

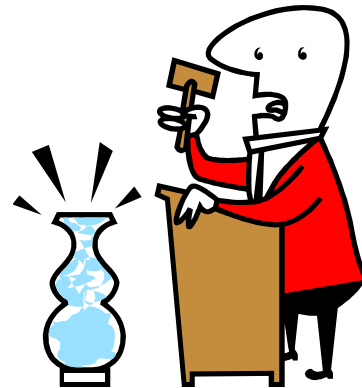


- Matching Market
  - if the search engine knew all the advertisers' valuations for clicks
- Vickrey-Clarke-Groves (VCG) mechanism
  - the advertisers' valuations are not known
  - encouraging truthful bidding, or to deal with the consequences of untruthful bidding
  - the design of a price-setting procedure for matching markets
- Generalized Second-Price Auction (GSP)
  - the procedure that the search industry adopted



# Setting the prices

- Search engines determine prices using an **auction procedure**, in which they solicit bids from the advertisers.





# The Bidding Prices

- In the early days
  - advertisers were simply asked to report their revenues per click in the form of bids, and then they were assigned slots in decreasing order of these bids.
  - advertisers are under-report, small increments to experiment with the outcome



# Four main types of auctions

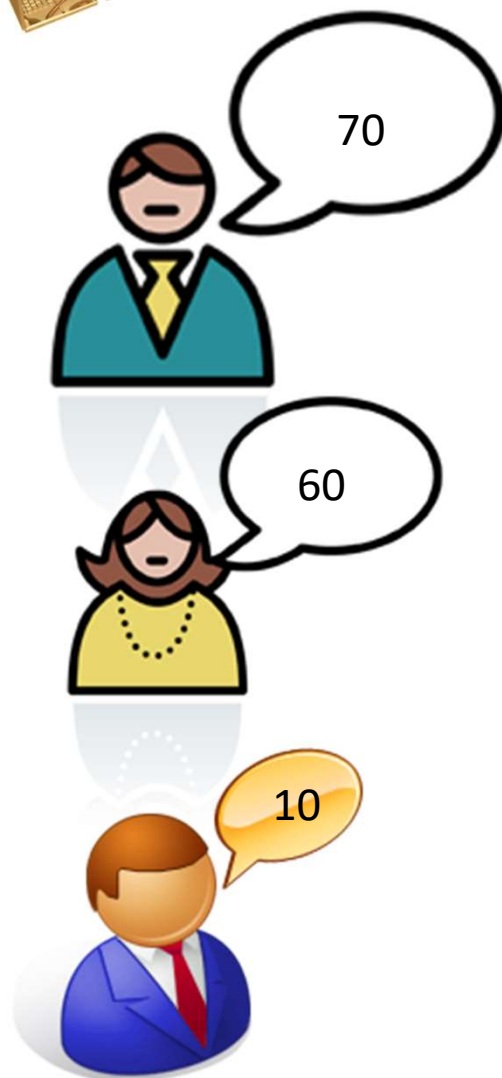
- Ascending-bid auctions (English auctions)
- Descending-bid auctions (Dutch auctions)
- First-price sealed auctions
- Second-price sealed-bid auctions (Vickrey auctions)



- **First-price auctions**
  - bidders underreport, non-truthful bidding, very complex bidding for everyone
- **Second-price auctions**
  - truthful bidding is a dominant strategy for all advertisers



