

Costly search, information, and competition

Dirk Bergemann
Yale

Benjamin Brooks
Chicago

Stephen Morris
Princeton

Yale University

March 2018

Homogenous good markets and price setting

- ▶ Law of One Price: with more than one seller, firms will compete the price down to cost [Bertrand (1883)]

Homogenous good markets and price setting

- ▶ Law of One Price: with more than one seller, firms will compete the price down to cost [Bertrand (1883)]
- ▶ 40 years ago, Varian wrote: “Economists have belatedly come to recognize that the “law of one price” is no law at all. Most retail markets are instead characterized by a rather large degree of price dispersion. The challenge to economic theory is to describe how such price dispersion can persist in markets where at least some consumers behave in a rational manner.”

40 years on.....

- ▶ Most retail markets *continue* to be characterized by “a rather large degree of price dispersion”, notwithstanding the invention of the internet.....

40 years on.....

- ▶ Most retail markets *continue* to be characterized by “a rather large degree of price dispersion”, notwithstanding the invention of the internet.....
- ▶ Economic theory has (as always!) risen to the challenge.....

40 years on.....

- ▶ Most retail markets *continue* to be characterized by “a rather large degree of price dispersion”, notwithstanding the invention of the internet.....
- ▶ Economic theory has (as always!) risen to the challenge.....
 - ▶ key is lack of common knowledge that consumer can choose between at least two price quotes

40 years on.....

- ▶ Most retail markets *continue* to be characterized by “a rather large degree of price dispersion”, notwithstanding the invention of the internet.....
- ▶ Economic theory has (as always!) risen to the challenge.....
 - ▶ key is lack of common knowledge that consumer can choose between at least two price quotes
 - ▶ this lack of common knowledge naturally arises even with free entry and low costs for the consumers to search, sellers to publicly post prices or information intermediaries to collect, advertise and distribute prices

40 years on.....

- ▶ Most retail markets *continue* to be characterized by “a rather large degree of price dispersion”, notwithstanding the invention of the internet.....
- ▶ Economic theory has (as always!) risen to the challenge.....
 - ▶ key is lack of common knowledge that consumer can choose between at least two price quotes
 - ▶ this lack of common knowledge naturally arises even with free entry and low costs for the consumers to search, sellers to publicly post prices or information intermediaries to collect, advertise and distribute prices
 - ▶ see Stigler (1961), Diamond (1971), Rothschild (1973), Varian (1980), Burdett and Judd (1983), Stahl (1989, 1996), Baye and Morgan (2001) and many many more

But.....

- ▶ This smorgasbord of models makes lots of stylized assumptions I don't know how to observe / what to make of: optimal versus exogenous search, simultaneous versus sequential, consumer vs. search costs, heterogeneity, psychic costs, etc...

But.....

- ▶ This smorgasbord of models makes lots of stylized assumptions I don't know how to observe / what to make of: optimal versus exogenous search, simultaneous versus sequential, consumer vs. search costs, heterogeneity, psychic costs, etc...
- ▶ Although lack of common knowledge is driver, informational assumptions are typically trivialized (e.g., firms assumed to have no information about how many quotes consumers have)

But.....

- ▶ This smorgasbord of models makes lots of stylized assumptions I don't know how to observe / what to make of: optimal versus exogenous search, simultaneous versus sequential, consumer vs. search costs, heterogeneity, psychic costs, etc...
- ▶ Although lack of common knowledge is driver, informational assumptions are typically trivialized (e.g., firms assumed to have no information about how many quotes consumers have)
- ▶ No metric of how much price dispersion we can explain

But.....

- ▶ This smorgasbord of models makes lots of stylized assumptions I don't know how to observe / what to make of: optimal versus exogenous search, simultaneous versus sequential, consumer vs. search costs, heterogeneity, psychic costs, etc...
- ▶ Although lack of common knowledge is driver, informational assumptions are typically trivialized (e.g., firms assumed to have no information about how many quotes consumers have)
- ▶ No metric of how much price dispersion we can explain
- ▶ No results on level of prices (e.g., expected price) and welfare

Our Paper

- ▶ Single consumer with value 1 for a homogenous good observes a number of price quotes from firms with identical marginal cost (normalized to 0) and buys from the firm with the lowest price quote

Our Paper

- ▶ Single consumer with value 1 for a homogenous good observes a number of price quotes from firms with identical marginal cost (normalized to 0) and buys from the firm with the lowest price quote
- ▶ We analyze the relationship between the (stochastic) distribution of number of price quotes (an observable?) and the distribution of prices

Our Paper

- ▶ Single consumer with value 1 for a homogenous good observes a number of price quotes from firms with identical marginal cost (normalized to 0) and buys from the firm with the lowest price quote
- ▶ We analyze the relationship between the (stochastic) distribution of number of price quotes (an observable?) and the distribution of prices
- ▶ Two cases:

Our Paper

- ▶ Single consumer with value 1 for a homogenous good observes a number of price quotes from firms with identical marginal cost (normalized to 0) and buys from the firm with the lowest price quote
- ▶ We analyze the relationship between the (stochastic) distribution of number of price quotes (an observable?) and the distribution of prices
- ▶ Two cases:
 1. Exogenous distribution of the number of price quotes (allowing different information among firms about number of quotes)

Our Paper

- ▶ Single consumer with value 1 for a homogenous good observes a number of price quotes from firms with identical marginal cost (normalized to 0) and buys from the firm with the lowest price quote
- ▶ We analyze the relationship between the (stochastic) distribution of number of price quotes (an observable?) and the distribution of prices
- ▶ Two cases:
 1. Exogenous distribution of the number of price quotes (allowing different information among firms about number of quotes)
 2. Endogenous distribution of price quotes (e.g., simultaneous and sequential search, costly price posting, information intermediaries)

Result 1: Fixed Exogenous Distribution of Number of Price Quotes

1. we show the existence of and characterize the highest (under FOSD) distribution of equilibrium prices (across information structures and equilibria).....

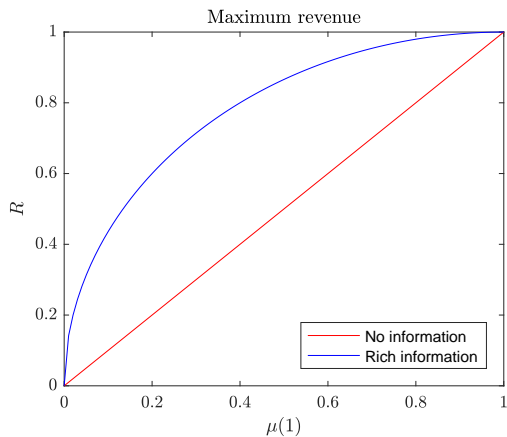
Result 1: Fixed Exogenous Distribution of Number of Price Quotes

1. we show the existence of and characterize the highest (under FOSD) distribution of equilibrium prices (across information structures and equilibria).....
2. if the ex ante probability of a single price quote is μ , the expected price / revenue is at most $\sqrt{\mu(2 - \mu)} > \mu$

Result 1: Fixed Exogenous Distribution of Number of Price Quotes

1. we show the existence of and characterize the highest (under FOSD) distribution of equilibrium prices (across information structures and equilibria).....
2. if the ex ante probability of a single price quote is μ , the expected price / revenue is at most $\sqrt{\mu(2-\mu)} > \mu$
3. we show how to attain all bounds

Maximum Revenue



Result 2: Endogenous Distribution of Number of Endogenous Price Quotes

- ▶ The bounds continue to hold under reasonable models endogenizing the distribution on price quotes:

Result 2: Endogenous Distribution of Number of Endogenous Price Quotes

- ▶ The bounds continue to hold under reasonable models endogenizing the distribution on price quotes:
 1. straightforwardly: under simultaneous price setting with pre-determined information structure (e.g., with ex ante search decisions by consumers, costly price posting and informational intermediary markets)

Result 2: Endogenous Distribution of Number of Endogenous Price Quotes

- ▶ The bounds continue to hold under reasonable models endogenizing the distribution on price quotes:
 1. straightforwardly: under simultaneous price setting with pre-determined information structure (e.g., with ex ante search decisions by consumers, costly price posting and informational intermediary markets)
 2. more subtly: under sequential search by consumers

Talk

1. lengthy example to illustrate our results and prior literature on price dispersion in homogenous goods markets

Talk

1. lengthy example to illustrate our results and prior literature on price dispersion in homogenous goods markets
2. result 1 for exogenous distribution on number of price quotes

Talk

1. lengthy example to illustrate our results and prior literature on price dispersion in homogenous goods markets
2. result 1 for exogenous distribution on number of price quotes
3. briefly:

Talk

1. lengthy example to illustrate our results and prior literature on price dispersion in homogenous goods markets
2. result 1 for exogenous distribution on number of price quotes
3. briefly:
 - 3.1 sketch model for the only subtle case (sequential search) for result 2

Talk

1. lengthy example to illustrate our results and prior literature on price dispersion in homogenous goods markets
2. result 1 for exogenous distribution on number of price quotes
3. briefly:
 - 3.1 sketch model for the only subtle case (sequential search) for result 2
 - 3.2 mention results on asymmetric equilibria/distributions and heterogeneous costs

Talk

1. lengthy example to illustrate our results and prior literature on price dispersion in homogenous goods markets
2. result 1 for exogenous distribution on number of price quotes
3. briefly:
 - 3.1 sketch model for the only subtle case (sequential search) for result 2
 - 3.2 mention results on asymmetric equilibria/distributions and heterogeneous costs
 - 3.3 relation to our prior work on auctions and informational robustness

Example

- ▶ single consumer has value 1 for a single unit of a homogenous good

Example

- ▶ single consumer has value 1 for a single unit of a homogenous good
- ▶ two firms have 0 cost of production

Example

- ▶ single consumer has value 1 for a single unit of a homogenous good
- ▶ two firms have 0 cost of production
- ▶ consumer collects a single (monopoly) quote with probability $\frac{1}{2}$, two (competitive) quotes with probability $\frac{1}{2}$

Example

- ▶ single consumer has value 1 for a single unit of a homogenous good
- ▶ two firms have 0 cost of production
- ▶ consumer collects a single (monopoly) quote with probability $\frac{1}{2}$, two (competitive) quotes with probability $\frac{1}{2}$
- ▶ more precisely, consumer gets quote from firm 1 only with probability $\frac{1}{4}$, firm 2 only with probability $\frac{1}{4}$, and both firms with probability $\frac{1}{4}$.

Full Information

- ▶ if one quote, firm charges monopoly price of 1

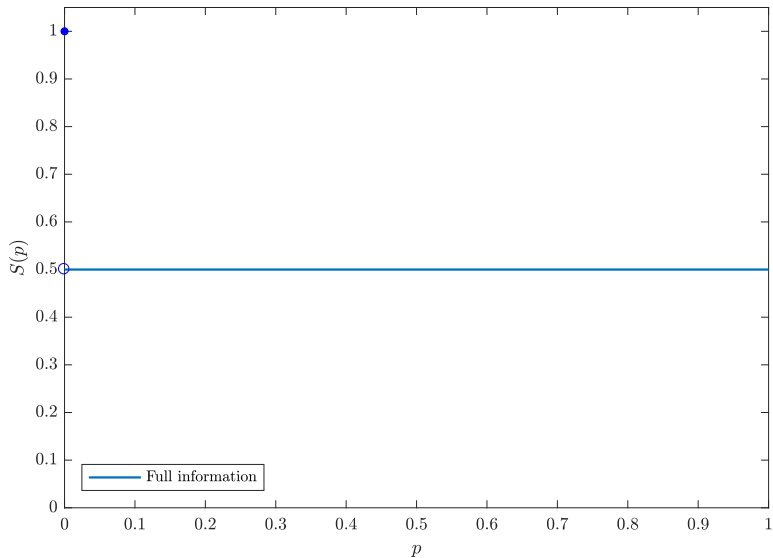
Full Information

- ▶ if one quote, firm charges monopoly price of 1
- ▶ if two quotes, both firms charge competitive price of 0

Full Information

- ▶ if one quote, firm charges monopoly price of 1
- ▶ if two quotes, both firms charge competitive price of 0
- ▶ figure 1 plots the equilibrium price distribution = probability that price is p or higher....

Full Information Price Distribution



No Information

- ▶ a firm assigns probability $\frac{1}{3}$ to being the monopolist

No Information

- ▶ a firm assigns probability $\frac{1}{3}$ to being the monopolist
- ▶ there is a unique symmetric mixed strategy equilibrium where firms randomize over prices on the interval $[\frac{1}{3}, 1]$ and the probability of choosing price p or above is $F(p) = \frac{1-p}{2p}$

No Information

- ▶ a firm assigns probability $\frac{1}{3}$ to being the monopolist
- ▶ there is a unique symmetric mixed strategy equilibrium where firms randomize over prices on the interval $[\frac{1}{3}, 1]$ and the probability of choosing price p or above is $F(p) = \frac{1-p}{2p}$
- ▶ verify: expected profit from quoting price p is

$$\left(\frac{1}{3} + \frac{2}{3}F(p)\right)p = \frac{1}{3}$$

No Information

- ▶ a firm assigns probability $\frac{1}{3}$ to being the monopolist
- ▶ there is a unique symmetric mixed strategy equilibrium where firms randomize over prices on the interval $[\frac{1}{3}, 1]$ and the probability of choosing price p or above is $F(p) = \frac{1-p}{2p}$
- ▶ verify: expected profit from quoting price p is

$$\left(\frac{1}{3} + \frac{2}{3}F(p)\right)p = \frac{1}{3}$$

- ▶ the probability that the sale price is p or higher is then

$$\frac{1}{2} \left(\frac{1-p}{2p}\right) + \frac{1}{2} \left(\frac{1-p}{2p}\right)^2 = \frac{1-p^2}{8p}$$

No Information

- ▶ a firm assigns probability $\frac{1}{3}$ to being the monopolist
- ▶ there is a unique symmetric mixed strategy equilibrium where firms randomize over prices on the interval $[\frac{1}{3}, 1]$ and the probability of choosing price p or above is $F(p) = \frac{1-p}{2p}$
- ▶ verify: expected profit from quoting price p is

$$\left(\frac{1}{3} + \frac{2}{3}F(p)\right)p = \frac{1}{3}$$

- ▶ the probability that the sale price is p or higher is then

$$\frac{1}{2} \left(\frac{1-p}{2p}\right) + \frac{1}{2} \left(\frac{1-p}{2p}\right)^2 = \frac{1-p^2}{8p}$$

- ▶ see figure....

