

SCC.121: Fundamentals of Computer Science

Sorting, Trees and Graphs

Shortest Paths in Graphs

Today's Lecture

Aim:

- Distances and **Shortest Paths** in graphs
- BFS in directed graphs
- Computing shortest paths in weighted graphs using **Dijkstra's algorithm**

Distances and Shortest Paths in Graphs

RAIL MAP
GREAT
BRITAIN



Distances and Shortest Paths in Graphs



Edge weight/Distance:
Time it takes to go from
London to Birmingham

Distances and Shortest Paths in Graphs



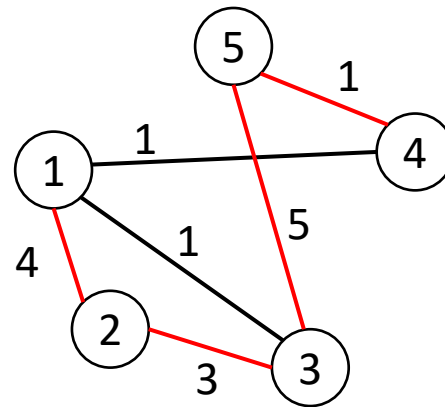
Distances and Shortest Paths in Graphs



Red Path:
Shortest path from
Manchester to Newcastle

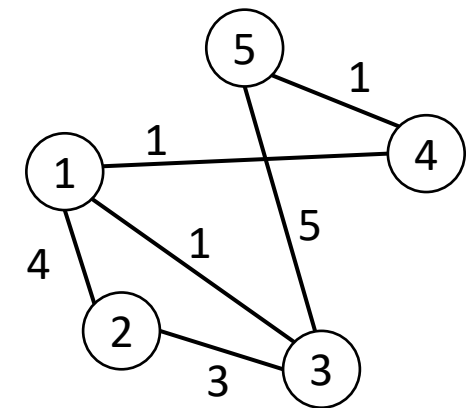
Paths

- Path between nodes u and v :
 - Sequence of (non-repeating) nodes: u, w_1, w_2, \dots, v
 - In the example, **(1,2,3,5,4)** is a path between 1 to 4



Shortest Paths

- **Shortest path** between nodes u and v = **among all paths between u and v , the path that has the smallest total edge weight**
- Example:
 - (1,2,3,5,4) is a path between 1 and 4 but not a shortest path
 - (1,4) is a shortest path between 1 and 4
 - (5,3) is a path between 5 and 3 but not a shortest path
 - (5,4,1,3) is a shortest path between 5 and 3
 - (1,2) is a shortest path between 1 and 2
 - (1,3,2) is **also** a shortest path between 1 and 2



Shortest Path Problems

1. Shortest distances (to source):

Given a graph $G = (V, E)$ and a source node s , compute the distance from all nodes $v \in V$ to s

2. Shortest paths (to source):

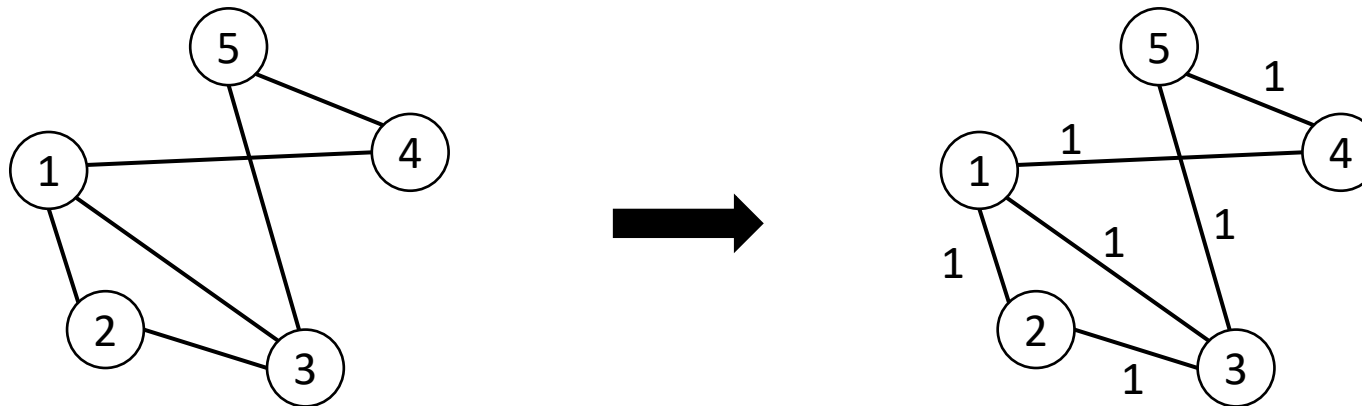
Given a graph $G = (V, E)$ and a source node s , compute for each node $v \in V$ the shortest path from v to s .

