

Equitable stable matchings under modular assessment

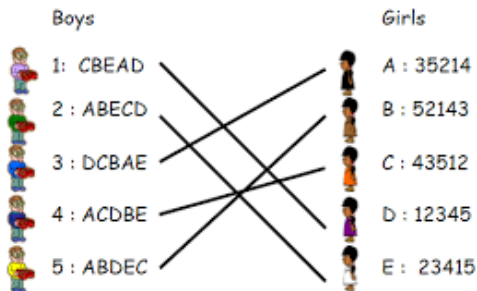
AHMET ALKAN

Sabancı University

KEMAL YILDIZ

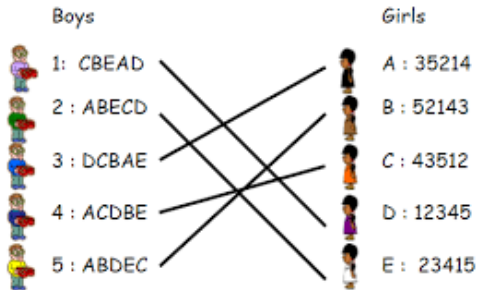
Bilkent University & Princeton University

a two-sided matching (marriage) problem



M and W are equal-sized sets of men and women ($N = M \cup W$)

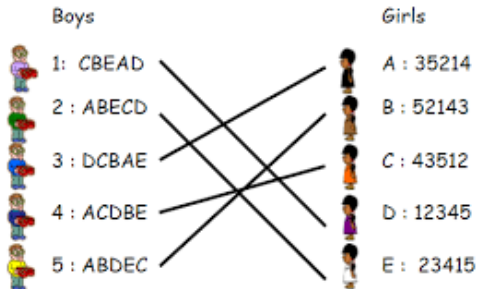
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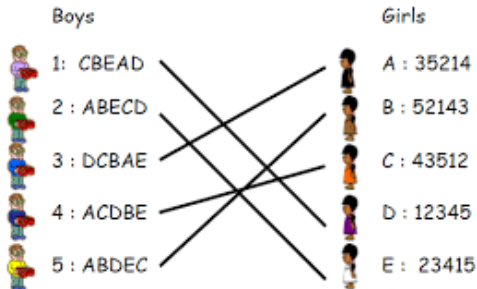


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a problem: " $\succ = \{\succ_i\}_{i \in N}$ "

M \ W	a	b	c	d	e	f
1	1 6	2 5	3 4	4 3	5 1	6 2
2	2 5	1 6	6 2	3 4	4 3	5 1
3	5 1	6 2	1 6	2 5	3 4	4 3
4	4 3	5 1	2 5	1 6	6 2	3 4
5	3 4	4 3	5 1	6 2	1 6	2 5
6	6 2	3 4	4 3	5 1	2 5	1 6

stable matchings lattice

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- ▶ a matching μ is **men-wise better than** another matching μ' , denoted by $\mu \triangleright_M \mu'$, if for each $m \in M$,

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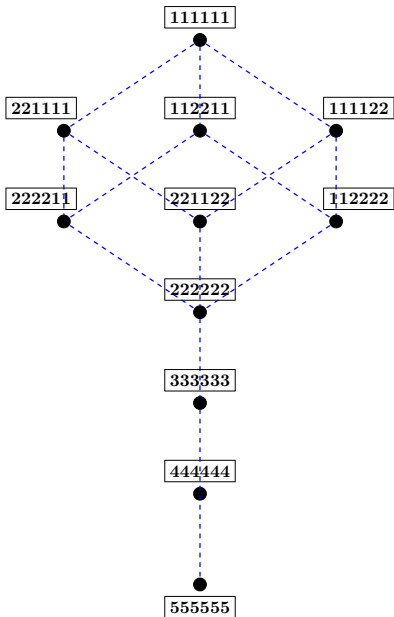
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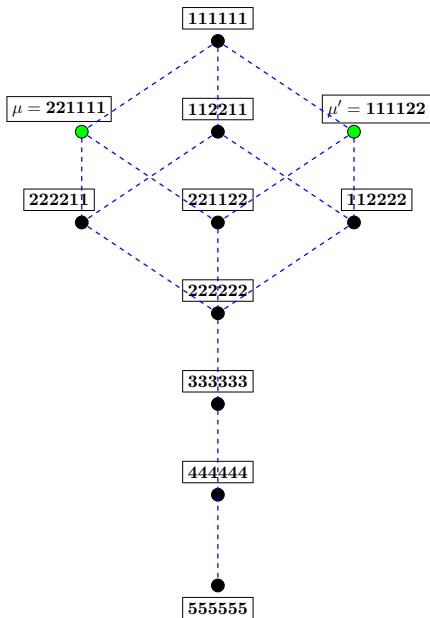
Thm: The set of stable matchings \mathcal{S} together with the relation \triangleright_M forms a **lattice**: If μ and μ' are stable, then $\mu \vee \mu'$ and $\mu \wedge \mu'$ are stable.



