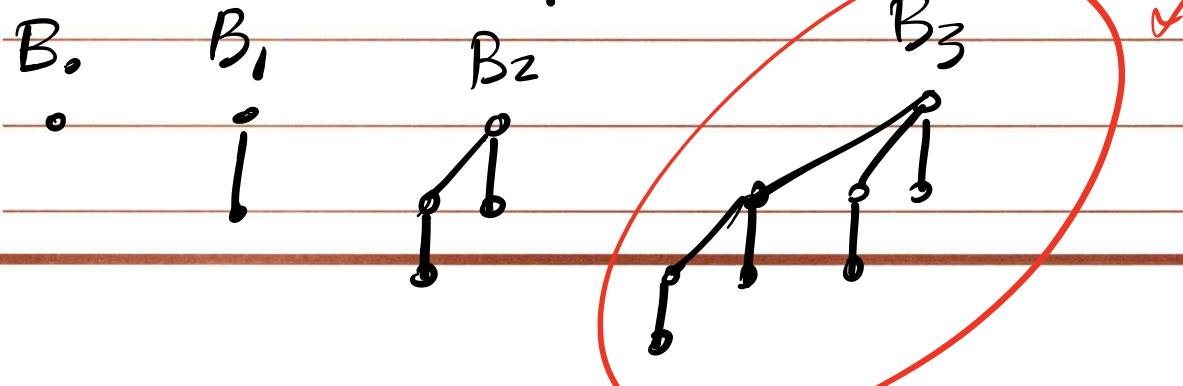


## Other Heaps

Def A binomial tree  $B_k$  is an ordered tree defined recursively:

- Binomial tree  $B_0$  consists of one node

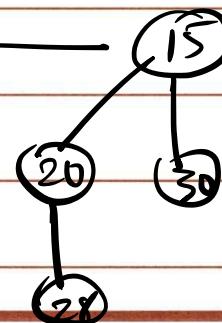
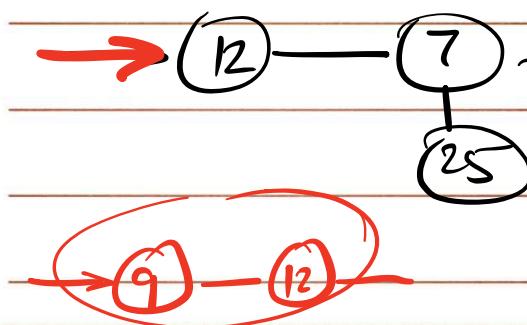
- Binomial tree  $B_k$  consists of 2 binomial trees  $B_{k-1}$ , that are linked together such that root of one is the leftmost child of the root of the other.



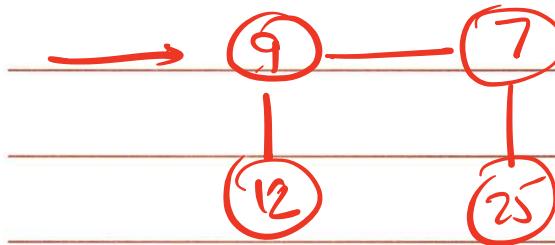
Def. A binomial heap  $H$  is a set of binomial trees that satisfies the following properties