No Information

- ▶ a firm assigns probability $\frac{1}{3}$ to being the monopolist
- ▶ there is a unique symmetric mixed strategy equilibrium where firms randomize over prices on the interval $[\frac{1}{3}, 1]$ and the probability of choosing price p or above is $F(p) = \frac{1-p}{2p}$
- ▶ verify: expected profit from quoting price p is

$$\left(\frac{1}{3} + \frac{2}{3}F(p)\right)p = \frac{1}{3}$$

- ▶ the probability that the sale price is p or higher is then

$$\frac{1}{2} \left(\frac{1-p}{2p}\right) + \frac{1}{2} \left(\frac{1-p}{2p}\right)^2 = \frac{1-p^2}{8p}$$

- ▶ see figure....
- ▶ note that because firms always indifferent to charging monopoly price, expected price = industry revenue = $\frac{1}{2}$, as in no information case

No Information

- ▶ a firm assigns probability $\frac{1}{3}$ to being the monopolist
- ▶ there is a unique symmetric mixed strategy equilibrium where firms randomize over prices on the interval $[\frac{1}{3}, 1]$ and the probability of choosing price p or above is $F(p) = \frac{1-p}{2p}$
- ▶ verify: expected profit from quoting price p is

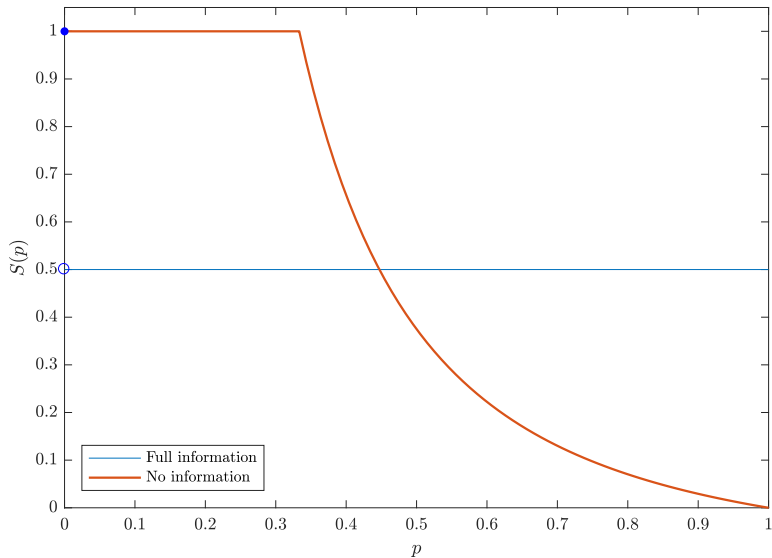
$$\left(\frac{1}{3} + \frac{2}{3}F(p)\right)p = \frac{1}{3}$$

- ▶ the probability that the sale price is p or higher is then

$$\frac{1}{2} \left(\frac{1-p}{2p}\right) + \frac{1}{2} \left(\frac{1-p}{2p}\right)^2 = \frac{1-p^2}{8p}$$

- ▶ see figure....
- ▶ note that because firms always indifferent to charging monopoly price, expected price = industry revenue = $\frac{1}{2}$, as in no information case
- ▶ this will be a general result about the no information case

No Information Price Distribution



Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then

Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then
 - ▶ with probability α , firm 1 only is told

Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then
 - ▶ with probability α , firm 1 only is told
 - ▶ with probability α , firm 2 only is told

Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then
 - ▶ with probability α , firm 1 only is told
 - ▶ with probability α , firm 2 only is told
 - ▶ with probability $1 - 2\alpha$, both firms are told

Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then
 - ▶ with probability α , firm 1 only is told
 - ▶ with probability α , firm 2 only is told
 - ▶ with probability $1 - 2\alpha$, both firms are told
- ▶ if

$$\frac{1}{2\alpha} \geq \frac{\alpha}{1 - 2\alpha} \quad (1)$$

there is an equilibrium where uninformed firms charge price 1 and informed firms follow mixed strategy $F(p) = \frac{\alpha}{1-2\alpha} \frac{1-p}{p}$ with support $\left[\frac{\alpha}{1-\alpha}, 1\right]$.

Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then
 - ▶ with probability α , firm 1 only is told
 - ▶ with probability α , firm 2 only is told
 - ▶ with probability $1 - 2\alpha$, both firms are told
- ▶ if

$$\frac{1}{2\alpha} \geq \frac{\alpha}{1 - 2\alpha} \quad (1)$$

there is an equilibrium where uninformed firms charge price 1 and informed firms follow mixed strategy $F(p) = \frac{\alpha}{1-2\alpha} \frac{1-p}{p}$

with support $\left[\frac{\alpha}{1-\alpha}, 1 \right]$.

- ▶ verify:

Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then
 - ▶ with probability α , firm 1 only is told
 - ▶ with probability α , firm 2 only is told
 - ▶ with probability $1 - 2\alpha$, both firms are told
- ▶ if

$$\frac{1}{2\alpha} \geq \frac{\alpha}{1 - 2\alpha} \quad (1)$$

there is an equilibrium where uninformed firms charge price 1 and informed firms follow mixed strategy $F(p) = \frac{\alpha}{1-2\alpha} \frac{1-p}{p}$

with support $\left[\frac{\alpha}{1-\alpha}, 1 \right]$.

- ▶ verify:
 - ▶ informed firms payoff to charging price p is

$$\left(\frac{\alpha}{1-\alpha} + \frac{1-2\alpha}{1-\alpha} F(p) \right) p = \frac{\alpha}{1-\alpha}$$

Partially Informed Firms

- ▶ consider one special information structure: if market is competitive, then
 - ▶ with probability α , firm 1 only is told
 - ▶ with probability α , firm 2 only is told
 - ▶ with probability $1 - 2\alpha$, both firms are told
- ▶ if

$$\frac{1}{2\alpha} \geq \frac{\alpha}{1 - 2\alpha} \quad (1)$$

there is an equilibrium where uninformed firms charge price 1 and informed firms follow mixed strategy $F(p) = \frac{\alpha}{1-2\alpha} \frac{1-p}{p}$

with support $\left[\frac{\alpha}{1-\alpha}, 1 \right]$.

- ▶ verify:
 - ▶ informed firms payoff to charging price p is

$$\left(\frac{\alpha}{1-\alpha} + \frac{1-2\alpha}{1-\alpha} F(p) \right) p = \frac{\alpha}{1-\alpha}$$

- ▶ condition (1) ensures that uninformed attaches a higher probability to facing monopoly price than uninformed firm

Partially Informed Firms

- ▶ highest prices (across all information structures and equilibria) arise in this equilibrium where (1) holds with equality and

$$\alpha = \frac{1}{2} (\sqrt{3} - 1)$$

Partially Informed Firms

- ▶ highest prices (across all information structures and equilibria) arise in this equilibrium where (1) holds with equality and

$$\alpha = \frac{1}{2} (\sqrt{3} - 1)$$

- ▶ expected price = industry revenue =

$$\frac{1}{2} \sqrt{3}$$

Partially Informed Firms

- ▶ highest prices (across all information structures and equilibria) arise in this equilibrium where (1) holds with equality and

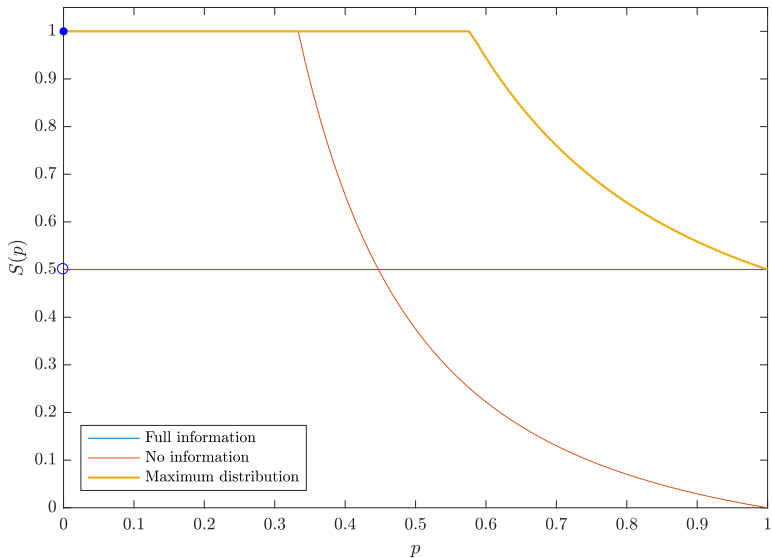
$$\alpha = \frac{1}{2} (\sqrt{3} - 1)$$

- ▶ expected price = industry revenue =

$$\frac{1}{2} \sqrt{3}$$

- ▶ result 1: analogous result for general distributions over number of quotes

Price Distributions



Endogenizing the Number of Quotes 1: Simultaneous Search

- ▶ All consumers observe at least one price quote

Endogenizing the Number of Quotes 1: Simultaneous Search

- ▶ All consumers observe at least one price quote
- ▶ At a cost/benefit c , they may decide (ex ante) to observe an additional price quote

Endogenizing the Number of Quotes 1: Simultaneous Search

- ▶ All consumers observe at least one price quote
- ▶ At a cost/benefit c , they may decide (ex ante) to observe an additional price quote
- ▶ There may be a distribution of c in the population

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population
 - ▶ there is a unique equilibrium where no one gets a second quote ($\mu = 1$) and the monopoly price is charged

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population
 - ▶ there is a unique equilibrium where no one gets a second quote ($\mu = 1$) and the monopoly price is charged
2. like Varian (1980): $c = \infty$ for proportion $\frac{1}{2}$ and $c \leq 0$ for proportion $\frac{1}{2}$ (“shoppers”)

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population
 - ▶ there is a unique equilibrium where no one gets a second quote ($\mu = 1$) and the monopoly price is charged
2. like Varian (1980): $c = \infty$ for proportion $\frac{1}{2}$ and $c \leq 0$ for proportion $\frac{1}{2}$ (“shoppers”)
 - ▶ our (no information) equilibrium is played

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population
 - ▶ there is a unique equilibrium where no one gets a second quote ($\mu = 1$) and the monopoly price is charged
2. like Varian (1980): $c = \infty$ for proportion $\frac{1}{2}$ and $c \leq 0$ for proportion $\frac{1}{2}$ (“shoppers”)
 - ▶ our (no information) equilibrium is played
3. more generally: full support density on c with prob. $c \geq \frac{1}{2} (\ln 3 - 1)$ equal to $\frac{1}{2}$

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population
 - ▶ there is a unique equilibrium where no one gets a second quote ($\mu = 1$) and the monopoly price is charged
2. like Varian (1980): $c = \infty$ for proportion $\frac{1}{2}$ and $c \leq 0$ for proportion $\frac{1}{2}$ (“shoppers”)
 - ▶ our (no information) equilibrium is played
3. more generally: full support density on c with prob.
 $c \geq \frac{1}{2} (\ln 3 - 1)$ equal to $\frac{1}{2}$
 - ▶ equilibrium where consumers by second quote only if $c \geq \frac{1}{2} (\ln 3 - 1) \approx 0.05$

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population
 - ▶ there is a unique equilibrium where no one gets a second quote ($\mu = 1$) and the monopoly price is charged
2. like Varian (1980): $c = \infty$ for proportion $\frac{1}{2}$ and $c \leq 0$ for proportion $\frac{1}{2}$ (“shoppers”)
 - ▶ our (no information) equilibrium is played
3. more generally: full support density on c with prob.
 $c \geq \frac{1}{2} (\ln 3 - 1)$ equal to $\frac{1}{2}$
 - ▶ equilibrium where consumers by second quote only if $c \geq \frac{1}{2} (\ln 3 - 1) \approx 0.05$
 - ▶ verify: expected price from two quotes is $\frac{1}{2}$; expected price from one quote is $\frac{1}{2} \ln 3 \approx 0.55$.

