

# Algorithmic Game Theory

## LECTURE 3

# Main points covered:

- ▶ Single-Parameter Environments
- ▶ Allocation and Payment Rules
- ▶ Some Useful Definitions
- ▶ Myerson's Lemma
- ▶ Proof of Myerson's Lemma
- ▶ Applying the payment formula

# Single-Parameter Environments

(1/2)

- ▶ A generalization of the mechanism design problems introduced in Lecture 2

- ▶ Setup:

- ▶ ‘n’ agents (bidders)
- ▶ Each agent  $i$  has a private valuation  $v_i$ , her value “per unit of stuff” that she requires
- ▶ There’s a feasible set  $X$

Each element of  $X$  is a non-negative  $n$ -vector  $(x_1, x_2, \dots, x_n)$  where  $x_i$  denotes the “amount of stuff” given to agent  $i$

AUCTION		MECHANISM	
bidder	↔	agent	
bid	↔	report	
valuation	↔	valuation	

# Single-Parameter Environments

(2/2)

Some Examples to make things clear →

- ▶ Single-item auction → Here  $X$  is the set of 0-1 vectors that have at most one 1 i.e.,  $\sum_{i=1}^n x_i \leq 1$
- ▶ k-Unit Auctions → There are  $k$  identical items and each bidder can get at most one.  $\therefore X$  is the set of 0-1 vectors such that  $\sum_{i=1}^n x_i \leq k$
- ▶ Sponsored search auctions → Here,  $X$  is the set of  $n$ -vectors corresponding to the assignment of bidders to slots i.e., if bidder  $i$  is assigned to slot  $j$  then  $x_i$  is equal to  $\alpha_j$  (CTR of slot  $j$ )

# Allocation and Payment Rules

**RECAP:** In a sealed-bid auction, we need to make two decisions viz. 1) who wins and 2) who pays what

► We can formalize these as *allocation* and *payment rules* in 3 steps:

- Collect bids  $b = (b_1, b_2, \dots, b_n)$  |  $b$  = bid vector/ bid profile
- **[allocation rule]** Choose a feasible allocation  $x(b) \in X \subseteq \mathbb{R}^n$  as a function of the bids
- **[payment rule]** Choose payments  $p(b) \in \mathbb{R}^n$  as a function of the bids

Direct-revelation mechanism  
(agents directly reveal their  
private valuations)

Our new quasilinear utility model → Agent  $i$  receives utility  $u_i(b) = v_i \cdot x_i(b) - p_i(b)$  when the bid profile is  $b$ .

Note: We must have

1.  $p_i(b) \geq 0$  [so that seller does not have to pay to the agents]
2.  $p_i(b) \leq b_i \cdot x_i(b)$  [so that a truthful agent has non-negative utility]

Therefore,  $p_i(b) \in [0, b_i \cdot x_i(b)]$

# Some Useful Definitions

(1/2)

## Implementable Allocation Rule:

*An allocation rule  $x$  for a single-parameter environment is “implementable” if there is a payment rule  $p$  such that the direct-revelation mechanism  $(x, p)$  is DSIC.*

Example →

- ▶ In a single-item auction, we award the item to the highest bidder.
- ▶ Is this allocation rule implementable ?  
YES !
- ▶ The second-price payment rule is the answer as it renders the mechanism DSIC

### ❑ An Observation:

If we had wanted an allocation rule that awarded the item to 2<sup>nd</sup> highest bidder, then we **cannot** call it implementable !

There is no payment rule possible for such an allocation !

# Some Useful Definitions

(2/2)

## Monotone Allocation Rule:

*An allocation rule  $x$  for a single-parameter environment is monotone if for every agent  $i$  and bids  $b_{-i}$  by the other agents, the allocation  $x_i(z, b_{-i})$  is non-decreasing in her bid  $z$ .*

- ▶ In simple words, in a monotone allocation rule, bidding higher can only get you more stuff

Examples →

- ▶ In a single-item auction, allocating the item to highest bidder is “monotone”
  - ▶ If the winner(highest bidder) keeps raising her bid, she still remains winner !
- ▶ In single-item auction, allocating the item to 2<sup>nd</sup> highest bidder is “non-monotone”
  - ▶ If the winner(2<sup>nd</sup> highest bidder) raises her bid significantly, she may lose !
- ▶ The welfare maximizing allocation rule for sponsored search auctions where  $i^{\text{th}}$  highest bidder gets the  $i^{\text{th}}$  highest slot is “monotone”
  - ▶ On raising her bid, the bidder’s position can only increase !

