

CS112: Data Structures

Lecture 12:

Heaps
Graphs
Shortest path

Final Exam

- **Wednesday, August 16**
 - 2 weeks from today
- **6:00 PM**
- **In our normal lecture room**
- **More cumulative than Exam 2 was**
- **Topic list and practice exam will be on Sakai**

- **Today's topics**
 - **Heaps**
 - **Graphs**
 - **shortest path**

Review: Priority Queues

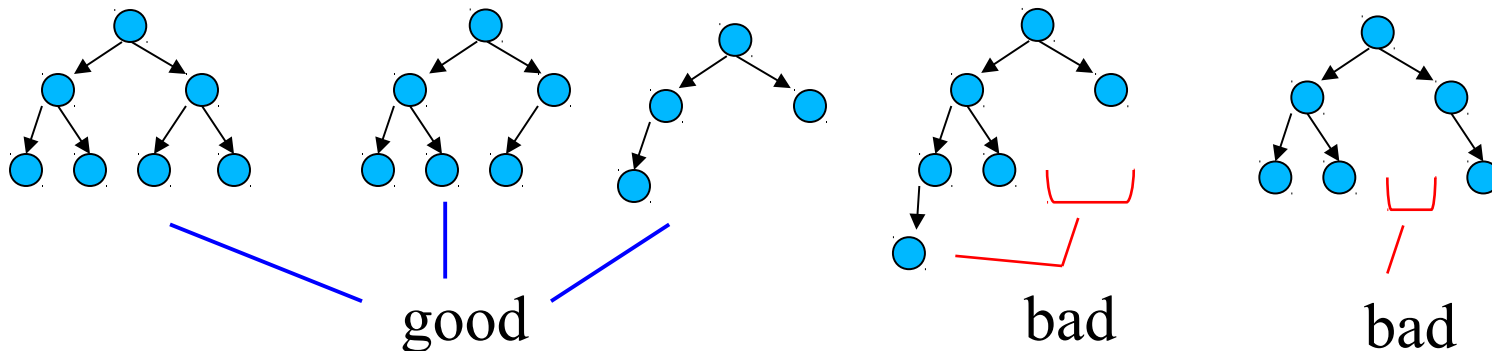
- **Each data item has a priority**
- **Add items to queue in any order**
- **Remove items in priority order**
 - **add A:5, B:6, C:3**
 - **remove B**
 - **add D:4**
 - **remove A, remove D**

Priority Queue as an Array

- **Either as sorted or unsorted, one of**
 - **add item to queue, or**
 - **remove highest priority item****is $O(n)$**
- **Can we add and remove in less than $O(n)$?**

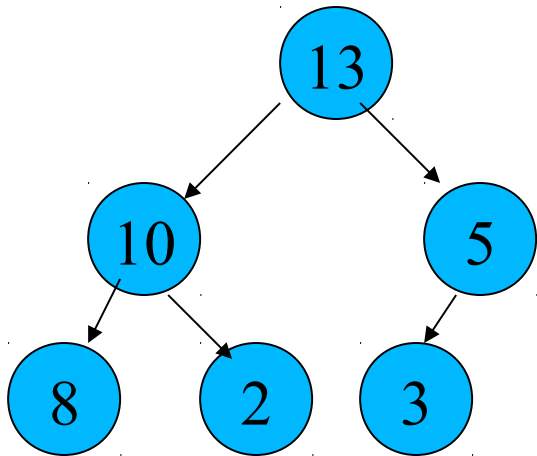
Heap

- A heap is a way to implement a priority queue with $O(\log n)$ complexity
- A heap is a complete binary tree
 - all levels except maybe the last are full
 - last level filled from left to right

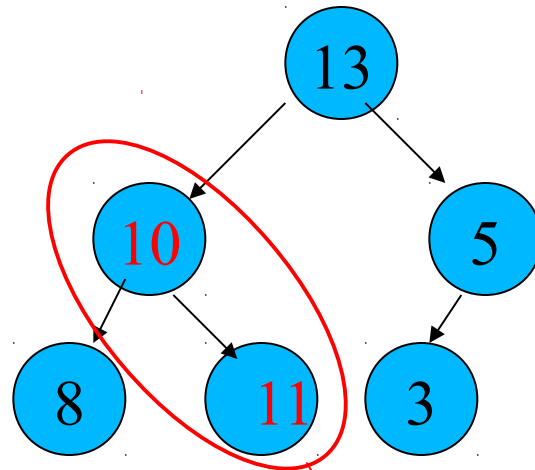


New: Heap

- And the number at a node is greater than the number at any descendant



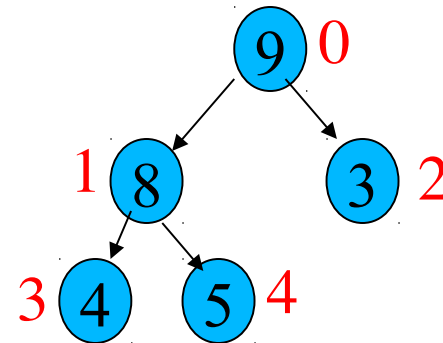
good



bad

Heap Representation

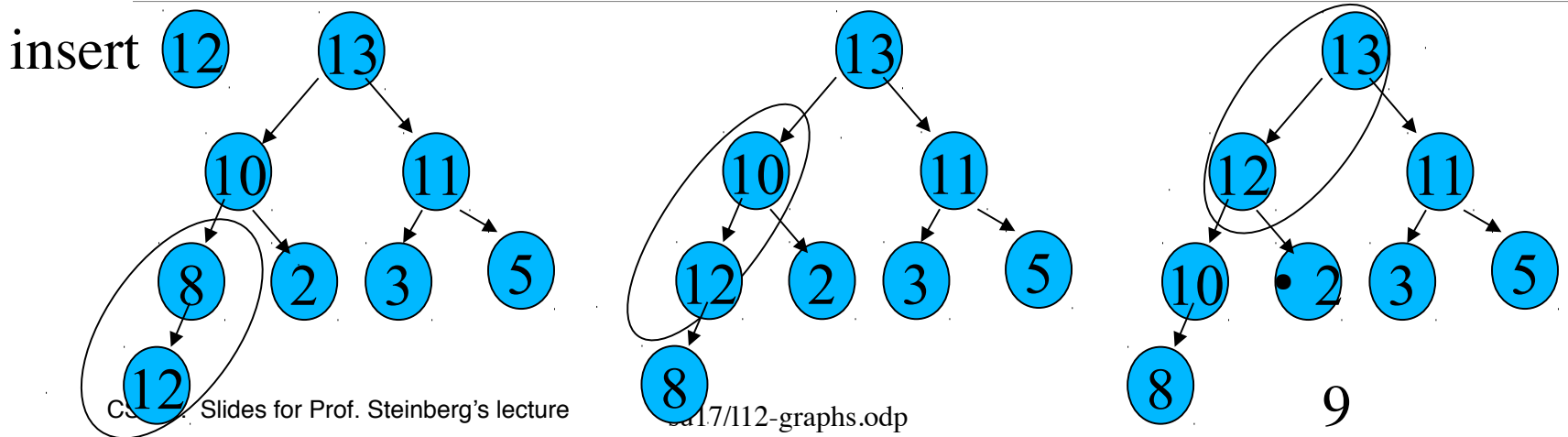
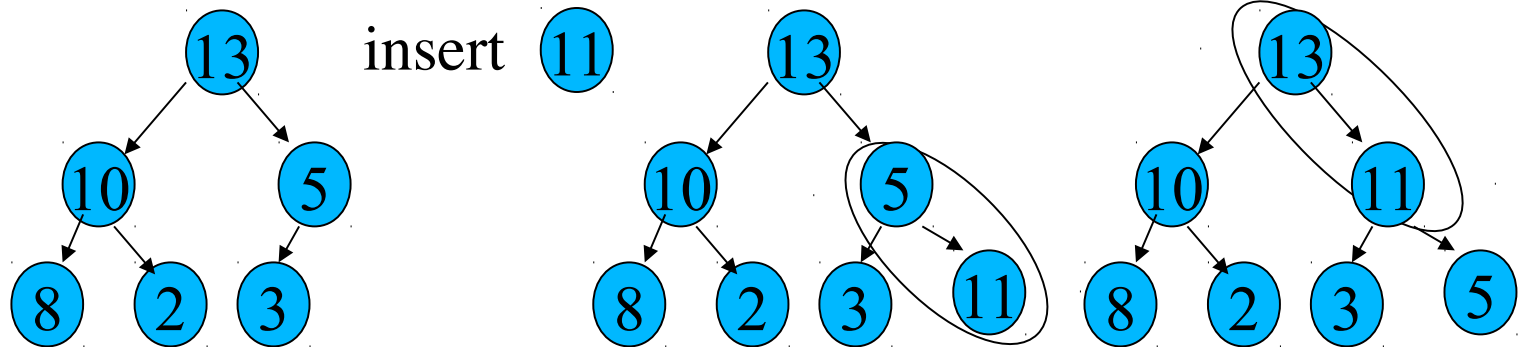
- **Store heap in an array**
 - For node at index j , children are at $2j+1$ and $2j+2$
 - Parent at $\text{floor}((j-1)/2)$
 - Root at index **0**



0	1	2	3	4
9	8	3	4	5

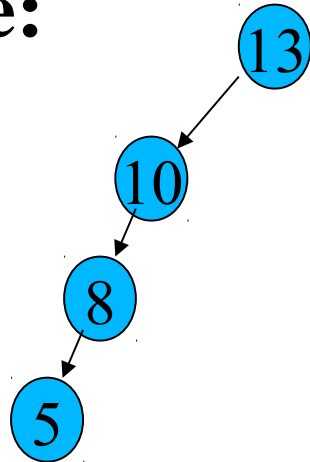
Heap Insert

- Add node at end of last level
- Move up restoring order (*filter up*)



