

# Incentivizing Firms to Protect Consumer Data: Can Reputation Play a (Bigger) Role?

Ying Lei Toh

*Toulouse School of Economics*

Digital Workshop

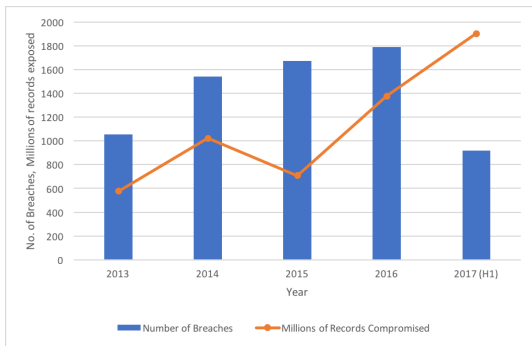
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Dec 20, 2017



# MOTIVATION

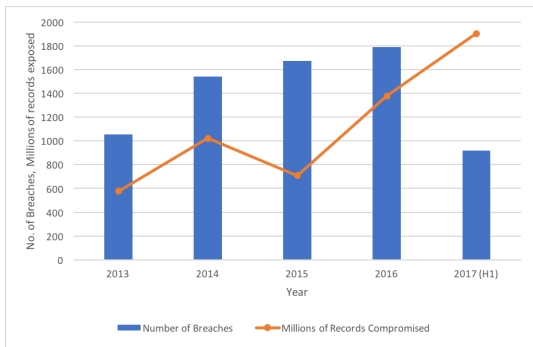
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Data breach victims may suffer costly consequences such as identity thefts and payment fraud.

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Increasingly hostile cyber-threat landscape, thanks to the emergence of dark-net marketplaces...

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...where criminals can buy hacking tools

## Goods and Services on the Black Market

Category	Definition	Examples
Initial Access Tools	Enable a user to perform arbitrary operations on a machine, then deliver payloads; can automate the exploitation of client-side vulnerabilities (Zeltser, 2010)	<ul style="list-style-type: none"> <li>Exploit kit (hosted or as-a-service)</li> <li>Zero-day vulnerabilities (and weaponized exploits)</li> </ul>
Payload Parts and Features	Goods and/or services that create, package, or enhance payloads to gain a foothold into a system	<ul style="list-style-type: none"> <li>Packers</li> <li>Crypters</li> <li>Binders</li> <li>Obfuscation / evasion</li> </ul>
Payloads	Imparts malicious behavior, including destruction, denial, degradation, deception, disruption, or data exfiltration	<ul style="list-style-type: none"> <li>Botnet for sale</li> </ul>
Digital Assets	Digital assets are those items obtained from the target or victim (i.e., the hacked or stolen information)	<ul style="list-style-type: none"> <li>Credit card information (e.g., fullz, dumps, card verification value)</li> <li>Account information (e.g., eCommerce, social media, banking)</li> <li>Email login and passwords</li> <li>Online payment service accounts</li> <li>Credentials</li> <li>PII/protected health information (PHI)</li> </ul>

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- Can reputation concerns play a role in incentivizing security investment? If so, how big a role does it play?
- How can we further improve investment incentives?

# OVERVIEW

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  - ▶ **Externalities:** losses to consumer and bank not internalized by website
  - ▶ **Imperfect Information:** website's security level not observed by consumer
  - ▶ **Customer turnover:** data breaches signal poor security; consumer may leave upon learning that website was breached → Reputation mechanism

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  - ▶ Difficulty in detecting breaches.
  - ▶ Limited consumer losses due to bank's fraud prevention and liability protection policy.
- Policies aimed at raising investment via the reputation mechanism can make the consumer worse off.



