

# Auctions and Other Games with Max-Min Players

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# Multi-unit auctions

Multi-unit auctions common when principal allocates many homogeneous units.

- Treasury securities
  - 2016: \$8.6tn (U.S.), 526bn € (Fr.), £146bn (U.K.)
- Quantitative easing
- Electricity distribution

Know little about equilibrium in these auctions in presence of private information.

# Multi-unit auctions

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## Appeal to authority

“Unfortunately, computing equilibrium strategies in (asymmetric) discriminatory multi-unit auctions is still an open question [...]”

Hortaçsu and Kastl, 2012

# General concept

Max-min utility provides a tractable approach to private information.

- Equilibrium existence
- Strategy selection to combat “anything goes” results
  - Natural limit of risk aversion
  - Limit as ambiguity aversion allows for arbitrary concentration
  - Relation to optimizing “but for”
- Uniqueness of selection

Game theoretic results extend to related settings—oligopoly, cooperation, etc. In the process of formalizing.

# Multi-unit auction results

- Equilibrium existence/uniqueness
- In pay-as-bid auctions:
  - Near-efficiency with private values
  - Rent near-extraction with private values
- Revenue and efficiency comparisons across mechanisms
- Clean generalization to interdependent value case

## Related literature

### **Multi-unit auctions (theory)**

Maskin and Riley, 1989; Engelbrecht-Wiggans and Kahn, 2002; Ausubel et al., 2015; Burkett and Woodward, 2016

### **Multi-unit auctions (empirics)**

Février et al., 2002; Castellanos and Oviedo, 2004; Armantier and Sbaï, 200x; Kang and Puller, 2008; Hortaçsu and McAdams, 2010

### **Divisible-good auctions**

Wilson, 1979; Klemperer and Meyer, 1989; Back and Zender, 1993; Wang and Zender, 2002; Anderson et al., 2013; Pycia and Woodward, 2016

### **Max-min mechanism design**

Lo, 1998; Bose et al., 2006; Chen et al., 2007; de Castro and Yannelis, 2010; Bodoh-Creed, 2012; Di Tillio et al., 2012; Bose and Renou, 2014; Lopomo et al., 2014; de Castro et al. 2015; Wolitzky, 2016

# Model

Presentation model:

- $n$  bidders
- $Q$  indivisible units,  $1 \leq Q \leq (n-1)d$
- Value for  $k^{\text{th}}$  unit is  $\theta_k^i \in [0, \bar{\theta}]$ ; assume full support,  $\theta^i \in [0, \bar{\theta}]^d$
- Weakly decreasing bids  $b_k^i \in \{0, \varepsilon, \dots, \bar{m}\varepsilon\}$  (wlog  $\bar{m}\varepsilon \leq \bar{\theta}$ )
- $Q$  highest bids win; ties broken by random bidder order

# Multi-unit auctions

If allocation is  $q_i$ , utility is

$$\sum_{k=1}^{q_i} \theta_k^i - t^i(b^i, b^{-i})$$

**Pay-as-bid:** price discrimination against reported demand,

$$t^i(b^i, b^{-i}) = \sum_{k=1}^{q_i} b_k^i$$

**Uniform price:** constant per-unit marginal price,

$$t^i(b^i, b^{-i}) = b^{(Q)} q_i$$



# Max-min equilibrium

## Definition (Max-min equilibrium)

A strategy profile  $(s_i)_{i=1}^n$  is a *max-min equilibrium* if for all agents  $i$ , all types  $\theta_i$ , and all actions  $\tilde{a}_i \in A_i$ ,

$$\inf_{\theta_{-i}} u^i(s_i(\theta_i), s_{-i}(\theta_{-i}); \theta) \geq \inf_{\theta_{-i}} u^i(\tilde{a}_i, s_{-i}(\theta_{-i}); \theta).$$

A strategy profile is a max-min equilibrium if for any other action there is a belief over opponent types that generates lower worst-case utility.

# Max-min equilibrium: existence

## Theorem

*There exists a max-min equilibrium.*

# Max-min equilibrium: IPV first-price auction

Except for very high types ( $\bar{\theta} \geq \bar{m}\varepsilon$ ), anything goes: any bid weakly below value is supportable in equilibrium.

