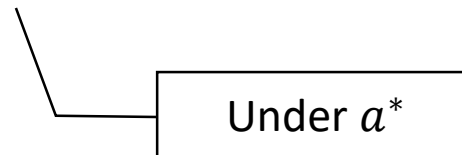


# CSC304 Lecture 9

Mechanism Design w/ Money:  
More examples of VCG, winner  
determination and truthful approximation

# VCG Recap

- $f(v) = a^* = \operatorname{argmax}_{a \in A} \sum_i v_i(a)$
- $p_i(v) = \left[ \max_a \sum_{j \neq i} v_j(a) \right] - \left[ \sum_{j \neq i} v_j(a^*) \right]$
- Procedure
  - Step 1: Choose the allocation to maximize social welfare
  - Step 2: Payment charged to each agent  $i$  is the externality that  $i$  imposes on others
    - [Max welfare of others |  $i$  absent] – [welfare of others |  $i$  present]



# VCG Recap

- Four properties
  - Maximize social welfare
  - Dominant strategy incentive compatibility (DSIC)
  - No payments to agents
  - Individual rationality (IR)
- Vickrey auction satisfies the first two
- VCG adds Clarke's pivot rule to satisfy all four

# VCG Example

- In the last lecture, we saw...
  - Additive valuations: agent has value  $v_i(\{a\})$  for each  $a$ ,  
$$v_i(S) = \sum_{a \in S} v_i(\{a\})$$
  - Unit-demand valuations: Still have  $v_i(\{a\})$  for each  $a$ ,  
$$v_i(S) = \max_{a \in S} v_i(\{a\})$$
    - Goods are “substitutes”
- Another example...
  - Complementary goods: value of the whole exceeds the sum of values of its parts

# VCG Example

- A chair ( $c$ ) and a table ( $t$ )



$$v_1(c) = 3$$



$$v_2(t) = 4$$



$$v_3(\{c, t\}) = 6$$

- Allocation?

- Payment?

# VCG Example

- A chair ( $c$ ) and a table ( $t$ )



$$v_1(c) = 3$$



$$v_2(t) = 4$$



$$v_3(\{c, t\}) = 8$$

- Allocation?

- Payment?

# VCG Example: Seller as Agent

- Seller ( $S$ ) wants to sell his car ( $c$ ) to buyer ( $B$ )
- Seller has a value for his own car:  $v_S(c)$ 
  - Individual rationality for the seller mandates that seller must get revenue at least  $v_S(c)$
- Idea: Add seller as another agent, and make his values part of the welfare calculations!

# VCG Example: Seller as Agent



$$v_S(c) = 3$$

$$v_B(c) = 5$$

- What if...
  - We give the car to buyer when  $v_B(c) > v_S(c)$  and
  - Buyer pays seller  $v_B(c)$  : Not DSIC for buyer!
  - Buyer pays seller  $v_S(c)$  : Not DSIC for seller!



# VCG Example: Seller as Agent



$$v_S(c) = 3$$

$$v_B(c) = 5$$

- Allocation?
  - Buyer gets the car (welfare = 5)
- Payment?
  - Buyer pays:  $3 - 0 = 3$
  - Seller pays:  $0 - 5 = -5$

Mechanism takes \$3 from buyer, and gives \$5 to the seller!

- Need external subsidy

# Problems with VCG

- Difficult to understand in complex settings
  - Need to reason about what allocation would maximize welfare if agent  $i$  was absent
- Only cares about welfare, not revenue
  - Though, as we will see in a few lectures, gets pretty good revenue
- With sellers and buyers, need external subsidy
  - Actually, cannot get individual rationality, DSIC, no subsidy, and constant approximation of welfare
- Might be computationally difficult to implement
  - Computing welfare maximizing allocation may be hard

# Single-Minded Bidders

- Combinatorial auction for a set of  $m$  items  $S$
- Each agent  $i$  has
  - Value  $v_i$  if receives a subset  $S_i \subseteq S$
  - Value 0 if doesn't get a superset of  $S_i$
  - “Single-minded”
- Welfare-maximizing allocation:
  - Find a subset of players  $i$  with the highest total value such that their sets  $S_i$  are **disjoint**

# Single-Minded Bidders

- Reduction to the Weighted Independent Set (WIS) problem in a graph
  - NP-hard to find the welfare-maximizing allocation
  - Note: not even thinking about computing payments yet
  - In fact, hard to approximately optimize welfare
    - No  $O(m^{\frac{1}{2}-\epsilon})$  approximation (unless  $NP \subseteq ZPP$ )
- Luckily, a simple greedy algorithm gives  $\sqrt{m}$ -approximation (i.e.,  $OPT/GREEDY \leq \sqrt{m}$  )

