

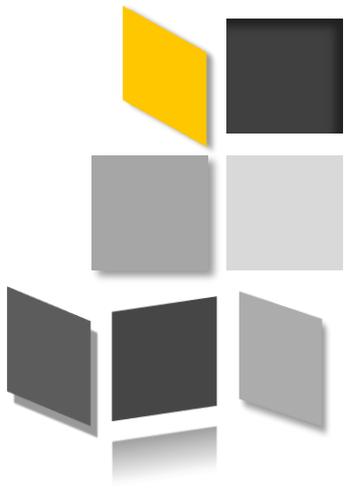
**COMP/MATH 553 Algorithmic  
Game Theory  
Lecture 7: Bulow-Klemperer &  
VCG Mechanism**

Sep 24, 2014

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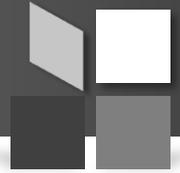
## An overview of today's class

- 
- Prior-Independent Auctions & Bulow-Klemperer Theorem*
  - General Mechanism Design Problems*
  - Vickrey-Clarke-Groves Mechanism*



# Prior-Independent Auctions

# Another Critique to the Optimal Auction



- ❑ What if your distributions are *unknown*?
- ❑ When there are many bidders and enough past data, it is reasonable to assume you know exactly the value distributions.
- ❑ But if the market is “thin”, you might not be confident or not even know the value distributions.
- ❑ Can you design an auction that does not use any knowledge about the distributions but performs *almost as well as* if you know *everything* about the distributions.
- ❑ Active research agenda, called prior-independent auctions.

# Bulow-Klemperer Theorem



**[Bulow-Klemperer '96]** For any regular distribution  $F$  and integer  $n$ .

$$\mathbb{E}_{v_1, \dots, v_{n+1}} [\text{REV}(\text{Vickrey})] \geq \mathbb{E}_{v_1, \dots, v_n} [\text{REV}(\text{Myerson})]$$

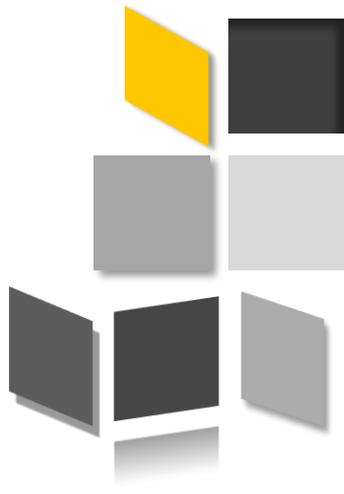
Remark:

- Vickrey's auction is prior-independent!
- This means with the same number of bidders, Vickrey Auction achieves at least  $n-1/n$  fraction of the optimal revenue. (exercise)
- More competition is better than finding the right auction format.

# Proof of Bulow-Klemperer

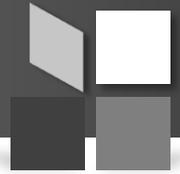


- Consider another auction  $M$  with  $n+1$  bidders:
  1. Run Myerson on the first  $n$  bidders.
  2. If the item is unallocated, give it to the last bidder for free.
- This is a *DSIC* mechanism. It has the *same* revenue as Myerson's auction with  $n$  bidders.
- Notice that its allocation rule always gives out the item.
- Vickrey Auction also always gives out the item, but always to the bidder who has the highest value (also with the highest virtual value).
- Vickrey Auction has the highest virtual welfare among all DSIC mechanisms that always give out the item! □



# General Mechanism Design Problem (Multi-Dimensional)

# Multi-Dimensional Environment



- ❑ So far, we have focused on single-dimensional environment.
- ❑ In many scenarios, bidders have different value for different items.
  - Sotherby's Auction:



## ❑ Multi-Dimensional Environment

- $n$  strategic participants/agents,
- a set of possible outcomes  $\Omega$ .
- agent  $i$  has a private value  $v_i(\omega)$  for each  $\omega$  in  $\Omega$  (abstract and could be large).

