

# Partial Mechanism Design & Incomplete-Information Industrial Organization

EC'23 Tutorial

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# Motivation

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For example, consider the following:

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**#2.** How should a social planner optimally redistribute? (with a private market)

In these examples, the mechanism designer can design only part of the market.

# Mechanism design with equilibrium effects

#1. Consumers freely participate in designed market; allocations are realized.

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**Question:** How should the mechanism designer allocate the good in #1?

There are equilibrium effects: allocations in #1 affect outcomes in #2—and vice versa.

# Goals of this tutorial

## #1. Introduce a relatively new and rapidly growing research program.

- Recent revived interest in applying large-market mechanism design to applied problems:  
Condorelli (2013); Dworzak (r) al. (2021); Akbarpour (r) al. (2021); Kang (2022); Akbarpour (r) al. (2022); Pai and Strack (2022)...
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- Adapt some classic tools from mechanism design.

## #3. Conclude with some open questions.

# Framework

## Model: consumers

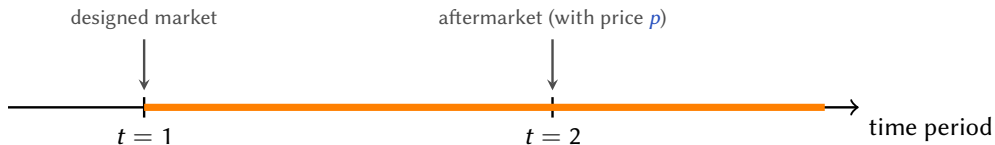
There is a unit mass of risk-neutral consumers with unit demand + quasilinear utility.

Consumers differ in types  $\theta$ , whose CDF  $F$  has positive density  $f$  on  $[\underline{\theta}, \bar{\theta}] \subset \mathbb{R}_+$ .

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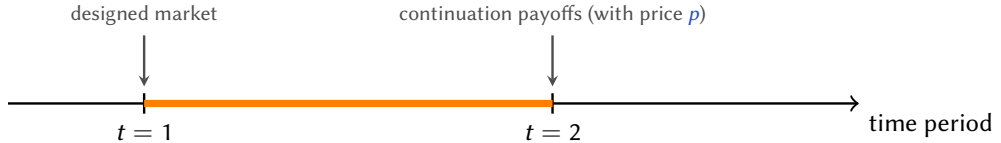
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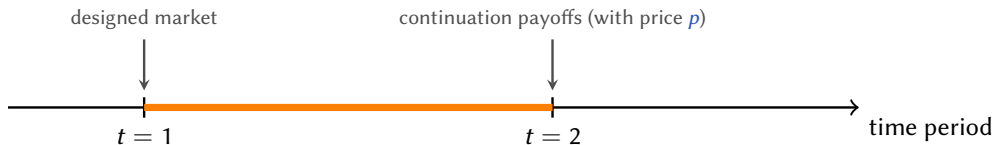




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Continuation payoffs (with price  $p$ ):

$$\begin{cases} v_0(p; \theta) & \text{if not allocated the good in the designed market,} \\ v_1(p; \theta) & \text{if allocated the good in the designed market.} \end{cases}$$

## Model: mechanism designer

There is a mechanism designer who chooses a **direct mechanism**  $(x, t)$ , consisting of:

- ▶ an **allocation function**  $x : [\underline{\theta}, \bar{\theta}] \rightarrow [0, 1]$ , where  $x(\theta)$  = prob. that consumer receives good; and
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Given  $p$ , the payoff of the mechanism designer is, for some increasing function  $\Pi_1 : \mathbb{R} \rightarrow \mathbb{R}$  and some function  $\Pi_0 : \mathbb{R}_+ \rightarrow \mathbb{R}$ ,

$$\Pi(x; p) = \Pi_1 \left( \int_{\underline{\theta}}^{\bar{\theta}} \psi(\theta; p) x(\theta) dF(\theta) \right) + \Pi_0(p).$$

**Key assumption (A):**  $\Pi$  is an affine functional of  $x$  (up to increasing transformation).

## Model: aftermarket

The price  $p$  in the aftermarket depends on the mechanism  $(x, t)$  through

$$\phi(p) = P(x), \quad \text{for some function } \phi : \mathbb{R}_+ \rightarrow \mathbb{R}.$$

Denote the laissez-faire price by  $p_0$ , so that  $\phi(p_0) = P(0)$ .

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- ▶ Allocation  $x$  changes residual demand and residual supply in the aftermarket.
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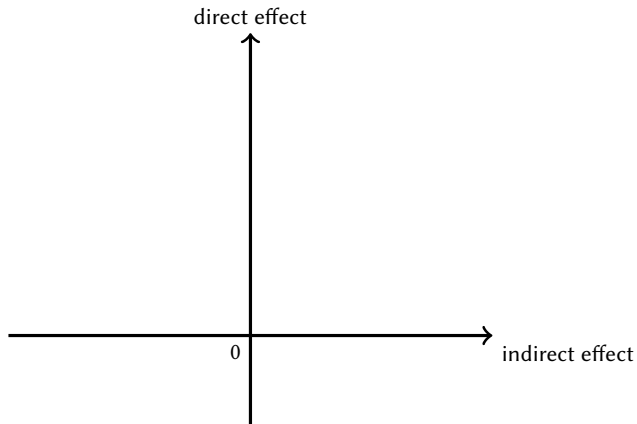
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## Key trade-off: direct effect versus indirect effect

$$\Pi(x; p) - \Pi(0; p_0) = \underbrace{\Pi(x; p) - \Pi(0; p)}_{\text{direct effect (price = } p)} + \underbrace{\Pi(0; p) - \Pi(0; p_0)}_{\text{indirect effect (price } p_0 \rightarrow p)} .$$