# The Second-Price Auction (single item)

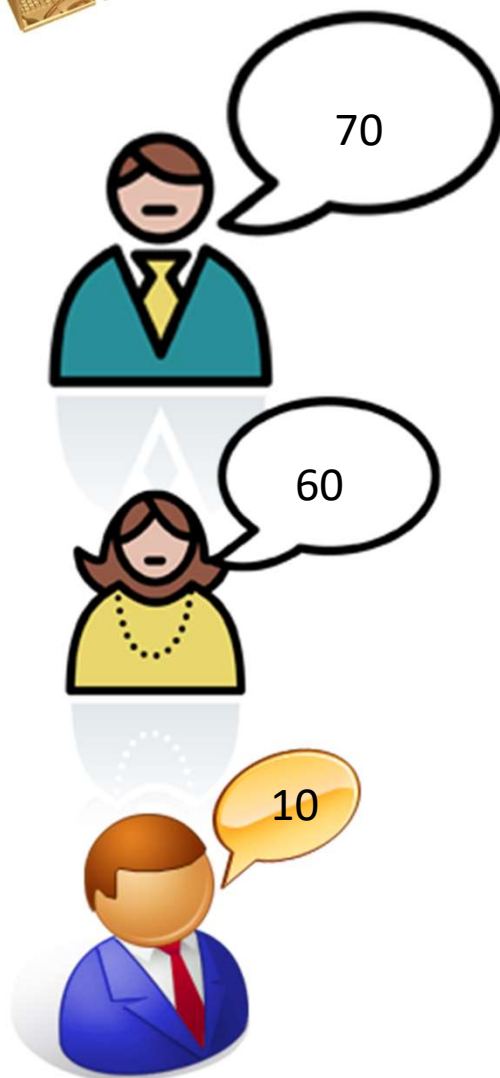


- The bidders' values for the item are  $v_1, v_2, v_3, \dots, v_n$  in decreasing order.



# The Second-Price Auction (single item)

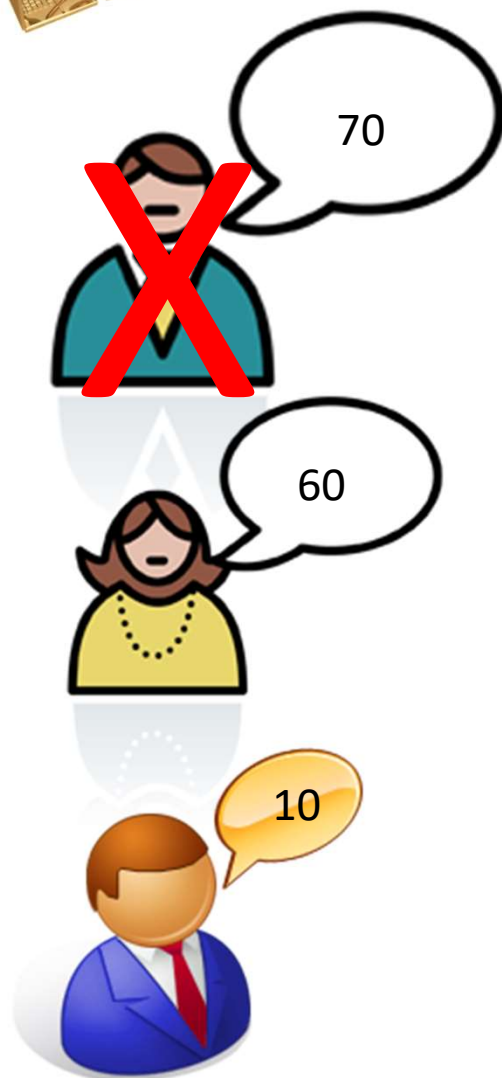
- What is the price ?