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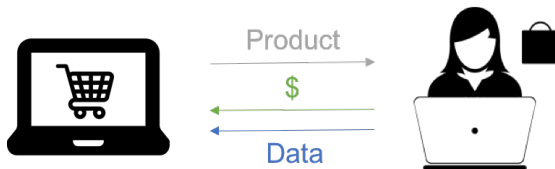




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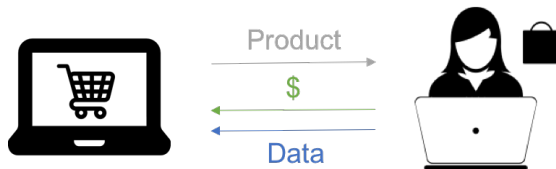
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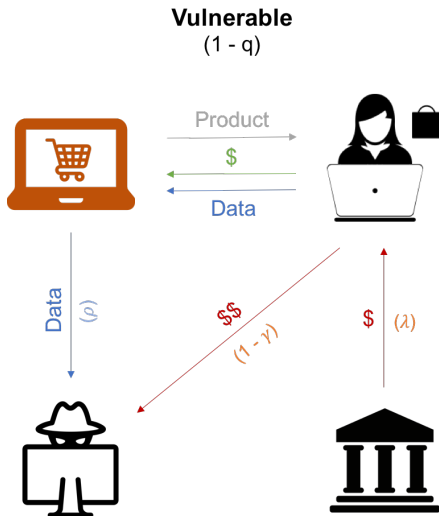
Website makes a one-time investment,  $c(q)$ , to protect consumer data at the start.

# THEORETICAL FRAMEWORK

**Secure**  
(q)



# THEORETICAL FRAMEWORK



# INFORMATION

What do the players know?



**Amount invested**

Yes.

No, but has rational beliefs over  $q$  (website's reputation).

**State of security**

No.

No.

**Data breaches**

Yes.

With probability  $\lambda(1 - \gamma)$ .

# INFORMATION

Website has initial reputation  $q_0$ .

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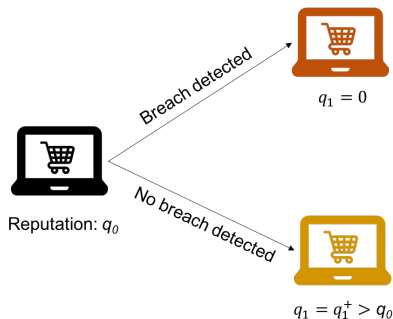
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# PAYOFFS

At every period, when the consumer buys from a *secure* website



Sales revenue:  $r$



Gross utility:  $v$   
Expected losses: 0



Financial gains: 0



Expected liability: 0

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At every period, when the consumer buys from a *vulnerable* website



Sales revenue:  $r$



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 Fraud losses:  
 $-\rho(1-\gamma)(1-\lambda\alpha)l$



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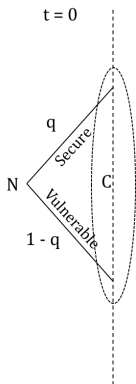


Fraud liability:  
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$\alpha$ : Fraud liability protection offered by the bank.

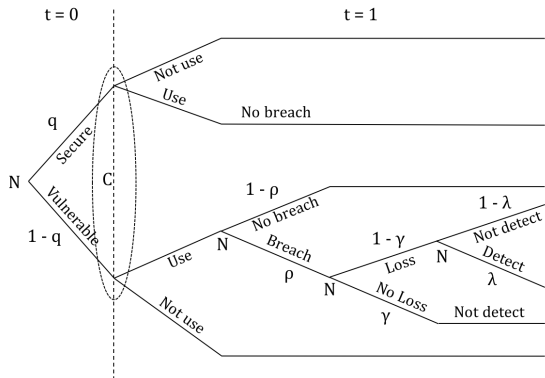
# TIMING

$t = 0$ : Website invests  $c(q)$  in security. With probability  $q$ , it is secure against cyber-attacks.



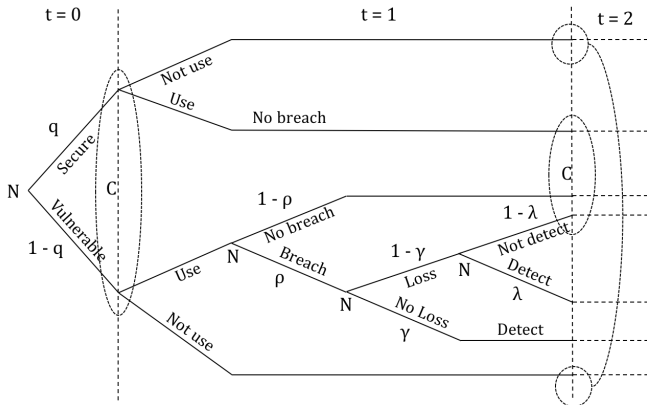
# TIMING

$t = 1$ : Consumer makes purchase decision given website's initial reputation. If website is vulnerable, breach may occur and be detected. Beliefs are updated.



