# CS420+500: Advanced Algorithm Design and Analysis Lecture: March 17, 2017

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In this lecture, we discussed approximation algorithms for:

- Minimum Vertex Cover
- List Scheduling Approximation

Suggested Reading: <a href="http://jeffe.cs.illinois.edu/teaching/algorithms/notes/31-approx.pdf">http://jeffe.cs.illinois.edu/teaching/algorithms/notes/31-approx.pdf</a>

## 1 Minimum Vertex Cover

**Definition.** *Minimum vertex cover:* given an undirected graph G = (V, E), find the smallest set of vertices  $S \subseteq V$  such that all edges in G have at least one endpoint in S

## Greedy Algorithm for Minimum Vertex Cover [GreedyVC]:

- 1. Include in S the vertex with the highest degree (largest number of connected edges)
- 2. Remove the vertex and all incident edges from G
- 3. Repeat Steps 1-2 until no edges are left in G

**Guarantee:** the size of *GreedyVC*  $\leq \log n \cdot OPTVC$  for all graphs

## Matching Vertex Cover [ MVC ]:

- 1. Set  $S = \emptyset$
- 2. Pick any edge in the graph:  $(u, v) \in G$ 
  - a. Remove (u, v) from G and all edges that are adjacent to u or v
  - b. Add u, v to S
- 3. Repeat 2 until no edges are left in G

**Claim:** *MVC* is a 2-approximation for minimum vertex cover

• We don't know how big OPTVC(G) is but we can get the lower bound for its size *Proof:* 

- 1.  $|OPTVC(G)| \ge #edges$  picked by *MVC* because the edges form the matching; no vertex covers more than one edge in a matching
- 2. # vertices picked by *MVC* is  $2 \times # edges picked \rightarrow |MVC(G)| \le 2 |OPTVC(G)|$

# 2 List Scheduling Approximation

(1966 – Ronald Graham of Graham's Scan)

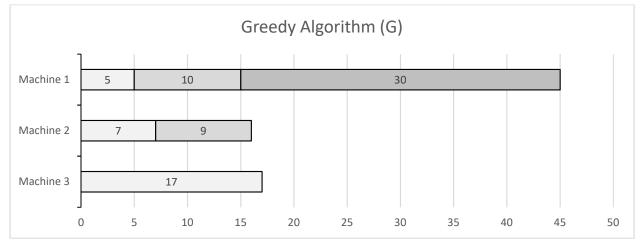
Definition. List Scheduling:

- Given *n* jobs, job *i* must execute uninterruptibly for  $P_i$  time units.
- Given *m* identical machines, each machine can work on one job at a time
- Find a schedule of jobs that minimizes the overall completion time

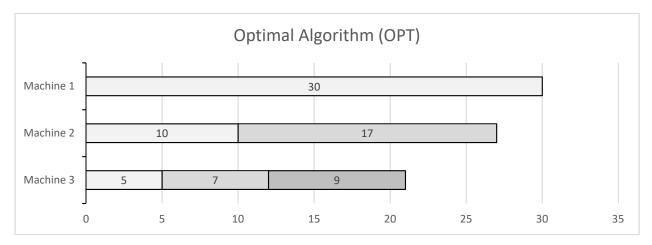
Example:

*P*<sub>*i*</sub>: 5, 7, 17, 10, 9, 30: 6 jobs among 3 machines

## Greedy Algorithm: Whenever a machine becomes idle, assign the next job to it.



## Optimal Algorithm: the best possible job allocation



Another possible variant (not depicted): sort the jobs first from smallest to largest, then add to machines in reverse size order.

#### Greedy Algorithm (G):

Whenever a machine becomes idle, assign the next job to it.

Claim:  $|G(P_1, P_2, ..., P_n)| \le (2 - \frac{1}{m})|OPT(P_1, P_2, ..., P_n)|$  (A little better than 2-approximation)

### Proof:

- 1.  $OPT \ge P_i$  for all i
- 2.  $OPT \ge \frac{1}{m} \sum_{i} P_i$
- Note:  $\frac{1}{m}\sum_{i} P_i$  is the perfect division of  $P_i$  among machines, assuming jobs are interruptible

Let job k be the last job to finish.  $P_k \leq OPT$  by (1)

**Goal:** show that the sum of jobs before  $P_k$  on that machine is smaller than OPT, then the sum of the  $P_i$ s for all jobs on that machine is no more than  $\left(2 - \frac{1}{m}\right)OPT$ 

- 1. Let  $S_k$  be the sum of the  $P_i$  s for all jobs on that machine before  $P_k$ .
- 2. Up to time  $S_k$  (when work starts on job k), all machines have been busy. That means the total amount of work that has been done up to time  $S_k$  is  $mS_k$ . This work is on jobs other than job

*k*. So 
$$\sum_{i \neq k} P_i \ge mS_k$$
 or, after rearranging,  $S_k \le \frac{1}{m} \sum_{i \neq k} P_i$ 

3. Combining (1) and (2):

$$S_k + P_k \le \frac{1}{m} \sum_{i \ne k} P_i + P_k = \frac{1}{m} \sum_i P_i + \left(1 - \frac{1}{m}\right) P_k$$
$$\le OPT + \left(1 - \frac{1}{m}\right) OPT = \left(2 - \frac{1}{m}\right) OPT$$
$$\therefore$$