

# **MS&E 246: Lecture 13**

## **Auctions: Imperfect information**

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# Auctions: Theory

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- Basic definitions
- Revelation principle
- Truthtelling lemma
- Payoff equivalence theorem
- Revenue equivalence theorem
- Symmetric BNE
- Examples next lecture

# A basic auction model

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- Assume two players want the same item

- Type of player  $i$  : valuation  $v_i \geq 0$

Assume:  $P(v_i \leq x_i) = \Phi_i(x_i)$

$F_i$  : continuous dist. on  $[0, V]$ , with pdf  $\phi_i$

*e.g.* uniform:  $\phi_i(x_i) = 1/V$ , for  $x_i \in [0, V]$

# A basic auction model

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Payoffs depend on *winning* and *payment*

- Let  $w = i$  if player  $i$  wins
- Let  $p_i$  = payment of player  $i$
- Payoff to player  $i$  of type  $v_i$ :

$$\Pi_i(w, p_i; v_i) = \begin{cases} v_i - p_i, & \text{if } w = i \\ 0, & \text{otherwise} \end{cases}$$

# A basic auction model

An *auction mechanism* is:

- action set for each player,  $B_i$
- mapping from actions to:

$$\text{winner: } w(b_1, b_2) \in \{1, 2\}$$

$$\text{payments: } p_i(b_1, b_2) \in [0, \infty), \quad i = 1, 2$$

$$\text{Payoff to } i: \quad Q_i(b_1, b_2; v_i) = \Pi_i(w(\mathbf{b}), p_i(\mathbf{b}); v_i)$$

# Example: Second price auction

- Action space (bids):  $B_i = [0, \infty)$ ,  $i = 1, 2$
- Winner:  $w(b_1, b_2) = 1$  if  $b_1 > b_2$ ;  
 $= 2$  if  $b_1 \leq b_2$
- Payments:  $p_i(b_1, b_2) = b_{-i}$  if  $w(b_1, b_2) = i$ ;  
 $= 0$  otherwise

# Bayes-Nash equilibrium

Strategy of  $i$  :  $s_i : [0, \infty) \rightarrow B_i$

$s_1$  is a *Bayesian best response* to  $s_2$  if:

$$\int_0^{\infty} Q_1(s_1(v_1), s_2(v_2); v_1) \phi_2(v_2) dv_2 \geq \int_0^{\infty} Q_1(b_1, s_2(v_2); v_1) \phi_2(v_2) dv_2$$

for all  $b_1 \in B_1$  , and  $v_1 \geq 0$

(similar definition for player 2)

# Bayes-Nash equilibrium

Strategy of  $i$  :  $s_i : [0, \infty) \rightarrow B_i$

$s_1$  is a *Bayesian best response* to  $s_2$  if:

$$\mathbf{E}[Q_1(s_1(v_1), s_2(v_2); v_1) | v_1] \geq \mathbf{E}_{v_2}[Q_1(b_1, s_2(v_2); v_1) | v_1]$$

for all  $b_1 \in B_1$  , and  $v_1 \geq 0$

*(Similarly for player 2)*



# Bayes-Nash equilibrium

---

$(s_1, s_2)$  is a BNE if:

- $s_1$  is a Bayesian best response to  $s_2$
- $s_2$  is a Bayesian best response to  $s_1$

# Second price auction and BNE

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We start by finding a BNE for the second price auction.

Recall: Given type  $v_i$ , *truth telling* is a *weak dominant action* for  $i$ :

$$d_i(v_i) = v_i$$

# Dominant actions and BNE

Consider *any* Bayesian game with type spaces  $T_1, T_2$ .

Suppose for each type  $t_i$ , player  $i$  has a *(weakly) dominant action*  $d_i(t_i)$ :

$$Q_i(d_i(t_i), a_{-i}; t_i) \geq Q_i(a_i, a_{-i}; t_i)$$

for any other action  $a_i$

# Dominant actions and BNE

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Then  $(d_1(\cdot), d_2(\cdot))$  is a BNE.

