

# Section 11

CSCI E-22

Will Begin Shortly

## Double Hashing

Recall:

- Double Hashing is a collision resolution scheme that uses *a second hash function*
  - $h1(x)$  computes the hash code
  - $h2(x)$  computes the interval for probing

# Double Hashing

Recall:

- Double Hashing is a collision resolution scheme that uses *a second* hash function
  - $h1(x)$  computes the hash code
  - $h2(x)$  computes the interval for probing
- Combines good features of linear and quadratic probing
  - Reduces clustering
  - Can be proven to *always* find an open position if there is one, so long as the length of the table is a prime number

# Double Hashing

For our example, we'll use the same keys from last time, and the following hash functions

- $h1(x)$ : index related to the first letter of the word ( $a = 0, b = 1, \dots$ )
- $h2(x)$ : length of the word ( $h2(\text{"apple"}) = 5$ )

## Double Hashing

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Let's go through inserting elements using double hashing and count the total length of the probes.

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing



apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 1

$h1(\text{apple}) = 0$

0	apple
1	
2	
3	
4	
5	
6	

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 2

$h1(\text{apple}) = 0$

$h1(\text{cat}) = 2$

0	apple
1	
2	cat
3	
4	
5	
6	

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 3

0	apple
1	
2	cat
3	
4	
5	
6	

$h1(\text{apple}) = 0$

$h1(\text{cat}) = 2$

$h1(\text{anvil}) = 0$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 4

0	apple
1	
2	cat
3	
4	
5	anvil
6	

$h1(\text{apple}) = 0$

$h1(\text{cat}) = 2$

$h1(\text{anvil}) = 0$

$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 5

0	apple
1	boy
2	cat
3	
4	
5	anvil
6	

$h1(\text{apple}) = 0$

$h1(\text{cat}) = 2$

$h1(\text{anvil}) = 0$

$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$

$h1(\text{boy}) = 1$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 6

0	apple
1	boy
2	cat
3	
4	
5	anvil
6	

$h1(\text{apple}) = 0$

$h1(\text{cat}) = 2$

$h1(\text{anvil}) = 0$

$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$

$h1(\text{boy}) = 1$

$h1(\text{bag}) = 1$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 7

0	apple
1	boy
2	cat
3	
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 8

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 9

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cup}) = 2$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 10

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cup}) = 2$$

$$h1(\text{cat}) = 2$$

$$h1(\text{cup}) + 1 * h2(\text{cup}) = 5$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 11

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

$$h1(\text{cup}) = 2$$

$$h1(\text{cup}) + 1 * h2(\text{cup}) = 5$$

$$(h1(\text{cup}) + 2 * h2(\text{cup})) \% 7 = 1$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 12

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

$$h1(\text{cup}) = 2$$

$$h1(\text{cup}) + 1 * h2(\text{cup}) = 5$$

$$(h1(\text{cup}) + 2 * h2(\text{cup})) \% 7 = 1$$

$$(h1(\text{cup}) + 3 * h2(\text{cup})) \% 7 = 4$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 13

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

$$h1(\text{cup}) = 2$$

$$h1(\text{cup}) + 1 * h2(\text{cup}) = 5$$

$$(h1(\text{cup}) + 2 * h2(\text{cup})) \% 7 = 1$$

$$(h1(\text{cup}) + 3 * h2(\text{cup})) \% 7 = 4$$

$$(h1(\text{cup}) + 4 * h2(\text{cup})) \% 7 = 0$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 14

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	

$$h1(\text{apple}) = 0$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5 \quad (h1(\text{cup}) + 5 * h2(\text{cup})) \% 7 = 3$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

$$h1(\text{cup}) = 2$$

$$h1(\text{cup}) + 1 * h2(\text{cup}) = 5$$

$$(h1(\text{cup}) + 2 * h2(\text{cup})) \% 7 = 1$$

$$(h1(\text{cup}) + 3 * h2(\text{cup})) \% 7 = 4$$

$$(h1(\text{cup}) + 4 * h2(\text{cup})) \% 7 = 0$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 15

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	cup

$$h1(\text{apple}) = 0$$

$$h1(\text{cat}) = 2$$

$$h1(\text{anvil}) = 0$$

$$h1(\text{anvil}) + 1 * h2(\text{anvil}) = 0 + 5 = 5$$

$$h1(\text{boy}) = 1$$

$$h1(\text{bag}) = 1$$

$$h1(\text{bag}) + 1 * h2(\text{bag}) = 1 + 3 = 4$$

$$h1(\text{dog}) = 3$$

$$h1(\text{cup}) = 2$$

$$h1(\text{cup}) + 1 * h2(\text{cup}) = 5$$

$$(h1(\text{cup}) + 2 * h2(\text{cup})) \% 7 = 1$$

$$(h1(\text{cup}) + 3 * h2(\text{cup})) \% 7 = 4$$

$$(h1(\text{cup}) + 4 * h2(\text{cup})) \% 7 = 0$$

$$(h1(\text{cup}) + 5 * h2(\text{cup})) \% 7 = 3$$

$$(h1(\text{cup}) + 6 * h2(\text{cup})) \% 7 = 6$$

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 15

0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	cup

We cannot insert “down” because the table is full. Using double hashing, when the size of the hash table is a prime number, detecting that we have overflow is linear in the size of the hash table.

apple, cat, anvil, boy, bag, dog, cup, down

## Double Hashing

Probe length: 22

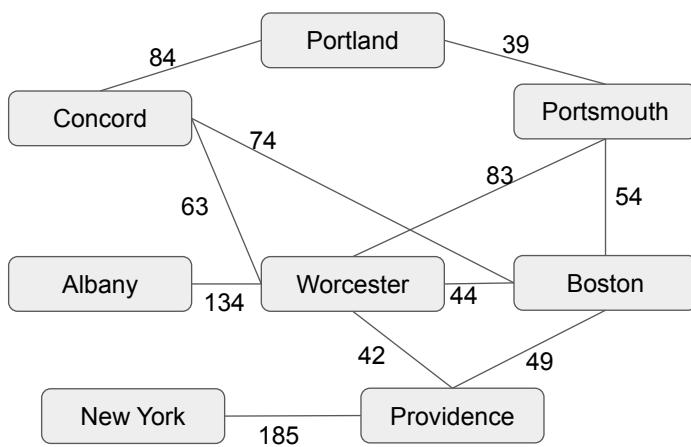
0	apple
1	boy
2	cat
3	dog
4	bag
5	anvil
6	cup

We cannot insert "down" because the table is full. Using double hashing, when the size of the hash table is a prime number, detecting that we have overflow is linear in the size of the hash table.

Total probe length = 15 + 7 (for the probe length of "down") = **22**

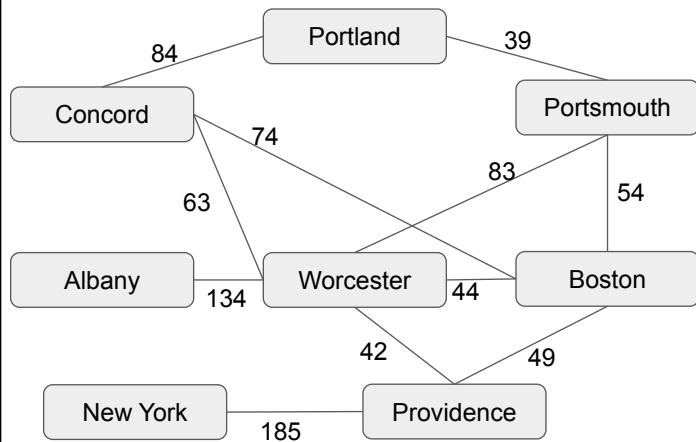
## Graph Terminology and Representation

Consider the graph from lecture:



# Graph Terminology and Representation

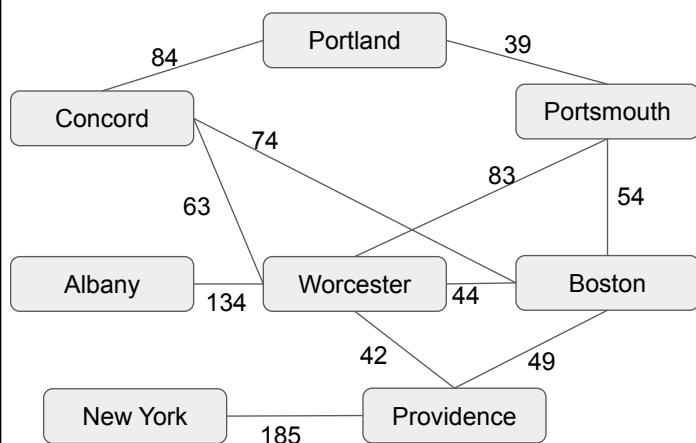
Consider the graph from lecture:



What are Worcester's neighbors in the graph?