Three Cases

1. like Diamond (1971): same strictly positive cost for everyone in the population
 - ▶ there is a unique equilibrium where no one gets a second quote ($\mu = 1$) and the monopoly price is charged
 2. like Varian (1980): $c = \infty$ for proportion $\frac{1}{2}$ and $c \leq 0$ for proportion $\frac{1}{2}$ (“shoppers”)
 - ▶ our (no information) equilibrium is played
 3. more generally: full support density on c with prob.
 $c \geq \frac{1}{2} (\ln 3 - 1)$ equal to $\frac{1}{2}$
 - ▶ equilibrium where consumers by second quote only if $c \geq \frac{1}{2} (\ln 3 - 1) \approx 0.05$
 - ▶ verify: expected price from two quotes is $\frac{1}{2}$; expected price from one quote is $\frac{1}{2} \ln 3 \approx 0.55$.
- ▶ In each case, endogeneity of μ does not change pricing

Endogenizing the Number of Quotes 2: Posting Prices

- ▶ firm pays cost $\frac{1}{2} \left(1 - \frac{1}{\sqrt{2}}\right)$ to have price advertised on public site

Endogenizing the Number of Quotes 2: Posting Prices

- ▶ firm pays cost $\frac{1}{2} \left(1 - \frac{1}{\sqrt{2}}\right)$ to have price advertised on public site
- ▶ consumer buys at lowest posted price; if no price posted, he is randomly assigned to a firm

Endogenizing the Number of Quotes 2: Posting Prices

- ▶ firm pays cost $\frac{1}{2} \left(1 - \frac{1}{\sqrt{2}}\right)$ to have price advertised on public site
- ▶ consumer buys at lowest posted price; if no price posted, he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where

Endogenizing the Number of Quotes 2: Posting Prices

- ▶ firm pays cost $\frac{1}{2} \left(1 - \frac{1}{\sqrt{2}}\right)$ to have price advertised on public site
- ▶ consumer buys at lowest posted price; if no price posted, he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms advertise with probability $\frac{1}{\sqrt{2}}$;

Endogenizing the Number of Quotes 2: Posting Prices

- ▶ firm pays cost $\frac{1}{2} \left(1 - \frac{1}{\sqrt{2}}\right)$ to have price advertised on public site
- ▶ consumer buys at lowest posted price; if no price posted, he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms advertise with probability $\frac{1}{\sqrt{2}}$;
 - ▶ advertising firms follow a symmetric mixed strategy $F(p) = (\sqrt{2} - 1) \frac{1-p}{p}$ with support $\left[\frac{\sqrt{2}-1}{\sqrt{2}}, 1\right]$

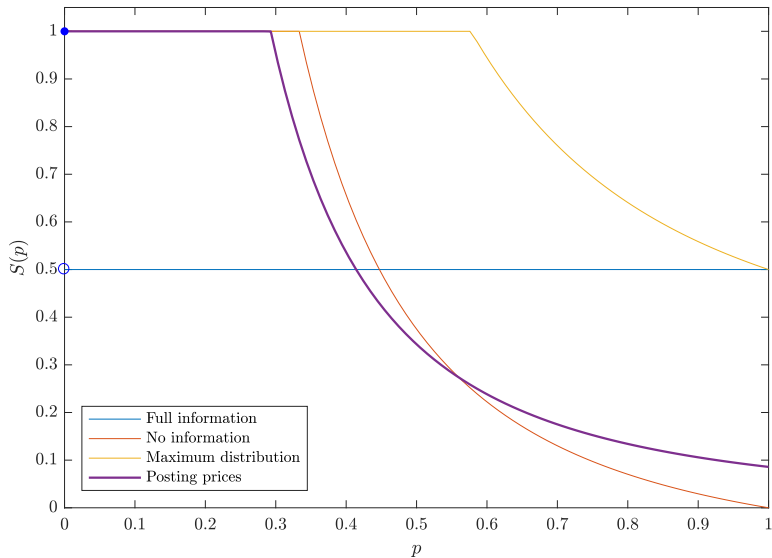
Endogenizing the Number of Quotes 2: Posting Prices

- ▶ firm pays cost $\frac{1}{2} \left(1 - \frac{1}{\sqrt{2}}\right)$ to have price advertised on public site
- ▶ consumer buys at lowest posted price; if no price posted, he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms advertise with probability $\frac{1}{\sqrt{2}}$;
 - ▶ advertising firms follow a symmetric mixed strategy $F(p) = (\sqrt{2} - 1) \frac{1-p}{p}$ with support $\left[\frac{\sqrt{2}-1}{\sqrt{2}}, 1\right]$
 - ▶ non-advertising firms charge the monopoly price.

Endogenizing the Number of Quotes 2: Posting Prices

- ▶ firm pays cost $\frac{1}{2} \left(1 - \frac{1}{\sqrt{2}}\right)$ to have price advertised on public site
- ▶ consumer buys at lowest posted price; if no price posted, he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms advertise with probability $\frac{1}{\sqrt{2}}$;
 - ▶ advertising firms follow a symmetric mixed strategy $F(p) = (\sqrt{2} - 1) \frac{1-p}{p}$ with support $\left[\frac{\sqrt{2}-1}{\sqrt{2}}, 1\right]$
 - ▶ non-advertising firms charge the monopoly price.
- ▶ see plot....

Price Distributions



Endogenizing the Number of Quotes 3: Information Intermediaries

- ▶ like Baye and Morgan (2001), information intermediary charges firms pays a advertising fee $c > 0$ to have prices advertised on his site; consumer pays an access fee $\kappa \geq 0$ to observe

Endogenizing the Number of Quotes 3: Information Intermediaries

- ▶ like Baye and Morgan (2001), information intermediary charges firms pays a advertising fee $c > 0$ to have prices advertised on his site; consumer pays an access fee $\kappa \geq 0$ to observe
- ▶ if consumer accesses site, he buys at lowest price; if he does not access or if no price is posted, and he is randomly assigned to a firm

Endogenizing the Number of Quotes 3: Information Intermediaries

- ▶ like Baye and Morgan (2001), information intermediary charges firms pays a advertising fee $c > 0$ to have prices advertised on his site; consumer pays an access fee $\kappa \geq 0$ to observe
- ▶ if consumer accesses site, he buys at lowest price; if he does not access or if no price is posted, and he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where

Endogenizing the Number of Quotes 3: Information Intermediaries

- ▶ like Baye and Morgan (2001), information intermediary charges firms pays a advertising fee $c > 0$ to have prices advertised on his site; consumer pays an access fee $\kappa \geq 0$ to observe
- ▶ if consumer accesses site, he buys at lowest price; if he does not access or if no price is posted, and he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms are charged a fee $\frac{1}{2}$ and consumer is charged $\frac{1}{3}$;

Endogenizing the Number of Quotes 3: Information Intermediaries

- ▶ like Baye and Morgan (2001), information intermediary charges firms pays a advertising fee $c > 0$ to have prices advertised on his site; consumer pays an access fee $\kappa \geq 0$ to observe
- ▶ if consumer accesses site, he buys at lowest price; if he does not access or if no price is posted, and he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms are charged a fee $\frac{1}{2}$ and consumer is charged $\frac{1}{3}$;
 - ▶ firms randomize 50/50 between advertising and not advertising; so prob $\frac{1}{4}$ of two quotes

Endogenizing the Number of Quotes 3: Information Intermediaries

- ▶ like Baye and Morgan (2001), information intermediary charges firms pays a advertising fee $c > 0$ to have prices advertised on his site; consumer pays an access fee $\kappa \geq 0$ to observe
- ▶ if consumer accesses site, he buys at lowest price; if he does not access or if no price is posted, and he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms are charged a fee $\frac{1}{2}$ and consumer is charged $\frac{1}{3}$;
 - ▶ firms randomize 50/50 between advertising and not advertising; so prob $\frac{1}{4}$ of two quotes
 - ▶ advertising firms follow a symmetric mixed strategy
$$F(p) = \frac{1-p}{p}$$

Endogenizing the Number of Quotes 3: Information Intermediaries

- ▶ like Baye and Morgan (2001), information intermediary charges firms pays a advertising fee $c > 0$ to have prices advertised on his site; consumer pays an access fee $\kappa \geq 0$ to observe
- ▶ if consumer accesses site, he buys at lowest price; if he does not access or if no price is posted, and he is randomly assigned to a firm
- ▶ there will be symmetric equilibrium where
 - ▶ firms are charged a fee $\frac{1}{2}$ and consumer is charged $\frac{1}{3}$;
 - ▶ firms randomize 50/50 between advertising and not advertising; so prob $\frac{1}{4}$ of two quotes
 - ▶ advertising firms follow a symmetric mixed strategy $F(p) = \frac{1-p}{p}$
 - ▶ non-advertising firms charge the monopoly price.

Endogenizing the Number of Quotes 4: Sequential Search

- ▶ like Stahl (1989), proportion $\frac{1}{2}$ of consumers observe one quote and can then choose (after observing the price) to pay $c > 0$ to get a second price; proportion $\frac{1}{2}$ of consumers (“shoppers”) will always get two price quotes

Endogenizing the Number of Quotes 4: Sequential Search

- ▶ like Stahl (1989), proportion $\frac{1}{2}$ of consumers observe one quote and can then choose (after observing the price) to pay $c > 0$ to get a second price; proportion $\frac{1}{2}$ of consumers (“shoppers”) will always get two price quotes
- ▶ In equilibrium:

Endogenizing the Number of Quotes 4: Sequential Search

- ▶ like Stahl (1989), proportion $\frac{1}{2}$ of consumers observe one quote and can then choose (after observing the price) to pay $c > 0$ to get a second price; proportion $\frac{1}{2}$ of consumers (“shoppers”) will always get two price quotes
- ▶ In equilibrium:
 - ▶ non-shoppers only get one quote;

Endogenizing the Number of Quotes 4: Sequential Search

- ▶ like Stahl (1989), proportion $\frac{1}{2}$ of consumers observe one quote and can then choose (after observing the price) to pay $c > 0$ to get a second price; proportion $\frac{1}{2}$ of consumers (“shoppers”) will always get two price quotes
- ▶ In equilibrium:
 - ▶ non-shoppers only get one quote;
 - ▶ firms follow mixed strategy $F(p) = \frac{r-p}{2p}$ with support $[\frac{r}{3}, r]$ where $r = \frac{c}{1 - \frac{1}{2} \ln 3}$

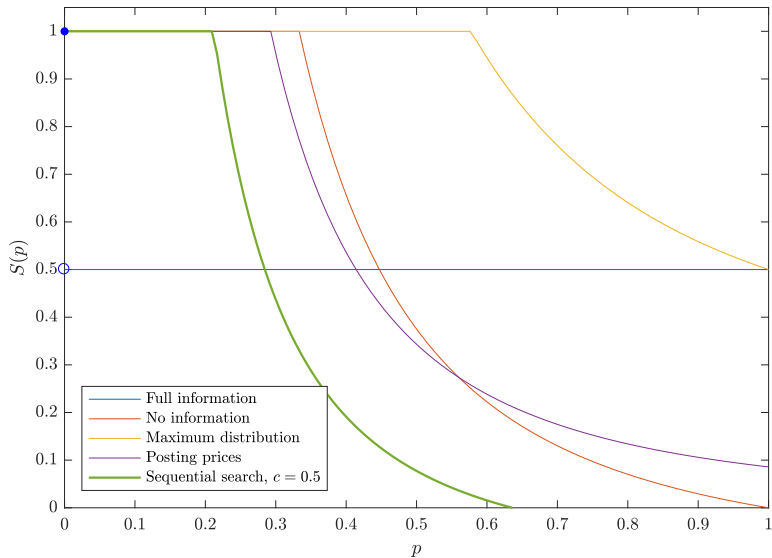
Endogenizing the Number of Quotes 4: Sequential Search

- ▶ like Stahl (1989), proportion $\frac{1}{2}$ of consumers observe one quote and can then choose (after observing the price) to pay $c > 0$ to get a second price; proportion $\frac{1}{2}$ of consumers (“shoppers”) will always get two price quotes
- ▶ In equilibrium:
 - ▶ non-shoppers only get one quote;
 - ▶ firms follow mixed strategy $F(p) = \frac{r-p}{2p}$ with support $[\frac{r}{3}, r]$ where $r = \frac{c}{1 - \frac{1}{2} \ln 3}$
- ▶ Verify: expected price in second search is $\frac{1}{2} r \ln 3$, so gain from search is $r(1 - \frac{1}{2} \ln 3)$

Endogenizing the Number of Quotes 4: Sequential Search

- ▶ like Stahl (1989), proportion $\frac{1}{2}$ of consumers observe one quote and can then choose (after observing the price) to pay $c > 0$ to get a second price; proportion $\frac{1}{2}$ of consumers (“shoppers”) will always get two price quotes
- ▶ In equilibrium:
 - ▶ non-shoppers only get one quote;
 - ▶ firms follow mixed strategy $F(p) = \frac{r-p}{2p}$ with support $[\frac{r}{3}, r]$ where $r = \frac{c}{1 - \frac{1}{2} \ln 3}$
- ▶ Verify: expected price in second search is $\frac{1}{2} r \ln 3$, so gain from search is $r(1 - \frac{1}{2} \ln 3)$
- ▶ see plot for $c = \frac{1}{2}$ and so $r \approx 0.74$

Price Distribution



Fundamentals

- ▶ One representative consumer

Fundamentals

- ▶ One representative consumer
- ▶ N firms, indexed by $k \in \mathcal{N} = \{1, \dots, N\}$

Fundamentals

- ▶ One representative consumer
- ▶ N firms, indexed by $k \in \mathcal{N} = \{1, \dots, N\}$
- ▶ Firms produce a perfectly homogenous good

Fundamentals

- ▶ One representative consumer
- ▶ N firms, indexed by $k \in \mathcal{N} = \{1, \dots, N\}$
- ▶ Firms produce a perfectly homogenous good
- ▶ Consumer demands a single unit, willingness to pay 1