# Myerson's Lemma

Fix a single-parameter environment:

- a) An allocation rule  $\mathbf{x}$  is implementable if and only if it is monotone
- b) If  $\mathbf{x}$  is monotone, then there is a unique payment rule for which the direct-revelation mechanism  $(\mathbf{x}, \mathbf{p})$  is DSIC and  $p_i(b) = 0$  whenever  $b_i = 0$
- c) The payment rule in (b) is given by an explicit formula

$$p_i(b_i, \mathbf{b}_{-i}) = \sum_{j=1}^l z_j \cdot [\text{jump in } x_i(\cdot, \mathbf{b}_{-i}) \text{ at } z_j]$$

where,  $z_1, z_2, \dots, z_l$  are the breakpoints of the allocation function  $x_i(\cdot, \mathbf{b}_{-i})$  in the range  $[0, b_i]$



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# Proof of Myerson's Lemma

(1/3)

Let us fix a single-parameter environment and consider  $x$  to be an allocation rule that may or may not be monotone.

**To show:** There exists a payment rule  $p$  such that the mechanism  $(x, p)$  is DSIC

We will use shorthand  $x(z)$  for  $x_i(z, b_{-i})$  and  $p(z)$  for  $p_i(z, b_{-i})$  when agent  $i$  bids 'z'

Now,

Suppose  $(x, p)$  is DSIC and consider any  $0 \leq y \leq z$

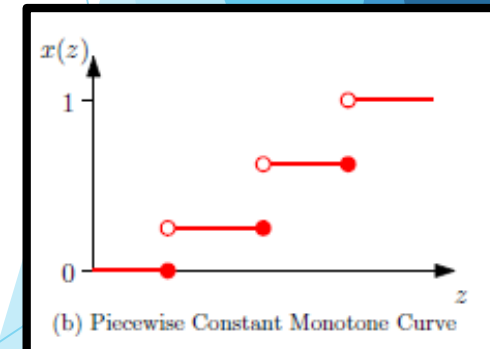
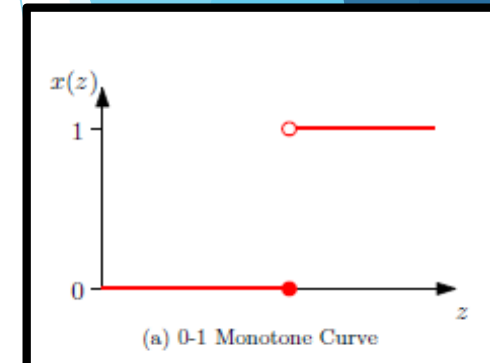
- ▶ Case 1: Agent  $i$  has private valuation  $z$  and submits false bid  $y$ . Then,

$$\underbrace{z \cdot x(z) - p(z)}_{\text{Utility of bidding } z} \geq \underbrace{z \cdot x(y) - p(y)}_{\text{Utility of bidding } y} \quad \dots(1)$$

- ▶ Case 2: Agent  $i$  has private valuation  $y$  and submits false bid  $z$ . Then,

$$\underbrace{y \cdot x(y) - p(y)}_{\text{Utility of bidding } y} \geq \underbrace{y \cdot x(z) - p(z)}_{\text{Utility of bidding } z} \quad \dots(2)$$

Two examples of possible allocation curves



# Proof of Myerson's Lemma

(2/3)

Rearranging (1) and (2) we get a “payment difference sandwich”

$$z.[x(y) - x(z)] \leq p(y) - p(z) \leq y.[x(y) - x(z)] \quad \dots(3)$$

The payment difference sandwich already implies that every implementable allocation rule is monotone

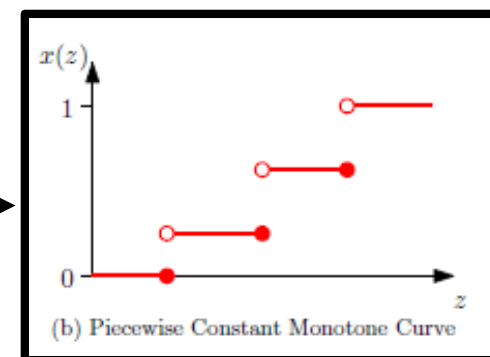
→ We can say  $x$  is monotone !