Each individual is  
charged the harm  
they cause to the  
rest of the world



# The Second-Price Auction (single item)



- The harm to the second bidder is 60
- No harm to the third bidder

Assign the item to  
the highest  
bidder at the  
second-highest  
price





# Multiple items



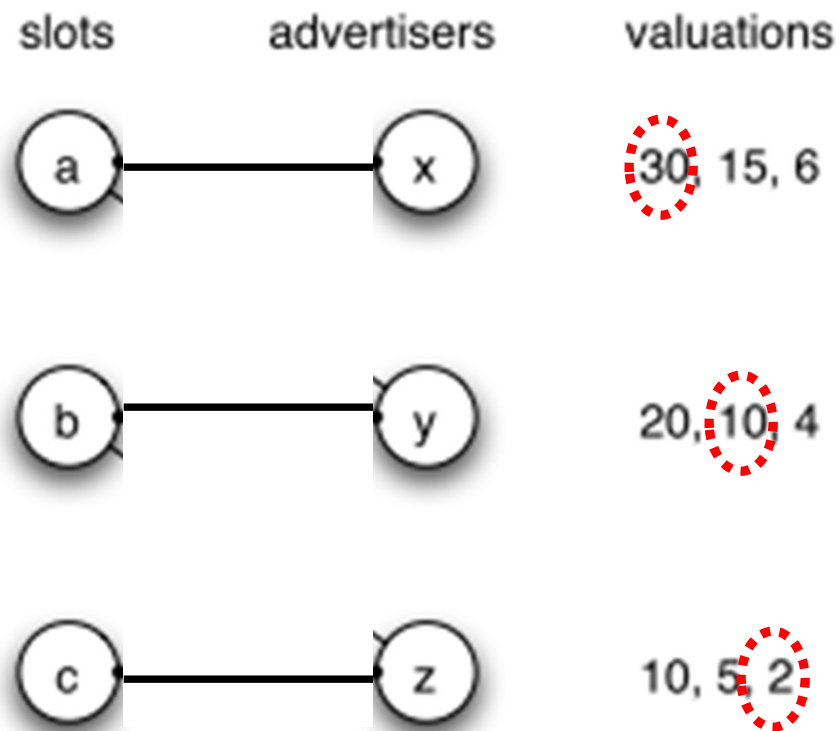
Each individual is  
charged the harm  
they cause to the  
rest of the world

How do we  
determine  
the harm ?