Fundamentals

- ▶ One representative consumer
- ▶ N firms, indexed by $k \in \mathcal{N} = \{1, \dots, N\}$
- ▶ Firms produce a perfectly homogenous good
- ▶ Consumer demands a single unit, willingness to pay 1
- ▶ Common production cost normalized to 0

Timing

- ▶ Consumer observes n prices

Timing

- ▶ Consumer observes n prices
- ▶ Distribution of number of price quotes $\mu \in \Delta(\{1, \dots, N\})$

Timing

- ▶ Consumer observes n prices
- ▶ Distribution of number of price quotes $\mu \in \Delta(\{1, \dots, N\})$
- ▶ Randomly drawn set of firms is \tilde{N}

Timing

- ▶ Consumer observes n prices
- ▶ Distribution of number of price quotes $\mu \in \Delta(\{1, \dots, N\})$
- ▶ Randomly drawn set of firms is \tilde{N}
- ▶ Firms $k \in \tilde{N}$ quote prices p_k

Timing

- ▶ Consumer observes n prices
- ▶ Distribution of number of price quotes $\mu \in \Delta(\{1, \dots, N\})$
- ▶ Randomly drawn set of firms is \tilde{N}
- ▶ Firms $k \in \tilde{N}$ quote prices p_k
- ▶ Consumer buys from a firm with lowest price

$$p^* = \min_{k \in \tilde{N}} p_k$$

(Break ties uniformly)

Information & firms' strategies

- ▶ We assume firm k gets a *signal* $s_k \in S$

Information & firms' strategies

- ▶ We assume firm k gets a *signal* $s_k \in S$
- ▶ Distribution of $s_{\tilde{N}} = (s_k)_{k \in \tilde{N}}$ is given by $\pi(s_{\tilde{N}}|n)$

Information & firms' strategies

- ▶ We assume firm k gets a *signal* $s_k \in S$
- ▶ Distribution of $s_{\tilde{N}} = (s_k)_{k \in \tilde{N}}$ is given by $\pi(s_{\tilde{N}}|n)$
- ▶ For now, assume *symmetry*: distribution depends on the number of the firms, but not their identities

Strategies and Equilibrium

- ▶ Conditional on observing signal s_k , firm k sets prices according to

$$F(p|s_k) = \text{probability that } p_k \geq p$$

Strategies and Equilibrium

- ▶ Conditional on observing signal s_k , firm k sets prices according to

$$F(p|s_k) = \text{probability that } p_k \geq p$$

- ▶ NB an upper cumulative distribution

Strategies and Equilibrium

- ▶ Conditional on observing signal s_k , firm k sets prices according to

$$F(p|s_k) = \text{probability that } p_k \geq p$$

- ▶ NB an upper cumulative distribution
- ▶ NB assuming firms use symmetric strategies

Strategies and Equilibrium

- ▶ Conditional on observing signal s_k , firm k sets prices according to

$$F(p|s_k) = \text{probability that } p_k \geq p$$

- ▶ NB an upper cumulative distribution
- ▶ NB assuming firms use symmetric strategies
- ▶ Firms want to maximize price times probability of sale

Strategies and Equilibrium

- ▶ Conditional on observing signal s_k , firm k sets prices according to

$$F(p|s_k) = \text{probability that } p_k \geq p$$

- ▶ NB an upper cumulative distribution
- ▶ NB assuming firms use symmetric strategies
- ▶ Firms want to maximize price times probability of sale
- ▶ F is an *equilibrium* if for all k and F'_k ,

$$R_k(\sigma, F) \geq R_k(\sigma, F'_k, F_{-k})$$

Sale price distribution

- ▶ For a strategy F , let $S(p|n)$ denote the probability the sale price is at least p , conditional on n firms quoted:

$$S(p|n) = \int_{s \in S^n} \times_k F(p|s_k) \pi(ds|n)$$

Sale price distribution

- ▶ For a strategy F , let $S(p|n)$ denote the probability the sale price is at least p , conditional on n firms quoted:

$$S(p|n) = \int_{s \in S^n} \times_k F(p|s_k) \pi(ds|n)$$

- ▶ Also let

$$S(p) = \sum_{n=1}^N \mu(n) S(p|n)$$

denote the ex ante distribution of the sale price

A constraint on sales

Theorem

In any equilibrium,

$$p \sum_{n=1}^N \mu(n) n S(p|n) \leq \int_{x=p}^{\infty} x S(dx).$$

A constraint on sales

Theorem

In any equilibrium,

$$p \sum_{n=1}^N \mu(n) n S(p|n) \leq \int_{x=p}^{\infty} x S(dx).$$

- ▶ This inequality will drive the rest of the analysis

A constraint on sales

Theorem

In any equilibrium,

$$p \sum_{n=1}^N \mu(n) n S(p|n) \leq \int_{x=p}^{\infty} x S(dx).$$

- ▶ This inequality will drive the rest of the analysis
- ▶ Will give a proof sketch

Equilibrium surplus

- ▶ The $S(p|n)$ are rich enough objects to compute the equilibrium revenue of a representative firm

Equilibrium surplus

- ▶ The $S(p|n)$ are rich enough objects to compute the equilibrium revenue of a representative firm
- ▶ Since the model is symmetric, when n firms are active, there is an n/N chance that firm k is active

Equilibrium surplus

- ▶ The $S(p|n)$ are rich enough objects to compute the equilibrium revenue of a representative firm
- ▶ Since the model is symmetric, when n firms are active, there is an n/N chance that firm k is active
- ▶ Conditional on being active, there is a $1/n$ chance that firm k has the lowest price

Equilibrium surplus

- ▶ The $S(p|n)$ are rich enough objects to compute the equilibrium revenue of a representative firm
- ▶ Since the model is symmetric, when n firms are active, there is an n/N chance that firm k is active
- ▶ Conditional on being active, there is a $1/n$ chance that firm k has the lowest price
- ▶ Hence, equilibrium surplus must be

$$\frac{1}{N} \sum_{n=1}^N \mu(n) \int_{x=0}^1 x S(dx|n)$$

A class of deviations

- ▶ Now suppose firm k *uniform deviation down to p* : Whenever you would set a price $p_k \geq p$, set a price of p instead

A class of deviations

- ▶ Now suppose firm k *uniform deviation down to p* : Whenever you would set a price $p_k \geq p$, set a price of p instead
- ▶ Claim: deviator's surplus is:

$$\frac{1}{N} \sum_{n=1}^N \mu(n) \left[\int_{x=0}^p xS(dx|n) + npS(p|n) \right]$$

A class of deviations

- ▶ Now suppose firm k *uniform deviation down to p* : Whenever you would set a price $p_k \geq p$, set a price of p instead
- ▶ Claim: deviator's surplus is:

$$\frac{1}{N} \sum_{n=1}^N \mu(n) \left[\int_{x=0}^p xS(dx|n) + npS(p|n) \right]$$

- ▶ Deviator wins at a price p whenever he is active and the equilibrium sale price would have been above p
Happens with probability $\mu(n)(n/N)S(p|n)$

A class of deviations

- ▶ Now suppose firm k *uniform deviation down to p* : Whenever you would set a price $p_k \geq p$, set a price of p instead
- ▶ Claim: deviator's surplus is:

$$\frac{1}{N} \sum_{n=1}^N \mu(n) \left[\int_{x=0}^p xS(dx|n) + npS(p|n) \right]$$

- ▶ Deviator wins at a price p whenever he is active and the equilibrium sale price would have been above p
Happens with probability $\mu(n)(n/N)S(p|n)$
- ▶ On the other hand, if the the equilibrium sale price is $x < p$, then the outcome is the same as it would have been in equilibrium (since firm k 's price is unchanged as well)

Conclusion of proof

- ▶ A necessary condition for equilibrium is that firms wouldn't want to uniformly deviate down, i.e.,

$$\frac{1}{N} \sum_{n=1}^N \mu(n) \int_{x=0}^v xS(dx|n) \geq \frac{1}{N} \sum_{n=1}^N \mu(n) \left[\int_{x=0}^p xS(dx|n) + npS(p|n) \right]$$

Conclusion of proof

- ▶ A necessary condition for equilibrium is that firms wouldn't want to uniformly deviate down, i.e.,

$$\frac{1}{N} \sum_{n=1}^N \mu(n) \int_{x=0}^v xS(dx|n) \geq \frac{1}{N} \sum_{n=1}^N \mu(n) \left[\int_{x=0}^p xS(dx|n) + npS(p|n) \right]$$

- ▶ Rearranging yields our result

No information warm up

- ▶ Suppose that $|S| = 1$, so firms get no information about consumers

No information warm up

- ▶ Suppose that $|S| = 1$, so firms get no information about consumers
- ▶ Then $F(p|s) = F(p)$, and $S(p|n) = (F(p))^n$

No information warm up

- ▶ Suppose that $|S| = 1$, so firms get no information about consumers
- ▶ Then $F(p|s) = F(p)$, and $S(p|n) = (F(p))^n$
- ▶ Our inequality reduces to

$$p \sum_{n=1}^N \mu(n)(n-1)(F(p))^n \leq \sum_{n=1}^N \mu(n) \int_{x=p}^1 (F(x))^n dx$$

An upper bound on prices under no information

Proposition

There exists a highest price distribution \bar{F} that satisfies the uniform downward incentive constraints under no information. This distribution satisfies all of the constraints as equalities wherever $\bar{F}(p) < 1$.

An upper bound on prices under no information

Proposition

There exists a highest price distribution \bar{F} that satisfies the uniform downward incentive constraints under no information. This distribution satisfies all of the constraints as equalities wherever $\bar{F}(p) < 1$.

- ▶ Proof: If there is a largest element, it must satisfy all of the constraints as equalities when $F(p) < 1$, for otherwise we could define $F'(p)$ as the minimum of 1 and the solution to

$$p \sum_{n=1}^N \mu(n)(n-1)(F'(p))^n = \sum_{n=1}^N \mu(n) \int_{x=p}^v (F(x))^n dx$$

An upper bound on prices under no information

Proposition

There exists a highest price distribution \bar{F} that satisfies the uniform downward incentive constraints under no information. This distribution satisfies all of the constraints as equalities wherever $\bar{F}(p) < 1$.

- ▶ Proof: If there is a largest element, it must satisfy all of the constraints as equalities when $F(p) < 1$, for otherwise we could define $F'(p)$ as the minimum of 1 and the solution to

$$p \sum_{n=1}^N \mu(n)(n-1)(F'(p))^n = \sum_{n=1}^N \mu(n) \int_{x=p}^v (F(x))^n dx$$

- ▶ Must have $F'(p) \geq F(p)$, and strictly so when the constraint is slack

An upper bound on prices under no information

Proposition

There exists a highest price distribution \bar{F} that satisfies the uniform downward incentive constraints under no information. This distribution satisfies all of the constraints as equalities wherever $\bar{F}(p) < 1$.

- ▶ Proof: If there is a largest element, it must satisfy all of the constraints as equalities when $F(p) < 1$, for otherwise we could define $F'(p)$ as the minimum of 1 and the solution to

$$p \sum_{n=1}^N \mu(n)(n-1)(F'(p))^n = \sum_{n=1}^N \mu(n) \int_{x=p}^v (F(x))^n dx$$

- ▶ Must have $F'(p) \geq F(p)$, and strictly so when the constraint is slack
- ▶ Moreover, the right-hand side has increased with F' , so that F' must be feasible

Proof, conclusion

- ▶ Let \mathcal{F} be the set of F 's satisfying the uniform downward constraint

Proof, conclusion

- ▶ Let \mathcal{F} be the set of F 's satisfying the uniform downward constraint
- ▶ Then the pointwise supremum of the F 's, denoted \bar{F} , is finite and also satisfies the constraints, since

$$\begin{aligned} p \sum_{n=1}^N \mu(n)(n-1) (\bar{F}(p))^n &= \sup_{F \in \mathcal{F}} p \sum_{n=1}^N \mu(n)(n-1) (F(p))^n \\ &\leq \sup_{F \in \mathcal{F}} \sum_{n=1}^N \mu(n) \int_{x=p}^v (F(x))^n dx \\ &= \sup_{F \in \mathcal{F}} \sum_{n=1}^N \mu(n) \int_{x=p}^v (\bar{F}(x))^n dx \end{aligned}$$

and hence is the largest element of \mathcal{F} \square

Equilibrium

Theorem

Equilibrium

Theorem

1. The unique equilibrium is \bar{F} .

Equilibrium

Theorem

1. The unique equilibrium is \bar{F} .
2. The expected price in any equilibrium is $\mu(1)$.

Proof

- ▶ Can directly verify that \bar{F} is an equilibrium. Firm is indifferent between all prices.

