Job Matching with Constraints, Subsidy and Taxation

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- What you enforce is what is destined to appear.
- What you forbid is what is destined to disappear.
- What you subsidize is what will happen more often.
- What you penalize/tax is what will happen less often.

All will be well and end well!

Problem with a Subsidy Policy

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 Large Farm Subsidy: per-unit-area subsidy for operating multiple land plots, if the total area exceeds a threshold

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• It didn't end well: rentiers demand higher rents \Rightarrow less renting, less economy of scale



- Holdup Problem: owners of complements demanding high compensations and thus holding up efficient assembly of resources
 - Recall example: Large Farm Subsidy
 - $\bullet \ \Rightarrow \ {\rm Complementarity} \ {\rm among} \ {\rm land} \ {\rm plots} \ \uparrow$
 - In rural China, it is reported that land owners can capture high rents due to stronger bargaining positions
- Exposure problem: agents desiring multiple complements but hesitating to make initial offers in fear of facing high costs for later trades
 - renters become reluctant to enter the market

References: Chandra and Wong (2016); Ehrlich and Overman (2020); Chen et al. (2021); Slattery and Zidar (2020); Milgrom (2004); Hazlett and Muñoz (2009)

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- Markets for Workers
 - income tax
 - subsidy for a firm to hire many workers
 - subsidy for hiring many disadvantaged, local, or R&D workers,
 - Markets for Goods
 - subsidy for preferred bidders, e.g., "weak bidders" in radio spectrum auctions
 - tax for excessive consumption, e.g., penalizing owning multiple homes
 - Large Farm Subsidy

References: Chandra and Wong (2016); Ehrlich and Overman (2020); Chen et al. (2021); Slattery and Zidar (2020); Milgrom (2004); Hazlett and Muñoz (2009)



- Markets for Goods
 - affordable housing policies \Rightarrow ceiling constraints: a family can own no more than *n* houses
 - environmental policies ⇒ proportionality constraints: a taxi company's fleet must be at least x% electronic
- Markets for Workers
 - public goods provision ⇒ floor constraints: a rural school must have at least n teachers
 - affirmative action ⇒ type-specific floor/ceiling constraints: a company's board has to have at least n minorities
 - legal punishment \Rightarrow never-hiring constraints: a firm forbidden to hire someone

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- Objective: Study how policy interventions may reshape demands, market outcomes, and mechanism performances
- Method: Augment job matching model of Kelso and Crawford (1982), which embeds object assignment and auction models (e.g., Gul and Stacchetti, 2000)
- Focus: (Gross) Substitutes Condition (on each hospital's demand, requiring a set of demanded doctors still be demanded after a rise of others' salaries)
 - Sufficient and necessary (in a sense of maximal domain) for competitive equilibria existence and nonempty core (stability)
 - Crucial for nice equilibria structure and incentive properties: lattice theorem; rural hospitals theorem; law of aggregate demand; group-incentive-compatibility; pseudo-equilibria being competitive equilibria; Vickrey outcomes residing in cores
 - Crucial for mechanism performances: deferred acceptance, multi-object auctions

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Research Question										

- Question Which policy interventions preserve the substitutes condition (and thus all the nice properties it entails)?
 - Analogous question in discrete convex analysis: which mathematical operations preserve M^{\$-}concavity?

- Set of doctors D
 - salary schedule $\mathbf{s} = (s_d)_{d \in D} \in \mathbb{R}^D$
- One hospital
 - Kojima, Sun and Yu (2021, "Job Market Interventions") study a model with multiple hospitals and establish equilibrium existence, lattice structure, and comparative statics
- A government which designs transfer policies

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- $R(A) \in \mathbb{R}$: hospital's revenue when matched to $A \subseteq D$.
- T(A) ∈ ℝ: hospital's transfer from the government when matched to A.
- $V(A; \mathbf{s}, R + T) = R(A) + T(A) \sum_{d \in A} s_d$: hospital's *profit*
 - maximal profit function: $\Pi(\mathbf{s}; R + T) = \max\{V(A; \mathbf{s}, R + T) : A \subset D\}$
 - demand correspondence:
 - $X(\mathbf{s}; R+T) = \{A \subset D : V(A; \mathbf{s}, R+T) = \Pi(\mathbf{s}; T)\}$
 - Each $A \in X(\mathbf{s}; R + T)$ is called a demand set

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Definition 1 (Substitutes Condition).

 $X(\cdot; R + T)$ satisfies the substitutes condition if for any two salary schedules **s** and **s'** with $\mathbf{s'} \ge \mathbf{s}$, and any $A \in X(\mathbf{s}; R + T)$, there exists $A' \in X(\mathbf{s'}; R + T)$ such that $\{d \in A : s_d = s'_d\} \subset A'$.

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Definition 2 (Always Preserving the Substitutes Condition).