1- Each binomial tree in  $H$  obeys the min-heap property

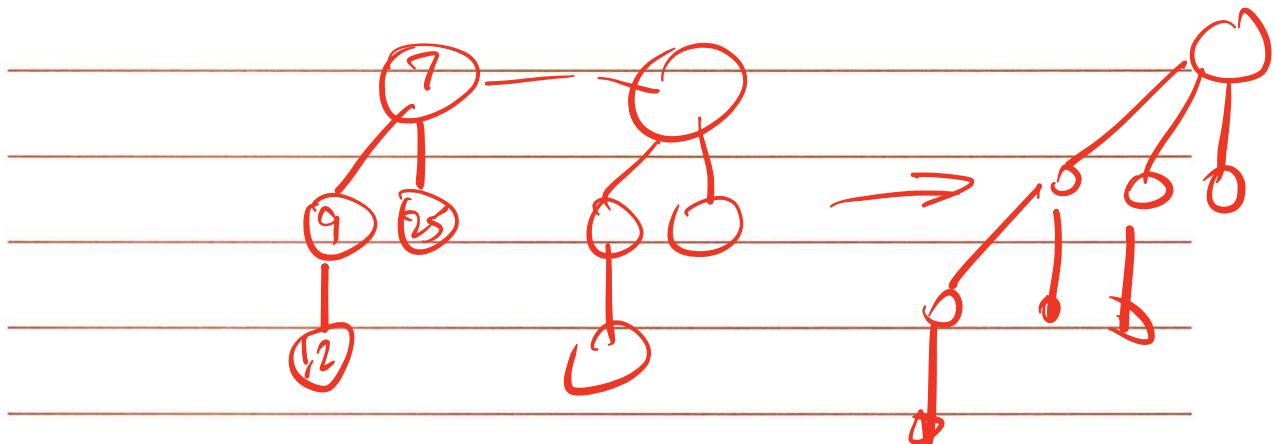
2- There is at most one binomial tree in  $H$  whose root has degree  $\leq k$ .



$B_2$        $B_1$        $B_0$



Find &  
insert tak  
 $O(k^n)$



# Amortized Cost Analysis

Ex. 1 ( for  $i = 1$  to  $n$   
push or Pop  
end for

push takes  $O(1)$   
Pop takes  $O(1)$

Our worst case run time complexity =  $O(n)$

Ex. 2 for  $i = 1$  to  $n$   
push or pop or multipop  
end for

push takes  $O(1)$  worst-case  
pop takes  $O(1)$  worst-case  
multipop takes  $O(n)$  worst-case

Our worst case run time complexity =  $O(n^2)$

## Aggregate Analysis

- We show that a sequence of  $n$  operations (for all  $n$ ) takes worst-case time  $T(n)$  total.
- So, in the worst case, the amortized cost (average cost) per operation will be  $T(n)/n$

observation: Multi-pop takes  $O(n)$  time if there are  $n$  elements pushed on the stack

A sequence of  $n$  pushes takes  $O(n)$   
multi-pop takes  $O(n)$  worst-case

$$T(n) = O(n)$$

when amortized over  $n$  operations,

$$\text{average cost of an operation} = \frac{O(n)}{n} = O(1)$$

Ex. 2    for  $i = 1$  to  $n$      $O(1)$      $O(1)$   
 $O(1)$     push or pop or multipop     $O(1)$   
              end for

push takes  $O(1)$  amortized

pop      "       $O(1)$       "  
multipop    "       $O(1)$       "

our worst case runtime complexity =  $O(n)$   
 $\Theta(n)$

## Accounting Method

- We assign different charges (amortized costs) to different operations
- If the charge for an operation exceeds its actual cost, the excess is stored as credit.
- The credit can later help pay for operations whose actual cost is higher than their amortized cost.
- Total credit at any time = total amortized cost - total actual cost
  - Credit can never be negative.

Ex. 2

for  $i = 1$  to  $n$   
 push or pop\* or multipop  
 end for

try #1

charge  
 assign a cost of 1 to each operation

<u>OP.</u>	<u>charge</u>	<u>Actual Cost</u>	<u>tot/credit</u>
push	1	1	0
push	1	1	0
multipop	1	2	-1

try #2

assign charges as follows:

Push 2  $\rightarrow O(1)$

Pop 0  $\rightarrow O(1)$

Multipop 0  $\rightarrow O(1)$

<u>OP.</u>	<u>charge</u>	<u>Actual Cost</u>	<u>tot/credit</u>
push	2	1	1
push	2	1	2
multipop	0	2	0

Ex. 2

for  $i = 0$  to  $n$

push or pop or multipop  
end for

Amortized cost

push

$O(1)$

pop

$O(1)$

multipop

$O(1)$

worst-case runtime complexity =  $O(n)$

- Fibonacci heaps are loosely based on binomial heaps.
- A Fibonacci heap is a collection of min-heaps trees similar to Binomial heaps, however, trees in a Fibonacci heap are not constrained to be binomial trees. Also, unlike binomial heaps, trees in Fibonacci heaps are not ordered.

