

Last lec: Single parameter (single stuff)  
agent  $i$  has value  $V_i$ /unit-stuff

bids  $b_i$



$$U_i(\bar{b}) = V_i \cdot x_i(\bar{b}) - p_i(\bar{b})$$

★ Myerson's Lemma:

①  $(x, p)$  is DSIC  $\Leftrightarrow x(\cdot)$  is monotone  
 $\hookrightarrow \forall i, \forall b_i, x_i(b_i, b_{-i})$  w.r.t  $b_i$  is monotone.

②  $\exists$  unique  $p$  s.t.  $(x, p)$  is DSIC

③  $p$  has an explicit formula.

Pf:

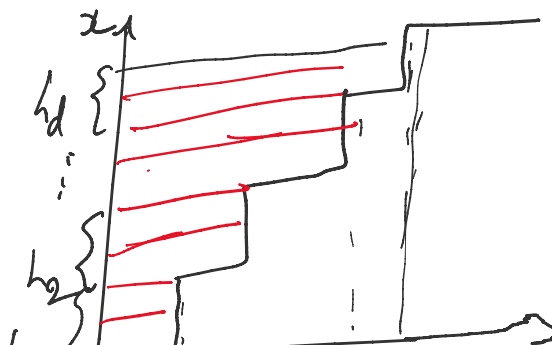
claim 1:  $(x, p)$  is DSIC  $\Rightarrow x(\cdot)$  is monotone.

claim 2: If  $(x, p)$  DSIC, then  $p$  has an explicit formula.

Fix  $i$ , Fix  $b_{-i}$

$$x(b_i) = x_i(b_i, b_{-i})$$

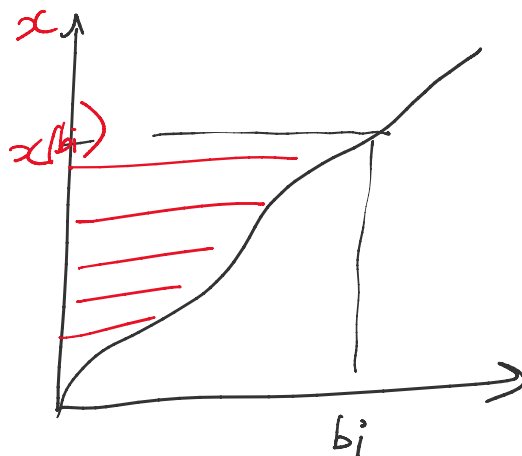
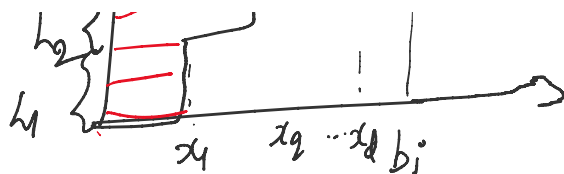
$$p(b_i) = p_i(b_i, b_{-i})$$



$$p(b_i) = p_i(b_1, b_{-1})$$

$$p(b_i) = \sum_{k=1}^d x_k \cdot h_k$$

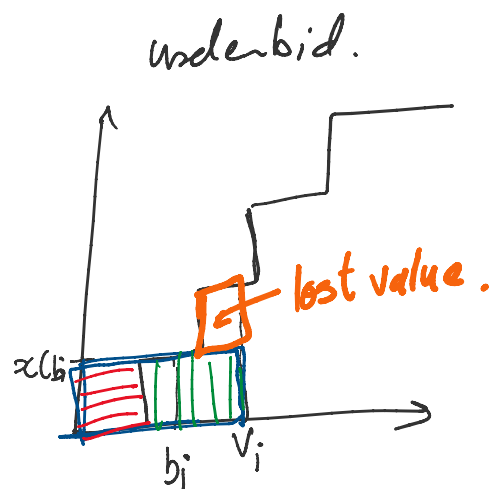
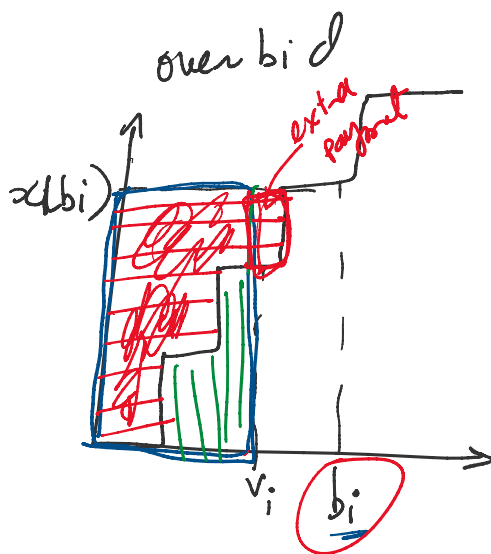
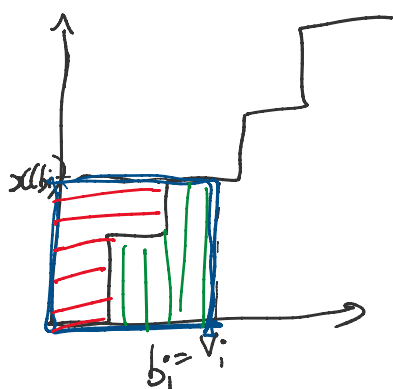
$$p(b_i) = \int_0^{b_i} z x'(z) dz$$



Claim 3: Such  $(x, p)$  is DSIC

PS: Fix  $i$ ,  $b_i$   $U_i = v_i \cdot x(b_i) - p_i$

True



★ Awesome Auctions.