3. Pathfinding (from source to target):

Given a graph $G = (V, E)$, a source node s and a target node t , compute the shortest path from s to t .

Shortest Paths in Unweighted Graphs

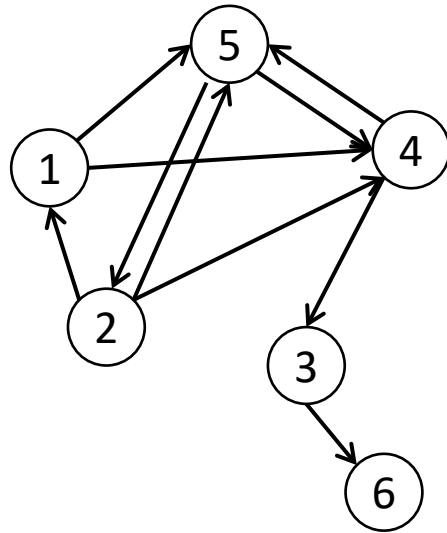
- Consider an unweighted graph G .



- BFS search** can compute shortest paths when G is an **unweighted** graph
 - Shortest path: contains less edges than any other paths
 - Even on directed graphs.

BFS Traversal on Directed Graphs

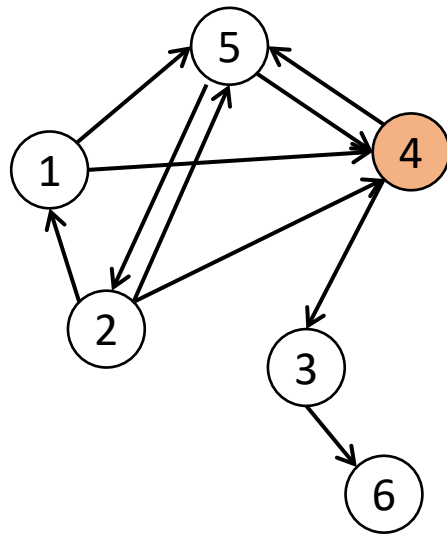
- Consider a directed, unweighted graph G .



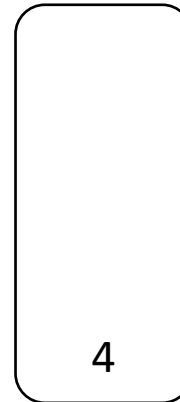
	(1)	(2)	(3)	(4)	(5)	(6)
(1)	0	0	0	1	1	0
(2)	1	0	0	1	1	0
(3)	0	0	0	0	0	1
(4)	0	0	1	0	1	0
(5)	0	1	0	1	0	0
(6)	0	0	0	0	0	0

