

Today:

Multi-parameter Mechanisms Design.

HW1 due today

HW2 out later this week. — due Nov 9

### Projects

— Report — due Dec 14.

— 1hr presentation. — between Nov 23 & Dec 14.

— Oct 22/23 — half hr. meetings —

— Ideas for topics on webpage.

Some observations about single parameter MD.

- Characterization of BIC mechs. — monotonicity
- payment identity.
- Revenue optimal mechs as virtual value maximizers.

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Some multi-parameter valuations. (combinatorial valuations)

① Unit-demand.

many different kind of items/services. — indexed by  $i$ .  
 $i \in [m]$

Buyer's value — vector  $v_1, v_2, \dots, v_m$ .

$v_i$  — value assigned to item  $i$ .

$$V(S) = \max_{i \in S} v_i.$$

↑ value    ↖ set of items.

$x$  — allocation vector  
 $x_i = 1$  if that item  $i$  is  
alloc.  
 $\sum_i x_i = 1$

$$V(x) = x \cdot v$$

② Additive  $V(S) = \sum_{i \in S} v_i$

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Problem: 1 buyer, 1 seller with  $m$  items.  $v \sim F$

What is the optimal selling  
mechanism?

↓  
joint distribution  
over  $m$ -dimensional  
vectors.

Solution — in single parameter case: monopoly reserve price  
set on the item.

TAXATION PRINCIPLE: Same allocations should always be charged the same price.

Implication: Describe any mechanism as a menu of options where each option is an (allocation, price) pair, and allow the buyer to choose their fav. option.

E.g.  $v = (1, 2)$   
 $x = (1, 0)$   
 $\text{Value}(x) = 1 \cdot 1 + 2 \cdot 0 = 1$   
 $x' = (\frac{1}{2}, \frac{1}{2})$   
 $\text{Value}(x') = 1 \cdot \frac{1}{2} + 2 \cdot \frac{1}{2} = 1\frac{1}{2}$

E.g. 2 items. 3 possible types of buyers  $\rightarrow$   $(1, 0)$ ;  $(0, 1)$ ;  $(\frac{1}{2}, \frac{1}{2})$   
 $F$  - uniform over these types

Optimal Deterministic Menu =  $\left\{ \begin{array}{l} x \\ (1, 0), 1 \\ (0, 1), \frac{1}{2} \end{array} \right\}$   $\left. \begin{array}{l} \text{--- A} \\ \text{--- B, C} \end{array} \right\}$  Revenue:  $1 \cdot \frac{1}{3} + \frac{1}{2} \cdot \frac{2}{3} = \frac{2}{3}$

$\left\{ \begin{array}{l} (1, 0), 1 \\ (0, 1), 1 \\ x \text{ --- C} \end{array} \right\}$  Revenue:  $1 \cdot \frac{2}{3} + 0 \cdot \frac{1}{3} = \frac{2}{3}$

Given: item pricing  $(p_1, p_2)$ , a buyer with value  $(v_1, v_2)$  will select  $\arg\max_i (v_i - p_i)$ .

Menu with lottery tickets =  $\left\{ \begin{array}{l} (1, 0) \quad 1-\epsilon \\ (0, 1) \quad 1-\epsilon \\ (\frac{1}{2}, \frac{1}{2}) \quad \frac{1}{2} \end{array} \right\}$   $\left. \begin{array}{l} \text{--- A} \\ \text{--- B} \\ \text{--- C} \end{array} \right\}$  Revenue:  $1 \times \frac{1}{3} + 1 \times \frac{1}{3} + \frac{1}{2} \times \frac{1}{3} = \frac{5}{6}$

lottery ticket.

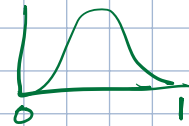
Even with unit-demand buyers over 2 items,  
the optimal mechanism may have a menu of unbounded size.

Example from Daskalakis, Deckelbaum,  
Tzamos.

