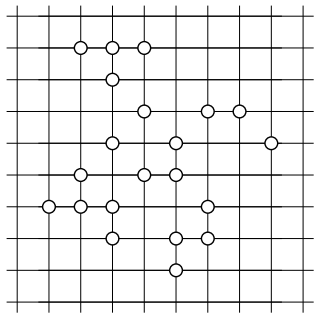


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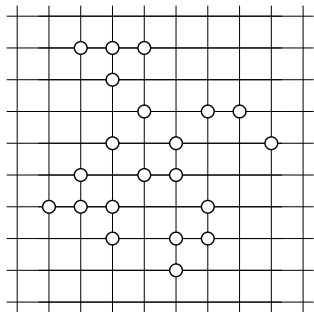
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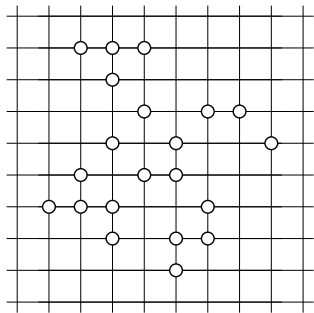
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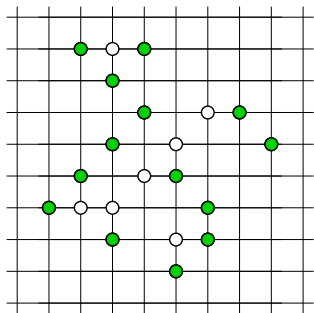


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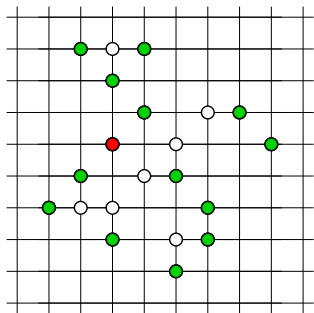


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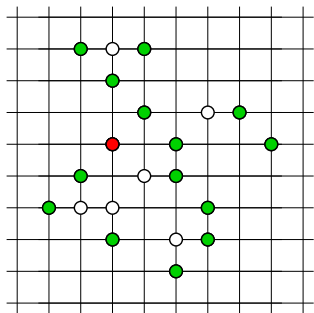


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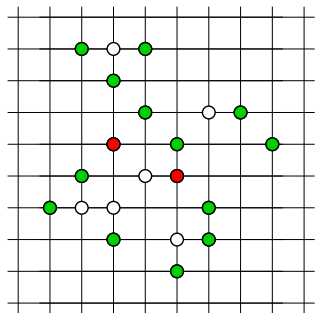


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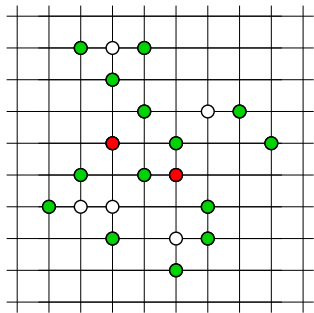


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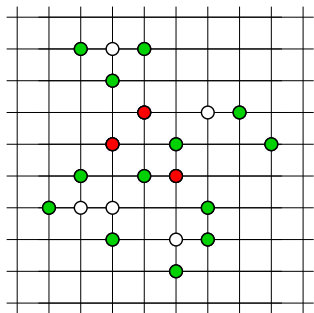


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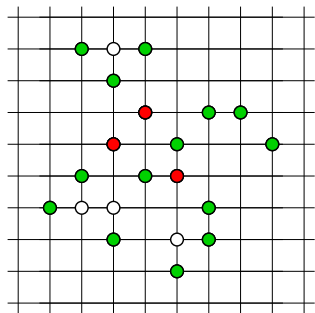
Follow the GS algorithm.

A special case



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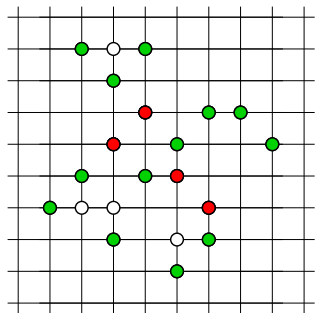


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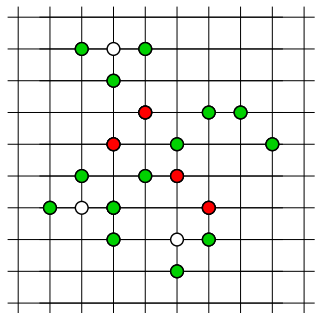


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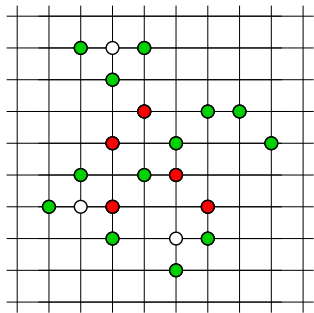


