

# Selling a Single Item with Negative Externalities

To Regulate Production or Payments?

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## OBJECTIVES

Consider the sale of an Internet-of-Things device that contains security vulnerabilities. Vulnerabilities can be mitigated by:

- A higher **investment in security** from the seller
- A higher effort from the buyer in **adopting security practices**.

When computer systems are compromised, the whole network is affected by cyber attacks and the buyer or seller is only **little affected**. This results in **little incentive** for the seller and the buyer in reducing vulnerabilities:

- Implementing security features introduce **extra engineering costs**.
- Security practices may be a **costly endeavor** for many buyers.

For a regulator, there is **uncertainty** and **asymmetry** on how effective the seller or the buyer is in mitigating negative externalities. A regulator can:

- Regulate production:** by requiring minimum security investment from a seller.
- Regulate prices:** by penalizing a buyer when they cause externalities.

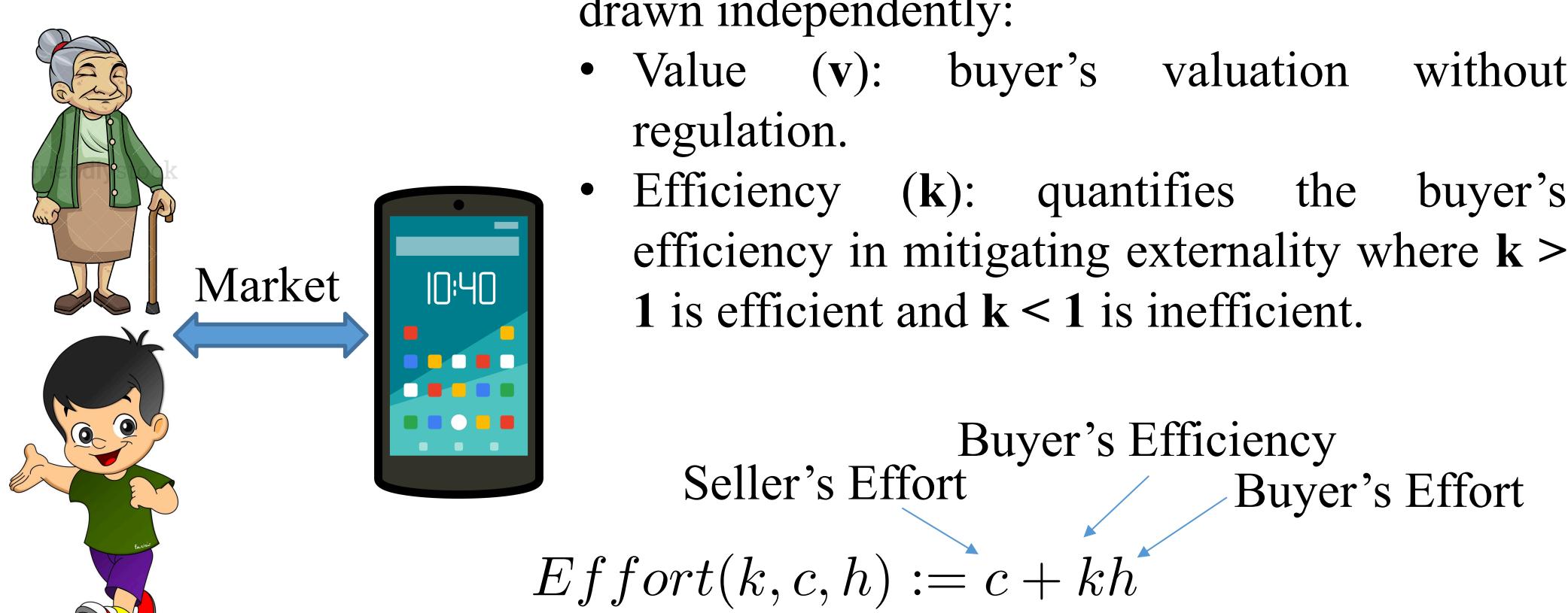
To avoid pushback from the industry regulations must provide **minimum profit guarantees** to sellers. The same problem is faced by a regulator in other application domains such as regulating air pollution.

