

### Mechanisms & Auctions

Lawrence & Willi Algorithmic Game Theory, 2017

### **Outline**

Mechanism Design

Auctions in General

Vickrey Auctions

VCG Mechanism

Mechanism Design

### Mechanism Design

#### **Definition**

A Bayesian game setting is a tuple  $(N, O, \Theta, p, u)$ .

- *N* is a set of *n* agents.
- $O = X \times \mathbb{R}^n$  is a set of outcomes (choice + payments).
- $\Theta = \Theta_1 \times \Theta_2 \times \cdots \times \Theta_n$  is a set of possible type vectors.
- p is a probability distribution on  $\Theta$ .
- $u = (u_1, ..., u_n), u_i : O \times \Theta \mapsto \mathbb{R}$  is the utility for agent i.

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### Mechanism Design

#### **Definition**

A (quasilinear) mechanism for  $(N, O = X \times \mathbb{R}^n, \Theta, p, u)$  is a triple  $(A, \chi, \rho)$ .

- $A = A_1 \times \cdots \times A_n$ , where  $A_i$  is the set of actions for agent i.
- χ : A → Π(X) maps each action profile to a distribution over choices.
- $\rho: A \mapsto \mathbb{R}^n$  maps each action profile to a payment for each agent.

### **Auctions in General**

#### Auction

- item A to be sold
- seller s who wants to sell A
- *n* bidders who want to buy *A*
- valuation v<sub>i</sub> of getting A
- bid b<sub>i</sub> for A
- price p<sub>i</sub> for each bidder
- utility  $u_i = v_i p_i$

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#### Mechanism

• x = (0, ..., 0, 1, 0, ..., 0)

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- agents  $i_1, ..., i_n$
- $\Theta_i$  (private information)
- action  $a_i \in A_i$
- $\rho_i \in \rho$
- $u_i = u_i(\rho_i, \Theta_i)$

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### **English Auction**

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```
price p \leftarrow \text{low price from seller } s
while item A not sold do
    p \leftarrow \text{bidder } i\text{'s bid } (> p)
    for all bidder j do
        if p > v_i then
             bidder j drops out
        end if
    end for
    if only bidder i left then
        return i gets A for price p
    end if
end while
```

#### **Dutch Auction**

#### **Dutch Auction**

