# Auctions as Games: Equilibria and Efficiency Near-Optimal Mechanisms

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### Yesterday: Simple Auction Games

- item bidding games: second price simultaneous item auction
- Very simple valuations: unit demand or even single parameter
- Ad Auctions: Generalized Second Price Today:
- More auction types
- More expressive valuations

## Summary of problems

Full information single minded bidders

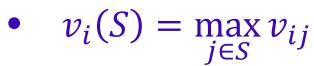












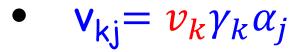




Bidding b<sub>ij</sub> >v<sub>ij</sub> is dominated.

assume not done

GSP (AdAuction), also single parameter:







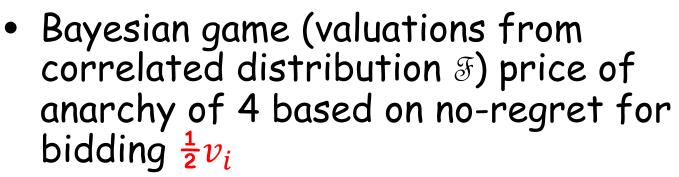






## Summary of techniques

- Price of anarchy 2 based on: noregret for bidding  $b_{ij_i^*} = v_{ij_i^*}$  and  $b_{ij} = 0 \ \forall j \neq j_i^*$
- Bound also applies to learning outcomes (see more Avrim Blum)



- GSP
- Single value auctions

























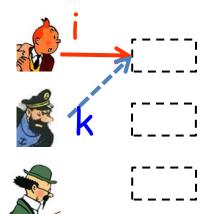
#### First Price vs Second Price?

Proof based on "player i has no regret about bidding  $\frac{1}{2}$   $v_i$ " applies just as well for first price.

If player wins: price  $\leq b_i \leq \frac{1}{2}v_i$ hence utility at least  $\frac{1}{2}v_i$ 

• If he looses, all his items of interest, went to players with bid (and hence value) at least  $\frac{1}{2}v_i$ 

If i has value of opt, i or k has high value at Nash



#### First Price vs Second Price?

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Proof based on "no-regret for bidding b_{ij_i^*} = v_{ij_i^*} and b_{ij} = 0 \ \forall j \neq j_i^{*}" no good, but similar proof applies with b_{ij_i^*} = \frac{1}{2} v_{ij_i^*} and b_{ij} = 0 \ \forall j \neq j_i^{*}"
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- If player wins: price  $\leq b_{ij_i^*} \leq \frac{1}{2}v_{ij_i^*}$  hence utility at least  $\frac{1}{2}v_{ij_i^*}$
- If he looses, his items of interest went to players with bid (and hence value) at least  $\frac{1}{2}v_{ij_i^*}$













#### First Price Pure Nash

Theorem [Bikchandani GEB'99] Any valuation, first price pure Nash, socially optimal. Any combinatorial valuation.

Proof each item i was sold for a price pi.

• price p is market equilibrium: all players maximizing  $v_i(S) - \sum_{i \in S} p_i$  players