**Main Question:** Which regulation minimizes negative externalities subject to minimum profit guarantees to the seller? Are simple regulations approximately optimal?



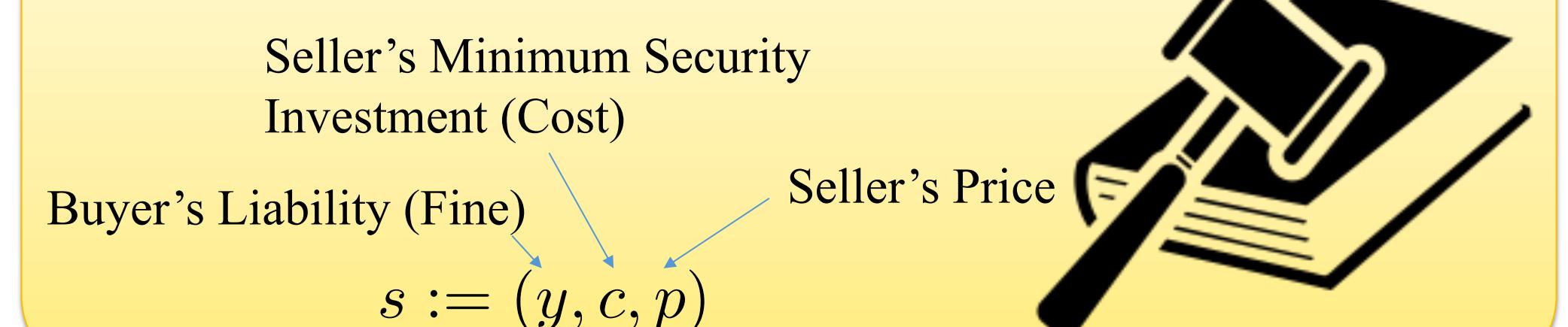
## Model

$$t = (v, k) \leftarrow D_v \times D_k$$



$$\text{Probability of an Externality: } Risk(k, c, h) := e^{-Effort(k, c, h)}$$

## Regulation



**Definition (Simple Regulation):** regulates only prices ( $c = 0$ ) or only regulates production ( $y = 0$ ).

**Effects of regulation on buyer's utility:** buyer increases effort towards higher security.

$$\text{Buyer's Utility } u(t, s) := \begin{cases} v - yRisk(k, c, h) - h - p & , \text{ if buyer purchase} \\ 0 & , \text{ otherwise} \end{cases}$$

$$\text{Optimal Buyer's Effort } h^*(t, s) := \max \left( 0, \frac{\ln(yk) - c}{k} \right)$$

$$\text{Buyer's Externality under Optimal Effort } risk(t, s) := \min \left( e^{-c}, \frac{1}{yk} \right)$$

