

Dijkstra's Algorithm ooo o	Interval Scheduling o oooooooo oo	Minimum Spanning Trees o ooo ooo	Scheduling with Deadlines oo ooo ooo o	Text Compression o oooo o
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- ▶ Turn in homework to front of classroom.
- ▶ Be sure your name is on your homework.
- ▶ Be sure to *staple* if you have multiple pages.
  - ▶ A paper clip is not a staple.
  - ▶ A fold is not a staple.

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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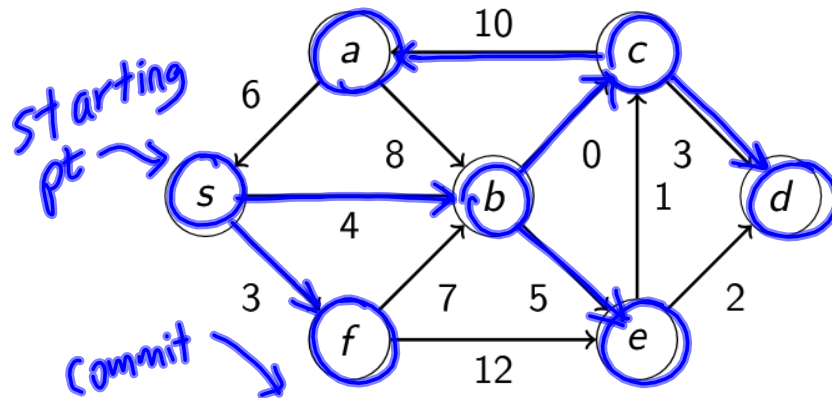
Scheduling with Deadlines

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Text Compression

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Dijkstra's Algorithm



v	intree(v)	parent(v)	dist(v)
s	<del>X</del> T	N/A	0
a	<del>X</del> T	c	<del>14</del>
b	<del>X</del> T	s	<del>4</del>
c	<del>X</del> T	b	<del>4</del>
d	<del>X</del> T	c	<del>7</del>
e	<del>X</del> T	<del>b</del>	<del>9</del>
f	<del>X</del> T	s	<del>3</del>

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Navigation icons: back, forward, search, etc.

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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Text Compression

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Dijkstra's Algorithm

But why is it right?

Dijkstra's Algorithm    Interval Scheduling    Minimum Spanning Trees    Scheduling with Deadlines    Text Compression

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Dijkstra's Algorithm

Running time?

$n = |V|$   
 $m = |E|$

with binary heap  
(better possible w)  
fib. heap)

for each vertex  $v$  do  
  intree( $v$ ) = false  
  parent( $v$ ) = N/A  
  dist( $v$ ) =  $\infty$   
  dist( $s$ ) = 0 }  $O(n)$

while  $\exists$  vertex  $u$  with intree( $u$ ) = false do  
   $u \leftarrow$  vertex with intree( $u$ ) = false and smallest dist( $u$ )  
  intree( $u$ ) = true

Once per edge  
total  $O(\log n)$

for each vertex  $v \in \text{adj}[u]$  do

if  $d(v) > d(u) + w(u, v)$  then  
   $d(v) = d(u) + w(u, v)$   
  parent( $v$ ) =  $u$

$O(m \log n)$   
total

// add to heap  
or  
update

key:  $d(v)$   
value:  $v$   
 $O(\log n)$

$O(\log n)$   
remove top of heap until removed elt not in free

Total:  $O((mn) \log n)$

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Dijkstra's Algorithm	Interval Scheduling	Minimum Spanning Trees	Scheduling with Deadlines	Text Compression
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Heaps				

$i$	1	2	3	4	5	6	7	8	9	10
$H_i$	C	<del>H</del>	E	M	<del>X</del>	S	T	R	Y	<del>D</del>



Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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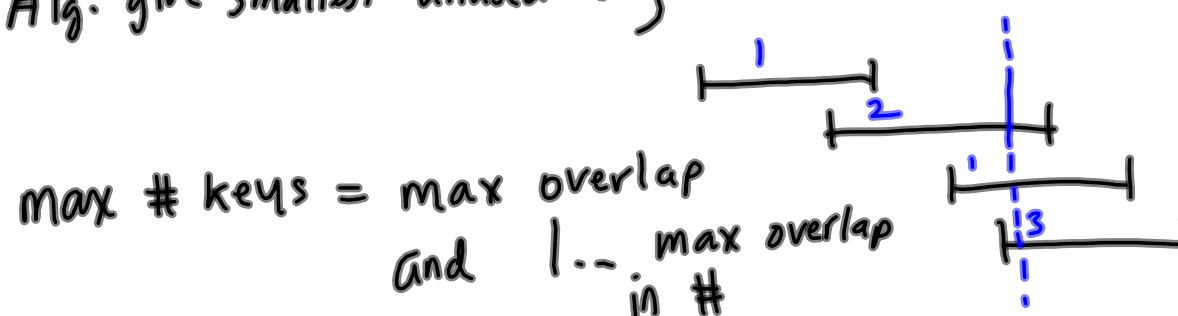
Text Compression

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Interval Coloring

## In-Class Exercise

Alg: give smallest unused key on arrival



No alg could use fewer on any input.

valid: no overlap w/ same room #

optimal/correct: no <sup>valid</sup>alt is better on # rooms

$B = \emptyset$      $next = 1$   
 Create  $2n$  "events":  
     -  $n$  arrival of group  $i$   
     -  $n$  departure of group  $i$   
 add all to a heap.  $H$   $O(n \log n)$   
 $O(n \log n)$  { while  $H \neq \emptyset$   
      $O(\log n)$  {  $e \leftarrow$  take event from  $H$   
          $O(1)$  { if  $e$  departure  
             add  $e$ 's room # to  $B$   
         else if  $B \neq \emptyset$ , group gets arbit. # from  $B$   
         else group gets room # next.  
              $next++$

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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Text Compression

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Unweighted Interval Scheduling

## Possible Algorithm 1: First Starting Class



alg: 1 interval  
OPT: 4 intervals



Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

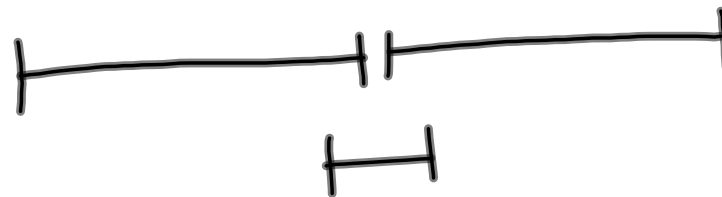
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Text Compression

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Unweighted Interval Scheduling

## Possible Algorithm 2: Shortest Class



alg: 1  
OPT: 2



Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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Text Compression

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Unweighted Interval Scheduling

## Possible Algorithm 4: First Ending Class

Proof Strategy:

- Some optimal uses same 1<sup>st</sup>
- any OPT can be described:
- take 1<sup>st</sup> decision of any optimal
  - remove it and any overlap
  - recurse w/ some optimal

Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○●○○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○○ ○○○ ○○○ ○	Text Compression ○ ○○○○ ○
Unweighted Interval Scheduling				

## Proving Correctness

**Claim:** There is an optimal solution that includes the first interval that we choose.

Note that I am not claiming that all optimal solutions do.

Let  $X$  be an optimal sol'n that doesn't include our 1<sup>st</sup> interval.

$$X' = X - X's \text{ first interval} + \text{our 1}^{\text{st}} \text{ interval.}$$

is  $X'$  even valid? Nothing in  $X \cap X'$  overlaps.

does  $X'$  overlap our 1<sup>st</sup>?  
our 1<sup>st</sup> ends  $\leq$   $X$ 's first ends  
so no overlap b/c all others start after  $X$ 's first ends

$X$  pre change:  
H  
our 1<sup>st</sup> ...

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$|X| = |X'|$ , so  $X'$  optimal size and valid

Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○●○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○○ ○○○ ○○○ ○	Text Compression ○ ○○○○ ○
Unweighted Interval Scheduling				

Would any optimal solution that includes our first interval also include any intervals that overlap with it?

