# Screening and Adverse Selection in Frictional Markets

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• how does market structure affect contracts terms? estimates of AS?

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# A tractable model of adverse selection, screening and imperfect competition

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- Screening: Uninformed buyers offer general menus of contracts.
- Imperfect Comp: sellers either receive 1 or 2 offers (Burdett-Judd).

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  - Identifying AS requires knowledge of market structure
- Effects of more competition & better info on trade volume, welfare
  - AS severe: welfare  $\bigcap$ -shaped with  $\uparrow$  competition. Otherwise: decreasing.
  - Low comp: welfare  $\bigcap$ -shaped as  $\uparrow$  transparency. Otherwise: decreasing.
  - Competition interacts with IC constraints in non-monotonic fashion.
  - $\bullet$   $\uparrow$  competition/transparency desirable only when AS severe, competition low

### Empirical

• Chiappori-Salanie ('00), Ivashina ('09), Einav et al. ('10,'12), ...

#### Adverse Selection and Screening

- Rothschild-Stiglitz ('76), Dasgupta-Maskin ('86), Rosenthal-Weiss ('84), Bisin-Gottardi ('06), ...
- Mirrlees ('71), Stiglitz ('77), ...
- Guerrieri-Shimer-Wright ('10), Guerrieri-Shimer ('14), Chang ('14)...

#### Imperfect Competition and Selection

- <u>Burdett-Judd</u>: Garrett, Gomes, and Maestri ('14)
- Hotelling: V-B & S-M ('99), Benabou-Tirole ('14), Townsend-Zhorin ('15), Weyl & co-authors...

# Environment

2 buyers, large number of sellers

- Each seller has 1 unit of divisible good
  - Good is of quality  $i \in \{I, h\}$  with probability  $\mu_i$
  - Seller: receives utility c<sub>i</sub> per unit of consumption.
  - Buyer: receives utility  $v_i$  per unit of consumption.

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- If seller gives up x units in exchange for a transfer t, payoffs are
  - Seller:  $t + (1 x)c_i$
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- Assumptions
  - Gains from trade for both types:  $v_h > c_h$  and  $v_l > c_l$
  - 'Lemons' assumption:  $v_l < c_h$
  - Adverse Selection: Only sellers know asset quality

### Screening

- Buyers post arbitrary menus of exclusive contracts
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- Each seller receives 1 offer w/ prob 1 − p & 2 offers w/ prob p
- · From buyer's perspective, conditional on a match,
  - Pr(seller has another offer):  $\pi = \frac{2p}{1-p+2p}$
  - Can vary degree of competition with a single parameter, nesting extremes:
    - $p = \pi = 0$ : monopsony.
    - $p = \pi = 1$ : Bertrand/perfect competition.

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    - $p = \pi = 0$ : monopsony.
    - $p = \pi = 1$ : Bertrand/perfect competition.
  - Note that market is always fully "covered" under this formulation
    - isolate effect of competition. (later: general setting where coverage also varies)

Market for financial securities

- Buyers make offers to sellers (or issuers): price and quantity
- Sellers have private information about value

Loan markets

- Lenders make offers to borrowers: loan size and interest rate
- · Borrowers have private information about default risk

Insurance markets

- Insurers make offers to potential customers: coverage and premium
- (Risk-averse) customers have private info about health/accident/death risk

buyer: offers menu of contracts

• sufficient to consider two contracts  $\mathbf{z} \equiv \{(x_l, t_l), (x_h, t_h)\}$ 

$$(IC_i):$$
  $t_i + c_i(1 - x_i) \ge t_{-i} + c_i(1 - x_{-i})$   $i \in \{I, h\}$ 

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seller: chooses a contract from available menus

- 1 offer (captive seller): chooses  $(x_i, t_i)$  by incentive compatibility
- 2 offers (non-captive seller): chooses  $(x_i, t_i)$  or  $(x'_i, t'_i)$  by

$$\chi_i(\mathbf{z},\mathbf{z}') = \left\{ egin{array}{c} 0 \ rac{1}{2} \ 1 \end{array} 
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ight\} t_i' + c_i(1-x_i').$$