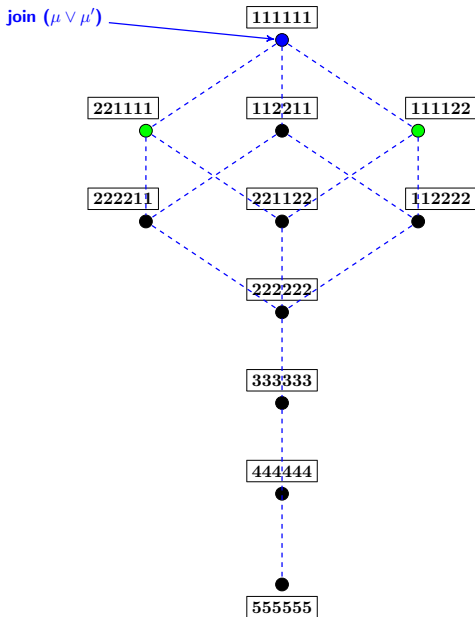
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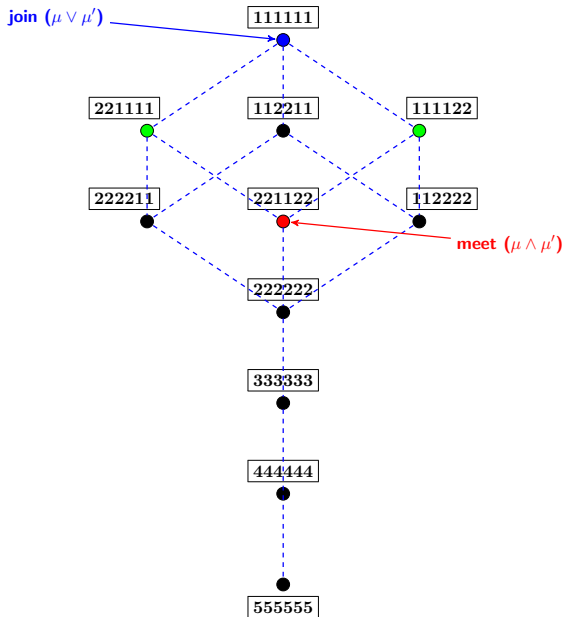
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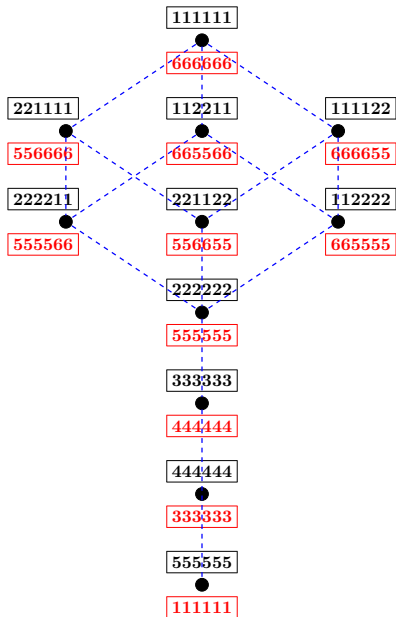
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- ▶ a matching μ is **women-wise better than** another matching μ' , denoted by $\mu \triangleright_w \mu'$, if for each $w \in W$,

$$\mu(w) \succ_w \mu'(w) \text{ or } \mu(w) = \mu'(w).$$

Thm: The set of stable matchings \mathcal{S} together with the relation \triangleright_M forms a **lattice** with the **polarity property**: for each $\mu, \mu' \in \mathcal{S}$,

$$\mu \triangleright_M \mu' \text{ iff } \mu' \triangleright_W \mu.$$

┌ polarity ────┐



motivation

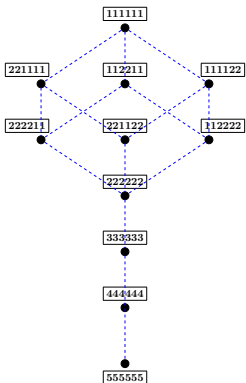
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- ▶ In the literature, the attention has mostly rested on extremal matchings.
- ▶ There is basically one way of being extremal, it is not clear how to be equitable.
- ▶ The breadth of possibilities calls for a “foundational framework” to address the issue of equity and social welfare.

Our aim: *To introduce such a framework together with a new class of solutions.*

outline

Part 1 The framework:

- ▶ Two basic axioms \longrightarrow stable matching rules
- ▶ Modularity

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- ▶ Two basic axioms \longrightarrow **stable matching rules**
- ▶ **Modularity** for analytical tractability along with clarity and richness.

Part 2 A new class of equity notions

The framework

stable matching rules

A **matching rule** π associates each matching problem γ with a nonempty set of matchings.

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- ▶ **Invariance under stability:** If the set of stable matchings for two problems \succ and \succ' are the same, then the chosen matchings must be the same, i.e $\pi(\succ) = \pi(\succ')$.

Definition: A matching rule π is a **stable matching rule** if π satisfies *stability* and *invariance under stability*.

invariance under stability?

<i>YES</i>	<i>NO</i>
median stable matchings (<i>Teo & Sethuraman'98</i>)	egalitarian stable matchings (<i>McVitie & Wilson'71</i>)
medians of the lattice (<i>Cheng'10</i>)	minimum regret matchings (<i>Knuth'76</i>)
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- ▶ this sum is constant among all stable matchings, and therefore does not differentiate any stable matching from the others.

Modularity

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Definition: A stable matching rule π is **modular** if for each problem \succ , there exists a modular $F : \mathcal{S}(\succ) \rightarrow \mathbb{R}$ s.t. $\pi(\succ)$ is the set of matchings that minimize (optimize) F , that is

$$\pi(\succ) = \operatorname{argmin}_{\mu \in \mathcal{S}(\succ)} F(\mu)$$

why modularity?

