

10/5/20.

- Review Myerson's mechanism
  - Simplicity versus optimality
    - Vickrey auction with monopoly reserves.
      - Simplifying dependence on distributions.
    - Non-anonymous pricing
      - completely remove competition
    - Bulow-Klemperer result.
      - extra competition; remove dependence on dist.
    - Vickrey with anonymous reserve.
      - Prior-independent mechanism.
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- HW 1 due next Monday Oct 12.
- Info about projects coming soon.

# Single parameter optimal mechanism design.

$n$  buyers  $v_i \sim F_i$  — known.

Feasibility constraint,

Goal: BIC mechanism that maximizes revenue.

Myerson's lemma: BIC mechs  $\Leftrightarrow$   $x$  is non-dec.  
Payment identity

Theorem: Exp. revenue of any BIC mechanism is equal to the expected virtual surplus.

$$Rev(x) = \mathbb{E} \left[ \sum_i x_i \phi_i \right]$$

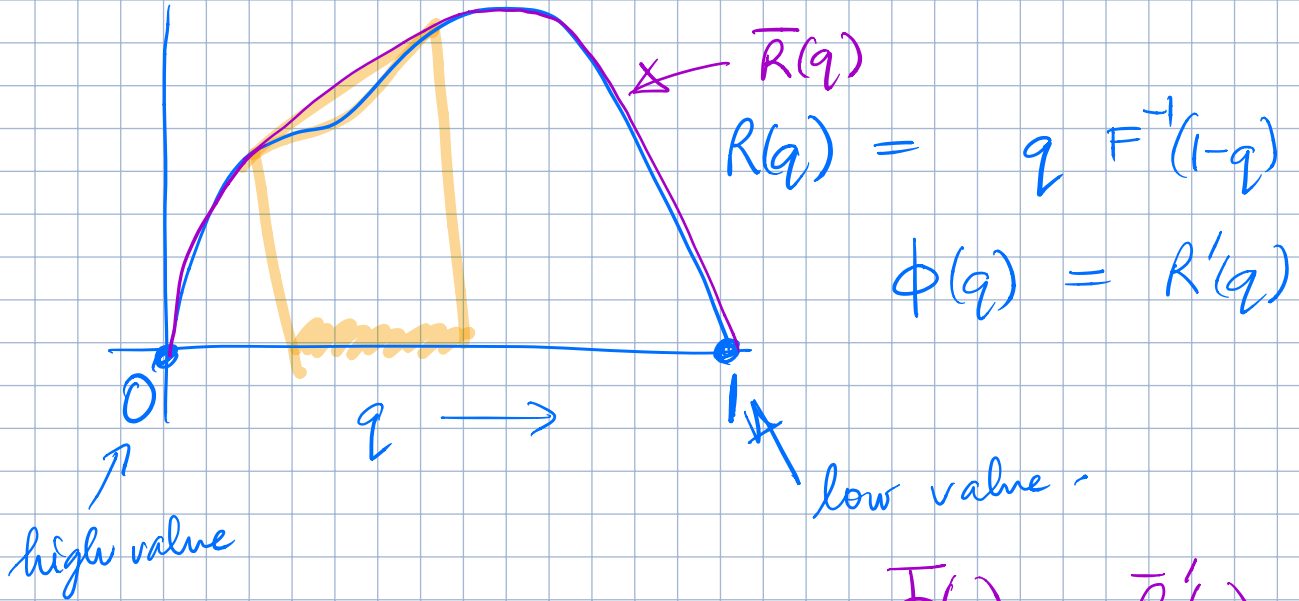
Virtual values:  $\phi_i(v_i) = v_i - \frac{(1 - F_i(v_i))}{f_i(v_i)}$

Theorem: When all buyers have regular value distributions, point wise maximization of virtual surplus gives a BIC mechanism.

◦◦ Optimal mech. is the virtual surplus maximizer.

Regularity  $\equiv \phi_i(\cdot)$  is a non-dec. function.

