Problem sets

# Topics in mechanism design

Elias Koutsoupias

# Set 1

1. Consider the problem of related machines scheduling in which machines are agents with private values for their speeds  $s_1, \ldots, s_n$ , and we want to minimize the makespan. Consider the mechanism that selects an arbitrary optimal solution. Is this mechanism truthful for 2 machines? For 3 machines?

# Solution.

A mechanism is truthful if the allocation is monotone: if the speed of a machine decreases, the machine will not get a larger load.

For 2 machines the mechanism is monotone, by simple case analysis.

For 3 machines the mechanism is not truthful. Example: the machines have speed 1,2,10 and the tasks are 1,2,100. An optimal allocation is to allocate the *i*-th task to the *i*-th machine, for i = 1, 2, 3. Furthermore, the allocation remains optimal even if agent 1 gets the first two tasks. Now when the speed of machine 1 is reduced and the mechanism switches from the first allocation to the second allocation, it is not monotone for agent 1.

2. Give a polynomial-time truthful deterministic mechanism with an approximation ratio 3/2 for the related scheduling problem with 2 machines. Recall that in the related scheduling problem there are two machines with speeds  $(s_1, s_2)$ , the input is a set of jobs  $\{w_1, \ldots, w_n\}$  and we want a monotone mechanism to minimize the makespan.

### Solution.

The following is a monotone scheduling algorithm. By symmetry, assume that  $s_1 \leq s_2$ :

- If  $s_2/s_1 \leq 2$ , the algorithm partitions the jobs into almost equal loads this can be done by a PTAS. It then allocates the smaller load to the first machine and the larger one to the second machine.
- If  $s_2/s_1 > 2$ , it assigns all jobs to the second machine.

We can argue by case analysis that the algorithm is monotone, i.e., if a machine decreases its speed, it will not get a higher load. For example, if  $s_1$  decreases and the allocation switches from the first case to the second case, the load of the machine decreases (it changes from a positive value to 0).

We now argue that the approximation ratio is at most 3/2. Assume without loss of generality that the optimum makespan is 1, so the total load is at most  $s_1 + s_2$ . In the first case, the approximation ratio is at most  $\frac{s_1+s_2}{2} \cdot \frac{1}{s_1} \leq \frac{1+s_2/s_1}{2} \leq 3/2$ . In the second, the approximation ratio is  $(s_1 + s_2) \cdot \frac{1}{s_2} \leq 1 + \frac{s_1}{s_2} \leq 3/2$ .

3. Let's consider a two-sided auction. There are two agents: a seller and a buyer with valuations  $(v_1, v_2)$ , respectively, for a single item. Assume that agent 1 owns the item.

We want a mechanism that trades the item, i.e., it decides whether to leave the item to agent 1 or move it to agent 2.

Describe the VCG mechanism with Clarke pivot rule for this setting. What are the payments? Does the mechanism have the "budget-balance" property?

Analyze the situation when there is another buyer with value  $v_3$ .

### Solution.

If  $v_1 \ge v_2$ , there is no trade and the payments are 0. Otherwise, the mechanism will give the item to agent 2. Agent 2 should pay  $v_1$  (their additional contribution to the social welfare is  $v_2 - v_1$ ) and agent 1 should receive  $v_2$  (their presence increases the social welfare from 0 to  $v_2$ ). This does not have the budget-balance property.

If there is a third agent, with  $v_1 \leq v_2 \leq v_3$ , the third agent will get the item, but she will pay  $v_2$  (as in the second-price auction). Similarly for the other cases.

- 4. Consider the case of a simple item to be allocated to one of n agents with nonnegative values  $v_1, \ldots, v_n$ . A mechanism is truthful for an agent i if and only if their payment  $p_i$  depends only on the values  $v_{-i}$  of the other agents.
  - (a) Suppose that  $p_i(v_{-i})$  are arbitrary functions. Explain why this mechanism may not be valid.
  - (b) Suppose that there are only two agents and that the mechanism is defined by a function  $p_1(v_2)$  as follows: if  $v_1 \ge p_1(v_2)$ , the item is allocated to agent 1, otherwise it is allocated to agent 2. What property must  $p_1(v_2)$  satisfy for the mechanism to be truthful?
  - (c) Let's generalize the mechanism to multiple agents: there are payment functions  $p_1(v_{-1}), \ldots, p_{n-1}(v_{-(n-1)}), p_n(v_{-n}) = 0$  and the mechanism allocates the item to the first agent i with  $v_i \ge p_i(v_{-i})$ . For which functions  $p_i(v_{-i})$  is the mechanism truthful?