Proposition 1: F is modular if and only if for each $i \in N$, there exists $F_i : A_i \rightarrow \mathbb{R}$ s.t. for each $\mu \in \mathcal{S}(\succ)$,

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Clarity:

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Tractability: Minimizers of F are isomorphic to **min cuts** of a specific **flow network** (obtained from [Picard'76](#)).

questions:

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- ▶ As an economist, by observing the chosen stable matchings, can we **identify** the underlying objectives of a society?
- ▶ A simple(r) test for verifying modularity?

an answer

Theorem 1: *A stable matching rule π is **modular** if and only if π satisfies **convexity**.*

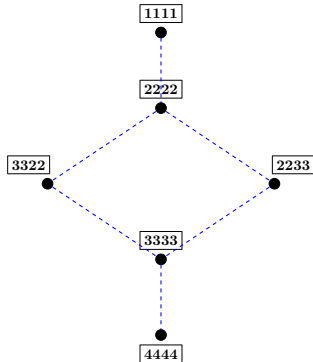
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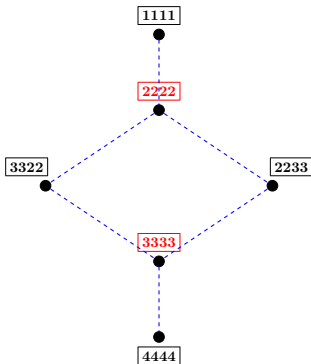
Convexity: Stable “mixtures” of chosen matchings are also chosen.

Convexity: If $\mu', \mu'' \in \pi(\succ)$ and there is a stable matching μ s.t. $\mu(m) \in \{\mu'(m), \mu''(m)\}$ for every $m \in M$, then $\mu \in \pi(\succ)$.

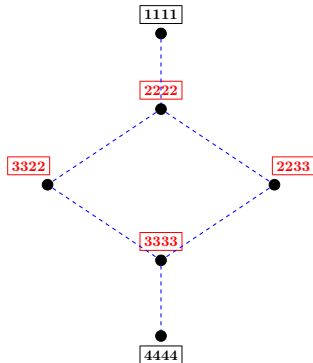
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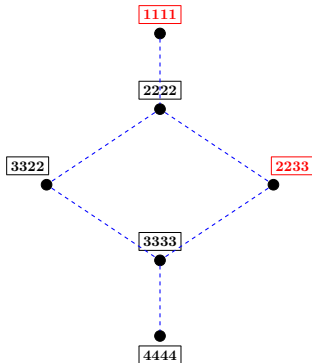
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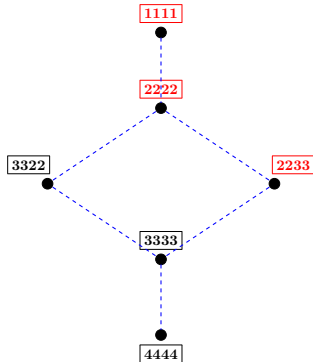
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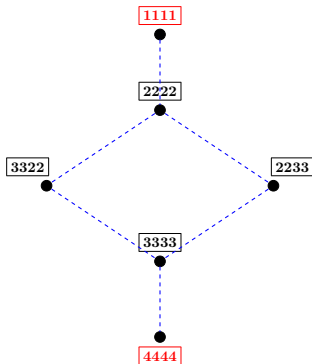
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an answer

Theorem 1: *A stable matching rule π is modular iff π satisfies convexity.*

Proof

another answer

another answer

Theorem: A stable matching rule π is *modular* iff π satisfies *independence of irrelevant rankings*.

Part II

independence of irrelevant rankings

- ▶ $\pi_i(\succ)$ is the set of agents matched to i at some $\mu \in \pi(\succ)$.

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\succ_i

1

2

3

4

5

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\succ_i

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- ▶ Then, the π -transformed problem \succ^π obtained from \succ s.t. for each agent i , each member of $\pi_i(\succ)$ is moved to the top of i 's preferences by preserving the relative rankings elsewhere.

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$\underline{\succ}_i$		$\underline{\succ}_i^\pi$
1		3
2		5
3	→	1
4		2
5		4

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γ_i		γ_i^π
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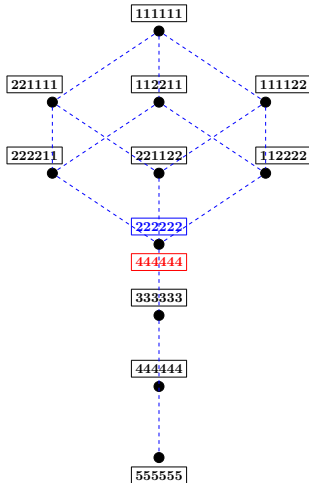
Independence of irrelevant rankings: If a matching that is stable in the original problem remains stable in the transformed problem, then it must be chosen in the initial problem.

Thm 1's relation to the literature

- ▶ Kreps'79 and Chambers & Echenique'09 provide representations for modular preferences over lattices under the additional assumption of *monotonicity*.
- ▶ A stable matching rule that satisfy *monotonicity* would choose one of the extremal matchings.

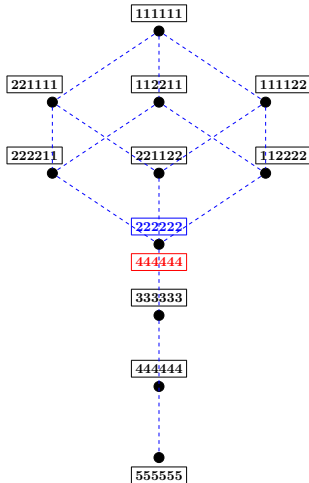
A new (class of) equity notion(s)

which matching seems most equitable?