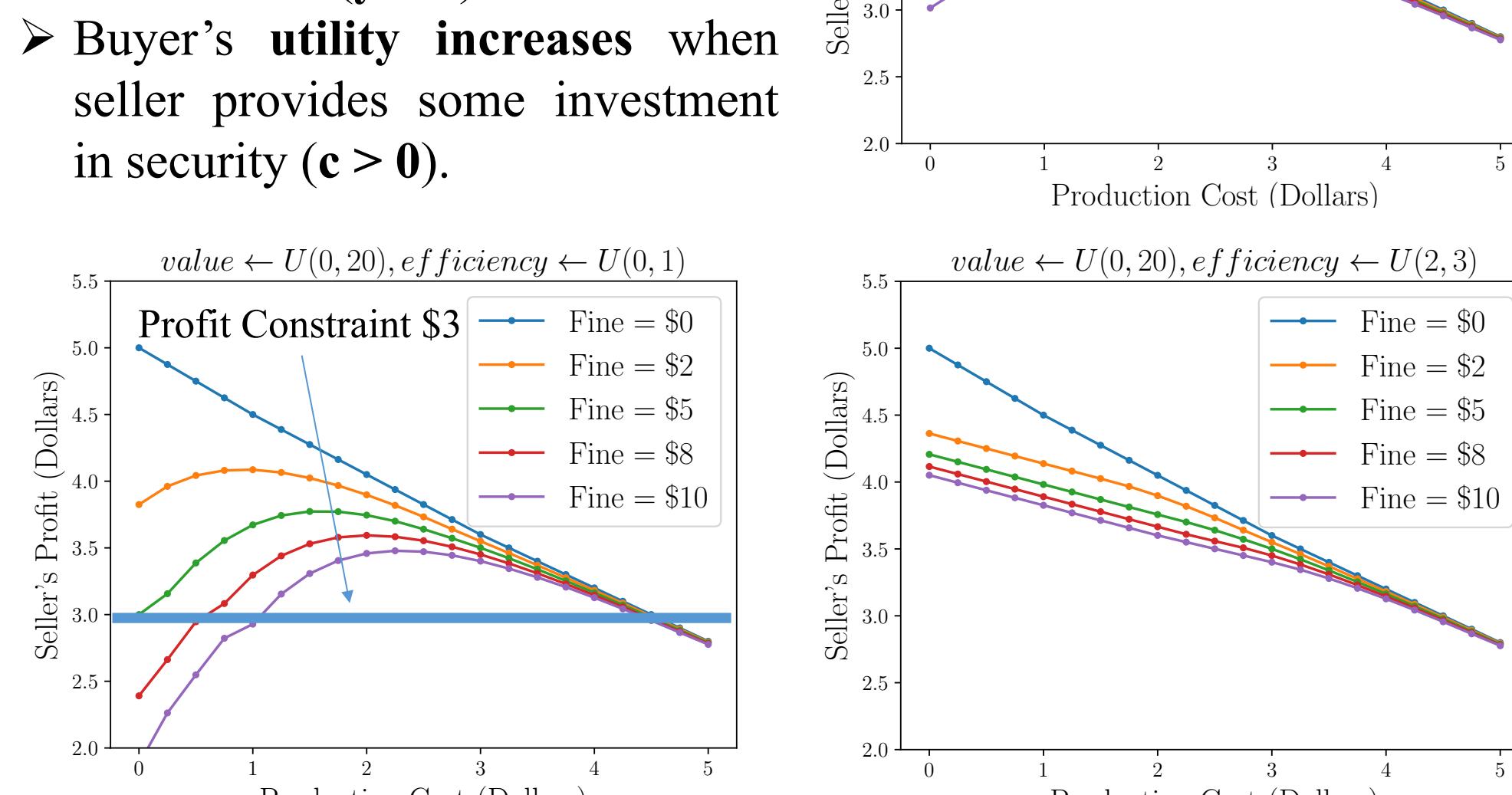
## Optimal Regulation

The regulator's objective is to minimize expected externalities **among buyers that purchase** the item subjected to minimum profit guarantees.

Profit	$Profit_D(s) := (p - c)Pr_{t \in D}[u(t, s) \geq 0]$
Externality	$Ext_D(s) := \frac{\mathbb{E}_{t \in D}[risk(t, s) \cdot \mathbb{I}(u(t, s) \geq 0)]}{Pr_{t \in D}[u(t, s) \geq 0]}$
Optimal Regulation	$OPT(D, R) := \arg \min_{s   Profit_D(s) \geq R} Ext_D(s)$