- Link to Fibonacci heaps animations:

[www.cs.usfca.edu/ngalles/JavascriptVisual/  
FibonacciHeap.html](http://www.cs.usfca.edu/ngalles/JavascriptVisual/FibonacciHeap.html)

Merge  
Costs

## Binary Heap      Binomial Heap      Fibonacci Heap

Find-Min

$O(1)$

Insert

$O(\lg n)$

Extract-Min

"

$O(\lg n)$

"

Delete

"

"

Decrease-key

"

"

Merge

$O(n)$

$O(n)$

$O(1)$

$O(1)$

$O(\lg n)$

$O(\lg n)$

$O(1)$

$O(1)$

Construct

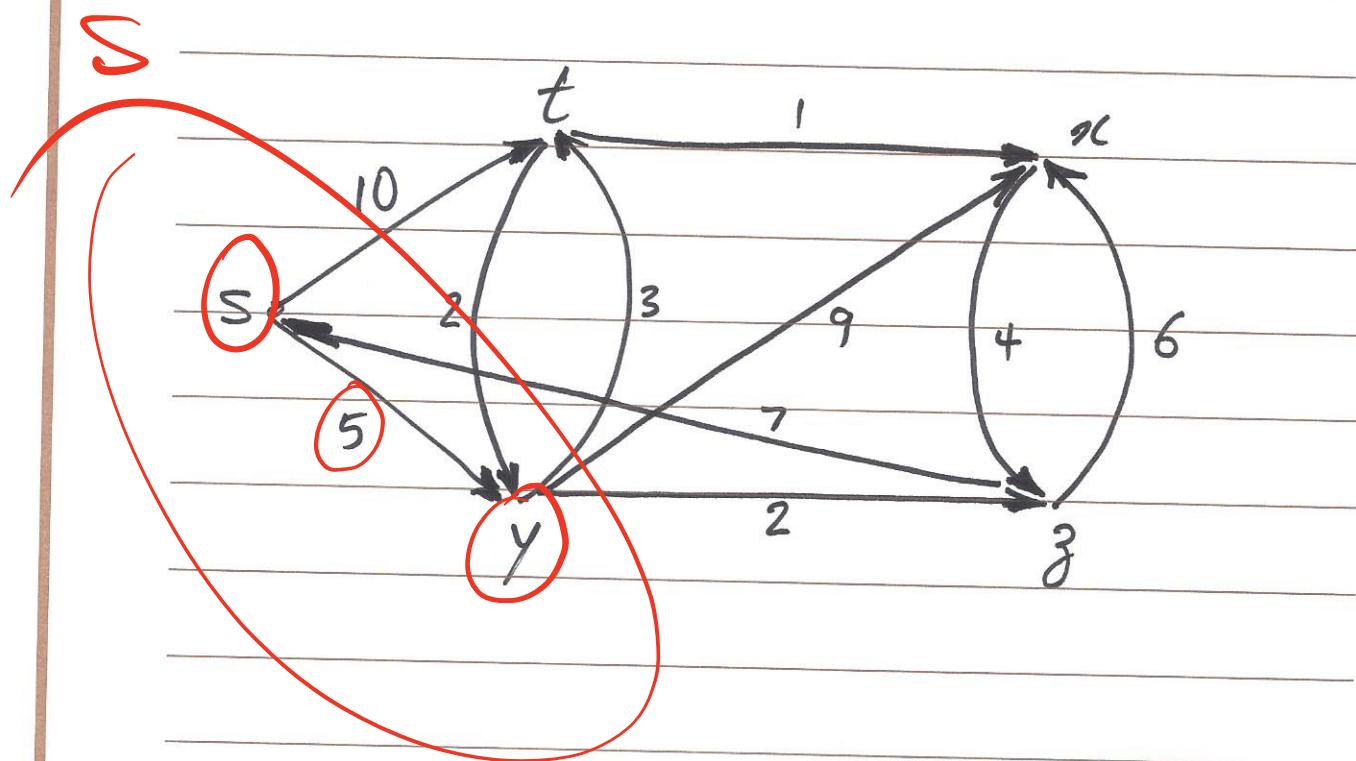
$O(n)$

$O(n)$

# Shortest Path

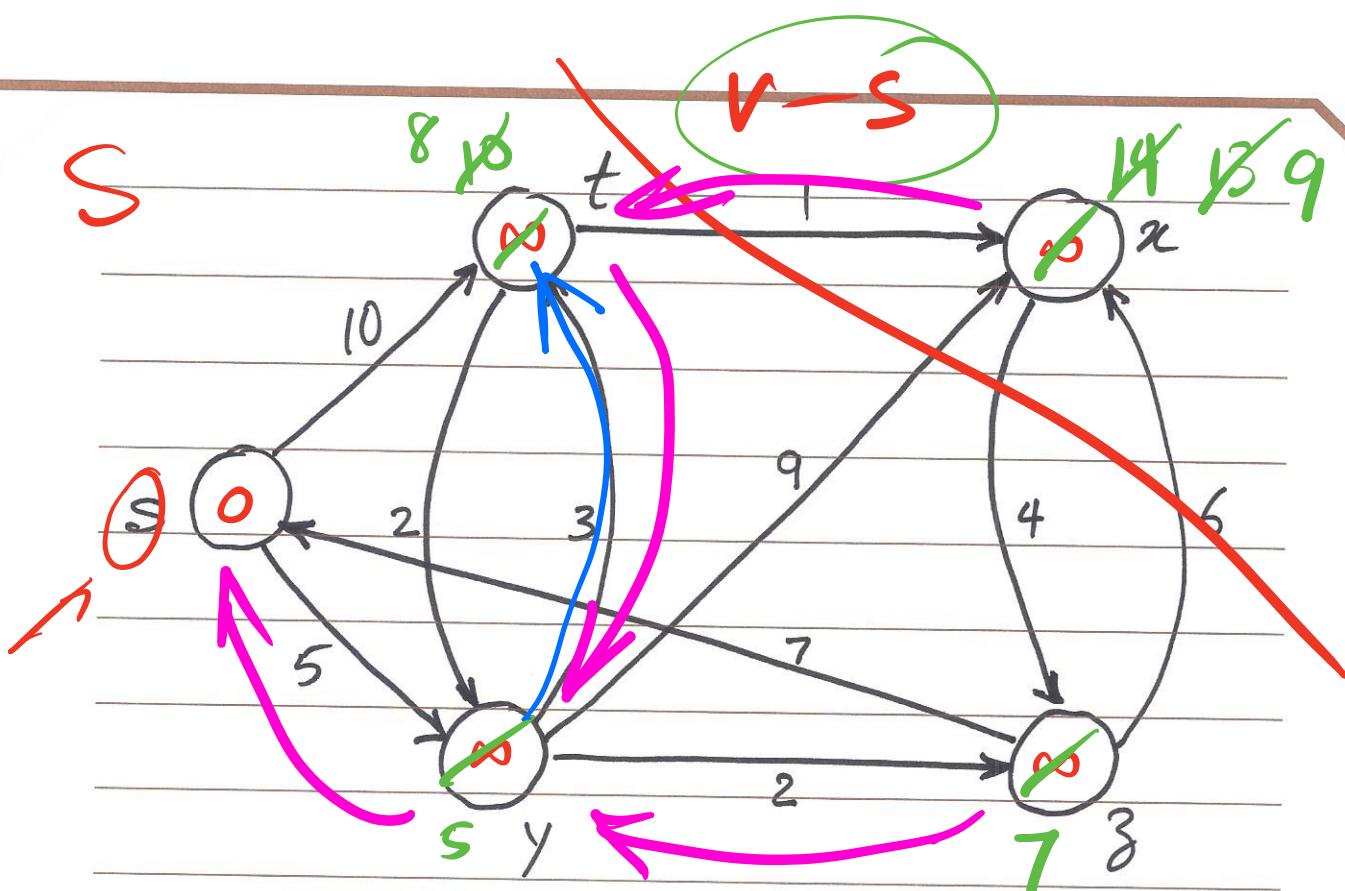
Problem Statement:

Given  $G = (V, E)$  with  $w(u, v) \geq 0$   
for each edge  $(u, v) \in E$ , find the  
shortest path from  $s \in V$  to  $t \in V$ .