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



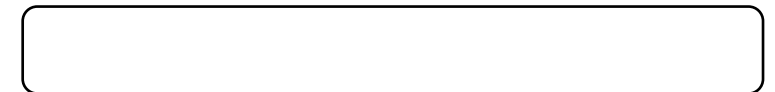
Queue



Traversal

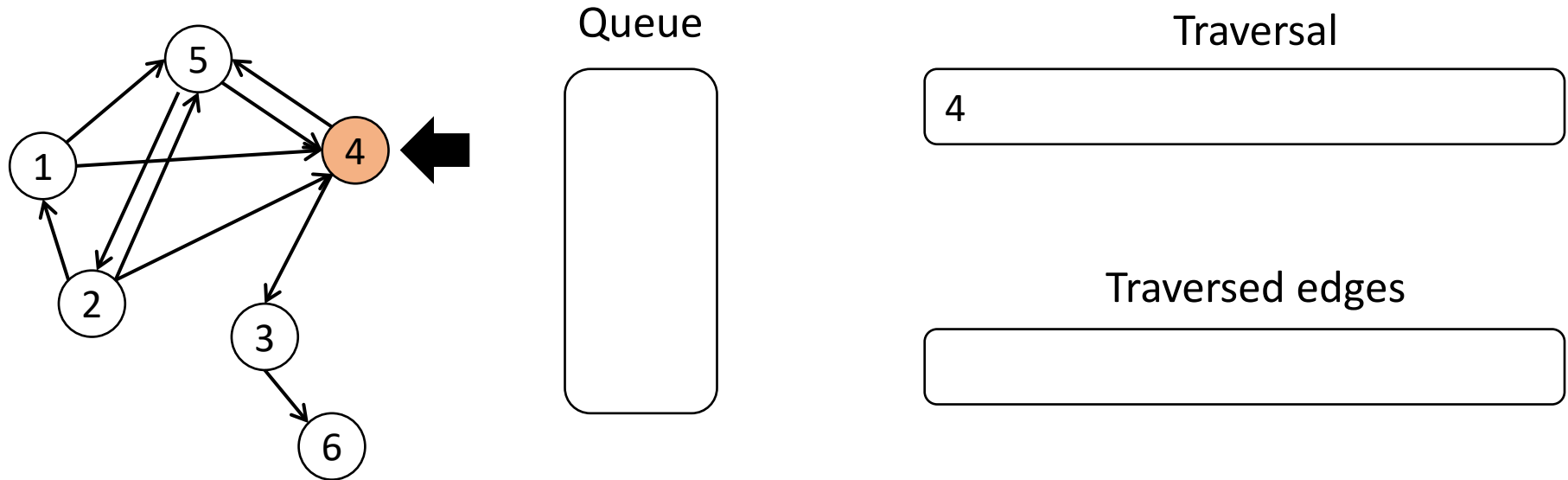


Traversed edges



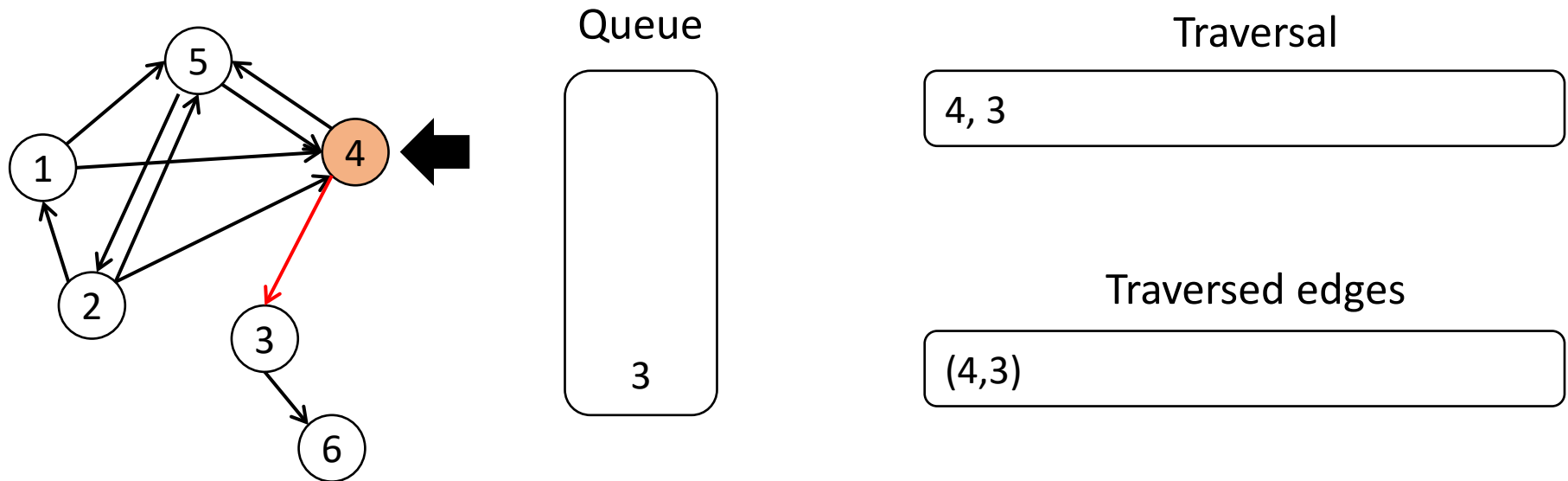
BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