We know that for each player  $i$ :

$$Q_i(d_i(t_i), d_{-i}(t_{-i}) ; t_i) \\ \geq Q_i(a_i, d_{-i}(t_{-i}) ; t_i)$$

for all types  $t_i, t_{-i}$ , and actions  $a_i$ .

# Dominant actions and BNE

Then  $(d_1(\cdot), d_2(\cdot))$  is a BNE.

Take expectations:

$$\begin{aligned} E[ Q_i(d_i(t_i), d_{-i}(t_{-i}) ; t_i) \mid t_i ] \\ \geq E[ Q_i(a_i, d_{-i}(t_{-i}) ; t_i) \mid t_i ] \end{aligned}$$

for all types  $t_i$ , and actions  $a_i$ .

This is exactly the condition for a BNE.

# Second price auction and BNE

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Conclusion:

In the second price auction,  
*truth telling is a BNE :*

$$s_i(v_i) = d_i(v_i) = v_i$$

(Note that this requires a dominant action  
for *every* possible type!)

# Incentive compatibility

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Auctions where *truthtelling is a BNE*,  
i.e., where:

1.  $B_i = [0, \infty)$  for  $i = 1, 2$ , and
2.  $s_i(v_i) = v_i$  for  $i = 1, 2$  is a BNE

are called *incentive compatible*.

# Revelation principle

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The *revelation principle* shows how to create an incentive compatible auction from any auction with a BNE.



# The revelation principle

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Given:  $B_1, B_2, w(\cdot), p_1(\cdot), p_2(\cdot)$   
and a BNE  $s_1(\cdot), s_2(\cdot)$

Create a new auction with:

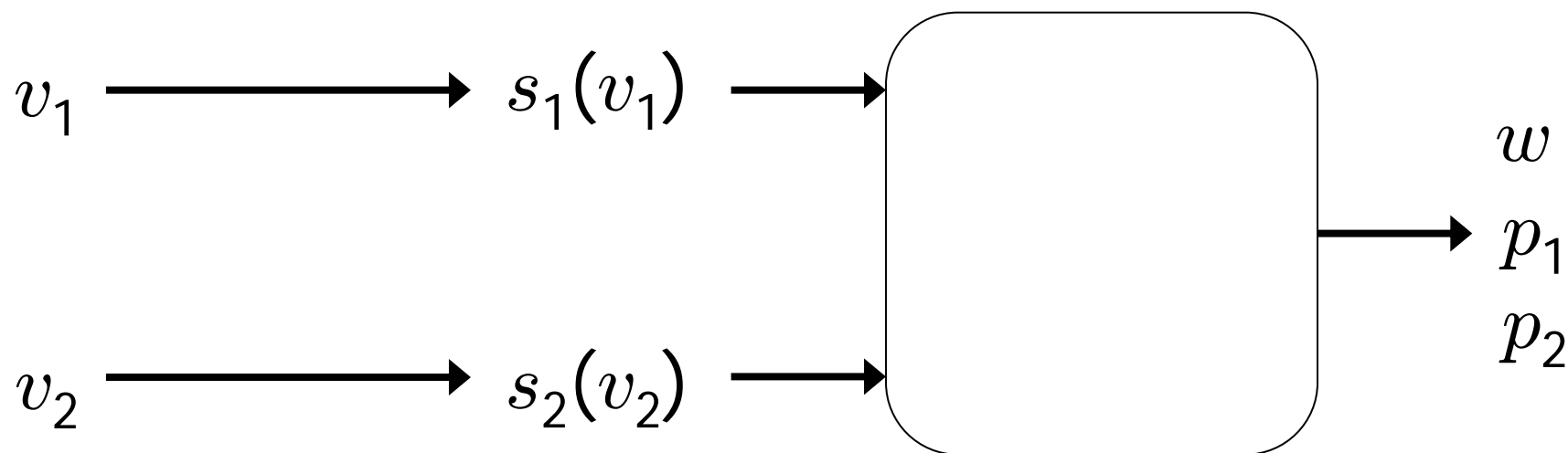
$$\underline{B}_1 = \underline{B}_2 = [0, \infty)$$

