# Competitive Analysis of Incentive Compatible On-line Auctions

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- The On-line Auction Model
- Incentive & Supply Curves
- Terminologies
  - Global Supply Curve
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  - Off-line Vickrey Auction
  - Competitiveness
- One Divisible Good
- k Indivisible Goods
  - A Randomized Auction
  - A Deterministic Auction
  - Revenue Analysis on Uniform Distribution

# The Model

#### The goods

k identical indivisible goods when k is very large  $\rightarrow$  one divisible good

# Players' valuations and utilities

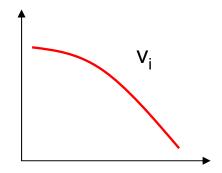
Player i has marginal valuation  $v_i(j)$  for good j,  $1 \le j \le k$ 

Assume that  $\forall$  i, j:  $v_i(j+1) \le v_i(j)$ 

When player i receives q goods and pays Pi

his utility is 
$$U_i(q, P_i) = \sum_{j=1}^q v_i(j) - P_i$$

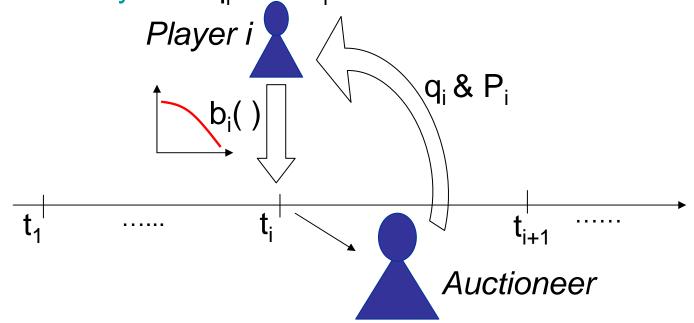
Each player aims to maximize his utility



#### The Model

# The on-line game and players' strategies

At time  $t_i$ , player i declares function  $b_i(\cdot)$  as his marginal function  $b_i:[1...k]\to R$ , non-increasing (of coz he could lie, i.e.  $b_i(\cdot)\neq v_i(\cdot)$ ). The auctioneer must answer bidder i immediately with  $q_i$  and  $P_i$ 



Applications: CPU time, cache space, bandwidth...

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#### Incentive

A strategy (bid) $b_i(q)$  of player i is called **dominant** if for any other bid  $\tilde{b}_i(q)$  and for any sequence of the past and future bids of the other players,  $U_i(q_i, P_i) \geq U_i(\tilde{q}_i, \tilde{P}_i)$ .

An auction is called *incentive compatible* if for any valuation  $v_i(\cdot)$ , declaring the true valuation is a dominant strategy.

**Comments**: the motivation of incentive – to free the bidders from strategic considerations (Vickrey et al. 1961); when all bidders are telling the truth, it is easy to maximize the social efficiency.

# Supply Curves for On-line Auctions

- **Definition 1** (Supply curves). An on-line auction is called "based on supply curves" if before receiving the i 'th bid it fixes a function (supply curve)  $p_i(q)$  based on previous bids, and,
- 1. The quantity  $q_i$  sold to bidder i is the quantity q that maximizes the sum  $\sum_{j=1}^{q} (b_i(j)-p_i(j))$ , i.e. the bidder's utility.
- 2. The price paid by bidder *i* is  $\sum_{j=1}^{q_i} p_i(j)$ .

Assume each supply curve  $p_i(q)$  is non-decreasing.

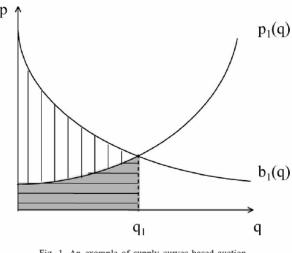


Fig. 1. An example of supply curves based auction.

