

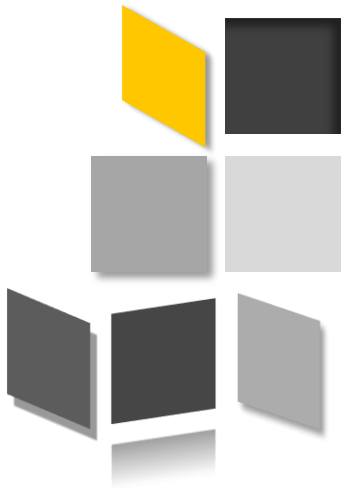
**COMP/MATH 553 Algorithmic
Game Theory
Lecture 3: Myerson's Lemma**

Sep 10, 2014

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An overview of today's class

- 
- Case Study: Sponsored Search Auction*
 - Myerson's Lemma*
 - Back to Sponsored Search Auction*



Case Study:
Sponsored Search
Auction

Sponsored Search Auction



bing Ads

Google
AdWords

Your ads appear beside related search results...

People click your ads...

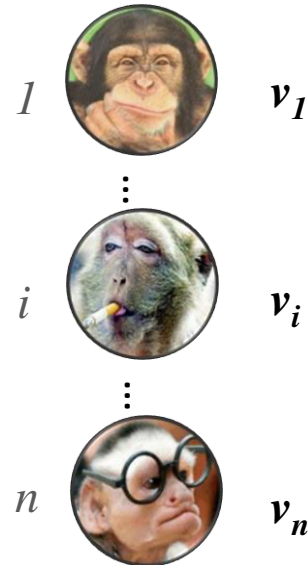
...And connect to your business



Sponsored Search Auctions: Set-up



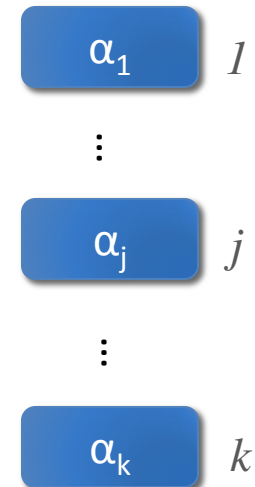
Bidders (advertisers)



Auctioneer/ Google



Slots



- k slots for sale.
- Slot j has click-through-rate (CTR) α_j .
- Bidder i 's value for slot j is $\alpha_j v_i$.

Sponsored Search Auction: Goal



(1) DSIC. That is, truthful bidding should be a **dominant strategy**, and never leads to negative utility.

(2) Social welfare maximization. That is, the assignment of bidders to slots should maximize $\sum v_i x_i$,

where x_i now denotes the CTR of the slot to which i is assigned (or 0 if i is not assigned to a slot). Each slot can only be assigned to one bidder, and each bidder gets only one slot.

(3) **Polynomial** running time. Remember zillions of these auctions need to be run every day!



- Two things to consider: who wins what and how much to charge?
 - Make the “correct” choice for only the first one is not enough, e.g. single item auction.

- Tackle this one step at a time:
 - 1) Assume that bidders bid truthfully. Then, how should we assign bidders to slots so that property (2) and (3) hold?

 - 2) How do we set prices so that truthful is a dominant strategy?



□ Tackle this one step at a time:

- 1) Assume that bidders bid truthfully. Then, how should we assign bidders to slots so that property (2) and (3) hold?

Greedy Alg. ✓

- 1) How do we set prices so that being truthful is a dominant strategy?

Can we run k Vickrey auctions?



- ❑ NO! It's not truthful!
- ❑ Example: 3 bidders 2 slots.
 $v_1=7$, $v_2=6$ and $v_3=1$; $\alpha_1=1$ and $\alpha_2=0.4$.
- ❑ Instead of being truthful, it's better for bidder 1 to bid 5 and win the second slot.



□ Tackle this one step at a time:

- 1) Assume that bidders bid truthfully. Then, how should we assign bidders to slots so that property (2) and (3) hold?

Greedy Alg. ✓ .

- 1) How do we set prices so that being truthful is a dominant strategy?

Myerson's Lemma!



Myerson's Lemma

Single-dimensional Environment



□ Definition:

- n bidders
- Each bidder i has a private valuation v_i , its value “per unit of stuff” that she gets.
- A feasible set X . Each element of X is an n -dimensional vector (x_1, x_2, \dots, x_n) , where x_i denotes the “amount of stuff” given to bidder i .

Single-dimensional Environment



□ Examples:

- Single-item auction: X is the set of 0-1 vectors that have at most one 1
- k units of the same items for sale: each bidder wants only one item. X is the 0-1 vectors satisfying $\sum_i x_i \leq k$.
- Sponsored search auction: X is the set of n -dimensional vectors corresponding to assignments of bidders to slots. If bidder i is assigned to slot j , then the component x_i equals the CTR α_j of its slot.



- Make Two choices:
 - Allocation rule
 - Payment rule

Sealed-Bid Auctions:

1. Collect bids $b=(b_1, \dots, b_n)$
2. [allocation rule] Choose a feasible allocation $x(b)$ in X as *a function of the bids*
3. [payment rule] Choose payments $p(b)$ as *a function of the bids*.

Two important definitions



Definition 1: (Implementable Allocation Rule) An **allocation rule** x for a single-dimensional environment is **implementable** if there is a **payment rule** p such the sealed-bid auction (x, p) is **DSIC**.

- Example: The allocation rule that gives the item to the highest bidder is implementable
- Is the Greedy allocation rule implementable for Sponsored Search Auctions?
- How about giving the item to the second highest bidder? Lowest bidder?

Two important definitions



Definition 2: (Monotone Allocation Rule) An **allocation rule** x for a single-dimensional environment is **monotone** if for every bidder i and bids b_{-i} by the other bidders, the allocation $x_i(z, b_{-i})$ to i is **nondecreasing in its bid z** .

- Example: The allocation rule that gives the item to the highest bidder is monotone.
- The Greedy allocation rule for Sponsored Search Auctions is monotone.
- Giving the item to the second highest bidder or the lowest bidder is not monotone.

Myerson's Lemma



[Myerson '81 ] Fix a single-dimensional environment.

(a) An allocation rule x is implementable **if and only if** it is **monotone**.

(b) If x is monotone, then there is a **unique** payment rule such that the sealed-bid mechanism (x, p) is DSIC [assuming the normalization that $b_i = 0$ implies $p_i(b) = 0$].

(c) The payment rule in (b) is given by an explicit formula.

Myerson's Lemma



Corollary: The greedy allocation rule for sponsored search is **Implementable**. Thus, there is a truthful auction that maximizes social welfare in sponsored search.

Myerson's Lemma



[Myerson '81 ] Fix a single-dimensional environment.

- (a) An allocation rule x is implementable **if and only if** it is **monotone**.
- (b) If x is monotone, then there is a **unique** payment rule such that the sealed-bid mechanism (x, p) is DSIC [assuming the normalization that $b_i = 0$ implies $p_i(b) = 0$].
- (c) The payment rule in (b) is given by an explicit formula.

Proof: See the Board.