$$\underline{w}(\underline{b}_1, \underline{b}_2) = w(s_1(\underline{b}_1), s_2(\underline{b}_2))$$

$$\underline{p}_i(\underline{b}_1, \underline{b}_2) = p_i(s_1(\underline{b}_1), s_2(\underline{b}_2)), \quad i = 1, 2$$

# The revelation principle

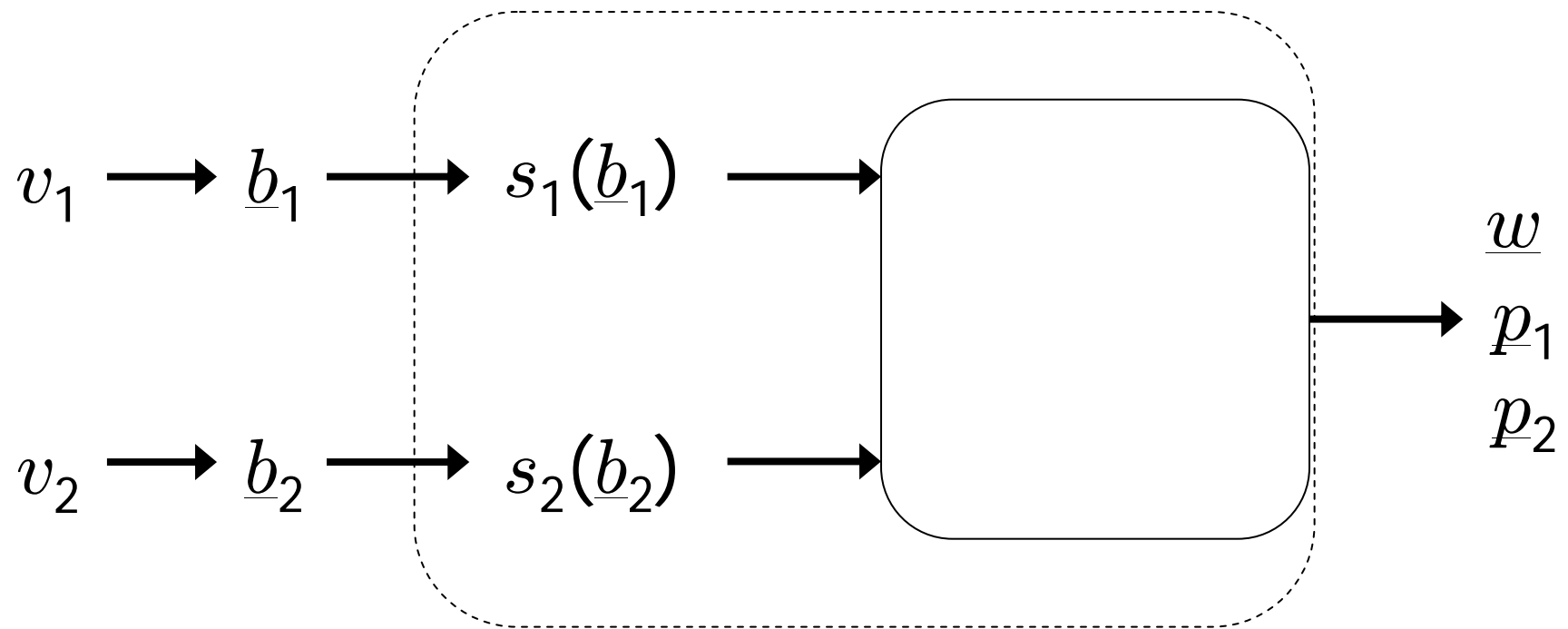
At the BNE of the original auction:



# The revelation principle

In the new auction:

Ask players to *declare valuation*.