```
price p \leftarrow \text{high price from seller } s
while item A not sold do
    for all bidder i do
        if p \le v_i then
            bidder i bids p
            return i gets A for price p
        end if
    end for
    p \leftarrow p' \ (p' < p)
end while
```

#### **Chinese Auction**

#### **Chinese Auction**

for all bidder i do
 bidder i buys v<sub>i</sub> tickets
end for
winner ← seller s draws one ticket with name of bidder j
return winner gets A

### **Achieving Social Optimum**

#### **Achieving Social Optimum**

- strategically complex mechanisms so far
- selfish behavior
- private information
- → How to achieve social welfare? (Adam Smith's "invisible hand")
- $x^{opt}(v) = \operatorname{argmax}_{x \in X} \sum_{i=1}^{n} v_i(x)$

**Vickrey Auctions** 

### **Vickrey Auction**

#### Motivation

How to assign good to player with highest valuation, not best strategy?

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#### Motivation

How to assign good to player with highest valuation, not best strategy?

**Example:** The government wants to auction off a wireless spectrum. The goal is **not to maximize their profit** but to get it in the hands of companies that **value it the most**, providing the best technology to the customers.

### **Vickrey Auction**

#### **Vickrey Auction**

- bidders submit simultaneous sealed bids with b to the seller
- seller s opens them
- highest bidder gets item
- highest bidder pays second highest bid

### **Vickrey Auction Properties**

#### Theorem

Bidding your true value  $v_i$  in a Vickrey auction is a dominant strategy.

#### **Proof**

Assume bidder i is bidding  $b_i = v_i$ .

In which situation would i receive a higher payoff by deviating from this strategy?

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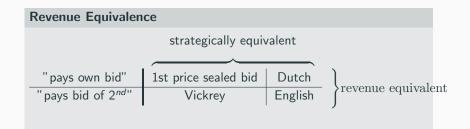
In which situation would i receive a higher payoff by deviating from this strategy?

	increase <i>b<sub>i</sub></i>	decrease b <sub>i</sub>	
already won item	No	No (doesn't change payoff;	
		decreases chance to win)	
already lost item	No (negative payoff)	No	
		'	

Revenue Equivaler	псе		
	1st price sealed bid	Dutch	
	Vickrey	English	

Revenue Equivalen	ce		
"pays own bid"	1st price sealed bid	Dutch	
"pays bid of 2 <sup>nd</sup> "	Vickrey	English	

strategically equivalent				
sealed bid Dutch				
ckrey English				
·				
2	e sealed bid Dutch			



### **Revenue Equivalence Theorem**

#### Theorem

Any efficient auction mechanism yields the same expected revenue.

### **Setting**

- efficient: the mechanism selects a choice x such that  $\forall v \forall x', \sum_i v_i(x) \ge \sum_i v_i(x')$
- *n* risk-neutral players
- privately known value drawn independently from a common, strictly increasing distribution
- any bidder with lowest possible value expects zero utility

### Revenue Equivalence Theorem - Outcome

#### **Outcome**

- *i* bidder
- $v_i$  i's true value drawn from  $[\underline{v}, \overline{v}]$
- $u_i(v_i)$  expected utility of true value  $v_i$
- $P_i(v_i)$  probability of being awarded the good
- $\Rightarrow u_i(v_i) = u_i(\underline{v}) + \int_{x=\underline{V}}^{v_i} P_i(x) dx$

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- $\Rightarrow u_i(v_i) = u_i(\underline{v}) + \int_{x=\underline{V}}^{v_i} P_i(x) dx$
- mechanisms are efficient ⇒ P<sub>i</sub> always the same
- ⇒ i's expected payment must be the same; independent of mechanism

# VCG Mechanism

#### **Efficient Mechanisms**

#### **Definition**

A quasilinear mechanism is **efficient**, if in equilibrium it selects a choice x such that

$$\forall v \forall x' : \sum_{i} v_i(x) \geq \sum_{i} v_i(x')$$

That is, an efficient mechanism selects the choice that maximizes the sum of agents utilities, disregarding the monetary payments that agents are required to make.

### **Groves Mechanism**

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**Groves mechanisms** are direct efficient quasilinear mechanisms  $(\chi, \rho)$ .

$$\begin{split} \chi(\hat{v}) &= \operatorname{argmax}_{x} \sum_{i} \hat{v}_{i}(x), \\ \rho(\hat{v}) &= h_{i}(\hat{v}_{-i}) - \sum_{j \neq i} \hat{v}_{j}(\chi(\hat{v})) \end{split}$$

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ho(\hat{\mathbf{v}})$  is "what would happen without i - what would happen with i"