In the non-regular case, we need to iron.



$$\bar{\Phi}(q) = \bar{R}'(q)$$

- ① Revenue of any BIC mech  $\leq$  ironed virtual surplus.
- ② Ironed v.v. are non-decreasing.
- ③ Rev. of any BIC mech, that has a flat/constant allocation function over ironed regions = ironed virtual surplus.

$\Rightarrow$  Revenue optimal mechanism is the ironed virtual surplus maximizer.

Example, 2 buyers & 1 item

$$v_1 \sim U[0,1]$$

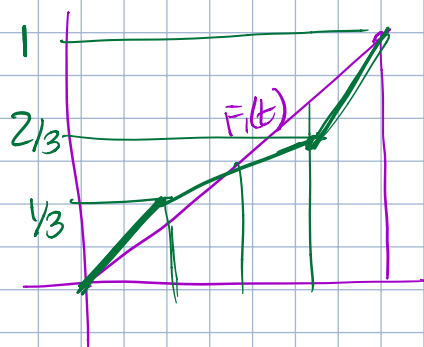
$$F_1(t) = t$$

$$f_1(t) = 1$$

$$\phi_1(t) = 2t - 1$$

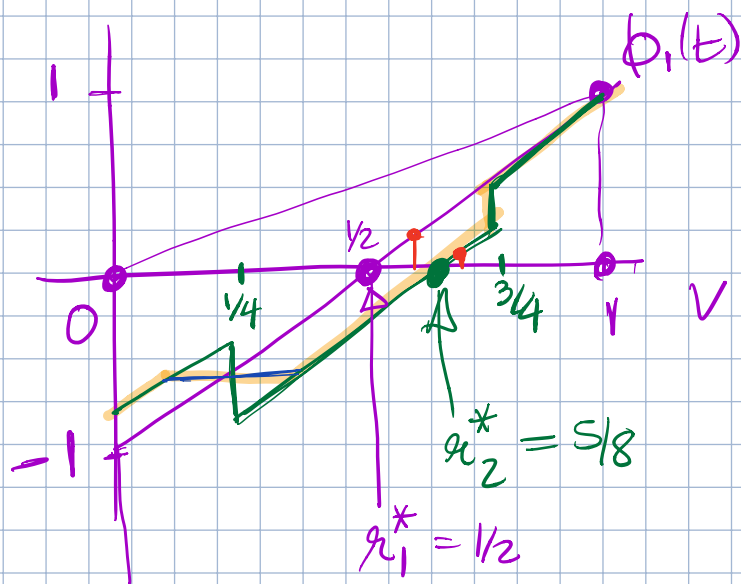
$$v_2 \sim \frac{1}{3} U[0, \frac{1}{4}] + \frac{1}{3} U[\frac{1}{4}, \frac{3}{4}] + \frac{1}{3} U[\frac{3}{4}, 1]$$

$$F_2(t) = \begin{cases} 4t/3 & t \leq 1/4 \\ 2t/3 + 1/6 & t \in [1/4, 3/4] \\ 4t/3 - 1/3 & t \geq 3/4 \end{cases}$$



$$f_2(t) = \begin{cases} 4/3 & [0, 1/4] \\ 2/3 & [1/4, 3/4] \\ 1 & [3/4, 1] \end{cases}$$

$$\phi_2(t) = \begin{cases} 2t - 3/4 & t \leq 1/4 \\ 2t - 5/4 & [1/4, 3/4] \\ 2t - 1 & [3/4, 1] \end{cases}$$



Buyer 1 wins if:  
 $- v_1 \geq 1/2$  and

either  $v_1 \geq 3/4$  and  $v_1 \geq v_2$

or  $v_1 \in [5/8, 3/4]$  and  $v_2 \leq 3/4$

or  $v_1 \in [1/2, 5/8]$  and  $v_2 \leq v_1 + 1/8$

Vickrey  
with  
monop.  
reserves:

$v_1 \geq 1/2$   
and  
 $v_1 \geq v_2$

Rest of this lecture: Single item and regularity.