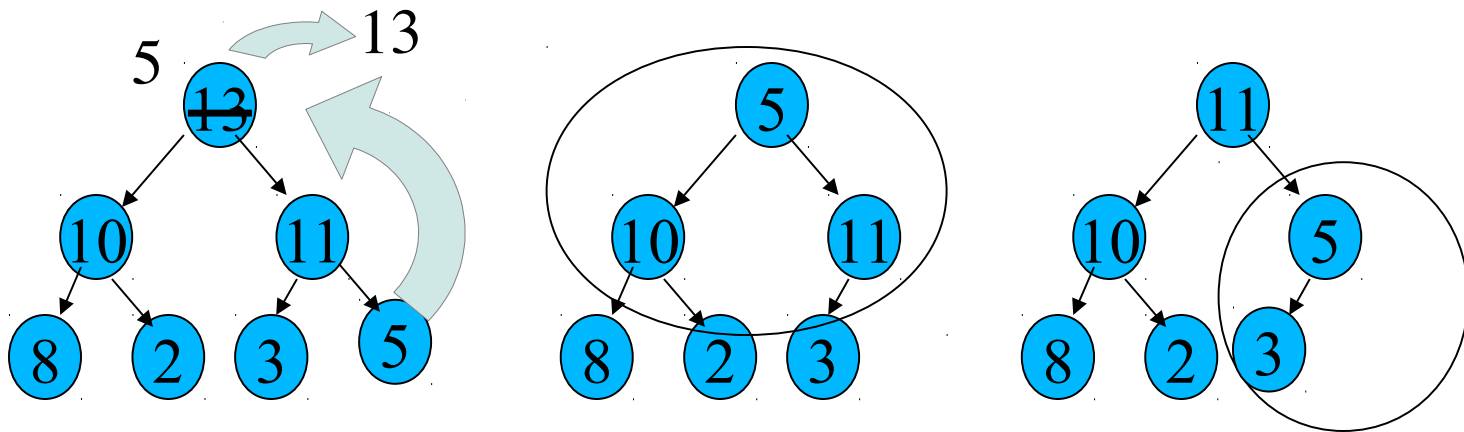
Big O of insertion

- $O(H)$ where H is height of whole tree
= $O(\log(n))$ where n is number of nodes
- Heap is a complete binary tree so this is impossible:



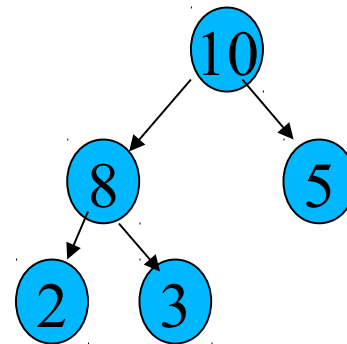
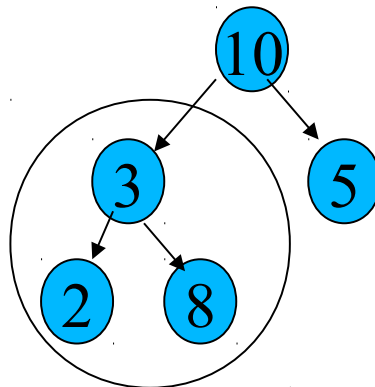
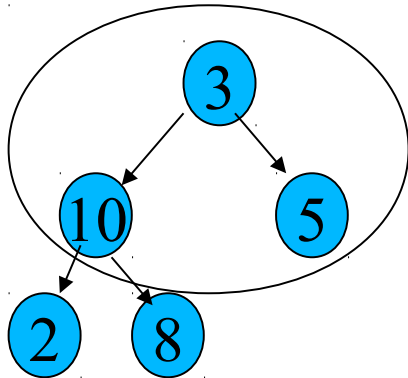
Heap Deletion

- **Copy out data at root**
- **Delete last node on last row & put data in root**
- **Move down restoring order (*filter down*)**



Filter Down

- **Compare current node and its two children**
 - if current node largest, stop
 - if left child is largest
swap data of current and left, current \leftarrow left
 - similarly if right child is largest



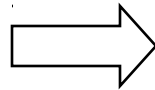
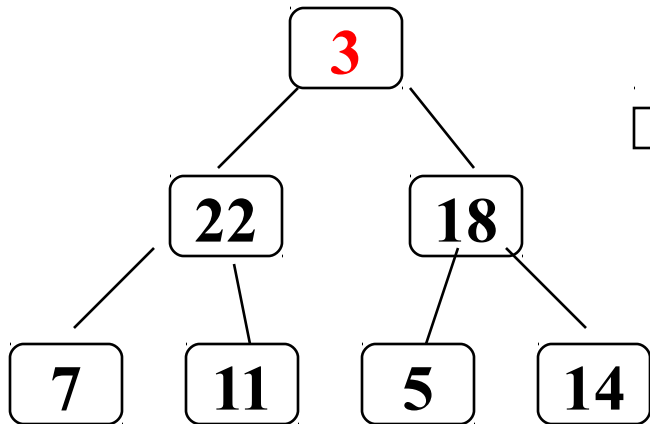
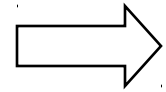
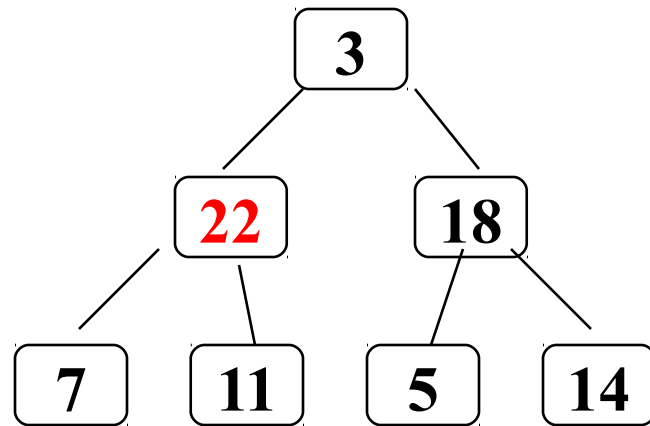
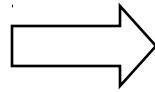
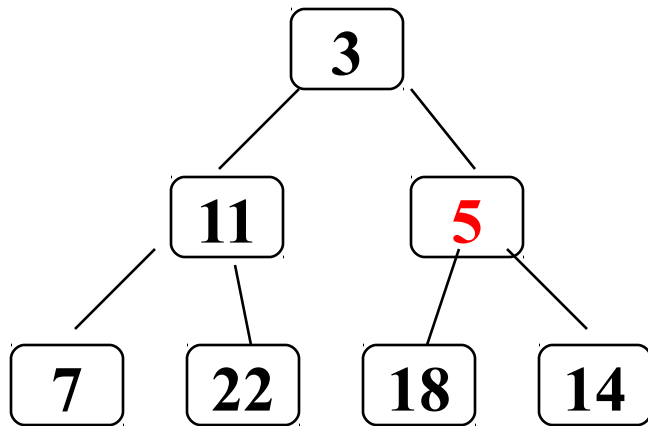
Big O of deletion

- **$O(H)$ where H is height of whole tree
= $O(\log(n))$ where n is number of nodes**

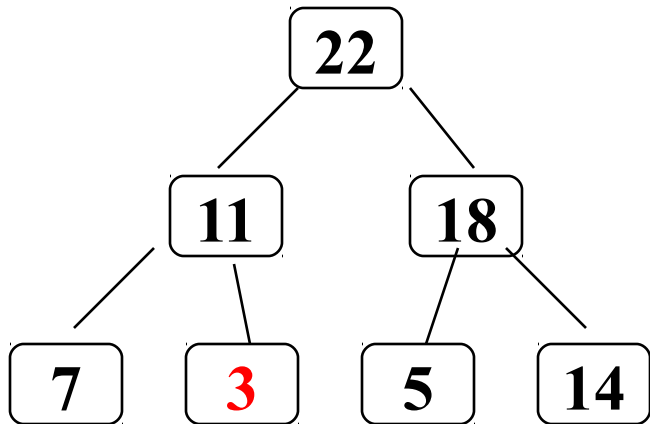
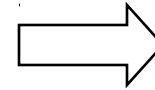
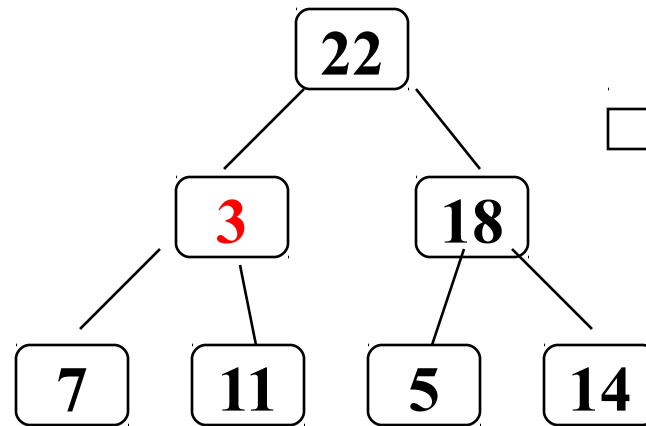
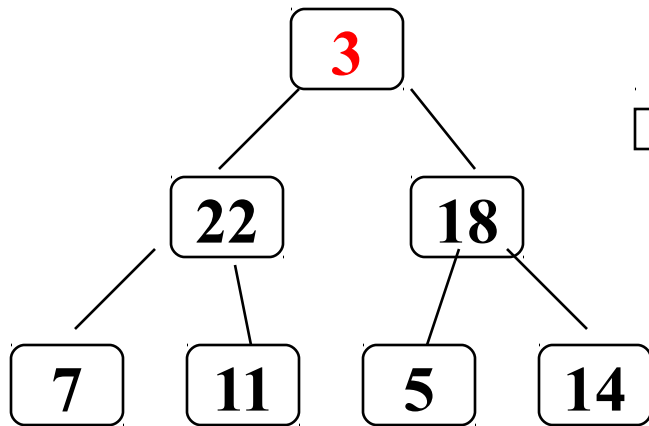
Building a Heap from an Array

- **Go through the array in reverse order**
 - from parent of the last leaf
 - to index 0
- **At each node, do filter-down**

Building a Heap from an Array



Building a Heap from an Array



Building a Heap from an Array

- Work at a node is $O(h)$ where h is height of subtree rooted at that node
- In a complete binary tree, majority of nodes close to bottom, so adds up to $O(n)$