#### Clarke Tax

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$$\rho(\hat{\mathbf{v}}) = \sum_{j \neq i} \hat{\mathbf{v}}_{j}(\chi(\hat{\mathbf{v}}_{-i})) - \sum_{j \neq i} \hat{\mathbf{v}}_{j}(\chi(\hat{\mathbf{v}}))$$

 $\Rightarrow$  sum of all players' valuations (except *i*) of the optimal solution without *i* - sum of all players' valuations (except *i*) of the overall optimal solution  $\Rightarrow$  **Social Cost** 

Bidder A1	
valuation $v_1 = 5$	

# **Seller**Some company with ad slots for sale

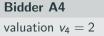
## Ad slot S1 500 clicks per week

## Ad slot S2 300 clicks per week

## Ad slot S3 100 clicks per week

## **Bidder A2** valuation $v_2 = 4$

## **Bidder A3** valuation $v_3 = 3$



## **Bidder A5** valuation $v_5 = 1$

## **VCG** Truthfulness

#### Theorem

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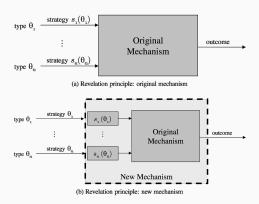
 $\Rightarrow \chi(\hat{v})$  is the social choice

 $\Rightarrow \rho(\hat{\mathbf{v}})$  is "what would happen without i - what would happen with i"

## **Revelation Principle**

#### Theorem

If there exists any mechanism that implements a social choice function  $\mathcal C$  in dominant strategies then there exists a direct mechanism that implements  $\mathcal C$  in dominant strategies and is truthful.



## **Revelation Principle**

#### **Proof**

## Original mechanism:

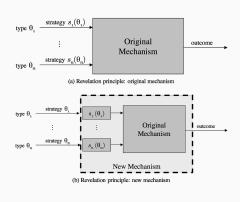
dominant strategies  $s_1$  to  $s_n$ 

#### New mechanism:

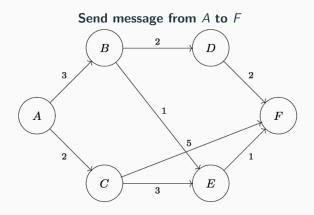
utility functions  $u_i$ determine  $s_1$  to  $s_n$ choose outcome from  $s_1$  to  $s_n$ 

#### **Contradiction:**

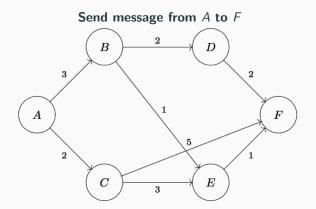
If i were better of lying with  $u_i*$  instead of  $u_i$ , he would prefer to follow  $s_i*$  in original mechanism rather than  $s_i \not = a_i s_i$  as  $s_i$  is dominant.



## **VCG** for Shortest Paths



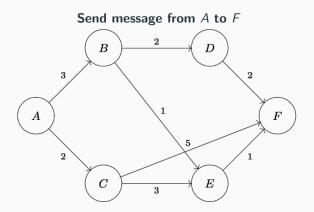
### **VCG** for Shortest Paths



## **Setting:**

- each edge e is an agent
- edge weight is  $cost_{\rm e}$  for agent e
- $u_i = -\text{cost}_e$
- mechanism pays agents ightarrow -p

## **VCG** for Shortest Paths



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- $u_i = -\cos t_e$
- mechanism pays agents  $\rightarrow -p$

## Payments:

$$\rho_{AB} = (-6) - (-2) = -4$$

$$\rho_{BE} = (-6) - (-4) = -2$$

$$\rho_{EF} = (-7) - (-4) = -3$$

## **Disclosure**

Agents have to disclose private information.

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Does not choose the cheapest solution.

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#### Collusion

Susceptible to group collusion (truthful not dominant strategy).

## VCG is Collusion Susceptible

Agent	U(build road)	U(do not build road)	Payment
1	200	0	150
2	100	0	50
3	0	250	0

Figure 1: Building a road

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Figure 2: Colluded road building

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## **Bidder Dropping**

Dropping bidders can increase revenue.

## VCG's Revenue Decreses with Bidder Dropping

Agent	U(build road)	U(do not build road)	Payment
1	0	90	0
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Figure 3: Building a road

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Agent	$\mathbf{U}(\text{build road})$	U(do not build road)	Payment
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Figure 4: Dropping players

## **Optimal Auctions for Bidders/Sellers**

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- Sellers: Revenue Equivalence Theorem shows that differences between auctions vanish
- Bidders:

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- Bidders: Difficult to determine

**Dollar-Auction-Game** 

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## **Best Strategy?**

- 1 Dollar is auctioned off
- highest bid wins the dollar and pays his bid
- second bid doesn't win dollar but also pays his bid
- bid in multiples of 5 cents

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- 1 Dollar is auctioned off
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- · second bid doesn't win dollar but also pays his bid
- bid in multiples of 5 cents
- ⇒ don't play the game (if there are more players than yourself)