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$t = 2$ : Consumer makes purchase decision given website's updated reputation...



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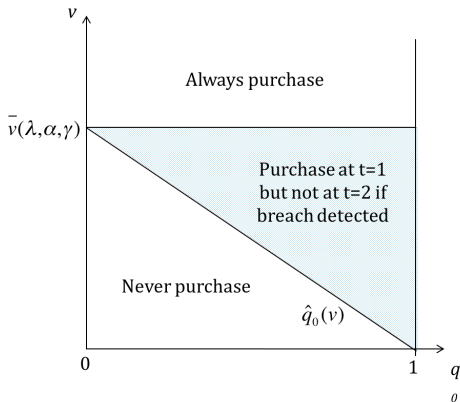
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1. Her valuation for the product  $v$
2. Her expected fraud losses  $\rightarrow$  depends on website's reputation  $q_{t-1}(q_0)$



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2) Consumer buys given website's initial reputation, but not after learning that it is vulnerable.

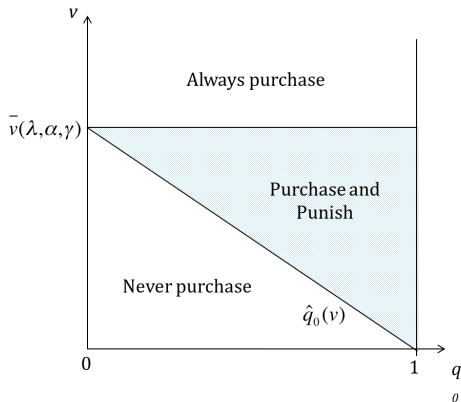


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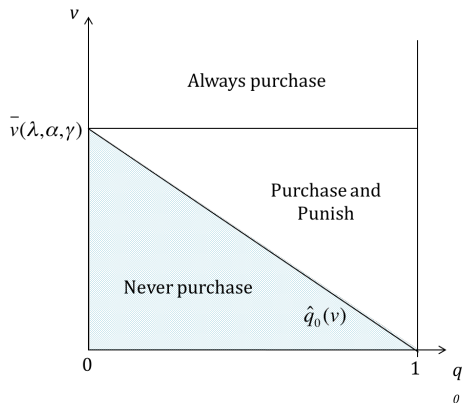


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3) Consumer never buys from website.



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Website has to decide how much to invest at the start given  $q_0$ :

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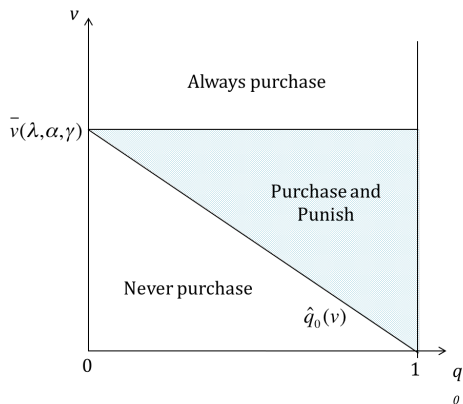
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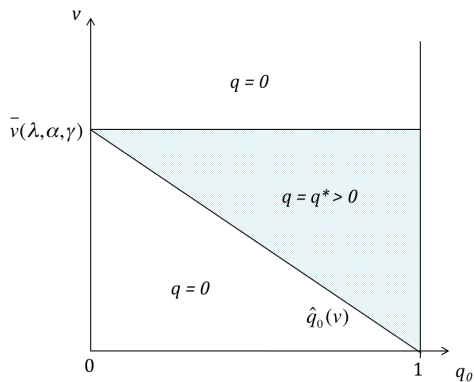
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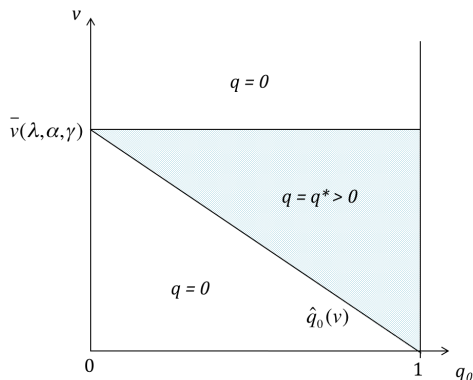
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Optimal security level  $q^*$  is increasing in consumer's ability to punish.