Implementing a heap

- See `tree/Heap.java`

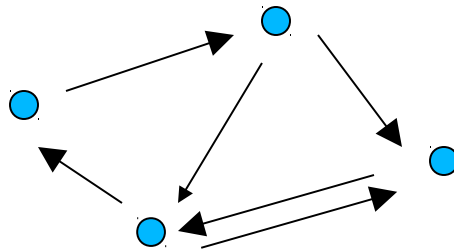
Heap Sort

- **Heapify unsorted array: $O(n)$**
- **Remove all n items from the heap, one by one: $n * O(\log n) = O(n \log n)$**
- **Total: $O(n) + O(n \log n) = O(n \log n)$**

Review: Graphs

Generalization of trees

- **Digraph (Directed Graph)**
 - Like a tree but any vertex can point to any other

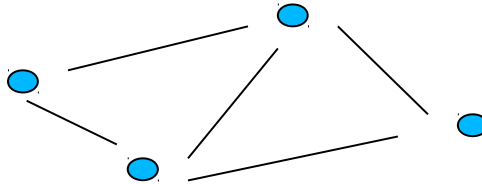


- E.g., Twitter follows relationship

Graphs

Generalization of trees

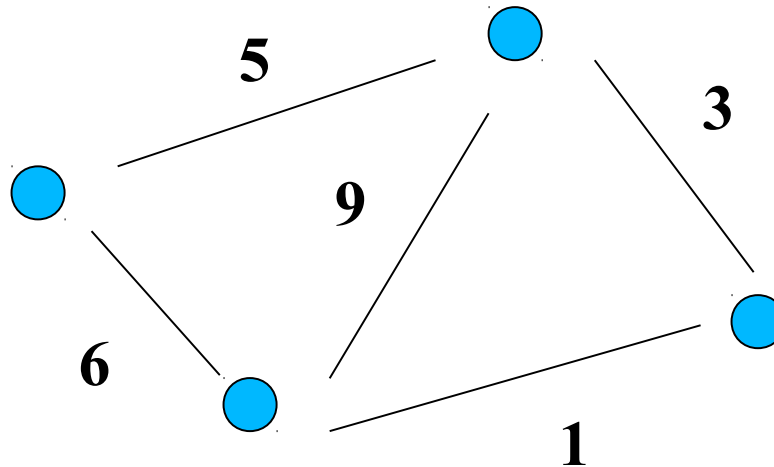
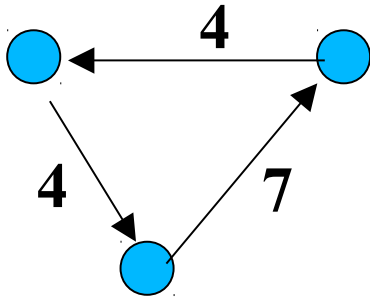
- **Graph**
 - like digraph but arcs have no direction



- **E.g., Facebook friends relationship**

Graphs

- **Weighted Graph**
 - Positive integer weights on each edge

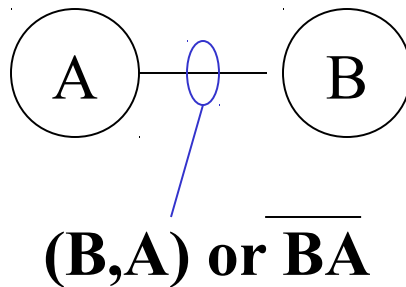


Applications

- **Paths**
 - **On streets (eg Google Maps)**
- **Electrical networks**
 - **Power lines**
 - **Printed Circuits**
- **Constraints**
 - **Ordering constraints on building steps**
eg counters before sinks
- **Many more**

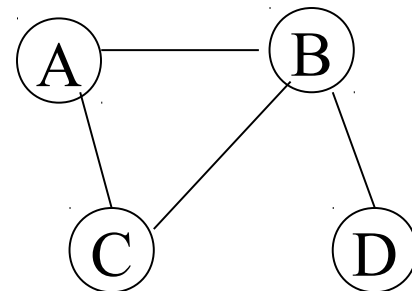
Notation

- **Arcs are named by the vertices they connect**



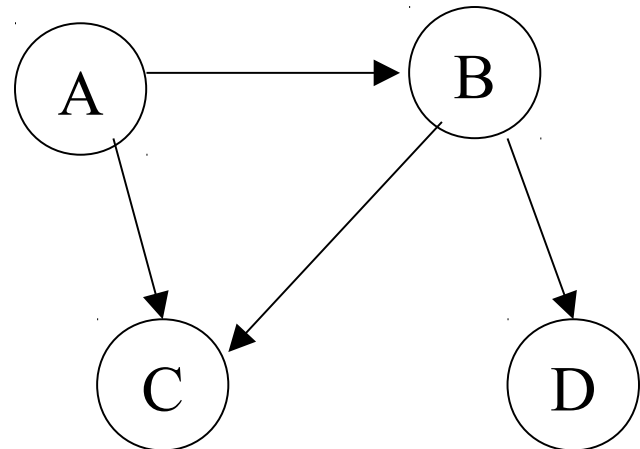
Graph Concepts

- **Neighbors of a vertex:** vertices that it shares an arc with
 - Neighbors of A are B and C
- **Degree of a vertex:** number of neighbors
 - Degree of A is 2, degree of B is 3



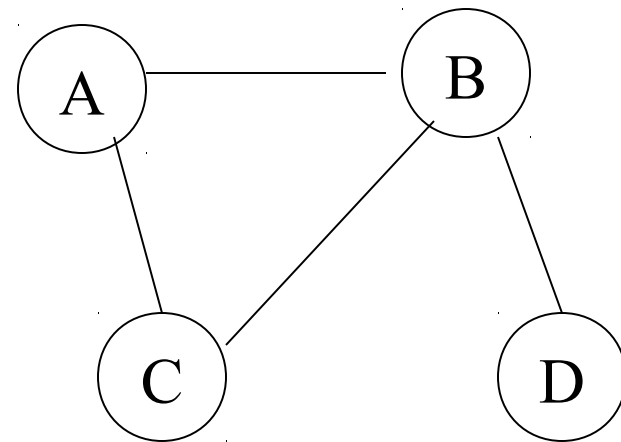
Graph Concepts

- **In degree (in a digraph):** number of vertices that have arcs to this vertex
 - In degree of B is 1
- **Out degree (in a digraph):** number of vertices that have arcs from this vertex
 - Out degree of B is 2



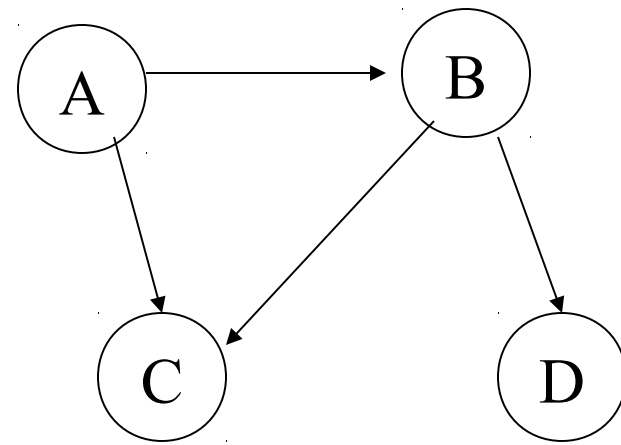
Graph Concepts

- **(Simple) Path**
 - Sequence of arcs
 $(A,B),(B,C)$
 - May not revisit a vertex
 ~~$(B,A),(A,C),(C,B),(B,D)$~~
 - Except last vertex may = first
 $(B,A),(A,C),(C,B)$
- **Vertex A is reachable from B if there is a path from B to A**



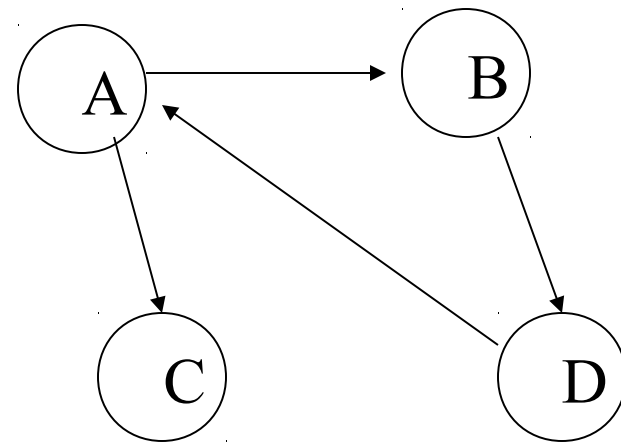
Graph Concepts

- **Path**
 - On digraph must follow arc directions
 $(A,B),(B,D)$
 ~~$(A,C),(C,B)$~~



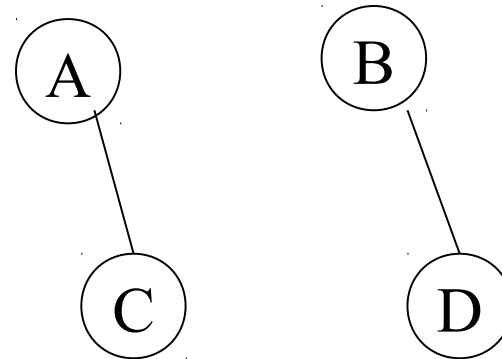
Graph Concepts

- **A cycle is a path from a node back to itself**
 - **(A, B)(B, D)(D, A)**
- **A graph with no cycles is called acyclic**



Graph Concepts

- **Connected Graph**
For any two vertices X and Y
there is a path from X to Y.