A transfer function T always preserves the substitutes condition if whenever a demand correspondence $X(\cdot; R)$ satisfies the substitutes condition, $X(\cdot; R + T)$ satisfies it.

Important Classes of Transfer Functions

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• T is additively separable if $T(A) = \sum_{d \in A} T(\{d\})$ for every $A \subset D$.

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- T is cardinal if there exists a function $f : \{0, 1, ..., |D|\} \to \mathbb{R}$ such that T(A) = f(|A|) for every $A \subset D$.
- *T* is cardinally concave if it is cardinal and the associated function *f* is concave.
 - A cardinal function is cardinally concave if and only if the marginal transfer from an additional doctor is non-increasing.



Theorem 1.

T always preserves the substitutes condition \uparrow T=(additively separable function) + (cardinally concave function).



• Recall the theorem:

Always preserving subst. \Leftrightarrow additively separable + cardinally concave.

- Cardinally concave transfer policies can be used to address rural public goods shortages (Roth, 1986; Kojima, 2012)
- Affirmative action can be carried out only in the form of individual subsidy/taxation.



The necessity part of the Theorem follows from a stronger result:

Proposition 1.

T preserves the substitutes condition for all binary unit-demand revenue functions

T = (additively separable function) + (cardinally concave function).

- Binary unit-demand: there exist $\alpha > 0$, $d, d' \in D$ with $R(A) = \alpha \min\{1, |A \cap \{d, d'\}|\}.$
- Even a small subclass of revenue functions already give lots of restrictions.



- In many cases, government transfers depend on salaries
 - Income taxes
 - "Credit for Increasing Research Activities"
 - For wages paid to R&D workers
 - Their total salary may count toward thresholds for greater tax breaks (Chen et al., 2021, Table 1)
 - In sports: luxury taxes (Kaplan, 2004; Coates and Frick, 2012).

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- A complex function $\Upsilon : 2^D \times \mathbb{R}^D \to \mathbb{R}$ is called an complex transfer function if:
 - Government transfer is only related to the salaries of its own employees

•
$$\Upsilon(A, \mathbf{s}) = \Upsilon(A, \mathbf{s}')$$
 for all $A \subset D$ and $\mathbf{s}, \mathbf{s}' \in \mathbb{R}^D$ with $\mathbf{s}|_A = \mathbf{s}'|_A$.

- Overall hiring cost is strictly increasing in the salaries of hired doctors
 - Define the hiring cost function associated with Υ as $H^{\Upsilon}: 2^{D} \times R^{D} \to \mathbb{R}$ such that $H^{\Upsilon}(A, \mathbf{s}) = \sum_{d \in A} s_{d} - \Upsilon(A, \mathbf{s})$ for all $A \subset D$ and $\mathbf{s} \in \mathbb{R}^{D}$; it is required that for every $A \subset D$, $H^{\Upsilon}(A, \cdot)$ is strictly increasing in each s_{d} with $d \in A$

Main Theorem for Complex Transfer Functions

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• Υ is C-additively separable if there is a family of functions $\{f_d : \mathbb{R} \to \mathbb{R}\}_{d \in D}$ such that for each $A \subset D$ and $\mathbf{s} \in \mathbb{R}^D$, $\Upsilon(A, \mathbf{s}) = \sum_{d \in D} f_d(s_d)$

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• Υ is C-cardinally concave if there exists a cardinally concave transfer function T such that for all $A \subsetneq D$ and $\mathbf{s} \in \mathbb{R}^{D}$, $\Upsilon(A, \mathbf{s}) = T(A)$; $\Upsilon(D, \mathbf{s})$ as a function of $\mathbf{s} \in \mathbb{R}^{D}$ is weakly increasing; for each $\mathbf{s} \in \mathbb{R}^{D}$, $\Upsilon(D, \mathbf{s}) \leq T(D)$ and the transfer function $T^{\mathbf{s}} := \Upsilon(\cdot, \mathbf{s})$ is cardinally concave

Theorem 2.

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 Υ always preserves the substitutes condition \uparrow $\Upsilon = (C-additively separable complex transfer function)$ + (C-cardinally concave complex function).

Subclasses of Revenue/Transfer Functions

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• \mathcal{P} is Partition of D; $P \in \mathcal{P}$ is referred to as a group

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- *R* is group separable if there exists a family of functions $\{R_P\}_{P \in \mathcal{P}}$ such that every R_P satisfies the substitutes condition on 2^P , and for every $A \subset D$, $R(A) = \sum_{P \in \mathcal{P}} R_P(A \cap P)$
- $\tau: 2^D \to \mathbb{Z}^P$ with $\tau(A)(P) = |A \cap P|$: "vectorization"
- *R* is group concave if it's of the form $R(A) = S(\tau(A))$ and substitutable.
 - Same as function S satisfying M^{\natural} -concavity (Murota, 2003).
- Can be defined for transfer functions too.