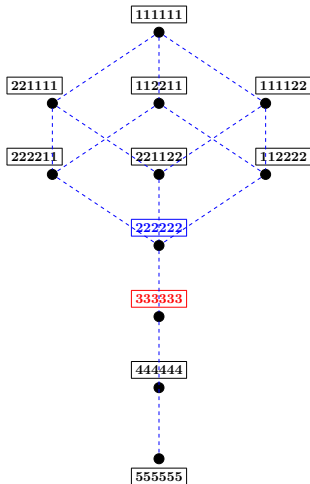
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- ▶ However, the matching [333333] is equitable in the sense that each agent is matched to his/her median attainable mate.

median attainable mate

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- ▶ Let med_i^A be the attainable mate for agent i with the lowest attainable median rank, i.e. $Rank_i^A(med_i^A) = \lfloor (|A_i| + 1)/2 \rfloor$.

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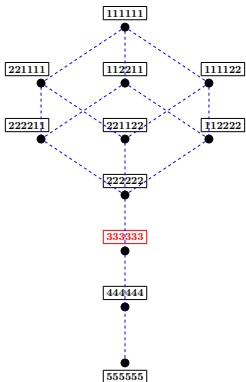
1. $\text{Rank}_i^A(\text{med}_i^A) = \lfloor (|A_i| + 1)/2 \rfloor$ and can be computed in P-time.
2. This is a modular stable matching rule.

a new fairness notion

Equity undominance: *If a matching is chosen, then there is no other stable matching in which each agent's mate is same or closer to their **median attainable mate** (med_i^A).*

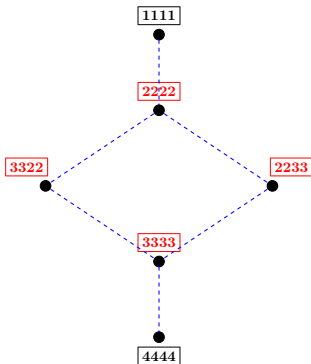
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a new fairness notion

Equity undominance: If $\mu \in \pi(\succ)$, then there is no $\mu' \in \mathcal{S}(\succ)$ s.t. $\mu'(i)$ is closer to med_i^A than $\mu(i)$ for every agent i with $\mu(i) \neq \mu'(i)$.



Equity undominance: *If a matching is chosen, then there is no other stable matching in which each agent's mate is same or closer to their **median attainable mate** (med_i^A).*

Theorem 2: *Let π be a stable matching rule. Then, π satisfies **convexity** and **equity undominance** iff $\pi(\succ)$ is the set of matchings that maximize:*

$$\mu(i)$$

Equity undominance: *If a matching is chosen, then there is no other stable matching in which each agent's mate is same or closer to their **median attainable mate** (med_i^A).*

Theorem 2: *A stable matching rule π satisfies **convexity** and **equity undominance** iff $\pi(\succ)$ is the set of matchings that maximize:*

$$F_i(\mu(i))$$

*where $F_i : A_i \rightarrow \mathbb{R}$ is unimodal with mode **median** med_i^A for each $i \in N$.*

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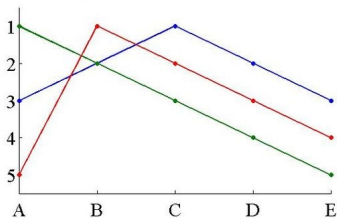
where $F_i : A_i \rightarrow \mathbb{R}$ is unimodal with mode med_i^A for each $i \in N$.

result

Theorem 2: A stable matching rule π satisfies *convexity* and *equity undominance* iff $\pi(\succ)$ is the set of matchings that maximize:

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where $F_i : A_i \rightarrow \mathbb{R}$ is unimodal with mode med_i^A for each $i \in N$.



more generally

Equity undominance: *If a matching is chosen, then there is no other stable matching in which each agent's mate is same or closer to their **ideal attainable mate** ($I(i) \in A_i$).*

Theorem 2: *A stable matching rule π satisfies **convexity** and **equity undominance** iff $\pi(\succ)$ is the set of matchings that maximize:*

$$\sum_{i \in N} F_i(\mu(i))$$

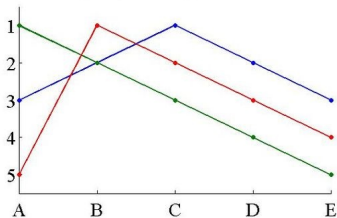
where $F_i : A_i \rightarrow \mathbb{R}$ is unimodal with mode $I(i)$ for each $i \in N$.

more generally

Theorem 2: A stable matching rule π satisfies *convexity* and *equity undominance* iff $\pi(\succ)$ is the set of matchings that maximize:

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- ▶ As for the many-to-one and many-to-many matchings, the set of stable matchings forms a distributive lattice under familiar restrictions ([Alkan'01](#), [Alkan & Gale'03](#)).