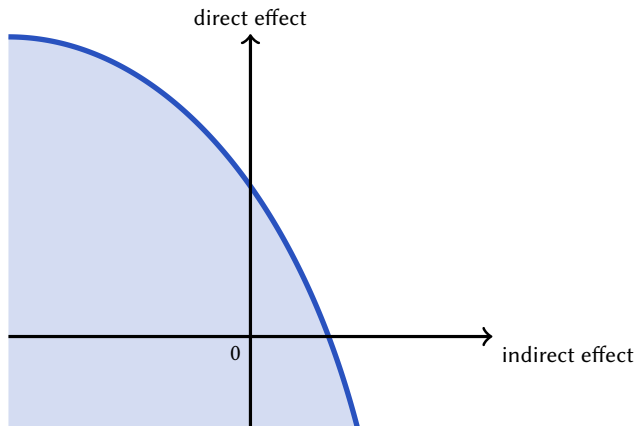
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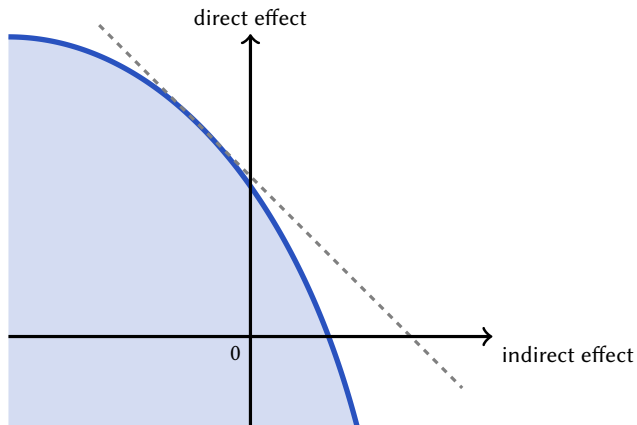


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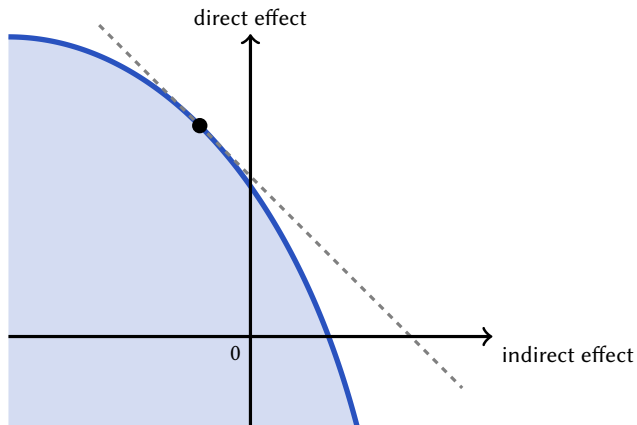
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# Analysis

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To answer this question, we proceed in two steps:

- ① Choose price  $p$  in the aftermarket to induce in equilibrium.
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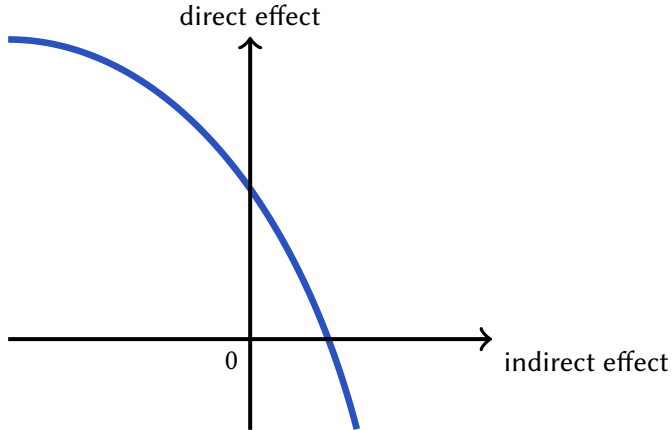
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For the chosen value of indirect effect, maximize the direct effect  $\Pi(x; p) - \Pi(0; p)$ .