Additive buyer over 2 items.

$$v_1 \sim \text{Beta}(3, 3)$$

$$v_2 \sim \text{Beta}(3, 4)$$



Optimal menu has unbounded size.

In fact, no approx. for optimal revenue via bounded  
size menus.

Duality based Approach for characterizing revenue  
optimal mechanisms.

One buyer.  $\mathcal{T}$  - set of possible types.  $t \in \mathcal{T}$ .

$x_t$ : allocation at type  $t$        $t \cdot x_t = \text{value from alloc.}$

$p_t$ : payment at type  $t$ .

$f_t$ : prob. mass over type  $t$ .

$$\max_{(x,p)} \sum_t f_t \cdot p_t$$

s.t.  $x_t$  is "supply-feasible"  $\Leftrightarrow x \in \mathcal{P} \quad \forall t \in \mathcal{T}$

$$\lambda_{t,t'} \quad \text{IC} \quad \boxed{t \cdot x_t - p_t \geq t \cdot x_{t'} - p_{t'}} \quad \forall t, t' \in \mathcal{T}$$

$$x \geq 0.$$

$$\max_{\substack{(x,p) \\ x \in P}} \underbrace{\sum_t f_t \cdot p_t + \sum_{t,t'} \lambda_{tt'} (t \cdot (x_t - x_{t'}) - (p_t - p_{t'}))}_{\mathcal{L}(\lambda, x, p)}$$

Observe: For any choice of  $\lambda \geq 0$  and any BIC  $(x, p)$ ,  $\mathcal{L}(\lambda, x, p) \geq \text{Rev}(x, p)$

Corollary: For any  $\lambda \geq 0$ ,  $\max_{\substack{(x,p) \\ x \in P}} \mathcal{L}(\lambda, x, p)$  is an upper bound on OPT.

New problem:

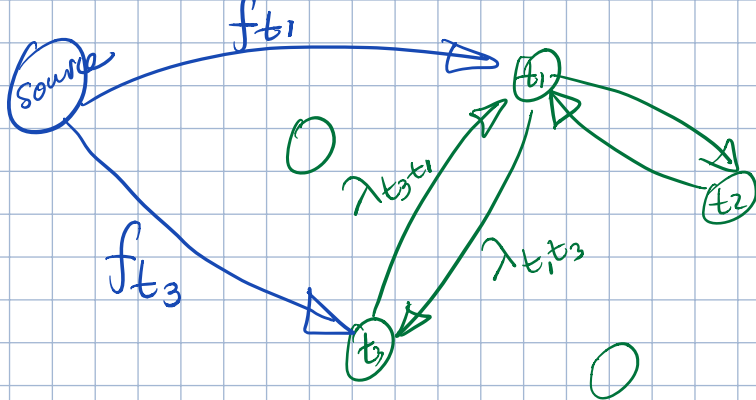
$$\min_{\lambda \geq 0} \max_{\substack{(x,p) \\ x \in P}} \mathcal{L}(\lambda, x, p).$$

Definition:  $\lambda$  is useful if  $\max_{\substack{(x,p) \\ x \in P}} \mathcal{L}(\lambda, x, p) < \infty$ .

$$\mathcal{L}(\lambda, x, p) = \sum_{t,t'} \lambda_{tt'} t \cdot (x_t - x_{t'}) + \sum_t p_t \left\{ f_t - \sum_{t'} \lambda_{tt'} + \sum_{t'} \lambda_{t't} \right\}$$

In order for  $\max_{\substack{(x,p) \\ x \in P}} \mathcal{L}(\lambda, x, p) < \infty$ , it must be the case

that  $\forall t$ ,  $\left[ f_t + \sum_{t'} \lambda_{t't} = \sum_{t'} \lambda_{tt'} \right]$ . flow conservation



