

## Ad auctions

As we've discussed:

Generation 1 of Web Ads were "traditional":  
large contracts negotiated to show a large number  
of impressions. Contracts were negotiated case-by-case  
... just like magazine advertising.

Generation 2 was started by Overture in 1997  
and changed the game completely:

- advertisers bid for positions  
on particular keywords
  - and they paid per click
- Ads were targeted and payment  
was only when ad was "successful"

Now with Basic Auction theory under our  
belts, we can discuss what ad auctions  
actually implement.

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### The Ad auction framework

Multiple goods (ad slots) up for sale, for  
each search.

Bidder valuations unknown → hence the auction

each search.

Bidder valuations unknown  $\rightarrow$  hence the auction

$\rightarrow$  So this is a more general setting than we talked about last time.

\* note submit a single bid even though slots are of different value  $\rightarrow$  done to simplify advertiser task.

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### Ad auctions circa 1997

Goto/Overture's first auctions were designed as 1<sup>st</sup> price auctions.

top k bids are assigned to slots  
 $\mapsto$  k and pay their bids

$\rightarrow$  we've seen already that this is not a great design.

And here it can easily lead to cyclic behavior.

ex:	Bidders	Slots
	$v_1 = \$10/\text{click}$	1 <u>200 clicks/hr</u>
	$v_2 = \$4$	2 <u>175 clicks/hr</u>
	$v_3 = \$2$	

Suppose  $b_2 = 2.01$  ... to ensure he gets a slot

then  $b_1 = 2.02$  ... to beat  $b_2$  & get slot 1

then  $b_2 = 2.03$

and so on, until  $b_1 = 4.01$

then  $b_2 = 2.01$

and we cycle.

$\rightarrow$  no pure strategy equilibrium  
& so bidders will want to constantly revise their bids.

\* this was actually observed in Overture

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(see ppt)

Despite this issue, Overture was successful, and was used by most search engines until 2002.

Note: GoTo/Overture started at Idealab  
... a Pasadena company... that also launched Roomba and lots of other cool stuff.

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It wasn't until 2002 that Google introduced its own system - Adwords - to address this

They introduced:

Generalized Second price Auctions

... and then Yahoo/Overture followed suit quickly

This generalizes the single item 2<sup>nd</sup> price auction in the "natural" way

for  $i < \#$  positions bidder with  $i$ th largest bid,  $b_i$ , pays  $b_{i+1}$

Ex: In our earlier example, if we suppose all bidders bid truthfully, this gives

Slot 1  $\rightarrow$  Bidder 1 for \$4/click  
Slot 2  $\rightarrow$  Bidder 2 for \$2/click

Q: Is truth-telling a dominant strategy always?

A: No!

Consider our example...

payoff to 1 in truthful setting is

$$(10-4)200 = 1200$$

if he deviates to a \$3 bid he gets 2<sup>nd</sup> position for \$2/click and has payoff

$$(10-2)175 = 1400$$

\* In other there can be multiple equilibria!

★ Further there can be multiple equilibria!  
... we'll come back to this  
and see an example later.

So GSP doesn't have the nice properties  
that 2<sup>nd</sup> price had for a single item...

but it's what Yahoo & Google  
use today (to a first approx)

... though for some settings,  
1<sup>st</sup> price is still used!

↑  
because the infrastructure  
is hard to change.

But, there's an important  
issue left to discuss:

Different ads have different click through  
rates for different terms.

Q: How should this change the auction?

A (Google):  $b_i \mapsto r_i b_i$

A (Yahoo):  $b_i \mapsto b_i$  (ignore Clickthrough  
rates)

Q: Why the difference?

A: Google maximizes its own revenue  
Yahoo's maximizes the "relevance" of  
the ads shown.

So, you now have a good idea of what  
Yahoo & Google use for their auctions.

... but we've also seen that  
GSP has some problems.

Q: Can we design a truthful auction for  
this setting?

A: Yes ... it turns out Google & Yahoo  
just didn't know their economics.

just didn't know their economics.

## VCG Auctions

It turns out that Google chose the "wrong" generalization of the 2nd price auction.

The "right" one was given in 60s by Economists.

VCG  $\Rightarrow$  Vickrey, Clark, Groves

All three independently discovered the design in different contexts

V-61  
C-71  
G-73

} tell story

The GSP auction isn't truthful

The VCG auction is...

So, what is the "right" generalization of the 2nd price auction?

★ Charge each winner a price equal to the total amount better off everyone else would be if the individual weren't there.

