

Myerson's Lemma and VCG mechanism in Mechanism Design

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In this tutorial, we will introduce

- What is mechanism design
- Two useful tools to design truthful mechanism
 - Myerson's lemma
 - VCG mechanism

In this tutorial, we

- assume no prior knowledge about mechanism design
- go through the detailed proof
- do not mention recent results

Warm up example - Single item auction

- An auction house wants to auction a valuable item among n bidders
- Each bidder i has a private value v_i for the item.
- Auction process:
 - Auctioneer asks the bidders for their private value.
 - For each bidder i , he/she claims b_i as the private value simultaneously. We call b_i the bid of bidder i .
 - Auctioneer decides winner and the price p according to $\{b_1, \dots, b_n\}$ and a specific mechanism.
- The utility for bidder i is $v_i - p$ if he/she is the winner and 0 otherwise.
- Question: how to design a “good” mechanism?

Second Price Auction Mechanism

- First Price Auction Mechanism

- Winner = bidder with highest bid; price = his/her bid
- Bidder has the incentive to cheat

3 bidders.

private value: 3, 5, 10.

bids: 3, 5, 10.

winner = 3rd bidder
price = 10

$$u_3 = 10 - 10 = 0.$$

↑ ↑

bid: 3, 5, 6
 ↑
 cheating bid.

winner = 3rd bidder
price = 6

$$u_3 = 10 - 6 = 4 > 0.$$

Second Price Auction Mechanism

- First Price Auction Mechanism

- Winner = bidder with highest bid; price = his/her bid
- Bidder has the incentive to cheat

- Second Price Auction Mechanism (Vickrey's Auction)

- Winner = bidder with highest bid; price = second highest bid
- Bidder has NO incentive to cheat

2 bidder.

private value: $\boxed{3}$ 5, $\boxed{10}$

2nd bidder:

reports honestly.

1. reports $b_3 > 5$.

2. reports $b_3 < 5$.

utility = 5.

winner = 3rd bidder.

price = 5.

utility = $10 - 5 = 5$.

winner = 2nd bidder. price = $\max(b_3, 3)$

utility for 3rd bidder = 0.

2nd bidder:
reports honestly. utility = 0.

1. reports $b_2 < 10$. utility = 0.

2. reports $b_2 > 10$. winner = 2nd bidder
price = 10
utility = $5 - 10 = -5 < 0$

Second Price Auction Mechanism

- First Price Auction Mechanism
 - Winner = bidder with highest bid; price = his/her bid
 - Bidder has the incentive to cheat
- Second Price Auction Mechanism (Vickrey's Auction)
 - Winner = bidder with highest bid; price = second highest bid
 - Bidder has NO incentive to cheat

Solution concept

- Truthfulness (Strategy-Proofness, Incentive-Compatibility): whatever the others do, if the agent acts truthfully (that is, reveal the true private information, or act according to true preferences), it maximizes the agent's utility.

Mechanism Design

- Design mechanism
- Private information VS. public information
- Objective of designer: truthful + some other objectives
 - social welfare maximization ✓
 - revenue maximization
 - fairness
- Need a game perspective

Trivial truthful mechanism for single item auction.

winner: 1st bidder.

price = 0

Mechanism Design

- Design mechanism
- Private information VS. public information
- Objective of designer: truthful + some other objectives
 - social welfare maximization
 - revenue maximization
 - fairness
- Need a game perspective

For second-price mechanism, what is the objective?

- For designer: truthful + maximize social welfare
- For bidders: maximize utility
- Later, we will show this is the “unique” truthful mechanism which maximizes the social welfare.