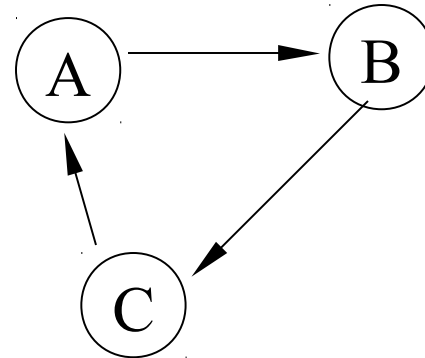


not connected

Graph Concepts

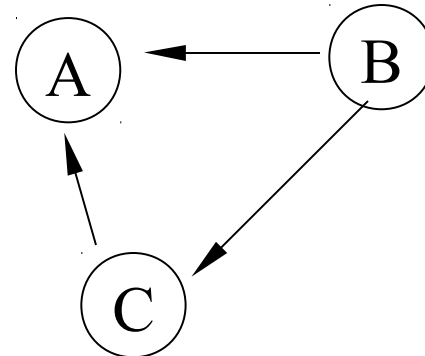
- **Strongly Connected Digraph**

For any two vertices X and Y there is a path from X to Y. (Paths must follow arc directions)



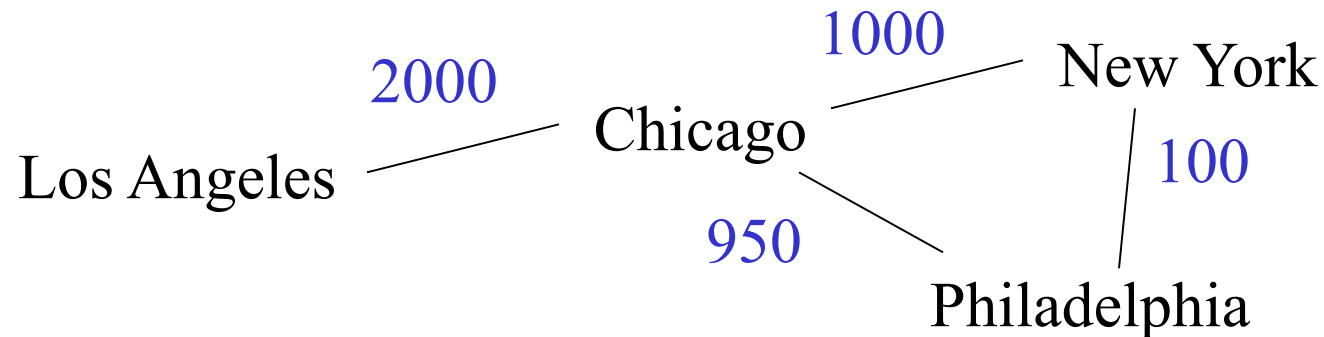
- **Weakly Connected Digraph**

Corresponding graph is connected (i.e., ignoring arc direction)



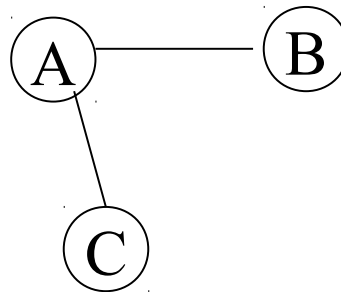
Graph Concepts

- **Weighted graph: each arc has a numerical weight**



Representing Graphs

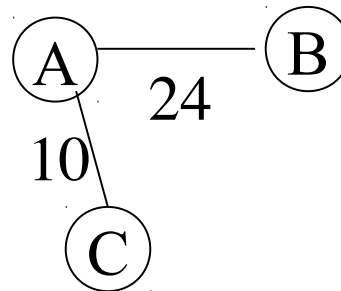
- **Adjacency matrix**
 - **$n \times n$ boolean matrix: is there an arc?**



	name		0	1	2
0	A	0		T	T
1	B	1	T		
2	C	2	T		

Representing Graphs

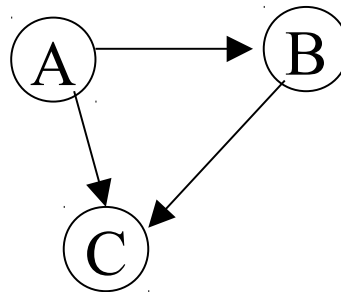
- **Adjacency matrix**
 - **$n \times n$ boolean matrix: weight of the arc or -1**



	name		0	1	2
0	A	0	-1	24	10
1	B	1	24	-1	-1
2	C	2	10	-1	-1

Representing Graphs

- **Adjacency matrix**
 - **$n \times n$ boolean matrix: is there an arc?**

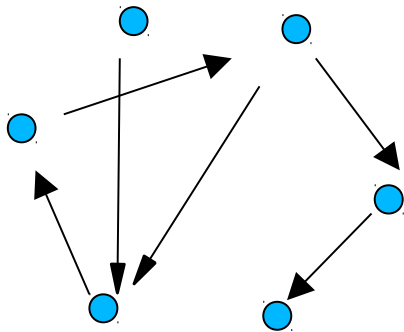


name				
		0	1	2
0	A	0		
1	B	1	T	T
2	C	2		T

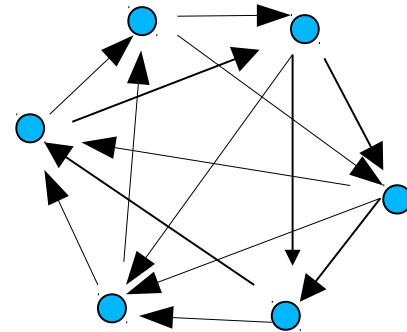
Adjacency Matrix

- **Space cost: v^2 booleans where v is number of vertices**
- **If v is large, v^2 is huge**
 - **Facebook: $v = 10^9$, $v^2 = 10^{18}$**
1,000,000,000,000,000,000
 - **An average Facebook user has about 350 friends**
 - **if e is number of edges, $e = 10^9 * 175$**
 - **Fraction of Trues in matrix = $10^9 * 175 / 10^{18} = 1.75 * 10^{-7}$**
 $\approx 1 / 5,000,000$

Sparse vs Dense Graphs



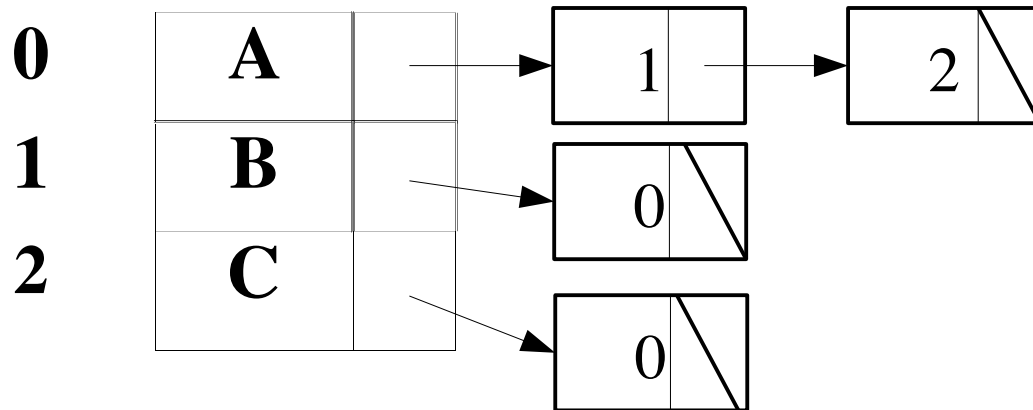
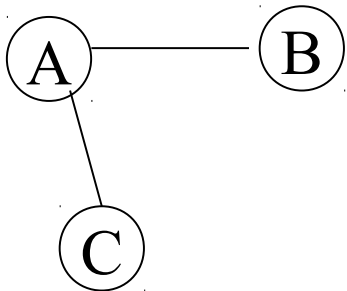
Sparse



Dense

Representing Graphs

- **Adjacency list**
 - for each node, a linked list of edges that touch it

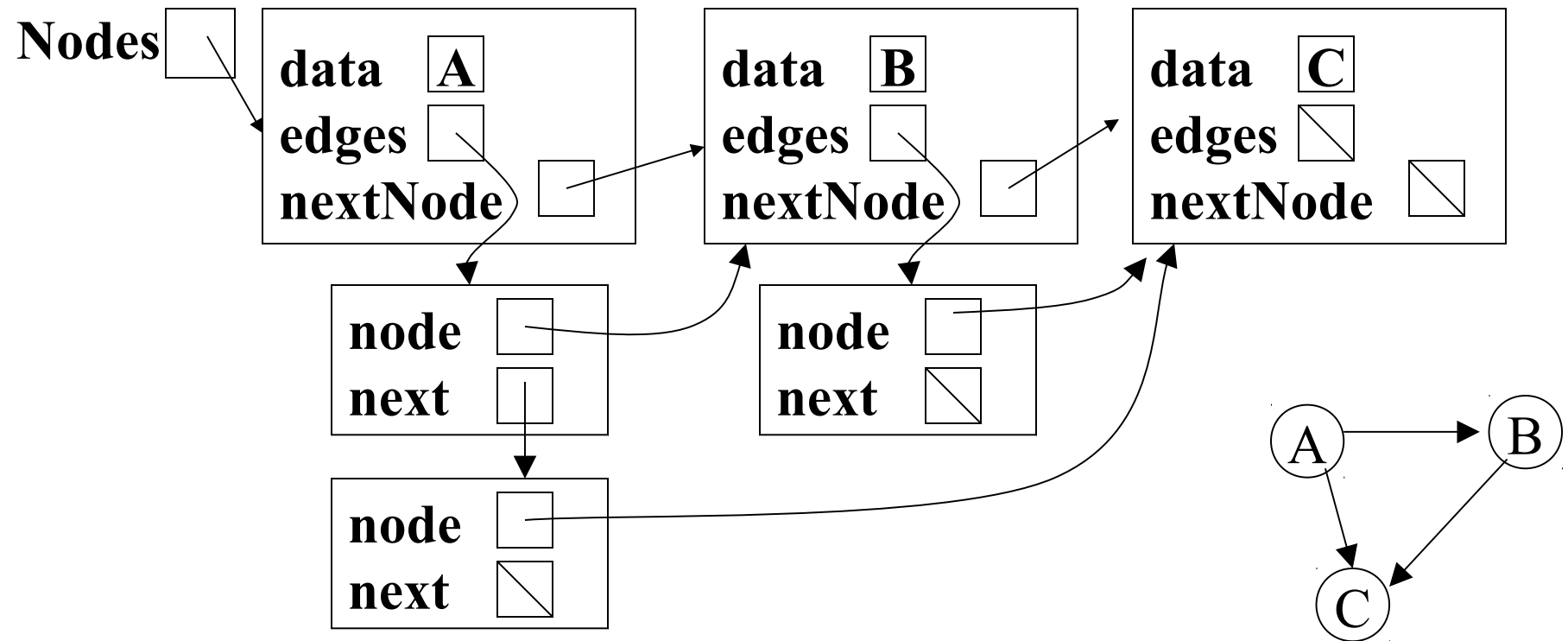


Representing Graphs

- **Adjacency list**
 - **for each node, a linked list of edges that touch it**
 - **Space cost: $2 * (v + e) = O(v+e)$**
 - **For Facebook: $2*(10^9 + 175 * 10^9) = 350*10^9$**