For any useful  $\lambda \geq 0$ , we can rewrite

$$\begin{aligned}
 \mathcal{L}(\lambda, x, p) &= \sum_t x_t \left\{ \sum_{t'} t \lambda_{tt'} - \sum_{t'} t' \lambda_{t't} \right\} \left| \sum_t f_t x_t \cdot \phi_t \right. \\
 &= \sum_t x_t \left\{ t \sum_{t'} \lambda_{tt'} - \sum_{t'} t' \lambda_{t't} \right\} \\
 &= \sum_t x_t \left\{ t f_t + t \sum_{t'} \lambda_{t't} - \sum_{t'} t' \lambda_{tt'} \right\} \\
 &= \sum_t x_t f_t \left\{ t - \frac{\sum_{t'} \lambda_{t't} (t' - t)}{f_t} \right\}
 \end{aligned}$$

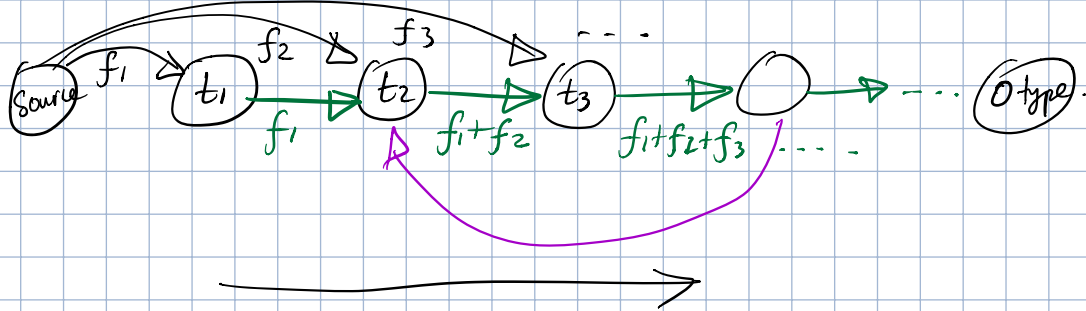
$\phi_t^\lambda$  : Virtual value  
w.r.t.  $\lambda$  at type  $t$ .

Myerson's v.v. :  $\phi_t = t - \frac{1 - F(t)}{f(t)}$

$\mathcal{L}(\lambda, x, p)$  : Virtual surplus  $(x, p)$ .

Lemma : For any useful  $\lambda \geq 0$ , and any IC  $(x, p)$ .  
 $\text{Rev}(x, p) \leq \text{Virtual surplus}$ .