# Examples of Multi-Dimensional Environment

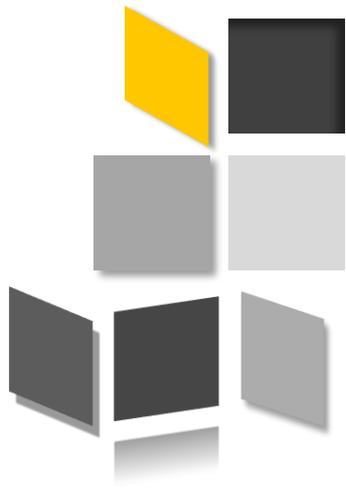


- ❑ Single-item Auction in the single-dimensional setting:
  - $n+1$  outcomes in  $\Omega$ .
  - Bidder  $i$  only has positive value for the outcome in which he wins, and has value  $0$  for the rest  $n$  outcomes
  
- ❑ Single-item Auction in the multi-dimensional setting:
  - Imagine you are not selling an item, but auctioning a startup who has a lot of valuable patents.
  - $n$  companies are competing for it.
  - Still  $n+1$  outcomes in  $\Omega$ .
  - But company  $i$  doesn't win, it might prefer the winner to be someone in a different market other than a direct competitor.
  - So besides the outcome that  $i$  wins,  $i$  has different values for the rest  $n$  outcomes.

# How do you optimize Social Welfare (Non-bayesian)?



- ❑ What do I mean by optimize social welfare (algorithmically)?
  - $\omega^* := \operatorname{argmax}_{\omega} \sum_i v_i(\omega)$
  
- ❑ How do you design a DSIC mechanism that optimizes social welfare.
  - Take the same two-step approach.
  - Sealed-bid auction. Bidder  $i$  submits  $b_i$  which is indexed by  $\Omega$ .
  - Allocation rule is clear: assume  $b_i$ 's are the true values and choose the outcome that maximizes social welfare.
  - In single-dimensional settings, once the allocation rule is decided, Myerson's lemma tells us the unique payment rule.
  - In multi-dimensional settings, Myerson's lemma doesn't apply ... How can you define monotone allocation rule when bids are multi-dimensional?
  - Similarly, how can we define the payment rule even if we know the allocation rule.



# Vickrey-Clarke-Groves (VCG) Mechanism

# The VCG Mechanism



[The Vickrey-Clarke-Groves (VCG) Mechanism] In every general mechanism design environment, there is a DSIC mechanism that maximizes the social welfare. In particular the allocation rule is

$$x(b) = \operatorname{argmax}_w \sum_i b_i(w) \quad (1);$$

and the payment rule is

$$p_i(b) = \max_w \sum_{j \neq i} b_j(w) - \sum_{j \neq i} b_j(w^*) \quad (2),$$

where  $w^* = \operatorname{argmax}_w \sum_i b_i(w)$  is the outcome chosen in (1).

# Understand the payment rule



□ What does the payment rule mean?

- $p_i(\mathbf{b}) = \max_{\omega} \sum_{j \neq i} b_j(\omega) - \sum_{j \neq i} b_j(\omega^*)$
- $\max_{\omega} \sum_{j \neq i} b_j(\omega)$  is the optimal social welfare when  $i$  is not there.
- $\omega^*$  is the optimal social welfare outcome, and  $\sum_{j \neq i} b_j(\omega^*)$  is the welfare from all agents except  $i$ .
- So the difference  $\max_{\omega} \sum_{j \neq i} b_j(\omega) - \sum_{j \neq i} b_j(\omega^*)$  can be viewed as “the **welfare loss** inflicted on the other  $n-1$  agents by  $i$ ’s presence”. Called “externality” in Economics.
- Example: single-item auction.
  - If  $i$  is the winner,  $\max_{\omega} \sum_{j \neq i} b_j(\omega)$  is the second largest bid.
  - $\sum_{j \neq i} b_j(\omega^*) = 0$ .
  - So exactly second-price.

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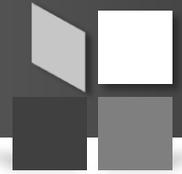
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where  $w^* = \operatorname{argmax}_w \sum_i b_i(w)$  is the outcome chosen in (1).

Proof: See the board!

# Discussion of the VCG mechanism



- ❑ *DSIC* mechanism that *optimizes social welfare* for *any* mechanism design problem !
  
- ❑ However, sometimes *impractical*.
  
- ❑ How do you find the allocation that maximizes social welfare. If  $\Omega$  is really large, what do you do?
  - m items, n bidders, each bidder wants only one item.
  - m items, n bidders, each bidder is single-minded (only like a particular set of items).
  - m items, n bidders, each bidder can take any set of items.
  
- ❑ Computational intractable.
  
- ❑ If you use approximation alg., the mechanism is no longer DSIC.