



# Algorithm Theory

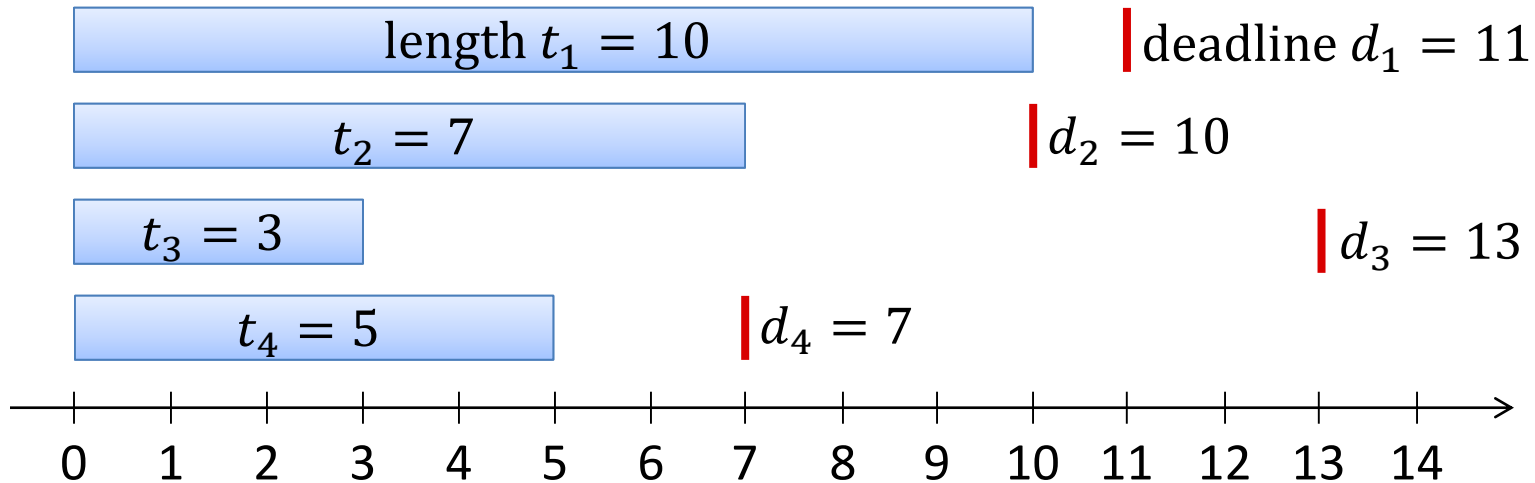
## Chapter 2 Greedy Algorithms

### Part III: Exchange Arguments

Fabian Kuhn

# Back to Scheduling

- Given:  $n$  requests / jobs with deadlines:

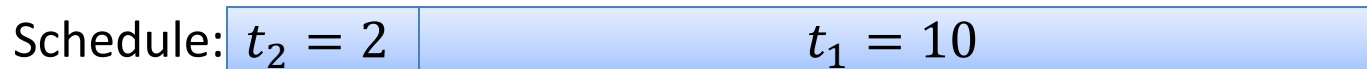
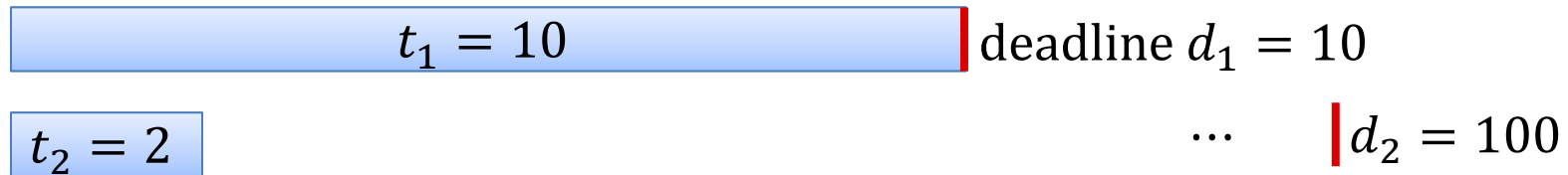


- Goal: schedule all jobs with minimum lateness  $L$ 
  - Schedule:  $s(i), f(i)$ : start and finishing times of request  $i$   
Note:  $f(i) = s(i) + t_i$
  - Lateness  $L_i$  of request  $i$ :  $L_i := \max\{0, f(i) - d_i\}$
- Lateness  $L := \max\left\{0, \max_i\{f(i) - d_i\}\right\} = \max_i L_i$ 
  - largest amount of time by which some job finishes late
- Many other natural objective functions possible...