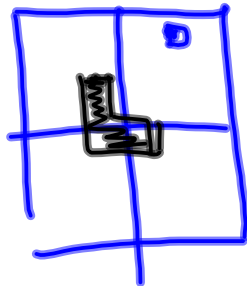
Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○● ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○○ ○○○ ○○○ ○	Text Compression ○ ○○○○ ○
Unweighted Interval Scheduling				

What is left to do to prove that the rest of our algorithm is correct?

Induction as a recursive proof

Prove: any  $2^n \times 2^n$  checkerboard w/ one square removed can be tiled w/  $\begin{bmatrix} \text{L} \\ \text{I} \end{bmatrix}$  pieces

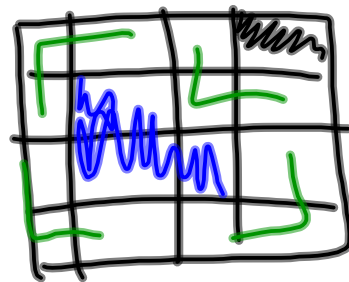
alg:  $n=0$ , trivial / done  
 else: divide into four quadrants,  $2^{n-1} \times 2^{n-1}$



One has a missing piece  
 wlog say top right

so call recursively  
 on top right

then place  $\begin{bmatrix} \text{L} \\ \text{I} \end{bmatrix}$  as shown  
 and call 3 recursively

$n=0:$   $n=1:$   and isomorphic $n=2$ 



Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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Text Compression

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In-Class Exercise I

Give an algorithm that will achieve this goal with the fewest possible pizza parlors placed, please.

Go to 1<sup>st</sup> house + 5 miles,  
place pizza parlor,  
remove covered houses,  
repeat

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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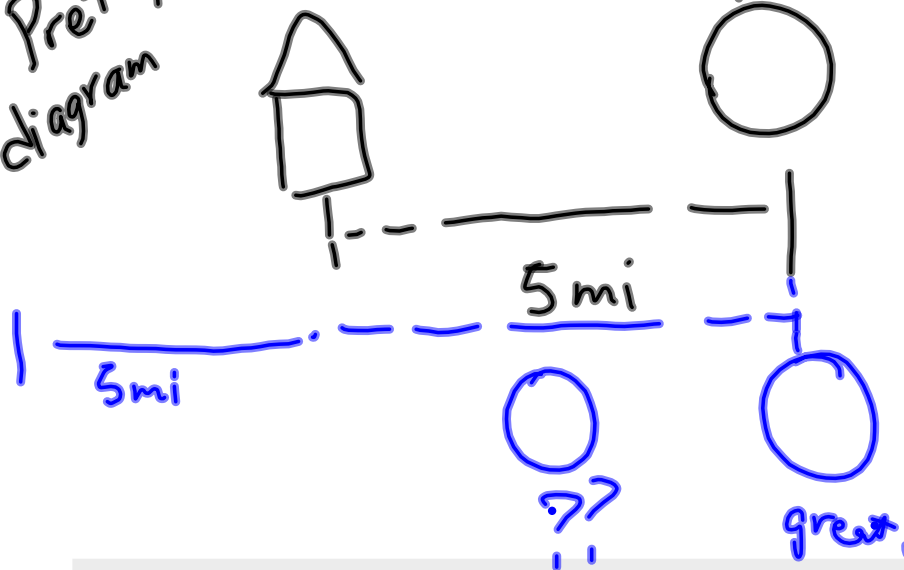
In-Class Exercise I

 $x \leftarrow$  arbitrary optimal placement

Prove that your algorithm achieves the optimal solution

Claim: Some optimal sol'n will place 1<sup>st</sup> parlor 5 mi after 1<sup>st</sup> house

Pretty diagram



X's first is no further down the road than mine (else invalid sol'n)

What if  $X$ 's first is before mine?