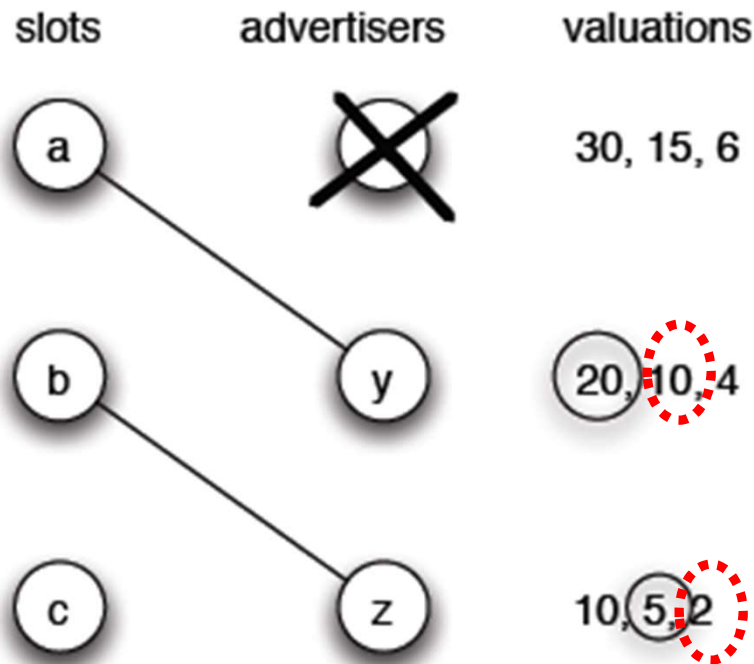


# The VCG Principle





# The VCG Principle

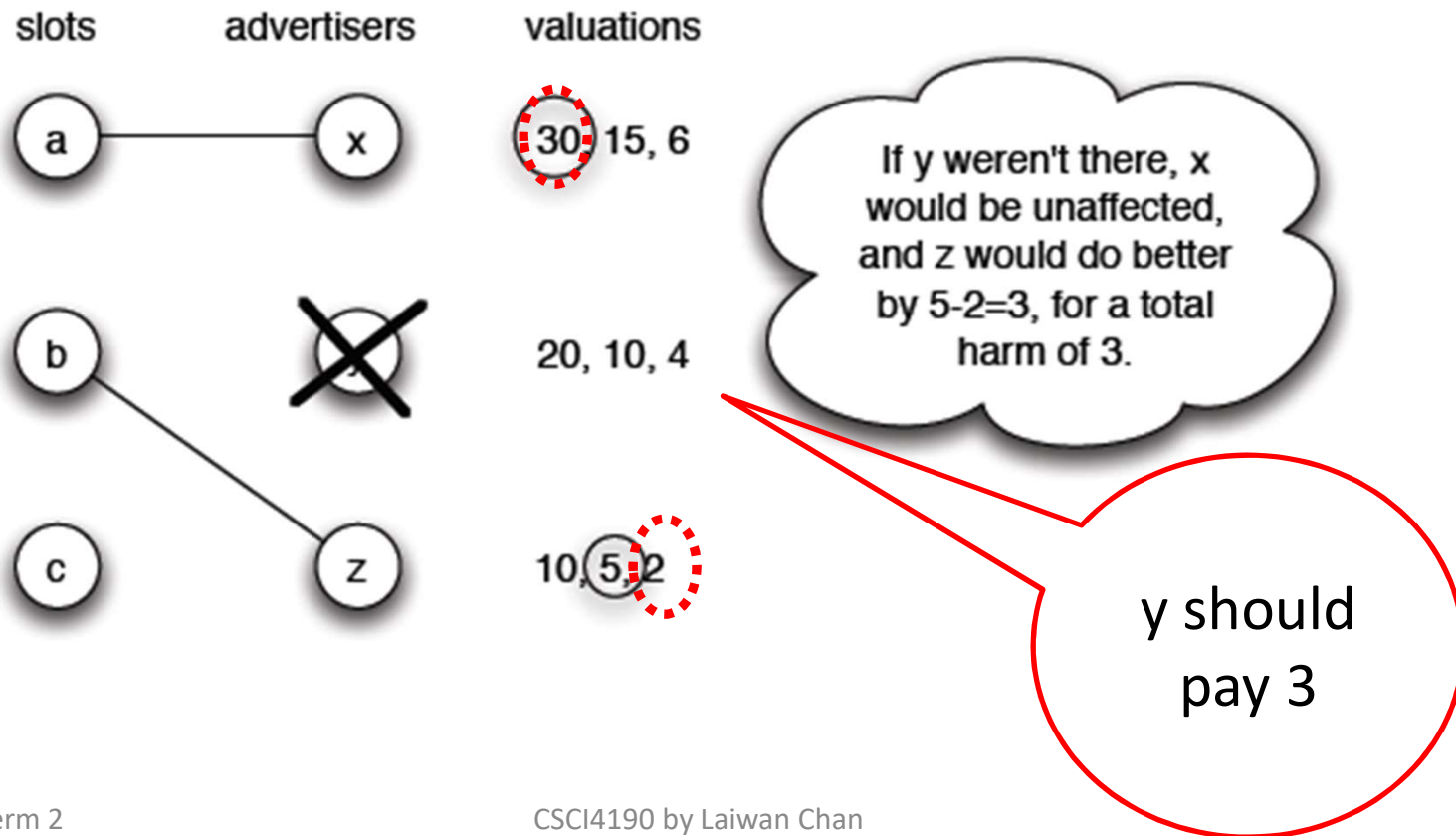


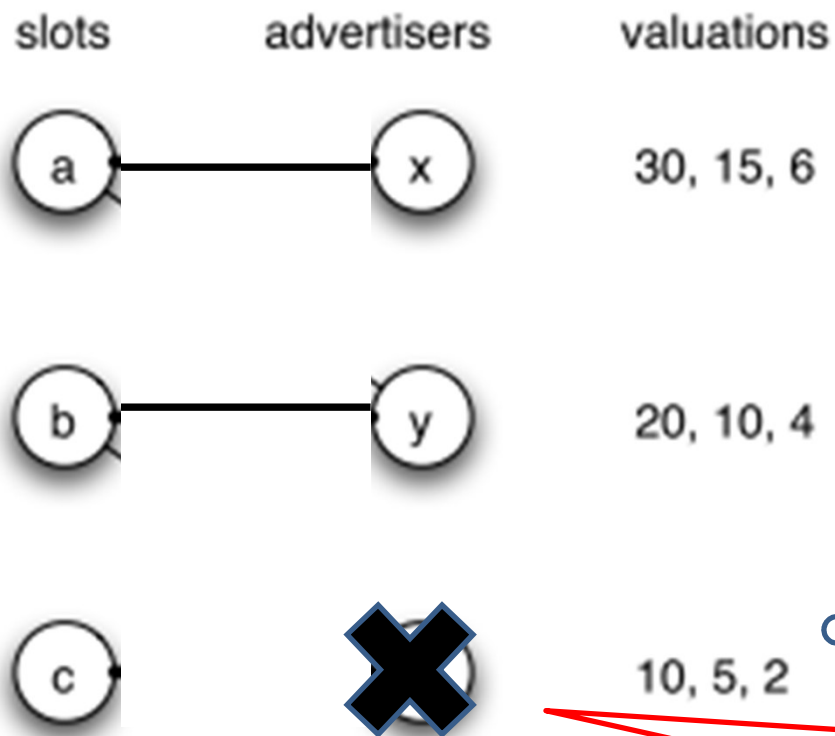
x should  
pay 13

If x weren't there, y  
would do better by  
 $20 - 10 = 10$ , and z would  
do better by  $5 - 2 = 3$ ,  
for a total harm of 13.



# The VCG Principle





If z weren't there, x and y would