Proof

- ▶ Can directly verify that \bar{F} is an equilibrium. Firm is indifferent between all prices.
- ▶ Standard FPA auction arguments imply uniqueness

Proof

- ▶ Can directly verify that \bar{F} is an equilibrium. Firm is indifferent between all prices.
- ▶ Standard FPA auction arguments imply uniqueness
- ▶ Firms are also indifferent between charging monopoly price, proving (2) expected price

Uniform example

- ▶ Suppose $\mu(n) = 1/N$ for $n \in \{1, \dots, N\}$

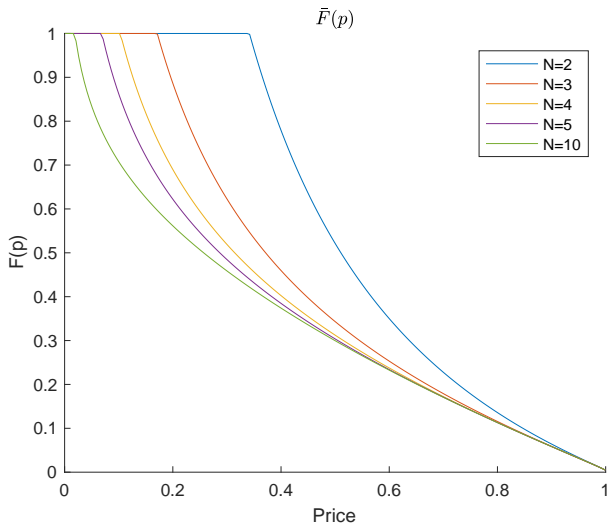
Uniform example

- ▶ Suppose $\mu(n) = 1/N$ for $n \in \{1, \dots, N\}$
- ▶ Set $v = 1$

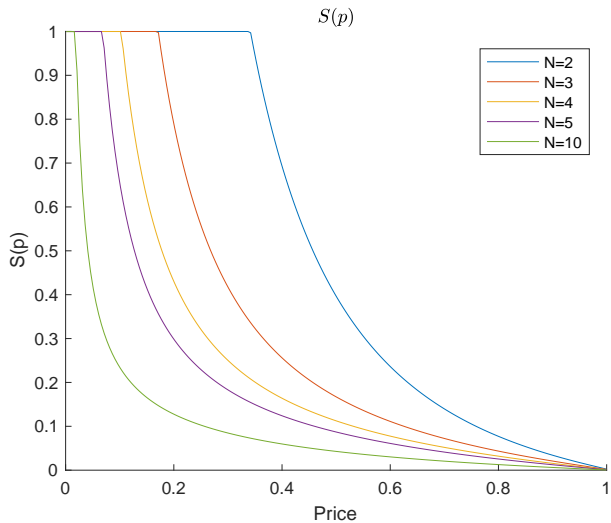
Uniform example

- ▶ Suppose $\mu(n) = 1/N$ for $n \in \{1, \dots, N\}$
- ▶ Set $\nu = 1$
- ▶ No closed form solutions but easy to compute numerically

Uniform example



Uniform example



General information

- ▶ If firms get partial information about n , then the $S(p|n)$ can vary more flexibly

General information

- ▶ If firms get partial information about n , then the $S(p|n)$ can vary more flexibly
- ▶ We again derive an upper bound, and now show that it is attained in an equilibrium for some information structure

Generalized bounds

Proposition

There exists a highest price distribution $\bar{S}(p)$ that can be induced by $S(p|n)$ satisfying the uniform downward incentive constraints. The inducing distributions $\bar{S}(p|n)$ satisfy the constraints as equalities whenever $\bar{S}(p) < 1$.

Generalized bounds

Proposition

There exists a highest price distribution $\bar{S}(p)$ that can be induced by $S(p|n)$ satisfying the uniform downward incentive constraints. The inducing distributions $\bar{S}(p|n)$ satisfy the constraints as equalities whenever $\bar{S}(p) < 1$.

- ▶ The logic is somewhat different from the earlier proof, because we now have more flexibility in choosing the distributions

Maximizing $S(p)$

- ▶ Recall the incentive constraints:

$$p \sum_{n=1}^N \mu(n)(n-1) S(p|n) \leq \sum_{n=1}^N \mu(n) \int_{x=p}^1 S(x|n) dx$$

Maximizing $S(p)$

- ▶ Recall the incentive constraints:

$$p \sum_{n=1}^N \mu(n)(n-1) S(p|n) \leq \sum_{n=1}^N \mu(n) \int_{x=p}^1 S(x|n) dx$$

- ▶ Imagine constructing a solution downward from $p = 1$

Maximizing $S(p)$

- ▶ Recall the incentive constraints:

$$p \sum_{n=1}^N \mu(n)(n-1) S(p|n) \leq \sum_{n=1}^N \mu(n) \int_{x=p}^1 S(x|n) dx$$

- ▶ Imagine constructing a solution downward from $p = 1$
- ▶ There's slack on the RHS that can be "allocated" to $S(p|n)$

Maximizing $S(p)$

- ▶ Recall the incentive constraints:

$$p \sum_{n=1}^N \mu(n)(n-1) S(p|n) \leq \sum_{n=1}^N \mu(n) \int_{x=p}^1 S(x|n) dx$$

- ▶ Imagine constructing a solution downward from $p = 1$
- ▶ There's slack on the RHS that can be "allocated" to $S(p|n)$
- ▶ Because $S(p|n)$ has weight $n - 1$ on the LHS, distributions with smaller n are "cheaper" to use
Suggests we should first use $S(p|n)$ with lower n

Maximizing $S(p)$

- ▶ Recall the incentive constraints:

$$p \sum_{n=1}^N \mu(n)(n-1) S(p|n) \leq \sum_{n=1}^N \mu(n) \int_{x=p}^1 S(x|n) dx$$

- ▶ Imagine constructing a solution downward from $p = 1$
- ▶ There's slack on the RHS that can be "allocated" to $S(p|n)$
- ▶ Because $S(p|n)$ has weight $n - 1$ on the LHS, distributions with smaller n are "cheaper" to use
Suggests we should first use $S(p|n)$ with lower n
- ▶ Indeed, $S(p|1)$ only appears on the right, so can set $S(p|1) \equiv 1$

Monotonic solutions

- ▶ More generally, we can show that any feasible $S(p|n)$ is dominated by one that is *monotonic*:

$$S(p|n) > 0 \implies S(p|n') = 1 \text{ for all } n' < n$$

Monotonic solutions

- ▶ More generally, we can show that any feasible $S(p|n)$ is dominated by one that is *monotonic*:

$$S(p|n) > 0 \implies S(p|n') = 1 \text{ for all } n' < n$$

- ▶ The argument is omitted for brevity, but basically if this constraint is violated, we can move a little mass from the larger n to the smaller n' and it increases $S(p)$

Monotonic solutions

- ▶ More generally, we can show that any feasible $S(p|n)$ is dominated by one that is *monotonic*:

$$S(p|n) > 0 \implies S(p|n') = 1 \text{ for all } n' < n$$

- ▶ The argument is omitted for brevity, but basically if this constraint is violated, we can move a little mass from the larger n to the smaller n' and it increases $S(p)$
- ▶ Once we restrict attention to monotonic solutions, we can use a similar trick as before to show that the set of $S(p)$ that can be generated by $S(p|n)$ satisfying the uniform downward constraints is a complete semi-lattice

Explicit formulae

- ▶ In fact, we have a closed form solution for the highest distribution:

Explicit formulae

- ▶ In fact, we have a closed form solution for the highest distribution:
- ▶ The support of $S(p|n)$ is an interval $[\rho_n, \rho_{n-1}]$, with $\rho_1 = \rho_0 = 1$ and for $n > 2$,

$$\rho_n = \rho_{n-1} \left(\frac{T_{n-1}}{T_n} \right)^{\frac{n-1}{n}}$$

where

$$T_n = \sum_{k=1}^n k\mu(k)$$

Explicit formulae

- ▶ In fact, we have a closed form solution for the highest distribution:
- ▶ The support of $S(p|n)$ is an interval $[p_n, p_{n-1}]$, with $p_1 = p_0 = 1$ and for $n > 2$,

$$p_n = p_{n-1} \left(\frac{T_{n-1}}{T_n} \right)^{\frac{n-1}{n}}$$

where

$$T_n = \sum_{k=1}^n k\mu(k)$$

- ▶ The distributions are

$$\bar{S}(p|n) = \frac{\left(\frac{p_n}{p}\right)^{\frac{n}{n-1}} - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{n}{n-1}}}{1 - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{n}{n-1}}}$$

Intuition for derivation

- ▶ Given that we have ordered supports, can rearrange the incentive constraint to

$$\begin{aligned} & \mu(n) \left(\int_{x=p}^v S(x|n) dx - p(n-1)S(p|n) \right) \\ &= \sum_{k=1}^{n-1} \mu(k) \left(\int_{x=p}^v S(x|k) dx - p(k-1)S(p|k) \right) \end{aligned}$$

Intuition for derivation

- ▶ Given that we have ordered supports, can rearrange the incentive constraint to

$$\begin{aligned} & \mu(n) \left(\int_{x=p}^v S(x|n) dx - p(n-1)S(p|n) \right) \\ &= \sum_{k=1}^{n-1} \mu(k) \left(\int_{x=p}^v S(x|k) dx - p(k-1)S(p|k) \right) \end{aligned}$$

- ▶ We can inductively solve this as an ODE for $S(p|n)$ in terms of $S(p|k)$ for $k < n$, which gives us the shape

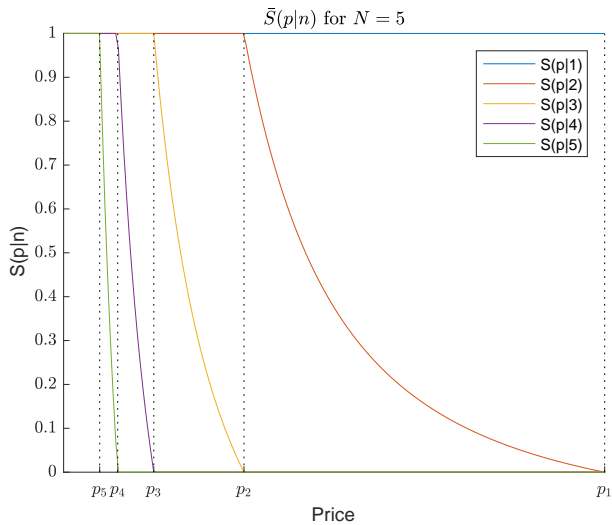
Intuition for derivation

- ▶ Given that we have ordered supports, can rearrange the incentive constraint to

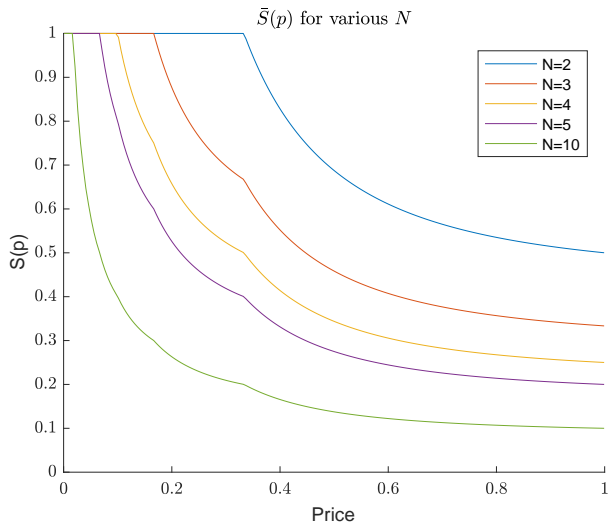
$$\begin{aligned} & \mu(n) \left(\int_{x=p}^v S(x|n) dx - p(n-1)S(p|n) \right) \\ &= \sum_{k=1}^{n-1} \mu(k) \left(\int_{x=p}^v S(x|k) dx - p(k-1)S(p|k) \right) \end{aligned}$$

- ▶ We can inductively solve this as an ODE for $S(p|n)$ in terms of $S(p|k)$ for $k < n$, which gives us the shape
- ▶ $S(p|n)$ satisfies the boundary condition $S(p_{n-1}|n) = 0$, and p_n is defined through $S(p_n|n) = 1$

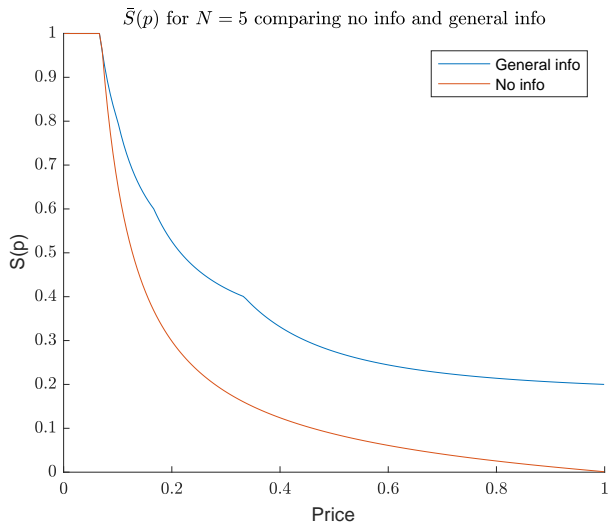
Uniform example revisited



Uniform example revisited



Uniform example revisited



Bounds attained

Theorem

Bounds attained

Theorem

1. The maximum distribution of prices in any equilibrium under any information structure is \bar{S} .

Bounds attained

Theorem

1. The maximum distribution of prices in any equilibrium under any information structure is \bar{S} .
2. Prices are decreased (under FOSD) as the number of price quotes increases (under FOSD).