Group Separable Revenue Functions

Theorem 3.

T preserves the substitutes condition for all group separable revenue functions

T = (additively separable function) + (group concave function).

- Compare with "all substitutes" case: *T*=(additively separable) + (cardinally concave).
- Certain affirmative action policies are allowed, e.g., decreasing marginal subsidy for minority.
- Necessity part can be obtained for a smaller class of revenue functions.

Group Concave Revenue Functions

Theorem 4.

Assume $|\mathcal{P}| > 2$. T preserves the substitutes condition for all group concave revenue functions

 $T = (group \ separable \ function) + (cardinally \ concave \ function).$

- Compare with the "all substitutes" case: *T*=(additively separable) + (cardinally concave)
- Certain affirmative action policies are allowed.
- Necessity part can be obtained for a smaller class of revenue functions.

Definition 3.

A transfer function T (or a complex transfer function Υ) **reestablishes the substitutes condition** for a revenue function Rif R + T (or $R + \Upsilon$) satisfies the condition.

- Designers may not know *R*, and even if they do, they may not be able to customize policies for different firms
- Are there transfer policies which reestablish the substitutes condition for a wide variety of revenue functions?
- So focus on: additively separable policies & cardinally concave ones
- $\bullet~$ But the former doesn't help \Rightarrow focus on the latter

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Some notation									

- Consider: the firm is constrained to pick a set out of a nonempty collection $\mathcal{F} \subset 2^D$, called its feasibility collection as in KSY
- Define: the maximal profit function Π and demand correspondence X such that for each salary schedule s,

$$\Pi(\mathbf{s}; R + T, \mathcal{F}) = \max\{V(A; \mathbf{s}, R + T) : A \in \mathcal{F}\};$$

$$X(\mathbf{s}; R + T, \mathcal{F}) = \{A \in \mathcal{F} : V(A; \mathbf{s}, R + T) = \Pi(\mathbf{s}; R + T, \mathcal{F})\}.$$

- The substitutes condition and its preservation are still well-defined
- Given m ∈ [0, M]_Z, the feasibility collection
 D_m := {A ⊂ D : |A| = m} is defined by an exact constraint, requiring the firm to hire exactly m workers.

Definition 4.

A revenue function R satisfies the exactly-constrained substitutes condition if given any $\mathbf{s}, \mathbf{s}' \in \mathbb{R}^D$ with $\mathbf{s}' \geq \mathbf{s}$, $m \in [1, M]_{\mathbb{Z}}$, and $A \in X(\mathbf{s}; R, \mathcal{D}_m)$, there exist $A' \in X(\mathbf{s}'; R, \mathcal{D}_m)$ satisfying $\{d \in A : s_d = s'_d\} \subset A'$.

Definition 5.

A revenue function R satisfies the chain-constrained substitutes condition if given any $\mathbf{s} \in \mathbb{R}^D$, $m \in [1, M]_{\mathbb{Z}}$, and $A \in X(\mathbf{s}; R, \mathcal{D}_m)$, there exists $A' \in X(\mathbf{s}; R, \mathcal{D}_{m-1})$ satisfying $A' \subset A$.

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Main Theorem										

Theorem 5.

For a revenue function R, \exists a cardinally concave T such that R + T satisfies the substitutes condition

- R simultaneously satisfies
 - the exactly-constrained substitutes condition
 - the chain-constrained substitutes condition
 - This is a surprisingly small class of revenue functions for which the substitutes condition can be reestablished by cardinally concave policies

The Model for Constraints (Job Matching under Constraints, AER 2020)

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ullet The hospital is constrained to choose among $\mathcal{F} \subset 2^D$

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• called feasibility collection of h

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- its elements called feasible sets
- $\mathcal{F} = \mathcal{F}^0 \cap \mathcal{F}^g$: \mathcal{F}^0 is self-imposed; \mathcal{F}^g is government-imposed

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Example 1: For A ⊂ D and integers 0 ≤ f ≤ c ≤ |A|, the feasibility collection

$$\mathcal{D}^{\mathcal{A}}_{[f,c]} \coloneqq \{ B \subset D : f \leq |B \cap A| \leq c \}$$

is defined by an interval constraint on A

- $\mathcal{D}^{A}_{[f,|A|]}$ is defined by a floor constraint on A
- $\mathcal{D}^{A}_{[0,c]}$ is defined by a ceiling constraint on A
- $\mathcal{D}_{[f,c]} \coloneqq \mathcal{D}_{[f,c]}^D$ is defined by an interval constraint (on D)

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• Example 2: For $\overline{D}, \underline{D} \subset D, \overline{D} \cap \underline{D} = \emptyset$, integers $0 \le f \le c \le |D \setminus (\overline{D} \cup \underline{D})|$, the feasibility collection

$$\{A \subset D : \overline{D} \subset A, \underline{D} \cap A = \emptyset, \text{ and } f \leq |A \setminus \overline{D}| \leq c\} \\ = \{A \subset D : \overline{D} \subset A\} \cap \{A \subset D : \underline{D} \cap A = \emptyset\} \cap \mathcal{D}_{[f,c]}^{D \setminus (\overline{D} \cup \underline{D})}$$

is defined by a generalized interval constraint.