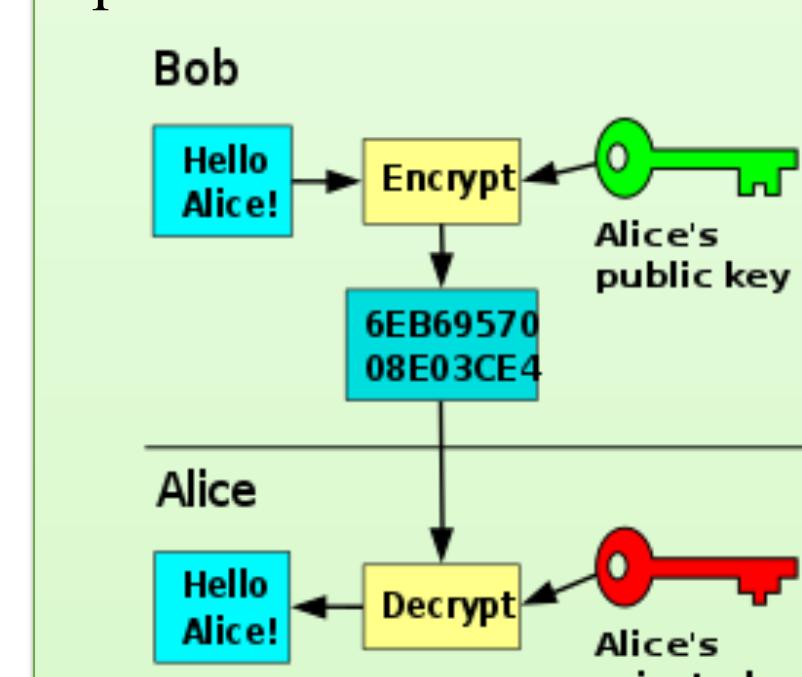
### Optimal Seller's Profit for Different Regulations

- Any regulation directly or **indirectly decreases seller's profit**.
- If population is inefficient ( $k < 1$ ) and buyers are penalized for their externalities ( $y > 0$ ):



### Example: Regulating only production is optimal when buyer is inefficient

Consider a product where the security is **uniquely determined** by the correct use of a public key encryption protocol



Buyers have no knowledge about the technical aspects of public key encryption; therefore, they are always inefficient in reducing risks



- Buyers have no technical expertise; therefore, they never put in effort in correctly using encryption (even if they are penalized)

$$h^*(t, s) = \max \left( 0, \frac{\ln(yk) - c}{k} \right)$$

- Risk depends only on the seller correctly implementing the public key infrastructure

$$risk(t, s) = \max \left( e^{-c}, \frac{1}{yk} \right)$$

- Any liability ( $y > 0$ ) on buyer can only hurt buyer's utility and has no impact on externality