## Solution

1. Start with a set  $S$  of vertices whose final shortest path we already know.
2. At each step, find a vertex  $v \in V - S$  with shortest distance from  $S$ .
3. Add  $v$  to  $S$ , and repeat.



$$S_1 = \{s\}, S_2 = \{s, y\}, S_3 = \{s, y, 8\}, S_4 = \{s, y, z, t\}$$

$$S_5 = \{s, y, z, t, x\}$$

Dijkstra's  
Alg.

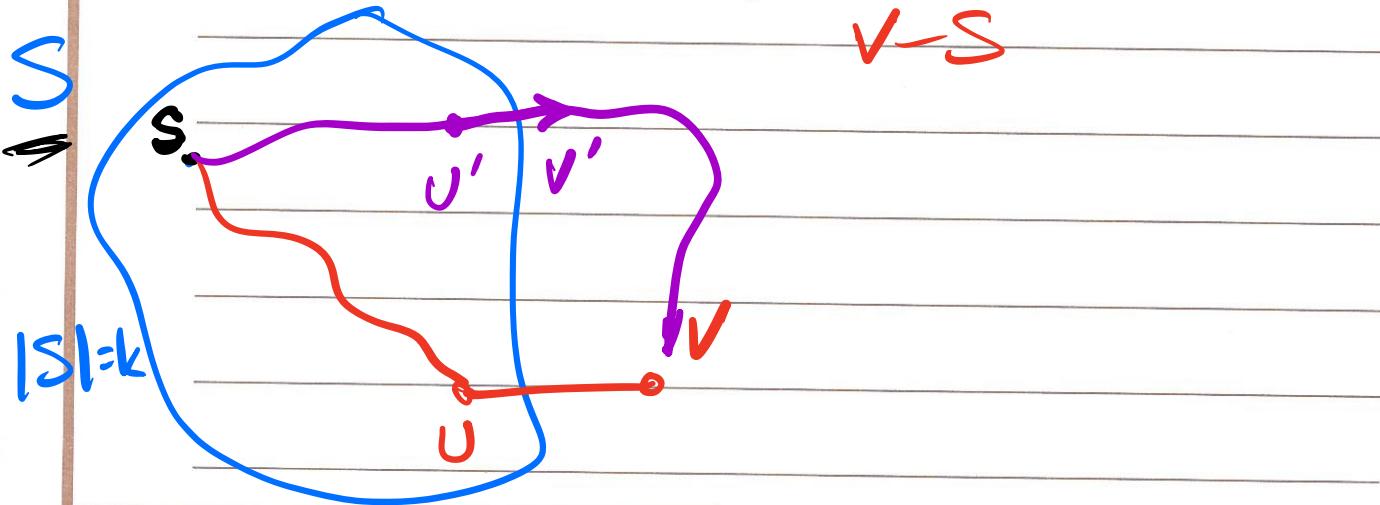
## Proof of Correctness

We will prove that at each step, Dijkstra's algorithm finds the shortest path to a new node in the graph.

Proof by mathematical induction:

Base Case:  $|S|=1$ ,  $S = \{s\}$  and  $d(s) = 0$

Inductive Step: Suppose the claim holds when  $|S|=k$  for some  $k \geq 1$ . We now grow  $S$  to size  $k+1$  and prove that we have found the shortest path to the new node.