A symmetric equilibrium is a distribution  $\Phi(z)$  such that almost all z satisfy,

1 Incentive compatibility:

$$t_i + c_i(1 - x_i) \ge t_{-i} + c_i(1 - x_{-i})$$
  $i \in \{h, l\}$ 

**2** Seller optimality:

 $\chi_i(\mathbf{z}, \mathbf{z}')$  maximizes her utility

**3** Buyers optimality:

$$\mathbf{z} \in \arg \max_{\mathbf{z}} \sum_{i \in \{l,h\}} \mu_i \left[ 1 - \pi + \pi \int_{\mathbf{z}'} \chi_i(\mathbf{z}, \mathbf{z}') \Phi(d\mathbf{z}') \right] (v_i x_i - t_i) \quad (1)$$

Why ? Suppose a pure strategy equilibrium exists.

- 1 Buyers make strictly positive profits from some type
- **②** Buyers compete for this type with probability  $\pi > 0$

Therefore,

- $\Rightarrow$  Incentives to undercut
- $\Rightarrow$  Equilibrium necessarily features dispersion in menus

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  - Reduces problem to distributions over 2 dimensions

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- 3. Construct SRP equilibrium
- 4. Show that constructed equilibrium is unique

### Result

In all menus offered in equilibrium,

- the low types trades everything:  $x_l = 1$
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Equilibrium menus can be represented by  $(u_h, u_l)$  with corresponding allocations

$$t_{l} = u_{l}$$
  $x_{h} = 1 - \frac{u_{h} - u_{l}}{c_{h} - c_{l}}$   $t_{h} = \frac{u_{l}c_{h} - u_{h}c_{l}}{c_{h} - c_{l}}$ 

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Since we must have  $0 \le x_h \le 1$ ,

$$c_h - c_l \geq u_h - u_l \geq 0$$

We define the marginal distributions:

$$F_{i}(u_{i}) = \int_{\mathbf{z}'} \mathbf{1} \left[ t'_{i} + c_{i} \left( 1 - x'_{i} \right) \leq u_{i} \right] d\Phi \left( \mathbf{z}' \right) \qquad i \in \{h, l\}$$
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Then, each buyer solves

$$\max_{u_{l} \geq c_{l}, u_{h} \geq c_{h}} \Pi(u_{h}, u_{l}) = \max_{u_{l} \geq c_{l}, u_{h} \geq c_{h}} \sum_{i \in \{l, h\}} \mu_{i} \left[ 1 - \pi + \pi F_{i} \left( u_{i} \right) \right] \Pi_{i} \left( u_{h}, u_{l} \right)$$
  
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Need to characterize the two interlinked distributions  $F_l$  and  $F_h$ .

#### Result

 $F_l$  and  $F_h$  have connected support and are continuous.

- Except for a knife-edge case (see paper)
- Proof more involved than standard case because of interdependencies

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The profit function  $\Pi(u_h, u_l)$  is strictly supermodular.

- Intuition:  $u_l \uparrow \Rightarrow \Pi_h \uparrow \Rightarrow$  stronger incentives to attract high types
- $\Rightarrow U_h(u_l) \equiv argmax_{u_h} \Pi(u_h, u_l)$  is weakly increasing

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#### Theorem (Strict Rank Preserving)

 $U_h(u_l)$  is a strictly increasing function.

- Weakly increasing because of super-modularity
- Strictly increasing, not a correspondence because F<sub>1</sub>, F<sub>h</sub> well-behaved

- Useful for characterization:
  - Ranking of equilibrium menus identical across types
  - Menus attract same fraction of both types  $F_l(u_l) = F_h(U_h(u_l))$
  - Greatly simplifies our task: only have to find  $F_l(u_l)$  and  $U_h(u_l)$

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- Implications for outcomes:
  - Terms of trade positively correlated across types
  - Buyers don't specialize, trade with equal frequency across types

# Constructing Equilibria





Perfect comp and "severe adverse selection"  $\Rightarrow$  Pure strategy separating eq.