(same principle as marginal cost pricing)  
for routing games

ex: Returning to

Bidders	Slots
$v_1 = \$10/\text{click}$	1 $\underline{200 \text{ clicks/hr}}$
$v_2 = \$4$	2 $\underline{175 \text{ clicks/hr}}$
$v_3 = \$2$	

We have:

- Bidder 1 pays:  $\$100 + \$350 = \$450 \Rightarrow \$2.50/\text{click}$   
↑  
extra 2  
would get  
w/o 1 there      ↑  
extra 3  
would  
get w/o  
1 there

- Bidder 2 pays:  $\$350$   
↑  
extra 3 would get  
w/o 2 there

extra \$ would get  
w/o 2 there

Formally:

The top bids get assigned to slots in order

$$\& P_{ij} = V_{B-j}^S - V_{B-j}^{S-i}$$

$\uparrow$  price for advertiser  
 $j$  to get slot  $i$

$\max$  value of an assignment  
 given slots sit  
 bidders  $B-j$

$$P_{ij} = (r_j - r_{j+1}) b_{i+1} + P_{i+1} d^{i+1}$$

Observe: this reduces to 2<sup>nd</sup> price in case of a single item

$$V_{B-j}^{S-i} = 0$$

$$V_{B-j}^S = \text{2nd highest value}$$

Now, time to prove the main result for VCG:

Thm: VCG results in

- (1) truthfulness is the dominant strategy
- (2) assignment maximizes total value

Pf: (2) is immediate given (1).

If all bid their true valuation then assigning them in that order maximizes total value.

→ this is a key benefit of truthful auctions

(1) takes some more work

Suppose  $j$  announces true valuation  $v_{ij}$ , she gets position  $i$  &

her payoff is  $v_{ij} - p_{ij}$

We now want to show that she has no incentive to deviate.

Suppose  $j$  lies about her valuations, and gets slot  $h$  instead.

Then we need to show that

$$v_{ij} - p_{ij} \geq v_{hj} - p_{hj}$$

$$\Leftrightarrow v_{ij} - [V_{B-j}^S - V_{B-j}^{S-i}] \geq v_{hj} - [V_{B-j}^S - V_{B-j}^{S-h}]$$

$$\Leftrightarrow \underbrace{v_{ij} + V_{B-j}^{S-i}}_{\sim} \geq \underbrace{v_{hj} + V_{B-j}^{S-h}}_{\sim}$$

$$= V_B^S \leq V_B^S$$

since  $i$  is matched to  $j$  when true valuation is given

since  $h$  is forced to be matched to  $j$ , which is not what happens when true valuation is used.

Nothing in this argument depends on decisions made by other players

e.g. they may not announce their true valuations

$V_{B,j}^{S_i}$  is the maximal valuation assignment using announced values other than yours ... same with  $V_{B,j}^{S_h}$

□

## Comparing VCG & GSP

Q: Why haven't Google & Yahoo switched from GSP to VCG?

A1: They have the GSP architecture already built and switching might be (i) expensive & (ii) confusing to advertisers

A2: Maybe they get more revenue from GSP?

↓  
Is this true?

ex:

Click through rate	Slots	advertisers	revenue/dick
10	a	x	\$7
4	b	y	\$6
0	c	z	\$1

VCG: Assigns  
 $x \rightarrow a$   
 $y \rightarrow b$   
 $z \rightarrow c$

valuations of all 3 are

	a	b	c
x	70	28	0
y	60	24	0
z	10	4	0

so x pays "harm to y & z"

$$40 = (60 - 24) + (4 - 0)$$

↑  
for y              for z

& y pays

$$4 = (70 - 70) + (4 - 0)$$

↑  
for x              for z

revenue = 44

GSP: Has 2 equilibria

$$\begin{aligned} 1) \quad b_1 &= 5 \\ b_2 &= 4 \\ h &= ? \end{aligned}$$

$$\begin{aligned} P_1 &= \$4 : 1^{\text{st}} \text{ slot} \\ P_2 &= \$2 : 2^{\text{nd}} \text{ slot} \\ &\parallel \end{aligned}$$

$$v_3 \leftarrow \text{revenue of } 48 = 40 + 8$$

To check that this is a Nash:

1 gets payoff would get	$70 - 40 = 30$	
	$28 - 8 = 20$	if dropped price

2 gets payoff would get	$24 - 8 = 16$	
	$40 - 50 = 10$	if raised price

$$\begin{array}{ll} 2) \quad b_1 = 3 & p_1 = 1 : 2^{\text{nd}} \text{ slot} \\ b_2 = 5 & p_2 = 3 : \text{top slot} \\ b_3 = 1 & \downarrow \\ \downarrow & \text{revenue of } 34 = 30 + 4 \end{array}$$

To check that this is a Nash:

1 gets payoff would get	$28 - 4 = 24$	
	$70 - 50 = 20$	if raised price

2 gets payoff would get	$60 - 30 = 30$	
	$24 - 4 = 20$	if lowered price

So VCG collects more than 2<sup>nd</sup> GSP equilibrium but less than the 1<sup>st</sup>.

$\Rightarrow$  GSP may collect more revenue depending on which equilibria bidders converge to.

... lots of interesting current research on this topic.