## INTRO TO APPROXIMATION, CLASS 4

Is greedy scheduling into a knapsack satisfiable?

A selection from homework:

## EXERCISE ONE Scheduling on machines with speeds:

We have *m* machines with speeds  $s_1 \ge s_2 \ge \cdots \ge s_m$  on which we want to schedule *n* jobs (so that one machine processes at most one job at a time). Now, processing the *j*-th job on machine *i* takes  $p_j/s_i$  units of time, where  $p_j$  is the length of the job. (The schedule starts at time 0 and two jobs cannot of course run at the same time on one machine.)

We say that a polynomial-time algorithm is a  $\rho$ -relaxed decision procedure if it gets a number D in addition to the intput and either (I) creates a schedule so that all jobs are finished till time  $\rho D$ , or (II) outputs that there is no schedule that can finish all jobs till time D.

Show that one can use a  $\rho$ -relaxed decision procedure to find a  $\rho$ -approximation algorithm.

EXERCISE TWO Consider SCHEDULING WITH DEPENDENCIES: we schedule jobs on m computers, but in addition to length  $p_j$  each job j has a set  $\mathcal{D}_j$  of dependencies and we can start job j only if all jobs in  $\mathcal{D}_j$  are already finished.

a) Prove the following lower bound on the optimum:

" $OPT \ge$  length of any chain in the input. A *chain* is a sequence of jobs where each one depends on the previous one. Its length is then the total processing time of all the jobs in the chain."

b) Design a greedy 2-approximation algorithm for this problem.

EXERCISE THREE Consider the classic NP-hard KNAPSACK PROBLEM, where we have n objects  $a_1, \ldots, a_n$ , each object has a weight  $w_i$  and cost  $c_i$ , and our bag has a weight limit of B.

- a) Explain why "naive greedy algorithm", i.e. "we put the most expensive item (that fits) into the knapsack and continue the same way" is a bad one.
- b) OK, let us try the following: "we sort the items according to their density (ratio price/size), go through them in decreasing order and insert only those that fit in the knapsack." Spoiler alert: this algorithm also fails. Show an input where it does.
- c) Finally, design a 2-approximation algorithm for this problem. This algorithm does not need to be greedy.

*Hint:* When you iterate over the items based on the density, at some point it may happen that object P does not fit with the items you have already selected into the knapsack. What should you do then?

EXERCISE FOUR The *k*-CENTER PROBLEM is another example of an interesting metric problem. On input we get a set V, |V| = n of points in a metric space and the goal is to select *k* centers out of them (a *k*-element subset of *V*) so that the points from *V* are as close to the centers as possible – so that the point which is furthest away from any center is as close as possible. Formally we minimize the function  $u(S) = \max_{p \in V} d(p, S)$ , where d(p, S) is the distance from *p* to its closest point in *S*.

Design and analyze a 2-approximation algorithm for the k-CENTER PROBLEM.

**Tip:** Note that both the algorithm and the optimum are choosing exactly k points, the factor that is relaxed by 2 is the distance function. This must be present in the analysis somehow – it makes sense to start by considering the k points that optimum chooses, the k points that you choose, and compare the two sets.

EXERCISE FIVE Recall the integer program for MAX SAT and its linear relaxation. During the lecture you have seen a 3/4-approximation algorithm for MAX SAT based on choosing a better of two solutions, one of which was created by rounding a solution of this relaxation. By a better rounding one can avoid choosing a better of two solutions and still maintain the approximation ratio 3/4.

Find an instance, that is, a set of clauses, such that the optimum of the relaxation  $OPT_r$  and the optimum of the instance OPT satisfies  $OPT = (3/4)OPT_r$ .

This shows that using the linear relaxation one cannot obtain a better than 3/4-approximation algorithm. (The worst case ratio between  $OPT_f$  and OPT is called integer gap.)

*Hint:* you can use, for example, just 2 variables and 4 clauses.