

First price auctions
with general information structures:
Implications for bidding and revenue

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2. Assumptions about information are hard to test
3. Equilibrium behavior can depend a lot on how we specify information

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- ▶ Other results on max revenue, min bidder surplus, min efficiency

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- ▶ Bidder surplus $U = 1/2 - R$
- ▶ What predictions can we make about U and R in equilibrium?

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- ▶ True information structure is likely somewhere in between:
 - ▶ Bidders have some information about v , but not perfect
 - ▶ But exactly how much information do they have?

Lower revenue?

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- ▶ $U_1 = \int_{v=0}^1 v(v - v/2)dv = 1/6$, $U_2 = 0$, $R = 1/3$

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- ▶ Welfare outcomes are sensitive to modelling of information
- ▶ Why? Optimal bid depends on distribution of others' bids, and on correlation between others' bids and values
- ▶ Problem: hard to say which specification is “correct”
- ▶ What welfare predictions do not depend on how we model information?

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- ▶ At min R , winning bids have been pushed down “as far as they can go”
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- ▶ In EMW, informed bidder strictly prefers equilibrium bid

Towards a bound

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$$\begin{aligned} \underline{\beta}(v) &= \frac{1}{\sqrt{v}} \int_{x=0}^v x \frac{1}{2\sqrt{x}} dx \\ &= \frac{v}{3} \end{aligned}$$

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- ▶ In fact, symmetry/deterministic winning bid are not needed
- ▶ Distribution of winning bid has to FOSD $U[0, 1/3]$ in *all* equilibria under *any* information
- ▶ $1/6$ is a *global* lower bound on equilibrium revenue

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- ▶ Defer proof until general results

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- ▶ Bound is characterized by binding *uniform upward incentive constraints*

The plan

- ▶ Detailed exposition of minimum bidding
- ▶ Maximum revenue/minimum bidder surplus
- ▶ Restrictions on information
- ▶ Other directions in welfare space (e.g., efficiency)

General model

- ▶ N bidders
- ▶ Distribution of values: $P(dv_1, \dots, dv_N)$
- ▶ Support of marginals $V = [\underline{v}, \bar{v}] \subseteq \mathbb{R}_+$

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- ▶ Support of marginals $V = [\underline{v}, \bar{v}] \subseteq \mathbb{R}_+$
- ▶ An *information structure* \mathcal{S} consists of
 - ▶ A measurable space S_i of signals for each player i , $S = \times_{i=1}^N S_i$
 - ▶ A conditional probability measure

$$\pi : V^N \rightarrow \Delta(S)$$

Equilibrium

- ▶ Bidders' strategies map signals to distributions over bids in $[0, \bar{v}]$

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- ▶ Bidder i 's payoff given strategy profile $\sigma = (\sigma_1, \dots, \sigma_N)$:

$$U_i(\sigma, \mathcal{S}) = \int_{v \in V} \int_{s \in S} \int_{b \in B^N} (v_i - b_i) \frac{\mathbb{I}_{b_i \geq b_j \ \forall j}}{|\arg \max_j b_j|} \sigma(db|s) \pi(ds|v) P(dv)$$

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- ▶ σ is a Bayes Nash *equilibrium* if

$$U_i(\sigma, \mathcal{S}) \geq U_i(\sigma'_i, \sigma_{-i}, \mathcal{S}) \ \forall i, \sigma'_i$$

Other welfare outcomes

Bidder surplus:
$$U(\sigma, \mathcal{S}) = \sum_{i=1}^N U_i(\sigma, \mathcal{S})$$

Revenue:
$$R(\sigma, \mathcal{S}) = \int_{v \in V^N} \int_{s \in \mathcal{S}} \int_{b \in B^N} \max_i b_i \sigma(b|s) \pi(ds|v) P(dv)$$

Total surplus:
$$T(\sigma, \mathcal{S}) = R(\sigma, \mathcal{S}) + U(\sigma, \mathcal{S})$$

Efficient surplus:
$$\bar{T} = \int_{v \in V} \max_i v_i P(dv)$$

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- ▶ On the whole, efficient allocation reduces gains from deviating up
- ▶ Suggests minimizing equilibrium is efficient, winning bid is constrained by *loser's (i.e., lowest) value*