Perfect comp and "mild adverse selection"  $\Rightarrow$  Mixed Strategy Eq.



Monopsony and "severe adverse selection"  $\Rightarrow$  No Trade with High Type



Monopsony and "mild adverse selection"  $\Rightarrow$  Full Trade



Today:

- Construct equilibrium with  $\mu_h < \bar{\mu}$  explicitly
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Terminology:

- "Separating eqm:" all contracts have  $u_h > u_l$  (i.e.,  $x_h < x_l = 1$ )
- "Pooling eqm:" all contracts have  $u_h = u_l$  (i.e.,  $x_h <= x_l = 1$ )
- "Mixed eqm:" some separating offers, some pooling.

Remember the buyer's problem:

$$\begin{aligned} \Pi(u_h, u_l) &= \max_{u_l \ge c_l, \ u_h \ge c_h} \sum_{i \in \{l, h\}} \mu_i \left[ 1 - \pi + \pi F_i \left( u_i \right) \right] \Pi_i \left( u_h, u_l \right) \\ \text{s. t.} & c_h - c_l \ge u_h - u_l \ge 0 \\ \text{with } \Pi_l \left( u_h, u_l \right) &\equiv v_l x_l - t_l = v_l - u_l \end{aligned}$$

$$\Pi_{h}(u_{h}, u_{l}) \equiv v_{h}x_{h} - t_{h} = v_{h} - u_{h}\frac{v_{h} - c_{l}}{c_{h} - c_{l}} + \frac{u_{l}}{c_{h} - c_{l}}$$

Marginal benefits vs costs of increasing  $u_l$ 

М

$$\underbrace{\mu_{l}\pi f_{l}(u_{l})\Pi_{l}}_{\text{B: more low types trade}} + (1 - \pi + \pi F_{l}(u_{l})) \left[\underbrace{-\mu_{l}}_{MC} + \underbrace{\mu_{h}}_{C_{h} - C_{l}} \underbrace{v_{h} - c_{h}}_{C_{h} - C_{l}}\right] = 0$$

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Boundary condition

$$F_l(c_l) = 0$$
  $F_l(\bar{u}_l) = 1$   $\rightarrow$   $F_l(u_l)$ 

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These conditions are necessary (see paper for sufficiency).



π



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- Full Pooling:  $x_h = 1$  a.e.
- Mix: pool below  $\bar{u}_l$ , separate above





#### Theorem

For every  $(\pi, \mu_h)$  there is a unique equilibrium.

- For the most part, competitive models with Bertrand-type structure
  - Rothschild-Stiglitz, Riley, ...Guerrieri-Shimer-Wright ,...
  - This paper: varying degree of competition
- What about off-path beliefs?
  - A common assumption: buyers have capacity constraints (e.g. GSW)
  - What happens when a contract attracts more than 1 type?
  - Requires a sampling rule ⇒ Beliefs about rules for off-path offers?
  - GSW: off-path, the type who gains the most is chosen
  - This paper: No capacity constraints
    - $\Rightarrow$  Meeting tech + equilibrium offer distribution pins down off-path payoffs
    - $\Rightarrow$  No need to separately specify off-path beliefs.

# IMPLICATIONS

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- Structure of eqm depends on distribution of asset quality  $(\mu_h)$ 
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- Effect of adverse selection on outcomes depends on trading frictions  $(\pi)$

 $\rightarrow\,$  need to know trading frictions to identify info frictions.

Are these policies desirable?

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- Direct interventions
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- Quantity restrictions/mandates
  - E.g. the health insurance mandate

Utilitarian welfare:

$$W = \mu_l v_l + \mu_h [v_h X_h + c_h (1 - X_h)]$$
  
with  $X_h \equiv \int_{\underline{u}_l}^{\overline{u}_l} x_h(u_l) d\hat{F}(u_l)$ 

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Low type always trades fully so key is what happens to  $X_h$ ?

