# CSC304 Algorithmic Game Theory & Mechanism Design

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## This Lecture: More Auctions

- Sponsored search
- Other auction mechanisms
  - > 1<sup>st</sup> price auction and ascending (English) auction
  - Comparison to the 2<sup>nd</sup> price auction
- A different type of incentive guarantee
  - Bayes-Nash Incentive Compatibility
- Revelation principle and revenue equivalence

#### **Sponsored Search Auctions**



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## **Sponsored Search Auctions**

- A search engine receives a query
- There are k advertisement slots

   "Clickthrough rates": c<sub>1</sub> ≥ c<sub>2</sub> ≥ ··· ≥ c<sub>k</sub> ≥ c<sub>k+1</sub> = 0
- There are *n* advertisers (bidders)
  - > Bidder *i* derives value  $v_i$  *per click*
  - > Value to bidder *i* for slot  $j = v_i \cdot c_j$
  - $\succ$  Without loss of generality,  $v_1 \geq v_2 \geq \cdots \geq v_n$

#### • Question:

> Who gets which slot, and how much do they pay?



# Sponsored Search : VCG

#### • VCG

- > Outcome
  - Maximize welfare  $\Rightarrow$  bidder j gets slot j for  $1 \le j \le k$ , other bidders get nothing
- Payments
  - $\circ$  Payment charged to bidder j = increase in welfare of others if j abstains
  - Bidders j + 1 through k + 1 would be upgraded by one slot
     So:
    - Payment of bidder  $j = \sum_{i=j+1}^{k+1} v_i \cdot (c_{i-1} c_i)$
    - Payment of bidder  $j \text{ <u>per click</u>} = \sum_{i=j+1}^{k+1} v_i \cdot \frac{c_{i-1}-c_i}{c_i}$

## Sponsored Search : VCG

• What if all the clickthrough rates are same?

$$\succ c_1 = c_2 = \dots = c_k > c_{k+1} = 0$$

> Payment of bidder 
$$j \text{ per click}$$
  
 $\circ \sum_{i=j+1}^{k+1} v_i \cdot \frac{c_{i-1}-c_i}{c_j} = v_{k+1}$ 

Bidders 1 through k pay the value of bidder k + 1
 Familiar? VCG for k identical items

## Sponsored Search : GSP

- Generalized Second Price Auction (GSP)
  - For 1 ≤ j ≤ k, bidder j gets slot j and pays the value of bidder j + 1 per click
  - > Other bidders get nothing and pay nothing
- Natural extension of the "second price" idea
  - > We considered this before for two identical slots
  - Not strategyproof
  - > In fact, truth-telling may not even be a Nash equilibrium 🛞

# Sponsored Search : GSP



- But there is a good Nash equilibrium that...
  - realizes the VCG outcome, i.e., maximizes welfare, and
  - ➤ generates as much revenue as VCG ☺ [Edelman et al. 2007]
- Even the worst Nash equilibrium...
  - > gives 1.282-approximation to welfare ( $PoA \le 1.282$ ) and
  - generates at least half of the revenue of VCG
     [Caragiannis et al. 2011, Dutting et al. 2011, Lucier et al. 2012]
- So if the players achieve an equilibrium, things aren't so bad

# VCG vs GSP



#### • VCG

- Truthful revelation is a dominant strategy, so there's a higher confidence that players will reveal truthfully and the theoretical welfare/revenue guarantees will hold
- But it is difficult to convey and understand

#### • GSP

- > Need to rely on players reaching a Nash equilibrium
- But has good welfare and revenue guarantees and is easy to convey and understand
- Industry is split on this issue too!

# From Theory to Reality

• Value is proportional to clickthrough rate?

- Could it be that users clicking on the 2<sup>nd</sup> slot are more likely buyers than those clicking on the 1<sup>st</sup> slot?
- Misaligned values of advertisers and ad engines?
  - > An advertiser having a high value for a slot does not necessarily mean their ad is appropriate for the slot

#### • Market competition?

> What if there are other ad engines deploying other mechanisms and advertisers are strategic about which ad engines to participate in?

# Bayes-Nash Incentive Compatibility

## **Bayesian Framework**

- Useful for providing weaker incentive guarantees than strategyproofness
- Strategyproofness:
  - "It's best for me to tell the truth even if I know what other players are doing, and regardless of what they are doing."

#### • Weaker guarantee:

- "I don't *exactly* know what others are going to do, but I have some idea. In expectation, it's best for me to tell the truth."
- Incomplete information setting

#### **Bayesian Framework**

- Each agent *i*'s valuation  $v_i$  is sampled from a distribution  $D_i$ 
  - >  $v_i$ 's are independent of each other
  - >  $T_i$  = valuation space of agent *i* (support of  $D_i \subseteq T_i$ )
  - >  $A_i$  = bid space of agent i
  - > Agent *i*'s strategy  $s_i: T_i \rightarrow A_i$  converts her valuation to her bid
- All agents know all  $D_i$ -s and all  $s_i$ -s, but only their own  $v_i$ 
  - > Agent *i* reasons about agent *j*'s bid in expectation over  $v_j$  drawn from  $D_j$  and then  $s_j$  applied to it

#### **Bayesian Framework**

- Given a strategy profile  $\vec{s} = (s_1, ..., s_n)$ :
  - Expected utility to agent i is

$$E_{\{v_j \sim D_j\}_{j \neq i}} [u_i(s_1(v_1), \dots, s_n(v_n))]$$

where utility  $u_i$  is "value derived – payment charged" under the outcome implemented when each agent j bids  $s_j(v_j)$ 

- >  $\vec{s}$  is a Bayes-Nash equilibrium (BNE) if  $s_i$  is the best strategy for agent i given  $\vec{s}_{-i}$  (strategies of others)
  - "I don't know what others' values are. But I know they are rational players, so I can reason about what strategies they might use."

# Comparison

- Nash equilibrium
  - Given their strategies and values, I'm doing the best I can
- Bayes-Nash equilibrium
  - Given their strategies and in expectation over their values, I'm doing the best I can

#### • Dominant strategy equilibrium

- > (Each player is playing their dominant action)
- Regardless of their strategies and values, I'm doing the best I can

# Example

- Sealed-bid first price auction for a single item
  - > Each agent *i* confidentially submits a bid  $b_i$
  - > Agent  $i^*$  with the highest bid wins the item, pays  $b_{i^*}$
- Example
  - Suppose there are two agents
  - Each agent i draws her valuation v<sub>i</sub> for the item from the same distribution U[0,1]
  - Claim: Both players using the strategy s(v) = v/2 is a BNE.
     o Proof on the board.