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- ▶ Consider complete information, all values are common knowledge
- ▶ High value bidder wins and pays second highest value

Average losing values I

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- ▶ Winner is still high value bidder, but losing bidders don't know who has which value
- ▶ If prior is symmetric, believe they are equally likely to be at any point in the distribution *except* the highest
- ▶ In equilibrium, winner pays *average of $N - 1$ lowest values*:

$$\mu(v_1, \dots, v_N) = \frac{1}{N-1} \left(\sum_{i=1}^N v_i - \max_i v_i \right)$$

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- ▶ $Q(dm)$ is distribution of $m = \mu(v)$ (assume non-atomic)
- ▶ Minimum winning bid and revenue:

$$\begin{aligned}\underline{\beta}(m) &= \frac{1}{Q^{\frac{N-1}{N}}(v)} \int_{x=\underline{v}}^v x \frac{N-1}{N} \frac{Q(dx)}{Q^{\frac{1}{N}}(x)} \\ &= \frac{1}{Q^{\frac{N-1}{N}}(v)} \int_{x=\underline{v}}^v x Q^{\frac{N-1}{N}}(dx)\end{aligned}$$

- ▶ Minimum revenue:

$$\underline{R} = \int_{m=\underline{v}}^{\bar{v}} \underline{\beta}(m) Q(dm)$$

- ▶ Let $\underline{H}(b) = Q(\underline{\beta}^{-1}(b))$

Main result

Theorem (Minimum winning bids)

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2. *Moreover, there exists an information structure and an efficient equilibrium in which the distribution of winning bids is exactly \underline{H} .*

Implications

Corollary (Minimum revenue)

Minimum revenue over all information structures and equilibria is \underline{R} .

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Minimum revenue over all information structures and equilibria is \underline{R} .

Corollary (Maximum bidder surplus)

Maximum total bidder surplus over all information structures and equilibria is $\overline{T} - \underline{R}$.

Proof methodology

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- ▶ All bidders use the monotonic pure-strategy $\underline{\beta}(s_i)$

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- ▶ Solution is precisely

$$\sigma(s_i) = \frac{1}{Q^{\frac{N-1}{N}}(s_i)} \int_{x=\underline{v}}^{s_i} x Q^{\frac{N-1}{N}}(dx) = \underline{\beta}(s_i)$$

Downward deviations

- ▶ Expectation of the bidder with the highest signal is $\tilde{v}(s_i) \geq s_i$
- ▶ Downward deviator obtains surplus

$$(\tilde{v}(s_i) - \underline{\beta}(m))Q^{\frac{N-1}{N}}(m)$$

and

$$\begin{aligned} & (\tilde{v}(s_i) - \underline{\beta}(m)) Q^{\frac{N-1}{N}}(dm) - \underline{\beta}'(m)Q^{\frac{N-1}{N}}(m) \\ & \geq (s_i - \underline{\beta}(m)) Q^{\frac{N-1}{N}}(dm) - \underline{\beta}'(m)Q^{\frac{N-1}{N}}(m) \end{aligned}$$

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- ▶ Well-known that IPV surplus is single peaked: if $m < s_i$,

$$\implies (s_i - \underline{\beta}(m))Q^{\frac{N-1}{N}}(dm) - \underline{\beta}'(m)Q^{\frac{N-1}{N}}(dm) \geq 0$$

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- ▶ By deviating up to win on this event, gain m in surplus

Upward deviations

- ▶ Upward deviator's surplus

$$(\tilde{v}(s_i) - \underline{\beta}(m))Q^{\frac{N-1}{N}}(s_i) + \int_{x=s_i}^m (x - \underline{\beta}(m))Q^{\frac{N-1}{N}}(dx)$$

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- ▶ In effect, correlation between others bids' and losing values induces adverse selection s.t. losing bidders are indifferent to deviating up

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 5. All uniform upward IC bind