not be affected, z causes no harm to the rest of the world

z should pay 0

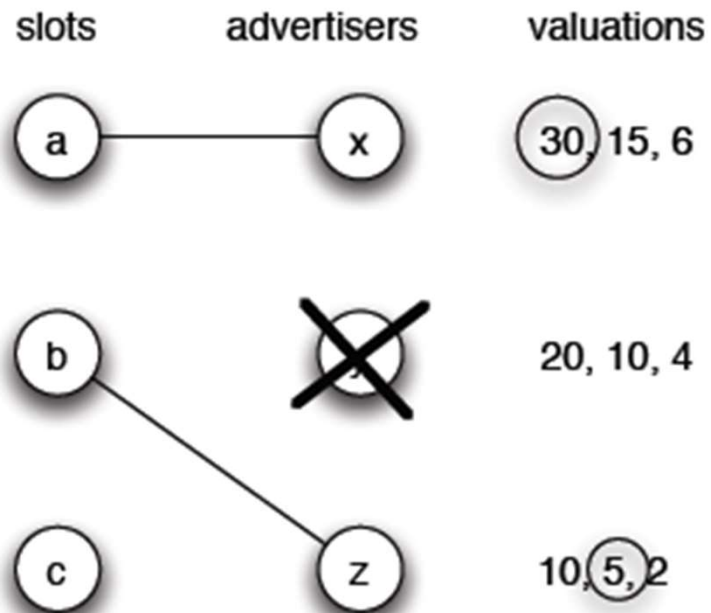


- $S$  = the set of sellers
- $B$  = the set of buyers
- $V_B^S$  = the maximum total valuation over all possible perfect matching of sellers and buyers
- $S-i$  = the set of sellers with seller  $i$  removed
- $B-j$  = the set of buyers with buyer  $j$  removed