otherwise bid  $p_i^+$  for items in  $i \in S$ 

market equilibrium is socially optimal

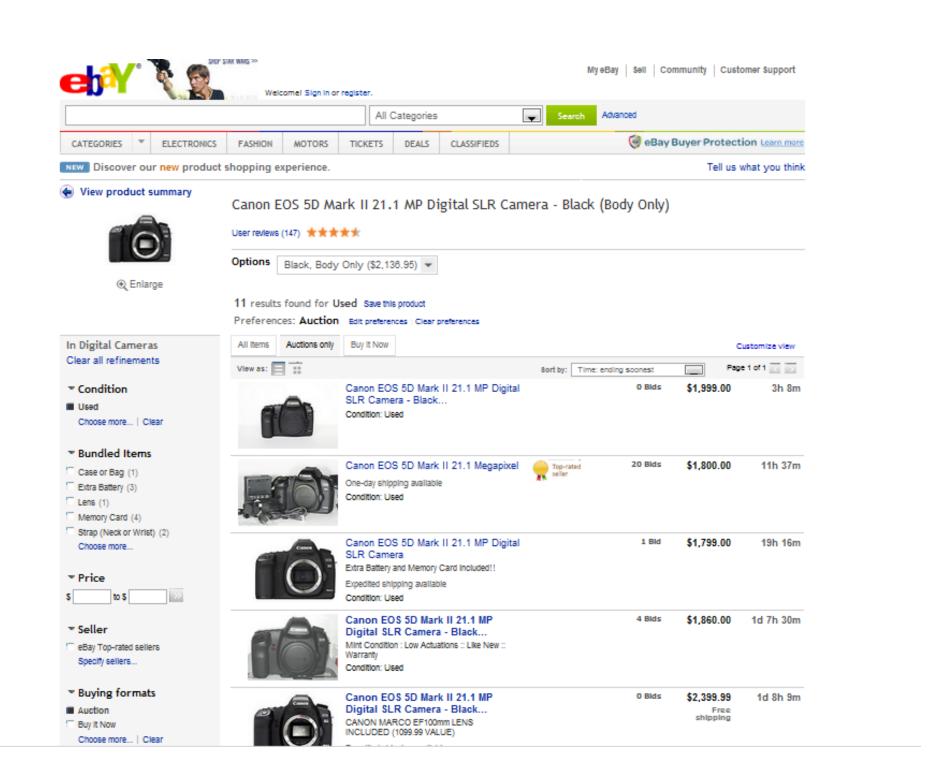
 $\{S_1, ..., S_k\}$  Nash and  $\{S_1^*, ..., S_k^*\}$  alternate soln.

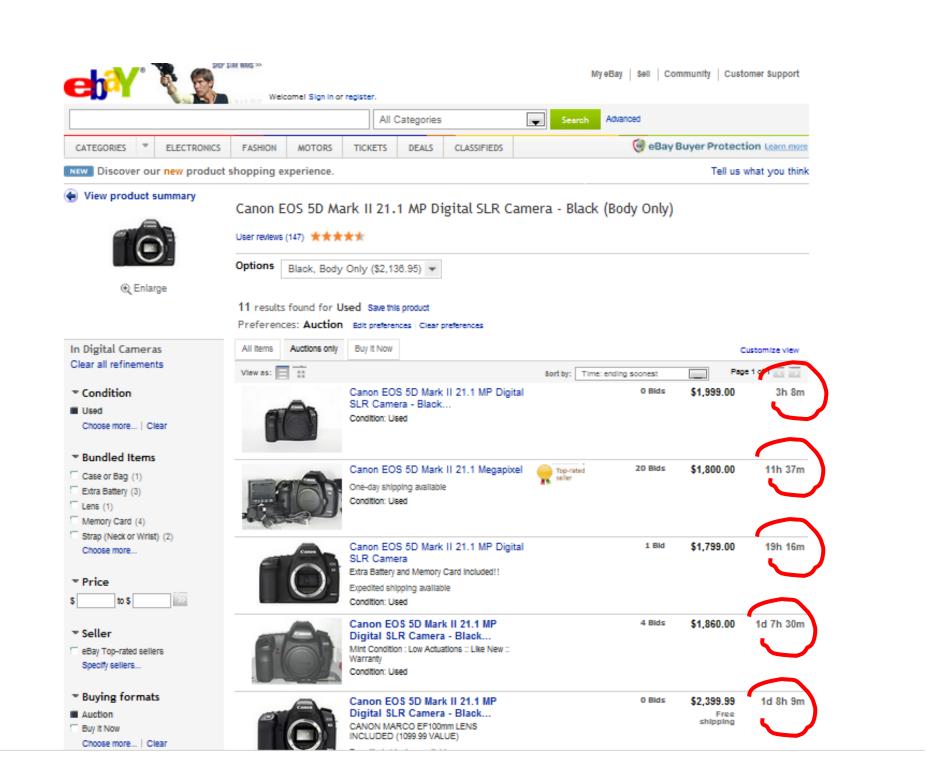
$$v_i(S_i) - \sum_{i \in S} p_i \ge v_i (S_i^*) - \sum_{i \in S} p_i$$

