

## Welfare Maximization in Multidimensional Settings

*Multidimensional* or *multi-parameter* environments are ones where we need to elicit more than one piece of information per bidder. The most common settings include  $m$  heterogeneous (*different*) items and

- $n$  unit-demand buyers; buyer  $i$  has value  $v_{ij}$  for item  $j$  but only wants at most 1 item. (You only want to buy 1 house!)
- $n$  additive buyers: buyer  $i$ 's value for set  $S$  is  $\sum_{j \in S} v_{ij}$ .
- $n$  subadditive buyers for some subadditive functions
- $n$  buyers who are  $k$ -demand: buyer  $i$ 's value for a set of items  $S$  is  $\max_{|S'|=k, S' \subseteq S} \sum_{j \in S'} v_{ij}$ .
- $n$  matroid-demand buyers for some matroid
- ...

With  $m$  heterogeneous items, it's *possible* that our buyers could have different valuations for every single one of the  $2^m$  bundles of items—that is why this general setting is referred to as *combinatorial auctions*.

Then how can we maximize welfare in this setting? How can we do so *tractably*? How can we even elicit preferences in a tractable way?

**Theorem 1** (The Vickrey-Clarke-Groves (VCG) Mechanism). *In every general mechanism design environment, there is a DSIC welfare-maximizing mechanism.*

Given bids  $\mathbf{b}_1, \dots, \mathbf{b}_n$  where each bid is indexed by the possible outcomes  $\omega \in \Omega$ , we define the welfare-maximizing allocation rule  $\mathbf{x}$  by

Now that things are multidimensional, there's no more Myerson's Lemma! In multiple dimensions, what is monotonicity? What would the critical bid be?

Instead, we have bidders pay their *externality*—the loss of welfare caused due to  $i$ 's participation:

$$p_i(\mathbf{b}) =$$

where  $\omega^* = \mathbf{x}(\mathbf{b})$  is the outcome chosen when  $i$  *does* participate.

**Claim 1.** The VCG mechanism is DSIC.

**Exercise** (optional): Prove that the payment  $p_i(\mathbf{b})$  is always non-negative (and so the mechanism is IR).

## Ascending Auctions

In *ascending auctions*, an auctioneer initializes prices for each item, iteratively raises the prices, and bidders decide which items to bid on in each round. Sometimes *activity rules* are enforced, e.g., once you drop out on an item, you can not bid on it again.

The most famous ascending auction is the single-item version, the English Auction.

The English Auction( $\varepsilon$ ):

- a. Initialize the item's price  $p_0$  to
- b. The initial set  $S_0$  of “active bidders” (willing to pay  $p_0$  for the item) is
- c. For iteration  $t = 1, 2, \dots$ :
  - (a) Ask the set of active bidders  $S_{t-1}$ :

$$S_t =$$

(b) If  $|S_t| \leq 1$ :

(c) Otherwise,  $p_t$

Benefits of using ascending auctions:

- Ascending auctions are easier for bidders.
- Less information leakage.
- Transparency.
- Potentially more seller revenue.
- When there are multiple items, the opportunity for “price discovery.”

What about  $k$  identical items? What should we do here?

The English Auction for  $k$  Identical Items:

**Definition 1.** In an ascending auction, *sincere bidding* means that a player answers all queries honestly.

**Claim 2.** In the  $k$  identical item setting, in an English auction, sincere bidding is a dominant strategy for every bidder (up to  $\epsilon$ ).

**Claim 3.** In the  $k$  identical item setting, if all bidders bid sincerely in an English auction, the welfare of the outcome is within  $k\epsilon$  of the maximum possible.

The English auction for  $k$  Identical Items terminates in  $v_{\max}/\epsilon$  iterations.

Design process:

- a. As a sanity check, design a direct-revelation DSIC welfare-maximizing polytime mechanism.
- b. Implement this as an ascending auction.
- c. **(Truthfulness)** Check that its EPIC.
- d. **(Performance)** Check that it still maximizes welfare under sincere bidding.
- e. **(Tractability)** Check that it terminates in a reasonable number of iterations.

## Additive Valuations, Parallel Auctions

The Additive Setting: There are  $m$  non-identical items and  $n$  bidders where each bidder  $i$  has private valuation  $v_{ij}$  for each item  $j$ . Bidder  $i$  has an additive valuation for each set  $S$ , that is,

$$v_i(S) := \sum_{j \in S} v_{ij}.$$

Step 1: What is the welfare-optimal direct revelation mechanism here?

What's the analogous ascending implementation?

Is this DSIC?

**Definition 2.** A strategy profile  $(\sigma_1, \dots, \sigma_n)$  is an *ex post Nash equilibrium (EPNE)* if, for every bidder  $i$  and valuation  $v_i \in V_i$ , the strategy  $\sigma_i(v_i)$  is a best-response to every strategy profile  $\sigma_{-i}(\mathbf{v}_{-i})$  with  $\mathbf{v}_{-i} \in \mathbf{V}_{-i}$ .

In comparison, in a dominant-strategy equilibrium (DSE), for every bidder  $i$  and valuation  $v_i$ , the action  $\sigma_i(v_i)$  is a best response to every action profile  $\mathbf{a}_{-i}$  of  $\mathbf{A}_{-i}$ , whether of the form  $\sigma_{-i}(\mathbf{v}_{-i})$  or not.

**Definition 3.** A mechanism is *ex post incentive compatible (EPIC)* if sincere bidding is an ex post Nash equilibrium in which all bidders always receive nonnegative utility.

**Claim 4.** For  $n$  additive bidders with  $m$  heterogeneous items, in parallel English auctions, sincere bidding by all bidders is an ex post Nash equilibrium (up to  $m\varepsilon$ ).

## Unit Demand

The Unit-Demand Setting: There are  $m$  non-identical items and  $n$  bidders where each bidder  $i$  has private valuation  $v_{ij}$  for each item  $j$ . Bidder  $i$  is unit demand, that is, wants at most one item for any set  $S$ :

$$v_i(S) := \max_{j \in S} v_{ij}.$$

First, solve the direct-revelation problem. What do we observe about the welfare-maximizing allocation in the unit-demand setting?

Refresh yourself on what the VCG mechanism looks like. Then what does the analogous ascending auction look like?