## **Online Advertising and Privacy**

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### Introduction

Online advertising industry: \$100 billion, and growing.

Three main types

- Search advertising (43%)
- Classified advertising (24%)
- Display advertising (33%)

#### Main actors in display advertising

Large publishers (Facebook, Google, etc.)

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Advertising networks, Ad Exchanges

### Introduction

Factors enhancing efficiency of display advertising

- 1. Ability to gather information about users:
  - Cookies
  - IP adress
  - Social network
- 2. Ability to tailor interactions
  - Simultaneous auctions
  - Display different ads to different users

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### Overview of the model



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## **Economic questions**

#### Questions

- When is it profitable for the publisher to disclose consumers' data?
- Do consumers and firms prefer privacy or disclosure?

#### Potential policy implications

- OFT market study (May 2010) "Online Targeting of Advertising and Prices"
- The FTC is contemplating a new online privacy mechanism: "Do not track" button (December 2010)

#### The main tradeoffs

Publisher (see ,e.g., Ganuza (2004))

- Under **Privacy**: symmetric bidders, no rent.
- Under Disclosure: increases dispersion of willingness to pay, positive informational rent.

### The main tradeoffs

#### Advertisers

- Under Privacy: "weak" demand by consumers, low price, zero profit.
- Under Disclosure: "strong" demand, high price, positive profit.

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#### The main tradeoffs

#### Consumers

 Under Privacy: bad match with advertisers, low price of the good.

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• Under **Disclosure**: good match, high price.

### The model

**Players:** 

- One consumer.
- *n* differentiated firms.
- One publisher auctioning **one** slot.

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#### Consumer

The consumer's valuation for product *i* is  $v_i = \begin{cases} 1 \text{ with prob } 1 - q_i \\ \hookrightarrow \mathcal{U}([1, 1 + V]) \text{ with prob } q_i \end{cases}$ 

Ex ante, the  $q_i$ 's are i.i.d uniform on [0; 1].

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 $\mathbf{q} = (q_1, ..., q_n) : interim-type$  $\mathbf{v} = (v_1, ..., v_n): type$  The publisher has information, but cannot infer the  $q_i$ 's. Firms could.

Under **Privacy**, the publisher does not let firms learn the information.

Under **Disclosure**, it lets firms learn the information. Each firm *i* then observes  $q_i \equiv P[v_i > 1]$ .

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# Timing of the game

- 1. The publisher chooses either Disclosure or Privacy.
- 2. Firms choose a price, and a bidding function  $b_i(q_i)$ .
- 3. Under Disclosure, firms learn  $q_i$ .
- 4. The publisher runs a second-price auction, without reserve price.
- 5. The winning firm's advertisement is displayed to the consumer.

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6. The consumer buys one unit if and only if  $p_i \leq v_i$ .

## Firms' pricing decision

#### Suppose that firm *i* faces a consumer of type $q_i$ .

Its gross revenue, if it sets a price  $p_i$ , is

$$p_i P[v_i \ge p_i] = \begin{cases} 1 \text{ if } p_i = 1\\ q_i p_i \left(\frac{1+V-p_i}{V}\right) \text{ if } p_i > 1 \end{cases}$$

The second expression is maximized by setting

$$p_i = \frac{1+V}{2} \equiv p^m$$

and the revenue is

$$q_i \frac{(1+V)^2}{4V} \equiv q_i r^m$$

## Firms' pricing decision

The optimal price is thus

$$p_i(q_i) = \begin{cases} 1 \text{ if } q_i \leq 1/r^m \\ p^m \text{ if } q_i \geq 1/r^m \end{cases}$$

A firm which faces a consumer with a high  $q_i$  wants to charge a high price.

A firm which faces a consumer with a low  $q_i$  wants to charge a low price.

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Assumption:  $r^m \in [1; 2]$ .

## Equilibrium under Privacy

If the publisher opts for Privacy, each firm expects  $q_i = \frac{1}{2}$ .

Since  $r^m \le 2$ , it is optimal for firms to choose  $p_i = 1$ , and  $b_i = 1$ .

The winner of the auction is picked randomly, and the publisher's profit is  $\Pi_{Privacy} = 1$ .

Consumer's surplus is  $CS_{Privacy}(V, n)$ , with  $\frac{\partial CS_{Privacy}}{\partial V} > 0$  and  $\frac{\partial CS_{Privacy}}{\partial n} = 0$ .

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Firms' profit is zero.

## Equilibrium under Disclosure

We look for an equilibrium in which all firms charge the high price  $p^m$  and bid  $b_i(q_i) = q_i r^m$ .

Firms have to choose their price prior to learning  $q_i$ .

So, if a firm wins the auction, the expected value of  $q_i$  is  $E[q_{n:n}]$ .

Firms' expected profit under this strategy profile is

$$\pi = \frac{1}{n} \left( E[q_{n:n}] - E[q_{n-1:n}] \right) r^m = \frac{r^m}{n(n+1)}$$

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## Equilibrium under Disclosure

Is there a profitable deviation by a firm?

The only potential deviation is  $p_i = 1 = b_i(q_i)$ .

This deviation is not profitable if and only if  $(r^m)^n > n + 1$ .

If the condition does not hold, or if  $E[q_{n:n}] < 1/r^m$ , the unique equilibrium is an asymmetric one with:

- One firm playing  $p_j = b_j = 1$  and
- n-1 firms playing  $p_i = p^m$  and  $b_i(q_i) = q_i r^m$ .

## Equilibrium under Disclosure

We focus on the symmetric equilibrium.

The publisher's expected profit is  $\Pi_{Disclosure} = E[q_{n-1:n}]r^m$ .

Consumer's expected surplus is

$$CS_{Disclosure} = E[q_{n:n}] \int_{p^m}^{1+V} x - p^m \frac{dx}{V} = \frac{n}{n+1} \frac{r^m}{2}$$

Under disclosure, consumer's surplus and publisher's profit increase with *n*.

# Publisher: Disclosure or Privacy?



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## Consumers: Disclosure or Privacy?



# Total welfare: Disclosure or Privacy?



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# Summary



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## Extensions (in the paper)

- Partial disclosure
- Customized pricing

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Other media

**Extension: Customized Pricing** 

Firms can charge  $p(q_i)$ .

Two results

- 1. The publisher **always** chooses to disclose information.
- 2. Firms are worse-off than without customized prices.
  - Better surplus extraction power (+)
  - The first and the second highest bids become closer (-)

## Extension: partial disclosure

#### 3 technologies

- 1. Truth or noise
- 2. Symmetric partition
  - In both cases, partial disclosure is never optimal.

3. Pooling at the top: partial revelation optimal.

### **Related literature**

#### Information disclosure

- In auctions: Ganuza (2004), Ganuza and Penalva (2010), Milgrom and Webber (1982).
- In IO: Lewis and Sappington (1994), Johnson and Myatt (2006).

#### Economics of privacy

- ► Taylor (2004), Aquisti and Varian (2005)
- Calzolari and Pavan (2006), Hermalin and Katz (2006)

#### Targeted advertising

- ▶ Iyer, Soberman and Villas-Boas (2005)
- de Cornière (2010)

### Future research

- Mass and niche advertisers
- Competition between publishers
- Costly content
- Not integrated publisher member of an ad network