Consider n companies competing for k ad slots on a search page:

cell phone

Home Orders About Google Shopping Sort by: Relevance

United States

Ad - See cell phone

Show only

- ☐ Buy on Google
- ☐ On sale
- ☐ Smaller stores

Price

- ☐ Up to \$100
- ☐ \$100 - \$250
- ☐ \$250 - \$500
- ☐ Over \$500

\$ Min - \$ Max

Carrier

- ☐ Unlocked
- ☐ T-Mobile
- ☐ AT&T
- ☐ Straight Talk
- ☐ Verizon

Brand

- ☐ Apple
- ☐ Samsung
- ☐ Motorola
- ☐ LG
- ☐ HTC
- ☐ Nexus
- ☐ Google
- ☐ Sony
- ☐ Huawei
- ☐ Xiaomi
- ☐ OnePlus
- ☐ Oppo
- ☐ Vivo
- ☐ Realme
- ☐ Nothing
- ☐ Honor
- ☐ POCO
- ☐ Redmi
- ☐ Blackview
- ☐ Ulefone
- ☐ Doogee
- ☐ UAG
- ☐ Spigen
- ☐ OtterBox
- ☐ LifeProof
- ☐ Catalyst
- ☐ Incipio
- ☐ Belkin
- ☐ Mophie
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- ☐ P

Sponsored search auction

Consider n companies competing for k ad slots on a search page.

Settings:

- k slots for sponsored links, n agents
- For the j -th slot, the click-through-rates is α_j (public information). We assume $\alpha_1 > \alpha_2 > \dots > \alpha_k$.
- For the i -th agent, the private valuation v_i is the profit for one click.
- If i -th agent wins the j -th slot and pays p_i per search, the utility function is $\underline{v_i} \cdot \underline{\alpha_j} - p_i$ per search.

Goals:

- truthful
- maximize social welfare

Single-parameter environment

Setting:

- n agents. Each has private information v_i , but will bid b_i . valuation for unit items
- bids $\mathbf{b} = (b_1, b_2, \dots, b_n)$
- Allocation rule: $\mathbf{x}(\mathbf{b}) = (x_1(\mathbf{b}), x_2(\mathbf{b}), \dots, x_n(\mathbf{b}))$
- Payment rule: $\mathbf{p}(\mathbf{b}) = (p_1(\mathbf{b}), p_2(\mathbf{b}), \dots, p_n(\mathbf{b}))$
- Utility function: $u_i(\mathbf{b}) = v_i \cdot x_i(\mathbf{b}) - p_i(\mathbf{b})$ (y & i)

mechanism

depends on $x_i(b)$ only, not depend on $x_j(b)$

Key points.

- ① private information is "single parameter"
- ② utility function, has specific form.
- ③ "feasible" allocation rule

Single-parameter environment

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- Utility function: $u_i(\mathbf{b}) = v_i \cdot x_i(\mathbf{b}) - p_i(\mathbf{b})$

For example, consider single item auction, the feasible allocation rules are

- $x_i(b) = 1, x_j(b) = 0 (\forall j \neq i)$: means the i -th bidder wins the item
- $(0, 0, \dots, 0)$: means no one wins the item

Single-parameter environment

Setting:

- n agents. Each has private information v_i , but will bid b_i .
- bids $\mathbf{b} = (b_1, b_2, \dots, b_n)$
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- Utility function: $u_i(\mathbf{b}) = v_i \cdot x_i(\mathbf{b}) - p_i(\mathbf{b})$

For sponsored search problem, the feasible allocation rules are

- For $1 \leq j \leq k$, α_j appears at most once in $(x_1(\mathbf{b}), x_2(\mathbf{b}), \dots, x_n(\mathbf{b}))$
- For example, when $n = 4, k = 2$:
 $(\alpha_1, 0, \alpha_2, 0), (\alpha_2, 0, 0, 0)$ are feasible allocation rules.

Single-parameter environment

Setting:

- n agents. Each has private information v_i , but will bid b_i .
- bids $\mathbf{b} = (b_1, b_2, \dots, b_n)$
- Allocation rule: $\mathbf{x}(\mathbf{b}) = (x_1(\mathbf{b}), x_2(\mathbf{b}), \dots, x_n(\mathbf{b}))$
- Payment rule: $\mathbf{p}(\mathbf{b}) = (p_1(\mathbf{b}), p_2(\mathbf{b}), \dots, p_n(\mathbf{b}))$
- Utility function: $u_i(\mathbf{b}) = v_i \cdot x_i(\mathbf{b}) - p_i(\mathbf{b})$

Thus, we have

- Truthful: for any i , \underline{b}_{-i}, b_i , we have $u_i(\underline{v_i}, \underline{b_{-i}}) \geq u_i(\underline{b_i}, \underline{b_{-i}})$
- Social welfare maximization: $\max \sum_i v_i \cdot x_i(\mathbf{b})$

Social welfare

$$-\sum_i p_i(\mathbf{b}) + \sum_{i=1}^n u_i(\mathbf{b}) = \sum_{i=1}^n v_i \cdot x_i(\mathbf{b}) - \sum_{i=1}^n p_i(\mathbf{b})$$

↑
utility of designer of mechanism.