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Conc

extensions

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Conc

Proof sketch for

Theorem 1: *A stable matching rule π is modular iff π satisfies convexity.*

Conc

roadmap for the sketch

- ▶ convexity \Rightarrow modularity:
 1. Connection to the *rotations poset*.
 2. *Hyperrotations* and *constraints*.
 3. *Partition lemma* and construction of F .
- ▶ modularity \Rightarrow convexity

Step 1: Rotations

- Rotations are the incremental changes that transform a stable matching μ into another stable matching μ' s.t. $\mu \triangleright_M \mu'$ and there is no other stable matching μ'' s.t. $\mu \triangleright_M \mu'' \triangleright_M \mu'$ (Irving'85).

$$\rho^{11} = [(m_1, w_1), (m_2, w_2)]$$

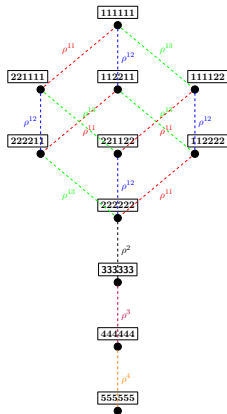
$$\rho^{12} = [(m_3, w_3), (m_4, w_4)]$$

$$\rho^{13} = [(m_5, w_5), (m_6, w_6)]$$

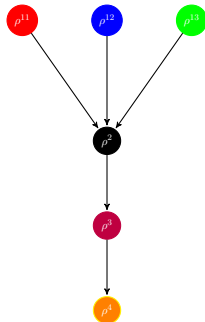
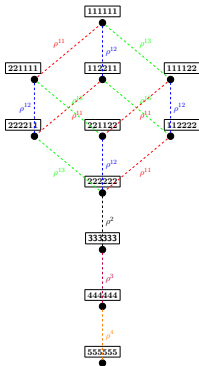
$$\rho^2 = [(m_1, w_2), (m_4, w_3), (m_5, w_6), (m_2, w_1), (m_3, w_4), (m_6, w_5)]$$

$$\rho^3 = [(m_1, w_3), (m_2, w_4), (m_3, w_5), (m_4, w_6), (m_5, w_1), (m_6, w_2)]$$

$$\rho^4 = [(m_1, w_4), (m_2, w_5), (m_3, w_6), (m_4, w_1), (m_5, w_2), (m_6, w_3)]$$



Step 2



$$\rho^{11} = [(m_1, w_1), (m_2, w_2)]$$

$$\rho^{12} = [(m_3, w_3), (m_4, w_4)]$$

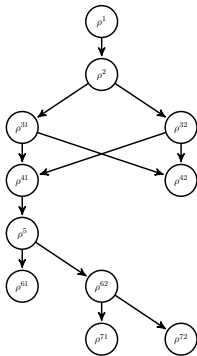
$$\rho^{13} = [(m_5, w_5), (m_6, w_6)]$$

$$\rho^2 = [(m_1, w_2), (m_4, w_3), (m_5, w_6), (m_2, w_1), (m_3, w_4), (m_6, w_5)]$$

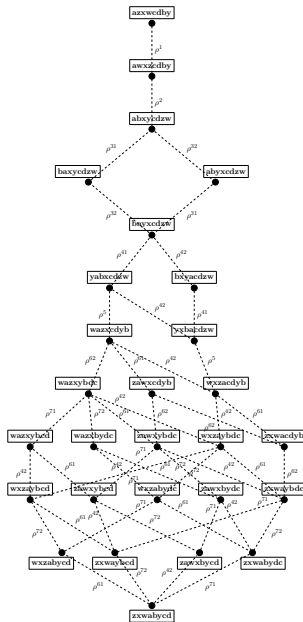
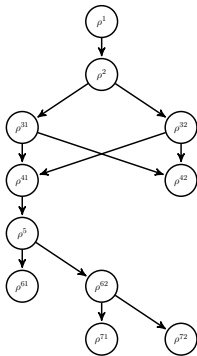
$$\rho^3 = [(m_1, w_3), (m_2, w_4), (m_3, w_5), (m_4, w_6), (m_5, w_1), (m_6, w_2)]$$

$$\rho^4 = [(m_1, w_4), (m_2, w_5), (m_3, w_6), (m_4, w_1), (m_5, w_2), (m_6, w_3)]$$

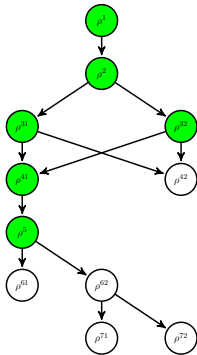
another rotation poset



another rotation poset



another rotation poset



Step 1

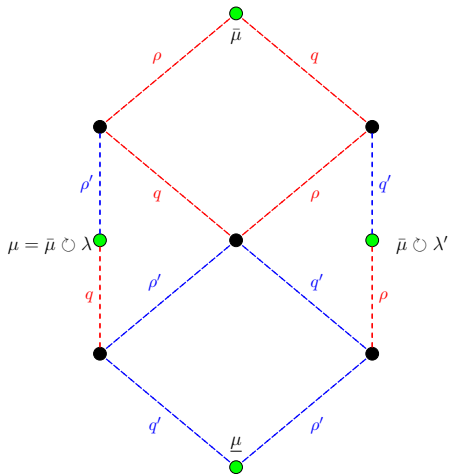
It follows from Irving & Leather'86 that:

- ▶ Each attainable pair (m, w) is contained in a unique rotation.
- ▶ The closed sets of rotations with the set containment relation $\langle Cl(\mathcal{R}), \subset \rangle$ is a lattice that is *order isomorphic* to $\langle \mathcal{S}, \triangleright_M \rangle$ (similar to Birkhoff's Representation Theorem).