# The VCG Principle

- $V_{B-j}^S$  = total valuation if buyer  $j$  does not exist



$$V_{B-y}^S = 30 + 5 = 35$$



# The VCG Principle

- $V_{B-j}^{S-i}$  = total valuation if buyer  $j$  and seller  $i$  do not exist

slots	advertisers	valuations
a	x	30, 15, 6
b	y	20, 10, 4
c	z	10, 5, 2

$$V_{B-j}^{S-i} = 30 + 2 = 32$$

The VCG price  $p_{ij} = V_{B-j}^S - V_{B-j}^{S-i}$

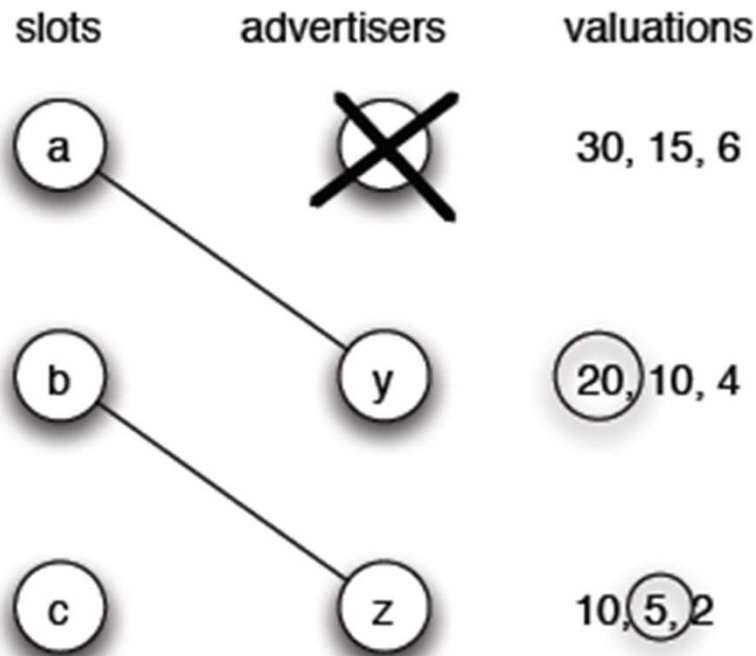
The VCG price  $p_{by} = 35 - 32 = 3$





# The VCG Principle

The VCG price  $p_{ij} = V_{B-j}^S - V_{B-j}^{S-i}$









The VCG price  $p_{ax} = V_{B-x}^S - V_{B-x}^{S-a} = (20+5) - (10+2) = 13$



# The VCG Price-setting procedure

1. Ask buyers to announce valuations for the items

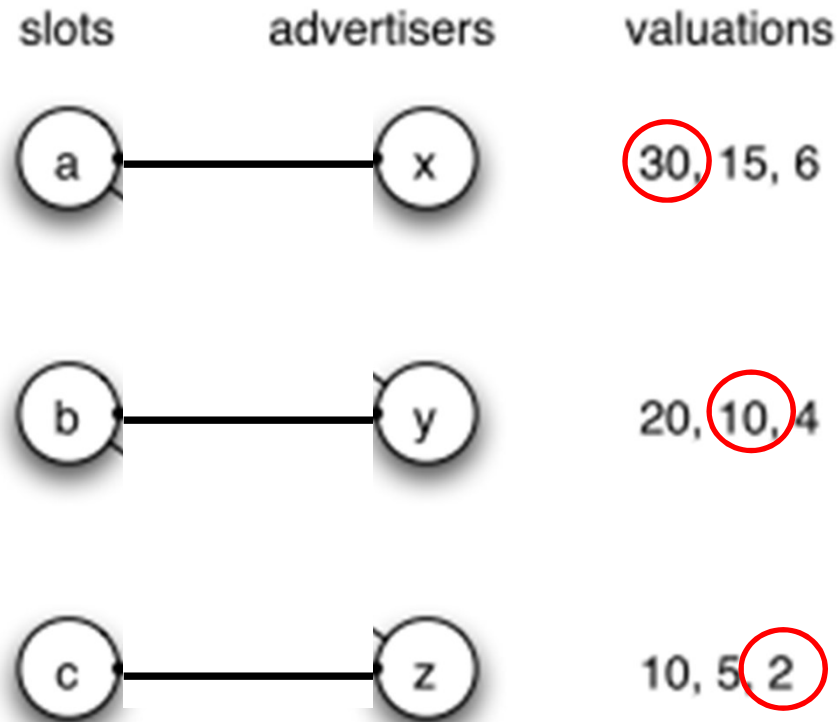
slots	advertisers	valuations
		30, 15, 6
		20, 10, 4
		10, 5, 2