# Incentive & Supply Curves

**Theorem 1.** A deterministic on-line auction is incentive compatible if and only if it is based on supply curves.

**Proof.** This is proved in two directions by Lemma 1 and Lemma 2.

**Lemma 1.** An on-line auction that is based on supply curves is incentive compatible.

**Proof.** According to Definition 1,  $\sum_{j=1}^{q} (b_i(j) - p_i(j))$  is maximized if based on supply curve. So that  $U_i = \sum_{j=1}^{q} (v_i(j) - p_i(j))$  is always maximized iff  $b_i(\cdot) = v_i(\cdot)$ .

**Lemma 2.** Any deterministic incentive compatible on-line auction is based on supply curves.

Proof. Next slides.

# Proof of Lemma 2

**Lemma 2.** Any deterministic incentive compatible on-line auction is based on supply curves.

#### Proof.

For each player i,  $P_i$  is uniquely determined by  $q_i$ . Otherwise there exists bids v and v', where P<P', so that a player which has valuation v' will lie by declaring v to increase his utility, which contradicts incentive compatibility. Denote  $P_i(q)$ :  $[1,k] \rightarrow R$ , the total payment of player i for q items.

The allocation to player i must maximize  $U_i(q) = \sum_{j=1}^q v_i(j) - P_i(q)$  otherwise player i will lie to increase his utility.

Denote  $p_i(q) = P_i(q) - P_i(q-1)$ . Since  $P_i(0) = 0$ , the allocation maximizes  $U_i(q) = \sum_{j=1}^q v_i(j) - P_i(q) = \sum_{j=1}^q (v_i(j) - p_i(j))$ , and the payment is  $P_i(q_i) = \sum_{j=1}^{q_i} p_i(j)$  so that  $p_i(q)$  is the supply curve according to Definition 1.

# Special Case: Fixed Marginal Valuation

**Lemma 3.** Assume that for any player i, the marginal valuation is fixed to  $v_i$ . Then any incentive compatible on-line auction is based on non-decreasing supply curves.

#### Proof.

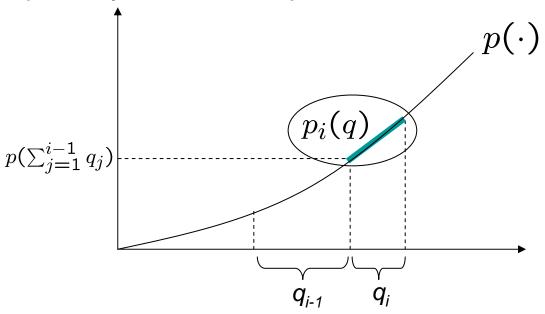
marginal valuation  $v_i$  quantity

- 1.  $q_i(v)$  is non-decreasing.
- 2. Define  $p_i(q) = \inf \{ v \mid q_i(v) \ge q \}$ . Since  $q_i(v)$  is non-dreasing,  $p_i(q)$  is non-decreasing as well.
- 3. Any incentive compatible on-line auction A is based on  $p_i(q)$ .

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# Global Supply Curve

**Definition 2** (A global supply curve). An online auction is called "based on a global supply curve p(q)" if it is based on supply curves and if  $p_i(q) = p(q + \sum_{j=1}^{i-1} q_j)$  where  $q_j$  is the quantity sold to the *j*th bidder.



# Revenue and Social Efficiency

**Definition 3** (Revenue and social efficiency). In auction A, for a valuation sequence  $\sigma$ , the revenue is

$$R_A(\sigma) = \sum_i P_i + \underline{p}(k - \sum_i q_i).$$

The social efficiency is

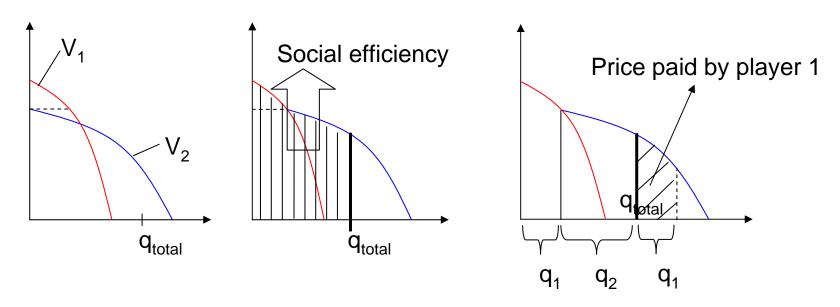
$$E_A(\sigma) = \sum_{i} \sum_{j=1}^{q_i} v_i(j) + \underline{p}(k - \sum_{i} q_i).$$

# **Assumptions**:

- 1. All marginal valuations are taken from some known interval  $[p, \overline{p}]$ , without assuming any distribution on them.
- 2. p is the salvage price of the auctioneer.

