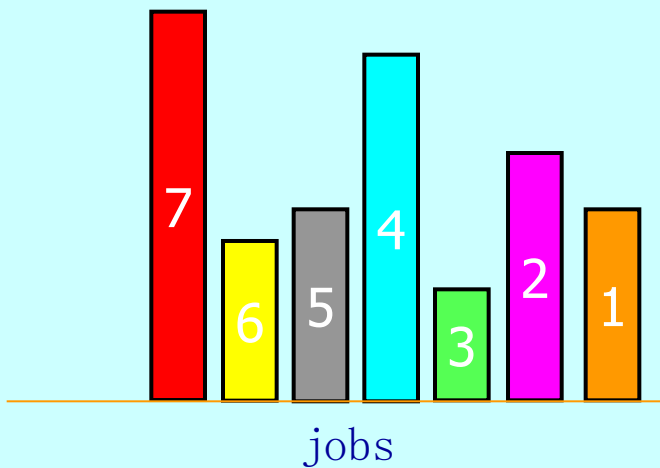


# List Scheduling

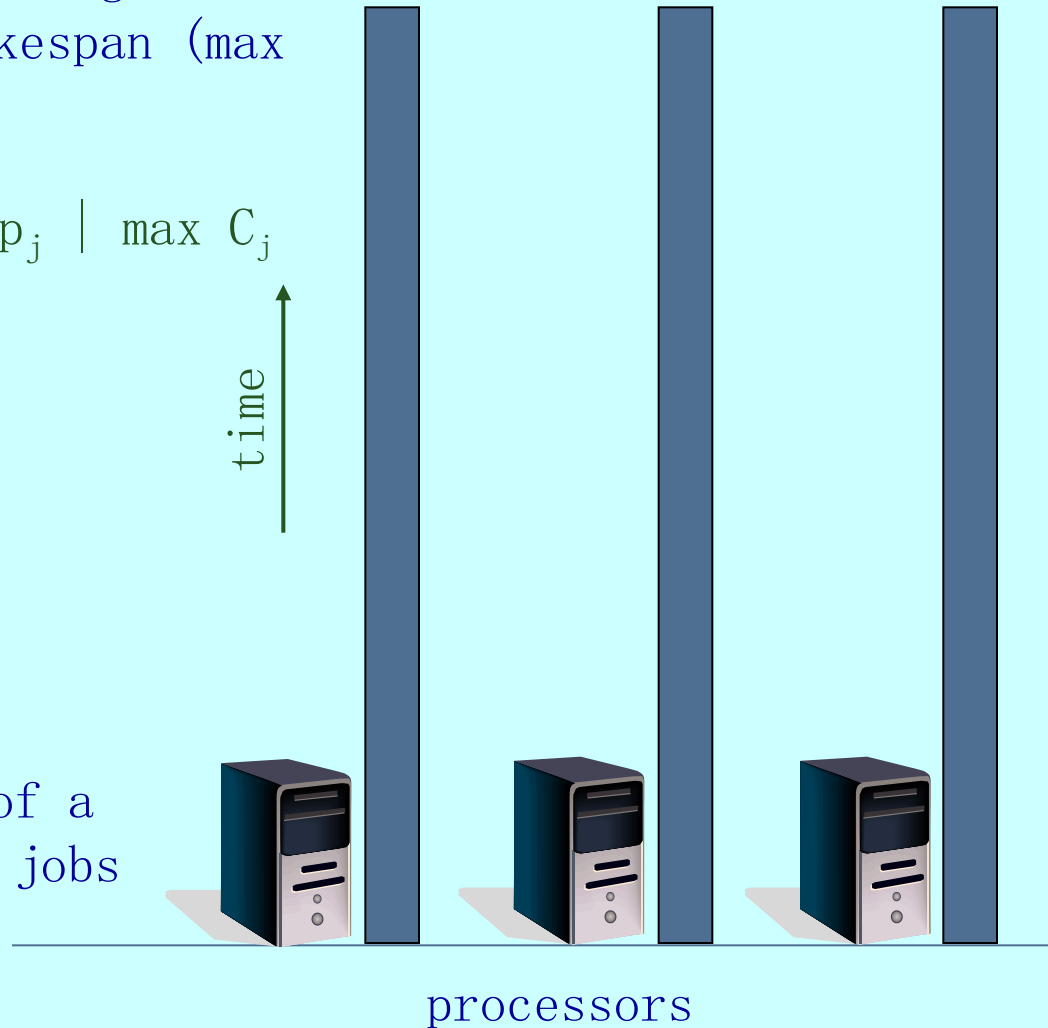
Given a list of jobs (each with a specified processing time), assign them to processors to minimize makespan (max load)