Need not  
to be  
truthful



## The VCG Price-setting procedure

2. Choose a perfect matching that maximizes the total valuations of each buyer for what they get.



Total  
valuations =  
 $30+10+2 = 42$



## The VCG Price-setting procedure

3. Charge each buyer the appropriate VCG price.

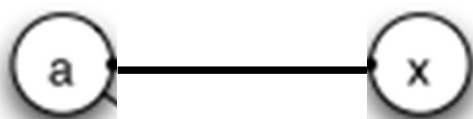
Prices

slots

advertisers

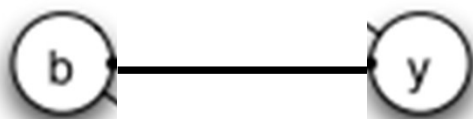
valuations

13



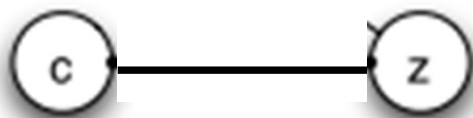
30, 15, 6

3



20, 10, 4

0



10, 5, 2

Total  
valuations =  
 $30+10+2 = 42$



- **Claim :** If items are assigned and prices computed according to the VCG procedure, then (a) truthfully announcing valuations is a dominant strategy for each buyer, and (b) the resulting assignment maximizes the total valuation of any perfect matching of slots and advertisers.



- **Claim :** (b) the resulting assignment maximizes the total valuation of any perfect matching of slots and advertisers.
- **Proof :** if buyers report their valuations truthfully, then the assignment of items is designed to maximize the total valuation by definition.

Please refer to the textbook for the proof of claim (a)



# Setting prices through an auction

- Matching Market
  - if the search engine knew all the advertisers' valuations for clicks
- Vickrey-Clarke-Groves (VCG) mechanism
  - the advertisers' valuations are not known
  - encouraging truthful bidding, or to deal with the consequences of untruthful bidding
  - the design of a price-setting procedure for matching markets
- Generalized Second-Price Auction (GSP)
  - the procedure that the search industry adopted



# The Generalised Second Price Auction (GSP)

- What is the price ?



awards  
each slot  $i$  to the  $i$ th  
highest bidder, at a  
price per click equal  
to the  $(i + 1)$ st  
highest bid.



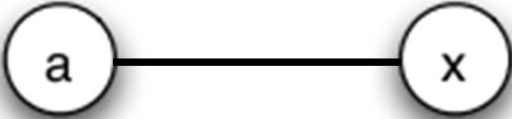
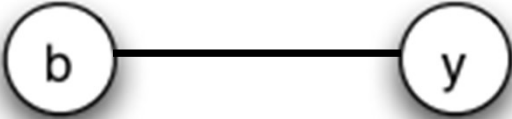
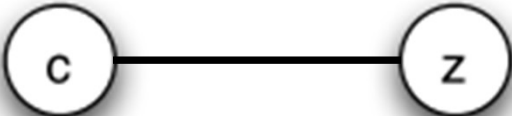


# GSP

- For multiple slots
  - when the bids per click are  $b_1, b_2, b_3, \dots$  in descending order
- GSP charges a cumulative price of  $r_i b_{i+1}$  for slot  $i$ .
  - the  $i$ th highest bidder will get slot  $i$  at a price per click of  $b_{i+1}$ , multiplying by the clickthrough rate of  $r_i$



## If each advertiser bids its true valuation

clickthrough rates	slots	advertisers	revenues per click	valuations
10			7	70, 28, 0
4			6	60, 24, 0
0			1	10, 4, 0

For GSP,  $p_{ax} = 6 \times 10 = 60$   
 $p_{by} = 1 \times 4 = 4$

Revenue for the publisher = 64



# GSP

- GSP was originally developed at Google.
- It had been in use for awhile in the search industry.