### Solution.

- (a) The mechanism is not valid because it may give the item to multiple agents.
- (b) The allocation is always valid. Agent 1 is truthful for every  $p_1(v_2)$ . The allocation to agent 2 is monotone and therefore truthful if and only if  $p_1(v_2)$  is non-increasing in  $v_2$ .
- (c) Similarly for many agents, the mechanism is truthful if and only if  $p_i(v_{-i})$  is non-increasing in  $v_j$  for i < j.
- 5. Consider the following mechanism for selling k > 1 identical items to unit-demand bidders. The bidders with the k highest bids get an item and pay as follows: The highest bidder pays the second highest bid, the second highest bidder pays the third highest bid, etc. Is this mechanism truthful for all bidders?

#### Solution.

Not in general. The bidders with the highest k - 1 bids have a reason to declare a value slightly above the (k + 1)-st bid. There is an extensive literature about a variant of this untruthful auction, called GSP (generalized second price auction). Google was using this auctions for ad placement.

### Set 2

1. Consider the scheduling problem with two unrelated machines and two tasks. VCG for this setting tries to minimize the social cost, i.e., it computes

$$\arg\min(t_{1,1}+t_{1,2}, t_{1,1}+t_{2,2}, t_{2,1}+t_{1,2}, t_{2,1}+t_{2,2}),$$

and gives the two tasks accordingly (for example, if the minimum comes from the third value  $t_{2,1} + t_{1,2}$ , machine 1 gets the second task and machine 2 gets the first task). Now consider changing the first expression from  $t_{1,1} + t_{1,2}$  to  $t_{1,1} + t_{1,2} - 1$ . Argue that this mechanism is an affine minimizer. Show the partition of the space into allocations of the first machine, when the second machine has values  $t_2 = (3, 2)$ . Show that this mechanism has unbounded approximation ratio, when the objective is the makespan.

#### Solution.

The mechanism is an affine minimizer because it only changes a  $\gamma$  value (see the definition of affine minimizers). To show that the approximation ratio is unbounded consider the input

$$t_1 = (1 - \epsilon, 0), t_2 = (0, 0),$$

for some  $\epsilon > 0$ . The mechanism will allocate both tasks to machine 1, with makespan  $1 - \epsilon$ , while the optimal makespan is 0.

2. Consider the scheduling problem with two unrelated machines and two tasks. Consider an affine minimizer with  $\lambda_i = 1$  for i = 1, 2. What are the conditions on payments (or equivalently on  $\gamma$ 's in the definition of affine minimizers) so that the mechanism is quasi-bundling? quasi-flipping? task-independent?

#### Solution.

The expression

$$x = p_1((0,0), t_2) + p_1((1,1), t_2) - p_1((0,1), t_2) - p_1((1,0), t_2) = \gamma(0,0) + \gamma(1,1) - \gamma(0,1) - \gamma(1,0) - \gamma(1,0)$$

determines whether the mechanism is quasi-bundling (x > 0), quasi-flipping (x < 0) or task-independent (x = 0). Interestingly, the property (quasi-bundling / quasi-flipping / taskindependent mechanism) does not depend on the values of  $t_2$ .

3. Analyze the approximation ratio of the Hybrid mechanism for a star of 2 leaves.

Can you suggest another truthful mechanism with better approximation ratio?

Solution.

The approximation ratio of the Hybrid mechanism is 2. Consider values on the edges  $(1-\epsilon, 1)$  and  $(1, 2-\epsilon)$ , where the first value is the value of the root and  $\epsilon$  is a small positive value. The optimal allocation is 1 (first edge to leaf and second edge to root), while Hybrid allocates both edges to the leaves, with makespan  $2-\epsilon$ . As  $\epsilon$  tends to 0, the approximation ratio tends to 2.

To get a better mechanism, we generalize the Hybrid mechanism as follows. Instead of considering the maximum value of the leaves, we consider a weighted maximum. Specifically, assume that the values of the leaves are  $l_1 \leq l_2 \leq \cdots \leq l_m$  (here we consider stars with m leaves), and the corresponding values of the root are  $r_1, \ldots, r_m$ . The weighted Hybrid mechanism with weights  $\alpha_1, \alpha_2, \ldots$ , allocates a set  $T = \{1, \ldots, k\}$  of edges to the leaves where k belongs to

$$\arg\min_{0\le k\le m}\sum_{j>k}r_j+\alpha_k l_k,$$

where by convention  $l_0 = 0$ . The (unweighted) Hybrid mechanism has  $\alpha_k = 1$  for all k.

If the sequence  $\alpha_1, \alpha_2, \ldots$  is nonnegative and non-decreasing, the mechanism is truthful. For two leaves, it achieves an approximation ratio of  $1.618\ldots$  (equal to the golden ratio).

4. Recall the SQUARE mechanism, which is a fractional task-independent mechanism that allocates fractions inversely proportional to the square of the values. Prove that it has approximation ratio (n + 1)/2.

#### Solution.

See paper: George Christodoulou, Elias Koutsoupias, Annamária Kovács: "Mechanism design for fractional scheduling on unrelated machines." ACM Trans. Algorithms 6(2): 38:1-38:18 (2010).