In Graham's notation:  $P_m \mid p_j \mid \max C_j$

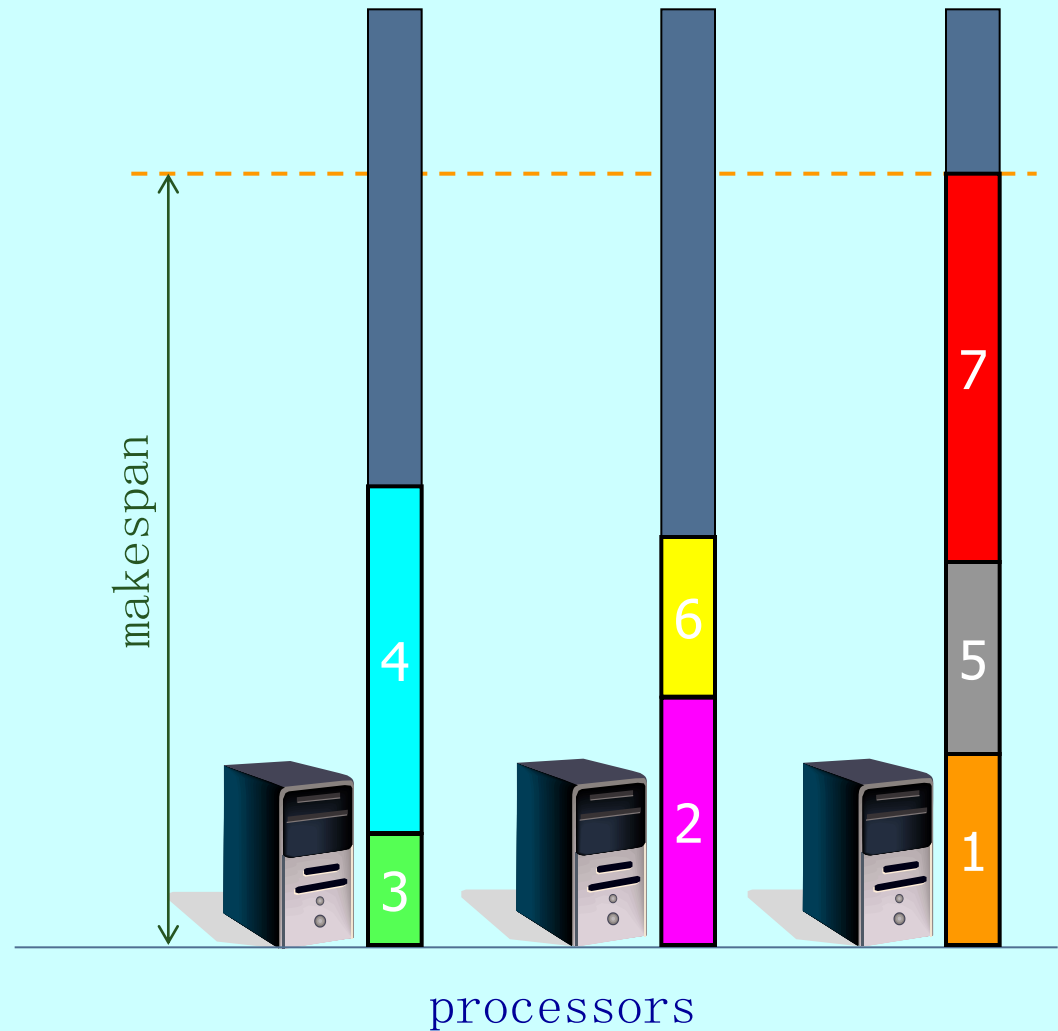
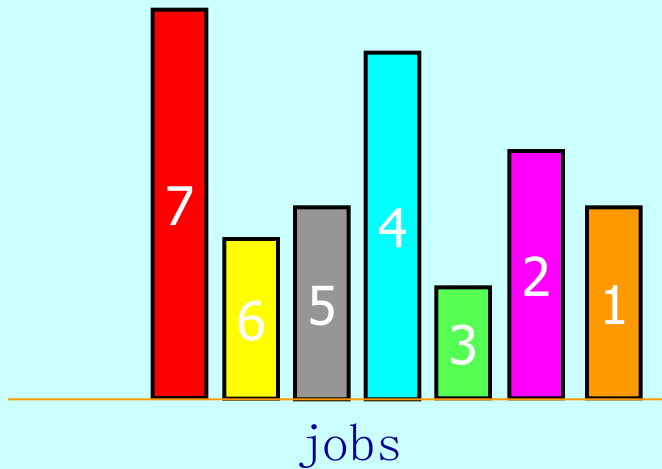