Let  $CX$  = houses covered by  $X$ 's first

Let  $CM$  = houses covered by  $1^{st}$  my

Subset



$$CX \subseteq CM$$

So this is a valid sol'n:

$$X' = X - X'_{1^{st}} + \text{my first}$$

$$|X'| = |X|$$

So  $X'$  same size as an optimal and valid,

So  $X'$  is an optimal

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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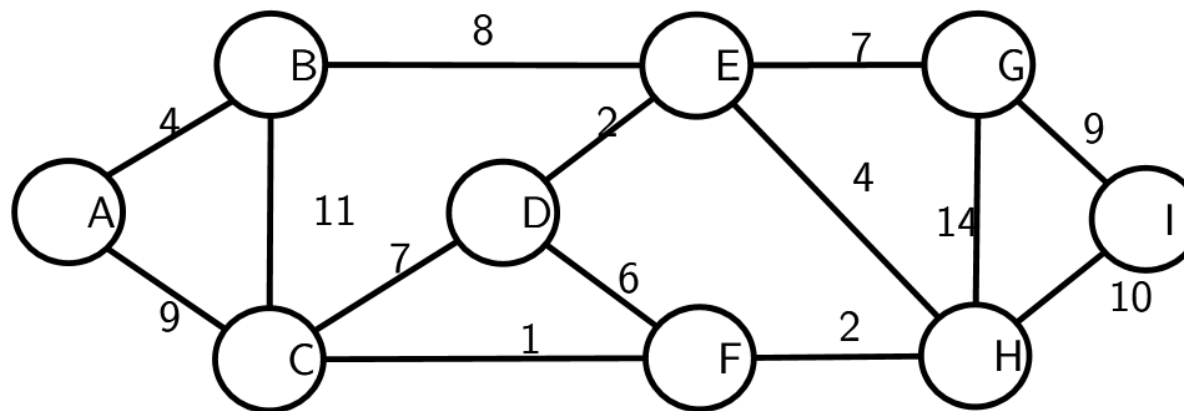
Text Compression

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Minimum Spanning Trees

## Minimum Spanning Trees

Read the problem description in your handout. Which edges would you keep for the following graph?



Navigation icons: back, forward, search, etc.

Dijkstra's Algorithm ooo o	Interval Scheduling o oooooooo oo	Minimum Spanning Trees o •oo ooo	Scheduling with Deadlines oo ooo ooo o	Text Compression o oooo o
Reverse-Delete Algorithm				

Could any valid solution contain a cycle?

Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○○ ○○	Minimum Spanning Trees ○ ○●○ ○○○	Scheduling with Deadlines ○○ ○○○ ○○○ ○	Text Compression ○ ○○○○ ○
Reverse-Delete Algorithm				

Suppose  $C$  is a cycle within  $G$ . At least one edge in  $C$  won't be in our solution. Which edge and why?

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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Text Compression

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Reverse-Delete Algorithm

## The Reverse-Delete Algorithm

```

while  $G$  contains a cycle do
  Let  $C$  be a cycle within  $G$ 
  Let  $e$  be a maximal edge within  $C$ 
  Remove  $e$  from  $G$ 
return  $G$ 
  
```

► Why is this correct?

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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Text Compression

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Cut-based Algorithm

## The Cut Property



Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Text Compression

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Cut-based Algorithm

## Modify Dijkstra's Algorithm?

```

for each vertex  $v$  do
   intree( $v$ ) = false
   parent( $v$ ) = N/A
   dist( $v$ ) =  $\infty$ 
dist( $s$ ) = 0
while  $\exists$  vertex  $u$  with intree( $u$ ) = false do
     $u \leftarrow$  vertex with intree( $u$ ) = false and smallest dist( $u$ )
   intree( $u$ ) = true
    for each vertex  $v \in \text{adj}[u]$  do
        if  $d(v) > d(u) + w(u, v)$  then
             $d(v) = d(u) + w(u, v)$ 
            parent( $v$ ) =  $u$ 