Representing Graphs

- **Adjacency list**
 - for each node, linked list of edges



Time costs, Worst case

	Is there an edge from i to j	List the neighbors of i
Adjacency matrix	$O(1)$	$O(v)$
Adjacency list	$O(d)$	$O(d)$

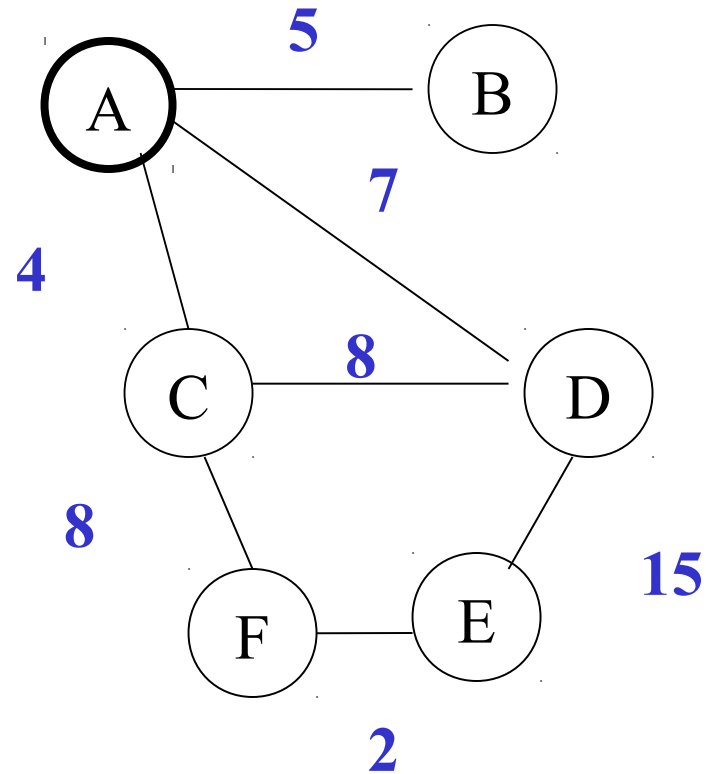
d is degree of vertex i , $d < v$
(usually $d \ll v$)

New: Shortest Path

- **weighted digraph**
 - **weights are all > 0**
- **“length” of a path = sum of weights of arcs on path**
- **given start vertex, end vertex, find shortest path from start to end**

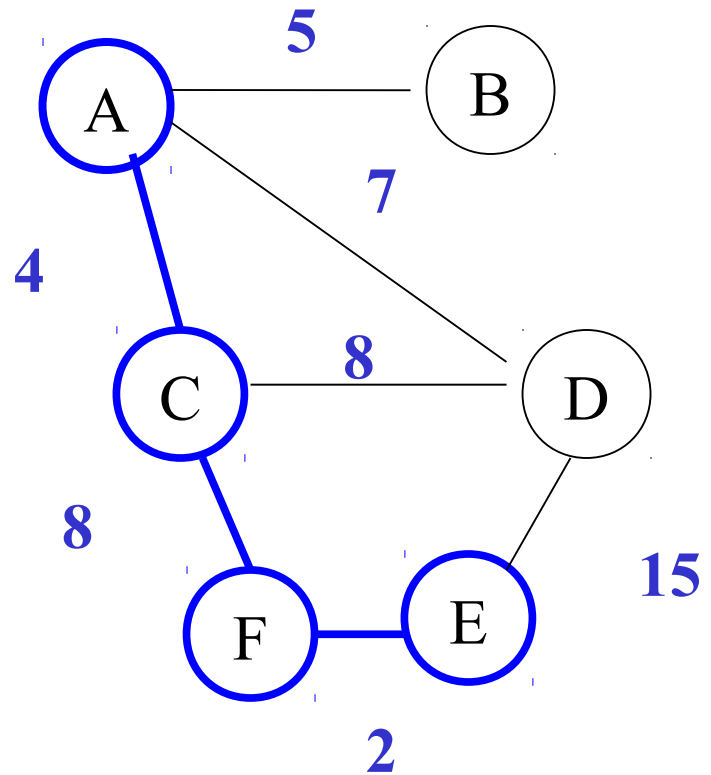
Shortest Paths

- **What is the shortest path**
 - **from A to E?**
 - **from A to F?**



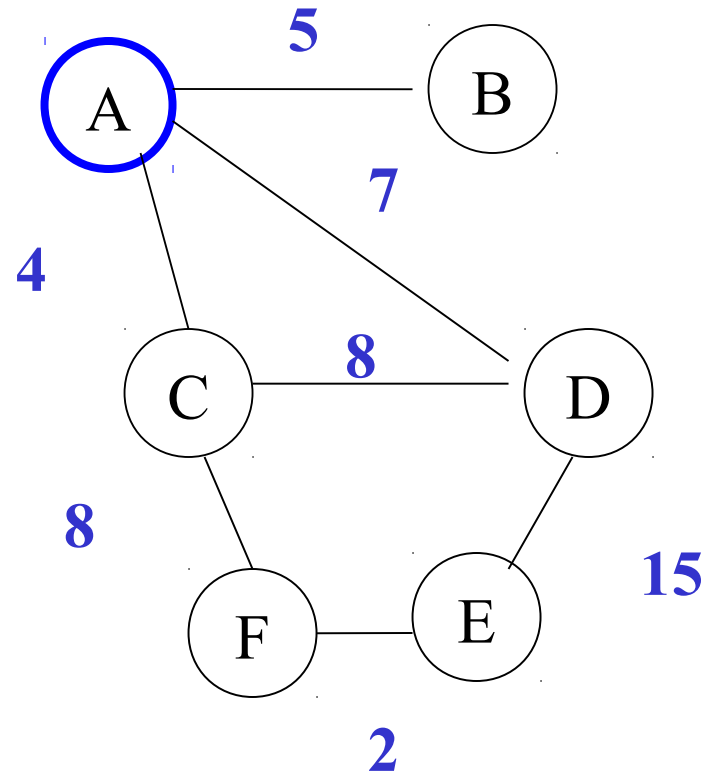
Shortest Paths

- If a shortest path from A to E runs through F, the part from A to F is a shortest path from A to F



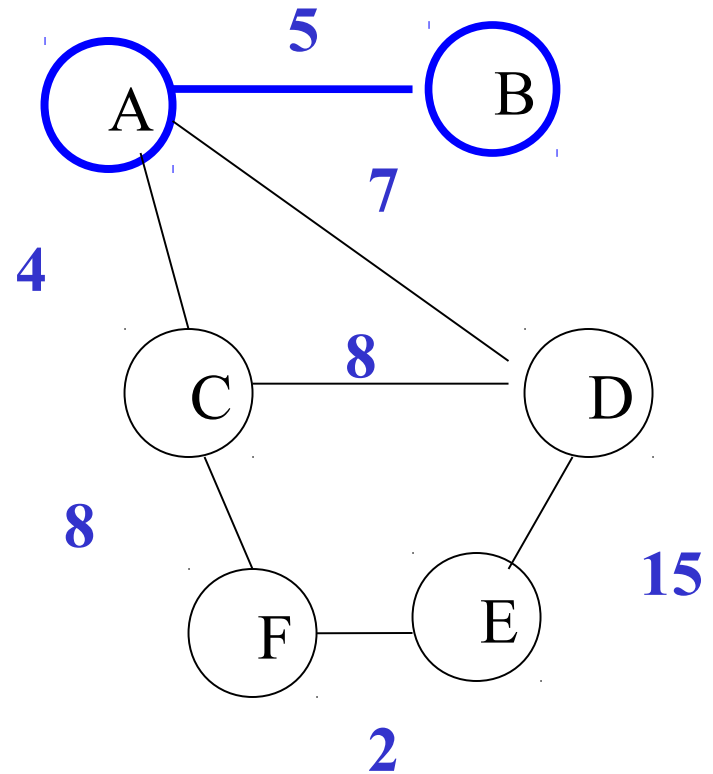
Dijkstra's Algorithm

- Consider the shortest paths from A to each other vertex.