Generalized second-price auction mechanism

Mechanism:

- suppose $b_1 \geq b_2 \geq \dots \geq b_n$
- $\mathbf{x}(\mathbf{b}) = (\alpha_1, \dots, \alpha_k, 0, \dots, 0)$
- $\mathbf{p}(\mathbf{b}) = (b_2 \cdot \alpha_1, \underline{b_3} \cdot \alpha_2, \dots, b_{k+1} \cdot \alpha_k, 0, \dots, 0)$

Good or not?

$k=1$

$$\mathbf{x}(\mathbf{b}) = (\alpha_1, 0, \dots, 0)$$

$$\mathbf{p}(\mathbf{b}) = (\underline{b_2} \cdot \alpha_1, 0, \dots, 0)$$

↓
second price auction
truthful.

Generalized second-price auction mechanism

Mechanism:

- suppose $b_1 \geq b_2 \geq \dots \geq b_n$
- $\mathbf{x}(\mathbf{b}) = (\alpha_1, \dots, \alpha_k, 0, \dots, 0)$
- $\mathbf{p}(\mathbf{b}) = (b_2 \cdot \alpha_1, b_3 \cdot \alpha_2, \dots, b_{k+1} \cdot \alpha_k, 0, \dots, 0)$

Good or not?

- Not truthful!
- Example: $n = 3, k = 2, \alpha_1 = 1, \alpha_2 = 0.4$, private value $(7, 6, 1)$. Consider agent 1:

Bid	Allocation	Payment	Utility
(7 (honest), 6, 1)	(1, 0.4, 0)	(6, 0.4, 0)	(1, 2, 0)
(5 (cheat), 6, 1)	(0.4, 1, 0)	(0.4, 5, 0)	(2.4, 1, 0)

Handwritten calculations:

- For the "cheat" row: $b_1 = 5$ is underlined in red.
- Red arrows point from the "cheat" row to calculations: $b_1 \cdot \alpha_1 = 5 \cdot 1 = 5$ (pointing to the payment 0.4) and $7 - 6 = 1$ (pointing to the utility 2.4).
- Red arrows point from the "honest" row to calculations: $b_2 \cdot \alpha_1 = 6 \cdot 1 = 6$ (pointing to the payment 6) and $7 - 6 = 1$ (pointing to the utility 1).
- Red arrows point from the "cheat" row to calculations: $b_3 \cdot \alpha_2 = 1 \cdot 0.4 = 0.4$ (pointing to the payment 5) and $7 \cdot 0.4 - 0.4 = 2.4$ (pointing to the utility 2.4).

Generalized second-price auction mechanism

Mechanism:

- suppose $b_1 \geq b_2 \geq \dots \geq b_n$
- $\mathbf{x}(\mathbf{b}) = (\alpha_1, \dots, \alpha_k, 0, \dots, 0)$
- $\mathbf{p}(\mathbf{b}) = (b_2 \cdot \alpha_1, b_3 \cdot \alpha_2, \dots, b_{k+1} \cdot \alpha_k, 0, \dots, 0)$

Good or not?

- very simple and intuitive, widely used
- still has many nice properties and in some sense stable
- Reference
 - B. Edelman, M. Ostrovsky and M. Schwarz (2007), “Internet Advertising and the Generalized Second-Price Auction: Selling Billions of Dollars Worth of Keywords”. American Economic Review 97(1): 242-259

Sponsored search auction

Can we design a truthful mechanism which maximizes the social welfare?

Sponsored search auction

Can we design a truthful mechanism which maximizes the social welfare?