sum over all i  $\sum_{i} v_i(S_i) \geq \sum_{i} v_i(S_i^*)$ 

## Sequential Game ( by) How important is simultaneous play?

Buyers Sellers 10

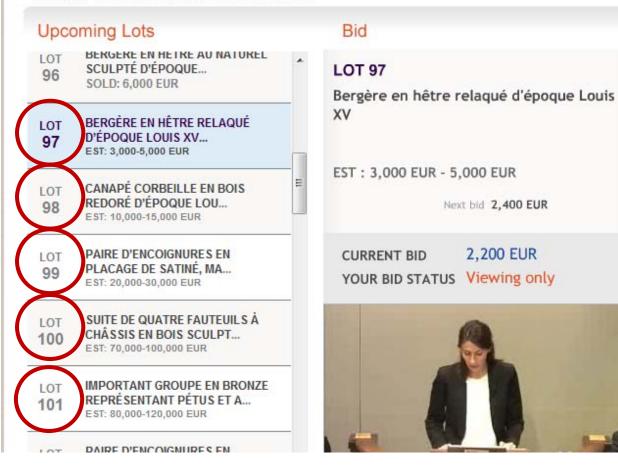




#### Sotheby's BIDnow

#### PF1201 | Important Mobilier, Sculptures et Objets dArt

Welcome, Guest | Paddle: W\_ | Saleroom Notices



#### **Current Lot**



## Second Price and Sequential Auctions

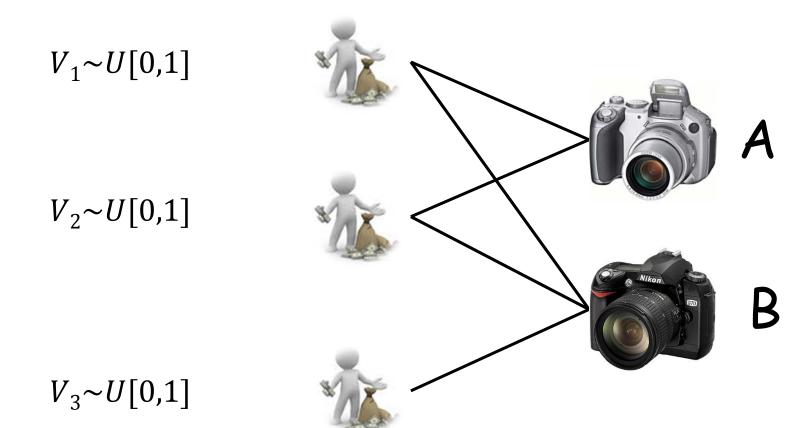
- Second price allows signaling
- Bidding above value is not dominated
- Can have unbounded price of anarchy both with
  - Additive valuations
  - Unit demand valuations (even after iterated elimination of dominated strategies)

