

Setup :- $n$  jobs $m$  identical machines $j$ th job needs  $p_j$  units of time

Each job is available at time 0.

 $c_j$  if job  $j$  completes at timeOur Objective :-minimize  $C_{\max} = \max_{j=1 \dots n} c_j$  (called makespan or length of schedule)Local Search Algorithms:-

Set of local changes/moves that change from FEASIBLE soln to the other.

Alg 1 :-

Start with any schedule

Consider job  $l$  that finishes lastIs there a free machine that finishes  $l$  earlier? (check.)If 'YES' Transfer ' $l$ ' to the other machine.Equivalent to checking if  $J$  machine that finishes its currently assigned job earlier than  $c_l - p_l$ .

Repeat till last job to complete cannot be transferred.

Analysis :-Lower Bound on optimal  $C^*$ 

$$\boxed{C^* \geq \max_{j=1 \dots n} p_j}$$

Also let  $P = \sum_{j=1}^n p_j$ .Total  $m$  machinesOn average  $\frac{P}{m}$  units of work on 1 machine  $\Rightarrow \exists$  a machine with at least  $\frac{P}{m}$  work.

$$\Rightarrow \boxed{C^* \geq \frac{n}{m} p_j / m}$$

Let  $l$  be a job that completes last in final schedule $\Rightarrow c_l$  is value of soln $s_l = c_l - p_l$  is start time of  $l$ so every machine (other than on which  $l$  was processed) busy from time 0 to  $s_l$  $S_l \leq \sum_{j \neq l} p_j / m$ Also  $s_l \leq c_l \leq C^*$  $\Rightarrow \text{Makespan} \leq 2C^*$ 

Does it converge fast enough?? Poly Time??

 $\rightarrow C_{\max}$  for sequence of schedules produced never increases(If remain same  $\Rightarrow$  no. of machines achieving the value decreases) $\rightarrow$  Transfer a job to machine currently finishing earliestLet  $C_{\min}$  = completion time of machine that completes all its processing earliest $\rightarrow C_{\min}$  never decreases

Claim :- We never transfer a job twice

 $\rightarrow$  Suppose notsay job  $j$  is transferred $j \rightarrow i' \rightarrow i^*$ When  $j$  is transferred from  $i'$  starts at  $C_{\min}$  for current scheduleSimilarly, for  $i' \rightarrow i^*$ , it starts at  $C'_{\min}$ No change of machine  $i'$  between moves of  $j$  $\Rightarrow C'_{\min} < C_{\min}$  (if transfer is better move)

Contradicts]

 $\rightarrow$  Alg. terminates in  $m$  iterationsImproved analysis :-

$$S_l \leq \sum_{j \neq l} p_j / m$$

Total length of schedule

$$\leq p_l + \sum_{j \neq l} p_j / m$$

$$= \left(1 - \frac{1}{m}\right) p_l + \sum_{j=1}^n p_j / m \leq C^*$$

$$\leq \left(1 - \frac{1}{m}\right) C^*$$

$$\therefore \boxed{C^* \leq \left(2 - \frac{1}{m}\right) C^*}$$

Therefore from previous L.B. and

$$S_l \leq C^*$$

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