$$u(t, s) = v - ye^{-c} - p$$

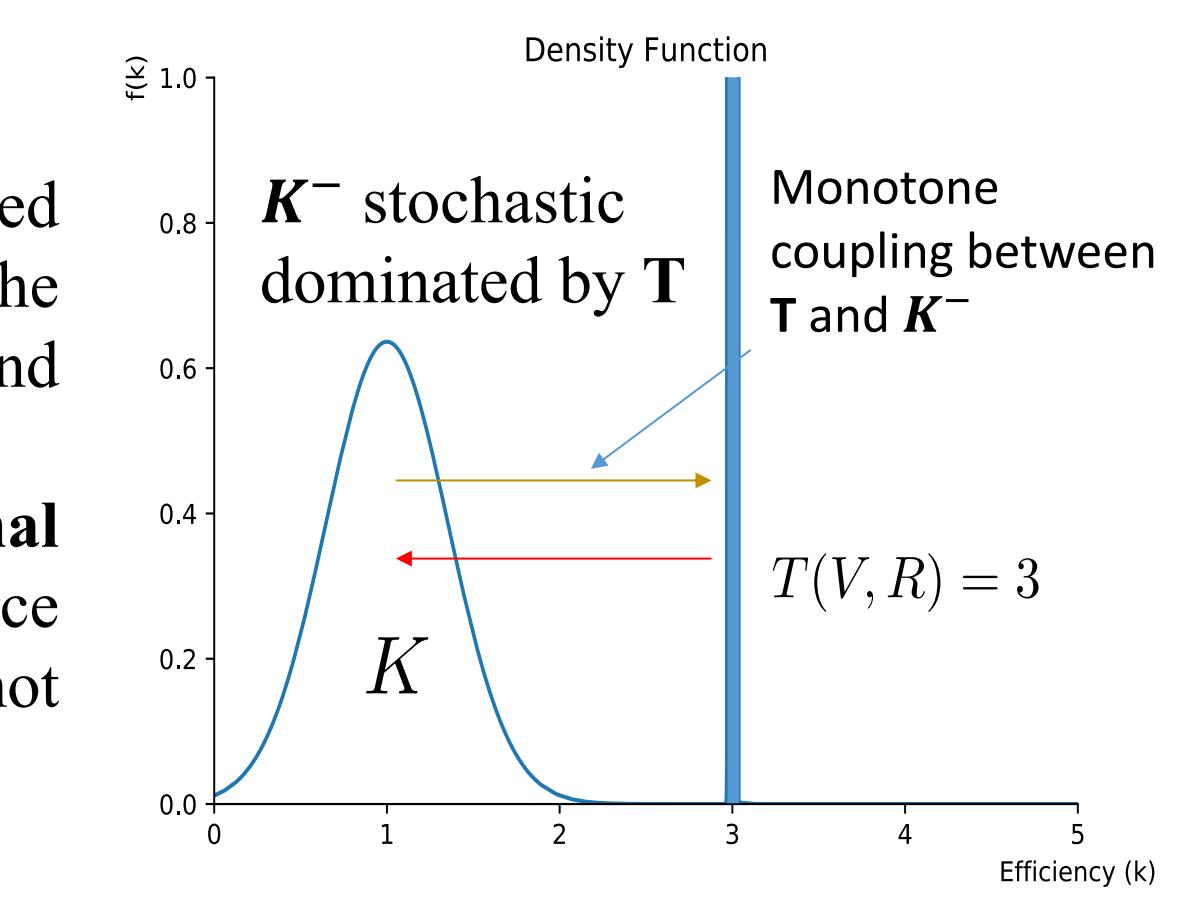
- The externality of the population only depends on seller's investment

$$Ext_D(s) = e^{-c}$$

## Optimal Simple Regulations

**Theorem:** For all value distributions  $V$ , and profit constraint  $R$ , there is a cutoff  $T = T(V, R)$  such that

- For all efficiency distributions  $K^-$  supported on  $[0, T(V, R)]$ , regulating only production is optimal.
- for all efficiency distributions  $K^+$  supported on  $[T, \infty]$ , the optimal regulation regulates only prices or it is not profit-maximizing.



### Approximately Optimal Simple Regulations

- For efficiency distributions supported below and above the cutoff  $T(V, R)$ , the **optimal regulation is mixed**.
- Without relaxing profit constraint, simple regulations are **not approximately optimal**.

**Theorem:** For all  $x > 0$ , there is a distribution  $D$ , profit constraint  $R$  with optimal regulation  $s$  and optimal simple regulation  $s'$  where the externalities of  $s'$  are at least  $x$  times bigger than the externalities of  $s$ .