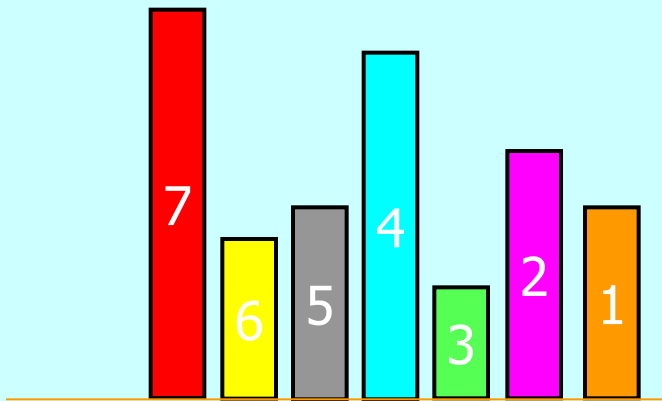
Online algorithm: assignment of a job does not depend on future jobs

Goal: small competitive ratio



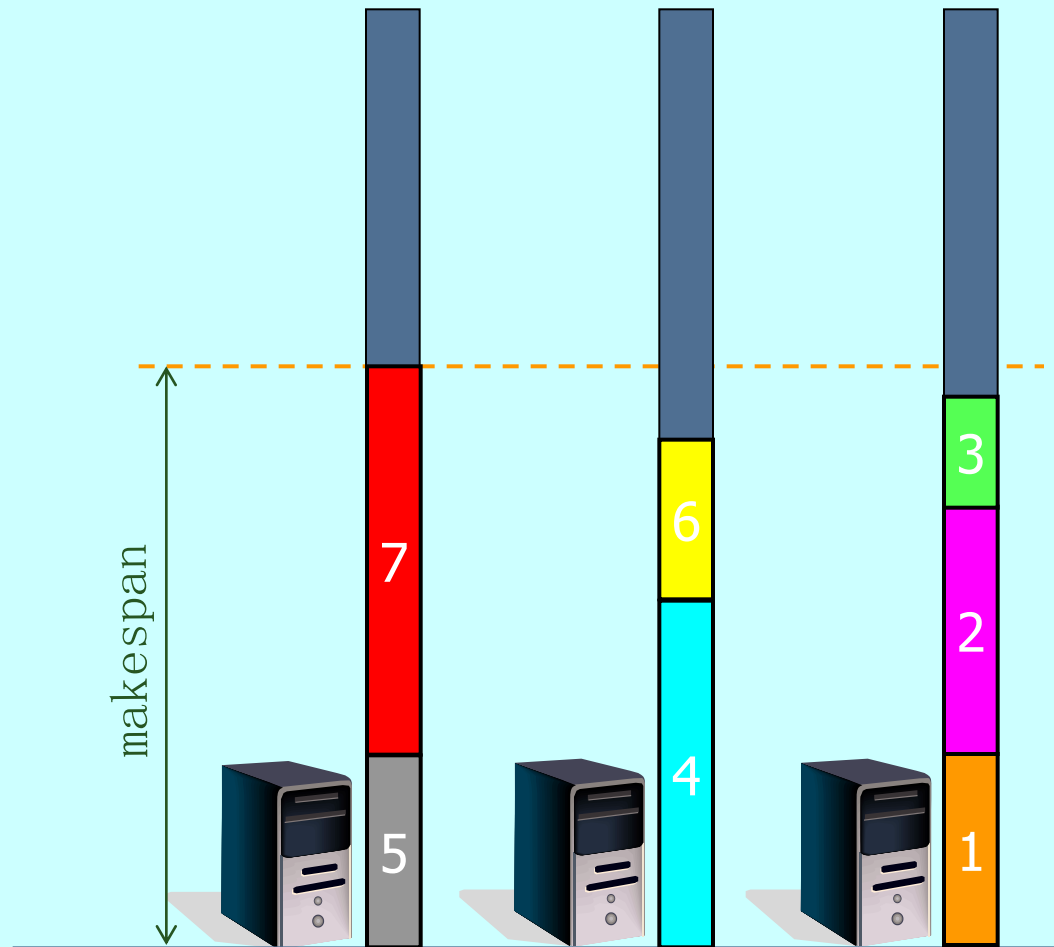
Greedy: Assign each job to the machine with the lightest load