# The revelation principle

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*Theorem:*

The new auction is incentive compatible.

Further, the truthtelling strategies in the new auction give exactly the same outcomes as the BNE of the original auction.

# The revelation principle: Proof

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For all  $v_1$ ,

$$\begin{aligned} & E[ Q_1(v_1, v_2 ; v_1) \mid v_1 ] \\ &= E[ Q_1(s_1(v_1), s_2(v_2) ; v_1) \mid v_1 ] \\ &\geq E[ Q_1(b_1, s_2(v_2) ; v_1) \mid v_1 ] \\ & \qquad \qquad \qquad \text{for all } b_1 \in B_1 \end{aligned}$$

# The revelation principle: Proof

---

For all  $v_1$ ,

$$\begin{aligned} & E[ Q_1(v_1, v_2 ; v_1) \mid v_1 ] \\ &= E[ Q_1(s_1(v_1), s_2(v_2) ; v_1) \mid v_1 ] \\ &\geq E[ Q_1(s_1(\underline{b}_1), s_2(v_2) ; v_1) \mid v_1 ] \\ & \qquad \qquad \qquad \text{for all } \underline{b}_1 \in [0, \infty) \end{aligned}$$

# The revelation principle: Proof

For all  $v_1$ ,

$$\begin{aligned} & E[ Q_1(v_1, v_2 ; v_1) \mid v_1 ] \\ &= E[ Q_1(s_1(v_1), s_2(v_2) ; v_1) \mid v_1 ] \\ &\geq E[ Q_1(\underline{b}_1, v_2 ; v_1) \mid v_1 ] \end{aligned}$$

for all  $\underline{b}_1 \in [0, \infty)$

*(Similarly for player 2)*

# The revelation principle: Proof

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Given  $v_1, v_2$  :

Outcome at truthtelling strategies

$$= ( \underline{w}(v_1, v_2), \underline{p}_1(v_1, v_2), \underline{p}_2(v_1, v_2) )$$

$$= ( w(s_1(v_1), s_2(v_2)), \\ p_1(s_1(v_1), s_2(v_2)), \\ p_2(s_1(v_1), s_2(v_2)) )$$

= outcome at original BNE



# The revelation principle

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The new auction is called a  
*direct revelation mechanism (DRM)*.

*Note:*

It may have other, undesirable equilibria!!

# Two useful results

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For a wide range of auctions  
(including first and second price),  
we will show  
*payoff equivalence* and  
*revenue equivalence*:

These auctions all have the *same* payoffs  
and auctioneer revenue at BNE.

# Definitions

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Suppose we are given a DRM.

*Truth-telling expected payoff to player 1:*

$$S_1(v_1) = E[ Q_1(v_1, v_2; v_1) \mid v_1 ]$$

*Truth-telling expected probability of winning for player 1:*

$$P_1(v_1) = \int_0^\infty I\{w(v_1, v_2) = 1\} \phi_2(v_2) dv_2$$

# The truthtelling lemma

*Lemma:* Truthtelling is a BNE  
if and only if for  $i = 1, 2$ :

$$(1) S_i(v_i) = S_i(0) + \int_0^{v_i} P_i(z) dz$$

(2)  $P_i$  is nondecreasing:

$$v_i \geq v_i' \Rightarrow P_i(v_i) \geq P_i(v_i')$$

# The truthtelling lemma: Proof

---

Truthtelling is a BNE if and only if:

$$S_1(v_1) \geq E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ]$$

for all  $v_1' \geq 0$

*(Similarly for player 2)*

# The truthtelling lemma: Proof

Truthtelling is a BNE if and only if:

$$S_1(v_1) \geq E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ]$$

for all  $v_1' \geq 0$

$$E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ] =$$

$$\int_0^\infty [v_1 - p_1(v_1', v_2)] I\{ w(v_1', v_2) = 1 \} \phi_2(v_2) dv_2$$