# Graph Terminology and Representation

Consider the graph from lecture:

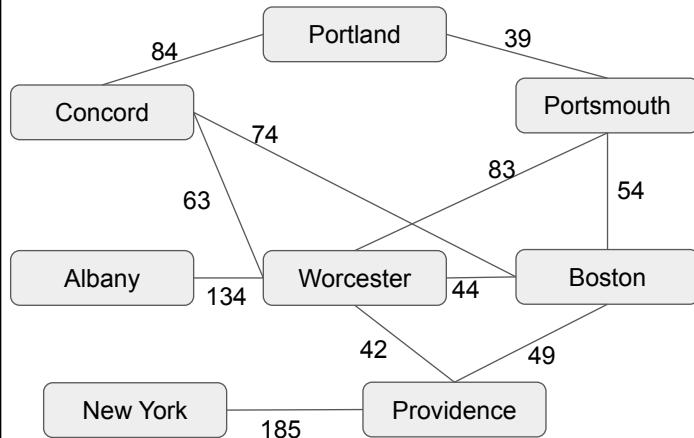


What are Worcester's neighbors in the graph?

Albany, Boston, Concord, Portsmouth, and Providence, because it is connected to each of them by a single edge.

# Graph Terminology and Representation

Consider the graph from lecture:



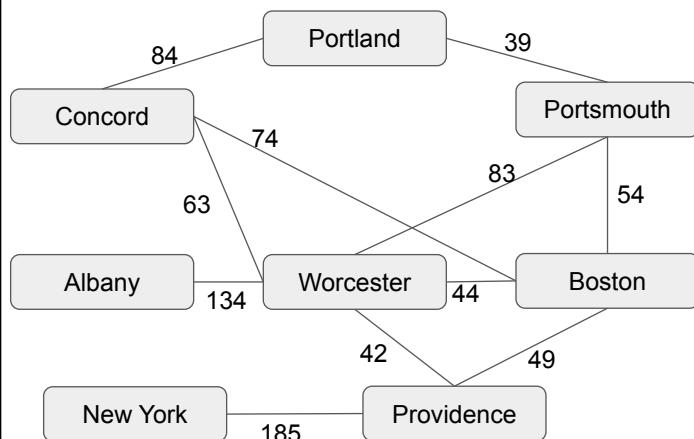
What are Worcester's neighbors in the graph?

**Albany, Boston, Concord, Portsmouth, and Providence, because it is connected to each of them by a single edge.**

Is the graph connected? Why or why not?

# Graph Terminology and Representation

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What are Worcester's neighbors in the graph?

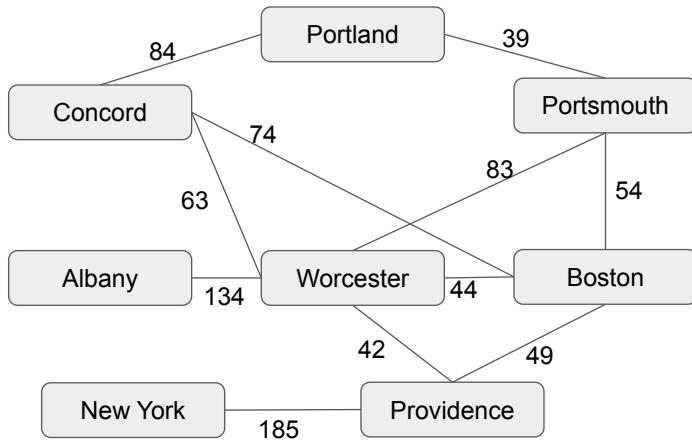
**Albany, Boston, Concord, Portsmouth, and Providence, because it is connected to each of them by a single edge.**

Is the graph connected? Why or why not?

**Yes, because there is a path between every pair of vertices.**

# Graph Terminology and Representation

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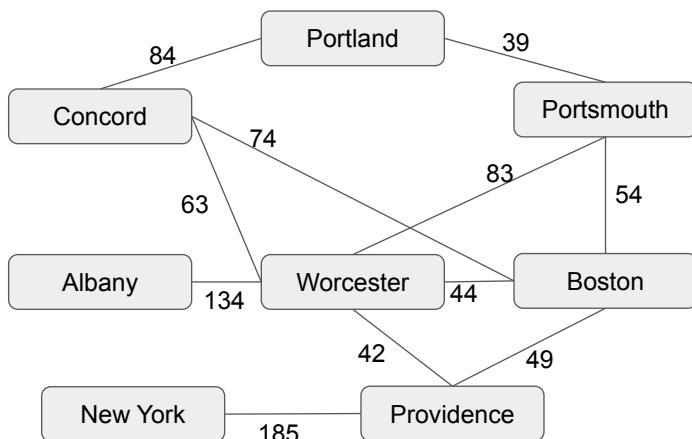
Is the graph connected? Why or why not?

**Yes, because there is a path between every pair of vertices.**

Is it complete? Why or why not?

# Graph Terminology and Representation

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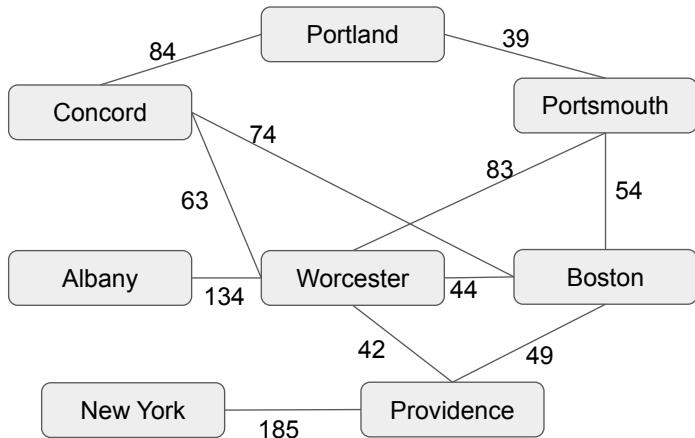
**Yes, because there is a path between every pair of vertices.**

Is it complete? Why or why not?

**It is not, because there is not an edge between every pair of vertices.**

# Graph Terminology and Representation

Consider the graph from lecture:



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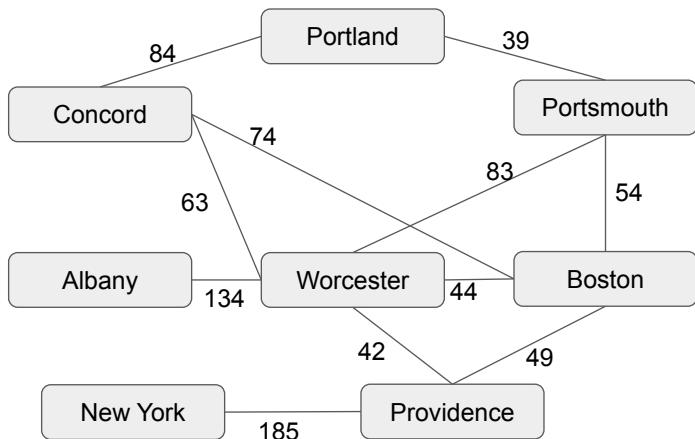
Is it complete? Why or why not?

**It is not, because there is not an edge between every pair of vertices.**

Is it acyclic? If not, give an example cycle.

# Graph Terminology and Representation

Consider the graph from lecture:



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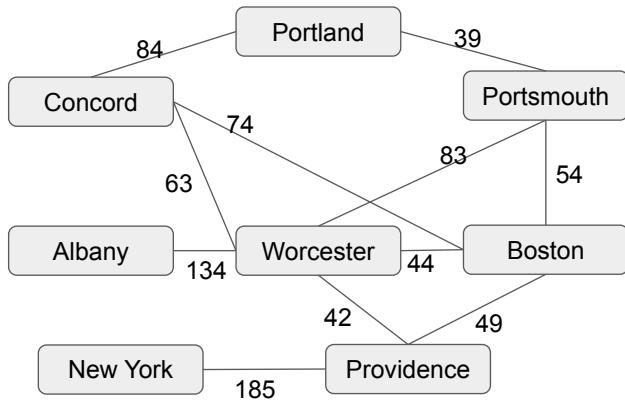
Is it complete? Why or why not?

**It is not, because there is not an edge between every pair of vertices.**

Is it acyclic? If not, give an example cycle.