- Very high types can play  $b(\bar{\theta}) = \bar{m}\varepsilon < \bar{\theta}$ 
  - Bidding higher is impossible
  - Bidding lower implies lose to opponent  $\bar{\theta}$ , utility 0
- Lower types bid anything below value
  - If bid above value, worst case is winning the auction, negative utility
  - If bid below value, worst case is losing (to, e.g.,  $\bar{\theta}$ ), indifferent across all losses

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Can we sharpen predictions, respecting analogy to risk aversion?

# Upside dominance

Let  $\underline{u}^i(a_i, s_{-i}; \theta_i) = \inf_{\tilde{\theta}_{-i}} u^i(a_i, s_{-i}(\tilde{\theta}_{-i}); \tilde{\theta})$ .

## Definition (Upside dominance)

Action  $a_i$  *upside dominates* action  $a'_i$  if there is  $\bar{\varepsilon} > 0$  such that for all  $\varepsilon \in (0, \bar{\varepsilon})$ ,

$$\begin{aligned} & \{ \theta_{-i} : u^i(a_i, s_{-i}(\theta_{-i}); \theta) \geq \underline{u}^i(a_i, s_{-i}; \theta_i) + \varepsilon \} \\ & \supseteq \{ \theta_{-i} : u^i(a'_i, s_{-i}(\theta_{-i}); \theta) \geq \underline{u}^i(a'_i, s_{-i}; \theta_i) + \varepsilon \}. \end{aligned}$$

This is strict for some  $\varepsilon' \in (0, \bar{\varepsilon})$ .

Two max-min best responses are upside-dominance ordered if one is more likely to guarantee (possibly small) upside.

# Limit of risk aversion

Non-formal analogy: for an appropriate strictly concave function  $f$ ,

$$\lim_{t \nearrow \infty} \left| \underbrace{f \circ \dots \circ f}_{t \text{ times}}(u') - \underbrace{f \circ \dots \circ f}_{t \text{ times}}(u) \right| = 0$$

The magnitude of potential gains becomes irrelevant, only the probability of gains matters.

# Upside dominance in first-price auctions

Suppose that equilibrium bid distribution has full support (e.g., reports are essentially truthful). Compare  $b' < b < \theta^i$ .

- Lower bid  $b'$  gives higher margins, lower probability
- Higher bid  $b$  gives lower margins, higher probability

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$$\exists \theta^{-i}, b^{-i} (\theta^{-i}) \in (b', b] \implies b \succ_{\text{UD}} b'$$



# Filtration

Fix a profile of opponent strategies. Idea:

- Start with full set of actions and opponent types
- Find max-min best responses in these sets
- Remove all opponent types against which the agent is indifferent across all max-min best responses
- Repeat until no opponent types removed

# Filtration

In FPA, suppose opponents submit highest bid strictly below value.

- I am indifferent across all bids weakly below my value
- All opponent type profiles who bid weakly above my value give me max-min outcomes
- Throw away these opponents, everyone who remains bids strictly below my value
- My unique max-min best response is the highest bid strictly below my value

# Filtration

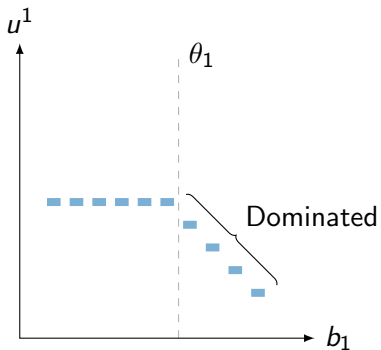


Figure: Worst-case utility, assuming truthful bidding by opponent.

# Filtration

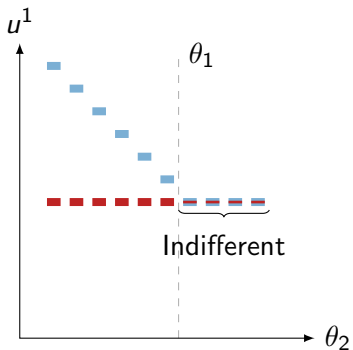


Figure: Maximum and minimum utility from max-min action set.

# Filtration

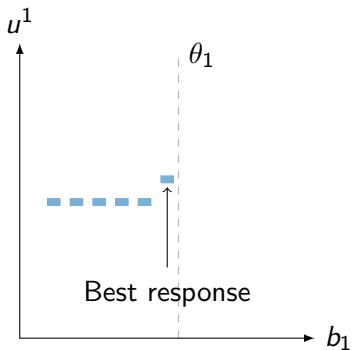


Figure: Worst-case utility in reduced opponent type space.