# Off-line Vickrey Auction

**Definition 4** (The Vickrey auction). In the Vickrey auction, each player declares his marginal valuation function. The allocation chosen is the one that maximizes the social efficiency (according to the players' declarations). The price charged from player i for the quantity  $q_i$  he receives is the worth of this additional quantity to the other players. Formally, denote by  $E_{-i}$  the optimal social efficiency when player i is missing, and by E the actual optimal social efficiency. Then the price that i pays is  $E_{-i}$ -(E- $v_i(q_i)$ ).



# Competitiveness

**Definition 5** (Competitiveness). An on-line auction A is c-competitive with respect to the revenue if for every valuation sequence  $\sigma$ ,  $R_A(\sigma) \geq R_{vic}(\sigma)/c$ . Similarly, A is c-competitive with respect to the social efficiency if for every valuation sequence  $\sigma$ ,  $E_A(\sigma) \geq E_{vic}(\sigma)/c$ .

**Comments**:  $E_{vic}$  is always optimal; while  $R_{vic}$  is not necessarily optimal, i.e. sometimes can be far from the optimal revenue.

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Let *c* be the unique solution to the equation:

$$c = \ln \frac{(\overline{p}/\underline{p}) - 1}{c - 1} \tag{1}$$

**Comments**: it can be shown that  $c = \Theta(\ln(\overline{p}/\underline{p}))$ . For example, if  $(\overline{p}/\underline{p})$ =2 then c=1.28, and if  $(\overline{p}/\underline{p})$ =8 then c=1.97.

**Definition 6** (The competitive on-line auction). Define the *competitive supply curve* by

$$p(x) = \underline{p}(1 + (c - 1)e^{cx}).$$

The *competitive on-line auction* has the competitive supply curve as its global supply curve.

Let 
$$q(x) = p^{-1}(x)$$
 and  $r(x) = \int_0^{q(x)} p(y) dy$ 

**Lemma 4.** (El-Yaniv et al) The functions q(x), r(x) preserve the following conditions:

1. 
$$\forall x \le c \cdot p : q(x) = 0, r(x) = 0$$

2. 
$$\forall x > c \cdot \underline{p} : r(x) + \underline{p} \cdot (1 - q(x)) = x/c$$

3. 
$$q(\overline{p}) = 1$$

Where c is as defined in Eq. (1).

**Theorem 2.** The competitive on-line auction is *c*-competitive with respect to the revenue and the social efficiency.

**Lemma 6.** For any sequence of valuations  $\sigma$ ,  $R_{cola}(\sigma) \geq R_{vic}(\sigma)/c$ , where "cola" is the competitive online auction and "vic" is the Vickrey auction.

**Lemma 7.** For any sequence of valuations  $\sigma$ ,  $E_{cola}(\sigma) \geq E_{opt}(\sigma)/c$ , where  $E_{opt}(\sigma)$  is the optimal social efficiency for  $\sigma$ .

**Theorem 3.** Any incentive compatible on-line auction must have a competitive ratio of at least c with respect to both the revenue and the social efficiency, where c is the solution to Eq. (1).

**Lemma 5**. For any constant  $\tilde{c} < c$  , there is no function  $\tilde{q}(x)$  such that

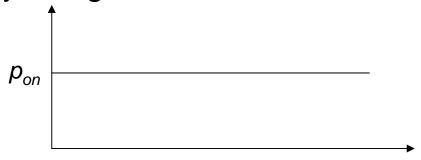
$$\forall x \in [\underline{p}, \overline{p}], \tilde{r}(x) + \underline{p} \cdot (1 - \tilde{q}(x)) \ge x/\tilde{c},$$

Where 
$$\tilde{r}(x) = \int_0^{\tilde{q}(x)} \tilde{p}(t) dt$$
 and  $\tilde{p}(x) = \tilde{q}^{-1}(x)$ 

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# A Randomized Auction for k Indivisible Goods

**Definition 7.** The randomized on-line auction: the supply curve is fixed with  $p(x)=p_{on}$ , where  $p_{on}$  is chosen by using the cumulative distribution  $q(\cdot)$ .