**Not acyclic; Worcester > Boston > Providence > Worcester**

# Graph Terminology and Representation

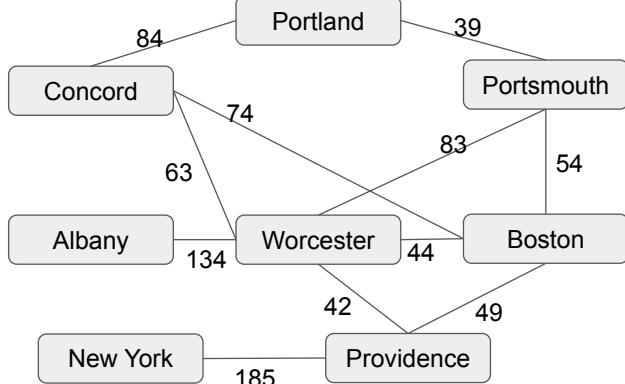


If we used an adjacency matrix to represent this graph, what would it look like? Assume that the vertices are numbered alphabetically, starting from zero:

0. Albany
1. Boston
2. Concord
3. New York
4. Portland
5. Portsmouth
6. Providence
7. Worcester

0: Albany, 1: Boston, 2: Concord, 3: NY, 4: Portland, 5: Portsmouth, 6: Providence, 7: Worcester

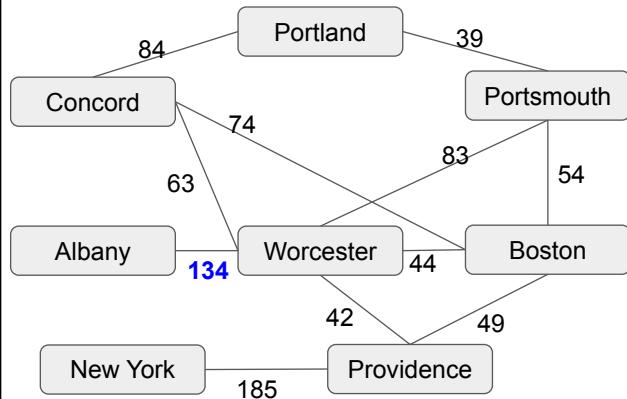
# Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								
1								
2								
3								
4								
5								
6								
7								

0: Albany, 1: Boston, 2: Concord, 3: NY, 4: Portland, 5: Portsmouth, 6: Providence, 7: Worcester

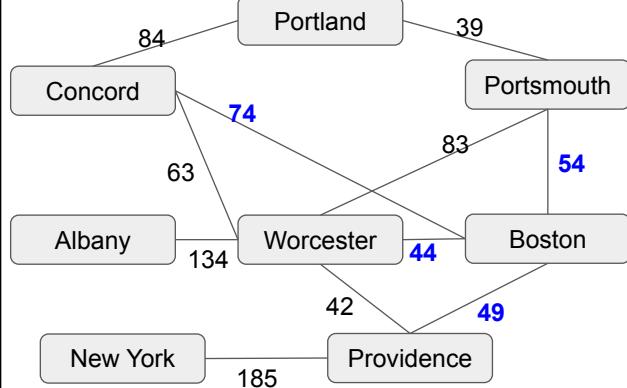
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1								
2								
3								
4								
5								
6								
7	134							

0: Albany, 1: Boston, 2: Concord, 3: NY, 4: Portland, 5: Portsmouth, 6: Providence, 7: Worcester

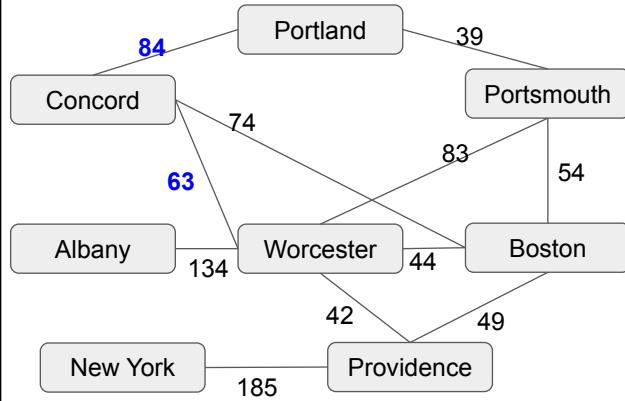
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1							54	49
2			74					
3								
4								
5						54		
6						49		
7	134	44						

0: Albany, 1: Boston, 2: Concord, 3: NY, 4: Portland, 5: Portsmouth, 6: Providence, 7: Worcester

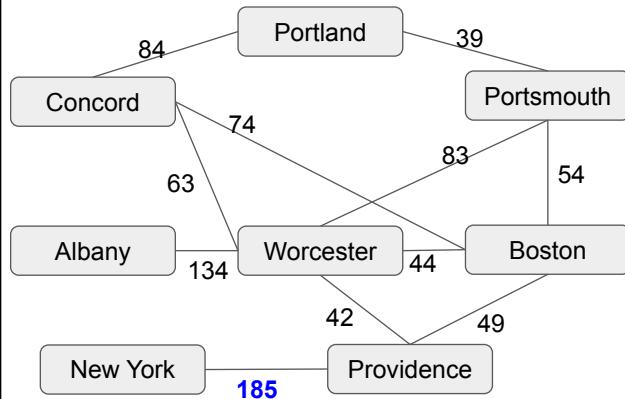
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1			74			54	49	44
2		74			84			63
3								
4			84					
5		54						
6		49						
7	134	44	63					

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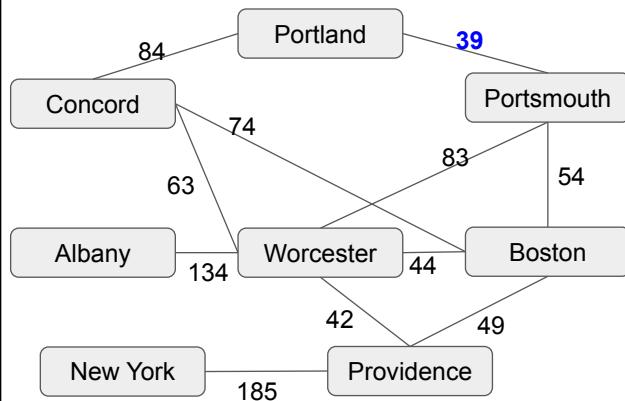
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1			74			54	49	44
2		74			84			63
3								185
4			84					
5		54						
6		49		185				
7	134	44	63					

0: Albany, 1: Boston, 2: Concord, 3: NY, 4: Portland, 5: Portsmouth, 6: Providence, 7: Worcester

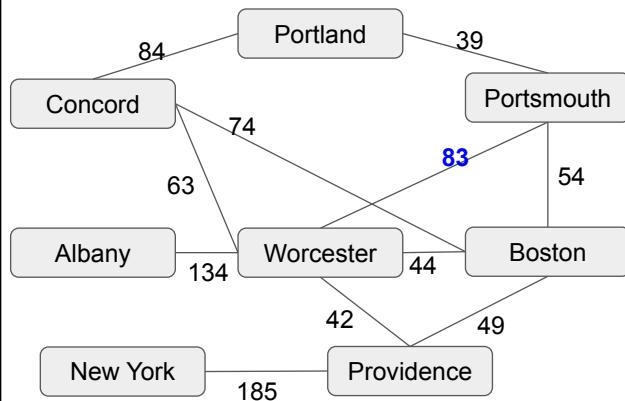
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1			74			54	49	44
2		74			84			63
3								185
4			84			39		
5		54			39			
6		49		185				
7	134	44	63					

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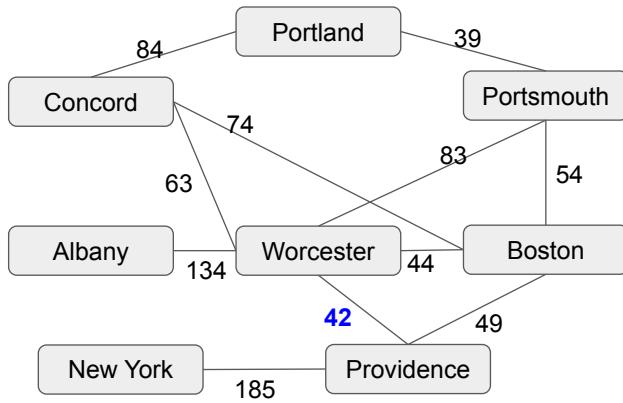
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1			74			54	49	44
2		74			84			63
3								185
4			84			39		
5		54			39			83
6		49		185				
7	134	44	63			83		