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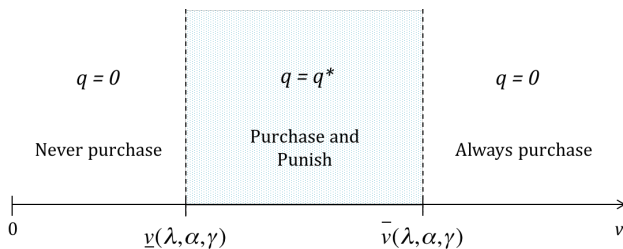
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2. It invests more when the consumer is more likely to learn of breaches.

# REPUTATION MECHANISM

Bayes-Nash Equilibrium (with Rational Expectations).



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- Only 11% of surveyed consumers terminated business relationship with the affected firm (Ablon et al, 2015).

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- Low *ability* to punish the firm → Firm invests little in security



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- Many major card networks (e.g., Visa, Mastercard, Amex) even offer a zero-liability policy.

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→ Firm has little incentives to invest.

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## Limited Role of Reputation in Reality

The consumer's *willingness* and *ability* to punish a breached firm in reality limited by:

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Implication:

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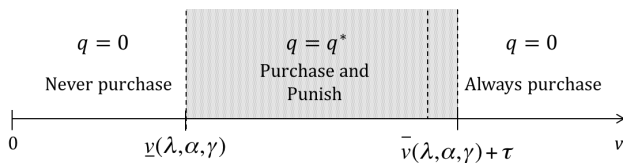
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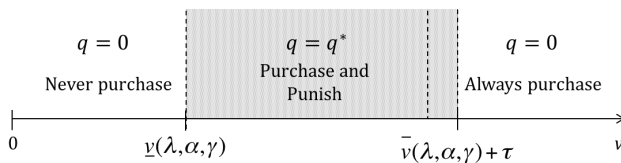
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The policy raises the consumer's willingness to punish, but does not affect her ability.

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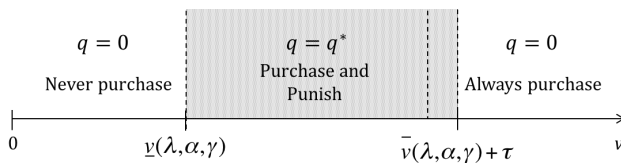


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Consumer surplus is *higher* when her valuation is *sufficiently small* ( $v < \hat{v} \in (\bar{v}, \bar{v} + \tau]$ ) and is lower otherwise.

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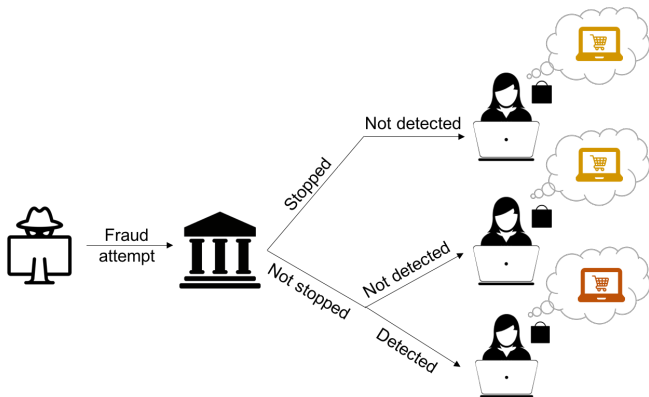
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Consumer is better able to punish website under active detection.