# The truthtelling lemma: Proof

Truthtelling is a BNE if and only if:

$$S_1(v_1) \geq E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ]$$

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# The truthtelling lemma: Proof

Truthtelling is a BNE if and only if:

$$S_1(v_1) \geq E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ]$$

for all  $v_1' \geq 0$

$$E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ] =$$

$$v_1 P_1 (v_1') -$$

$$\int_0^\infty [p_1(v_1', v_2)] I\{ w(v_1', v_2) = 1 \} \phi_2(v_2) dv_2$$



# The truthtelling lemma: Proof

Truthtelling is a BNE if and only if:

$$S_1(v_1) \geq E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ]$$

for all  $v_1' \geq 0$

$$E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ] =$$

$$v_1 P_1 (v_1') - v_1' P_1 (v_1')$$

$$\int_0^\infty [v_1' - p_1(v_1', v_2)] I\{ w(v_1', v_2) = 1 \} \phi_2(v_2) dv_2$$

# The truthtelling lemma: Proof

Truthtelling is a BNE if and only if:

$$S_1(v_1) \geq E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ]$$

for all  $v_1' \geq 0$

$$E[ Q_1 ( v_1', v_2 ; v_1 ) \mid v_1 ] =$$

$$v_1 P_1 (v_1') - v_1' P_1 (v_1') + S_1 (v_1')$$

# The truthtelling lemma: Proof

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Conclude:

Truthtelling is a BNE if and only if  
for  $i = 1, 2$ , and for all  $v_i, v_i' \geq 0$ :

$$S_i(v_i) \geq S_i(v_i') + P_i(v_i')(v_i - v_i')$$

i.e.,  $S_i$  is *convex*.

# The truthtelling lemma: Proof

Assume  $v_i' > v_i$ . Then:

$$S_i(v_i) \geq S_i(v_i') + P_i(v_i')(v_i - v_i')$$

$$S_i(v_i') \geq S_i(v_i) + P_i(v_i)(v_i' - v_i)$$

$$\Rightarrow P_i(v_i)(v_i' - v_i) \leq P_i(v_i')(v_i' - v_i)$$

So  $P_i(v_i) \leq P_i(v_i') \Rightarrow P_i$  is *nondecreasing*

# The truthtelling lemma: Proof

If  $v_i > v_i'$  :

$$\frac{S_i(v_i) - S_i(v_i')}{v_i - v_i'} \geq P_i(v_i')$$

If  $v_i < v_i'$  :

$$\frac{S_i(v_i) - S_i(v_i')}{v_i - v_i'} \leq P_i(v_i')$$

Take  $v_i' \uparrow v_i, v_i' \downarrow v_i \Rightarrow S_i'(v_i) = P_i(v_i)$

# The truthtelling lemma

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How to use the truthtelling lemma:

- (1) Use a BNE of an auction  
to create an incentive compatible DRM
- (2) Apply the truthtelling lemma  
to characterize the original BNE

# Payoff equivalence

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Given two auctions with BNE such that:

- in each BNE, if  $v_i = 0$  then player  $i$  gets zero payoff; and
- in each BNE, item *always* goes to highest valuation player

*Theorem:* Both BNE yield the same *expected payoff* to each player.

# Payoff equivalence: Proof

- Fix given BNE  $(s_1, s_2)$  of one of the auctions
- Construct incentive compatible DRM using revelation principle
- For this DRM:

$$\underline{S}_i(0) = 0, \text{ and}$$

$$\underline{P}_i(v_i) = \int_0^{v_i} \phi_{-i}(v_{-i}) \, dv_{-i}$$



# Payoff equivalence: Proof

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Expected payoff to player 1 of type  $v_1$ :

depends only on  $S_1(0)$  and  $P_1(\cdot)$ ,

by the truthtelling lemma

*(Similarly for player 2)*

# Payoff equivalence: Proof

Expected payoff to player 1 of type  $v_1$ :

