

# Lecture Notes: Scheduling to maximize profit

## Problem:

1 machine. it can be working on at most one job at a time

$n$  jobs  $J_1, \dots, J_j, \dots, J_n$

unit length, non-preemptive

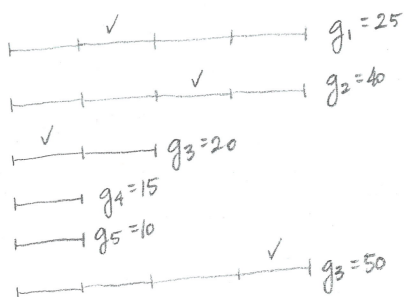
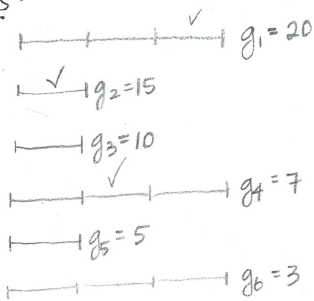
release time 0

deadline  $d_j \in \mathbb{Z}^+$

profit  $g_j \in \mathbb{Z}^+$

goal: feasibly schedule a subset  $S$  of jobs where  $S$  has max profit.  
 $\sum_{j \in S} g_j$

## Examples:



The greedy algorithm for this problem bears heavy resemblance to Kruskal's alg. for minimum spanning trees.

## High-level of Greedy Scheduler:

- sort jobs s.t.  $g_1 \geq g_2 \geq \dots \geq g_n$

-  $J \leftarrow \emptyset$

- for each  $j$  from 1 to  $n$  do

if  $\text{feas}(J \cup \{j\})$  do

$J \leftarrow J \cup \{j\}$

→ Oracle telling us whether  $J \cup \{j\}$  is a feasible set of jobs, i.e. whether there exists a schedule of  $J \cup \{j\}$ .

(Recall Kruskal's alg.:

- sort edges s.t.  $w(e_1) \leq w(e_2) \leq \dots \leq w(e_m)$

-  $T \leftarrow \emptyset$

- for each edge  $e$  from 1 to  $m$  do

if  $\text{feas}(T \cup \{e\})$  do

$T \leftarrow T \cup \{e\}$

→ can think of this as an oracle telling us whether  $T \cup \{e\}$  has cycles

Nevermind for now how the oracle determines whether a set of jobs is feasible. We will come back to this.

Note:  $\exists$  optimal schedule having no idle time.

Claim: Greedy Scheduler maximizes profit.

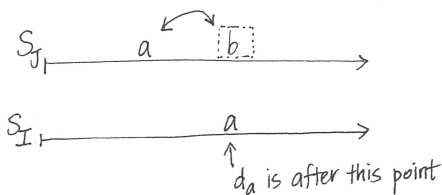
Proof: - let  $J$  denote jobs satisfied in GS' solution and  $S_J$  be some feasible schedule of jobs  $J$

- let  $I$  denote jobs satisfied by the optimal solution (OPT);  $S_I$  a feasible schedule of  $I$ .

- one can rearrange  $S_J$  and  $S_I$  into  $S'_J$  and  $S'_I$  s.t. any  $j \in I \cap J$  is done in same slot <sup>in</sup>  $S'_J$  and  $S'_I$ :  
for every job  $a \in I \cap J$ .

(i) if  $a$  in same slot in  $S_J$  and  $S_I$ , nothing to rearrange.

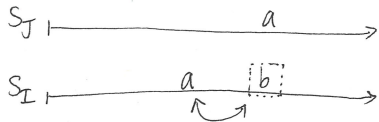
(ii) if  $S_J$  schedules  $a$  earlier than  $S_I$  schedules  $a$ ,



in  $S_J$ , swap  $a$  with  $b$ . ( $b$  may be nothing if  $S_J$  didn't schedule anything in the slot where  $S_I$  scheduled  $a$ . can still "swap")  
both  $a$  and  $b$  still done before their deadlines.

(iii) if  $S_J$  sch's  $a$  later than  $S_I$  sch's  $a$ ,

in  $S_I$ , swap  $a$  with  $b$ . again, still feasible.



- once job  $a$  has been moved into agreement, it never needs to move again. can repeat this argument for all of  $I \cap J$ , each time decreasing number of common but unsynced jobs.

so  $\text{profit}(S_J) = \text{profit}(S'_J)$  and  $\text{profit}(S_I) = \text{profit}(S'_I)$ .