0: Albany, 1: Boston, 2: Concord, 3: NY, 4: Portland, 5: Portsmouth, 6: Providence, 7: Worcester

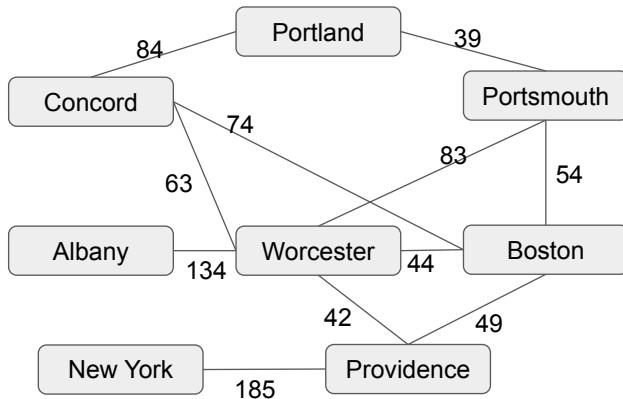
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1			74			54	49	44
2		74			84			63
3								185
4			84			39		
5		54			39			83
6		49		185				42
7	134	44	63			83	42	

0: Albany, 1: Boston, 2: Concord, 3: NY, 4: Portland, 5: Portsmouth, 6: Providence, 7: Worcester

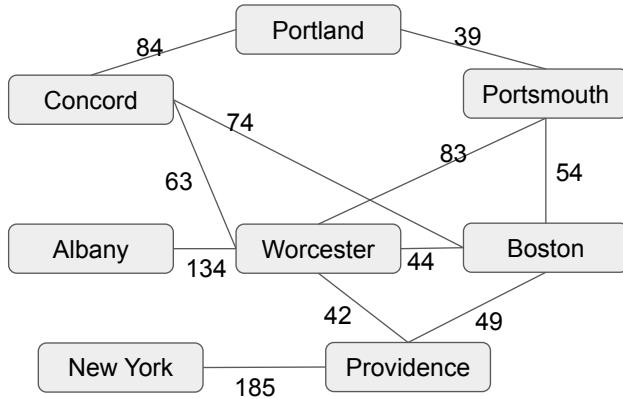
## Graph Terminology and Representation



	0	1	2	3	4	5	6	7
0								134
1			74			54	49	44
2		74			84			63
3								185
4			84			39		
5		54			39			83
6		49		185				42
7	134	44	63			83	42	

# Graph Traversals

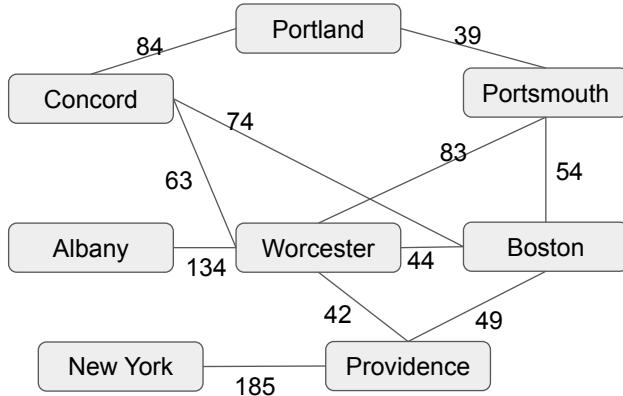
In what order would the cities be visited if we performed a **depth-first traversal** from Boston?  
Draw the resulting spanning tree.



# Graph Traversals

In what order would the cities be visited if we performed a **depth-first traversal** from Boston?  
Draw the resulting spanning tree.

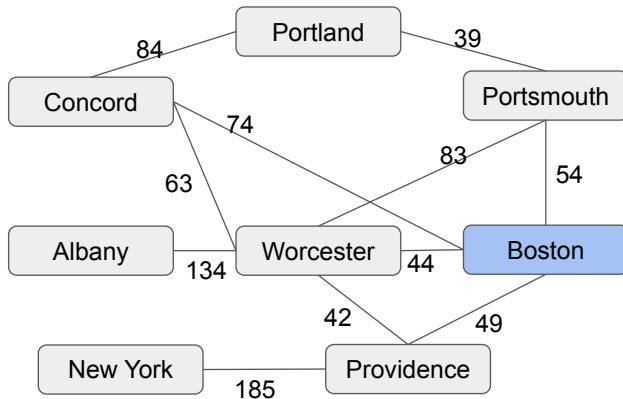
Remember that we assume adjacency lists sort edges in order of increasing weight!



Boston,

## Graph Traversals

dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

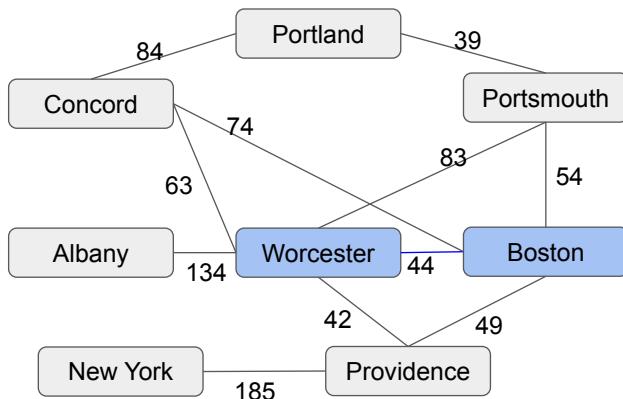


Boston, Worcester,

## Graph Traversals

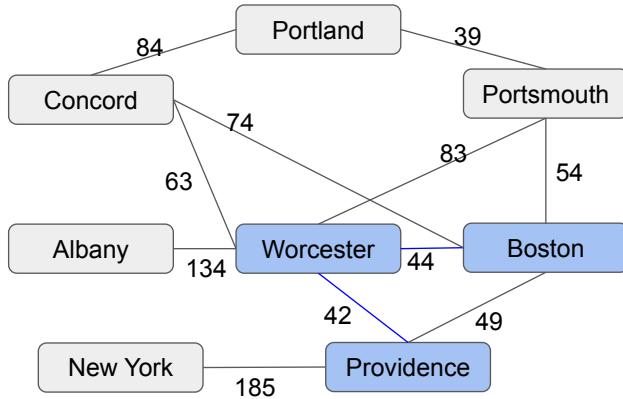
dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): visit Worcester, set its parent reference to Boston, make a recursive call on closest neighbor, Providence



Boston, Worcester, Providence,

## Graph Traversals



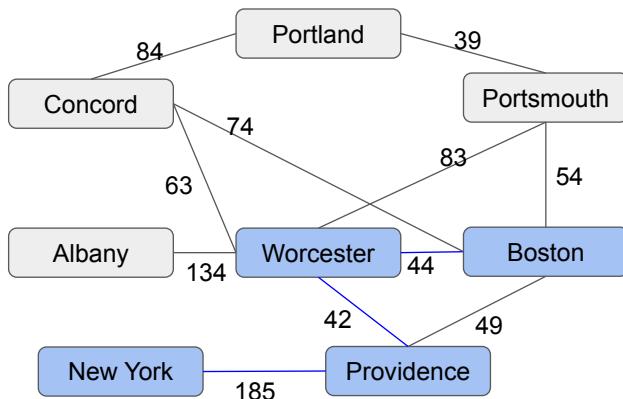
dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): visit Worcester, set its parent reference to Boston, make a recursive call on closest neighbor, Providence

dfTrav(Providence, Worcester): visit Providence, set its parent reference to Worcester, recurse to nearest *unvisited* neighbor, New York

Boston, Worcester, Providence, NY,

## Graph Traversals



dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

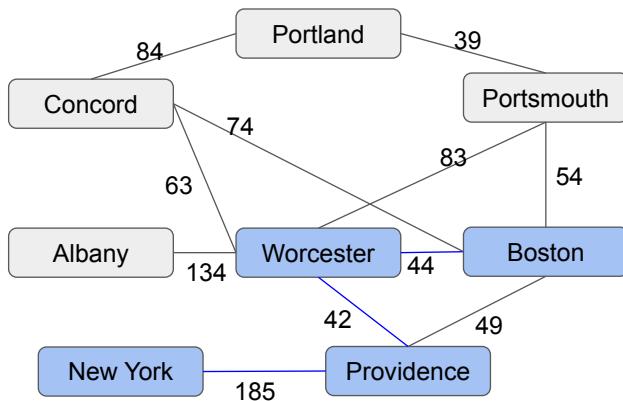
dfTrav(Worcester, Boston): visit Worcester, set its parent reference to Boston, make a recursive call on closest neighbor, Providence

dfTrav(Providence, Worcester): visit Providence, set its parent reference to Worcester, recurse to nearest *unvisited* neighbor, New York

dfTrav(New York, Providence): visit NY, set its parent reference to Providence. No unvisited neighbors, so **return**.