$$E[ Q_1(s_1(v_1), s_2(v_2) ; v_1) \mid v_1 ]$$

$$= E[ Q_1(v_1, v_2 ; v_1) \mid v_1 ]$$

$$= \underline{S}_1(v_1) = \int_0^{v_1} [ \int_0^{v_1'} \phi_2(v_2) dv_2 ] dv_1'$$

by the truthtelling lemma

*(Similarly for player 2)*

# Payoff equivalence: Proof

---

So at given BNE of *either auction*,  
expected payoff to player 1 of type  $v_1$  is:

$$\int_0^{v_1} \left[ \int_0^{v_1'} \phi_2(v_2) dv_2 \right] dv_1'$$

This does not depend on the BNE!

*(Similarly for player 2)*

# Revenue equivalence

---

Given two auctions with BNE such that:

- in each BNE, if  $v_i = 0$  then player  $i$  gets zero payoff; and
- in each BNE, item *always* goes to highest valuation player

*Theorem:* Both BNE yield the same *expected revenue* to the auctioneer.

# Revenue equivalence: Proof

Fix BNE  $(s_1, s_2)$  of one of the auctions

Note:

$$\sum_{i=1}^2 Q_i(s_1(v_1), s_2(v_2); v_i)$$

$$= v_{w(s_1(v_1), s_2(v_2))} - P_{w(s_1(v_1), s_2(v_2))}$$

# Revenue equivalence: Proof

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Taking expectations:

*Sum of expected payoffs to players*

=  $\mathbf{E} [ \max \{v_1, v_2\} ]$  -

*Expected revenue to auctioneer*

# Revenue equivalence: Proof

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Taking expected values:

*Expected revenue to auctioneer*

=  $E[ \max \{v_1, v_2\} ]$  -

*Sum of expected payoffs to players*

# Revenue equivalence: Proof

---

Taking expected values:

*Expected revenue to auctioneer*

=  $E[ \max \{v_1, v_2\} ]$  -

*Sum of expected payoffs to players*

Right hand side is same for BNE of both auctions (by payoff equivalence)



# Revenue equivalence

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Note that at BNE,  
expected payoffs to players are  $\geq 0$ .

So:

$$\text{Revenue to auctioneer} \leq E[ \max \{v_1, v_2\} ]$$

## [ Aside: optimal auction theory ]

The problem of maximizing the equilibrium revenue to the auctioneer is called *optimal auction design*.

For this problem to be well-defined, an additional constraint is needed, *individual rationality*:

$$E[ Q_i(s_i(v_i), \mathbf{s}_{-i}(\mathbf{v}_{-i}) ; v_i) \mid v_i ] \geq 0 \text{ for all } i.$$

(Otherwise bidder  $i$  would not participate.)

## [ **Aside: optimal auction theory** ]

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The framework defined here can be used to characterize the optimal auction design for any distribution of players' valuations.

(See Myerson 1979)

# Symmetric BNE

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From now on, assume:

- $B_1 = B_2 = [0, \infty)$
- $\phi_1 = \phi_2 = \phi$  (*same distribution*)  
(Assume  $\phi$  is positive on its entire domain)

A BNE is *symmetric* if:

$$s_1(v) = s_2(v) \text{ for all } v \geq 0$$

$s(v) = s_i(v)$  is called the *bid function*.

# Symmetric BNE theorem

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*Theorem:*

If highest bidder wins,  
then in a symmetric BNE with  
bid function  $s$ ,  
 $s$  is strictly increasing,  
so the winning bidder also has  
*the highest valuation.*

*(In case of tie, assume player 2 wins)*

# Symmetric BNE: Proof

Apply revelation principle to build  
new incentive compatible auction:

$$\underline{w}(\underline{b}_1, \underline{b}_2) = w(s(\underline{b}_1), s(\underline{b}_2))$$

$$\underline{p}_i(\underline{b}_1, \underline{b}_2) = p_i(s(\underline{b}_1), s(\underline{b}_2)), \quad i = 1, 2$$