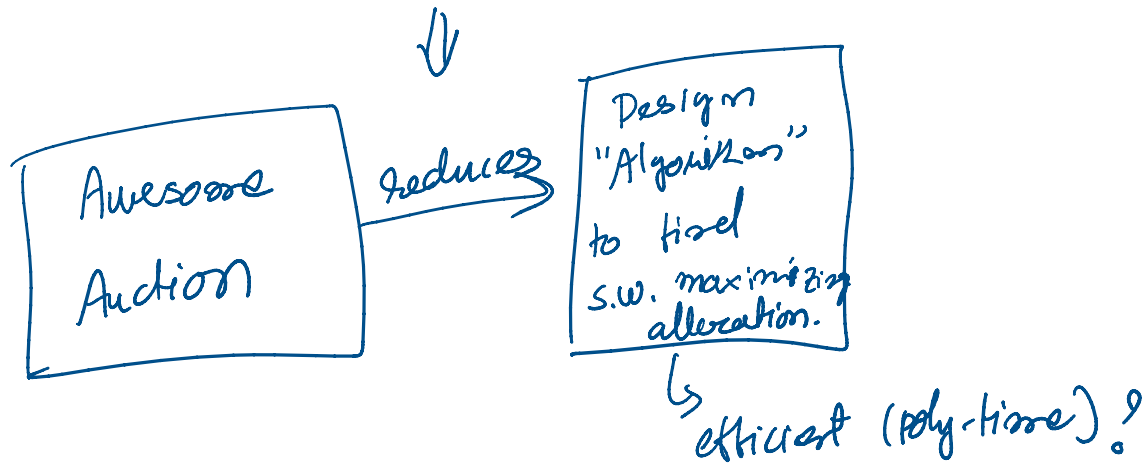
① DSIC ② s.w. maximizing ③ efficient implementation

↳ Fixes  $x(\cdot) = \arg \max_{x \in X} \sum_{i \in N} b_i x_i$

Monotone! YES! (ex).

Monotone! YES! (exe).

(pay 1)  
↳ Fixes  $P(\cdot)$  (Myerson's Lemma).



Eg: TV Ad. Auction.

We see a commercial break.

$N$ : set of advertisers.

$i \in N$ : ① ad of length  $a_i$  secs.

② value  $v_i$  (private)

③ bid  $b_i$

→ set of allocations

$$X = \left\{ x \in \{0,1\}^N \mid \sum_{i \in N} x_i a_i \leq w \right\}.$$

→ s.w. max allocation

$$x(\cdot) = \arg \max_{x \in X} \sum_{i \in N} x_i b_i \quad \leftarrow \text{Knapsack. NP-hard.}$$

★ Greedy Algo. ←

$$\textcircled{1} \quad \frac{b_1}{w_1} > \frac{b_2}{w_2} > \dots > \frac{b_n}{w_n}$$

allocate in this order until space allows.

Suppose allocate  $1, \dots, k$

$$\textcircled{2} \quad i^* \in \arg \max_i b_i \leftarrow$$

If  $\sum_{i=1}^k x_i b_i > b_{i^*}$  then allocate  $1, \dots, k$

else allocate only  $i^*$ .

Then: Greedy S.W.  $\geq \frac{1}{2}$  max. S.W.

ps: (exe).

Claim: Greedy allocation rule is monotone!

⇓

$\frac{1}{2}$  Auction: - DSC  
-  $k_2$  max S.W.  
- efficiently implementable

★  $(1+\epsilon)$ -approx. algo for knapsack

↳  $x(\cdot)$  is not monotone!

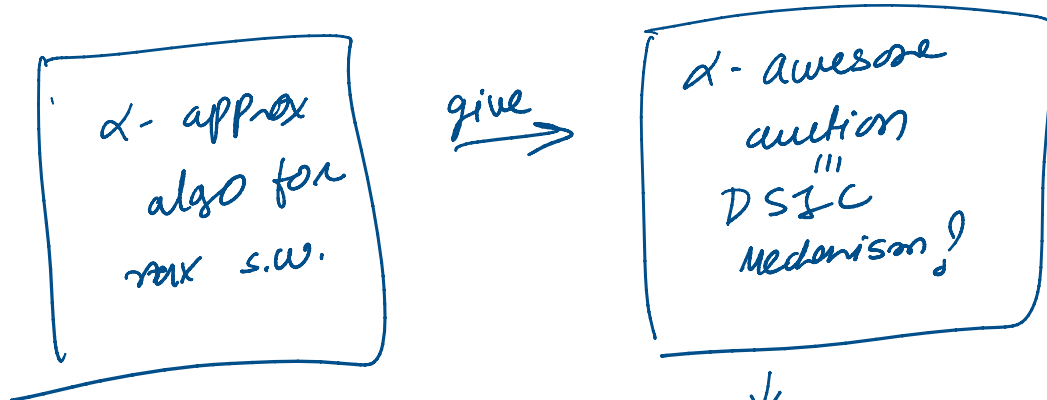
Can we make it monotone?