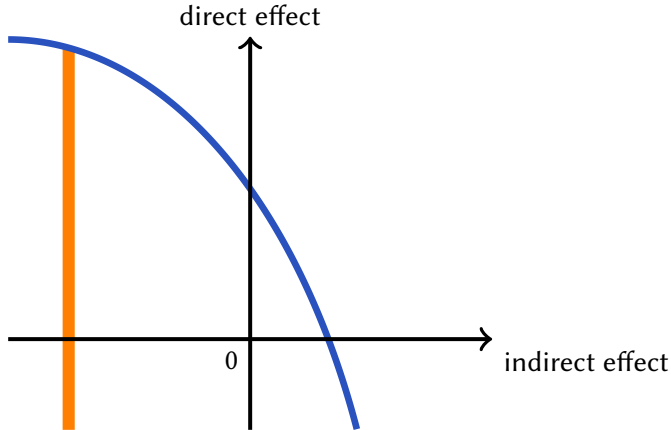


# Solving the mechanism design problem



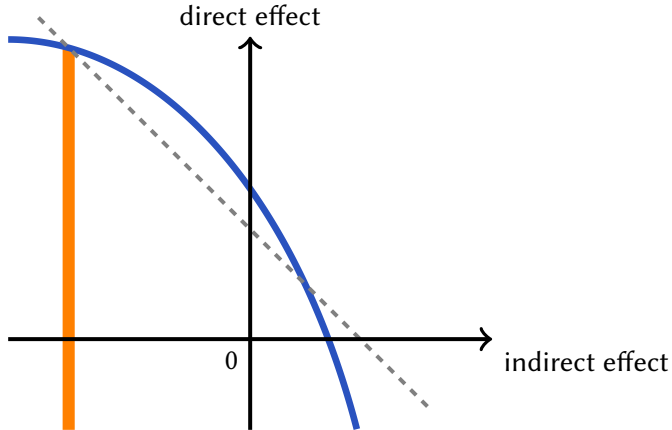
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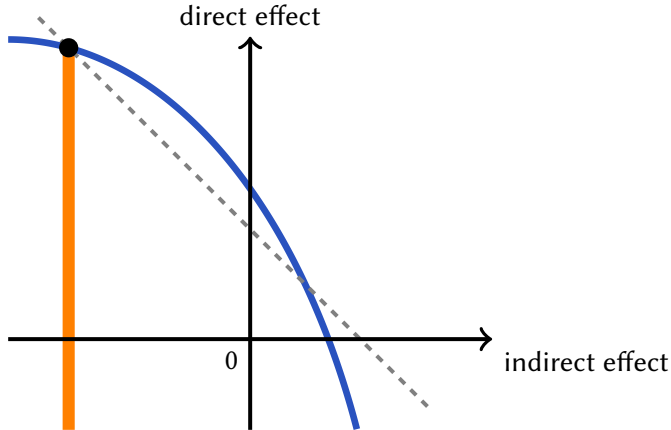
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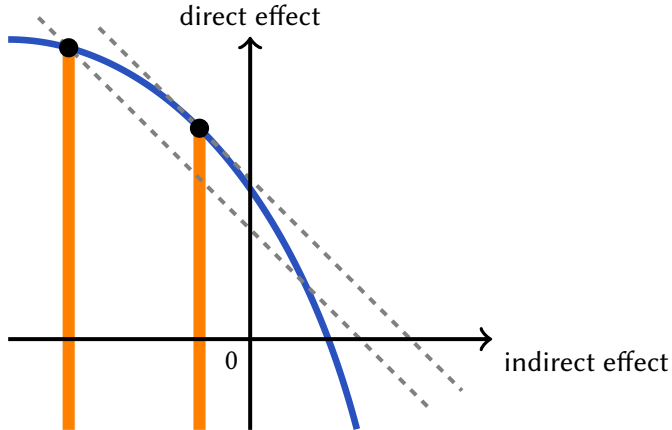
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# Constrained mechanism design

For each price  $p$ :

$$\max_{(x,t)} \underbrace{\Pi(x; p) - \Pi(0; p)}_{\text{direct effect}}$$
$$\text{s.t. } P(x) = \phi(p) \quad \iff \quad \underbrace{\Pi(0; p) - \Pi(0; p_0)}_{\text{indirect effect}} = \Delta\Pi_I$$

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► **Incentive compatibility:** consumers report their types truthfully, *i.e.*,

$$\theta \in \arg \max_{\theta' \in [\underline{\theta}, \bar{\theta}]} \left\{ v_1(p; \theta) \cdot x(\theta') + v_0(p; \theta) \cdot [1 - x(\theta')] - t(\theta') \right\} \quad \forall \theta \in [\underline{\theta}, \bar{\theta}]. \quad (\text{IC})$$

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- **Individual rationality:** consumers participate in the designed market voluntarily, *i.e.*,

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Define the **effective type**  $\eta(\theta; p) := v_1(p; \theta) - v_0(p; \theta)$ .

## Individual rationality (IR) with an aftermarket

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$\therefore$  WLOG, the designer considers mechanisms that elicit only information about  $\eta$ .

## Myerson's lemma

Myerson's lemma holds up to a change of variables from  $\theta$  to  $\eta(\theta; p)$ :

**Lemma 1.** For any given price  $p$ , let

$$\underline{\eta} = \min_{\theta \in [\underline{\theta}, \bar{\theta}]} \eta(\theta; p) \quad \text{and} \quad \bar{\eta} = \max_{\theta \in [\underline{\theta}, \bar{\theta}]} \eta(\theta; p).$$

Then any mechanism  $(x, t)$  satisfies (IC) and (IR) only if there exist a non-decreasing function  $\hat{x} : [\underline{\eta}, \bar{\eta}] \rightarrow [0, 1]$  and a function  $\hat{t} : [\underline{\eta}, \bar{\eta}] \rightarrow \mathbb{R}$  such that

1.  $x(\theta) = \hat{x}(\eta(\theta; p))$  almost everywhere; and
2.  $t(\theta) = \hat{t}(\eta(\theta; p))$  almost everywhere, such that

$$\eta \cdot \hat{x}(\eta) - \hat{t}(\eta) = \underline{\eta} \cdot \hat{x}(\underline{\eta}) - \hat{t}(\underline{\eta}) + \int_{\underline{\eta}}^{\eta} \hat{x}(s) ds \quad \text{for all } \eta \in [\underline{\eta}, \bar{\eta}] \quad \text{and} \quad \underline{\eta} \cdot \hat{x}(\underline{\eta}) - \hat{t}(\underline{\eta}) \geq 0.$$

# Optimal mechanism

**Main theorem.** There exists an optimal mechanism  $(x^*, t^*)$  that is a menu of at most two prices; that is,  $\text{im } x^* \subseteq \{0, \pi, 1\}$  for some  $0 < \pi < 1$ .