In this auction:

$$\underline{P}_1(v_1) = \int_0^\infty I\{ \underline{w}(v_1, v_2) = 1 \} \phi(v_2) dv_2$$

# Symmetric BNE: Proof

Apply revelation principle to build  
new incentive compatible auction:

$$\underline{w}(\underline{b}_1, \underline{b}_2) = w(s(\underline{b}_1), s(\underline{b}_2))$$

$$\underline{p}_i(\underline{b}_1, \underline{b}_2) = p_i(s(\underline{b}_1), s(\underline{b}_2)), \quad i = 1, 2$$

In this auction:

$$\underline{P}_1(v_1) = \int_0^\infty I\{w(s(v_1), s(v_2)) = 1\} \phi(v_2) dv_2$$

# Symmetric BNE: Proof

Apply revelation principle to build  
new incentive compatible auction:

$$\underline{w}(\underline{b}_1, \underline{b}_2) = w(s(\underline{b}_1), s(\underline{b}_2))$$

$$\underline{p}_i(\underline{b}_1, \underline{b}_2) = p_i(s(\underline{b}_1), s(\underline{b}_2)), \quad i = 1, 2$$

In this auction:

$$\underline{P}_1(v_1) = \int_0^\infty I\{s(v_1) > s(v_2)\} \phi(v_2) dv_2$$



# Symmetric BNE: Proof

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By truthtelling lemma,

$$\int_0^\infty I\{s(v_1) > s(v_2)\} \phi(v_2) dv_2$$

is nondecreasing in  $v_1$ .

Only possible if  $s(v)$  is nondecreasing in  $v$ .

We only need to show  $s$  is *strictly increasing*.

# Symmetric BNE: Proof

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We will show  $s$  is *strictly increasing*  
in the special case of the  
*first price auction*:

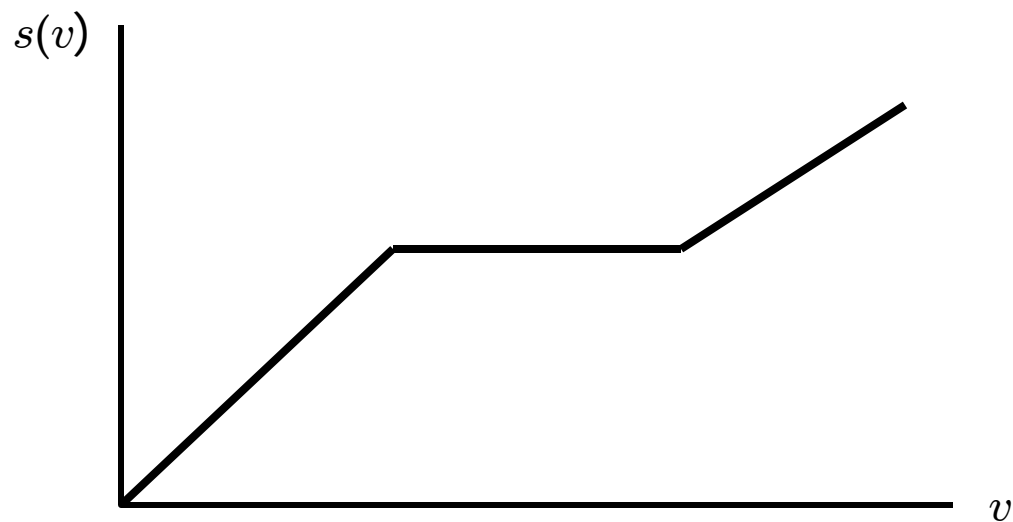
$$\begin{aligned} p_i(b_1, b_2) &= b_i \text{ if } w(b_1, b_2) = i; \\ &= 0 \text{ otherwise} \end{aligned}$$

However, the result holds more generally  
for the other auctions we consider.