Focus on severe adverse selection ( $\mu_h < \bar{\mu}_h$ ), show all these policies

- Desirable or irrelevant at the extremes, i.e.  $\pi = 0$  or  $\pi = 1$
- But, can be undesirable in the interior, esp. for  $\pi$  high

### Welfare and Competition



### Result

If  $\mu_h < \overline{\mu}_h$ , W maximized at  $\pi \in (0, 1)$ .

#### Implications

• Taxing entry (or otherwise limiting buyer competition) may be desirable

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  - $\Rightarrow\,$  buyers offer more utility to low types, which relaxes their IC constraint
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- 2 All else equal, increasing competition for high types causes:
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Which effect dominates depends on relative profits  $(\Pi_h/\Pi_l)$ .

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Which effect dominates depends on relative profits  $(\Pi_h/\Pi_l)$ .

- First effect dominates when  $\pi$  is small  $(\prod_h/\prod_l \text{ small})$ .
- Second effect dominates when  $\pi$  is large  $(\prod_h/\prod_l \text{ large})$ .  $\bigcirc$  Details

Asset purchases proposed to help markets suffering from adverse selection

• Similar: government option (insurance markets), FAFSA (student loans)

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- **()** Can only  $\uparrow W$  if government overpays for bad assets, loses money
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Our model: neither result true when  $\pi < 1$ .

• Government losing money neither necessary nor sufficient for  $\uparrow W$ 

Policy: Government will purchase any quantity at  $\mathcal{P} \in [c_l, v_l]$ .

Can be mapped into an *exogenous* lower bound for  $u_l$ 



Government option never exercised, so cost to the government = 0.

- **1** Helpful for low  $\pi, \mathcal{P}$ .
- **2** Harmful if  $\pi, \mathcal{P}$  high enough.

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- Can be mapped into a mean-preserving spread of  $\mu_h$
- Need to compare  $\mathbb{E}[W(\mu_h)]$  to  $W(\mathbb{E}[\mu_h])$
- Desirability is about the sign of  $W''(\mu_h)$

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- Desirability is about the sign of  $W''(\mu_h)$

Answer: desirability depends on  $(\pi, \mu_h)$ 

• Note: W is linear when  $\pi = 0$  and  $\pi = 1 \Rightarrow$  no effect on welfare

## Desirability of information



•  $\mu_h < \bar{\mu}_h$  :, W convex (concave) for low (high)  $\pi$ 

 $\Rightarrow$  more info desirable in concentrated markets, undesirable otherwise

μ<sub>h</sub> > μ
<sub>h</sub> :, W is (weakly) concave for all π
 ⇒ more info always undesirable

# ROBUSTNESS, EXTENSIONS, AND CONCLUSION

### 1 Endogenous $\pi$ $\checkmark$ Details

- buyers choose "advertising intensity" at cost  $ightarrow~\pi$
- Taxing this margin desirable when equilibrium  $\pi$  is high
- 2 Constrained efficiency Details
  - A mechanism design approach
  - $\mu_h < \bar{\mu}_h \; \Rightarrow \;$  equilibrium is efficient
- 3 General meeting technologies Details
  - · Methodology extends to many buyers, arbitrary distribution over meetings
  - Welfare effects of competition depend on strength of 'coverage' effect

- 1 Concave preferences: canonical insurance problem
- 2 Different levels of competition across types:  $\pi_l \neq \pi_h$
- 3 More than two types
- Ø Vertical/horizontal differentiation across buyers
- 6 Multi-dimensional heterogeneity across sellers

• Insurance, loans, CDS, ...

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This paper:

- $\textcircled{\ } \textbf{I} Tractable model w/ AS, imperfect comp, sophisticated contracts$
- 2 Many testable implications
- **3** Novel normative implications: different from  $\pi = 1$  case

# EXTRA STUFF

### Intuition

### Theorem



#### Theorem



### Intuition

### Theorem



### Intuition

### Theorem



Insurance markets

• Brown and Goolsbee (2002), Dafny (2010), Cabral et. al. (2014), Einav and Levin (2015)...