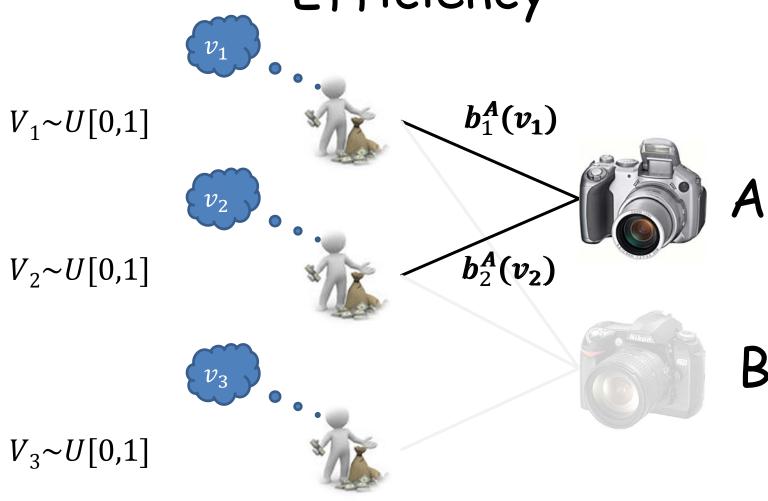
Bad example for 2<sup>nd</sup> price

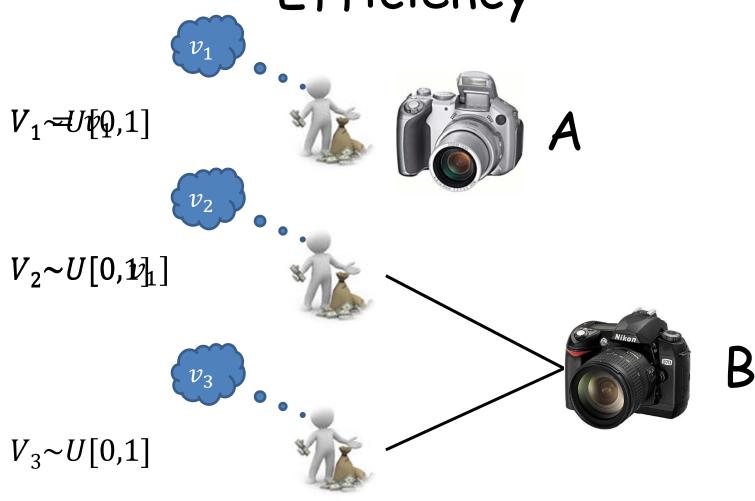
	<u>k</u>			k				
A	$\begin{pmatrix} 0 \end{pmatrix}$		0	0		0	20	20
B						0	20	20
C							10	0
D	1			$\epsilon$				
•••								
Z			1			$\epsilon$		

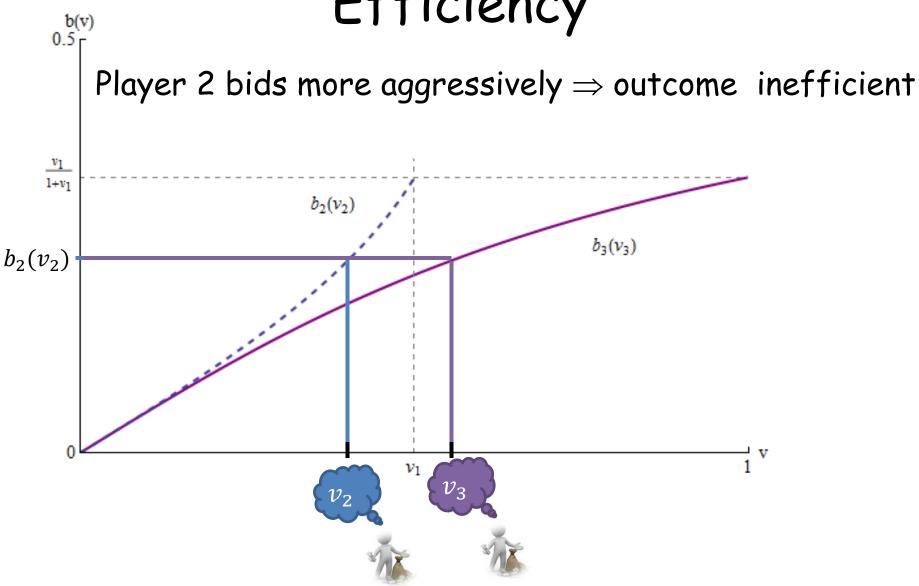
## Sequential game

- Items are not available at the same time: sellers arrive sequentially
- Players are strategic and make decisions reasoning about the decisions of other players in the future
- Each player has unit demand valuation  $\mathbf{v}_{ij}$  on the items
- First price auction
  - Full Information (Paes Leme, Syrgkanis, T. SODA'12)
  - Bayesian (Syrgkanis, T. EC'12)