## Implementation of Dijkstra's

Initially  $S = \{s\}$  and  $d(s) = 0$   
for all other nodes  $d(v) = \infty$

While  $S \neq V$

Select a node  $v \notin S$  with at least  
one edge from  $S$  for which  
 $d(v) = \min_{e(u,v): u \in S} (d(u) + le)$

Add  $v$  to  $S$

endwhile

## More Detailed Implementation of Dijkstra's

$S = \text{Null}$

Initialize priority Queue  $Q$  with all nodes  $V$  where  $d(v)$  is the key value.  
(All  $d(v)$ 's are  $= \infty$ , except for  $s$  where  $d(s) = 0$ )

While  $S \neq V$

$v = \text{Extract-Min}(Q)$

$S = S \cup \{v\}$

    for each vertex  $u \in \text{Adj}(v)$

        if  $d(u) > d(v) + l_e$ :

            Decrease-Key( $Q, u, d(v) + l_e$ )

    end for

end while

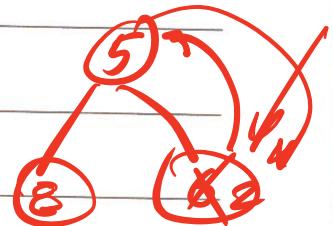
$O(n^2) \uparrow O(m)$

# Complexity Analysis

- Initialize Priority Queue  $O(n)$

- Max. no. of Extract-Min op's :  $n$

- Max. no. of Decrease-key op's :  $O(m)$

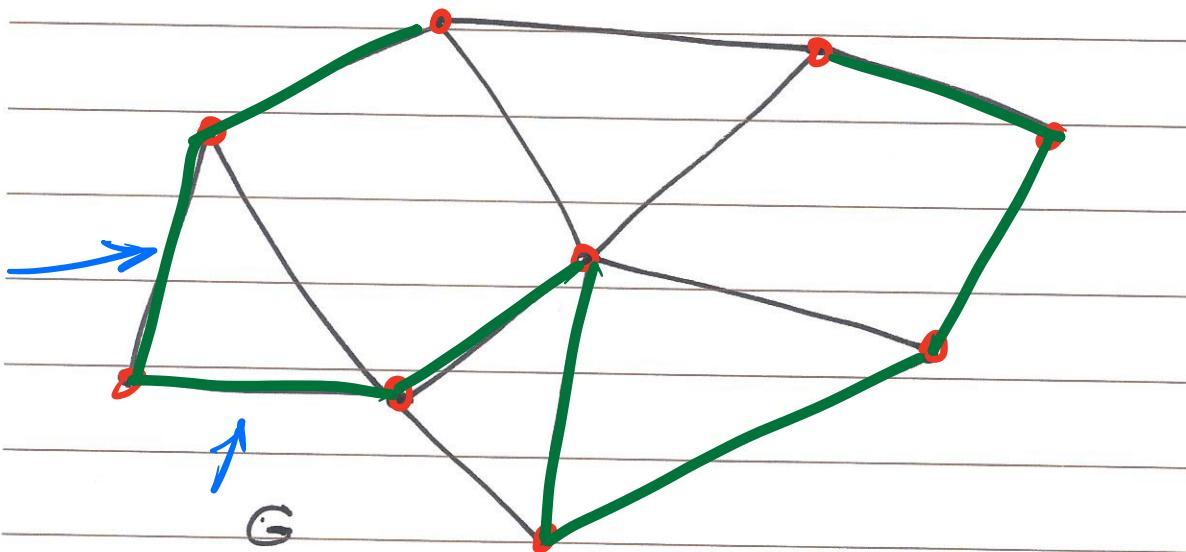


	Binary Heap	Binomial Heap	Fibonacci Heap
n. Extract-Mins	$O(n \lg n)$	$O(n \lg n)$	$O(n \lg n)$
m. Decrease-keys	$O(m \lg n)$	$O(m \lg n)$	$O(m)$
Total	$O(m \lg n)$	$O(m \lg n)$	<u><math>(m + n \lg n)</math></u>
Sparse graph	$O(n \lg n)$	$O(n \lg n)$	$(n \lg n)$
Dense •	<u><math>O(n^2 \lg n)</math></u>	<u><math>O(n^2 \lg n)</math></u>	<u><math>O(n^2)</math></u>



## Problem Statement

Find minimum cost network that connects all nodes in  $G$ .



Def. Any tree that covers all nodes of a graph is called a spanning tree.

Def. A spanning tree with minimum total edge cost is a minimum spanning tree. (MST)

## Problem Statement

Find a MST in an undirected graph

Sol. 1: Sort all edges in increasing order of cost. Add edges to  $T$  in this order as long as it does not create a cycle. If it does, discard the edge.