Boston, Worcester, Providence, NY,

## Graph Traversals



dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

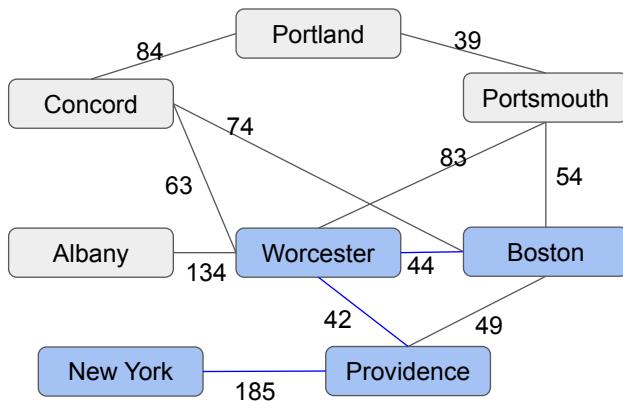
dfTrav(Worcester, Boston): visit Worcester, set its parent reference to Boston, make a recursive call on closest neighbor, Providence

dfTrav(Providence, Worcester): visit Providence, set its parent reference to Worcester, recurse to nearest *unvisited* neighbor, New York

- Providence has no unvisited neighbors, so **return**

Boston, Worcester, Providence, NY,

## Graph Traversals

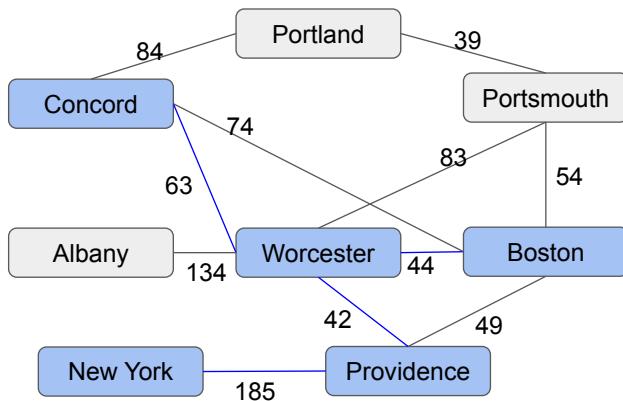


dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Concord**

Boston, Worcester, Providence, NY, Concord

## Graph Traversals



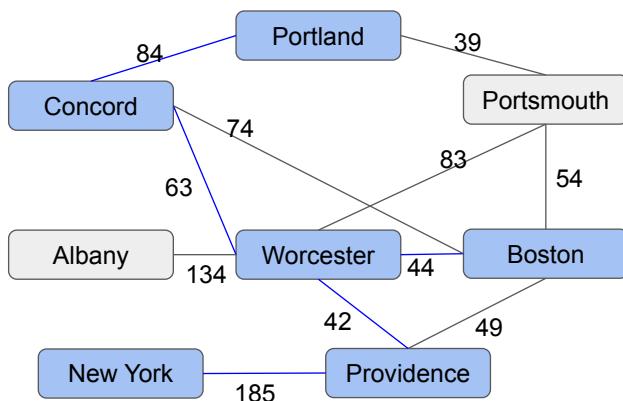
dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Concord**

dfTrav(Concord, Worcester): visit Concord, set its parent reference to Worcester, and recurse on nearest *unvisited* neighbor, **Portland**

Boston, Worcester, Providence, NY, Concord, Portland

## Graph Traversals



dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

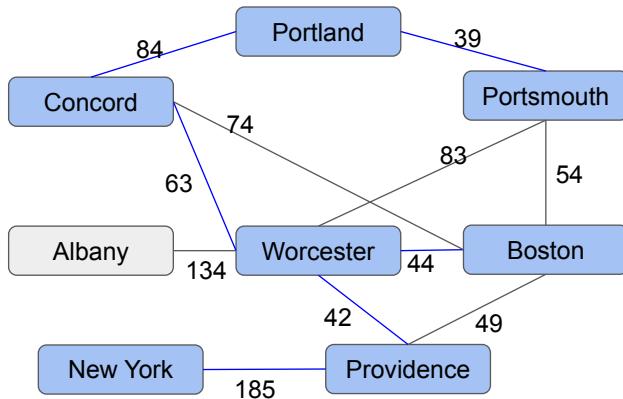
dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Concord**

dfTrav(Concord, Worcester): visit Concord, set its parent reference to Worcester, and recurse on nearest *unvisited* neighbor, **Portland**

dfTrav(Portland, Concord): visit Portland, set its parent reference to Concord, and recurse on Portsmouth

Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth,

## Graph Traversals



dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Concord**

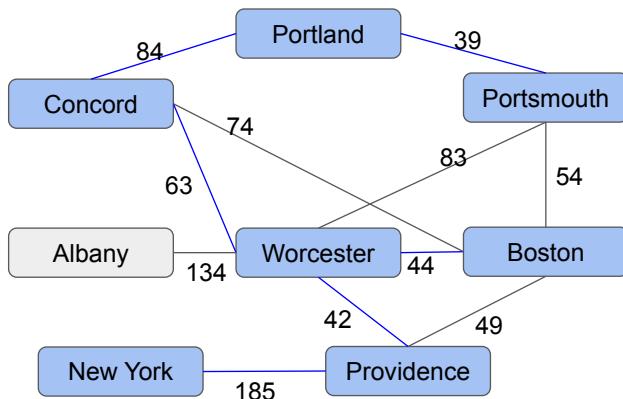
dfTrav(Concord, Worcester): visit Concord, set its parent reference to Worcester, and recurse on nearest *unvisited* neighbor, **Portland**

dfTrav(Portland, Concord): visit Portland, set its parent reference to Concord, and recurse on Portsmouth

dfTrav(Portsmouth, Portland): visit Portsmouth, set its parent reference to Portland. No unvisited neighbors, so **return**

Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth,

## Graph Traversals



dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Concord**

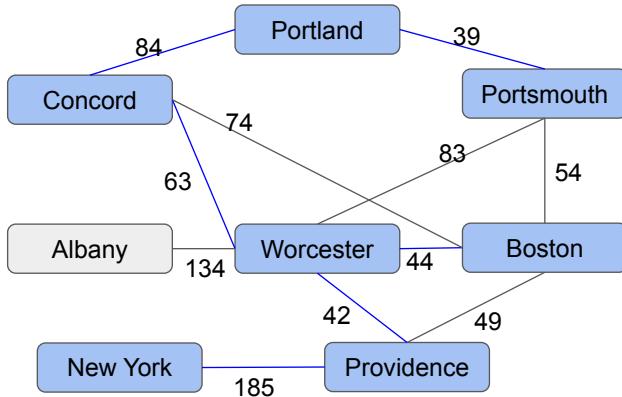
dfTrav(Concord, Worcester): visit Concord, set its parent reference to Worcester, and recurse on nearest *unvisited* neighbor, **Portland**

dfTrav(Portland, Concord): visit Portland, set its parent reference to Concord, and recurse on Portsmouth

- Portland has no unvisited neighbors, so **return**

Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth,

## Graph Traversals



dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

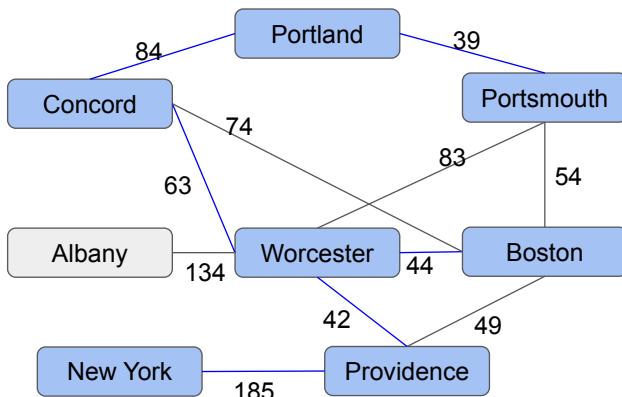
dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Concord**

dfTrav(Concord, Worcester): visit Concord, set its parent reference to Worcester, and recurse on nearest *unvisited* neighbor, **Portland**