Bounds attained

Theorem

1. The maximum distribution of prices in any equilibrium under any information structure is \bar{S} .
2. Prices are decreased (under FOSD) as the number of price quotes increases (under FOSD).
3. The expected price is under the maximum distribution of prices is in the interval $\left[\mu(1), \sqrt{\mu(1)(2 - \mu(1))} \right]$

Bounds attained

- ▶ The construction is now more subtle

Bounds attained

- ▶ The construction is now more subtle
- ▶ Firms receive a signal $n \geq 1$ which implies that there are at least n quotes

Bounds attained

- ▶ The construction is now more subtle
- ▶ Firms receive a signal $n \geq 1$ which implies that there are at least n quotes
- ▶ Firm receiving signal n follows a mixed strategy with support $[\rho_n, \rho_{n-1}]$

Bounds attained

- ▶ The construction is now more subtle
- ▶ Firms receive a signal $n \geq 1$ which implies that there are at least n quotes
- ▶ Firm receiving signal n follows a mixed strategy with support $[p_n, p_{n-1}]$
- ▶ Signal distributions can be chosen so that firm receiving signal n is indifferent between all signals in $[p_n, 1]$

Bounds attained

- ▶ The construction is now more subtle
- ▶ Firms receive a signal $n \geq 1$ which implies that there are at least n quotes
- ▶ Firm receiving signal n follows a mixed strategy with support $[p_n, p_{n-1}]$
- ▶ Signal distributions can be chosen so that firm receiving signal n is indifferent between all signals in $[p_n, 1]$
- ▶ Expected price is at least $\mu(1)$, i.e., that in the no information case

Bounds attained

- ▶ The construction is now more subtle
- ▶ Firms receive a signal $n \geq 1$ which implies that there are at least n quotes
- ▶ Firm receiving signal n follows a mixed strategy with support $[p_n, p_{n-1}]$
- ▶ Signal distributions can be chosen so that firm receiving signal n is indifferent between all signals in $[p_n, 1]$
- ▶ Expected price is at least $\mu(1)$, i.e., that in the no information case
- ▶ If there are at most two firms (so $\mu(2) = 1 - \mu(1)$), we can compute expected price to be $\sqrt{\mu(1)(2 - \mu(1))}$

Bounds attained

- ▶ The construction is now more subtle
- ▶ Firms receive a signal $n \geq 1$ which implies that there are at least n quotes
- ▶ Firm receiving signal n follows a mixed strategy with support $[p_n, p_{n-1}]$
- ▶ Signal distributions can be chosen so that firm receiving signal n is indifferent between all signals in $[p_n, 1]$
- ▶ Expected price is at least $\mu(1)$, i.e., that in the no information case
- ▶ If there are at most two firms (so $\mu(2) = 1 - \mu(1)$), we can compute expected price to be $\sqrt{\mu(1)(2 - \mu(1))}$
- ▶ This is upper bound on expected price if we shift distribution to $n \geq 3$, holding $\mu(1)$ fixed

More Formally: Firms' information

- ▶ The firms get discrete signals in $S = \{1, \dots, N\}$

More Formally: Firms' information

- ▶ The firms get discrete signals in $S = \{1, \dots, N\}$
- ▶ The distribution of signals is generated by first taking independent draws from $\alpha(\cdot|n)$ which has support on $\{1, \dots, n\}$, and *throwing out signal profiles where no bidder gets a signal of n*

Detailed description

- ▶ The formulae are:

$$\alpha(k|n) = \frac{T_{k-1} p_{k-1} \left(\left(\frac{p_{k-1}}{p_k} \right)^{\frac{1}{k-1}} - 1 \right)}{T_{n-1} p_{n-1} \left(\frac{p_{n-1}}{p_n} \right)^{\frac{1}{n-1}}}$$

and

$$\pi(s_{\tilde{N}}|n) = \frac{1}{1 - (1 - \alpha(n|n))^n} \times_{k \in \tilde{N}} \pi(s_k|n)$$

if $s_k = n$ for at least one $k \in \tilde{N}$, and $\pi(s|n) = 0$ otherwise

Strategies

- ▶ A firm that gets signal k randomizes according to

$$F(p|n) = \frac{\left(\frac{p_n}{p}\right)^{\frac{1}{n-1}} - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}{1 - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}$$

Strategies

- ▶ A firm that gets signal k randomizes according to

$$F(p|n) = \frac{\left(\frac{p_n}{p}\right)^{\frac{1}{n-1}} - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}{1 - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}$$

- ▶ One can show through some algebra and use of the binomial theorem that

Strategies

- ▶ A firm that gets signal k randomizes according to

$$F(p|n) = \frac{\left(\frac{p_n}{p}\right)^{\frac{1}{n-1}} - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}{1 - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}$$

- ▶ One can show through some algebra and use of the binomial theorem that
 1. These strategies are an equilibrium

Strategies

- ▶ A firm that gets signal k randomizes according to

$$F(p|n) = \frac{\left(\frac{p_n}{p}\right)^{\frac{1}{n-1}} - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}{1 - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}$$

- ▶ One can show through some algebra and use of the binomial theorem that
 1. These strategies are an equilibrium
 2. They induce the distributions $S(p|n)$

Strategies

- ▶ A firm that gets signal k randomizes according to

$$F(p|n) = \frac{\left(\frac{p_n}{p}\right)^{\frac{1}{n-1}} - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}{1 - \left(\frac{p_n}{p_{n-1}}\right)^{\frac{1}{n-1}}}$$

- ▶ One can show through some algebra and use of the binomial theorem that
 1. These strategies are an equilibrium
 2. They induce the distributions $S(p|n)$
- ▶ The proof that these strategies are an equilibrium shows that bidder surplus is quasiconcave in p conditional on s_k , and flat in $[p_{s_k}, p_{s_k-1}]$

Verification of sale price distribution

- ▶ For the sake of completeness, let's show the second

Verification of sale price distribution

- ▶ For the sake of completeness, let's show the second
- ▶ Write $\alpha_n = \alpha(n|n) = 1 - (p_n/p_{n-1})^{1/(n-1)}$

Verification of sale price distribution

- ▶ For the sake of completeness, let's show the second
- ▶ Write $\alpha_n = \alpha(n|n) = 1 - (p_n/p_{n-1})^{1/(n-1)}$
- ▶ Note that the high price must come from one of the firms that gets a signal of n , because the supports are ordered

Verification of sale price distribution

- ▶ For the sake of completeness, let's show the second
- ▶ Write $\alpha_n = \alpha(n|n) = 1 - (p_n/p_{n-1})^{1/(n-1)}$
- ▶ Note that the high price must come from one of the firms that gets a signal of n , because the supports are ordered
- ▶ The probability that the sale price is at least p when there are n active firms is

$$\begin{aligned} & \frac{1}{1 - (1 - \alpha_n)^n} \sum_{k=1}^n \binom{n}{k} (\alpha_n F(p|n))^k (1 - \alpha_n)^{n-k} \\ &= \frac{(1 - \alpha_n + \alpha_n F(p|n))^n - 1}{1 - (1 - \alpha_n)^n} \\ &= S(p|n) \end{aligned}$$

Endogenizing Price Quotes: Simultaneous Price Setting with predetermined information

- ▶ consider an arbitrary game in which, first the consumer, firms and other parties take actions that influence which firms' prices the consumer will observe; and then the firms choose prices

Endogenizing Price Quotes: Simultaneous Price Setting with predetermined information

- ▶ consider an arbitrary game in which, first the consumer, firms and other parties take actions that influence which firms' prices the consumer will observe; and then the firms choose prices
- ▶ uniform downward deviations (holding earlier advertising / posting decisions fixed) are feasible deviations

Endogenizing Price Quotes: Simultaneous Price Setting with predetermined information

- ▶ consider an arbitrary game in which, first the consumer, firms and other parties take actions that influence which firms' prices the consumer will observe; and then the firms choose prices
- ▶ uniform downward deviations (holding earlier advertising / posting decisions fixed) are feasible deviations
- ▶ thus our bounds on the equilibrium price distribution continue to apply

Endogenizing Price Quotes: Simultaneous Price Setting with predetermined information

- ▶ consider an arbitrary game in which, first the consumer, firms and other parties take actions that influence which firms' prices the consumer will observe; and then the firms choose prices
- ▶ uniform downward deviations (holding earlier advertising / posting decisions fixed) are feasible deviations
- ▶ thus our bounds on the equilibrium price distribution continue to apply
- ▶ we can trivially come up with an extremal cost function for simultaneous search that will hit our exogenous distribution of number of quotes: for proportion $\mu(k)$, the cost of collecting k price quotes is 0 and the cost of collecting $k + 1$ price quotes is ∞ .

Endogenizing Price Quotes: Simultaneous Price Setting with predetermined information

- ▶ consider an arbitrary game in which, first the consumer, firms and other parties take actions that influence which firms' prices the consumer will observe; and then the firms choose prices
- ▶ uniform downward deviations (holding earlier advertising / posting decisions fixed) are feasible deviations
- ▶ thus our bounds on the equilibrium price distribution continue to apply
- ▶ we can trivially come up with an extremal cost function for simultaneous search that will hit our exogenous distribution of number of quotes: for proportion $\mu(k)$, the cost of collecting k price quotes is 0 and the cost of collecting $k + 1$ price quotes is ∞ .
- ▶ this class of games embeds simultaneous search, costly price posting, information intermediaries

Endogenizing Price Quotes: Pricing determines information

- ▶ firms simultaneously choose prices (without observing each other's prices)

Endogenizing Price Quotes: Pricing determines information

- ▶ firms simultaneously choose prices (without observing each other's prices)
- ▶ consumer decides what price quotes to observe having observed other price quotes (sequential search)

Endogenizing Price Quotes: Pricing determines information

- ▶ firms simultaneously choose prices (without observing each other's prices)
- ▶ consumer decides what price quotes to observe having observed other price quotes (sequential search)
- ▶ now a firm that deviates can influence the information that the consumer gets in equilibrium

Endogenizing Price Quotes: Pricing determines information

- ▶ firms simultaneously choose prices (without observing each other's prices)
- ▶ consumer decides what price quotes to observe having observed other price quotes (sequential search)
- ▶ now a firm that deviates can influence the information that the consumer gets in equilibrium
- ▶ so bound cannot be immediately applied

Endogenizing Price Quotes: Pricing determines information

- ▶ firms simultaneously choose prices (without observing each other's prices)
- ▶ consumer decides what price quotes to observe having observed other price quotes (sequential search)
- ▶ now a firm that deviates can influence the information that the consumer gets in equilibrium
- ▶ so bound cannot be immediately applied
- ▶ but we show that lowering price will discourage further search and thus *increase* benefit from uniform downward deviation.

Endogenizing Price Quotes: Pricing determines information

- ▶ firms simultaneously choose prices (without observing each other's prices)
- ▶ consumer decides what price quotes to observe having observed other price quotes (sequential search)
- ▶ now a firm that deviates can influence the information that the consumer gets in equilibrium
- ▶ so bound cannot be immediately applied
- ▶ but we show that lowering price will discourage further search and thus *increase* benefit from uniform downward deviation.
- ▶ so bound still applies

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm
- ▶ Firm searched at time t observes signal s distributed according to $\pi(ds|\theta, t)$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm
- ▶ Firm searched at time t observes signal s distributed according to $\pi(ds|\theta, t)$
- ▶ A consumer who stops at time t has resulting payoff

$$v - \min(p_1, p_2, \dots, p_t) - c(t, \theta)$$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm
- ▶ Firm searched at time t observes signal s distributed according to $\pi(ds|\theta, t)$
- ▶ A consumer who stops at time t has resulting payoff

$$v - \min(p_1, p_2, \dots, p_t) - c(t, \theta)$$

- ▶ We look for equilibrium in consumer search strategy and firm pricing strategy

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm
- ▶ Firm searched at time t observes signal s distributed according to $\pi(ds|\theta, t)$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm
- ▶ Firm searched at time t observes signal s distributed according to $\pi(ds|\theta, t)$
- ▶ A consumer who stops at time t has resulting payoff

$$v - \min(p_1, p_2, \dots, p_t) - c(t, \theta)$$

Sequential Search Model: Sketch

- ▶ Suppose search occurs over countable periods $t = 1, \dots, T$
- ▶ Consumer type $\theta \in \Theta$ with prior distribution $\eta \in \Delta(\Theta)$
- ▶ Firm has cost $c(n, \theta)$ of getting n quotes
- ▶ At end of period t , firm has history $h_t = (p_1, p_2, \dots, p_t)$.
- ▶ Let $\sigma(h_t, \theta)$ denote probability of searching one more firm
- ▶ Firm searched at time t observes signal s distributed according to $\pi(ds|\theta, t)$
- ▶ A consumer who stops at time t has resulting payoff

$$v - \min(p_1, p_2, \dots, p_t) - c(t, \theta)$$

- ▶ We look for equilibrium in consumer search strategy and firm pricing strategy

Our Bound?

- ▶ Our bound still holds lower prices always lead to less search.

Our Bound?

- ▶ Our bound still holds lower prices always lead to less search.
- ▶ More formally, if $p(h_t)$ is the lowest price in history h_t , we would like to show that if $p(h_t) \leq p(h'_t)$ and continuing to search is a best response at h_t for θ , then continuing to search is a strict best response at h'_t for θ .