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The optimal mechanism has a simple structure:

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This provides a new justification for rationing: to trade off direct and indirect effects.

## Proof idea of main theorem

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The designer's problem can be expressed as:

$$\begin{aligned} \max_{\hat{x}} \quad & \int_{\underline{\eta}}^{\bar{\eta}} \mathbf{E}[\psi(\theta; p) \mid \eta] \hat{x}(\eta) \, dG(\eta) \\ \text{s.t.} \quad & \begin{cases} \hat{x} : [\underline{\eta}, \bar{\eta}] \rightarrow [0, 1] \text{ is non-decreasing,} \\ \phi(p) = P(\hat{x}). \end{cases} \end{aligned}$$

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Any extreme point  $x^*$  of the feasible region satisfies  $\text{im } x^* \subseteq \{0, \pi, 1\}$  for some  $0 < \pi < 1$ .

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Zi Yang Kang

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# Application #1: Vertical Contracting

inspired by Kang and Muir (2022)

## Motivation

- ▶ Many dominant firms do not necessarily sell a final good directly to consumers; instead, they sell an input good to suppliers, who use it to produce a final good.
  - For example, Amazon sells distribution services to merchants, who then sell to downstream consumers; Google sells ads to third-party sellers, who use ads to make sale.

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  - In the paper, we study when such dominant firms should be allowed to merge with third-party sellers (*i.e.*, how vertical mergers impact welfare in the market).

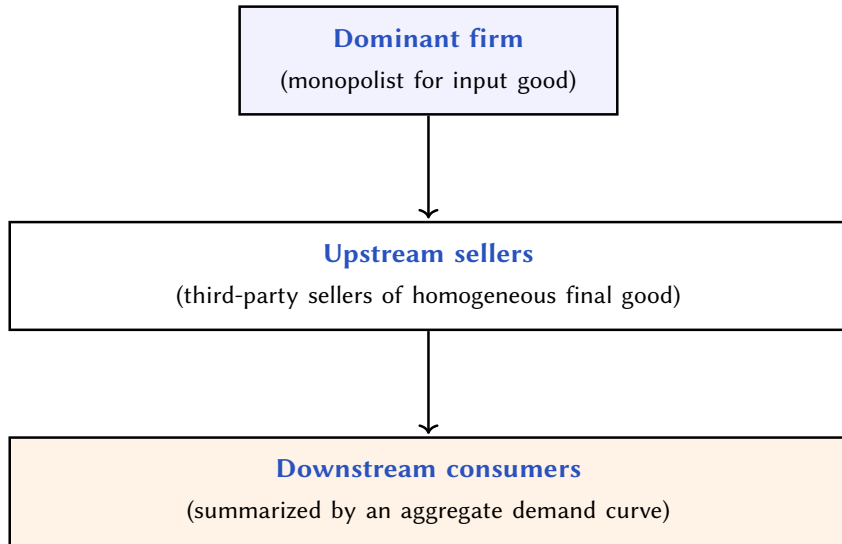
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**Question:** How does the dominant firm optimally contract with third-party sellers?



## Overview of model

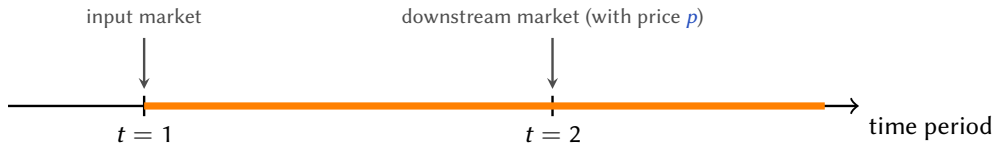


## Mapping from framework: upstream sellers

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Sellers differ in types  $\theta$ : they costlessly convert 1 unit of input into  $\theta$  units of final good.

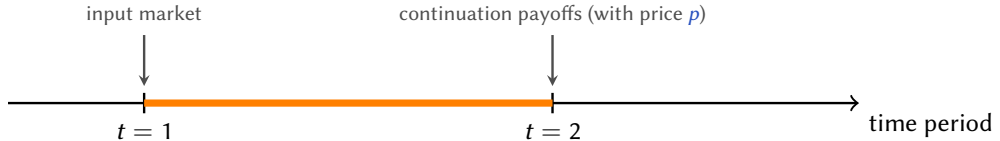
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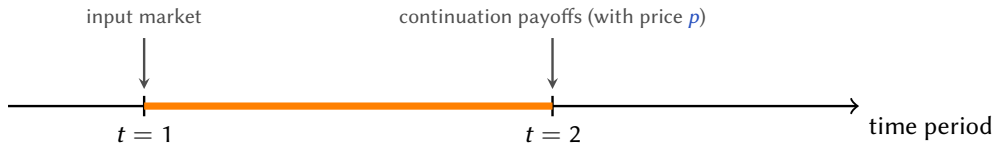
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Continuation payoffs (with price  $p$  per unit of final good):

$$\begin{cases} v_0(p; \theta) = 0 & \text{if not allocated input,} \\ v_1(p; \theta) = \theta p & \text{if allocated input.} \end{cases}$$