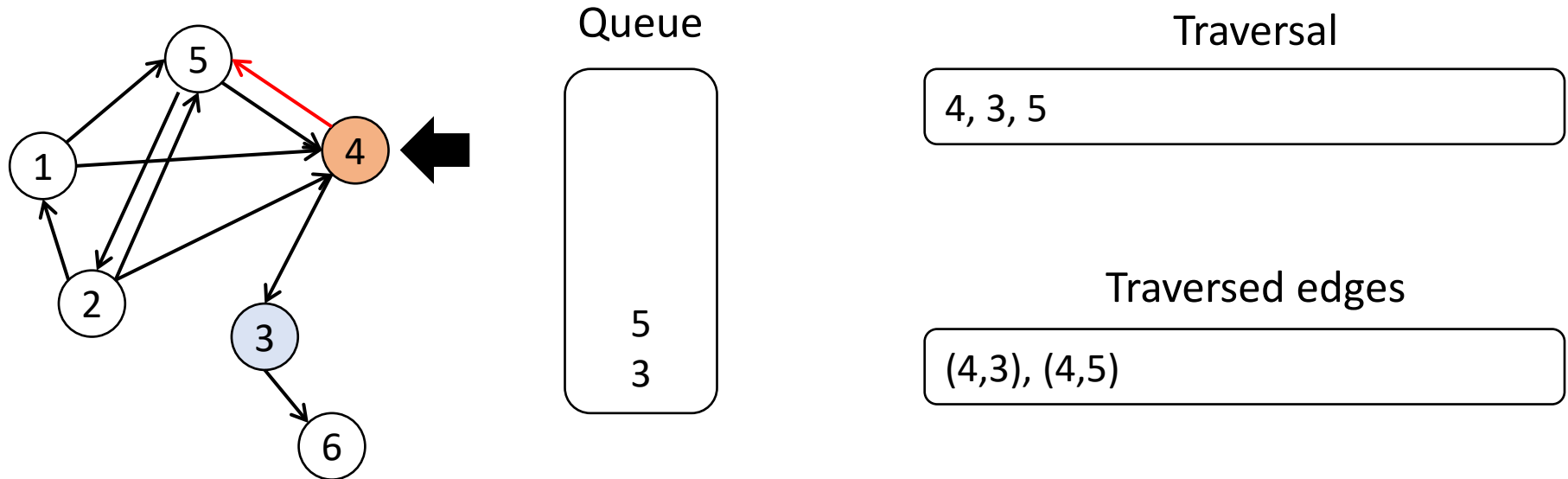
BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