# Symmetric BNE: Proof

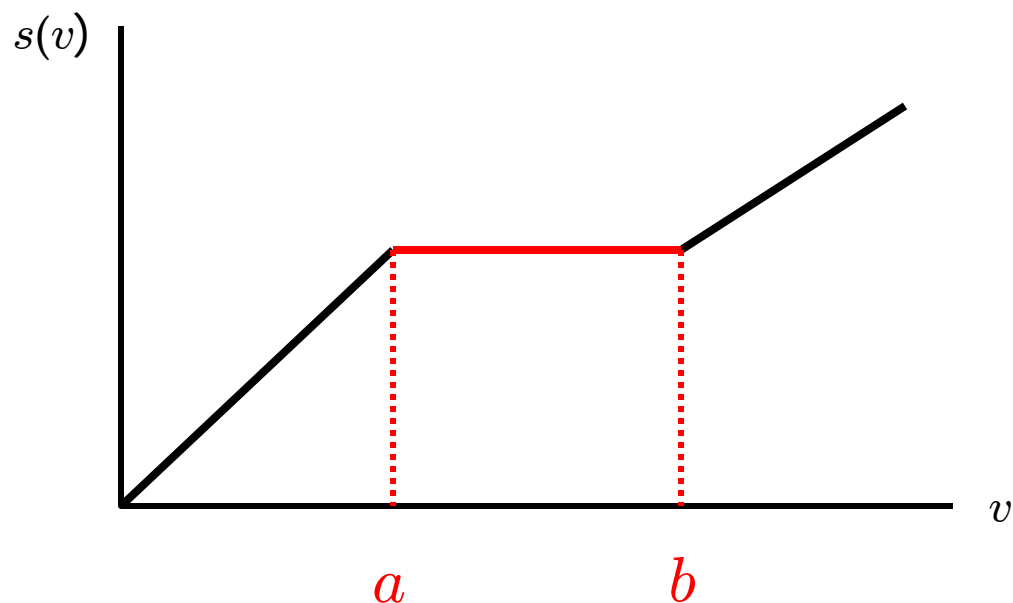
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Suppose  $s$  is not strictly increasing:



# Symmetric BNE: Proof

Suppose  $s$  is not strictly increasing:



# Symmetric BNE: Proof

---

Suppose  $s$  is not strictly increasing.

Fix  $a < b$  such that:

$$s(v) = s(a), \quad a \leq v \leq b$$

We can assume:  $a > s(a)$ .

(If not, just increase  $a$  slightly.)

# Symmetric BNE: Proof

---

Given player 2 is using  $s_2 = s$ ,  
suppose player 1 bids

$$b_1 = s(a) + \varepsilon \text{ when } v_1 = a.$$

Then when  $v_1 = a$ :

- Expected *payment* by player 1 increases by at most  $\varepsilon$
- Player 1 wins if  $v_2 \in [a, b]$

# Symmetric BNE: Proof

---

Given player 2 is using  $s_2 = s$ ,  
suppose player 1 bids

$$b_1 = s(a) + \varepsilon \text{ when } v_1 = a.$$

Player 1's change in expected payoff

$$\geq (a - s(a) - \varepsilon)(F(b) - F(a)) - \varepsilon$$

$$> 0 \quad \text{for small enough } \varepsilon$$

Profitable deviation!

# Symmetric BNE: Proof

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Conclude:

$s$  is strictly increasing

So:

Winner must have highest valuation



# Symmetric BNE

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In general, can show the same result if:

(1)  $p_i(b_1, b_2) \geq 0$  for all  $b_1, b_2$ ;

(2) the winner's payment is positive when at least one of  $b_1, b_2$  is positive; and

(3)  $p_1(b_1, b_2) = p_2(b_2, b_1)$  for all  $b_1, b_2$   
(*permutation invariance*)

# Moral

---

*Symmetric BNE* of “standard auctions”

(first price, second price, etc.)

have the *same* expected payoffs and auctioneer revenue.

In particular,

Expected revenue =  $E[\text{second highest bid}]$

*(Why?)*