- $\{A \subset D : \overline{D} \subset A\}$ is defined by a always-hiring constraint on \overline{D}
- $\{A \subset D : \underline{D} \cap A = \emptyset\}$ is defined by a never-hiring on \underline{D}
- $\mathcal{D}_{[f,c]}^{D\setminus(\overline{D}\cup\underline{D})}$ is defined by an interval constraint (on $D\setminus(\overline{D}\cup\underline{D}))$

• profit:
$$V(A; \mathbf{s}) = R(A) - \sum_{d \in A} s_d$$

- demand correspondence: $X(\mathbf{s}; \mathcal{F}) = \{A \in \mathcal{F} : V(A; \mathbf{s}) \ge V(A'; \mathbf{s}) \text{ for every } A' \in \mathcal{F}\}$
- $X(\mathbf{s}; \mathcal{F}^0)$ is innate; $X(\cdot; \mathcal{F}^0 \cap \mathcal{F}^g)$ is compelled

Definition 6 (Substitutes Condition).

Demand correspondence $X(\cdot; \mathcal{F})$ satisfies the substitutes condition

if

for any two salary schedules **s** and **s'** with $\mathbf{s'} \ge \mathbf{s}$, and any $A \in X(\mathbf{s}; \mathcal{F})$, there exists $A' \in X(\mathbf{s'}; \mathcal{F})$ such that $\{d \in A : s_d = s'_d\} \subset A'$.

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Always Preserving Substitutes

Definition 7 (Always preserving the Substitutes Condition).

A feasibility collection \mathcal{F}^{g} always preserves the substitutes condition

if

for every R and \mathcal{F}^0 with $\mathcal{F}^0 \cap \mathcal{F}^g \neq \emptyset$ such that $X(\cdot; \mathcal{F}^0)$ satisfies the substitutes condition, $X(\cdot; \mathcal{F}^0 \cap \mathcal{F}^g)$ satisfies the condition as well.

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Theorem 1.

A feasibility collection always preserves the substitutes condition if and only if it is defined by a generalized interval constraint.

Subclasses 0000000 Generalized Polyhedral Constraint (given partition \mathcal{P})

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• A feasibility collection \mathcal{F} is defined by a generalized polyhedral constraint if there is a supermodular function $\mu: 2^{\mathcal{P}} \to \{0, 1, \dots, |\hat{\chi}(\mathcal{F})|\}$ and a submodular function $\rho: 2^{\mathcal{P}} \to \{0, 1, \dots, |\hat{\chi}(\mathcal{F})|\}$ such that for any $\mathcal{Q}, \mathcal{Q}' \subset \mathcal{P}$, $\mu(\mathcal{Q}) - \mu(\mathcal{Q} \setminus \mathcal{Q}') < \rho(\mathcal{Q}') - \rho(\mathcal{Q}' \setminus \mathcal{Q}), \text{ and}$

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$$\mathcal{F} = \{ A \subset D : \overline{\chi}(\mathcal{F}) \subset A, \, \underline{\chi}(\mathcal{F}) \cap A = \emptyset, \\ \text{and } \mu(\mathcal{Q}) \leq |A \cap (\cup \mathcal{Q}) \cap \hat{\chi}(\mathcal{F})| \leq \rho(\mathcal{Q}) \text{ for every } \mathcal{Q} \subset \mathcal{P} \}.$$

- \mathcal{Q} may contain multiple groups, and $\mu(\mathcal{Q})$ and $\rho(\mathcal{Q})$ respectively dictate the floor and ceiling on the set of real-decision doctors in $\cup \mathcal{Q}$.
- The equation above simply states that \mathcal{F} is defined by a family of (potentially degenerate) generalized interval constraints on unions of groups.

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Theorem 2.

A feasibility collection preserves the substitutes condition for group separable revenue functions if and only if it is defined by a generalized polyhedral constraint.



- Policy interventions are ubiquitous in markets for indivisible resources
- Two classes of economic policies
 - transfer policies (providing financial incentive)
 - constraints (mandatory)
 - $\bullet \to$ systematically investigating which policy interventions preserve the substitutes condition
- Two mathematical operations in discrete convex analysis
 - summation of two discrete functions
 - domain restriction of a discrete function
 - $\bullet \to$ systematically investigating which operations preserve $M^{\natural}\text{-}concavity$
- A lot of extensions...



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