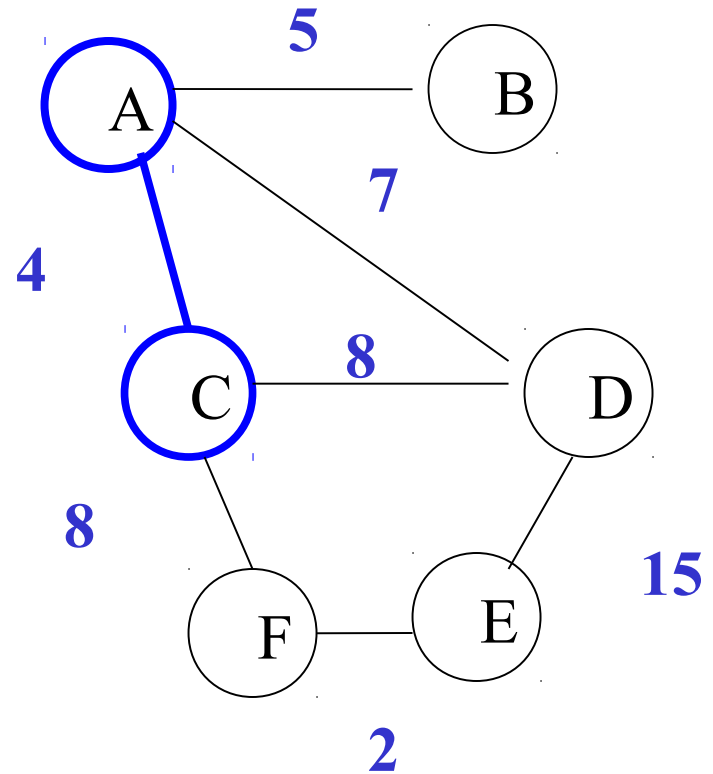
Dijkstra's Algorithm

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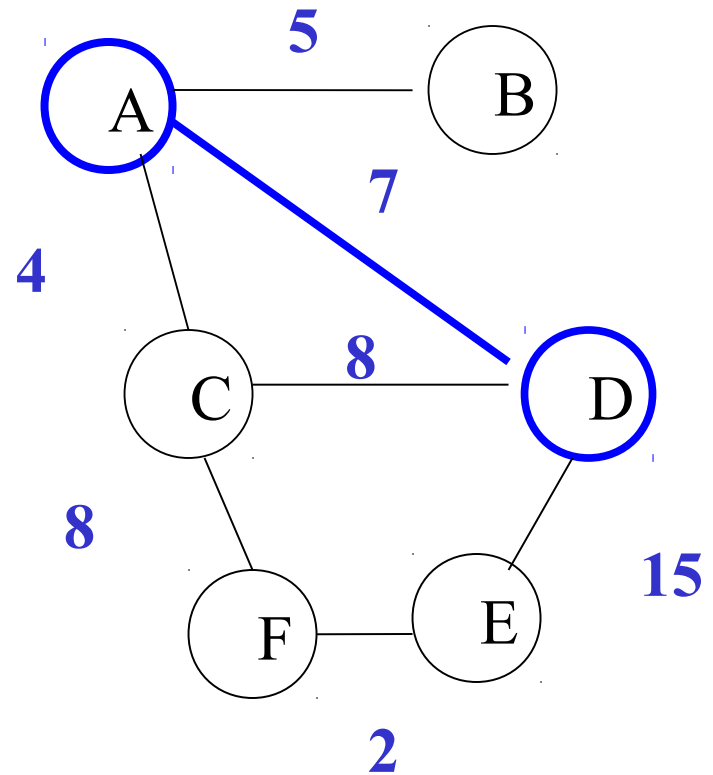
Dijkstra's Algorithm

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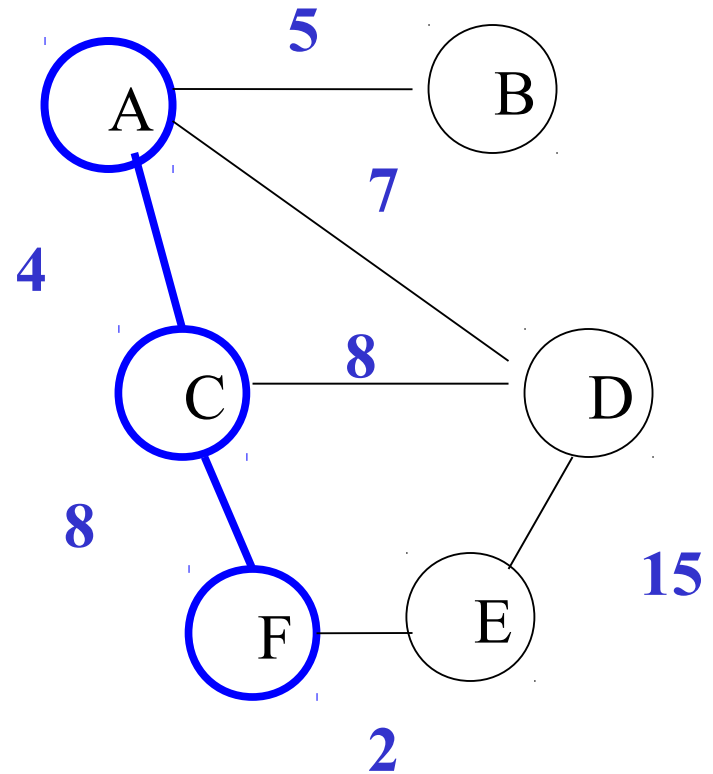
Dijkstra's Algorithm

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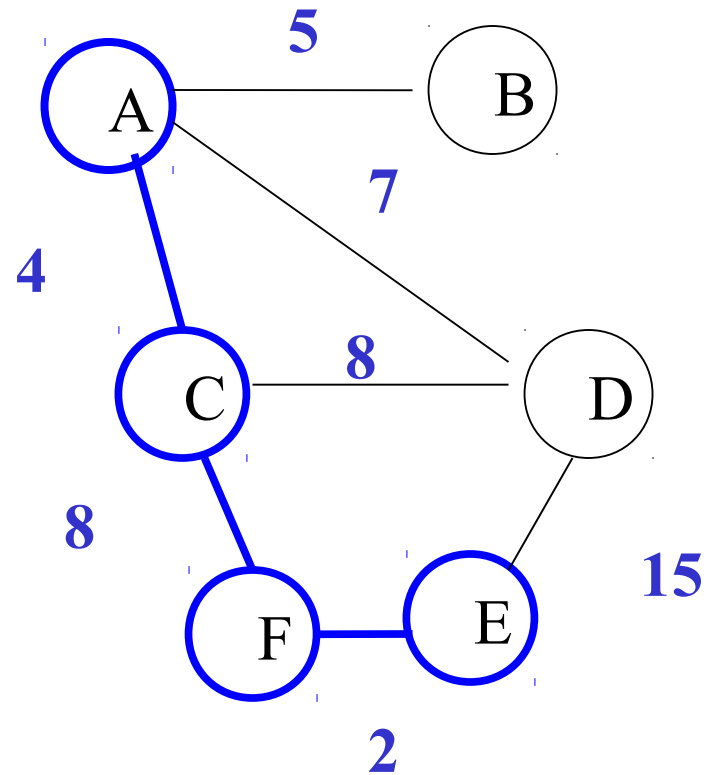
Dijkstra's Algorithm

- Consider the shortest paths from A to each other vertex.



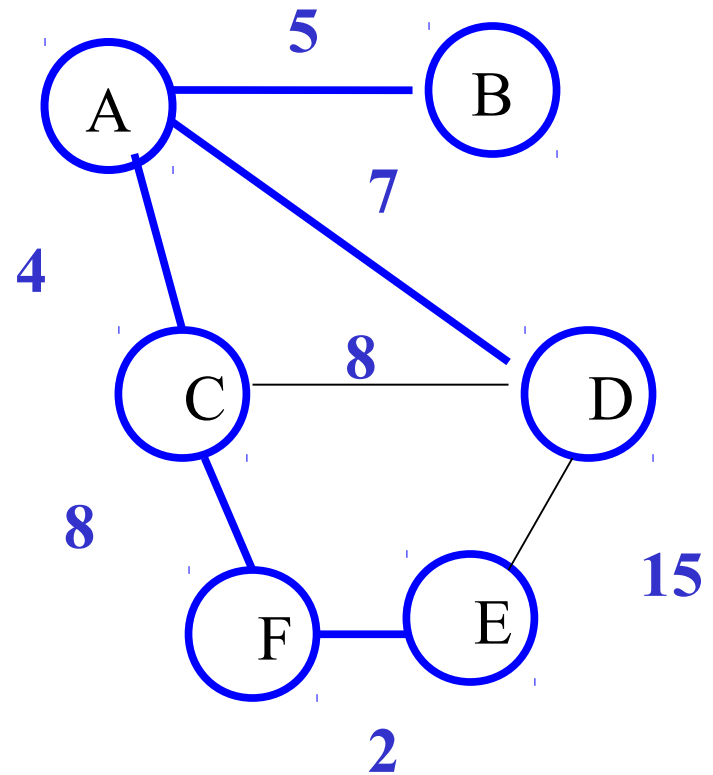
Dijkstra's Algorithm

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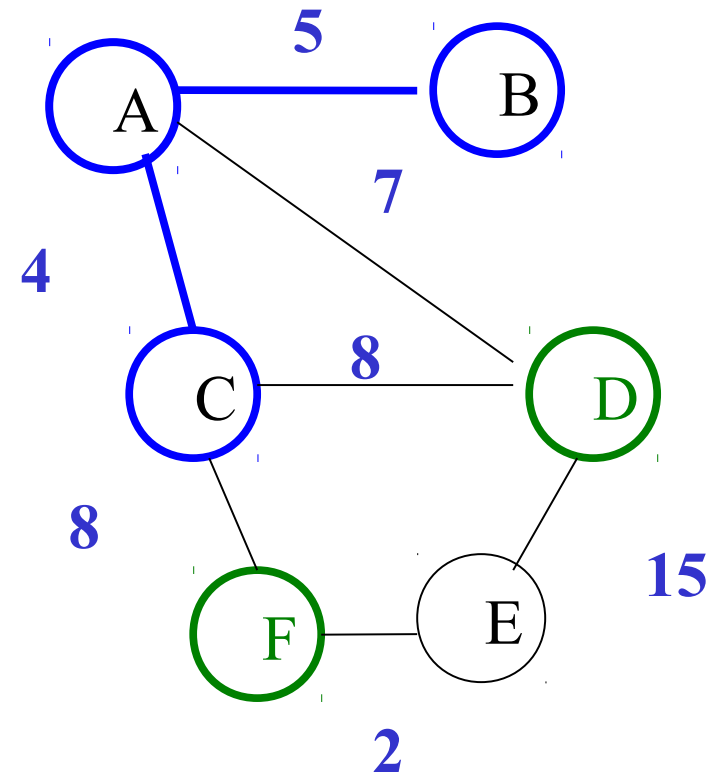
Dijkstra's Algorithm