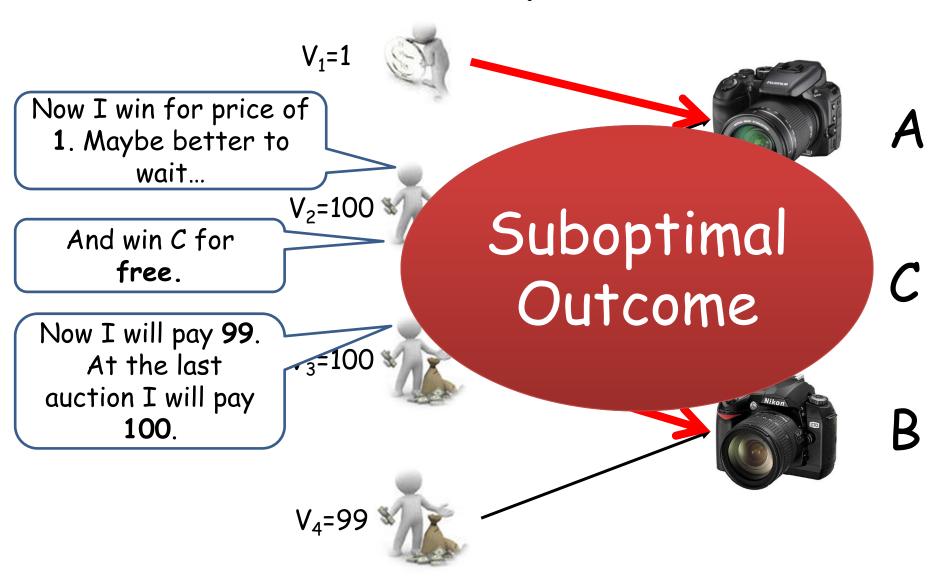








## Example



#### Formal model

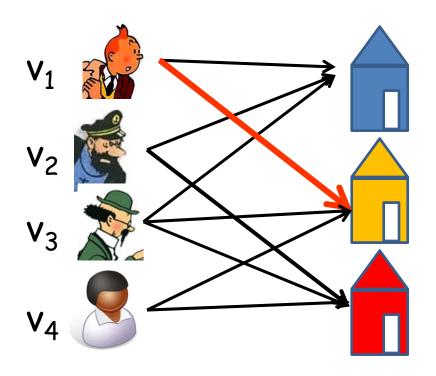
- A bidding strategy is a bid for each item for each possible history of play on previous items
  - Can depend only on information known to player:
  - Identity of winner, maybe also winner's price.
- Solution concept:
  - Subgame Perfect Equilibrium
    - = Nash in each subgame

### Bayesian Sequential Auction games

#### Valuations v drawn from distribution &

For simplicity assume for now

- single value v<sub>i</sub> for items of interest
- $(v_1, ..., v_n) \in \mathcal{F}$  drawn from a joint distribution



- OPT  $i_i^*$  random
- Depends on information i doesn't have!
- Deviating in early auctions may change behavior of others later

### Sequential Bayesian Price of Anarchy

Theorem In first price sequential auction for unit demand single parameter bidders from correlated distributions.

The total value  $v(N)=\sum_{i\in N}v_i$  at a Bayesian Nash equilibrium Distribution D of  $N=\{(i,j_i)\}$  is at least  $\frac{1}{4}$ th of optimum expected value of OPT (assuming  $b_i \leq v_i \, \forall \, i$ ).

proof based player i bidding  $\frac{1}{2}v_i$  on all items of interest.

#### Deviation only noticeable if winning!

- If player wins: hence utility =  $\frac{1}{2}v_i$
- If he looses, his items of interest valued at least  $\frac{1}{2}v_i$  by others.