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There is a dominant firm who chooses a **direct mechanism**  $(x, t)$ , consisting of:

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$$\Pi(x; p) = \int_{\underline{\theta}}^{\bar{\theta}} \left[ \theta - \frac{1 - F(\theta)}{f(\theta)} \right] p x(\theta) dF(\theta).$$

**Key assumption (A):**  $\Pi$  is an affine functional of  $x$ .

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# Optimal mechanism

**Main theorem.** There exists an optimal mechanism  $(x^*, t^*)$  that is a menu of at most two prices; that is,  $\text{im } x^* \subseteq \{0, \pi, 1\}$  for some  $0 < \pi < 1$ .

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But rationing can be optimal to trade off:

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**Exercise:** rationing is not optimal if  $\frac{1-F(\theta)}{\theta f(\theta)}$  is decreasing in  $\theta$ .


# Application #2: Public Option

based on Kang (2023)

## Motivation


- ▶ Governments often redistribute by providing public alternatives to goods sold in private markets, many of which are allocated at prices below market-clearing levels.
  - For example, public housing programs allow eligible individuals to rent affordable housing units at lower prices relative to private apartments of similar quality.
  - This results in excess demand: in the United States, 1.6 million households were on a public housing waitlist in 2012 (Collinson et al., 2016).

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- ▶ Policymakers have cited short-run constraints—such as limited funding and insufficient stock of public housing—as justification for rationing public assistance.
  - Recent theoretical work has confirmed that rationing can be optimal when these constraints are present (Akbarpour  al., 2022).

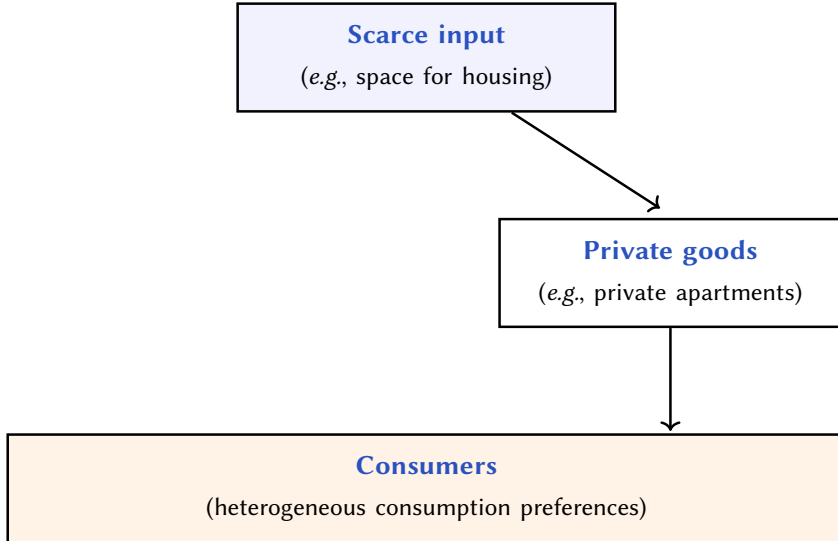


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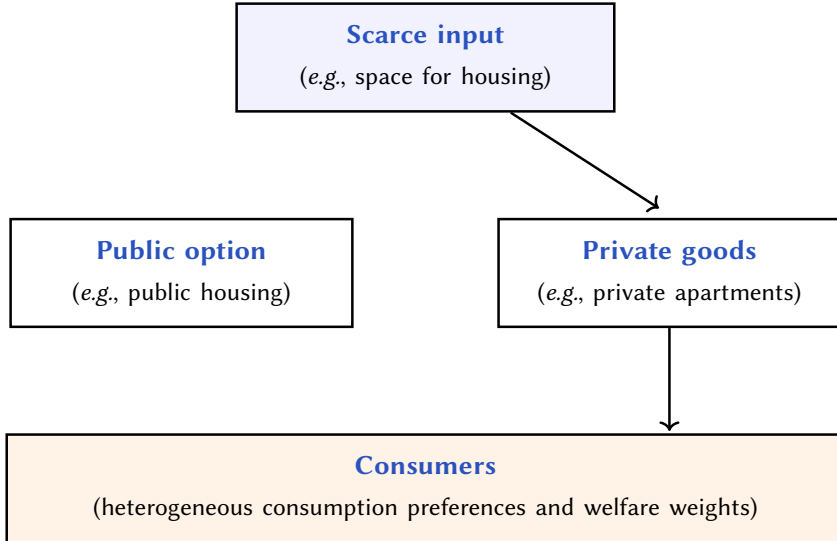
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**Question:** Can rationing be optimal in the long run and, if so, why?