Showed last time: Vickrey with monopoly reserves gets a 2-approx to expected revenue.

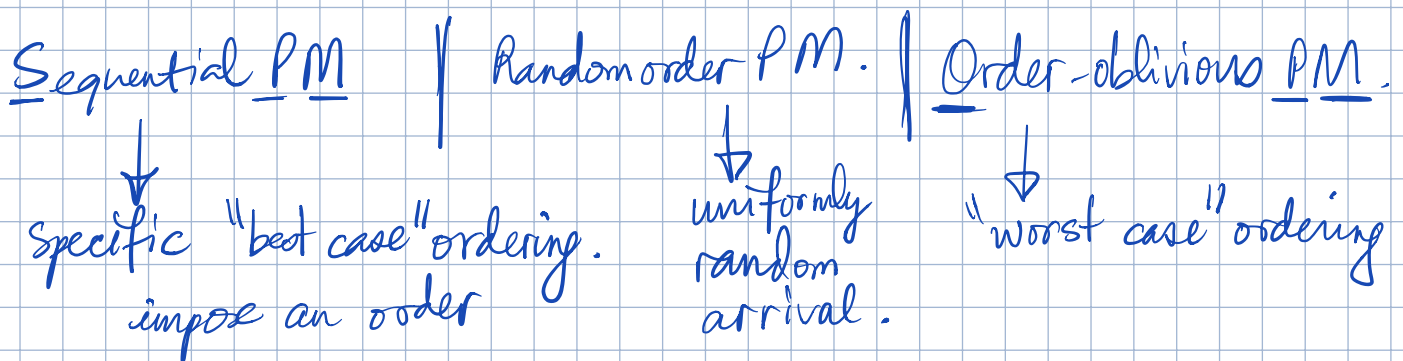
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### Posted price Mechanism:

Given  $F_1, \dots, F_n$ . Determine prices  $p_1, \dots, p_n$ .

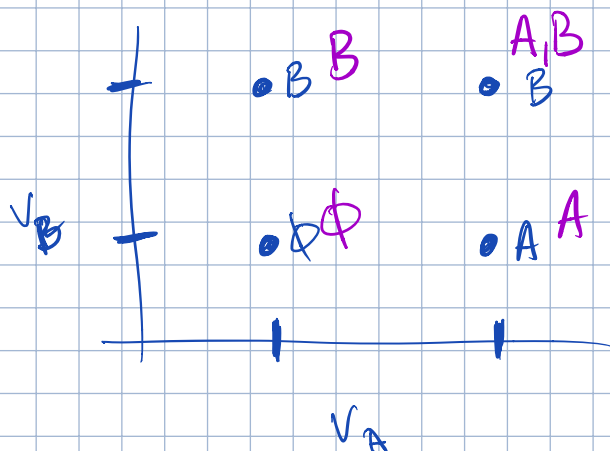
Buyers will arrive one at a time.

1st buyer with  $v_i \geq p_i$  will get the item at price  $p_i$ .



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### Ex-Ante Relaxation.



Supply constraint: Allocate to at most one buyer at every value vector.