In either case 
$$\frac{1}{2}v_{ij_i^*} \ge v_{ij_i} + v(j_i^*)$$

Sum over player, and take expectation over  $v \in \mathcal{F}$  $\frac{1}{2}OPT \ge E(v(N) + E(v(N)))$ 

## Bayesian Price of Anarchy

Theorem Unit demand single parameter bidders, the total expected value  $E(v(N))=E(\sum_{i\in N}v_i)$  at an equilibrium distribution  $N=\{(i,j)\}$  (assuming  $b_i\leq v_i\forall i$ ) is at least  $\frac{1}{4}$  of the expected optimum  $OPT=E(\max_{M}\sum_{i\in M}v_i)$ 

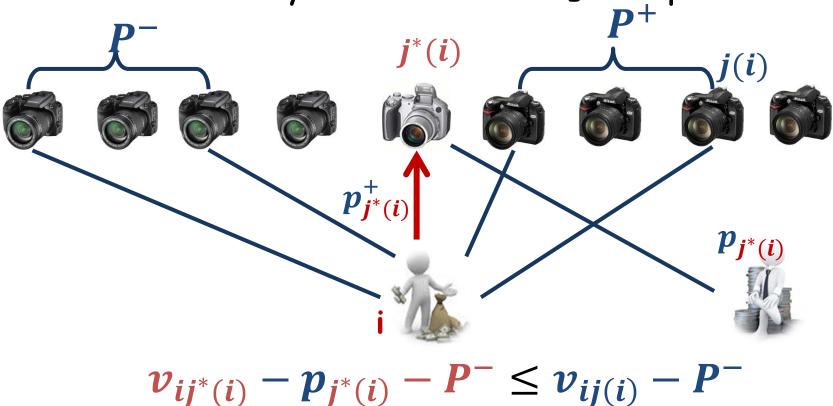
proof "player i has no regret about bidding  $\frac{1}{2}$   $v_i$  on all items of interest"

Simple strategy: no regret about this one strategy is all that we need for quality bound!

Applies for learning outcome, and Bayesian Nash with correlated bidder types.

#### Full info Sequential Auction with unit demand bidders

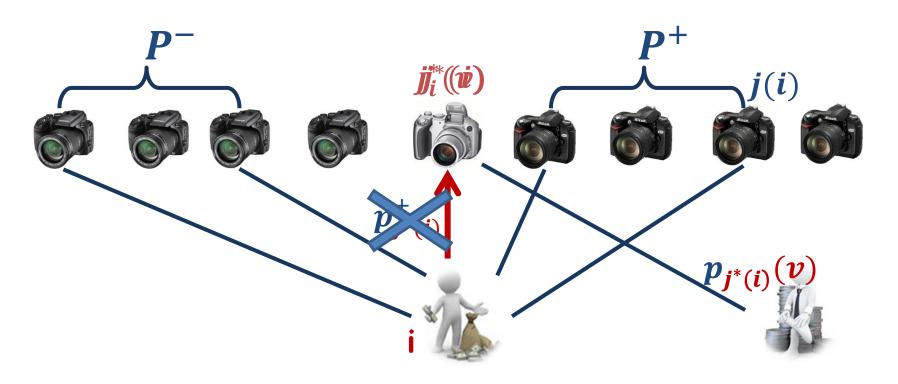
Thm: Value of any Nash at least ½ of optimum



$$v_{ij^*(i)} - p_{j^*(i)} - P^- \le v_{ij(i)} - P^-$$

Summing for all i:  $OPT \leq 2 SPE$ 

## Bayesian Sequential Auction?



$$v_{ij^*(i)} - p_{j^*(i)} - P^- \le v_{ij(i)} - P^-$$

Summing for all i:  $OPT \leq 2 SPE$ 

## Complications of Incomplete Information

•  $j_i^*(v)$  depends on other players' values which you don't know

 Bidding becomes correlated at later stages of the game since players condition on history

#### Simultaneous Item Auctions

Theorem [Christodoulou, Kovacs, Schapira ICALP'08]

Unit demand bidders, assuming values drawn independently  $v_i$  from  $\mathcal{F}_i$ , and  $b_{ij} \leq v_{ij} \forall i \& j$ 

the total expected value  $\mathsf{E}(\mathsf{v}(\mathsf{N})) = \mathsf{E}(\sum_{i \in N} v_{ij_i})$  at an equilibrium distribution  $N = \{(i,j)\}$  is at least  $\frac{1}{2}$  of the expected optimum  $\mathsf{OPT} = E(\max_M \sum_{(i,j) \in \mathsf{M}} v_{ij})$ .