- These can be put together to form a tree
- *A Shortest Path Tree*



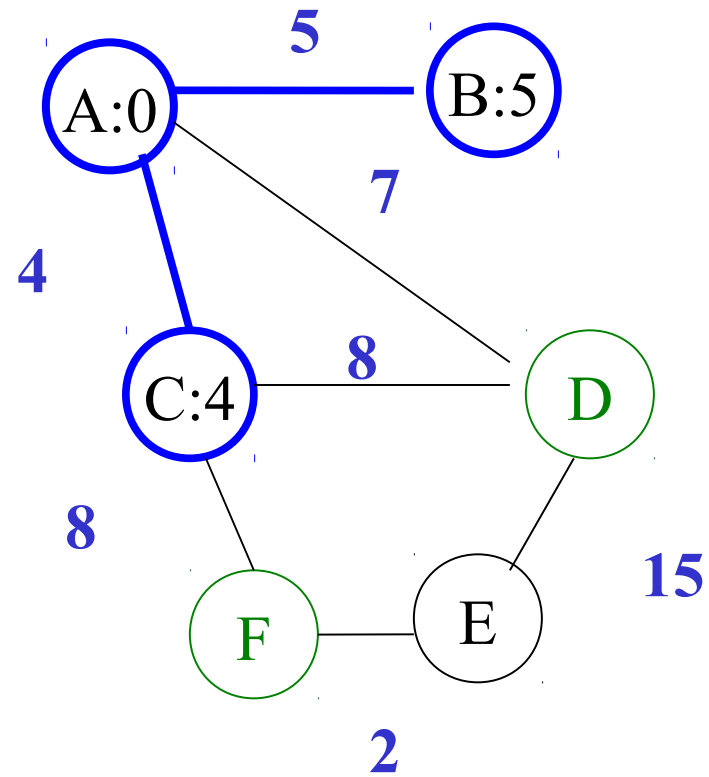
Dijkstra's Algorithm

- **Grow a tree of shortest paths from start**
 - grow it one vertex at a time, closest to farthest
- **Fringe:** nodes that are not in the tree yet but have a neighbor in the tree



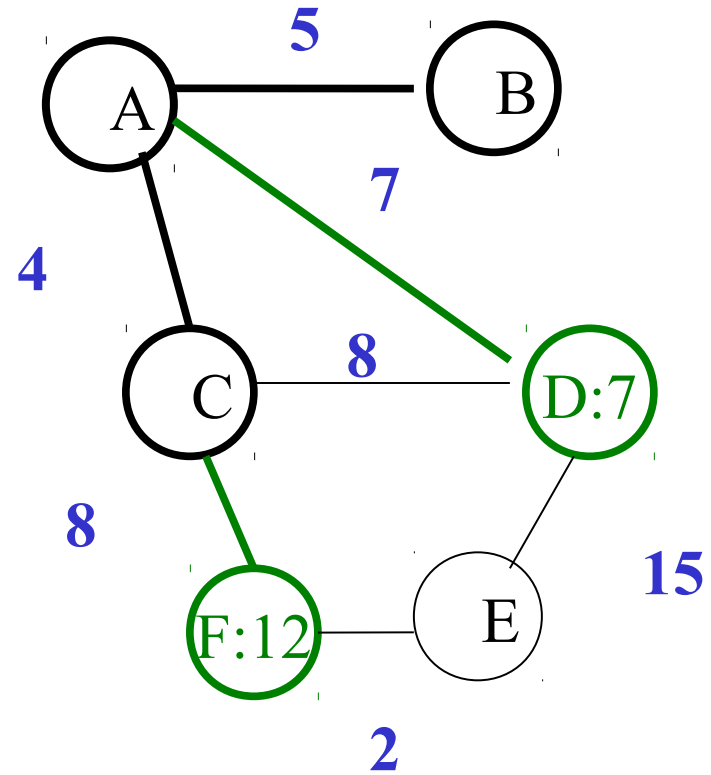
Dijkstra's Algorithm

- Vertices in the tree have
 - a link: first step on the shortest path back to start
 - a distance: the length of that whole path back to start



Dijkstra's Algorithm

- Vertices in the fringe have
 - a **link**: an arc to the tree if > 1 of these, use the arc that gives the shortest path back to start
 - a **distance**: the length of the path using link



Algorithm:

Put start vertex in the tree

While there are any vertices in fringe

**Let v be vertex in fringe with
smallest distance-from-start.**

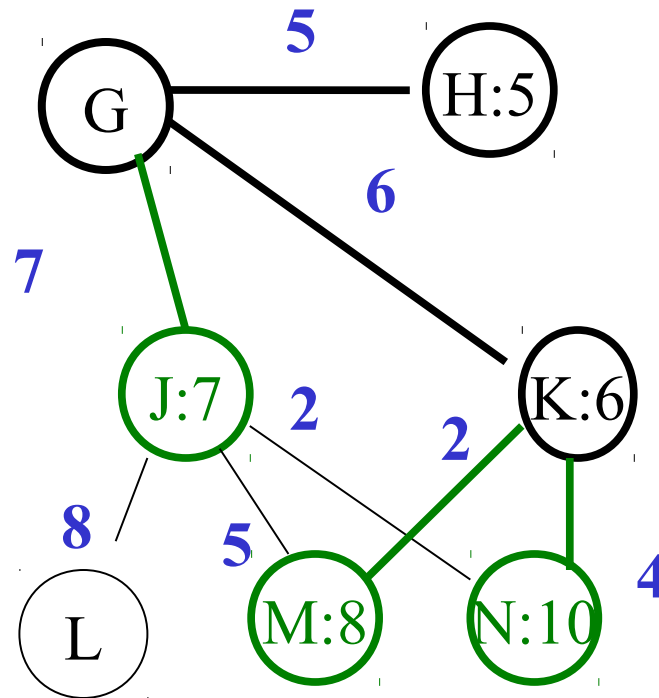
Put v in the tree.

Update fringe

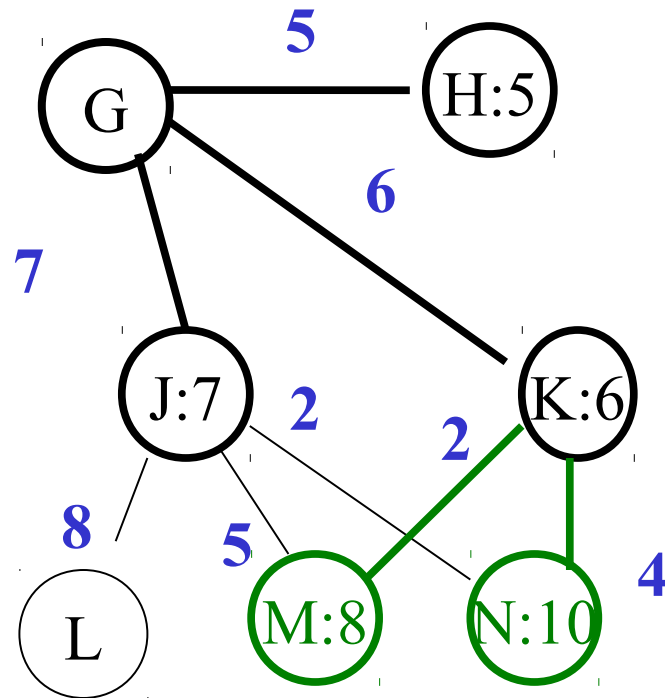
Update fringe

- **Neighbors of v that are not in tree or fringe get added to fringe**
- **Neighbors of v that are in the fringe get checked: would changing link to be v result in a smaller distance? If so, change link and distance**

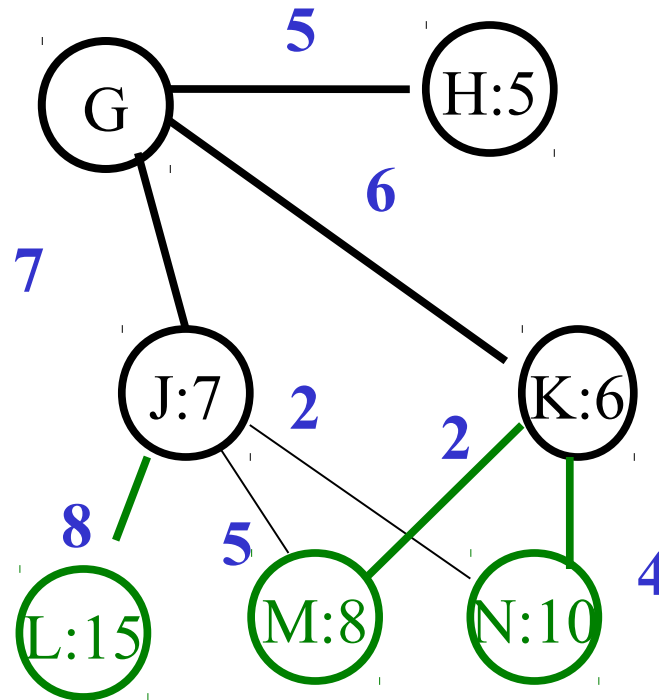
$J \rightarrow \text{tree, Update fringe}$