jobs

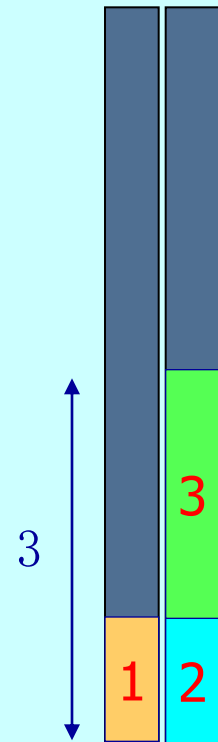
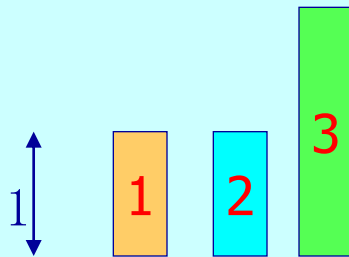
better schedule:



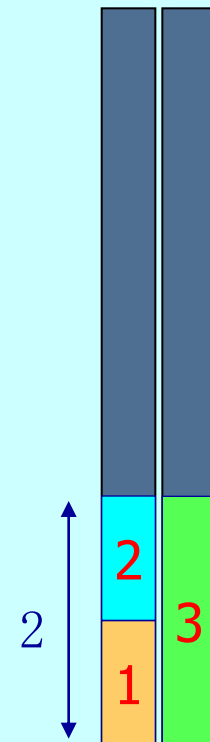
processors

How bad is Greedy?

Try  $k = 2$  first ...