Relation to Auctions

- ▶ the exogenous number of price quotes problem corresponds to the first price auction with two possible values, 0 or 1

Relation to Auctions

- ▶ the exogenous number of price quotes problem corresponds to the first price auction with two possible values, 0 or 1
- ▶ we have found the lowest possible distribution of equilibrium bids in the known private value case, when bidders know their own values but may have any information about each others values

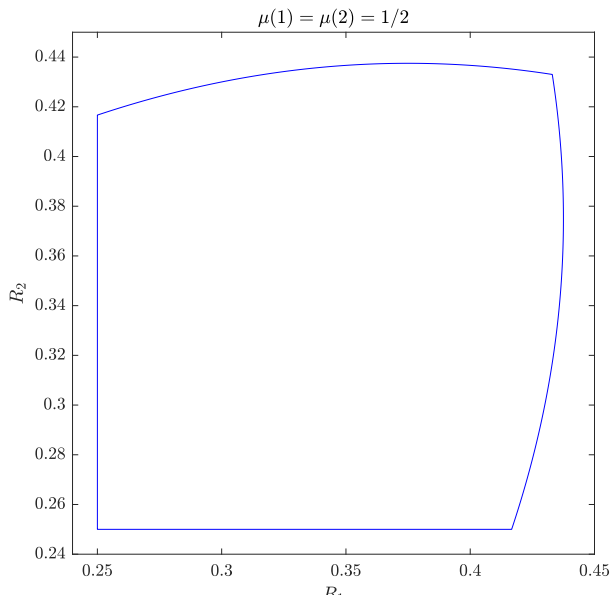
Relation to Auctions

- ▶ the exogenous number of price quotes problem corresponds to the first price auction with two possible values, 0 or 1
- ▶ we have found the lowest possible distribution of equilibrium bids in the known private value case, when bidders know their own values but may have any information about each others values
- ▶ our 2017 *Econometrica* paper derives the analogous distribution when bidders may not know their own values

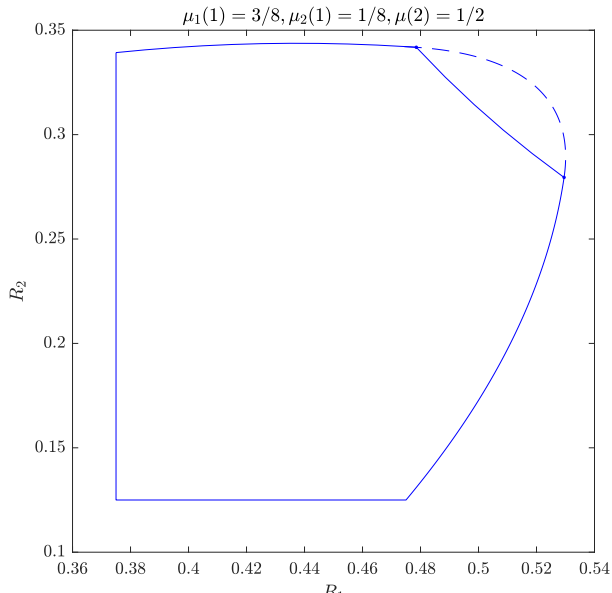
Relation to Auctions

- ▶ the exogenous number of price quotes problem corresponds to the first price auction with two possible values, 0 or 1
- ▶ we have found the lowest possible distribution of equilibrium bids in the known private value case, when bidders know their own values but may have any information about each others values
- ▶ our 2017 *Econometrica* paper derives the analogous distribution when bidders may not know their own values
- ▶ today's problem is harder and the result is less general

Asymmetric Equilibria, Symmetric Distribution on n



Asymmetric Distribution and Equilibrium



Heterogeneous Costs and the minimum expected price

- ▶ Homogenous cost case....

Heterogeneous Costs and the minimum expected price

- ▶ Homogenous cost case....
 - ▶ We have a characterization of maximum expected price for arbitrary μ

Heterogeneous Costs and the minimum expected price

- ▶ Homogenous cost case....
 - ▶ We have a characterization of maximum expected price for arbitrary μ
 - ▶ Minimum expected price was $\mu(1)$.

Heterogeneous Costs and the minimum expected price

- ▶ Homogenous cost case....
 - ▶ We have a characterization of maximum expected price for arbitrary μ
 - ▶ Minimum expected price was $\mu(1)$.
- ▶ Heterogeneous cost case....

Heterogeneous Costs and the minimum expected price

- ▶ Homogenous cost case....
 - ▶ We have a characterization of maximum expected price for arbitrary μ
 - ▶ Minimum expected price was $\mu(1)$.
- ▶ Heterogeneous cost case....
 - ▶ Can't say much about maximum expected price

Heterogeneous Costs and the minimum expected price

- ▶ Homogenous cost case....
 - ▶ We have a characterization of maximum expected price for arbitrary μ
 - ▶ Minimum expected price was $\mu(1)$.
- ▶ Heterogeneous cost case....
 - ▶ Can't say much about maximum expected price
 - ▶ An interesting result about the minimum expected price

Minimum Expected Price with heterogeneous costs

- ▶ Now suppose firms have independent cost drawn according to density g_k

Minimum Expected Price with heterogeneous costs

- ▶ Now suppose firms have independent cost drawn according to density g_k
- ▶ If firm k had cost c_k and expected all other firms to charge at cost, his payoff to charging p would be

$$(p - c_k) \prod_{k' \neq k} (1 - G_{k'}(p))$$

and his ex ante “competitive rent” would be

$$\int_{c_k} \left[\max_p (p - c_k) \prod_{k' \neq k} (1 - G_{k'}(p)) \right] g_k(c_k) dc_k$$

Minimum Expected Price with heterogeneous costs

- ▶ Now suppose firms have independent cost drawn according to density g_k
- ▶ If firm k had cost c_k and expected all other firms to charge at cost, his payoff to charging p would be

$$(p - c_k) \prod_{k' \neq k} (1 - G_{k'}(p))$$

and his ex ante “competitive rent” would be

$$\int_{c_k} \left[\max_p (p - c_k) \prod_{k' \neq k} (1 - G_{k'}(p)) \right] g_k(c_k) dc_k$$

- ▶ the minimum expected price is the sum of the minimum expected cost and the firms' competitive rents

Conclusion

- ▶ Price predictions based on distribution of number of price quotes (abstracting from details of where it came from)

Conclusion

- ▶ Price predictions based on distribution of number of price quotes (abstracting from details of where it came from)
- ▶ Information structure determines prices

Conclusion

- ▶ Price predictions based on distribution of number of price quotes (abstracting from details of where it came from)
- ▶ Information structure determines prices
- ▶ tight upper bound on price distribution, tight upper and lower bounds on expected prices

Further topics

- ▶ First Price Auction

Further topics

- ▶ First Price Auction
- ▶ Some cheap extensions

Further topics

- ▶ First Price Auction
- ▶ Some cheap extensions
- ▶ Asymptotics

Further topics

- ▶ First Price Auction
- ▶ Some cheap extensions
- ▶ Asymptotics
- ▶ Going dynamic

Further topics

- ▶ First Price Auction
- ▶ Some cheap extensions
- ▶ Asymptotics
- ▶ Going dynamic
- ▶ Other welfare outcomes

Further topics

- ▶ First Price Auction
- ▶ Some cheap extensions
- ▶ Asymptotics
- ▶ Going dynamic
- ▶ Other welfare outcomes
- ▶ Asymmetric firms

First Price Auction

- ▶ Up to N bidders have high or low valuation for an object.

First Price Auction

- ▶ Up to N bidders have high or low valuation for an object.
- ▶ Bidders know their values but the analyst does not know what they know about others' values

First Price Auction

- ▶ Up to N bidders have high or low valuation for an object.
- ▶ Bidders know their values but the analyst does not know what they know about others' values
- ▶ What can happen in equilibrium?

First Price Auction

- ▶ Up to N bidders have high or low valuation for an object.
- ▶ Bidders know their values but the analyst does not know what they know about others' values
- ▶ What can happen in equilibrium?
- ▶ Equivalent to solving for Bayes correlated equilibrium

First Price Auction

- ▶ Up to N bidders have high or low valuation for an object.
- ▶ Bidders know their values but the analyst does not know what they know about others' values
- ▶ What can happen in equilibrium?
- ▶ Equivalent to solving for Bayes correlated equilibrium
- ▶ Today's problem with exogenous μ is isomorphic to this problem: normalize low valuation to 0, low valuation bidders always bid 0, $\mu(n)$ is the probability that there are n high valuation bidders

First Price Auction

- ▶ Up to N bidders have high or low valuation for an object.
- ▶ Bidders know their values but the analyst does not know what they know about others' values
- ▶ What can happen in equilibrium?
- ▶ Equivalent to solving for Bayes correlated equilibrium
- ▶ Today's problem with exogenous μ is isomorphic to this problem: normalize low valuation to 0, low valuation bidders always bid 0, $\mu(n)$ is the probability that there are n high valuation bidders
- ▶ Bergemann, Brooks and Morris (2017) solved for the (easier) case where bidders do not necessarily know their own value

Value uncertainty

- ▶ An easy extension: instead of single unit demand, the consumer has multiunit demand with a downward sloping demand curve $D(p)$

Value uncertainty

- ▶ An easy extension: instead of single unit demand, the consumer has multiunit demand with a downward sloping demand curve $D(p)$
- ▶ Maintain homogenous goods, so that the consumer only purchases from a low-price firm

Value uncertainty

- ▶ An easy extension: instead of single unit demand, the consumer has multiunit demand with a downward sloping demand curve $D(p)$
- ▶ Maintain homogenous goods, so that the consumer only purchases from a low-price firm
- ▶ In this case, the incentive constraint becomes

$$pD(p) \sum_{n=1}^N \mu(n)nS(p|n) \leq \int_{x=p}^v xD(x)S(dx)$$

Value uncertainty

- ▶ An easy extension: instead of single unit demand, the consumer has multiunit demand with a downward sloping demand curve $D(p)$
- ▶ Maintain homogenous goods, so that the consumer only purchases from a low-price firm
- ▶ In this case, the incentive constraint becomes

$$pD(p) \sum_{n=1}^N \mu(n)nS(p|n) \leq \int_{x=p}^v xD(x)S(dx)$$

- ▶ Firms only use “undominated” prices, i.e., the set

$$\{p \mid \nexists p' \leq p \text{ s.t. } p'D(p') > pD(p)\}$$

(e.g., never price above the uniform monopoly
 $p^M = \arg \max pD(p)$)

Value uncertainty

- ▶ An easy extension: instead of single unit demand, the consumer has multiunit demand with a downward sloping demand curve $D(p)$
- ▶ Maintain homogenous goods, so that the consumer only purchases from a low-price firm
- ▶ In this case, the incentive constraint becomes

$$pD(p) \sum_{n=1}^N \mu(n)nS(p|n) \leq \int_{x=p}^v xD(x)S(dx)$$

- ▶ Firms only use “undominated” prices, i.e., the set

$$\{p \mid \nexists p' \leq p \text{ s.t. } p'D(p') > pD(p)\}$$

(e.g., never price above the uniform monopoly
 $p^M = \arg \max pD(p)$)

- ▶ We can treat the associated revenue levels as the price in the baseline model and everything goes through

Noisy search

- ▶ Instead of choosing a deterministic number of price quotes, consumer chooses a distribution $G \in \Delta(\{1, \dots, N\})$

Noisy search

- ▶ Instead of choosing a deterministic number of price quotes, consumer chooses a distribution $G \in \Delta(\{1, \dots, N\})$
- ▶ Associated cost $c(\theta, G)$

Noisy search

- ▶ Instead of choosing a deterministic number of price quotes, consumer chooses a distribution $G \in \Delta(\{1, \dots, N\})$
- ▶ Associated cost $c(\theta, G)$
- ▶ Still assume that distribution of number of searches matches μ

Noisy search

- ▶ Instead of choosing a deterministic number of price quotes, consumer chooses a distribution $G \in \Delta(\{1, \dots, N\})$
- ▶ Associated cost $c(\theta, G)$
- ▶ Still assume that distribution of number of searches matches μ
- ▶ Everything goes through, as our bang-bang search costs are still feasible, and always rationalize the data

Noisy search

- ▶ Instead of choosing a deterministic number of price quotes, consumer chooses a distribution $G \in \Delta(\{1, \dots, N\})$
- ▶ Associated cost $c(\theta, G)$
- ▶ Still assume that distribution of number of searches matches μ
- ▶ Everything goes through, as our bang-bang search costs are still feasible, and always rationalize the data
- ▶ Firms' incentive constraints are independent of how we rationalize consumer behavior

Asymmetric strategies and maximum revenue

- ▶ Throughout we assumed that the firms were using symmetric strategies

Asymmetric strategies and maximum revenue

- ▶ Throughout we assumed that the firms were using symmetric strategies
- ▶ We know that the analysis of the bounds under general info doesn't change if we allow firms to use different strategies

Asymmetric strategies and maximum revenue

- ▶ Throughout we assumed that the firms were using symmetric strategies
- ▶ We know that the analysis of the bounds under general info doesn't change if we allow firms to use different strategies
- ▶ A simple convexity argument says that it is WLOG to restrict attention to symmetric information and symmetric strategies

Asymmetric strategies and maximum revenue

- ▶ Throughout we assumed that the firms were using symmetric strategies
- ▶ We know that the analysis of the bounds under general info doesn't change if we allow firms to use different strategies
- ▶ A simple convexity argument says that it is WLOG to restrict attention to symmetric information and symmetric strategies
- ▶ Even in the symmetric case, symmetry is WLOG, since all equilibria have to be symmetric (Maskin and Riley 1983)

Asymptotics

- ▶ Consider a sequence of economies with $N = 1, 2, \dots$ with quote distributions μ^N

Asymptotics

- ▶ Consider a sequence of economies with $N = 1, 2, \dots$ with quote distributions μ^N
- ▶ If there were common knowledge that the number of firms $n > 1$, then firms would compete prices down to zero, and total profits would be zero