★ Many other settings give rise to NP-hard opt problems



\* Many other settings give rise to NP-hard prob.

- auctions facilities
- auction runtime time
- Spectrum auction.



YES, it corresponding  $\alpha(\cdot)$  is monotone.  
But  $\alpha(\cdot)$  need not be monotone.

Can be made monotone if  $X$  is downward closed.

if  $x \in X$  then  $\forall y \leq x, y \in X$ .

(clawik et al.)



General setting: Multi parameter.

e.g. auction of  $k$ -heterogeneous items

(painting, laptop, phone, pen, ...)

→  $\Omega$ : set of possible outcomes

Single-item.  
 $\Omega = \{i\text{-wins} \mid i \in N\}$

→  $\Omega$ : set of possible outcomes

→ For every agent  $i \in N$

①  $V_i: \Omega \rightarrow \mathbb{R}$  (Private)

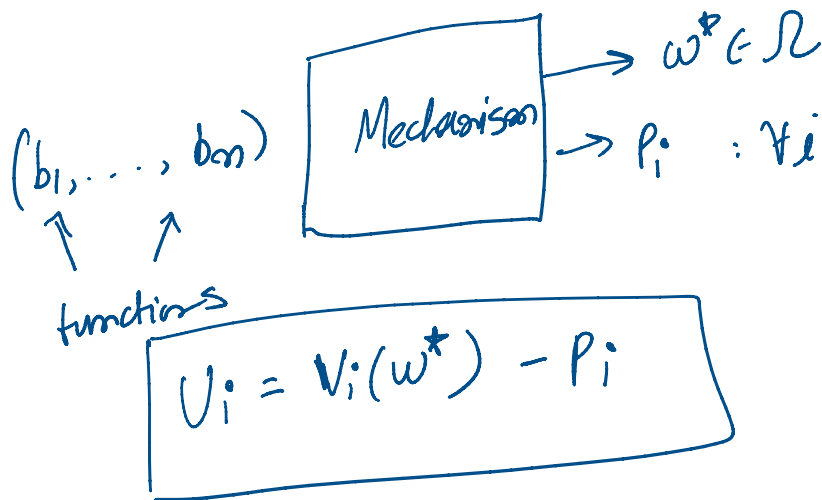
②  $b_i: \Omega \rightarrow \mathbb{R}$  (bid).

$$\Omega = \{i\text{-wins} \mid i \in N\}$$

$$V_i(i\text{-wins}) = V_i$$

$$V_i(j\text{-wins}) = 0 \quad \forall j \neq i$$

Goal: Design a DSIC Mechanism.



★ Vickrey-Clark-Groove (VCG) Mechanism:  
[only DSIC Mechanism].

①  $w^* \in \arg\max_{w \in \Omega} \sum_{i \in N} b_i(w)$

→ "pain" = "loss of value"

②  $p_i$  = "externality" agent  $i$  causes to the s.w. of everyone else by participating in the auction.

$$= \left[ \max_{w \in \Omega} \sum_{k \in N} b_k(w) \right] - \sum_{k \in N} b_k(w^*)$$

independent  $b_i$   $h_i(b_{-i})$

$$= \left[ \max_{w \in \Omega} \underbrace{\sum_{k \neq i} b_k(w)}_{\text{s.w. of others when } i \text{ does not participate}} \right] - \underbrace{\sum_{k \neq i} b_k(w^*)}_{\text{s.w. of others when } i \text{ participates}}$$

Thm: VCG is DSIC.

PS:

$$\begin{aligned} U_i &= V_i(w^*) - p_i \\ &= V_i(w^*) - \left( \underbrace{h_i(b_{-i})}_{\sum_{k \neq i} b_k(w^*)} \right) \\ &= \left[ V_i(w^*) + \sum_{k \neq i} b_k(w^*) \right] - h_i(b_{-i}) \end{aligned}$$

$\rightarrow$   $i$  wants maximize his quantity.

Though exp: suppose we allow  $i$  to pick the outcome.

$i$  pick:  $\arg \max_{w \in \Omega} V_i(w) + \sum_{k \neq i} b_k(w) \rightarrow$  some if  $b_i = V_i$

auctioneer picking:  $\arg \max_{w \in \Omega} b_i(w) + \sum_{k \neq i} b_k(w) \rightarrow$

$i$  achieves the goal by bidding  $b_i = V_i$  (truthfully).

1. achieve the goal - 0

(truthfully).



VCG is DSIC

IV.

Issues:

- ① Implementation efficient?
- ② Representation of bi  
10 items
- ③ Revenue.
- ④ Signaling (indirect implementation).

Q: Is VCG same as Myerson for  
single-parameter?

e.g. single item, K-identical items, sponsored  
search?