

Approximation Algorithms
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Local search algorithms

**Example I: Revisiting scheduling on identical
parallel machines**

Local search

Greedy algorithms

Construct a solution from nothing by repeatedly making "greedy choices".

Local search algorithms

Start with any feasible solution and repeatedly improve that solution by searching for a "nearby" (local) better solution.

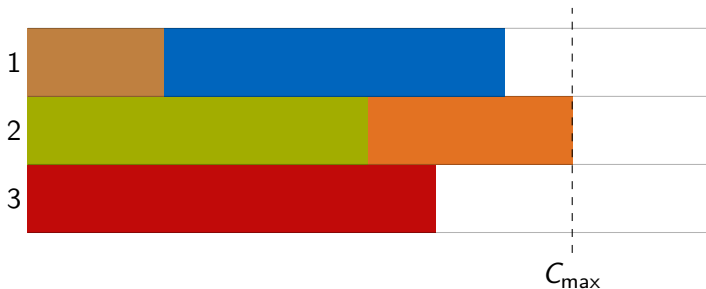
Scheduling on parallel machines

Input: m identical machines,

n jobs with processing times p_1, \dots, p_n

Task: assign each job $j \in [n]$ to a machine $i \in [m]$
minimizing the maximum load of any machine

$$C_{\max} := \max_{i \in [m]} \sum_{j: j \rightarrow i} p_j$$



Theorem

(Greedy) List Scheduling is a 2-approximation for $P||C_{\max}$.

Algorithm:

- 1 Init. any feasible solution.
- 2 While $\exists j \in [n], i \in [m]$ s.t.

$$p_j + \sum_{k: k \rightarrow i} p_k < \sum_{k: k \rightarrow M_j} p_k$$

Assign j to machine i .



2

3

Theorem

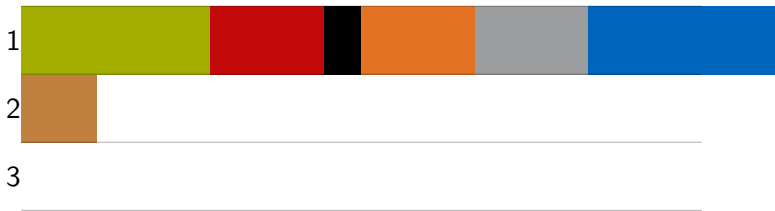
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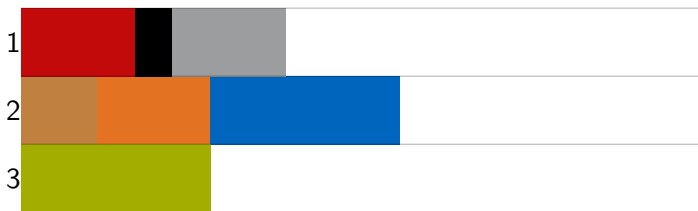
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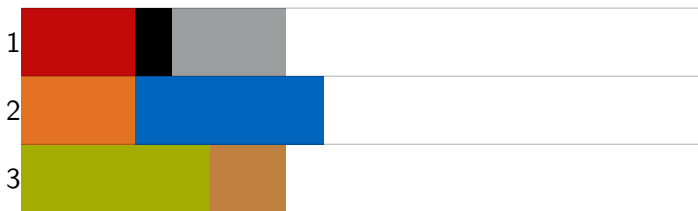
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Proof

Slightly different local moves.

- ▶ Move only the last job on a machine.
- ▶ Move only to the machine with the smallest load.

Local search algorithms

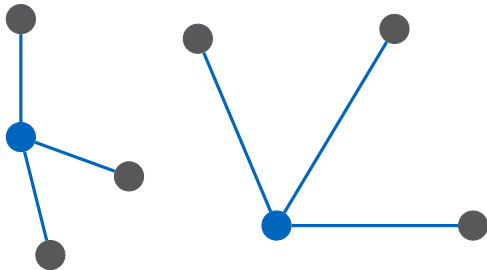
Example II: k -Median problem

The k -Median problem

Input: metric space V with distances d_{ij} for $i, j \in V$ and some $k \in \mathbb{N}$ (metric: $d_{ii} = 0$, $d_{ij} = d_{ji}$, and triangle ineq. $d_{ij} + d_{jk} \geq d_{ik}$)

Task: find k facilities in V , i.e., find $S \subseteq V$ with $|S| \leq k$.

Objective: minimize $\sum_{i \in V} d(i, S)$ with $d(i, S) = \min_{s \in S} d(i, s)$



Algorithm:

- 1 Init. any set S of k facilities.
- 2 While $\exists j \in V, k \in S$ s.t.

$$\sum_{i \in V} d(i, S + j - k) < \sum_{i \in V} d(i, S)$$

Swap j and k .

Theorem

Local search is a 5-approximation for k -Median.

Local search

Proof idea

S : Local optimum

S^* : Optimal solution

In S , find k swaps that imply the bound.

Mapping $\sigma : S^* \rightarrow S$: Each $i^* \in S^*$ to closest $i \in S$