**Theorem 4.** For any sequence of valuations  $\sigma$ , the expected revenue of the randomized auction is at least 1/c times the optimal efficiency, i.e.  $E(R_{on}(\sigma)) \ge E_{opt}(\sigma)/c$ .

# Proof of Theorem 4

Define the cdf:  $\forall v \in [\underline{p}, \overline{p}]$ ,  $\Pr(x \le v) = q(v)$ , f(x) = d[q(x)]/dx

$$E(R_{\text{on}}|v_{i+1} \leqslant p_{\text{on}} \leqslant v_i) \geqslant \int_{v_{i+1}}^{v_i} i \cdot x \cdot \frac{f(x)}{Pr(v_{i+1} \leqslant p_{\text{on}} \leqslant v_i)} \, \mathrm{d}x + \underline{p}(k-i)$$

$$E(R_{\text{on}}) \geqslant \sum_{i=0}^{k} \left[ i \cdot \int_{v_{i+1}}^{v_i} x f(x) \, \mathrm{d}x + \underline{p}(k-i) \cdot Pr(v_{i+1} \leqslant p_{\text{on}} \leqslant v_i) \right]$$

$$= \sum_{i=0}^{k} \left[ i \cdot \int_{v_{i+1}}^{v_i} x f(x) \, \mathrm{d}x + \underline{p}(k-i) (q(v_i) - q(v_{i+1})) \right].$$

$$\geqslant \sum_{i=1}^{k} \left[ \int_{\underline{p}}^{v_i} x f(x) \, \mathrm{d}x \right] + \sum_{i=1}^{k} \left[ \underline{p}(q(v_0) - q(v_i)) \right]$$

$$= \sum_{i=1}^{k} \left[ \int_{\underline{p}}^{v_i} x f(x) \, \mathrm{d}x + \underline{p} (1 - q(v_i)) \right] = \sum_{i=1}^{k} \frac{v_i}{c} = E_{\mathrm{opt}}(\sigma)/c$$

# A Deterministic Auction for *k* Indivisible Goods

**Definition 8** (The discrete on-line auction). The discrete on-line auction is based on the following global supply curve:

$$p(j) = \underline{p} \cdot \Phi^{j/(k+1)}$$
, for  $j = 1, \dots, k$ . assume w.l.o.g that  $\underline{p} = 1, \bar{p} = \phi$ .

**Theorem 5.** The discrete on-line auction is  $k \cdot \Phi^{1/(k+1)}$ competitive with respect to the revenue and to the social
efficiency. When  $k \ge 2 \cdot \ln \Phi$  then the discrete on-line auction is
also  $2 \cdot e \cdot (\ln(\Phi) + 1)$ -competitive with respect to the revenue
and to the social efficiency.

**Theorem 6.** Any incentive compatible on-line auction of k goods has a competitive ratio of at least  $m=max\{\Phi^{1/(k+1)},c\}$  with respect to the revenue and to the efficiency.

# Revenue Analysis on Uniform Distribution

We compare the expected revenue of the competitive on-line auction to the expected revenue of the Vickrey off-line auction for a divisible good in the special case of fixed marginal valuations uniformly distributed in  $[p, \overline{p}]$ .

	On-line revenue	Vickrey revenue
$\bar{p} = 1.5, \ n = 2$	1.15	1.17
$\bar{p}=3, n=2$	1.60	1.67
$\bar{p}=10, n=2$	3.33	4.00
$\bar{p}=2, n=2$	1.31	1.33
$\bar{p}=2, n=3$	1.37	1.50
$\bar{p} = 2, \ n = 100$	1.56	1.98