Mechanism:

$$\max_{\alpha} \sum_{i=1}^n v_i \cdot x_i(b)$$

- Suppose $b_1 \geq b_2 \geq \dots \geq b_n$
- Allocation rule which maximizes the social welfare:
 $\mathbf{x}(\mathbf{b}) = (\alpha_1, \dots, \alpha_k, 0, \dots, 0)$
 - The same as the generalized second-price auction
- Is there a suitable “payment rule” so that (\mathbf{x}, \mathbf{p}) is truthful?

Sponsored search auction

Can we design a truthful mechanism which maximizes the social welfare?

Mechanism:

- Suppose $b_1 \geq b_2 \geq \dots \geq b_n$
- Allocation rule which maximizes the social welfare:
 $\mathbf{x}(\mathbf{b}) = (\alpha_1, \dots, \alpha_k, 0, \dots, 0)$
 - The same as the generalized second-price auction
- Is there a suitable “payment rule” so that (\mathbf{x}, \mathbf{p}) is truthful?

Answer: Myerson's lemma

Myerson's lemma

Definition (Implementable allocation rule)

For any single-parameter problem, an allocation rule \mathbf{x} is implementable if there exists a payment rule \mathbf{p} such that (\mathbf{x}, \mathbf{p}) is truthful.

Definition (Monotone allocation rule)

For any single-parameter problem, an allocation rule $\mathbf{x}(\mathbf{b})$ is monotone if for any i , b_{-i} , $b_i > b'_i$, we have $x_i(b_i, b_{-i}) \geq x_i(b'_i, b_{-i})$.

$$\mathbf{x}(\mathbf{b}) = (x_1(\mathbf{b}), \dots, x_n(\mathbf{b}))$$

$$x_i(\mathbf{b}) = x_i(b_1, \dots, b_n) = \underline{x}_i(b_i, b_{-i}) \text{ is monotone w.r.t. } b_i$$

Myerson's lemma

Definition (Implementable allocation rule)

For any single-parameter problem, an allocation rule \mathbf{x} is implementable if there exists a payment rule \mathbf{p} such that (\mathbf{x}, \mathbf{p}) is truthful.

Definition (Monotone allocation rule)

For any single-parameter problem, an allocation rule $\mathbf{x}(\mathbf{b})$ is monotone if for any $i, b_{-i}, b_i > b'_i$, we have $x_i(b_i, b_{-i}) \geq x_i(b'_i, b_{-i})$.

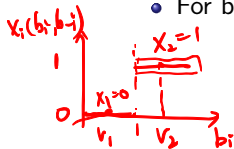
Theorem (Myerson's lemma)

For any single-parameter problem, an allocation rule \mathbf{x} is monotone if and only if it is implementable.

Application of Myerson's Lemma

Single item auction

- Step 1: Consider the allocation rule which maximizes the social welfare
 - Allocate the item to the highest bid \leftarrow global view
- Step 2: Show that the allocation rule is monotone \leftarrow individual views
 - For bidder i , let $b_{\max} = \max_{j \neq i} b_j$, then we have

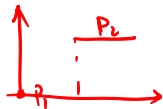


fix b_{-i}

$$x_i(\mathbf{b}) = \begin{cases} 1 & \text{if } b_i \geq b_{\max} \\ 0 & \text{otherwise} \end{cases}$$

$$v_1(1-0) \leq p_2 - p_1 \leq v_2 \cdot (1-0)$$

$$v_2 \in [b_{\max}, \infty) \\ v_1 \in [0, b_{\max}]$$



$$p_2 - p_1 = b_{\max}$$

Assumption: $b_i = 0 \Rightarrow p_i(b_i, b_{-i}) = 0$

$$p_1 = 0. \quad p_2 = b_{\max}$$

Application of Myerson's Lemma

Single item auction

- Step 1: Consider the allocation rule which maximizes the social welfare
 - Allocate the item to the highest bid
- Step 2: Show that the allocation rule is monotone
 - For bidder i , let $b_{\max} = \max_{j \neq i} b_j$, then we have

$$x_i(\mathbf{b}) = \begin{cases} 1 & \text{if } b_i \geq b_{\max} \\ 0 & \text{otherwise} \end{cases}$$