```

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

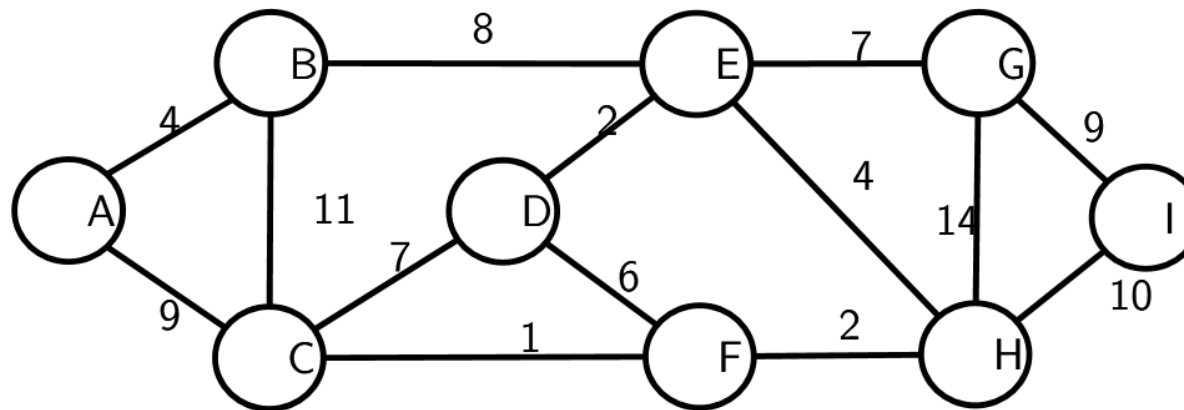
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Cut-based Algorithm

Illustrate Prim/Jarnik/Dijkstra



Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ●○ ○○○ ○○○ ○	Text Compression ○ ○○○○ ○
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Examples

## Understanding the Problem

**Example 1:** What is the optimal schedule for the following?

Time	1	2	3
Deadline	2	4	6

Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○● ○○○ ○○○ ○	Text Compression ○ ○○○○ ○
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Examples

## Understanding the Problem

**Example 2:** What is the optimal schedule for the following?

Time	1	2	3	4
Deadline	2	4	6	6

Dijkstra's Algorithm ooo o	Interval Scheduling o oooooooo oo	Minimum Spanning Trees o ooo ooo	Scheduling with Deadlines oo ●ooo ooo o	Text Compression o oooo o
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Possible Algorithms

## Possible Algorithm 1

Sort the jobs by increasing time  $t_i$ ; schedule them in that order.

Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○○ ○○●○ ○○○ ○	Text Compression ○ ○○○○ ○
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Possible Algorithms

## Possible Algorithm 2

Sort the jobs by  $d_i - t_i$  ; schedule them in that order.

Dijkstra's Algorithm

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Interval Scheduling

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Minimum Spanning Trees

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Scheduling with Deadlines

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Text Compression

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Possible Algorithms

## Possible Algorithm 3

Sort the jobs by deadline  $d_i$ ; schedule them in that order.

Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○○ ○○○ ●○○ ○	Text Compression ○ ○○○○ ○
Proof				

When deciding start times, don't leave any gaps;  $s_{i+1} = s_i + t_i$ .



Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○○ ○○○ ○●○ ○	Text Compression ○ ○○○○ ○
Proof				

Any schedule that doesn't agree with our algorithm has at least one pair of *consecutive* intervals  $i, i + 1$  that are *inverted* relative to our order.

*Note: You may take this fact as a given for the related homework problem. You do not need to prove it again.*

Dijkstra's Algorithm ○○○ ○	Interval Scheduling ○ ○○○○○○○ ○○	Minimum Spanning Trees ○ ○○○ ○○○	Scheduling with Deadlines ○○ ○○○ ○○● ○	Text Compression ○ ○○○○ ○
Proof				

Any schedule with an inversion can be modified to be more like our algorithm's output without making it worse.