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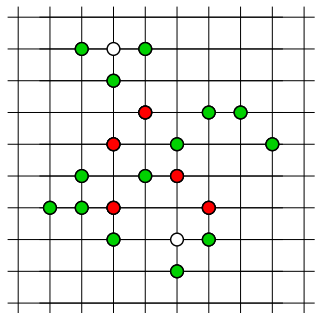


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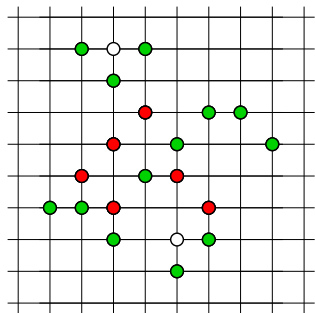


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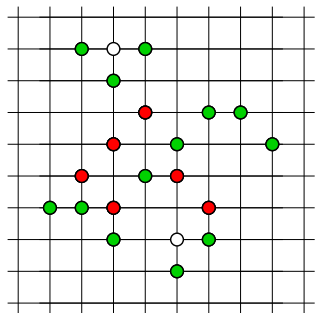


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The man-oriented GS algorithm finds the man-optimal stable solution: the “widest” set of gridpoints. The woman-optimal solution would be the “tallest” such set.

Stable assignments on many-to-one markets

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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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**

($E = E_1 \cup E_2 \cup \dots \cup E_k$ is a partition. $I \in \mathcal{I}$ iff $|I \cap E_i| \leq 1$).

(6) **Direct sum of uniform matroids** ($E = E_1 \cup E_2 \cup \dots \cup E_k$ is a partition, b_1, b_2, \dots, 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.

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“Rural hospitals” Thm: If both \mathcal{C}_C and \mathcal{C}_A are greedy choice fn's then stable assignments have the same span.

The classified stable matching problem

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

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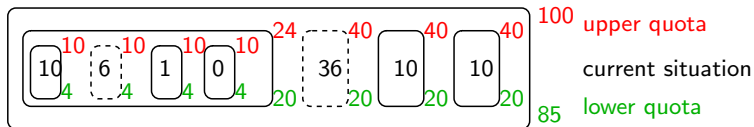
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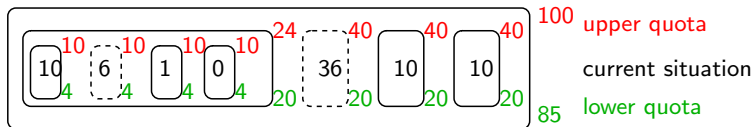
Solution: Application of the choice function framework.

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

Colleges' choice function

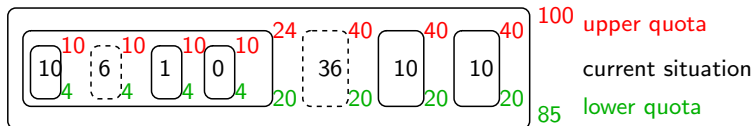


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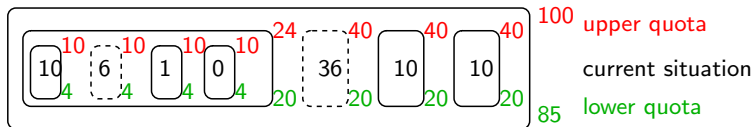
Recursive definition: For $F \subseteq E$, if Q is an inclwise min member of \mathcal{Q}_C then

$$d(Q, F) := \max\{|F \cap Q|, l(Q)\}.$$

If $Q \in \mathcal{Q}_C$ has maximal children Q_1, \dots, Q_k then

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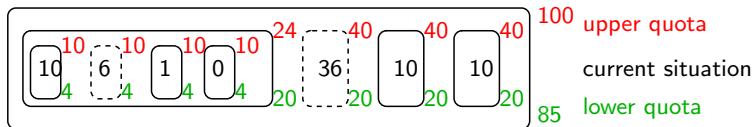
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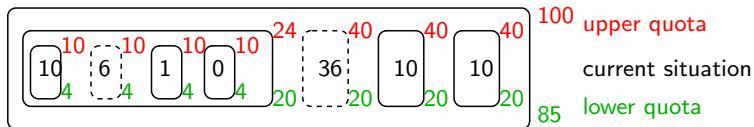
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Trick: As span is always the same, either all $\mathcal{C}_C \mathcal{C}_A$ -stable solutions obey the lower quotas or none of them does. So if Gale-Shapley solution violates a lower quota then no stable assignment exists whatsoever. Otherwise GS outputs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

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- ▶ **Lesson for Mathematicians:**
a practical model might motivate a class of interesting matroids

Thank you for the attention!