Credit markets

• Ausubel (1991), Petersen and Rajan (1994), Calem and Mester (1995), Scharfstein and Sundaram (2013)...

Financial markets

• Barclay et. al. (1999), Weston (2000),...



Einav, Finkelstein, and Levin

"There has been much less progress on [...] models of insurance contracting that incorporate realistic market frictions. One challenge is to develop an appropriate conceptual framework. Even in stylized models of insurance markets with asymmetric information, characterizing competitive equilibrium can be challenging, and the challenge is compounded if one wants to allow for [...] market imperfections."

Or, as Chiappori et al (2006) put it:

"there is a crying need for...models...devoted to the interaction between imperfect competition and adverse selection"

Back to Introduction

# Why is Welfare Hump-Shaped in $\pi$ ?

Because  $x_h$  is hump-shaped in  $\pi$  and  $F_l$  is shifting right.



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  - tightens IC constraint  $\rightarrow x_h \downarrow$

Which dominates? Depends on whether  $U'_h(u_l) \leq 1$ .

- i.e., whether buyers trying to attract more *l* or *h*.
- this depends on relative profits  $\frac{\Pi_h}{\Pi_l}$ ...

## Severe Adverse Selection: Allocations



• Slope of  $U_h$  determined by ratio of profits,  $\Pi_h/\Pi_l$ 





• Slope of  $U_h$  determined by ratio of profits,  $\Pi_h/\Pi_l$ 

- At low  $u_l$ ,  $\Pi_h/\Pi_l$  small, competition stronger for type-*l*,  $U'_h(u_l) < 1$
- At high  $u_l$ ,  $\Pi_h/\Pi_l$  large, competition stronger for type-h,  $U'_h(u_l) > 1$



A communication game between a seller and the buyer(s) she meets

- Buyers offer mechanisms that map seller's 'messages' into an offer (x, t)
  - Deterministic and exclusive but otherwise unrestricted
- Seller sends a message to each buyer
  - Arbitrary message space (quality, contact with other buyer etc.)

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#### Proposition

Any equilibrium of the communication game can be achieved by a menu game.

Proof: See Martimort and Stole (2002).

### Proposition

In any menu, at most 2 contracts are chosen by some seller type in equilibrium.

Proof: If type-*j* seller chooses 2 (or more) contracts in eq., they must yield same utility to seller *AND* same profit to buyer.



## Constrained Efficiency: A mechanism design approach

Types

- Seller: Quality, buyers matched with
- Buyer(s): Set of sellers matched with
- A direct mechanism: a map from reports to allocations, subject to
  - Feasibility: Only matched agents can trade
  - Incentive compatibility: Types reported truthfully
  - Participation: Outside option is equilibrium described earlier
  - Exclusivity: Each seller can trade with at most 1 buyer

### Proposition

If  $\mu < \bar{\mu}_h$ , the equilibrium allocation is constrained efficient.

- Utilities are the same as in equilibrium (allocations might differ)
- Trade volume (or eq., utilitarian welfare) still maximized at interior  $\pi$

Large number of buyers and sellers (measure *b* and *s* resp.)

Meeting technology: described by

- $\lambda(\alpha)$ : Average number of offers sent by buyers
- $P(n, \alpha)$ : Pr(a seller receives *n* offers)
- $Q(n, \alpha)$ : Pr(offer received by seller with n-1 other offers) =  $\frac{nP(n,\alpha)}{\lambda(\alpha)}$
- $\alpha$ : Summarizes 'frictions' in matching