# Greedy Algorithm?

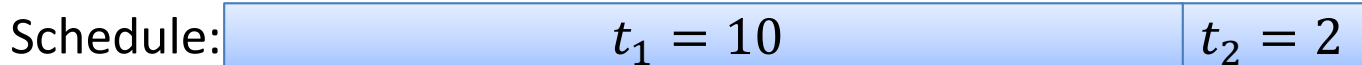
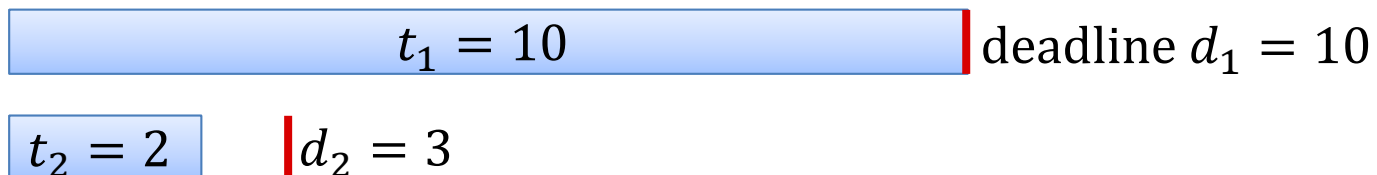
## Schedule jobs in order of increasing length?

- Ignores deadlines: seems too simplistic...
- E.g.:



## Schedule by increasing slack time?

- Should be concerned about slack time:  $d_i - t_i$



# Greedy Algorithm

## Schedule by earliest deadline?

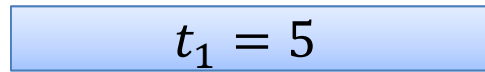
- Schedule in increasing order of  $d_i$
- Ignores lengths of jobs: too simplistic?
- Earliest deadline is optimal!

## Algorithm:

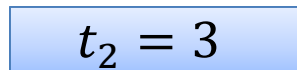
- Assume jobs are reordered such that  $d_1 \leq d_2 \leq \dots \leq d_n$
  - Start/finishing times:
    - First job starts at time  $s(1) = 0$
    - Duration of job  $i$  is  $t_i$ :  $f(i) = s(i) + t_i$
    - No gaps between jobs:  $s(i + 1) = f(i)$
- (idle time: gaps in a schedule  $\rightarrow$  alg. gives schedule with no idle time)

# Example

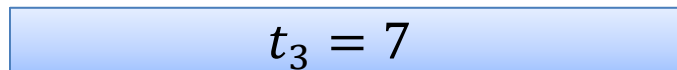
**Jobs ordered by deadline:**



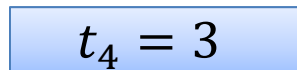
$d_1 = 7$



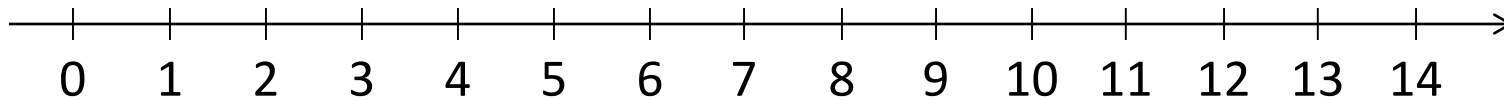
$d_2 = 10$



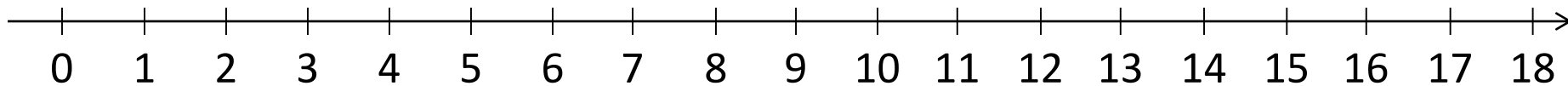
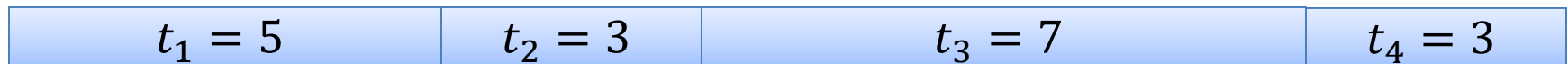
$d_3 = 11$