Greedy

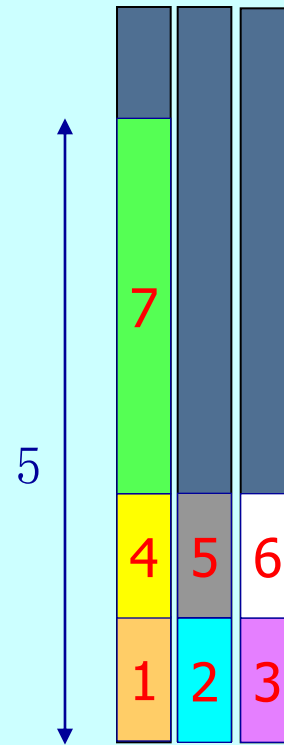
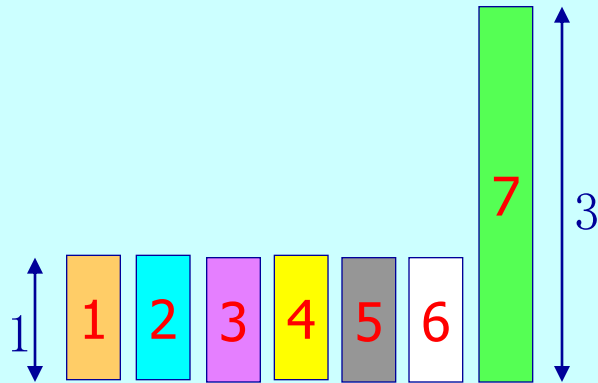


optimal

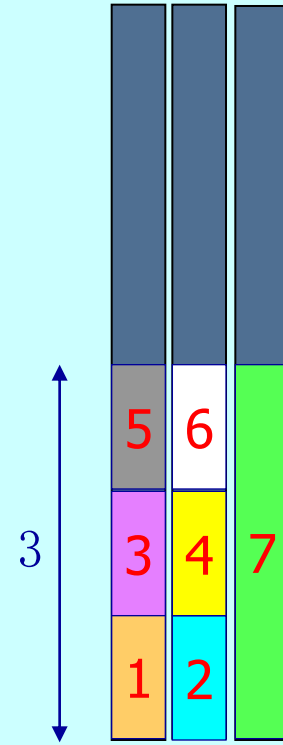
So for  $k = 2$  Greedy's competitive ratio is  $\geq 3/2$

How bad is Greedy?

Try  $k = 3$  now ...



Greedy



optimal

So for  $m = 3$  Greedy's competitive ratio is  $\geq 5/3$

**Exercise:** Show that for  $m$  machines Greedy's competitive ratio is  $\geq 2 - 1/m$

How good is Greedy?

Hint:  
 $\text{load} \geq m \cdot x + y$

Rough analysis:

$x$  = min load before placing last job

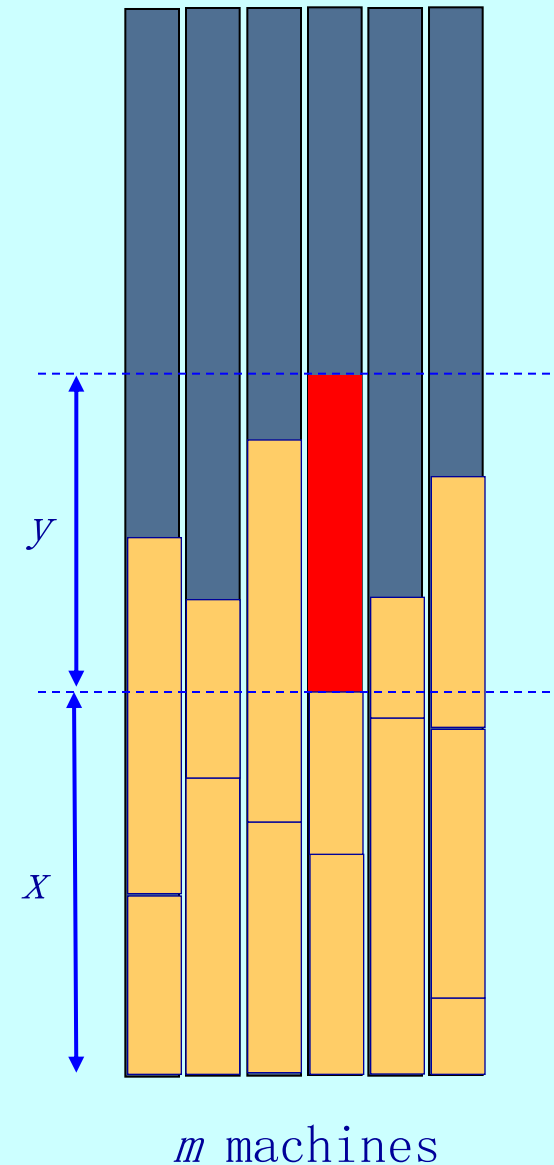
$y$  = length of last job

- total load  $\geq m \cdot x$ , so optimum makespan  $\geq x$
- optimum makespan  $\geq y$
- so