Next,

We consider  $x$  to be piece-wise constant [Fig.(b)]

We fix  $z$  and let  $y$  tend to  $z$  from above ( $y \downarrow z$ )

- ▶ Applying the limit in (3), the left and right sides become
  - ▶ 0 if there is no jump in  $x$  at  $z$
  - ▶ Tending to  $z.h$  if there is a jump of magnitude  $h$  at  $z$
  - ▶ Therefore, [jump in  $p$  at  $z$ ] =  $z.[\text{jump in } x \text{ at } z] \quad \dots(4)$
- ▶ Combining (4) with the initial condition  $p(0)=0$ , we get the required payment formula !



# Proof of Myerson's Lemma

(3/3)

Thus we have derived the payment formula for a piece-wise constant function

$$p_i(b_i, \mathbf{b}_{-i}) = \sum_{j=1}^l z_j \cdot [\text{jump in } x_i(\cdot, \mathbf{b}_{-i}) \text{ at } z_j]$$

Where,  $z_1, z_2, \dots, z_l$  are the breakpoints of the allocation function  $x_i(\cdot, \mathbf{b}_{-i})$  in the range  $[0, b_i]$

□ NOTE: The payment formula can be generalized to a case where  $x$  is not piece-wise constant. The formula would then take a form as follows:

$$p_i(b_i, \mathbf{b}_{-i}) = \int_0^{b_i} z \cdot \frac{d}{dz} x_i(z, \mathbf{b}_{-i}) dz$$

for every agent  $i$ , bid  $b_i$  and bids  $\mathbf{b}_{-i}$  by other agents.

# Applying the Payment Formula

(1/2)

## ► Single-item Auctions →

- Allocation Rule allocates item to the highest bidder
- Fixing a bidder  $i$  and bids  $b_{-i}$  by other agents, the function  $x_i(z, b_{-i})$  is 0 upto  $B = \max_{j \neq i} b_j$  and 1 thereafter
- Therefore, it is piece-wise constant !
- We can apply the payment formula
  - If  $b_i < B$ , payment = 0
  - If  $b_i > B$ , there is a single breakpoint (jump of 1 at  $B$ ), payment =  $B$

Thus, Myerson's Lemma regenerates the second-price payment rule as a special case !

# Applying the Payment Formula

(2/2)

## ► Sponsored Search Auctions →

- There are  $k$  slots with CTRs  $\alpha_1 \geq \alpha_2 \geq \dots \geq \alpha_k$
- Allocation rule assigns  $j^{\text{th}}$  highest bidder to  $j^{\text{th}}$  best slot
- The rule is monotone and welfare-maximizing (assuming truthful bids)
- We can apply Myerson's payment formula
  - Re-index bids in the bid profile  $\mathbf{b}$  as  $b_1 \geq b_2 \geq \dots \geq b_n$  first
  - Considering only first bidder, we can imagine bidder raising her bid from 0 to  $b_1$ , holding other bids fixed
  - The allocation  $x_i(z, b_{-i})$  ranges from 0 to  $\alpha_1$  as  $z$  ranges from 0 to  $b_1$ , with a jump of  $\alpha_j - \alpha_{j+1}$  at the point where  $z$  becomes the  $j^{\text{th}}$  highest bid in the profile  $(z, b_{-i})$ , namely  $b_{j+1}$  !
- Thus in general,

$$p_i(b) = \sum_{j=i}^k b_{j+1} (\alpha_j - \alpha_{j+1}) \text{ for the } i^{\text{th}} \text{ highest bidder (where } \alpha_{k+1} = 0)$$

# References

- ▶ Twenty Lectures on Algorithmic Game Theory by Tim Roughgarden, 2016, Cambridge University Press
- ▶ [https://www.youtube.com/playlist?list=PLEGCF-WLh2RJBqmxvZ0\\_ie-mleCFhi2N4](https://www.youtube.com/playlist?list=PLEGCF-WLh2RJBqmxvZ0_ie-mleCFhi2N4)

# THANK YOU