Kruskal's

Sol. 2: Similar to Dijkstra's algorithm, start with a node set  $S$  (initially the root node) on which a minimum spanning tree has been constructed so far.

At each step, grow  $S$  by one node, adding the node  $v$  that minimizes the attachment cost.

Prim's

Sol. 3: Backward version of Kruskal's.

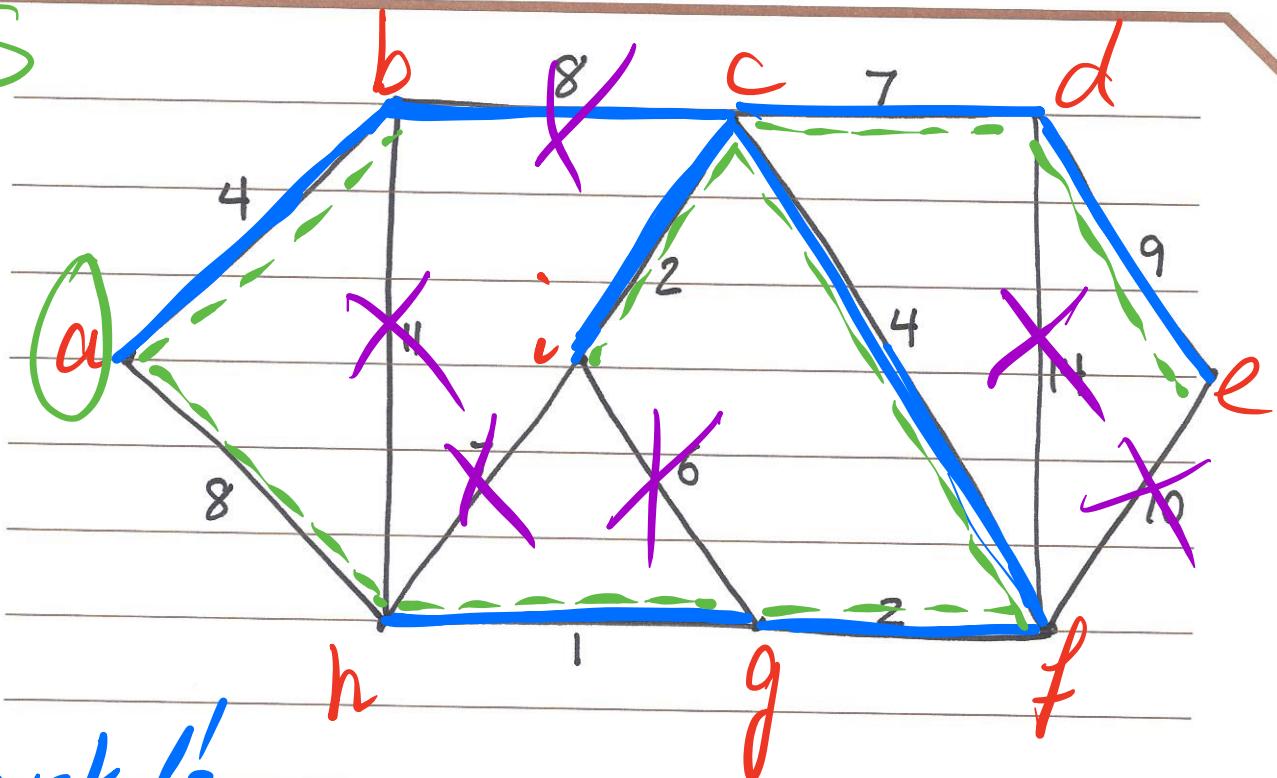
Start with a full graph ( $V, E$ ).

Begin deleting edges in order  
of decreasing cost as long as  
it does not disconnect the graph

Reverse-Delete

V-S

S



Kruskals'         
Prim's       

Reverse-Dekte X

FACT: Let  $S$  be any subset of nodes  
that is neither empty nor equal to  
all of  $V$ , and let edge  $e = (v, w)$   
be the min cost edge with one end  
in  $S$  and the other end in  $V - S$ .  
Then every MST contains the edge  $\underline{e}$ .