$d_4 = 13$



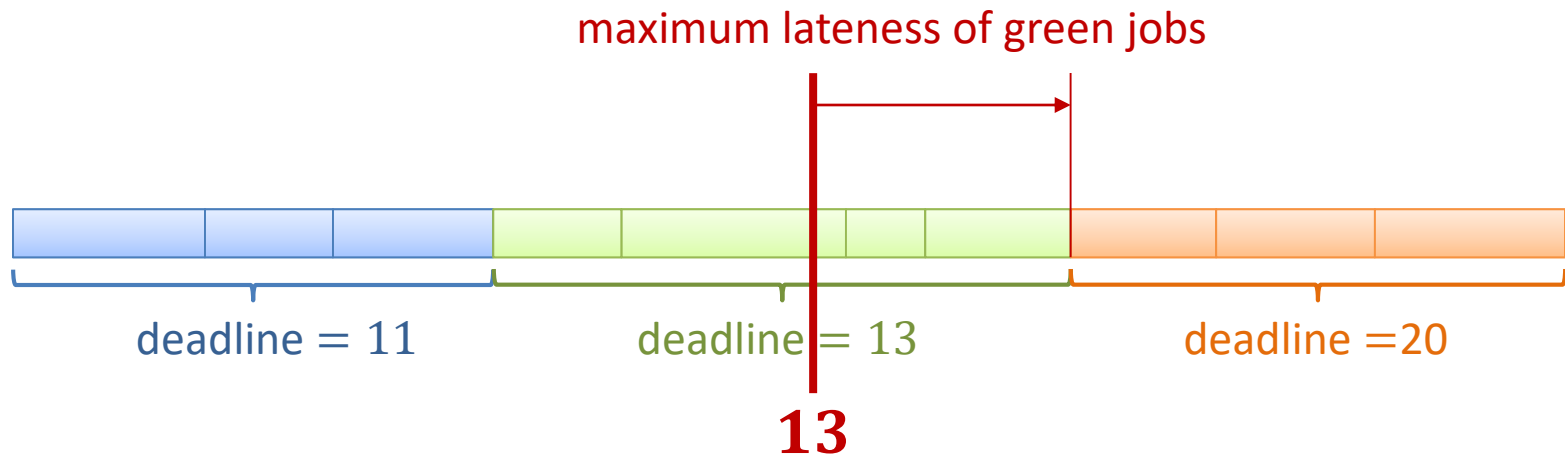
**Schedule:**



**Lateness:** job 1: 0, job 2: 0, job 3: 4, **job 4: 5**

# Basic Facts

1. There is an optimal schedule with no idle time
  - Can just schedule jobs earlier...
  
2. Inversion: Job  $i$  scheduled before job  $j$  if  $d_i > d_j$   
 Schedules with no inversions have the same maximum lateness



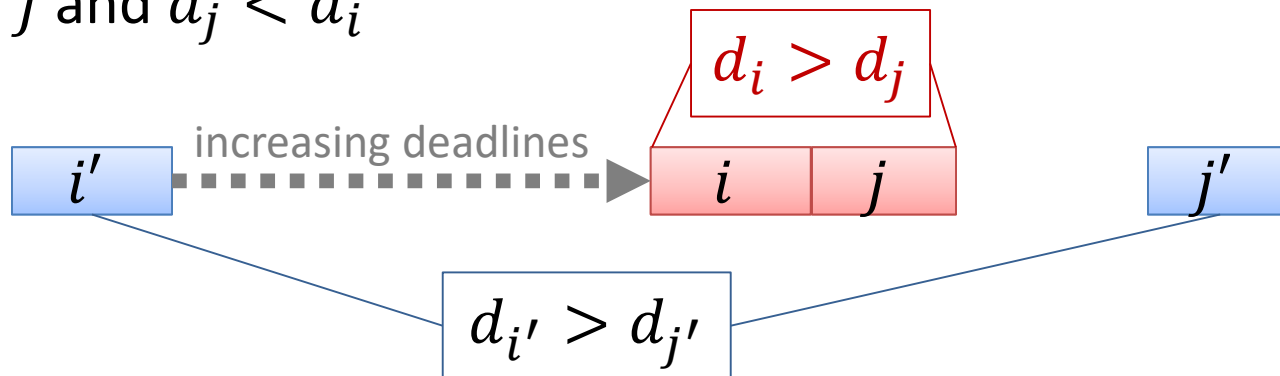
# Earliest Deadline is Optimal

## Theorem:

There is an optimal schedule  $\mathcal{O}$  with no inversions and no idle time.