# Greedy Algorithm

- Input:  $(v_i, S_i)$  for each agent  $i$
- Output: Agents with mutually independent  $S_i$
- Greedy Algorithm:
  - Sort the agents. Go over them one-by-one. Accept each bid if no requested item is previously allocated.
- Sort by what?
  - $v_1 \geq v_2 \geq \dots \geq v_n$ ?  $m$ -approximation
  - $\frac{v_1}{|S_1|} \geq \frac{v_2}{|S_2|} \geq \dots \geq \frac{v_n}{|S_n|}$ ?  $m$ -approximation
  - $\frac{v_1}{\sqrt{|S_1|}} \geq \frac{v_2}{\sqrt{|S_2|}} \geq \dots \geq \frac{v_n}{\sqrt{|S_n|}}$ ?  $\sqrt{m}$ -approximation [Lehmann et al. 2011]

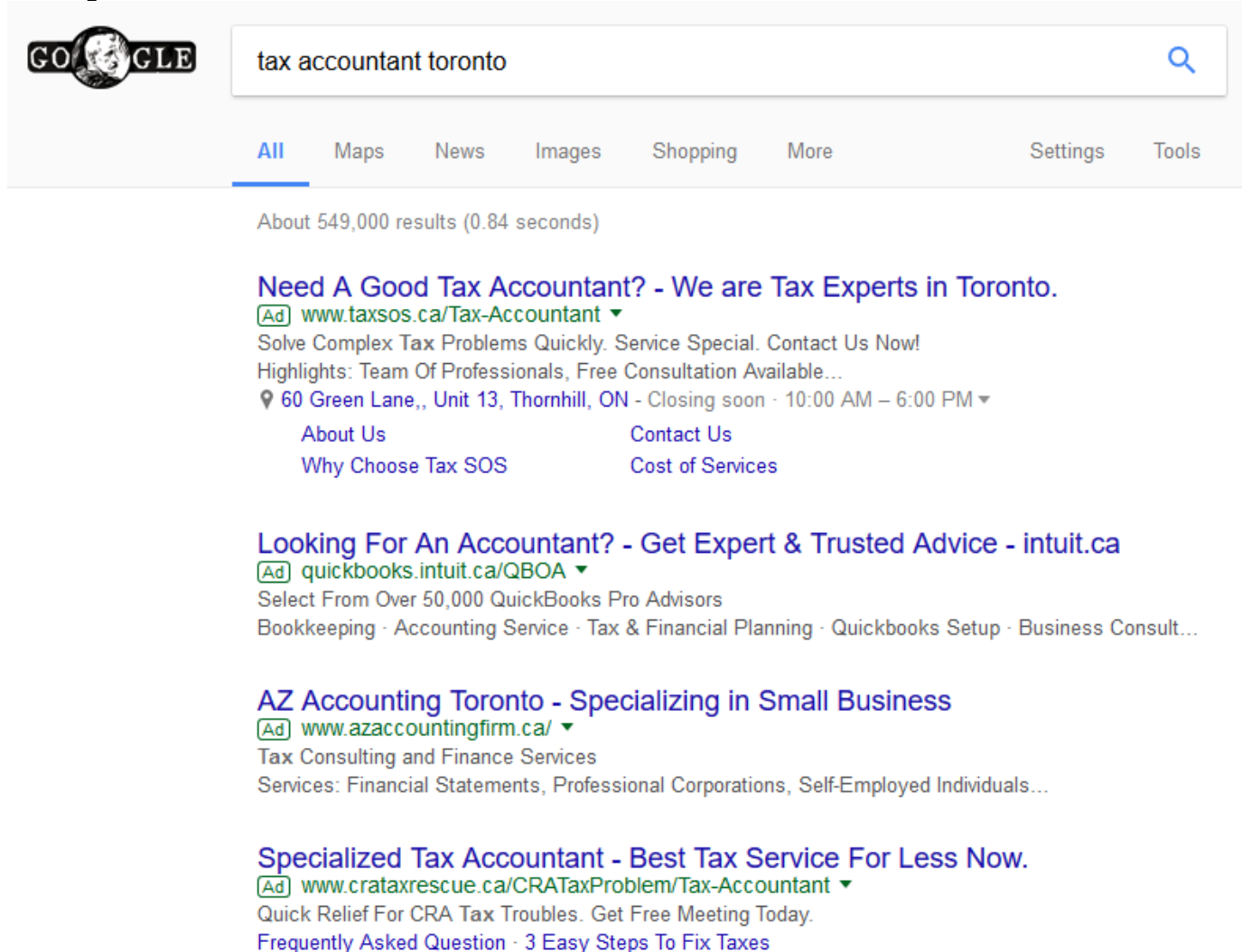
# Greedy Algorithm

- (allocation rule, payments) truthful if and only if
  - Allocation is **monotonic**: If agent  $i$  wins with  $(v_i, S_i)$ , it must win with  $(v'_i, S'_i)$  where  $v'_i \geq v_i$  and  $S'_i \subseteq S_i$
  - Payments are **critical prices**: Agent  $i$  pays the least value (s)he could have reported and still won.
- $$p_i = v_{j^*} \cdot \sqrt{\frac{|S_i|}{|S_{j^*}|}}$$
  - $j^*$  is the smallest index  $j$  such that  $S_j \cap S_i \neq \emptyset$  and  $S_j \cap S_k = \emptyset$  for all  $k < j, k \neq i$
  - If agent  $i$  reports less than this value, agent  $j$  gets  $S_j$  first, and  $i$  loses.