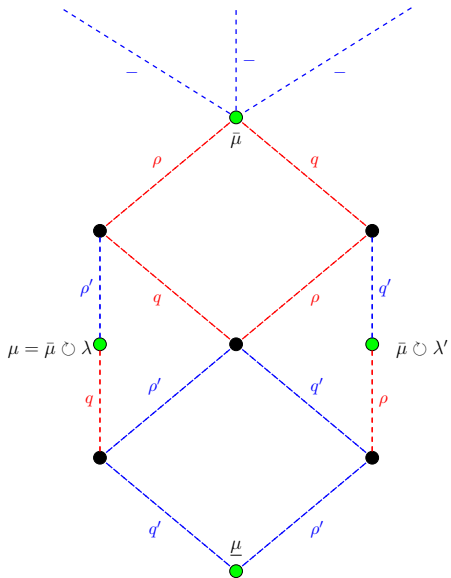
Thus, our problem boils down to assigning a weight $g(\rho)$ to each rotation ρ s.t.

$$\pi(\succ) = \operatorname{argmin}_{\mu \in \mathcal{S}} \sum_{\rho \in R_\mu} g(\rho)$$

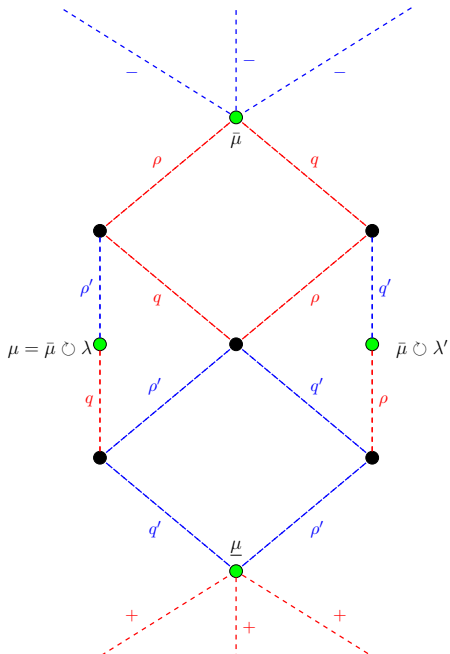
Step 2: Hyper-rotations



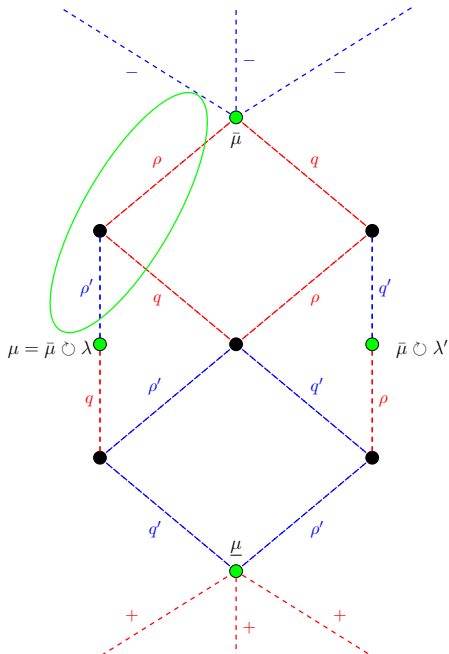
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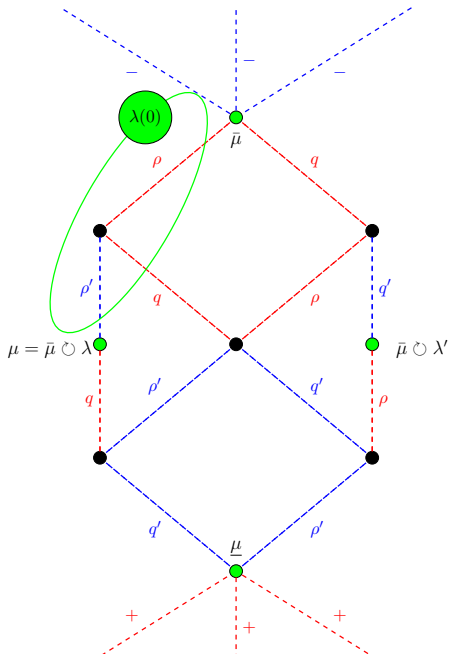
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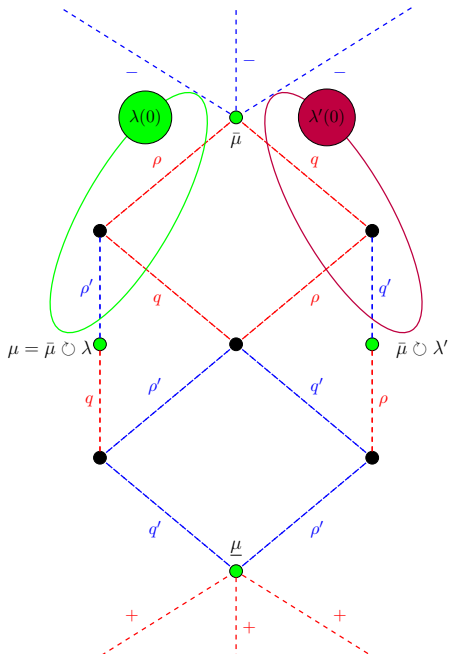
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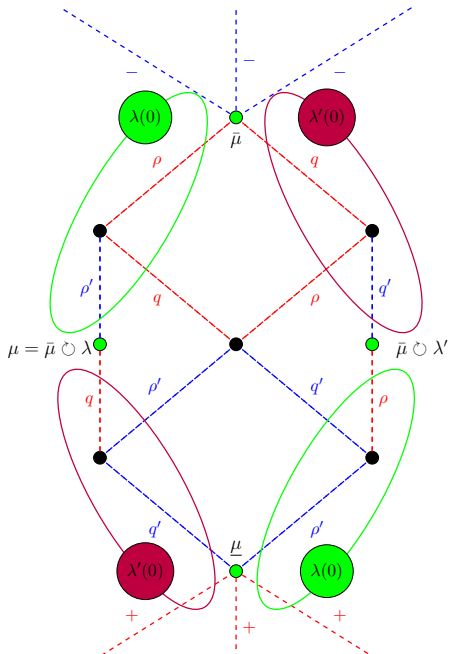
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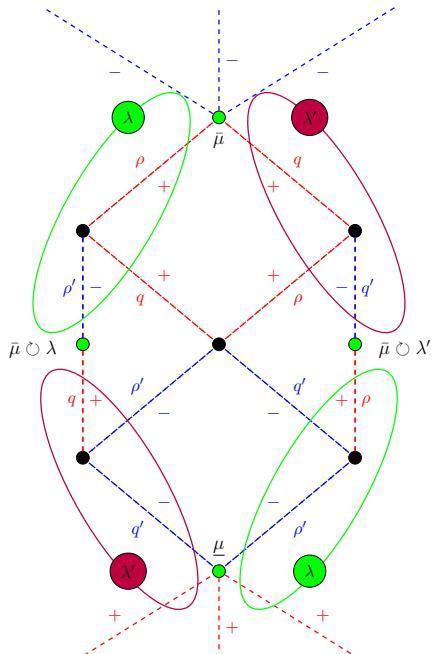
Step 2: Hyper-rotations