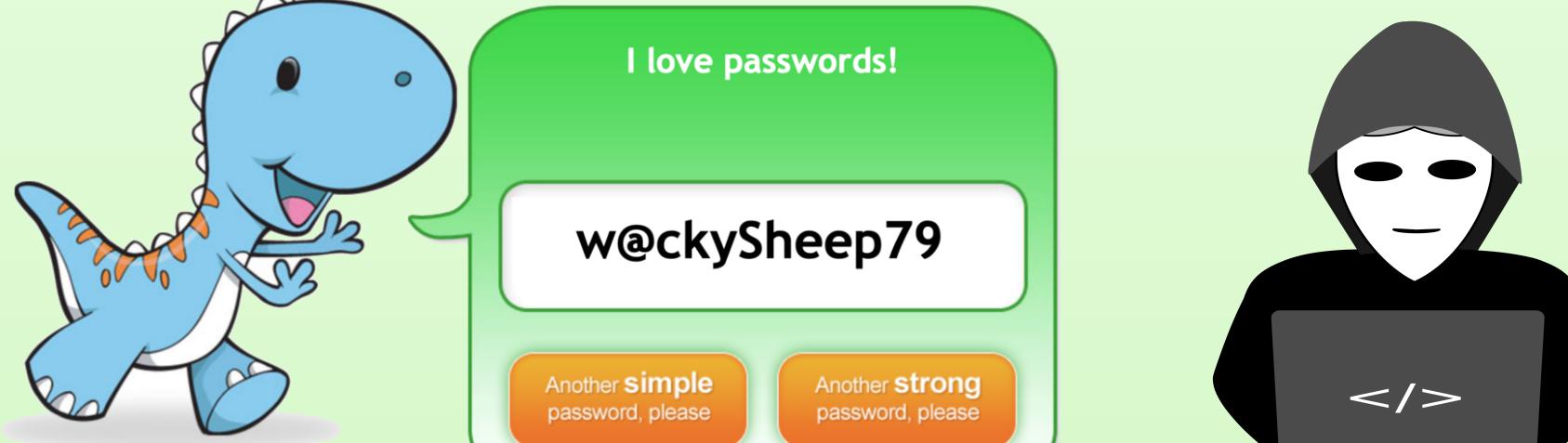
- Bad distribution is supported on two types of buyers.
- Profit constraint that can only be satisfied if the item is **always sold**.
- Both types have the same value but one type is highly efficient and the other type is inefficient.

### Example: Regulating only prices is optimal when the buyer is highly efficient

Consider a product where security depends **mostly** on the buyer using strong passwords

Buyer is capable of setting strong passwords

$$D_k = k , \text{ where } k \rightarrow \infty$$



- With a small penalty ( $y > 0$ ), buyer sets strong passwords

$$h^*(t, s) = \max \left( 0, \frac{\ln(yk) - c}{k} \right)$$

- Risk depends only on the buyer using strong passwords

$$risk(t, s) = \max \left( e^{-c}, \frac{1}{yk} \right)$$

- Production cost ( $c > 0$ ) has a big impact on profit and small impact on externality when compared with liabilities ( $y > 0$ )

$$Rev_D(s) = (p - c)Pr \left[ v \geq p + \frac{1 - \ln(yk) - c}{k} \right] \quad Ext_D(s) = \frac{1}{yk}$$