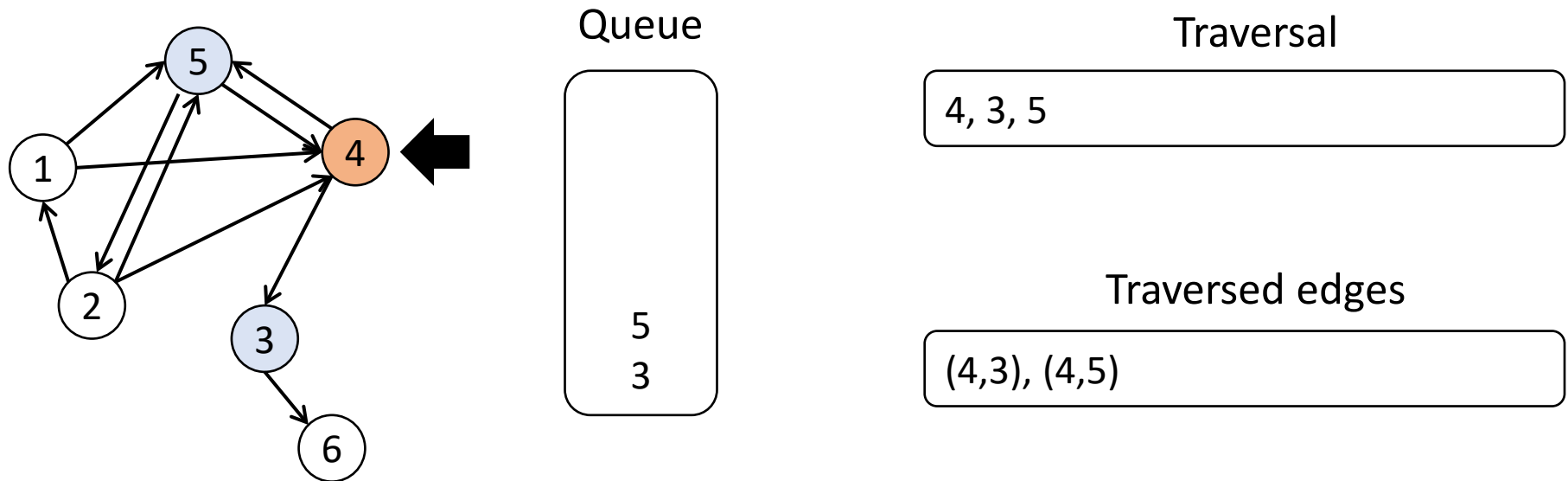
BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



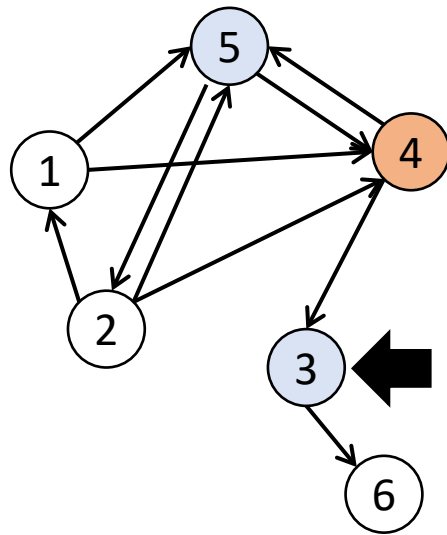
BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.

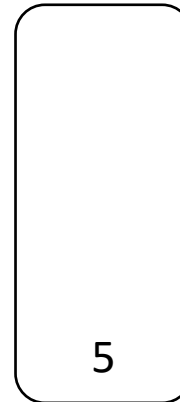


BFS Traversal on Directed Graphs

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Queue



Traversal

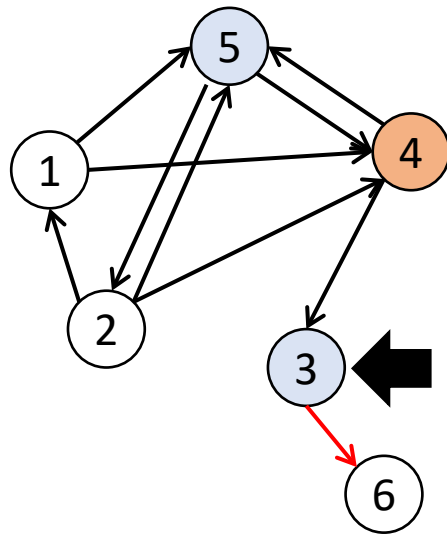
4, 3, 5

Traversed edges

(4,3), (4,5)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

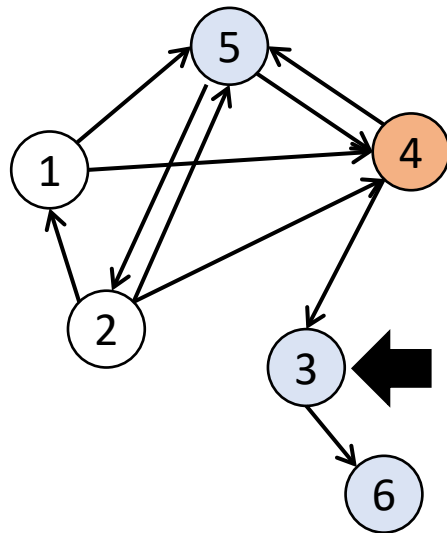
4, 3, 5, 6

Traversed edges

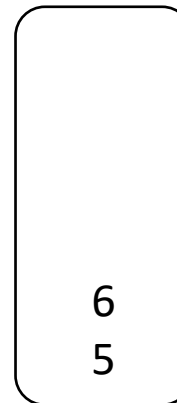
(4,3), (4,5), (3, 6)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