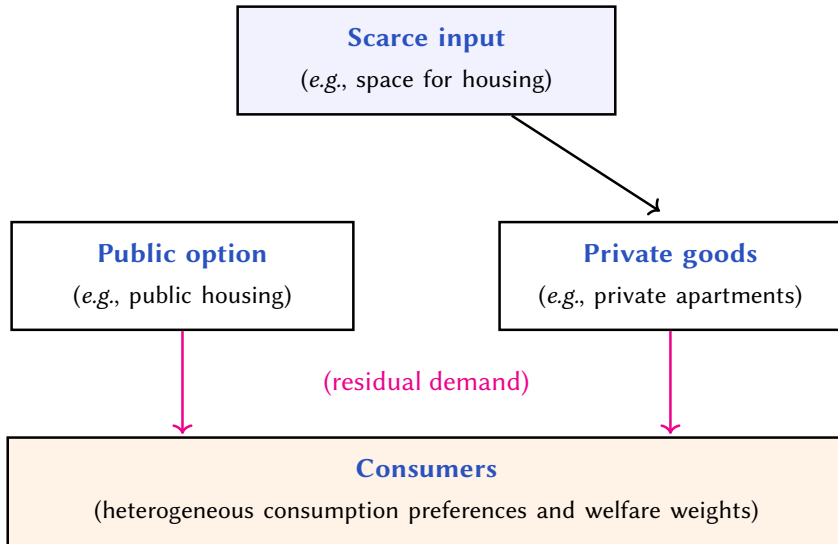
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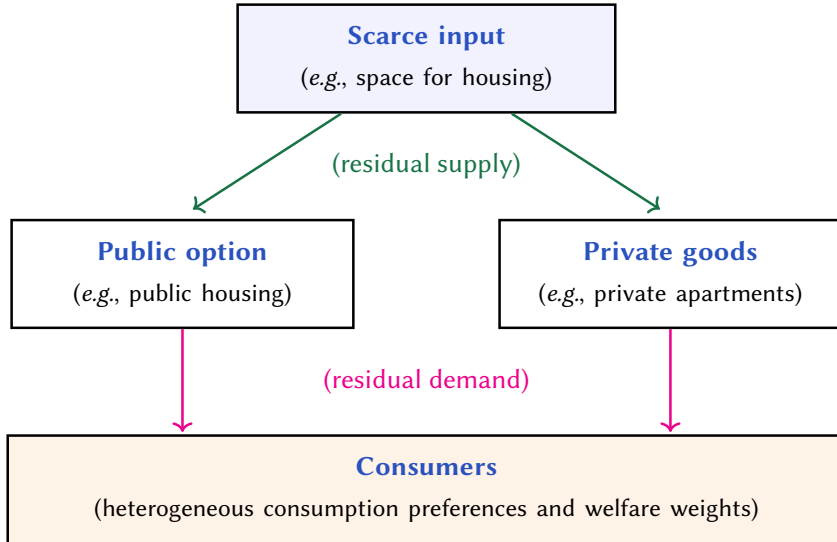
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## Mapping from framework: consumers

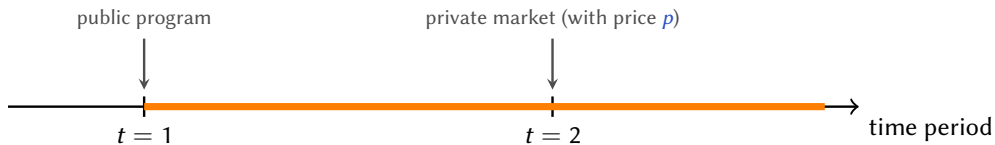
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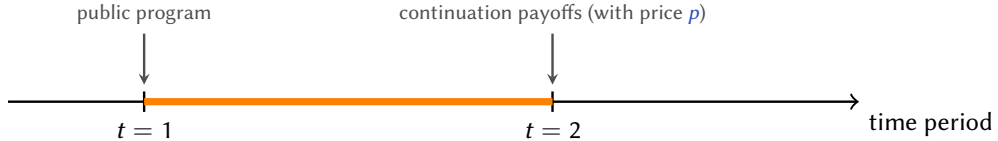
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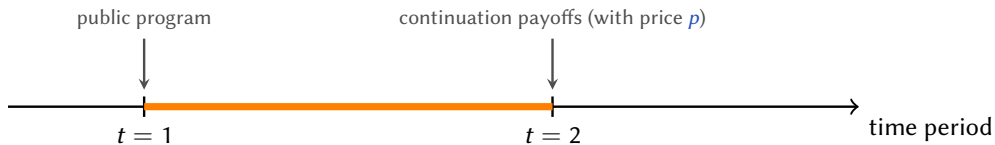




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**Key assumption (A):**  $\Pi$  can be written as an affine functional of  $x$ .



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## Implications of incentive constraints