-  $S'_I$  and  $S'_J$  can still look different, but only because  $I \neq J$ . How can this happen?

Case 1:  $S'_J$  has a point 'a' followed by an empty slot.  $S'_I$  has an empty slot. Some job  $a$  is sched'd in  $S'_J$  opposite an empty slot in  $S'_I$  and  $a \notin I$ .  
\* contradicts optimality of  $I$  since  $I \cup \{a\}$  is feasible and more profitable.

Case 2:  $S'_J$  has an empty slot.  $S'_I$  has a point 'a'. Some job  $a$  is sched'd in  $S'_I$  opposite empty slot in  $S'_J$  and  $a \notin J$ .  
 $J \cup \{a\}$  is feasible and Greedy Scheduler wouldn't have skipped it. \*

Case 3:  $S'_J$  has a point 'a' and  $a \notin I$ .  $S'_I$  has a point 'b' and  $b \notin J$ .  
Case 3.1:  $g_a > g_b$ .  $I \setminus \{b\} \cup \{a\}$  is more profitable than  $I$ .  
\* optimality of  $I$ .

Case 3.2:  $g_a < g_b$ . then Greedy Scheduler skipped over  $b$  to eventually pick  $a$ . \* greediness

Case 3.3:  $g_a = g_b$ . this is the only thing that can happen.

$\therefore \forall$  timeslots  $t$ , at  $t$   $S'_J$  and  $S'_I$  schedule

- no jobs
- same job
- two jobs with same profit.

$\Rightarrow \text{profit of } S'_J = \text{profit of } S'_I$

$\therefore$  schedule  $S_I$  yields optimal (i.e. maximum) profit.



## Determining feasibility:

FeasOracle(J): for each  $i \in J$ , schedule  $i$  at  $t$ , the latest possible free slot  $t \leq \min(n, d_i)$ .

Lemma: J is feasible iff FeasOracle(J) returns a feasible solution.

Proof:  $\Leftarrow$ : trivial.

$\Rightarrow$ : suppose J is feasible.

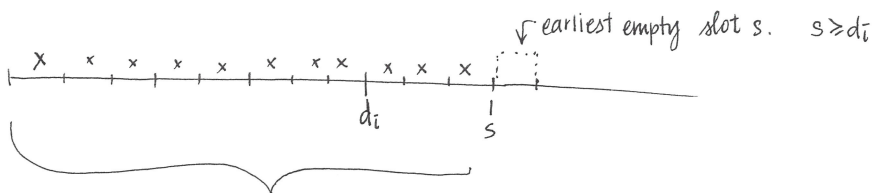
then  $\exists$  a feas. sch.

then  $\exists$  a feas. sch. scheduling all jobs in first  $|J|$  timeslots } "left-shifted sch."

- can always move jobs earlier.

Suppose FeasOracle(J) does not return a feasible sol'n,

i.e.  $\exists$  job  $i \in J$  s.t. FeasOracle was unable to add it before  $\min(|J|, d_i)$



since slot  $s$  is empty, all  $(s-1)$  jobs scheduled here have deadline  $\leq s-1$

$\therefore$  J has at least  $s$  jobs, each of whose deadline is  $< s$ .

By Pigeonhole Prin., J cannot be feasible.

■

How to implement Greedy Scheduler with FeasOracle: note that FeasOracle doesn't specify order in which jobs of J are added to schedule. We will choose to add them in same order of non-increasing  $g_j$  so that we don't have to rebuild the sch. from scratch with each oracle call.

## Greedy Scheduler details

- sort jobs s.t.  $g_1 \geq g_2 \geq \dots \geq g_n$  (compute  $d_{max}$  along the way)

- for each  $t \leftarrow 1$  to  $\min(n, d_{max})$  do

$S[t] \leftarrow \text{NIL}$  (schedule)  
      $\text{free}[t] \leftarrow t$  (latest free slot earlier than or equal to  $t$ )

- for each job  $j \leftarrow 1$  to  $n$  do

$m \leftarrow \text{free}[\min(n, d_j)]$  (get latest free slot  $\leq \min(n, d_j)$ )

    if  $m > 0$  do

$S[m] \leftarrow j$  (schedule  $j$  there)

$m' \leftarrow m$

        while  $S[m'] \neq \text{NIL}$  do

$\text{free}[m'] \leftarrow \text{free}[m'-1]$

$m' \leftarrow m'+1$

} (update  $\text{free}[\cdot]$ )

Total time:

$$O(n \log n) + O(n^2) = \underline{O(n^2)}$$