- Concord has no unvisited neighbors, so **return**

Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth,

## Graph Traversals

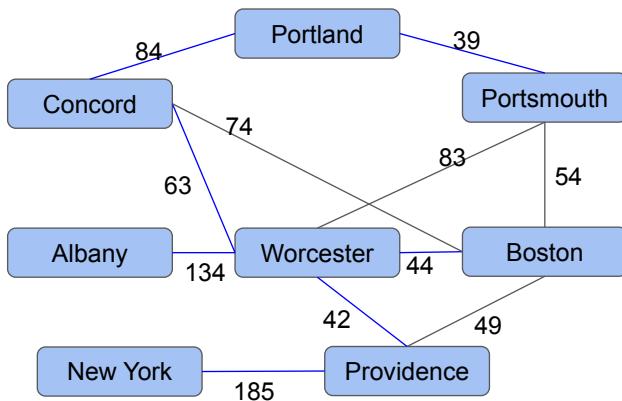


dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Albany**

Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth, Albany

## Graph Traversals



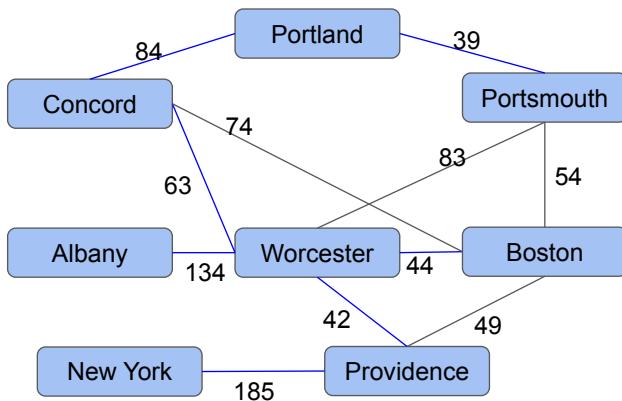
dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Albany**

dfTrav(Albany, Worcester): visit Albany, set its parent reference to Worcester. No unvisited neighbors, so **return**

Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth, Albany

## Graph Traversals



dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

dfTrav(Worcester, Boston): Worcester still has unvisited neighbors, so we recurse on the next closest one: **Albany**

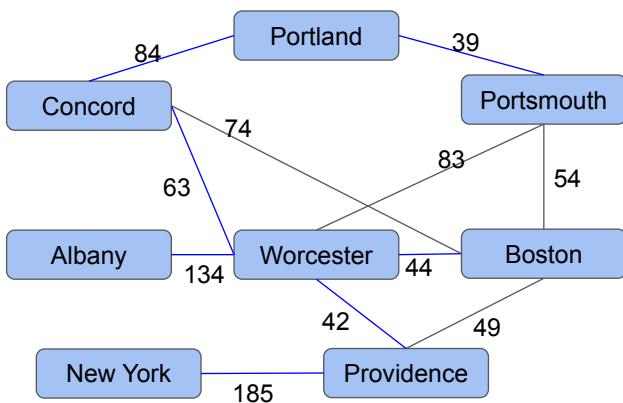
- Worcester has no unvisited neighbors, so **return**

Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth, Albany

## Graph Traversals

dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

- Boston has no unvisited neighbors, so we return, and complete the DF traversal!

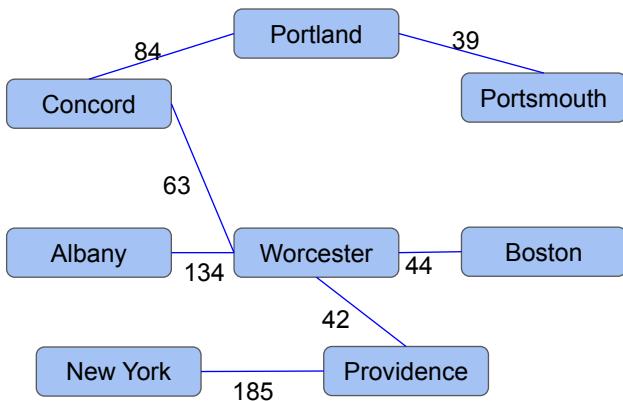


Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth, Albany

## Graph Traversals

dfTrav(Boston, null): visit Boston, set its parent reference to null, and make a recursive call on closest neighbor, Worcester

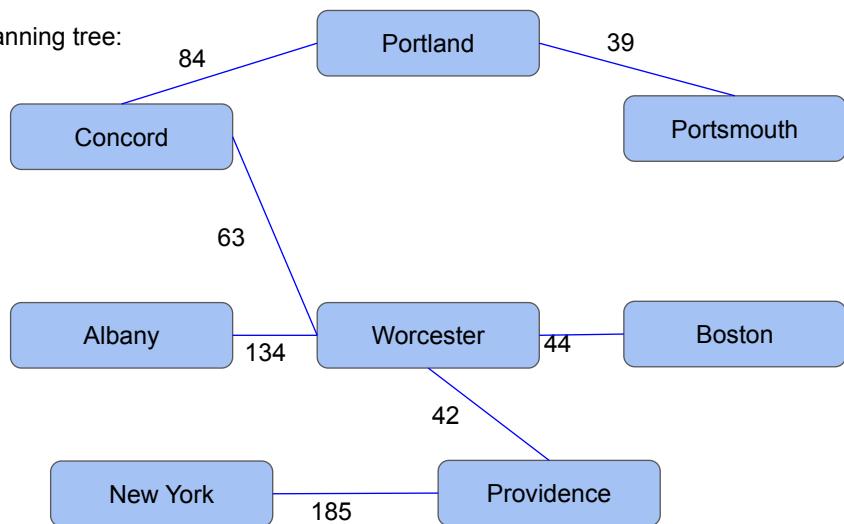
- Boston has no unvisited neighbors, so we return, and complete the DF traversal!



Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth, Albany

## Graph Traversals

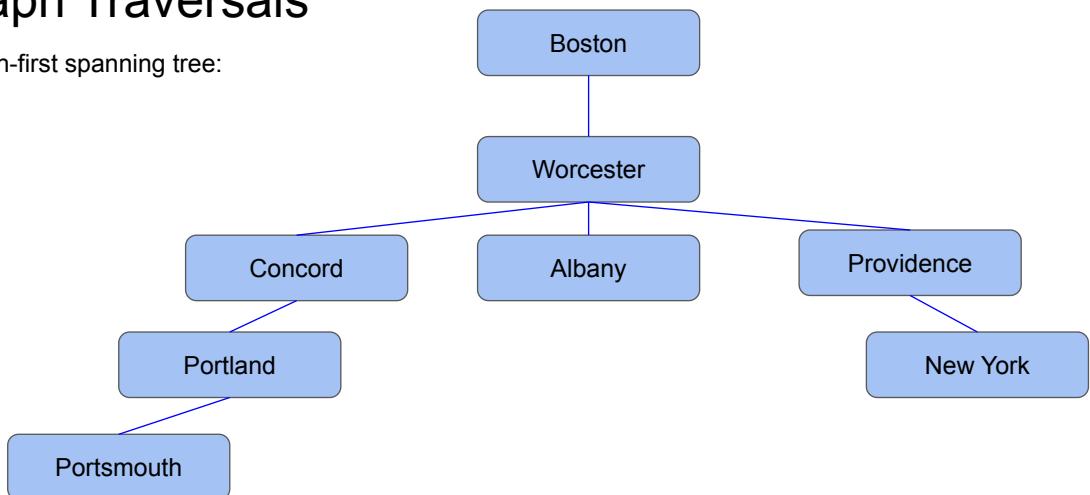
Our depth-first spanning tree:



Boston, Worcester, Providence, NY, Concord, Portland, Portsmouth, Albany

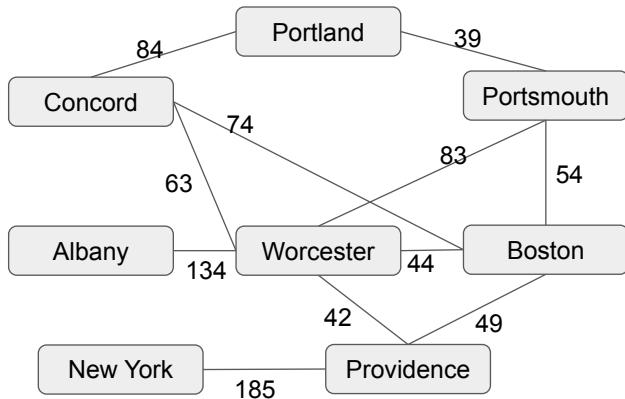
## Graph Traversals

Our depth-first spanning tree:



# Graph Traversals

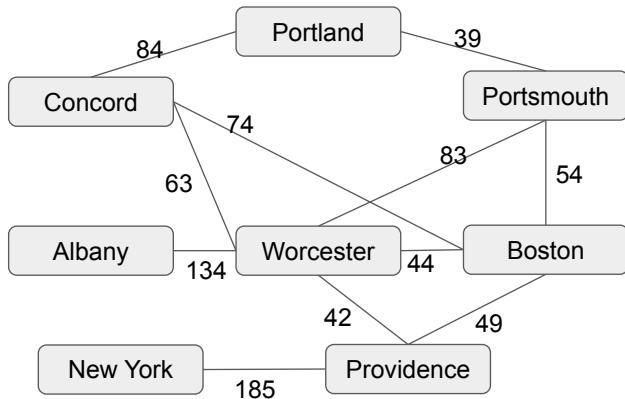
In what order would the cities be visited if we performed a **breadth-first traversal** from Boston? Draw the resulting spanning tree.