## Proof:

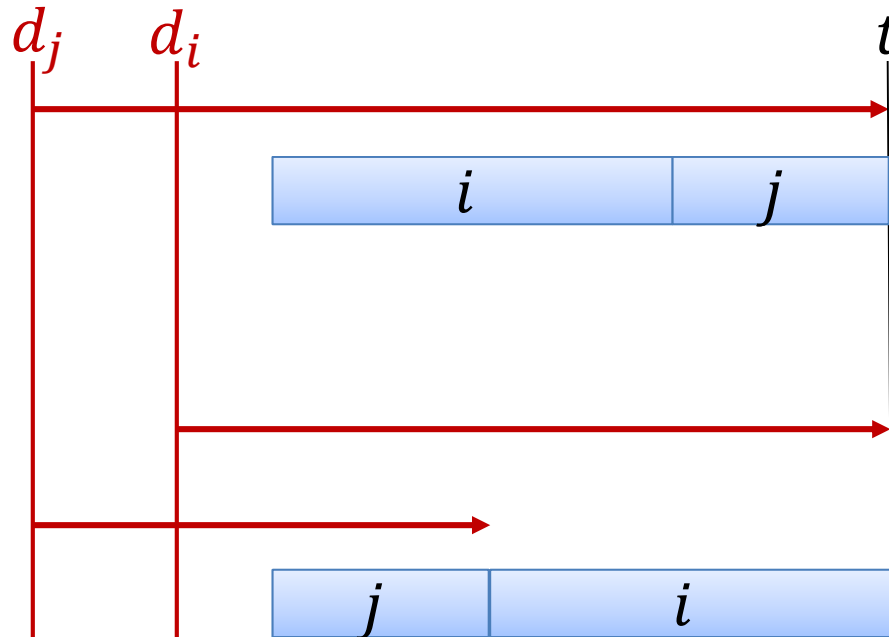
- Consider some schedule  $\mathcal{O}'$  with no idle time
- If  $\mathcal{O}'$  has inversions,  $\exists$  pair  $(i, j)$ , s.t.  $i$  is scheduled immediately before  $j$  and  $d_j < d_i$



- Claim: Swapping  $i$  and  $j$  gives a schedule with
  1. Fewer inversions
  2. Maximum lateness no larger than in  $\mathcal{O}'$

# Earliest Deadline is Optimal

**Claim:** Swapping  $i$  and  $j$ : maximum lateness no larger than in  $\mathcal{O}'$



$$\text{Lateness } L_j = \max\{0, t - d_j\}$$

**Max. lateness after swap:**

$$L'_i = \max\{0, t - d_i\} \leq L_j$$

$$L'_j = \max\{0, L_j - t_i\} \leq L_j$$



# Exchange Argument

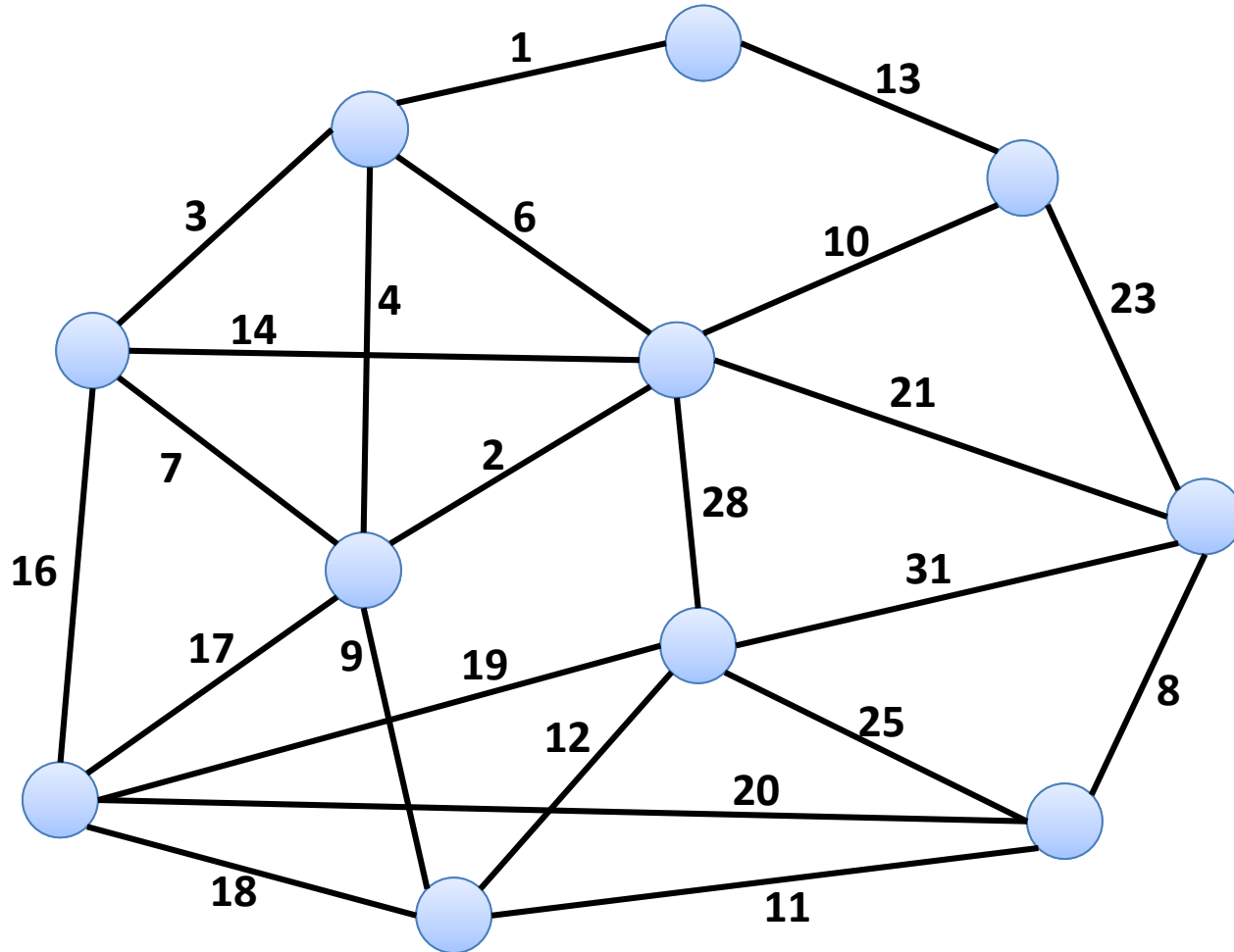
- General approach that often works to analyze greedy algorithms
- Start with any solution
- Define basic exchange step that allows to transform solution into a new solution that is not worse
- Show that exchange step move solution closer to the solution produced by the greedy algorithm
- Number of exchange steps to reach greedy solution should be finite...