# Upside dominant equilibrium

## Definition (Upside-dominant equilibrium)

A strategy profile  $(s_i)_{i=1}^n$  is an *upside-dominant equilibrium* if it is a max-min equilibrium, and for each agent  $i$  and type  $\theta^i$  there is no action  $\tilde{a}_i$  that upside dominates  $s_i(\theta^i)$ .

# Pay-as-bid: equilibrium existence

## Theorem

*The pay-as-bid auction admits an upside-dominant equilibrium.*

Proof is constructive, but intuition should generalize:

- WLOG actions are monotone in type
- In equilibrium, worst outcome is when opponent has high type
- Start at PSNE in full-information auction with only high types
- Sweep types downward, filling in upside-dominant max-min best response

# Pay-as-bid: equilibrium

There is an equilibrium in which

$$b_k^i(\theta^i) = \begin{cases} \max \{ \kappa \in \mathcal{K} : \kappa < \theta_k^i \} & \text{if } \theta_k^i > 0, \\ 0 & \text{otherwise.} \end{cases}$$

- Full support of values implies full support of bids, implies all allocations feasible
- Then sum of bids is weakly below sum of values
- If bid for  $k$  above value for  $k$ , can reduce bid on  $k$  without sacrificing net utility
- If bid below prescribed bid, can increase and capture (small) gain against some opponents, keeping all existing positive margins strict



# Pay-as-bid: uniqueness

If  $n \geq 3$  and the bidding grid is evenly spaced, equilibrium bids are unique for all  $\theta \leq (\bar{m} - 1)\varepsilon < \bar{\theta} - \varepsilon$ .

Conditions have to do with tiebreaking. Generally:

- For any grid we have (essential) uniqueness for  $n$  sufficiently large
- For any  $n$ , equilibria  $(b^i)$  and  $(\hat{b}^i)$  differ by  $\|b^i - \hat{b}^i\| = O(\text{maximum grid step})$

# Properties of equilibrium

Except for highest types, bidders report as truthfully as possible (respecting IR).

If sufficiently high bids are available:

- Ex post allocation is essentially efficient (gap is  $O(\text{maximum grid step})$ )
- Ex post revenue captures essentially all bidder rents (gap is  $O(\text{maximum grid step})$ )
- Essentially no role for reserve prices or supply restrictions

# Uniform-price: equilibrium

Pay-as-bid logic implies same equilibrium in uniform-price auction. Except for lowest types, bids are strictly below values in all equilibria.

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- Pay-as-bid bids weakly exceed uniform-price bids
- Pay-as-bid revenue is strictly higher for all strictly-decreasing type realizations
- Uniform-price is (weakly) less efficient

# Interdependent values

Consider interdependent single-unit auction model,

$$v^i = \theta^i + \alpha \sum_{j \neq i} \theta^j \quad (\alpha > 0)$$

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**Pay-as-bid:** equilibrium unchanged,

$$b_k^i(\theta^i) = \begin{cases} \max \{ \kappa \varepsilon : \kappa \varepsilon < \theta_k^i \} & \text{if } \theta_k^i > 0, \\ 0 & \text{otherwise.} \end{cases}$$

**Uniform-price:** equilibrium still bounded by pay-as-bid equilibrium

# Equilibrium properties

In pay-as-bid, bids are unchanged *even though values increase almost surely*.

- Bidders retain rents, give away (most of) minimum possible rents conditional on own type
- Inefficient outcomes arise
  - Suppose  $\theta_1^i \gg \theta_Q^i > \theta_1^j \gg \theta_Q^j$ ; then  $i$  gets  $Q$  units,  $j$  gets 0
  - Then for  $\alpha$  sufficiently large,

$$v_1^j = \theta_1^j + \alpha\theta_1^i > \theta_Q^j + \alpha\theta_Q^i = v_Q^j$$

- Holding average ex post values constant, revenues decrease in interdependence

Nonetheless, still no role for reserve price or supply optimization in pay-as-bid.

# Conclusion

Considered canonical multi-unit auction formats with max-min bidders.

- Existence of upside-dominant equilibria
- Near-uniqueness of equilibrium in pay-as-bid
  - Near-full rent extraction in private values case
  - Near-efficiency in private values case
- Revenue and efficiency dominance of pay-as-bid
- Equilibrium strategies carry over simply to interdependent values model

Working on extending results to more general class of models.