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- ▶ Note

$$H(b) = \int_{v \in V^N} \sum_{i=1}^N H_i(b|v) P(dv)$$

Relaxed program

- ▶ Also impose *uniform upward incentive constraints* (IC):

$$\underbrace{\int_{\underline{v} \in V^N} \int_{x=\underline{v}}^b (b-x) H_i(dx|v) P(dv)}_{\text{loss when would have won}} \geq \underbrace{\int_{\underline{v} \in V^N} \int_{x=\underline{v}}^b (v_i - b) \sum_{j \neq i} H_j(dx|v) P(dv)}_{\text{gain when would have lost}}$$

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- ▶ Relaxed program: for fixed $f(b)$ that is weakly increasing,

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- ▶ Note: Objective and constraints are *linear* in H_i

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- ▶ For example, with $N = 2$, can create symmetric solution:

$$\begin{aligned}\tilde{H}_1(b|v_1, v_2) &= \frac{1}{2} (H_1(b|v_1, v_2) + H_2(b|v_2, v_1)) \\ \tilde{H}_2(b|v_1, v_2) &= \frac{1}{2} (H_2(b|v_1, v_2) + H_1(b|v_2, v_1))\end{aligned}$$

Average losing values III

- ▶ Consider a bidder who uniformly deviates up, so they *always* win when the equilibrium winning bid is b
- ▶ Say there is a value profile v at which b is sometimes the winning bid
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- ▶ But someone has to win in equilibrium...
- ▶ Incremental gain from winning when you would lose in equilibrium is the *average losing value* given $[v]$:

$$\mu(v) = \frac{1}{N-1} \left(\sum_{i=1}^N v_i - \text{expected winner's value} \right)$$

Efficiency

- ▶ Can rewrite gain from upward deviating as

$$\int_{v \in V^N} \int_{x=\underline{v}} (\mu(v) - b) \frac{N-1}{N} \sum_i H_i(dx|v) P(dv)$$

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- ▶ Can always induce efficient allocation without changing $H(b)$:
If $v_i = \max v$, set

$$\tilde{H}_i(b|v) = \frac{1}{|\arg \max v|} \sum_{j=1}^N H_j(b|v)$$

Relaxed program II

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- ▶ Recall $Q(dm)$ is distribution of m
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$$\min \int_{m=\underline{v}}^{\bar{v}} \int_{b=\underline{v}}^{\bar{v}} f(b)H(db|m)Q(dm)$$

subject to

$$0 \leq H(b|m) \leq 1 \quad (\text{Feas})$$

and

$$\begin{aligned} \frac{1}{N} \int_{m=\underline{v}}^{\bar{v}} \int_{x=\underline{v}}^b (b-x)H(dx|m)Q(dm) \\ \geq \frac{N-1}{N} \int_{m=\underline{v}}^{\bar{v}} (m-b)H(b|m)Q(dm) \end{aligned} \quad (\text{IC})$$

Monotonicity

- ▶ Only part of (IC) that depends on correlation between b and m is

$$\hat{m}(b) = \int_{m=\underline{v}}^{\bar{v}} m H(b|m) Q(dm),$$

i.e., average losing value when winning bid is less than b

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- ▶ Can minimize $\hat{m}(b)$ *pointwise* by making b and m *comonotonic*,
i.e., the α lowest m are associated with the α lowest b
- ▶ Implies a *deterministic winning bid* $\beta(m)$ s.t. for all m ,

$$H(\beta(m)) = Q(m)$$

Relaxed program III

- ▶ Relaxed program is reduced to what we assumed in example:

$$\min \int_{m=\underline{v}}^{\bar{v}} f(\beta(m))Q(dm)$$

subject to $\beta(m) \geq \underline{v}$ and

$$\begin{aligned} \frac{1}{N} \int_{x=\underline{v}}^m (\beta(m) - \beta(x))Q(dx) \\ \geq \frac{N-1}{N} \int_{x=\underline{v}}^{\bar{v}} (x - \beta(m))Q(dx) \end{aligned} \tag{IC}$$

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- ▶ Minimize $\beta(m)$ pointwise by $\beta(\underline{v}) = \underline{v}$ and (IC) binding everywhere
- ▶ Solution is precisely $\underline{\beta}$!