$$\begin{aligned} \text{greedy's makespan} &= x + y \\ &\leq 2 \cdot \max(x, y) \\ &\leq 2 \cdot \text{optimum} \end{aligned}$$

makespan

Exercise: Improve the bound to  $2 - 1/m$ .



## How good is Greedy?

- total load  $\geq m \cdot x + y$ ,  
so optimum makespan  $\geq x + y/m$
- optimum makespan  $\geq y$

Find smallest  $R$  such that

$$x + y \leq R \cdot \max(y, x + y/m)$$

We can assume  $x + y = 1$  and  $x, y \geq 0$

Then

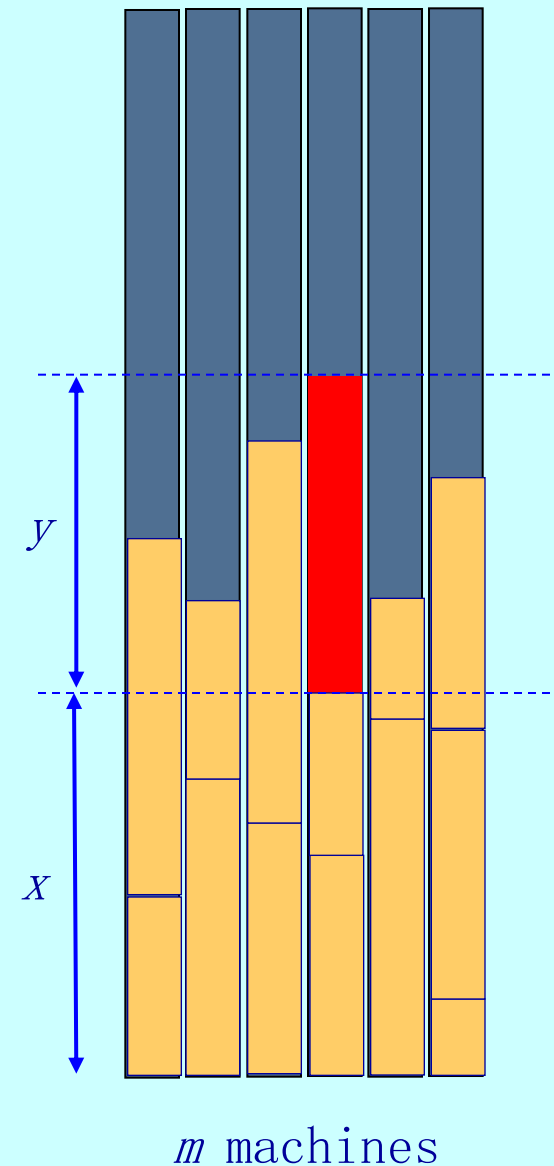
$$R = \max_y 1/\max(y, 1 - y + y/m)$$

Equalizing,  $y = 1 - y + y/m$ , we get

$$y = m/(2m-1)$$

Substituting into  $R$ , we get:

**Theorem:** Greedy is  $(2 - 1/m)$ -competitive.



# List Scheduling

- Greedy is  $(2-1/m)$ -competitive [Graham '66]
- Lower bound  $\approx 1.88$   
[Rudin III, Chandrasekaran'03]
- Best known ratio  $\approx 1.92$   
[Albers '99] [Fleischer, Wahl '00]
- Lots of work on randomized algorithms,  
preemptive scheduling, ...