Asymptotics

- ▶ Consider a sequence of economies with $N = 1, 2, \dots$ with quote distributions μ^N
- ▶ If there were common knowledge that the number of firms $n > 1$, then firms would compete prices down to zero, and total profits would be zero
- ▶ This means that for asymptotic results, what matters for whether or not profits go to zero as $N \rightarrow \infty$ is what happens to $\mu^N(1)$

Asymptotics

- ▶ Consider a sequence of economies with $N = 1, 2, \dots$ with quote distributions μ^N
- ▶ If there were common knowledge that the number of firms $n > 1$, then firms would compete prices down to zero, and total profits would be zero
- ▶ This means that for asymptotic results, what matters for whether or not profits go to zero as $N \rightarrow \infty$ is what happens to $\mu^N(1)$
 - ▶ If $\mu^N(1)$ goes to zero, profits converge to zero, and we obtain a competitive limit;

Asymptotics

- ▶ Consider a sequence of economies with $N = 1, 2, \dots$ with quote distributions μ^N
- ▶ If there were common knowledge that the number of firms $n > 1$, then firms would compete prices down to zero, and total profits would be zero
- ▶ This means that for asymptotic results, what matters for whether or not profits go to zero as $N \rightarrow \infty$ is what happens to $\mu^N(1)$
 - ▶ If $\mu^N(1)$ goes to zero, profits converge to zero, and we obtain a competitive limit;
 - ▶ If $\mu^N(1)$ is bounded away from zero, then total firm profits will be positive, even if the expected number of searches goes to infinity

Going dynamic

- ▶ Extension we're most interested in: allowing for sequential search

Going dynamic

- ▶ Extension we're most interested in: allowing for sequential search
- ▶ Now suppose search occurs over time $t = 1, \dots, T$

Going dynamic

- ▶ Extension we're most interested in: allowing for sequential search
- ▶ Now suppose search occurs over time $t = 1, \dots, T$
- ▶ At each period t , consumer chooses to search n_t firms

Going dynamic

- ▶ Extension we're most interested in: allowing for sequential search
- ▶ Now suppose search occurs over time $t = 1, \dots, T$
- ▶ At each period t , consumer chooses to search n_t firms
- ▶ Draw a random subset N_t of the unsearched firms with $|N_t| = n_t$
(i.e., no replacement)

Going dynamic

- ▶ Extension we're most interested in: allowing for sequential search
- ▶ Now suppose search occurs over time $t = 1, \dots, T$
- ▶ At each period t , consumer chooses to search n_t firms
- ▶ Draw a random subset N_t of the unsearched firms with $|N_t| = n_t$
(i.e., no replacement)
- ▶ Firms in N_t get (possibly correlated) signals about $(\theta, n_1, \dots, n_t)$,
set prices

Going dynamic

- ▶ Extension we're most interested in: allowing for sequential search
- ▶ Now suppose search occurs over time $t = 1, \dots, T$
- ▶ At each period t , consumer chooses to search n_t firms
- ▶ Draw a random subset N_t of the unsearched firms with $|N_t| = n_t$
(i.e., no replacement)
- ▶ Firms in N_t get (possibly correlated) signals about $(\theta, n_1, \dots, n_t)$,
set prices
- ▶ After seeing prices, consumer either chooses to buy at current lowest price, or continue searching
 $\sigma(\cdot | \theta, n_1, \dots, n_t, \{p_k | k \in N_\tau, \tau \leq t\}) \in$
 $\Delta \left(\{0, 1, \dots, N - \sum_{\tau \leq T} n_\tau\} \right)$

New issues

- ▶ Basically, we think we should be able to generalize our results using the following logic

New issues

- ▶ Basically, we think we should be able to generalize our results using the following logic
- ▶ Cutting prices creates an incentive for consumers to search less, because search is costly, and the outside option has gotten better

New issues

- ▶ Basically, we think we should be able to generalize our results using the following logic
- ▶ Cutting prices creates an incentive for consumers to search less, because search is costly, and the outside option has gotten better
- ▶ Less search leads to less competition, and an even higher distribution of the lowest price of firms – k

New issues

- ▶ Basically, we think we should be able to generalize our results using the following logic
- ▶ Cutting prices creates an incentive for consumers to search less, because search is costly, and the outside option has gotten better
- ▶ Less search leads to less competition, and an even higher distribution of the lowest price of firms $-k$
- ▶ Thus, in a sequential search model, the gains from deviating down would be weakly greater than the static gains, and hence our uniform downward incentive constraint is a necessary condition

New issues

- ▶ Basically, we think we should be able to generalize our results using the following logic
- ▶ Cutting prices creates an incentive for consumers to search less, because search is costly, and the outside option has gotten better
- ▶ Less search leads to less competition, and an even higher distribution of the lowest price of firms $-k$
- ▶ Thus, in a sequential search model, the gains from deviating down would be weakly greater than the static gains, and hence our uniform downward incentive constraint is a necessary condition
- ▶ Can still rationalize search as simultaneous, with bang-bang costs

New issues

- ▶ Basically, we think we should be able to generalize our results using the following logic
- ▶ Cutting prices creates an incentive for consumers to search less, because search is costly, and the outside option has gotten better
- ▶ Less search leads to less competition, and an even higher distribution of the lowest price of firms – k
- ▶ Thus, in a sequential search model, the gains from deviating down would be weakly greater than the static gains, and hence our uniform downward incentive constraint is a necessary condition
- ▶ Can still rationalize search as simultaneous, with bang-bang costs
- ▶ This is the most collusive search cost model, because it creates the weakest incentives for firms to cut prices

The problem

- ▶ It is hard to guarantee in general that lower prices lead to less search

The problem

- ▶ It is hard to guarantee in general that lower prices lead to less search
- ▶ NB would be true if firms got no information

The problem

- ▶ It is hard to guarantee in general that lower prices lead to less search
- ▶ NB would be true if firms got no information
- ▶ But for general information, lower prices may lead the consumer's behavior to shift in a way that makes the probability of a sale go *down*

The problem

- ▶ It is hard to guarantee in general that lower prices lead to less search
- ▶ NB would be true if firms got no information
- ▶ But for general information, lower prices may lead the consumer's behavior to shift in a way that makes the probability of a sale go *down*
- ▶ This would weaken incentives to deviate down, and support even higher prices than the ones we construct

A “sufficient” condition

- ▶ For now, we know our result goes through whenever the consumer’s search strategy leads to less search when prices are lower, in a strong sense:

A “sufficient” condition

- ▶ For now, we know our result goes through whenever the consumer’s search strategy leads to less search when prices are lower, in a strong sense:
- ▶ If h_t and h'_t are two histories, where h_t has a lower minimum price, then for all $n_{t+1} > 0$,

$$\sigma(n_{t+1}|h_t) < \sigma(n_{t+1}|h'_t)$$

A “sufficient” condition

- ▶ For now, we know our result goes through whenever the consumer’s search strategy leads to less search when prices are lower, in a strong sense:
- ▶ If h_t and h'_t are two histories, where h_t has a lower minimum price, then for all $n_{t+1} > 0$,

$$\sigma(n_{t+1}|h_t) < \sigma(n_{t+1}|h'_t)$$

- ▶ We are looking for conditions on primitives (information and costs) under which this will be true, or the weaker condition that price cuts lead to less competition

A “sufficient” condition

- ▶ For now, we know our result goes through whenever the consumer’s search strategy leads to less search when prices are lower, in a strong sense:
- ▶ If h_t and h'_t are two histories, where h_t has a lower minimum price, then for all $n_{t+1} > 0$,

$$\sigma(n_{t+1}|h_t) < \sigma(n_{t+1}|h'_t)$$

- ▶ We are looking for conditions on primitives (information and costs) under which this will be true, or the weaker condition that price cuts lead to less competition
- ▶ True in simple sequential model

A “sufficient” condition

- ▶ For now, we know our result goes through whenever the consumer’s search strategy leads to less search when prices are lower, in a strong sense:
- ▶ If h_t and h'_t are two histories, where h_t has a lower minimum price, then for all $n_{t+1} > 0$,

$$\sigma(n_{t+1}|h_t) < \sigma(n_{t+1}|h'_t)$$

- ▶ We are looking for conditions on primitives (information and costs) under which this will be true, or the weaker condition that price cuts lead to less competition
- ▶ True in simple sequential model
- ▶ But it is hard to rule out complex consumer response due to “leaked information” about signals and future prices

Other welfare objectives

- ▶ In general, we might be interested in other welfare objectives besides maximizing prices (although this is an interesting objective from the perspective of understanding collusion)

Other welfare objectives

- ▶ In general, we might be interested in other welfare objectives besides maximizing prices (although this is an interesting objective from the perspective of understanding collusion)
- ▶ For example, what are the possible weighted sums of firms' profits, or profit and consumer surplus?

Other welfare objectives

- ▶ In general, we might be interested in other welfare objectives besides maximizing prices (although this is an interesting objective from the perspective of understanding collusion)
- ▶ For example, what are the possible weighted sums of firms' profits, or profit and consumer surplus?
- ▶ A bit hard to think about consumer surplus, since we don't know search costs, but we can think about profits...

Minimizing revenue

Theorem

The no-information costly search model minimizes total profits, even when firms can have general information.

Minimizing revenue

Theorem

The no-information costly search model minimizes total profits, even when firms can have general information.

- ▶ Firms can always set a price $p = v$ and only make a sale at that price when the consumer has value v , and guarantee themselves

$$\underline{R} = \frac{\mu(1)}{N} v$$

Minimizing revenue

Theorem

The no-information costly search model minimizes total profits, even when firms can have general information.

- ▶ Firms can always set a price $p = v$ and only make a sale at that price when the consumer has value v , and guarantee themselves

$$\underline{R} = \frac{\mu(1)}{N} v$$

- ▶ But $p = v$ is in the support of \bar{F} , and in the event of setting that price, a firm makes a sale with probability one, and hence achieves \underline{R}

Minimizing revenue

Theorem

The no-information costly search model minimizes total profits, even when firms can have general information.

- ▶ Firms can always set a price $p = v$ and only make a sale at that price when the consumer has value v , and guarantee themselves

$$\underline{R} = \frac{\mu(1)}{N} v$$

- ▶ But $p = v$ is in the support of \bar{F} , and in the event of setting that price, a firm makes a sale with probability one, and hence achieves \underline{R}
- ▶ NB Would also be achieved under complete information

The set of possible profit profiles

- ▶ For weighted sums of firms profits, the only results we have now are for the case of $N = 2$

The set of possible profit profiles

- ▶ For weighted sums of firms profits, the only results we have now are for the case of $N = 2$
- ▶ Let us parametrize the joint distribution of whether a firm is active or not active

	Active	Not active
Active	$1 - p_1 - p_2 - p_0$	p_2
Not active	p_1	p_0

The set of possible profit profiles

- ▶ For weighted sums of firms profits, the only results we have now are for the case of $N = 2$
- ▶ Let us parametrize the joint distribution of whether a firm is active or not active

	Active	Not active
Active	$1 - p_1 - p_2 - p_0$	p_2
Not active	p_1	p_0

- ▶ If this matrix is symmetric, then can achieve all possible combinations of firms' profits with two signals, as for maximum revenue

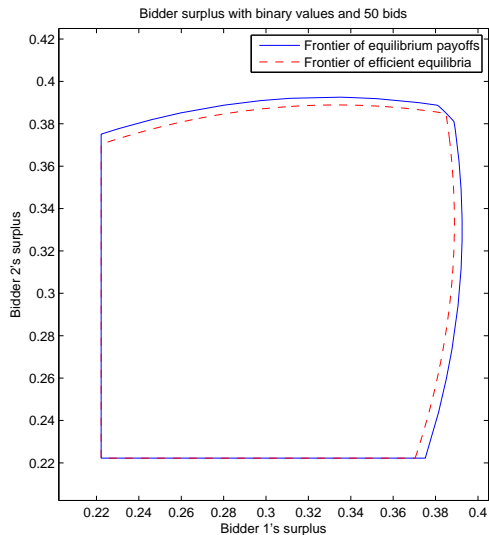
The set of possible profit profiles

- ▶ For weighted sums of firms profits, the only results we have now are for the case of $N = 2$
- ▶ Let us parametrize the joint distribution of whether a firm is active or not active

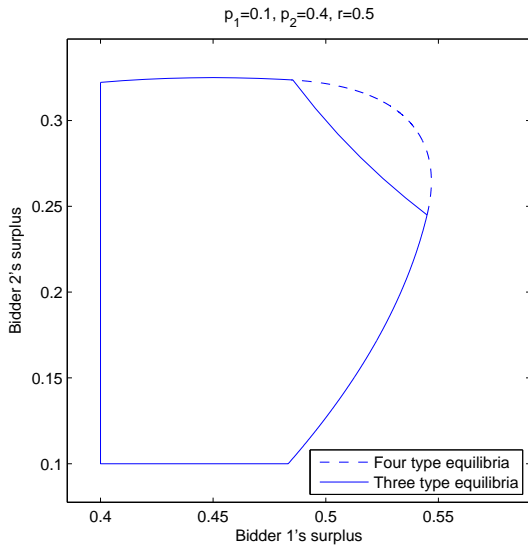
	Active	Not active
Active	$1 - p_1 - p_2 - p_0$	p_2
Not active	p_1	p_0

- ▶ If this matrix is symmetric, then can achieve all possible combinations of firms' profits with two signals, as for maximum revenue
- ▶ (Mention connection with first-price auction?)

The set of firms' profits when $p_1 = p_2 = 2/9$, $p_0 = 1/9$



Asymmetric firms



Final words

Thank you!