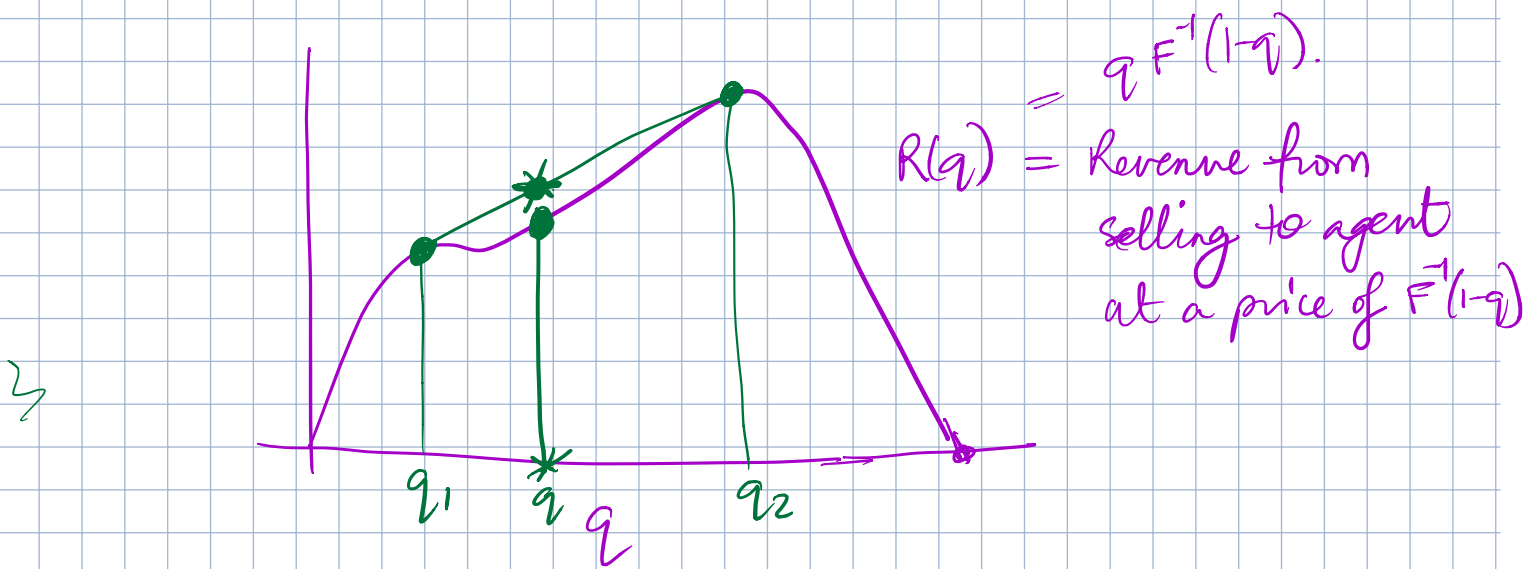
Ex-ante relaxation: Allocate at most one item in expectation over value vectors.

$Z_i(q_i)$  = Maximum revenue we can get from agent  $i$  by selling with ex-ante prob. at most  $q_i$  to the agent.

Ex-ante relaxation:  $\bar{R}_i$

$$EA-OPT = \begin{cases} \max. & \sum_i Z_i(q_i) \\ \text{s.t.} & \sum_i \underline{q_i} \leq 1. \end{cases}$$

Lemma: Optimal revenue is at most EA-OPT.



What is the best mech. that sells with ex ante prob  $q$ ?

In the regular case, this corresponds exactly to posting a price of  $F^{-1}(1-q)$ .

$$\downarrow$$

$$Z(q) = R(q)$$

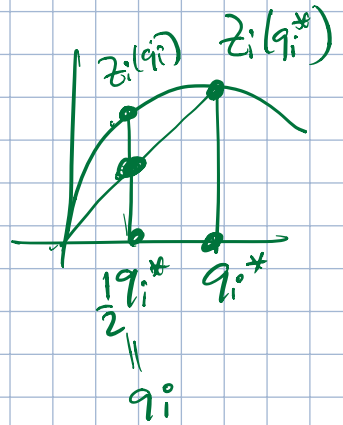
In the non-regular case,  $Z(q) = \bar{R}(q)$ .

At quantiles  $q$ , where  $R(q) \neq \bar{R}(q)$ , the

ex-ante optimal mech. randomizes between two posted prices.

OPM [ Suppose  $q_1^*, \dots, q_n^*$  is the solution to EA-OPT.  
 Set  $q_i = \frac{1}{2} q_i^*$  and  $p_i = F_i^{-1}(1 - q_i)$ . [Randomize in case of non-reg.]  
 Offer prices  $p_i$  in arbitrary sequence.

① EA-OPT =  $\sum_i z_i(q_i^*)$



②  $\forall i, z_i(q_i) \geq \frac{1}{2} z_i(q_i^*)$   
 by concavity.