# Another Exchange Argument Example



- **Minimum spanning tree (MST)** problem
  - Classic graph-theoretic optimization problem
- **Given:** weighted graph
- **Goal:** spanning tree with min. total weight
- Several greedy algorithms work
- Kruskal's algorithm:
  - Start with empty edge set
  - As long as we do not have a spanning tree:  
**add minimum weight edge that doesn't close a cycle**

# Kruskal Algorithm: Example



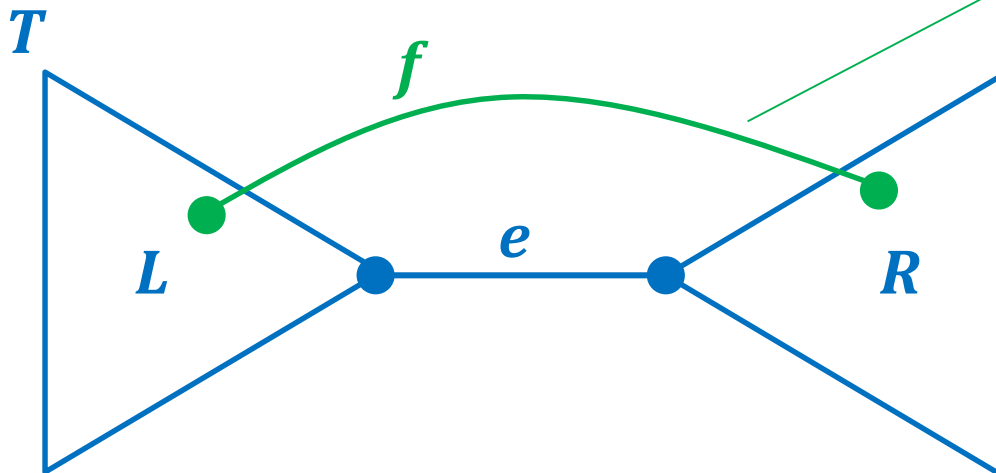
# Kruskal is Optimal

- Basic exchange step: swap two edges to get from tree  $T$  to tree  $T_K$ 
  - Swap out edge not in Kruskal tree  $T_K$ , swap in edge in Kruskal tree  $T_K$
  - Swapping does not increase total weight
- For simplicity, assume, weights are unique

$T$  : any spanning tree

$T_K$ : Kruskal tree

Assume that  $T \neq T_K \Rightarrow \exists e \in T \setminus T_K$



$f$  is the lightest edge connecting  $L$  and  $R$

$\Rightarrow f \in T_K \setminus T$

$\Rightarrow w(f) < w(e)$

$T' := T \setminus \{e\} \cup \{f\}$  is a spanning tree of smaller total weight than  $T$ .