Proof? The assigned item in optimum  $j_i^*$  depends on  $v_{-i}$  hence not known to i.

Not a possible bid to consider

## Simultaneous Item Auctions (proof)

Sample valuations of other players  $w_{-i}$  from  $\mathcal{F}_{-i}$ , Use  $(v_i, w_{-i})$  to determine  $j_i^*$ 

- bid  $b_{ij_i^*} = v_{ij_i^*}$  and  $b_{ij} = 0 \ \forall j \neq j_i^*$
- Nash's value of  $j_i^*$  is  $v(j_i^*)$ . Exp. cost of item  $j_i^*$   $\leq E_v(v(j_i^*)|v_i)$
- i's utility for given  $v_i$

$$E_{w}(v_{ij_{i}^{*}}) - E_{w}E_{v_{-i}}(v(j_{i}^{*})|v_{i})$$

Use Nash for i

$$E_{v_{-i}}(v_{ij_i}) \ge E_w(v_{ij_i^*}) - E_w E_{v_{-i}}(v(j_i^*)|v_i)$$

### Simultaneous Item Auctions (proof2)

Use Nash for i

$$E_{v_{-i}}(v_{ij_i}) \ge E_w(v_{ij_i^*}) - E_w E_{v_{-i}}(v(j_i^*)|v_i)$$

Take expectation over

$$(E_v(v_{ij_i})) \geq (E_v E_w(v_{ij_i^*})) - (E_w E_v(v(j_i^*)))$$

- Ihs sum over i:  $\sum_{i} E_{v}(v_{ij_{i}}) = Nash(5W)$
- rhs term 1:  $E_v E_w(v_{ij_i^*}) = E_{v_i} E_{w_{-i}}(v_{ij_i^*}) = E_v(v_{ij_i^*})$
- Sum over i:  $\sum_{i} E_{v} E_{w}(v_{ij_{i}^{*}}) = OPT(SW)$  (use indep)
- Last term sum over i:

$$\sum_{i} E_{w} E_{v} \left( v(j_{i}^{*}) = \sum_{j} E_{w} E_{v}(v(j)) \right)$$
$$= \sum_{j} E_{v} \left( v(j) \right) = Nash(SW)$$

### Bayesian second Price of Anarchy

Theorem [Christodoulou, Kovacs, Schapira ICALP'08] Unit demand bidders, assuming values drawn independently  $v_i$  from  $\mathcal{F}_i$ , and  $b_{ij} \leq v_{ij} \forall$  i&j

the total expected value  $\mathsf{E}(\mathsf{v}(\mathsf{N})) = \mathsf{E}(\sum_{i \in \mathsf{N}} v_{ij_i})$  at an equilibrium distribution  $N = \{(i,j)\}$  is at least  $\frac{1}{2}$  of the expected optimum  $\mathsf{OPT} = E(\max_{M} \sum_{(i,j) \in \mathsf{M}} v_{ij})$ .

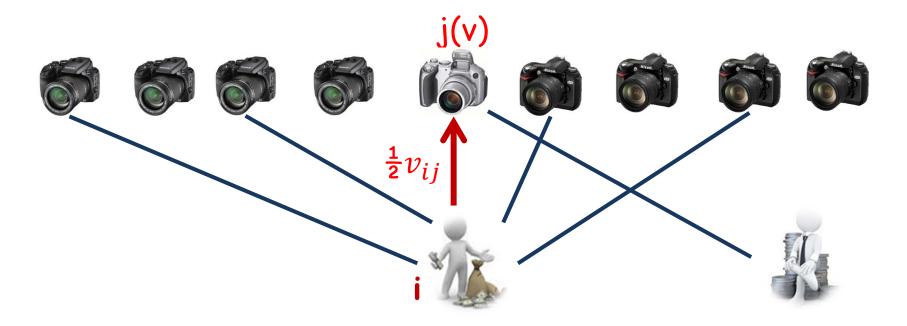
Proof: In expectation over v and w Nash(SW) ≥OPT(SW)-Nash(SW)