## Bicriteria Approximation

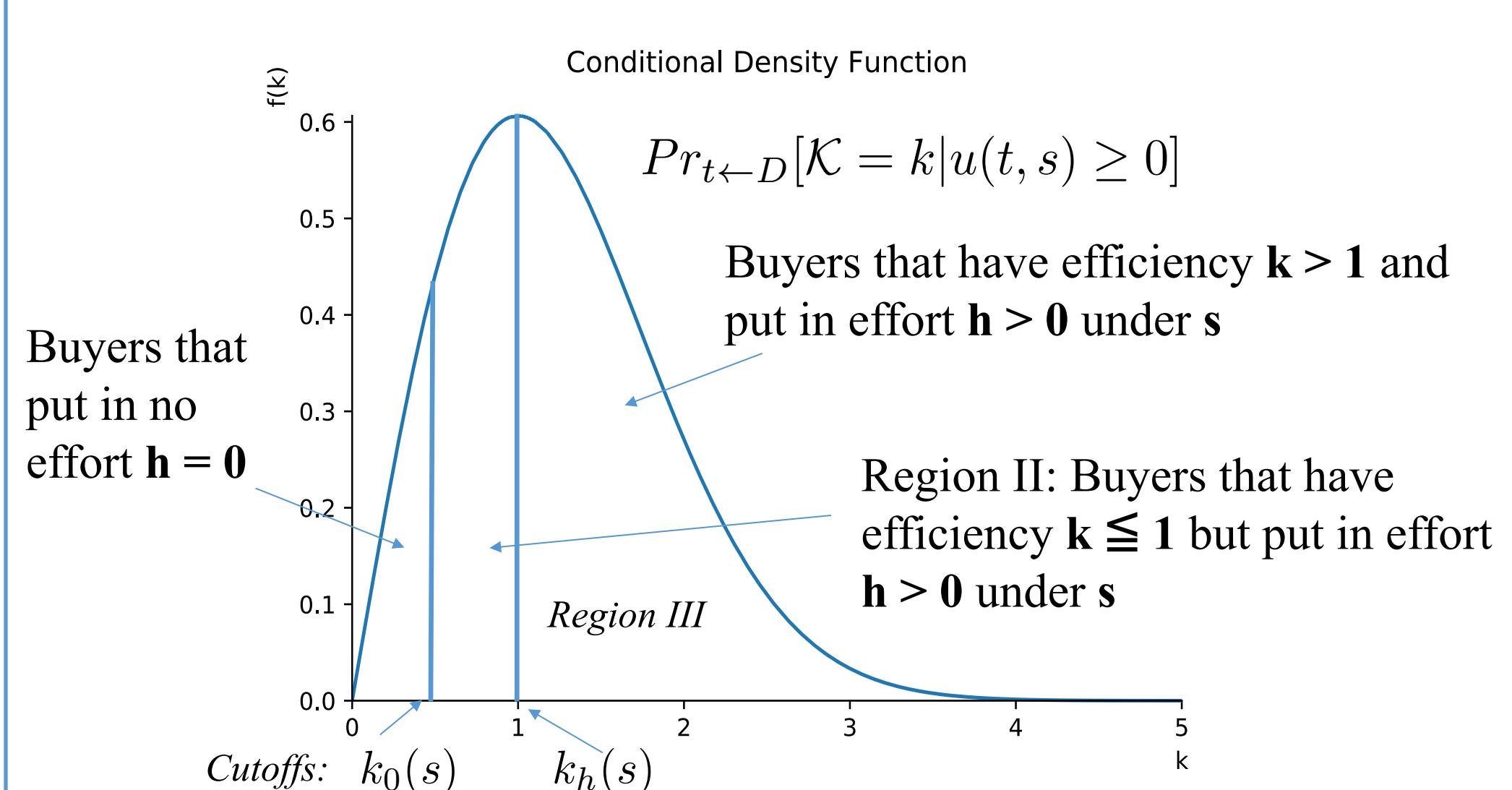
**Theorem:** For every distribution  $D$ , for all regulation  $s$ , there is a simple regulation  $s'$  such that:

$$Prof_D(s') \geq 1/8 Prof_D(s) \quad Ext_D(s') \leq 40/3 Ext_D(s)$$

Given some arbitrary regulation  $s$ , we construct a simple regulation  $s'$  targeting the population that already purchase the item under regulation  $s$ :

- Partition buyers** (conditioned on buying under  $s$ ) in three groups.
- Depending on which group contributes the most to profit under  $s$ , we design a simple regulation **targeting that group**.

### Efficiency distribution of buyers that purchase



### Case 1: Region 1 and 2 has large density

- Most of the revenue comes from **inefficient buyers**; therefore, regulating only production is approximately optimal.

### Case 2: Region 3 has large density

- Regulating only production can still be approximately optimal when:
  - $K$  has **small expected value**.
  - $V$  is a **heavy tail distribution**.

### Example: Optimal regulation also depends on value distribution

For every profit constraint  $R < 1$ , for every externality target  $E$  there is a regulation ( $y = 0, c > 0$ ) that gets revenue  $> R$  and externality  $< E$ .

$$Value is drawn from Equal Revenue \quad Pr[v \leq x] = \begin{cases} 0 & , x < 1 \\ 1 - \frac{1}{x} & , x \geq 1 \end{cases}$$

- First set sufficiently large  $c$ :

$$Ext_D(s) = e^{-c} < E$$

- Set sufficiently large price  $p$ :

$$\begin{aligned} Prof_D(s) &= (p - c)Pr[v \geq p] \\ &= (p - c)(1 - (1 - 1/p)) \\ &= 1 - c/p > R \end{aligned}$$

## Contact

Checkout the Paper:  
<https://arxiv.org/abs/1902.10008>

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