- Step 3: Compute the payment rule according to Myerson's lemma
 - For bidder i

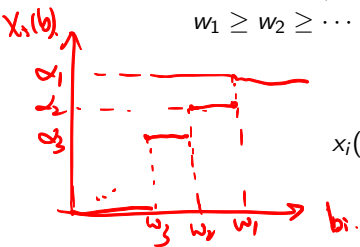
$$p_i(\mathbf{b}) = \begin{cases} b_{\max} & \text{if } b_i \geq \underline{b_{\max}} \\ 0 & \text{otherwise} \end{cases} \quad \text{✓} = \text{second highest bid.}$$

- This is actually the second price auction

Application of Myerson's Lemma

Sponsored Search Auction

- Step 1: Fix the allocation rule
 - Suppose $b_1 \geq b_2 \geq \dots \geq b_n$
 - Allocation rule: $\mathbf{x}(\mathbf{b}) = (\alpha_1, \dots, \alpha_k, 0, \dots, 0)$
- Step 2: Show the allocation rule is monotone
 - For bidder i , suppose bids of the other $n - 1$ bidders are $w_1 \geq w_2 \geq \dots \geq w_{n-1}$



$$x_i(\mathbf{b}) = \begin{cases} \alpha_1 & \text{if } b_i \geq w_1 \\ \alpha_2 & \text{if } w_2 \leq b_i < w_1 \\ \dots & \\ \alpha_k & \text{if } w_k \leq b_i < w_{k-1} \\ 0 & \text{if } b_i < w_k \end{cases}$$

$$\{w_1, \dots, w_{n-1}\} \sim \{b_1, \dots, b_{i-1}, \underline{b_{i+1}}, \dots, b_n\}$$

- Step 3: Compute the payment rule according to Myerson's lemma

Myerson's lemma

Very nice result! monotone allocation \rightarrow truthful for free!

Roger Myerson:

- 2007 Nobel Memorial Prize in Economic Sciences - with Leonid Hurwicz and Eric Maskin
- Contribution: having laid the foundations of mechanism design theory

Reference:

- R. Myerson (1981). Optimal auction design. *Mathematics of Operations Research*, 6(1):58-73

Limitation:

- Works only for single parameter environment

What about general case?

- n agents, Ω : a finite set of outcomes
- For i -th agent, private valuation function $v_i : \Omega \rightarrow \mathbb{R}_{\geq 0}$, bid $b_i : \Omega \rightarrow \mathbb{R}_{\geq 0}$
- $\mathbf{x}(\mathbf{b}) \in \Omega, \mathbf{p}(\mathbf{b}) \in \mathbb{R}^n$
- Utility function for i -th agent: $u_i(\mathbf{b}) = v_i(\mathbf{x}(\mathbf{b})) - p_i(\mathbf{b})$

Single parameter case. $\nwarrow v_i \circ x_i(b)$

Setting

- n agents, Ω : a finite set of outcomes
- For i -th agent, private valuation function $v_i : \Omega \rightarrow \mathbb{R}_{\geq 0}$, bid $b_i : \Omega \rightarrow \mathbb{R}_{\geq 0}$
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For single item auction ($n = 3$):

- Outcome $\Omega = \{(0, 0, 0), (1, 0, 0), (0, 1, 0), (0, 0, 1)\}$
- Private valuation function for bidder 1: $(0, v_1, 0, 0)$

$(0, v_1, 0, 0)$
 $\hookrightarrow 0$

- n agents, Ω : a finite set of outcomes
- For i -th agent, private valuation function $v_i : \Omega \rightarrow \mathbb{R}_{\geq 0}$, bid $b_i : \Omega \rightarrow \mathbb{R}_{\geq 0}$
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Thus, we have

- Truthful: for any i, b_{-i}, b_i , we have $u_i(v_i, b_{-i}) \geq u_i(b_i, b_{-i})$
- Social welfare maximization: $\max_{\omega} \sum_i v_i(\omega)$

Theorem (VCG mechanism)

In every general mechanism design environment, there is a truthful mechanism which maximizes the social welfare.