Examples

- Poisson:  $\lambda(\alpha) = \alpha$   $P(n, \alpha) = \frac{e^{-\alpha}\alpha^n}{n!}$
- Geometric:  $\lambda(\alpha) = \frac{\alpha}{1-\alpha}$   $P(n, \alpha) = \alpha^n(1-\alpha)$
- For both, coverage (sellers with at least 1 offer) increases with  $\alpha$

$$\arg \max_{u_l, u_h} \qquad \sum_{i \in \{l, h\}} \mu_i \left[ \sum_{n=1}^{\infty} Q(n) F_i^{n-1}(u_i) \right] \prod_i (u_l, u_h)$$

$$\arg \max_{u_{l}, u_{h}} \sum_{i \in \{l, h\}} \mu_{i} \left[ \sum_{n=1}^{\infty} Q(n) F_{i}^{n-1}(u_{i}) \right] \Pi_{i}(u_{l}, u_{h})$$

$$= \arg \max_{u_{l}, u_{h}} \sum_{i \in \{l, h\}} \mu_{i} \left[ \frac{Q(1)}{\sum_{n'=1}^{\infty} Q(n')} + \sum_{n''=2}^{\infty} \frac{Q(n'')}{\sum_{n'=1}^{\infty} Q(n')} F_{i}^{n''-1}(u_{i}) \right] \Pi_{i}(u_{l}, u_{h})$$

$$\begin{aligned} \arg \max_{u_{l},u_{h}} & \sum_{i \in \{l,h\}} \mu_{i} \left[ \sum_{n=1}^{\infty} Q(n) F_{i}^{n-1}(u_{i}) \right] \Pi_{i}(u_{l}, u_{h}) \\ = \arg \max_{u_{l},u_{h}} & \sum_{i \in \{l,h\}} \mu_{i} \left[ \frac{Q(1)}{\sum_{n'=1}^{\infty} Q(n')} + \sum_{n''=2}^{\infty} \frac{Q(n'')}{\sum_{n'=1}^{\infty} Q(n')} F_{i}^{n''-1}(u_{i}) \right] \Pi_{i}(u_{l}, u_{h}) \\ = \arg \max_{u_{l},u_{h}} & \sum_{i \in \{l,h\}} \mu_{i} \left[ 1 - \tilde{\pi} + \tilde{\pi} G_{i}(u_{i}) \right] \Pi_{i}(u_{l}, u_{h}) \quad \text{where} \quad \tilde{\pi} = 1 - \frac{Q(1)}{\sum_{n=1}^{\infty} Q(n)} \end{aligned}$$

- Characterization from baseline  $\rightarrow G_i(u_i)$  (and therefore,  $F_i$ )
- Shape of  $W(\alpha)$  depends on strength of coverage effect
  - Hump-shaped for Poisson, always increasing for Geometric

#### Back

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## Endogenizing $\pi$

Buyer k also chooses  $\hat{\pi}^k$ : Pr(her offer reaches a seller) subject to cost  $C(\hat{\pi}^k)$ 

$$\max_{\hat{\pi}^{k}, u_{l}^{k}, u_{h}^{k}} \sum_{i \in \{l, h\}} \mu_{i} \left[ \hat{\pi}^{k} \left( 1 - \hat{\pi}^{-k} \right) + \hat{\pi}^{k} \hat{\pi}^{-k} F_{i}^{-k} \left( u_{i}^{k} \right) \right] \Pi_{i} \left( u_{l}^{k}, u_{h}^{k} \right) - C(\hat{\pi}^{k}),$$

Optimality in a symmetric equilibrium

$$C'(\hat{\pi}^*) = \sum_{i \in \{l,h\}} \mu_i \left[ 1 - \hat{\pi}^* + \hat{\pi}^* F_i^{-k} \left( u_i^k \right) \right] \prod_i \left( u_l^k, u_h^k \right).$$
(2)

Implications

- Unique symmetric equilibrium (under regularity conditions on *C*)
- $\hat{\pi}^*$  increasing (decreasing) in  $\mu_h$  when  $\mu_h$  is less (greater) than  $\bar{\mu}_h$
- Welfare: 'taxing' effort (advertising?) can be optimal if  $\hat{\pi}^*$  sufficiently high