③  $\sum_i q_i = \frac{1}{2} \sum_i q_i^* \leq \frac{1}{2}$

Total prob. of selling the item is  $\leq 1/2$

For any agent, prob. that item is still available when they arrive is  $\geq 1/2$

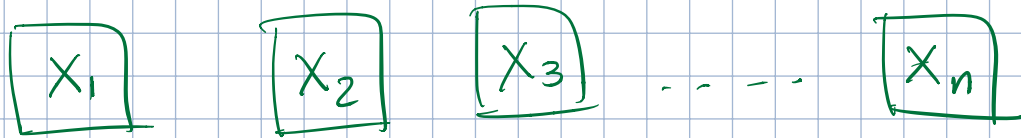
④ Rev of OPM  $\geq \sum_i \Pr[\text{item is offered to agent } i] \cdot (\text{Rev from agent } i)$

$\geq \sum_i \frac{1}{2} \cdot z_i(q_i)$

$\geq \frac{1}{4} \sum_i z_i(q_i^*) = \frac{1}{4} \text{EA-OPT}$

$$\geq \frac{1}{4} \text{OPT.}$$

## PROPHET INEQUALITY



$n$  boxes with a reward in each.

Alg. can open boxes one at a time,  
observe the reward,  
decide to accept or reject it.  
↓  
game ends.

Prophet knows the instantiations of all rewards.  
So can accept the highest one.

Alg competes against  $E[\max_{i=1, \dots, n} X_i] = \text{OPT}$

Theorem: Can achieve  $\frac{1}{2}$  of prophet's expected reward  
by picking a single threshold and accepting  
the 1st reward that crosses it.

$$\text{Alg} = E_{X_1, \dots, X_n} \left[ X_{\min_{\text{any } i} \{X_i \geq t\}} \right]$$

$\text{Alg} \geq \frac{1}{2} \text{OPT}$  for an appropriate choice of  $t$



Connection to OPM's : the  $X_i$ 's are virtual values;

OPT = virtual value maximizer

Alg = OPM that places a price of  $\Phi_i^{-1}(t)$   
for buyer  $i$ .

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Proof of prophet inequality

$$\Pr[\exists i : X_i \geq t] = 1/2$$

$$t = \text{median}(\max_i X_i)$$

$$\begin{aligned} \text{OPT} = E[\max_i X_i] &\leq t + E[\max_i X_i - t] \\ &\leq t + \sum_i (X_i - t)^+ \end{aligned}$$

$$\text{ALG} = \frac{1}{2}t + \sum_i \underbrace{\Pr[\text{did not accept a reward before } i]}_{[a^+ = \max(a, 0)]} (X_i - t)^+$$

$$\Pr[X_1, \dots, X_{i-1} < t]$$

$$= \Pr[\max_{i' < i} X_{i'} < t]$$

$$\geq \Pr[\max_i X_i < t]$$

$$= 1/2$$

$$\geq \frac{1}{2}t + \sum_i \frac{1}{2} (X_i - t)^+ \geq \frac{1}{2} \text{OPT}.$$

Non-anonymous posted pricing — different buyers are offered different prices

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Approximation through increased competition.

Bulow-Klemperer

$n$  i.i.d. buyers with regular values.

Optimal mechanism — Vickrey auction with anon. reserve.

✓ The revenue of the Vickrey auction over  $(n+1)$  buyers (with no reserve price) is at least as large as revenue of optimal auction over  $n$  buyers.

Proof: Vickrey auction over  $(n+1)$  buyers sells to the buyer with highest v.v. — even when this is -ve.

Among mechanisms that always sell the item over  $(n+1)$  buyers, Vickrey is the optimal one.

Rev =  $OPT_n$  [ Alternate mech over  $n+1$  buyers :  
— Run optimal mech over  $n$  buyers.  
— If item remains unsold, give it for free to the  $(n+1)^{th}$  buyer.