Wrapping up

- ▶ \underline{H} solves the relaxed program for an arbitrary $f(\max b)$
- ▶ Must therefore be FOSD by any equilibrium $H(b)$
- ▶ Construction attains \underline{H} , so proof of theorem is complete

Maximum revenue

- ▶ With pure common value, no-information and complete information induce full surplus extraction
- ▶ Not true with idiosyncratic values:
 - ▶ No-information induces inefficiency
 - ▶ Complete information gives rents to bidders
- ▶ Nonetheless...

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Theorem (Maximum revenue and minimum bidder surplus)

For every $\epsilon > 0$, there exists an information structure and equilibrium such that revenue is at least $\bar{T} - \epsilon$ and bidder surplus is at most ϵ .

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- ▶ Weak dominance: players do not bid more than own value

A lower bound bidder surplus

- ▶ If bid b , always win when others' values are less than b
- ▶ Lower bound on bidder surplus $\underline{U}_i(v_i)$ from best responding to “worst case” in which others bid their values:

$$\underline{U}_i(v_i) = \max_b \left\{ (v_i - b) \int_{\{v_{-i} \mid \max_{j \neq i} v_j \leq b\}} P(dv_{-i} \mid v_i) \right\}$$

- ▶ Integrate over values to obtain an ex-ante bound \underline{U}_i

Maximum revenue/minimum bidder surplus

Theorem (Known values)

1. *There exists an equilibrium in which every bidder receives surplus \underline{U}_i , thus attaining minimum bidder surplus with known values.*

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2. *Moreover, this equilibrium is efficient, thus attaining maximum revenue with known values.*

Proof sketch

- ▶ Bidders with $v_i < \max v$ see entire profile v
- ▶ Known they will lose to some $b_j \geq v_i$
- ▶ \implies losers bid $b_i = v_i$

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- ▶ High valuation bidder learns he has the high value
- ▶ Receives partial information about losers' values such that
 - (i) He outbids the others with probability 1
 - (ii) Indifferent between equilibrium bid and the bid that generates \underline{U}_i

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 - (ii) Indifferent between equilibrium bid and the bid that generates \underline{U}_i
- ▶ Uses ideas from “The Limits of Price Discrimination”, BBM 2015

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- ▶ With unknown values, likelihood may depend on b and distribution of others' values
- ▶ Example: higher winning bids occur when values are higher on average
- ▶ If equilibrium is efficient and v_i is low, I am unlikely to win in equilibrium at high bids
- ▶ Increase in probability of winning from upward deviation varies with v_i

Binary known values

- ▶ Case we can solve completely: $v_i \in \{v_L, v_H\}$
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- ▶ General known values minimum revenue is an open question

Other directions

- ▶ We talked about max/min revenue, max/min bidder surplus
- ▶ What about weighted sums? Minimum efficiency?

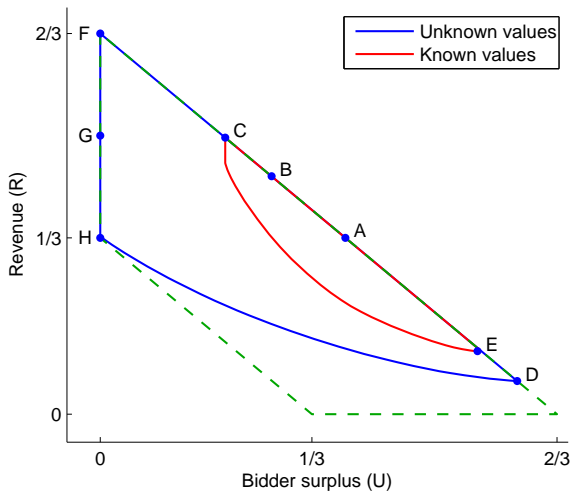
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- ▶ Solved numerically for two bidder i.i.d. $U[0, 1]$ model

Welfare set



- Note: Lower bound on efficiency

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- ▶ Context:
 - ▶ Part of a larger agenda on robust predictions and information design

Thank you!