Special case of single param. settings

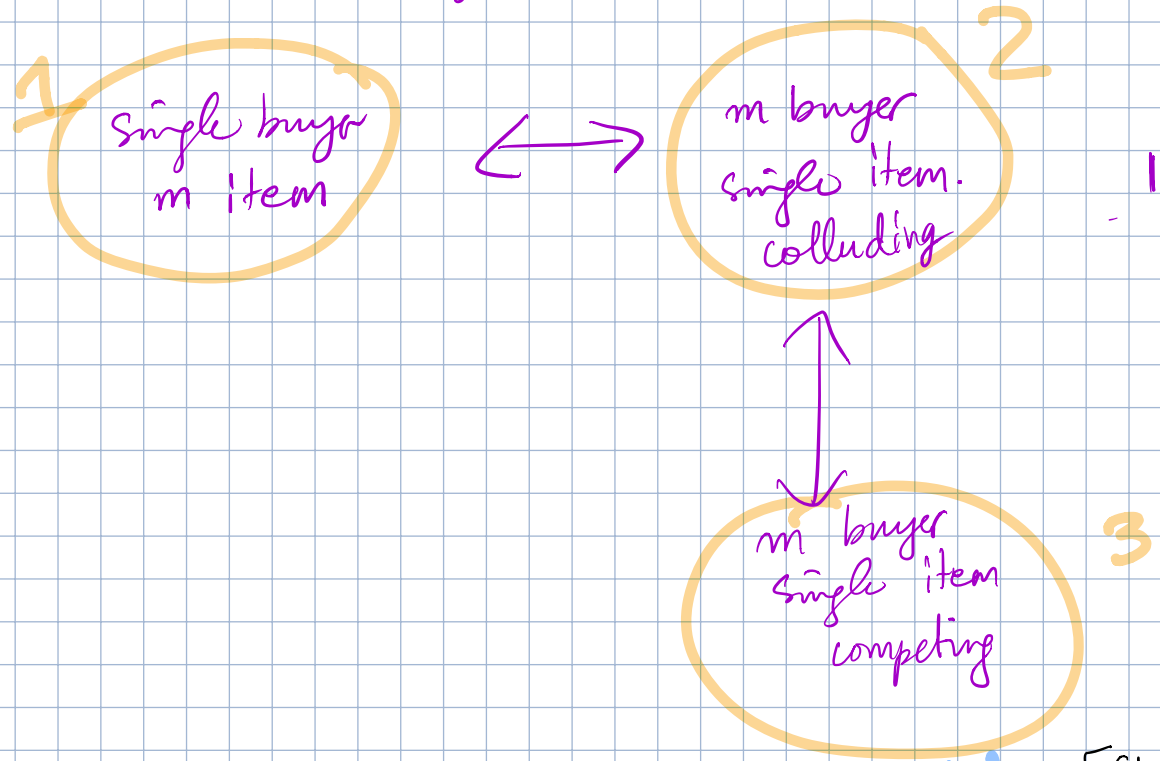


Sort types in decreasing order.  
 $t_1 \geq t_2 \geq t_3 \geq \dots$

Unit Demand - single buyer. [CHK'07]

Assume:  $V \sim F = F_1 \times F_2 \times \dots \times F_m$ . Product distribution.  
 $(v_1, v_2, \dots)$        $v_i \sim F_i$ .

Think of a buyer as  $m$  "copies" or colluding friends.  
 Each "copy"  $i$  is only interested in buying item  $i$ .  
 value -  $v_i \sim F_i$ .  
 ↓  
 Single parameter.

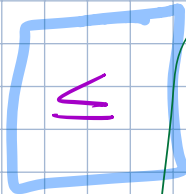


does not hold.

[Chandra Malec Sivan '10]

Does it

Opt rev for 2



Opt rev for 3

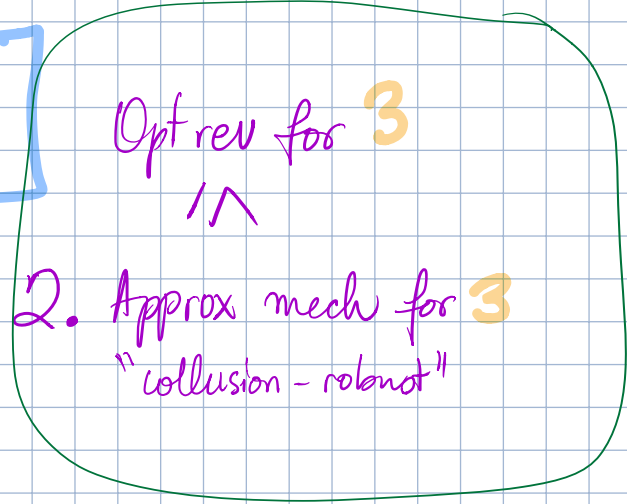
∧

2. Approx mech for 2

=

2. Approx mech for 3

"collusion-robust"



Order-oblivious Posted Price  
OPMs.  
based on Prophet Inequalities

Item Pricing  
for 1



⇒ In the unit-demand indep item values setting, <sup>above</sup> item pricing <sup>based on</sup> OPMs is a 2-approx. to the optimal revenue.  
↓  
deterministic

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In the unit-demand indep. item setting, item pricing is a 4-approx. to the optimal revenue.