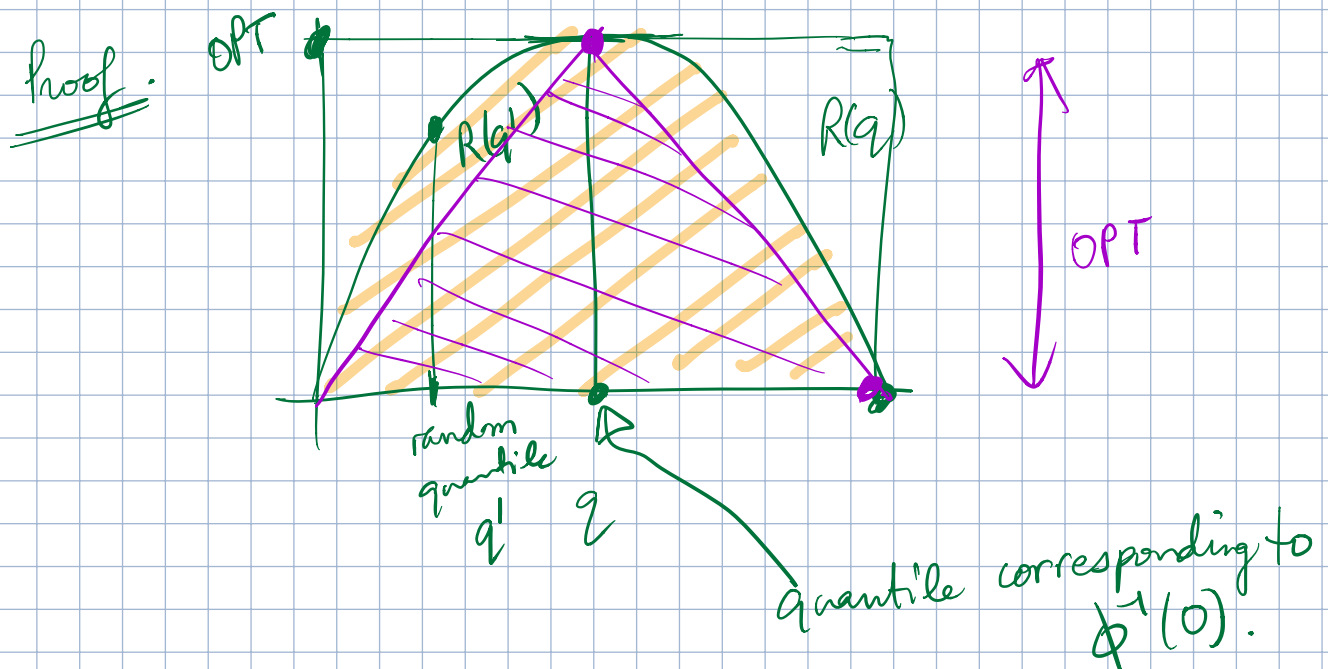
Vickrey $_{n+1} \geq OPT_n$ .

# Single Sample Mechanisms. [DRY'10]

one buyer  $v \sim F$ . Optimal mechanism - offer  $\phi^{-1}(0)$ .

Draw  $p \sim F$ . Offer  $p$  to the buyer.

Claim:  $E_{p \sim F}[\text{Rev}(p)] \geq \frac{1}{2} \text{OPT}$  if  $F$  is regular.



$$E_{q' \sim U[0,1]} [R(q')] = \int_0^1 R(q') dq'$$

= area under curve  
 $\geq$  area of purple  $\Delta$ .

Purple  $\Delta$  has area  $\frac{1}{2} \text{OPT}$   
 and lies below  $R(q)$   $\because R$  is concave.

[Hartline Roughgarden '09]

Consider  $n$  non-iid regular buyers.  $v_1 \dots v_n$

Suppose we double the buyers.  $v'_1 \dots v'_n$ .

Revenue of the Vickrey auction over  $v_1 \dots v_n, v'_1 \dots v'_n$   
is at least  $1/2$  of the opt. rev. over  $v_1 \dots v_n$ .