- Allocation rule: $\mathbf{x}(\mathbf{b}) = \arg \max_{\omega \in \Omega} \sum_i b_i(\omega)$

Vickrey-Clarke-Groves mechanism

Theorem (VCG mechanism)

In every general mechanism design environment, there is a truthful mechanism which maximizes the social welfare.

- Allocation rule: $\mathbf{x}(\mathbf{b}) = \arg \max_{\omega \in \Omega} \sum_i b_i(\omega)$
- Payment rule: $p_i(\mathbf{b}) = \max_{\omega \in \Omega} (\sum_{j \neq i} b_j(\omega)) - \sum_{j \neq i} b_j(\omega^*)$
where $\omega^* = \arg \max_{\omega \in \Omega} \sum_i b_i(\omega)$

$= x(\mathbf{b})$

social welfare maximization without agent i .

$$= b_i(\omega^*) - \left[\sum_j b_j(\omega^*) - \max_{\omega} \sum_{j \neq i} b_j(\omega) \right]$$

↑
bid of agent i .

↑
contribute to
increase of social welfare
↑
i's presence

Application: Single Item Auction

- Allocation rule: $\mathbf{x}(\mathbf{b}) = \arg \max_{\omega \in \Omega} \sum_i b_i(\omega)$
 - Allocate the item to the bidder with highest bid

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 - Case 1: bidder i 's bid is the highest bid
 - $\max_{\omega \in \Omega} (\sum_{j \neq i} b_j(\omega))$ = second highest bid
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 - Case 2: bidder i 's bid is not the highest bid
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- This is exactly second-price auction.

Application: Sponsored Search Problem

Suppose $b_1 \geq b_2 \geq \dots \geq b_n$

- Allocation rule: $\mathbf{x}(\mathbf{b}) = \arg \max_{\omega \in \Omega} \sum_i b_i(\omega)$
 - $\mathbf{x}(\mathbf{b}) = (\alpha_1, \alpha_2, \dots, \alpha_k, 0, \dots, 0)$

Application: Sponsored Search Problem

Suppose $b_1 \geq b_2 \geq \dots \geq b_n$

- Allocation rule: $\mathbf{x}(\mathbf{b}) = \arg \max_{\omega \in \Omega} \sum_i b_i(\omega)$
 - $\mathbf{x}(\mathbf{b}) = (\alpha_1, \alpha_2, \dots, \alpha_k, 0, \dots, 0) \leftarrow \omega^*$
- Payment rule: $p_i(\mathbf{b}) = \max_{\omega \in \Omega} (\sum_{j \neq i} b_j(\omega)) - \sum_{j \neq i} b_j(\omega^*)$
where $\omega^* = \arg \max_{\omega \in \Omega} \sum_i b_i(\omega)$. Consider bidder 1:
 - $\max_{\omega \in \Omega} (\sum_{j \neq 1} b_j(\omega)) = \alpha_1 b_2 + \alpha_2 b_3 + \dots + \alpha_k b_{k+1}$
 - the social welfare maximization without bidder 1
 - $\sum_{j \neq 1} b_j(\omega^*) = \alpha_2 b_2 + \alpha_3 b_3 + \dots + \alpha_k b_k$
 - ω^* is the allocation which maximizes the social welfare
 - So $p_1(\mathbf{b}) = \alpha_1 b_2 - \alpha_2(b_2 - b_3) - \dots - \alpha_k(b_k - b_{k+1})$
 - It is less than $\alpha_1 b_2$ (payment rule in generalized second-price auction)

Vickrey-Clarke-Groves mechanism

Advantage:

- If you want to maximize social welfare, “truthful” is always possible in principle.
- clean mechanism

Disadvantage:

- Cannot deal with other objective functions
- Parameter space may very large $\Omega \rightarrow \mathbb{R}_1$
- It is not always practical to compute the social welfare maximization

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Conclusion

- How to design truthful mechanism
- Myerson's Lemma
- VCG Mechanism

	Myerson's lemma	VCG mechanism
Setting	single parameter environment	general environment
Objective	any monotone allocation	max social welfare
Practicality	usually practical	less practical

Thank you! Any questions?