Dijkstra's Algorithm ooo o	Interval Scheduling o oooooooo oo	Minimum Spanning Trees o ooo ooo	Scheduling with Deadlines oo ooo ooo •	Text Compression o oooo o
Algorithmic Pizza 2				

Dijkstra's Algorithm

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Interval Scheduling

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Compression

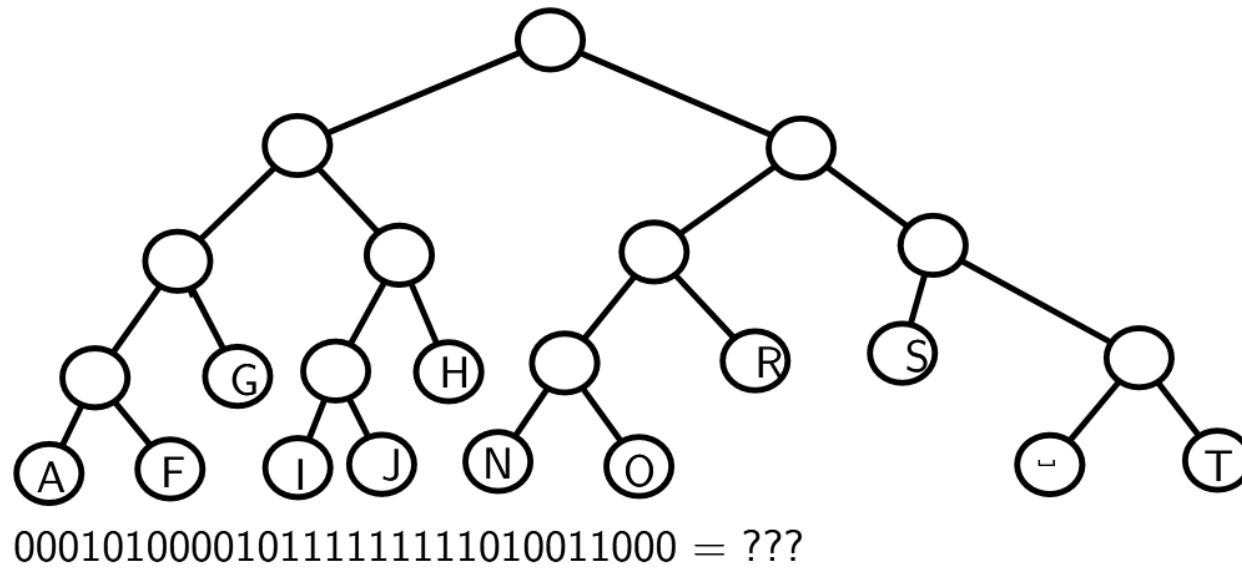
## Problems with some other encodings...

- ▶  $a = 0, b = 1, c = 00, d = 01, e = 10$ , etc
- ▶  $a = 00000, b = 00001, c = 00010, \dots, z = 11001$
- ▶  $a = 00000, b = 00001, \dots, v = 10101, w = 1100, x = 1101, y = 1110, z = 1111$

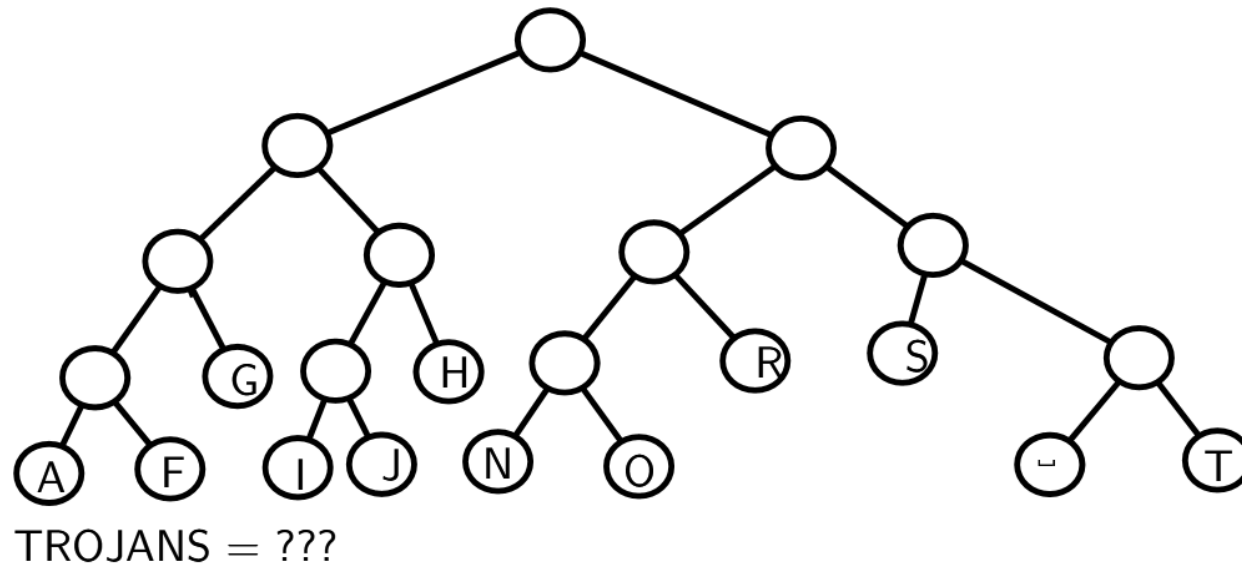
Dijkstra's Algorithm ooo o	Interval Scheduling o oooooooo oo	Minimum Spanning Trees o ooo ooo	Scheduling with Deadlines oo ooo ooo o	Text Compression o ●ooo o
Binary Tree Based Codes				