Step 2: Hyper-rotations



Step 2: Constraints



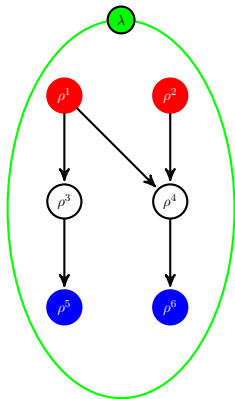
Step 2: Constraints

Thus, our problem boils down to designing the weight function g s.t. for each **hyper-rotation** λ ,

- ▶ $\sum_{\rho \in \lambda} g(\rho) = 0$.
- ▶ for each $R \subsetneq \lambda$ that is (relatively) closed in λ ,

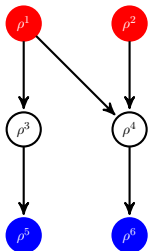
$$\sum_{\rho \in R} g(\rho) > 0$$

Step 3: Construction of g



- ▶ $\bar{\lambda} = \{\rho \in \lambda \text{ without any predecessor}\} = \{\rho^1, \rho^2\}$.
- ▶ $\underline{\lambda} = \{\rho \in \lambda \text{ without any successor}\} = \{\rho^5, \rho^6\}$.

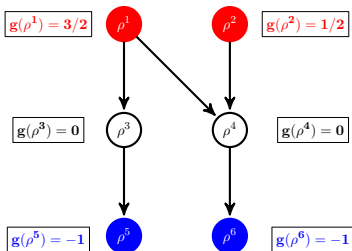
construction of g : “preloading”



	$\lambda^\downarrow(\rho)$	$\lambda^\uparrow(\rho)$
ρ_1	$\{\rho_5, \rho_6\}$	$\{\rho_1\}$
ρ_2	$\{\rho_6\}$	$\{\rho_2\}$
ρ_3	$\{\rho_5\}$	$\{\rho_1\}$
ρ_4	$\{\rho_6\}$	$\{\rho_1, \rho_2\}$
ρ_5	$\{\rho_5\}$	$\{\rho_1\}$
ρ_6	$\{\rho_6\}$	$\{\rho_1, \rho_2\}$

- ▶ $\bar{\lambda} = \{q \in \lambda \text{ without any predecessor}\} = \{\rho^1, \rho^2\}$.
- ▶ $\underline{\lambda} = \{\rho \in \lambda \text{ without any successor}\} = \{\rho^5, \rho^6\}$.
- ▶ $\lambda^\uparrow(\rho) = \{q \in \bar{\lambda} \mid q \rightarrow \rho\}$ & $\lambda^\downarrow(\rho) = \{q \in \underline{\lambda} \mid \rho \rightarrow q\}$.

construction of g : “preloading”

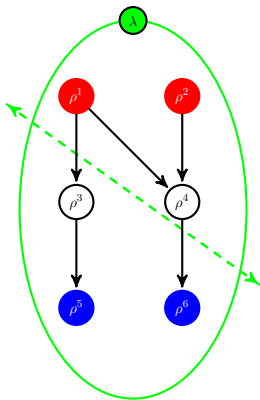


	$\lambda^\downarrow(\rho)$	$\lambda^\uparrow(\rho)$
ρ_1	$\{\rho_5, \rho_6\}$	$\{\rho_1\}$
ρ_2	$\{\rho_6\}$	$\{\rho_2\}$
ρ_3	$\{\rho_5\}$	$\{\rho_1\}$
ρ_4	$\{\rho_6\}$	$\{\rho_1, \rho_2\}$
ρ_5	$\{\rho_5\}$	$\{\rho_1\}$
ρ_6	$\{\rho_6\}$	$\{\rho_1, \rho_2\}$

$$g(\rho) = \begin{cases} -1 & \text{if } \rho \in \underline{\lambda}, \\ \sum_{q \in \lambda^\downarrow(\rho)} \frac{1}{|\lambda^\uparrow(q)|} & \text{if } \rho \in \bar{\lambda}, \text{ and} \\ 0 & \text{otherwise.} \end{cases}$$