# Moral

- VCG can sometimes be too difficult to implement
  - May look into approximately maximizing welfare
  - Can set the payments right if the allocation rule is monotone
- Need for approximation is due to computational considerations
- Later in mechanism design without money...
  - Can't use payments to ensure truthfulness
  - Will need to approximate welfare just to get truthfulness, even without computational considerations

# Sponsored Search Auctions



The image shows a screenshot of a Google search results page. At the top left is the Google logo. The search bar contains the text "tax accountant toronto" and a magnifying glass icon. Below the search bar are navigation links: "All", "Maps", "News", "Images", "Shopping", "More", "Settings", and "Tools". The "All" link is underlined. Below the navigation links, it says "About 549,000 results (0.84 seconds)". There are four sponsored search results listed, each with a blue title, a green "Ad" icon, and a URL. The first result is for "www.taxsos.ca/Tax-Accountant" with a description about solving complex tax problems. The second is for "quickbooks.intuit.ca/QBOA" with a description about selecting from over 50,000 QuickBooks Pro advisors. The third is for "www.azaccountingfirm.ca/" with a description about tax consulting and finance services. The fourth is for "www.crataxrescue.ca/CRATaxProblem/Tax-Accountant" with a description about quick relief for CRA tax troubles.

GOOGLE

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# Sponsored Search Auctions

- Suppose the search engine receives a search query
- $k$  advertisement slots
  - “Clickthrough rates” :  $c_1 \geq c_2 \geq \dots \geq c_k \geq c_{k+1} = 0$
- $n$  advertisers (bidders)
  - Bidder  $i$  derives value  $v_i$  \*per click\*
  - Final value to bidder  $i$  for receiving slot  $j = v_i \cdot c_j$
  - Without loss of generality,  $v_1 \geq v_2 \geq \dots \geq v_n$
- Age-old question:
  - Who gets which slot, and how much should they pay?

For convenience

# Sponsored Search : VCG

- VCG
  - Maximize welfare:  $j^{\text{th}}$  bidder gets  $j^{\text{th}}$  slot ( $1 \leq j \leq k$ )
  - Payment of  $j^{\text{th}}$  bidder?
- Increase in social welfare to others if  $j$  abstains
  - Bidders  $j + 1$  through  $k + 1$  get “upgraded” by one slot
  - Payment of bidder  $j = \sum_{i=j+1}^{k+1} v_i \cdot (c_{i-1} - c_i)$
  - Payment to bidder  $j$  “per click” =  $\sum_{i=j+1}^{k+1} v_i \cdot \frac{c_{i-1} - c_i}{c_j}$
  - Not very intuitive...

# Sponsored Search : VCG

- What happens if all clickthrough rates are same?

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

- Payment of bidder  $j$  per click

- $\sum_{i=j+1}^{k+1} v_i \cdot \frac{c_{i-1} - c_i}{c_j} = v_{k+1}$

- 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  $1 \leq j \leq k$
  - Bidder  $j$  gets slot  $j$
  - Bidder  $j$  pays the bid of bidder  $j + 1$
- A natural extension of the second price auction
  - We already saw that this is not truthful even with two identical slots
  - Highest bidder paying 2<sup>nd</sup> highest bid → wants to lower bid to become 2<sup>nd</sup> highest bidder and pay 3<sup>rd</sup> highest bid

# Sponsored Search : GSP

- Truth-telling is not a Nash equilibrium 😞
- 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** ( $PoA \leq 1.282$ ) and generates at least **half the revenue of VCG**  
[Caragiannis et al. 2011, Dutting et al. 2011, Lucier et al. 2012]

# VCG vs GSP

- VCG

- Truthful in dominant strategy → more confidence that players will bid truthfully
- Theoretical welfare/revenue guarantees will hold
- Though players might still misreport...
- Difficult to understand

- GSP

- Need to rely on players reaching a Nash equilibrium
- Good welfare and revenue
- Easy to understand

# VCG vs GSP

- Google uses GSP
- Facebook used GSP, but switched to VCG
  - They argue that maximizing welfare has two benefits
  - Advertisers are happy → attract more advertisers → more long-term revenue
  - Users are happy (?!) → users use FB more → more slots to sell → more long-term revenue
- No consensus

# Sponsored Search 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?
- Ad engines also want to produce quality results
  - An advertiser having a high value for a slot does not necessarily mean his ad is appropriate for the slot
- Theoretical analysis does not take into account market competition
  - Advertiser divide their budget among ad engines