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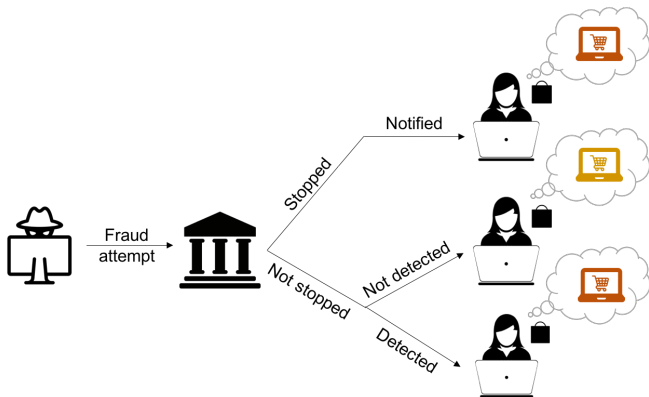
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**Passive Deterrence**

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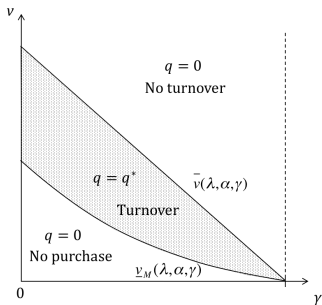
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Suppose active detection and passive deterrence are equally effective.

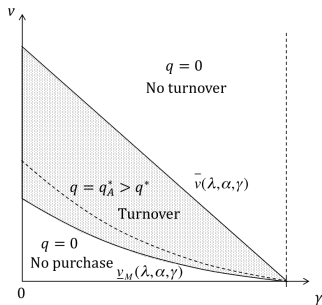
# ACTIVE MONITORING BY BANK

Suppose active detection and passive deterrence are equally effective.

- Website invests (weakly) more under active detection.



Passive deterrence



Active detection





# MANDATORY BREACH NOTIFICATION

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  - ▶ Notification must be provided *no later than 72 hours* after data controller becomes aware of the breach, whenever it is likely to "result in a risk for the rights and freedoms of individuals".

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- Failure to comply with regulations will result in high fines or penalties.

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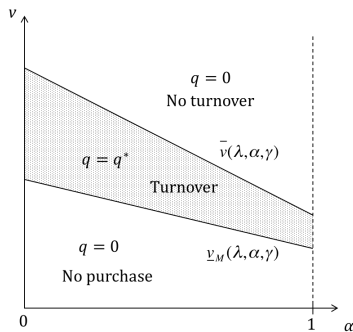
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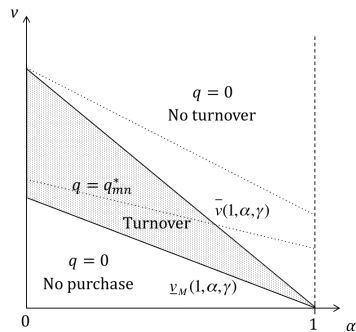
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- Lower expected losses from breaches → Less willing to punish the firm.

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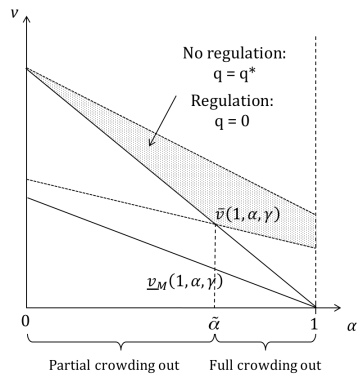


No regulation

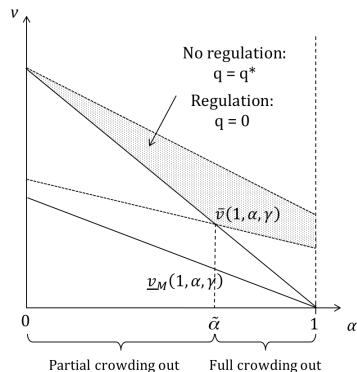


Mandatory notification

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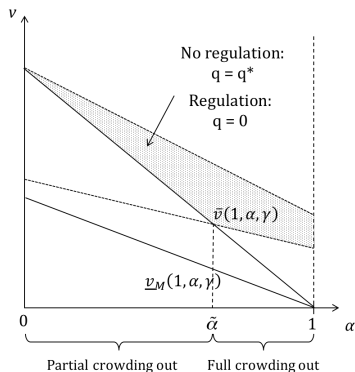


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Consumer surplus is *higher* under breach notification if

- the website invests more;
- the website invests less but the loss mitigation benefit is sufficiently big ( $\alpha$  is high enough).