How can we use a binary tree to represent an encoding?

Dijkstra's Algorithm	Interval Scheduling	Minimum Spanning Trees	Scheduling with Deadlines	Text Compression
				
Binary Tree Based Codes				

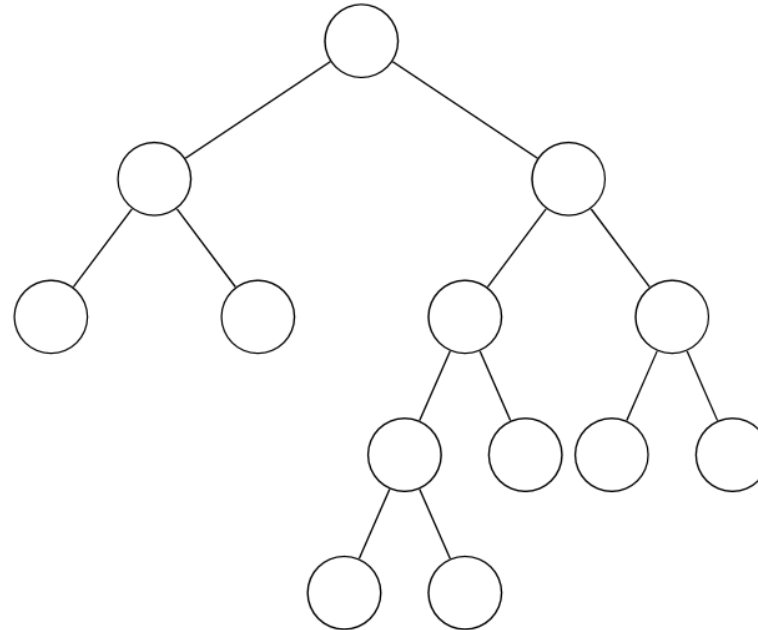


Dijkstra's Algorithm ooo o	Interval Scheduling o oooooooo oo	Minimum Spanning Trees o ooo ooo	Scheduling with Deadlines oo ooo ooo o	Text Compression o ooo o
Binary Tree Based Codes				



Dijkstra's Algorithm	Interval Scheduling	Minimum Spanning Trees	Scheduling with Deadlines	Text Compression
				
Binary Tree Based Codes				

letter $x$	frequency $f_x$
A	21%
B	18%
C	6%
D	5%
E	12%
F	23%
G	15%



Where should the letters go in order to minimize the average bit length of a compressed message?



Dijkstra's Algorithm    Interval Scheduling    Minimum Spanning Trees    Scheduling with Deadlines    Text Compression

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Huffman Codes

Optimal tree for these letters?

letter $x$	frequency $f_x$
A	21%
B	18%
C	6%
D	5%
E	12%
F	23%
G	15%

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