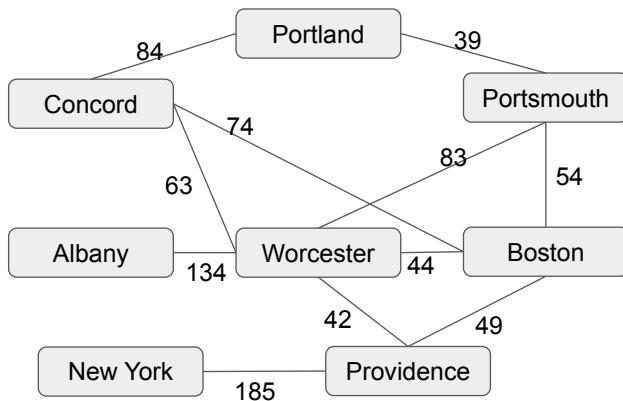
# Graph Traversals

In what order would the cities be visited if we performed a **breadth-first traversal** from Boston? Draw the resulting spanning tree.

Remember, with breadth-first traversal, we mark a node as “encountered” *before* it’s put into the queue, and visit it after it’s dequeued.



# Graph Traversals

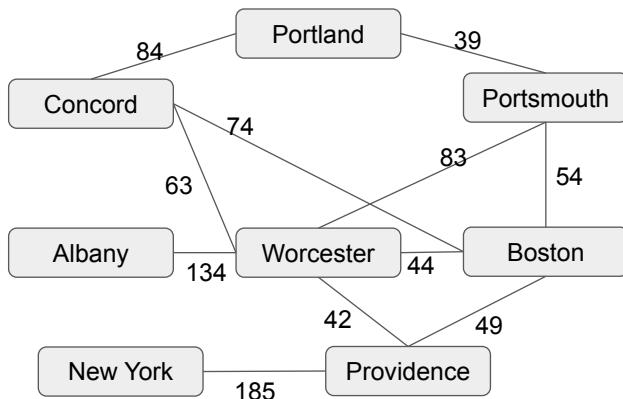


In what order would the cities be visited if we performed a **breadth-first traversal** from Boston? Draw the resulting spanning tree.

Remember, with breadth-first traversal, we mark a node as “encountered” *before* it’s put into the queue, and visit it after it’s dequeued.

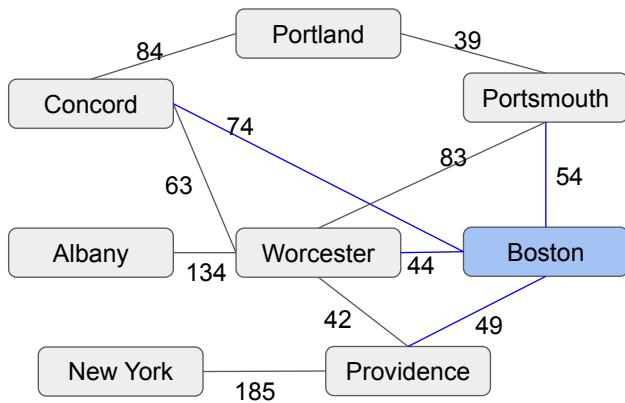
We set parent references when we “encounter” a node.

# Graph Traversals



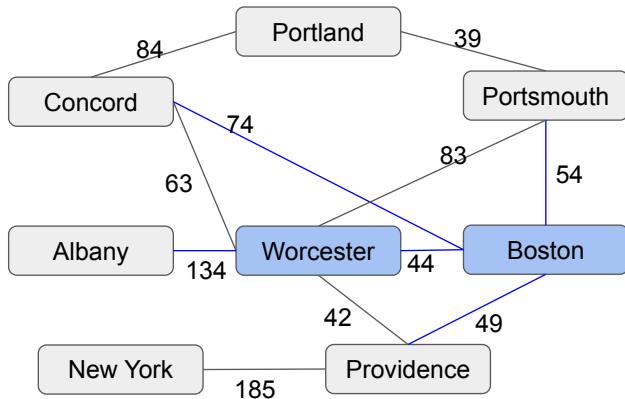
Boston,

# Graph Traversals



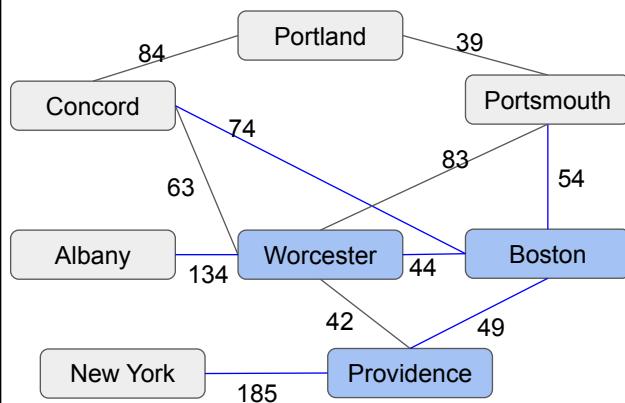
Boston, Worcester,

# Graph Traversals



Boston, Worcester, Providence

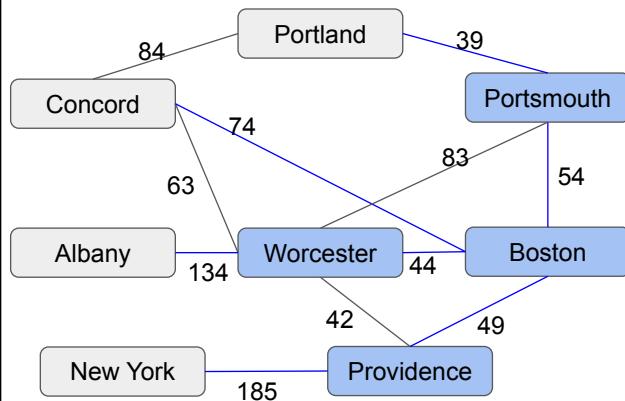
## Graph Traversals



remove	insert	queue contents
	Boston	Boston
Boston	Worcester, Providence, Portsmouth, Concord	Worcester, Providence, Portsmouth, Concord
Worcester	Albany	Providence, Portsmouth, Concord, Albany
Providence	NY	Portsmouth, Concord, Albany, NY

Boston, Worcester, Providence, Portsmouth

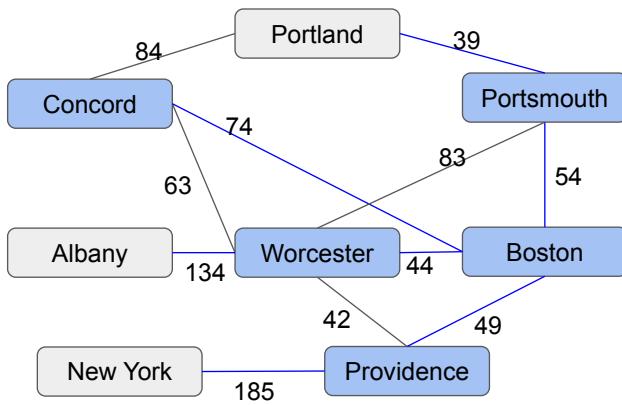
## Graph Traversals



remove	insert	queue contents
	Boston	Boston
Boston	Worcester, Providence, Portsmouth, Concord	Worcester, Providence, Portsmouth, Concord
Worcester	Albany	Providence, Portsmouth, Concord, Albany
Providence	NY	Portsmouth, Concord, Albany, NY
Portsmouth	Portland	Concord, Albany, NY, Portland