Consumer surplus is lower otherwise.



# SUMMARY

	Impact on			
	Ability to Punish	Willingness to Punish	Investment Incentives	Consumer Surplus
<b>Expulsion of Breached Merchants</b>	·	+	+	+/-
<b>Active Monitoring by Bank</b>	+	·	+	+
<b>Mandatory Breach Notification</b>	+	-	+/-	+/-

# SUMMARY

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- Ex-post protection of consumers against losses reduces ex-ante investment incentives of firms.

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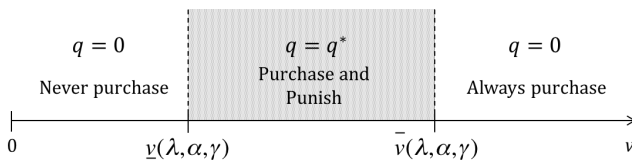
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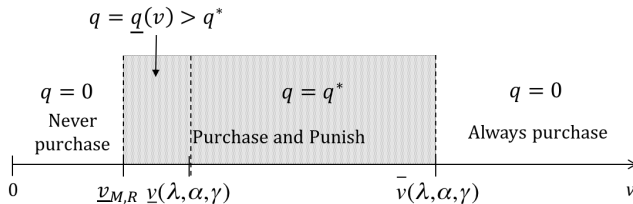
### 1. No regulation:



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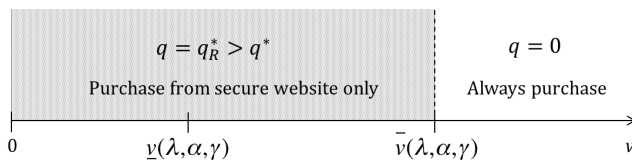
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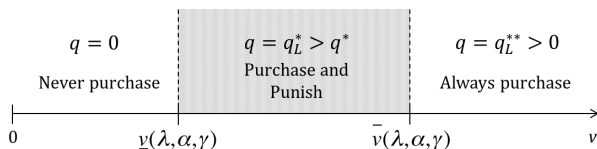
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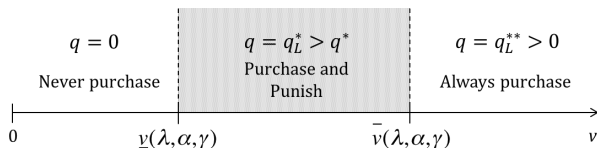


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Consumer surplus is (weakly) higher.



# RELATED LITERATURE

## **Economics of Info Security:**

- Probabilistic model of security investment: Gordon and Loeb (2002)
- Public good games: Varian (2004), Grossklags et al. (2008)
- Contagion: Acemoglu et al. (2016), Kunreuther and Heal (2003)
- Composite security model: Riordan (2014)

## **Reputation and Product Quality:**

Board and Meyer-ter Vehn (2013), Allen (1984), Dybvig and Spatt (1983), Rogerson (1983), Shapiro (1982), Shapiro (1983), Klein and Leffler (1981), Smallwood and Conlisk (1979)

# RELATED LITERATURE

## Product Safety:

See Daughety and Reinganum (2011) for an overview.

## Data Breaches:

- Consumer reactions: Kwon and Johnson (2015), Mikhed and Vogan (2015, 2017), Ablon et al. (2016), Greene and Stavins (2017)
- Stock prices: Campbell et al. (2003), Cavusoglu et al. (2004), Acquisti and Grossklags (2005)
- Breach notification: Romanosky et al. (2010)

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Attention should be paid to how indirect measures affect the consumer's willingness to punish → may lower her surplus.

**Thank you.**

Feedback and comments are welcomed at  
[yinglei.toh@gmail.com](mailto:yinglei.toh@gmail.com)