## Bayesian Sequential Auction

#### Try similar idea (idea 1):

Sample valuations of other players  $w_{-i}$  from  $\mathcal{F}_{-i}$ , Use  $(v_i, w_{-i})$  to determine  $j = j_i^*$ 

- Bid as before till j comes up, then bid  $\frac{1}{2}v_{ij}$  for j



## Bayesian Sequential Auction (idea 1)

• If i wins item j then he gets utility at least:

$$v_{ij} - \frac{v_{ij}}{2} - P_{ij}^{-}(v, v_{-i}) = \frac{v_{ij}}{2} - P_{ij}^{-}(v, v_{-i})$$

• If he doesn't then the winning bid must be at least:

$$p_j^{-i}(v_i, v_{-i}) \ge \frac{v_{ij}}{2}$$

In any case utility from the deviation is at least:

$$\frac{v_{ij}}{2} - P_i(v_i, v_{-i}) - p_j^{-i}(v_i, v_{-i})$$

## Correlated Bidding

- $p_j^{-i}(v_i, v_{-i})$  depends implicitly on your bid through the history of play
- When player i arrives at  $j_i^*(v_i, w_{-i})$  he doesn't "face" the expected equilibrium price but a "biased" price
- Will not allow us to claim that:
  - "either bidder already gest high value or expected price of some item is high"

## The Bluffing Deviation

- Player draws a random sample  $w_i$  from his value and a random sample  $w_{-i}$  of the other players' values
- He plays as if he was of type  $w_i$  until item

$$j = j_i^*(v_i, w_{-i})$$

Then he bids

$$\frac{v_{ij}}{2}$$

## The Bluffing Deviation

The utility from the deviation is at least:

$$\frac{v_{ij}}{2} - P_i(w_i, v_{-i}) - p_j^{-i}(w_i, v_{-i})$$

Summing for all players and taking expectation

Note: price for j independent of  $v_i$ 

$$\frac{1}{2}OPT - Rev(SPE) - Rev(SPE) \le Util(SPE)$$

$$\frac{1}{2}OPT \leq 2SPE$$

## Simple Auction Games

Examples of simple games

- Item bidding first and second price
- Generalized Second Price

Simple valuations: unit demand

Results: Bounding outcome quality

- -Nash,
- Bayesian Nash,
- learning outcomes

## Overbidding assumptions

- We used: unit demand bidders
  - assume  $b_{ij} \leq v_{ij}$
  - Bidding  $b_{ij} > v_{ij}$  is dominated by  $b_{ij} = v_{ij}$
- more general 2<sup>nd</sup> price results use
  - assume  $\sum_{j \in S} b_{ij} \leq v_i(S)$
  - A best respond in this class always exists!
- First price: no such assumption is needed
- Sequential Auction: overbidding may be very useful/natural

## The Dining Bidder Example

		K				•
A	1	::	1	0	$10 - \frac{k\epsilon}{2}$	0
B	1	::	1	0	0	$10 - \frac{k\epsilon}{2}$
C	$\epsilon$	::	$\epsilon$	20	20 — fish — bread	
D	$\epsilon$		$\epsilon$	$20 - \text{bread} - \frac{\epsilon}{2}$	0	

### References and Better results

- [Christodoulou, Kovacs, Schapira ICALP'08] Price
  of anarchy of 2 assuming conservative bidding, and
  fractionally subadditive valuations, independent
  types
- [Bhawalkar, Roughgarden SODA'10] subaddivite valuations,
- [Hassidim, Kaplan, Mansour, Nisan EC'11] First Price Auction mixed Nash
- [Paes Leme, Syrgkanis, T, SODA'12] Price of Anarchy for sequential auction
- [Syrgkanis, TEC'12] Bayesian Price of Anarchy for sequential auction, better bounds of 3 and 3.16