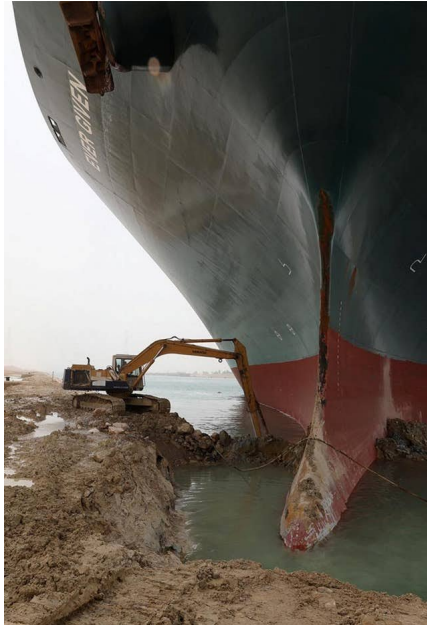
Step 3: Role of convexity

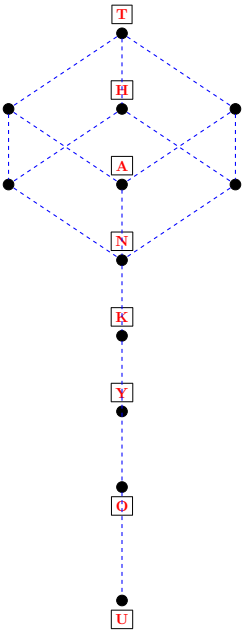
Bisection lemma: Each hyper-rotation λ is a connected subset of the rotations poset, i.e. for each bisection $\{P, P'\}$ of λ , there exist $\rho \in P$ and $\rho' \in P'$ s.t. $\rho \rightarrow \rho'$ or $\rho' \rightarrow \rho$.



└── conclusion ───

conclusion





┌ modularity \Rightarrow convexity ─

- ▶ Modularity implies that $\pi(\mathcal{L})$ is a sublattice.

modularity \Rightarrow convexity

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- ▶ Suppose that μ is a mixture of $\mu', \mu'' \in \pi(\gamma)$.

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- ▶ Note that μ is also a mixture of $\bar{\mu} = \mu' \vee \mu''$ and $\underline{\mu} = \mu' \wedge \mu''$.

modularity \Rightarrow convexity

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- ▶ Let $\lambda = R_{\mu} \setminus R_{\bar{\mu}}$ and $\lambda' = R_{\underline{\mu}} \setminus R_{\mu}$.

modularity \Rightarrow convexity

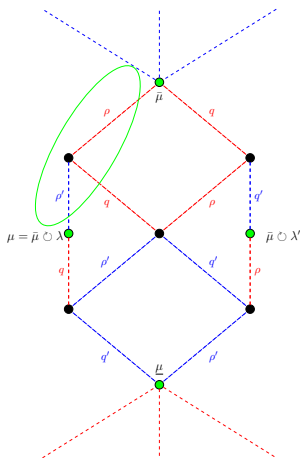
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- ▶ Let $\lambda = R_\mu \setminus R_{\bar{\mu}}$ and $\lambda' = R_{\underline{\mu}} \setminus R_\mu$.
- ▶ Since μ is a mixture, for each $\rho \in \lambda$ and each $\rho' \in \lambda'$, $\rho \cap \rho' = \emptyset$. Therefore ρ and ρ' are independent.

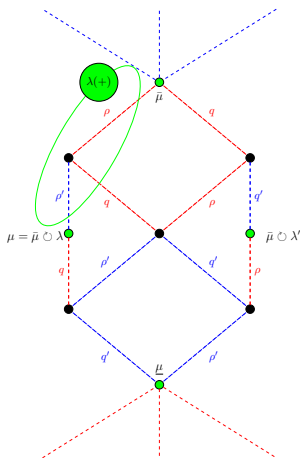
modularity \Rightarrow convexity

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- ▶ Let $\lambda = R_\mu \setminus R_{\bar{\mu}}$ and $\lambda' = R_{\underline{\mu}} \setminus R_\mu$.
- ▶ Since λ and λ' are independent, $F(\bar{\mu} \circlearrowleft \lambda') < F(\bar{\mu})$.



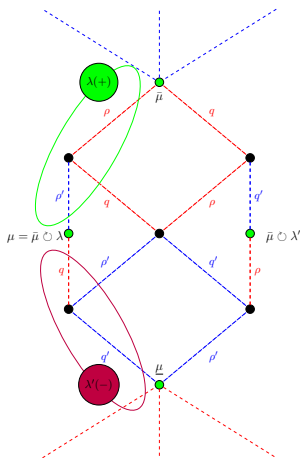
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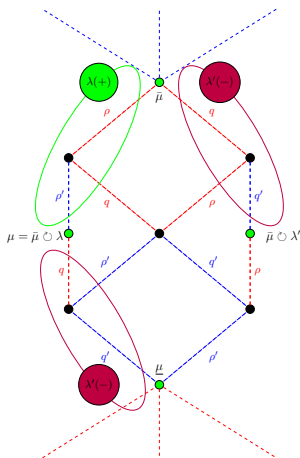
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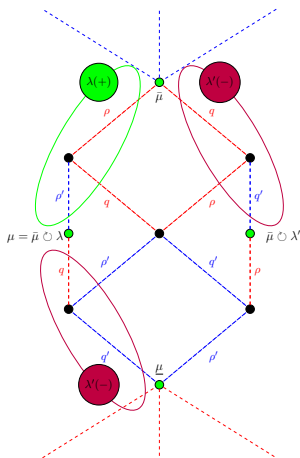
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— Thank you! —