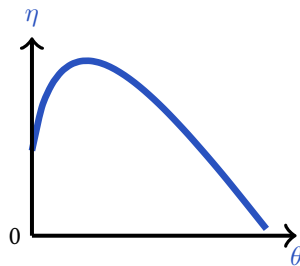
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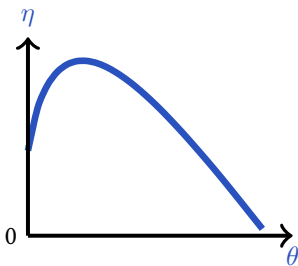
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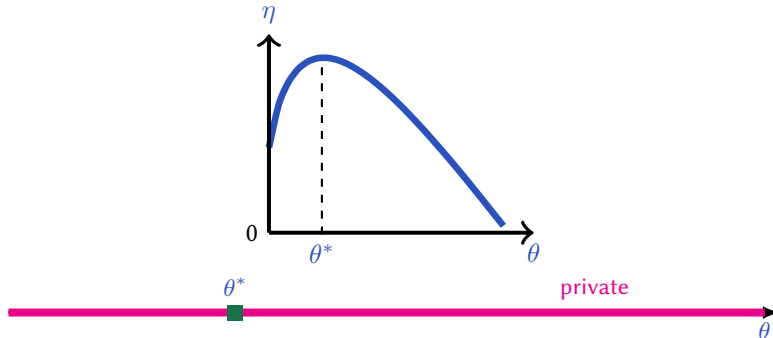
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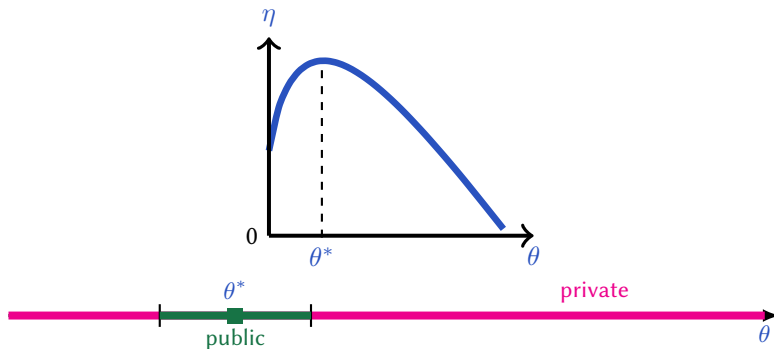
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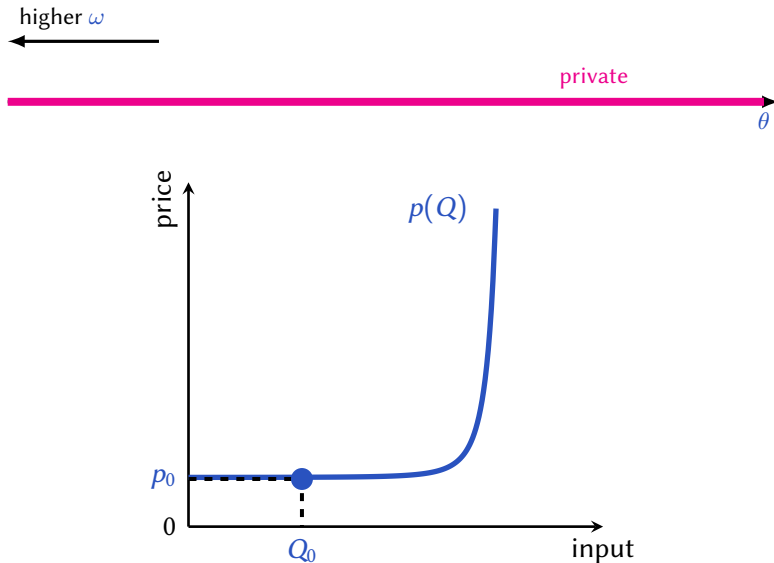
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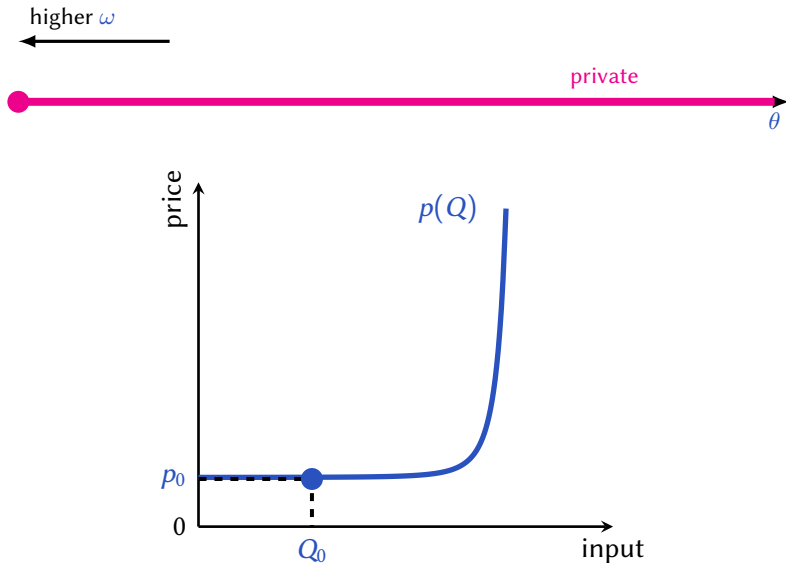
Thus rationing can be optimal in the long run to trade off direct and indirect effects.