Boston, Worcester, Providence, Portsmouth, Concord,

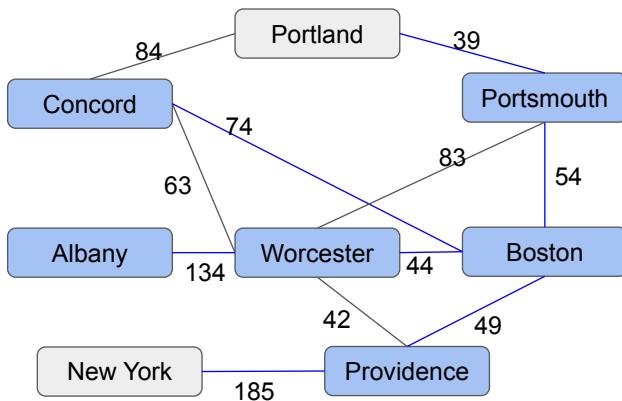
## Graph Traversals



remove	insert	queue contents
	Boston	Boston
Boston	Worcester, Providence, Portsmouth, Concord	Worcester, Providence, Portsmouth, Concord
Worcester	Albany	Providence, Portsmouth, Concord, Albany
Providence	NY	Portsmouth, Concord, Albany, NY
Portsmouth	Portland	Concord, Albany, NY, Portland
Concord	none	Albany, NY, Portland

Boston, Worcester, Providence, Portsmouth, Concord, Albany,

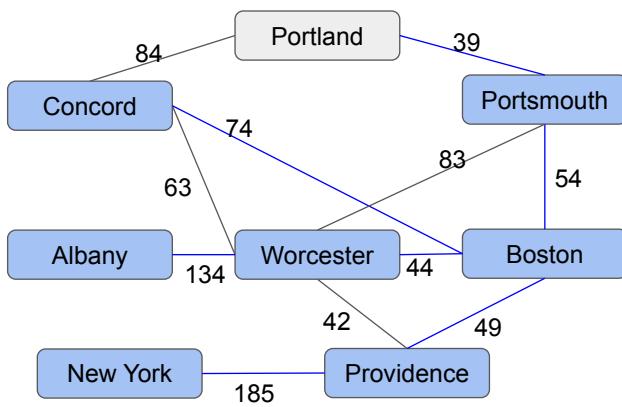
## Graph Traversals



remove	insert	queue contents
	Boston	Boston
Boston	Worcester, Providence, Portsmouth, Concord	Worcester, Providence, Portsmouth, Concord
Worcester	Albany	Providence, Portsmouth, Concord, Albany
Providence	NY	Portsmouth, Concord, Albany, NY
Portsmouth	Portland	Concord, Albany, NY, Portland
Concord	none	Albany, NY, Portland
Albany	none	NY, Portland

Boston, Worcester, Providence, Portsmouth, Concord, Albany, NY,

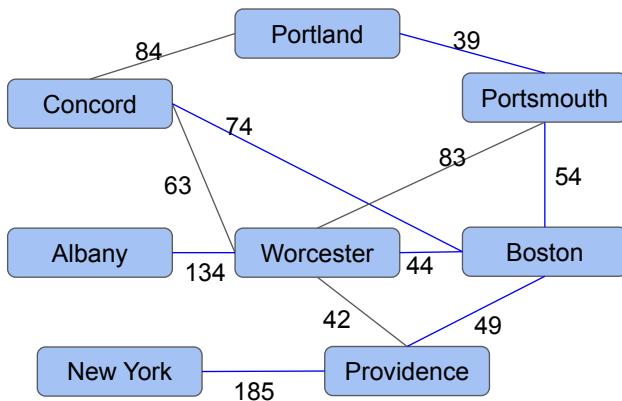
## Graph Traversals



	remove	insert	queue contents
		Boston	Boston
Boston	Worcester, Providence, Portsmouth, Concord		Worcester, Providence, Portsmouth, Concord
Worcester	Albany		Providence, Portsmouth, Concord, Albany
Providence	NY		Portsmouth, Concord, Albany, NY
Portsmouth	Portland		Concord, Albany, NY, Portland
Concord	none		Albany, NY, Portland
Albany	none		NY, Portland
NY	none		Portland

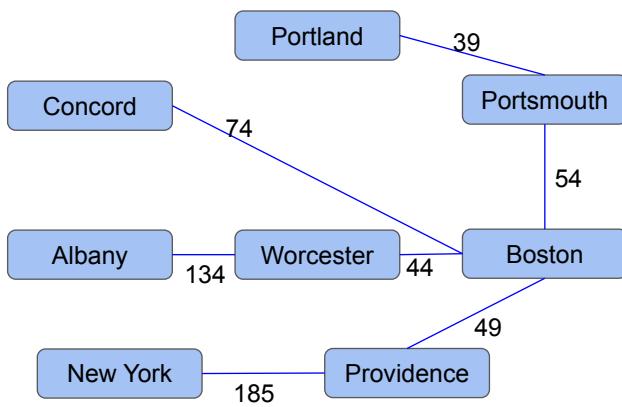
Boston, Worcester, Providence, Portsmouth, Concord, Albany, NY, Portland

## Graph Traversals



	remove	insert	queue contents
		Boston	Boston
Boston	Worcester, Providence, Portsmouth, Concord		Worcester, Providence, Portsmouth, Concord
Worcester	Albany		Providence, Portsmouth, Concord, Albany
Providence	NY		Portsmouth, Concord, Albany, NY
Portsmouth	Portland		Concord, Albany, NY, Portland
Concord	none		Albany, NY, Portland
Albany	none		NY, Portland
NY	none		Portland
Portland	none		empty

# Graph Traversals

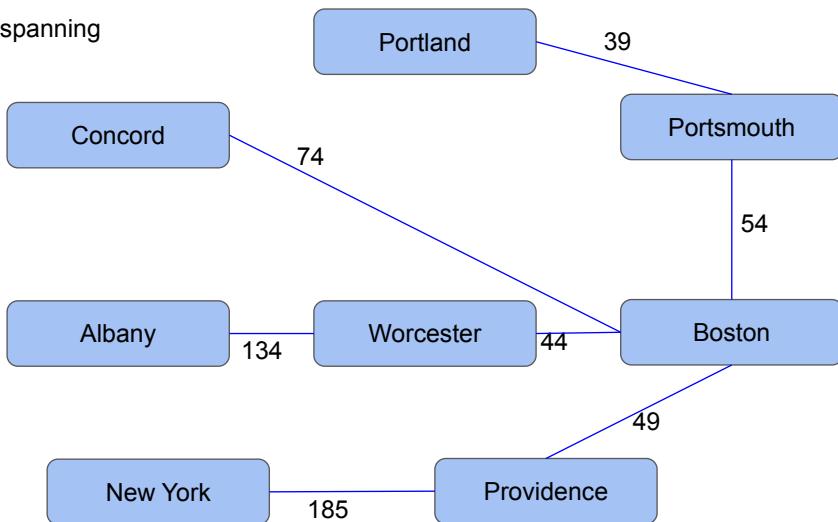


	remove	insert	queue contents
	Boston	Boston	Boston
Boston	Worcester, Providence, Portsmouth, Concord	Worcester, Providence, Portsmouth, Concord	Worcester, Providence, Portsmouth, Concord
Worcester	Albany	Providence, Portsmouth, Concord, Albany	Providence, Portsmouth, Concord, Albany
Providence	NY	Portsmouth, Concord, Albany, NY	Portsmouth, Concord, Albany, NY
Portsmouth	Portland	Concord, Albany, NY, Portland	Concord, Albany, NY, Portland
Concord	none	Albany, NY, Portland	Albany, NY, Portland
Albany	none	NY, Portland	NY, Portland
NY	none	Portland	Portland
Portland	none	empty	empty

Boston, Worcester, Providence, Portsmouth, Concord, Albany, NY, Portland

# Graph Traversals

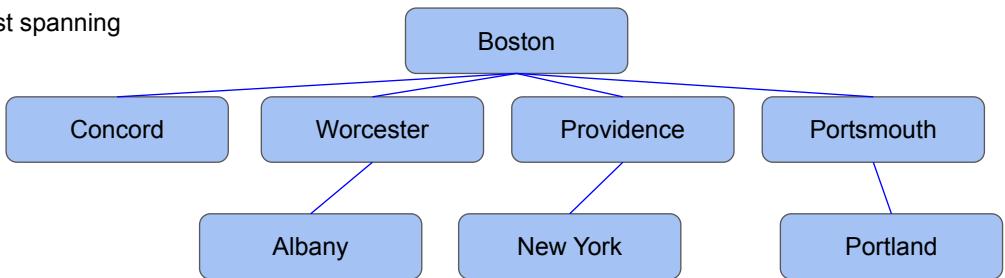
Our breadth-first spanning tree:



Boston, Worcester, Providence, Portsmouth, Concord, Albany, NY, Portland

## Graph Traversals

Our breadth-first spanning tree:



End of section.

Questions?

# Lecture 13

CSCI E-22

Will Begin Shortly