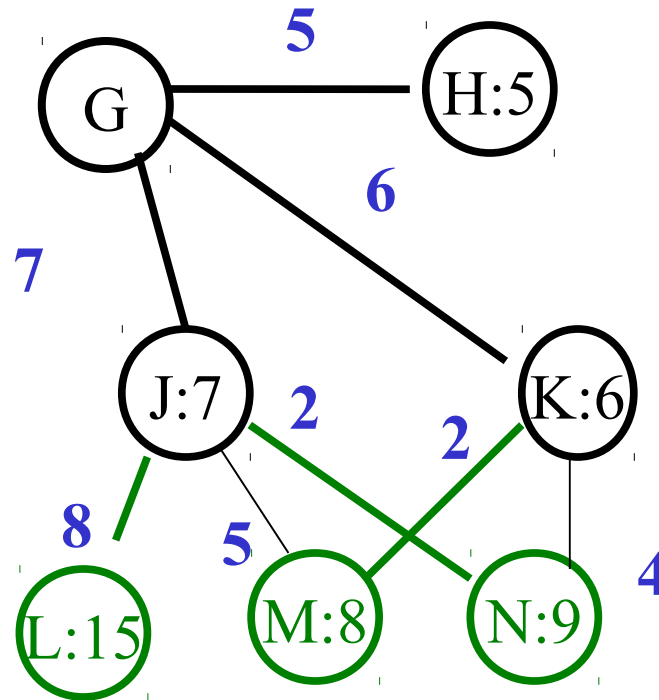
$J \rightarrow \text{tree}$



Update fringe: neighbors \rightarrow fringe



Update fringe: Check neighbors' links



Example

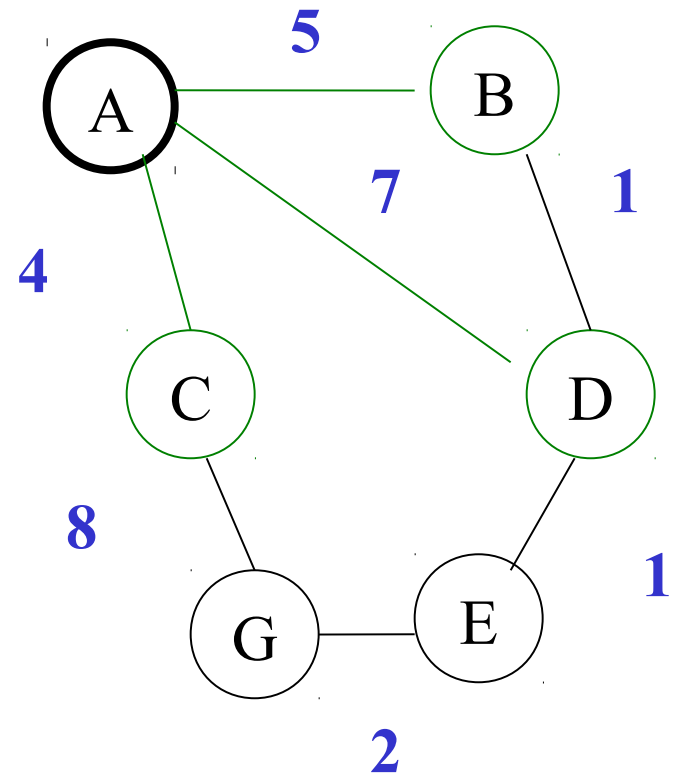
Step:	1
Node	SLD
A	Tx0
B	FA5
C	FA4
D	FA7
E	Nxx
G	Nxx

State:

T: in Tree

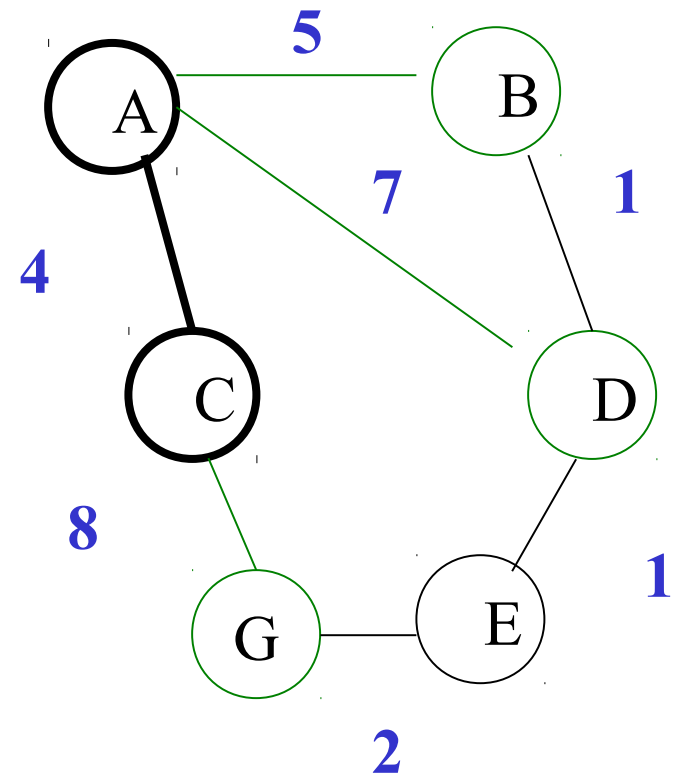
F: in Fringe

N: Neither



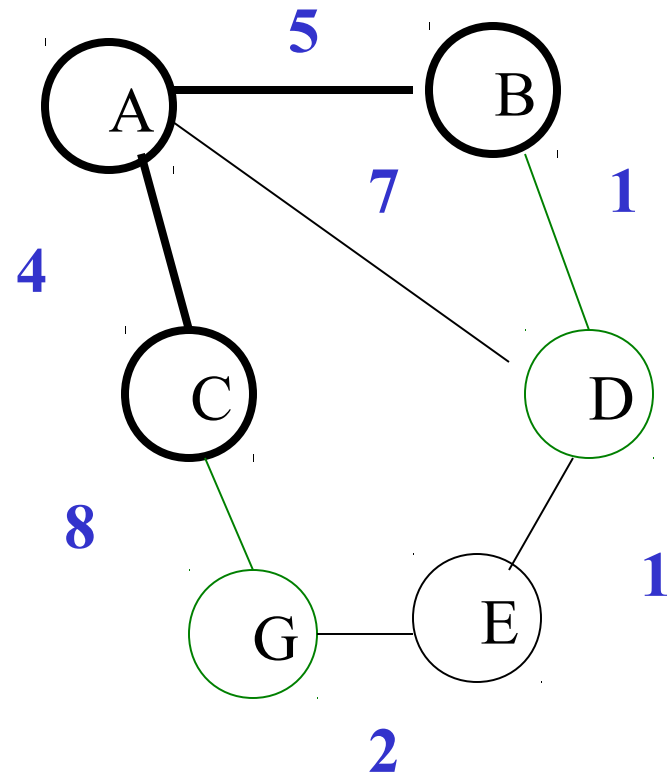
Example

Step:	1	2
Node	SLD	SLD
A	Tx0	
B	FA5	FA5
C	FA4	TA4
D	FA7	FA7
E	Nxx	Nxx
G	Nxx	FC12



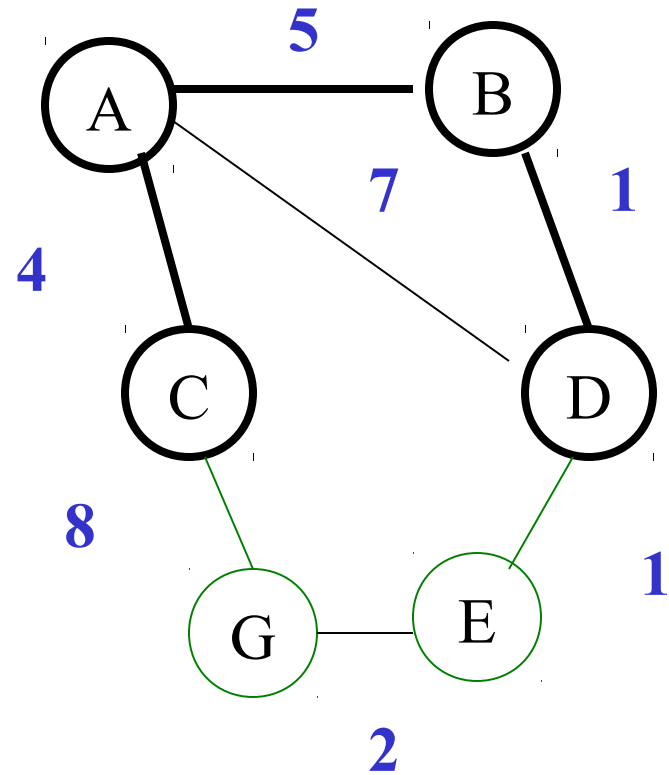
Example

Step:	1	2	3
Node	SLD	SLD	SLD
A	Tx0		
B	FA5	FA5	TA5
C	FA4	TA4	
D	FA7	FA7	FB6
E	Nxx	Nxx	Nxx
G	Nxx	FC12	FC12



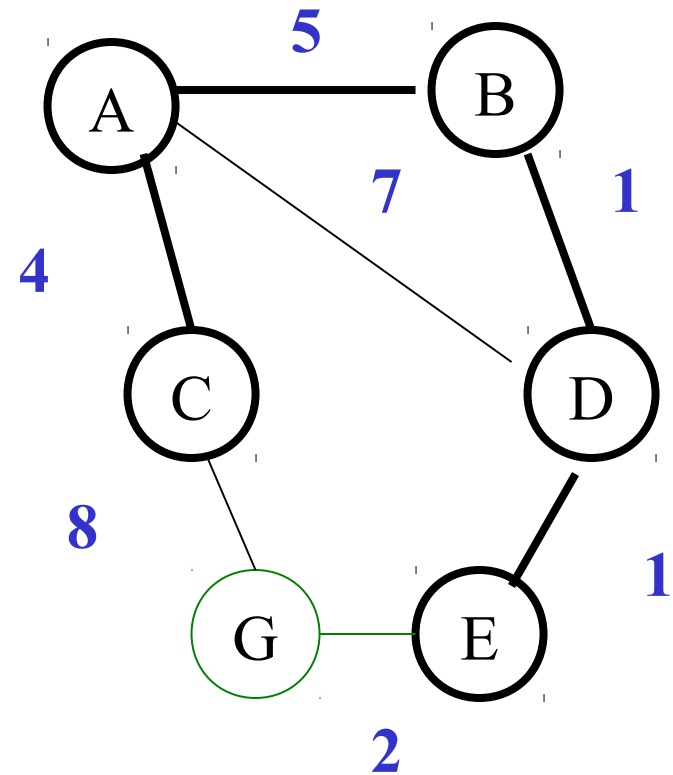
Example

Step:	1	2	3	4
Node	SLD	SLD	SLD	SLD
A	Tx0			
B	FA5	FA5	TA5	
C	FA4	TA4		
D	FA7	FA7	FB6	TB6
E	Nxx	Nxx	Nxx	FD7
G	Nxx	FC12	FC12	FC12



Example

Step:	1	2	3	4	5
Node	SLD	SLD	SLD	SLD	SLD
A	Tx0				
B	FA5	FA5	TA5		
C	FA4	TA4			
D	FA7	FA7	FB6	TB6	
E	Nxx	Nxx	Nxx	FD7	TD7
G	Nxx	RC12	FC12	FC12	FE9



Example

Step:	1	2	3	4	5	6
Node	SLD	SLD	SLD	SLD	SLD	SLD
A	Tx0					
B	FA5	FA5	TA5			
C	FA4	TA4				
D	FA7	FA7	FB6	TB6		
E	Nxx	Nxx	Nxx	FD7	TD7	
G	Nxx	FC12	FC12	FC12	FE9	TE9