- ▶ **Direct effect:**  $\Pi(x; p) - \Pi(0; p)$  measures the value due to screening.
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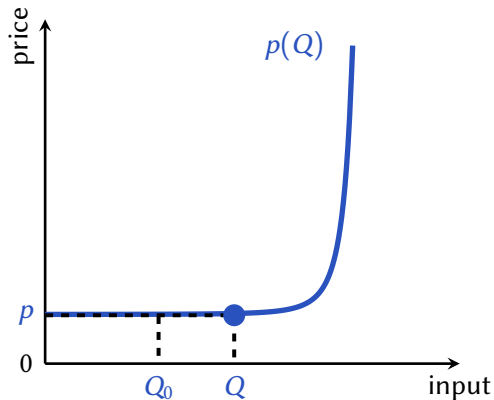
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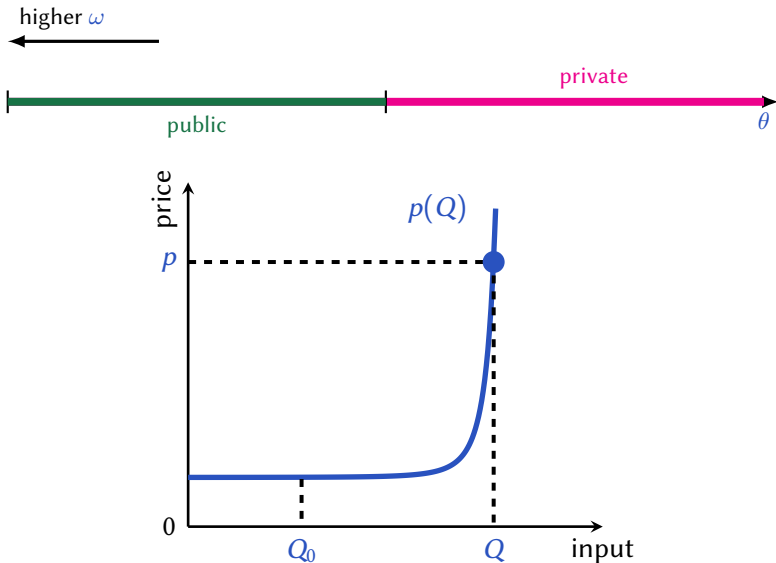
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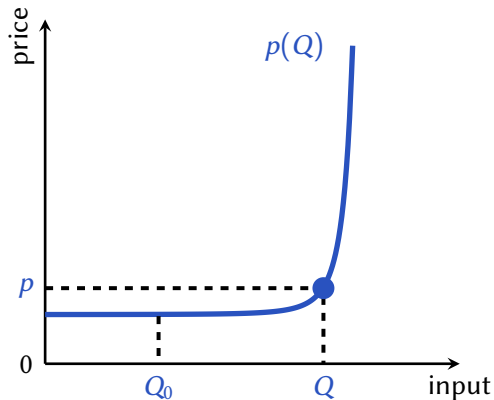
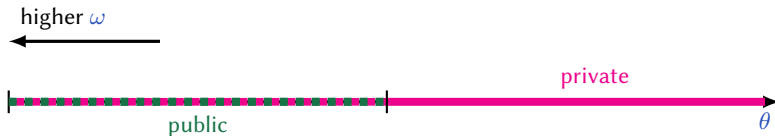
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# Discussion



## Extensions

Many assumptions can be relaxed:

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- ▶ **Market structure assumptions.**

Aftermarket need not be perfectly competitive (e.g., Kang, 2023).

## Takeaway #1: equilibrium effects are important in many settings

Trade-offs in other economic problems can be understood via direct and indirect effects.

<b>Problem</b>	<b>Instruments</b>	<b>Indirect feedback</b>
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**Other problems:** adverse selection, imperfect competition, costly search, market frictions...

**Other instruments:** taxes/subsidies on multiple goods, price controls, product specification regulation...

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**Now:** equilibrium effects can necessitate optimal rationing.

## Conclusion

**This tutorial:** an approach for mechanism design problems with equilibrium effects.

- ▶ This approach involves (only slightly) modifying existing mechanism design tools.
- ▶ Equilibrium effects are important; can lead to new insights on optimal mechanisms.
- ▶ Many problems untouched; many potentially exciting and new areas for research!

## References

- AKBARPOUR, M. (r) E. BUDISH (r) P. DWORCZAK (r) S. D. KOMINERS (2021): “An Economic Framework for Vaccine Prioritization,” *Working paper*.
- AKBARPOUR, M. (r) P. DWORCZAK (r) S. D. KOMINERS (2022): “Redistributive Allocation Mechanisms,” *Working paper*.
- COLLINSON, R., I. G. ELLEN, AND J. LUDWIG (2016): “Low-Income Housing Policy,” in *Economics of Means-Tested Transfer Programs in the United States* ed. by Moffitt, R. A. Volume 2, Chicago, IL: University of Chicago Press, Chap. 2, 59–126.
- CONDORELLI, D. (2013): “Market and Non-Market Mechanisms for the Optimal Allocation of Scarce Resources,” *Games and Economic Behavior*, 82, 582–591.
- DWORCZAK, P. (r) S. D. KOMINERS (r) M. AKBARPOUR (2021): “Redistribution Through Markets,” *Econometrica*, 89, 1665–1698.
- KANG, Z. Y. (2022): “Optimal Indirect Regulation of Externalities,” *Working paper*.

## References

- (2023): “The Public Option and Optimal Redistribution,” *Working paper*.
- KANG, Z. Y., AND E. V. MUIR (2022): “Contracting and Vertical Control by a Dominant Platform,” *Working paper*.
- LOERTSCHER, S., AND E. V. MUIR (2022): “Monopoly Pricing, Optimal Rationing, and Resale,” *Journal of Political Economy*, 130, 566–635.
- PAI, M., AND P. STRACK (2022): “Taxing Externalities Without Hurting the Poor,” *Working paper*.