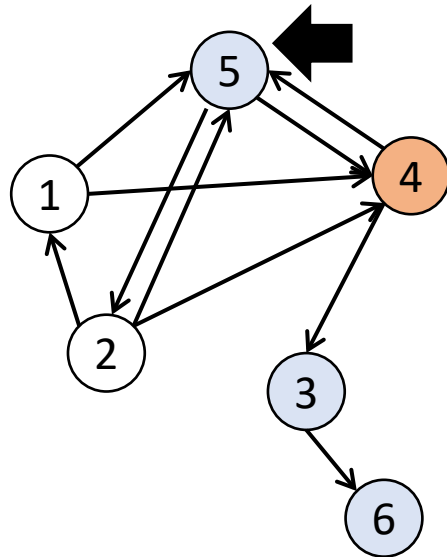
4, 3, 5, 6

Traversed edges

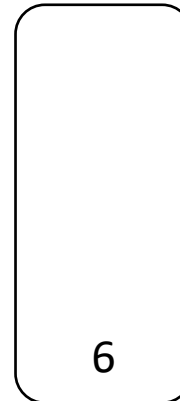
(4,3), (4,5), (3, 6)

BFS Traversal on Directed Graphs

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Queue



Traversal

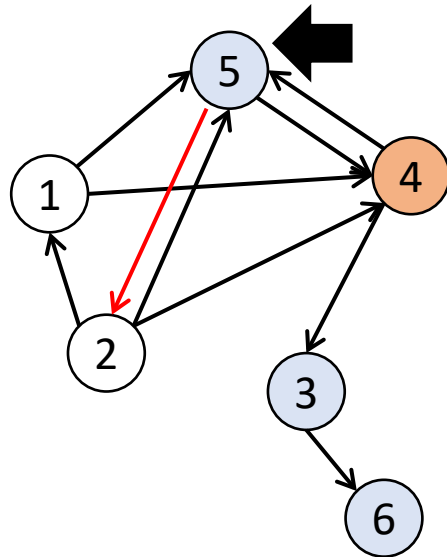
4, 3, 5, 6

Traversed edges

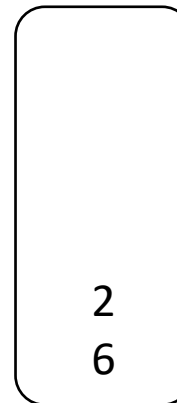
(4,3), (4,5), (3, 6)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

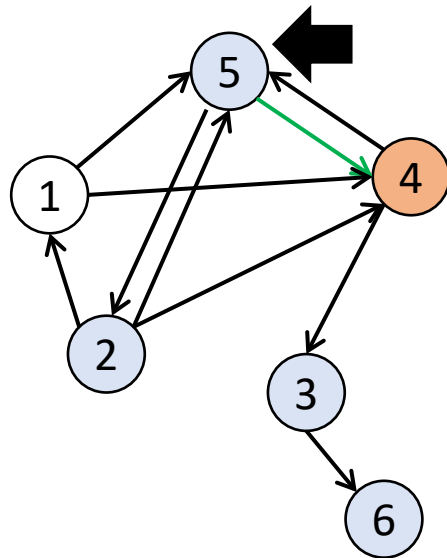
4, 3, 5, 6, 2

Traversed edges

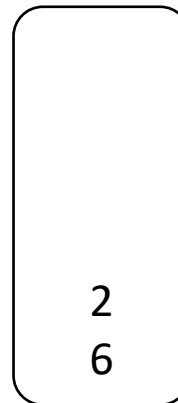
(4,3), (4,5), (3, 6), (5,2)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

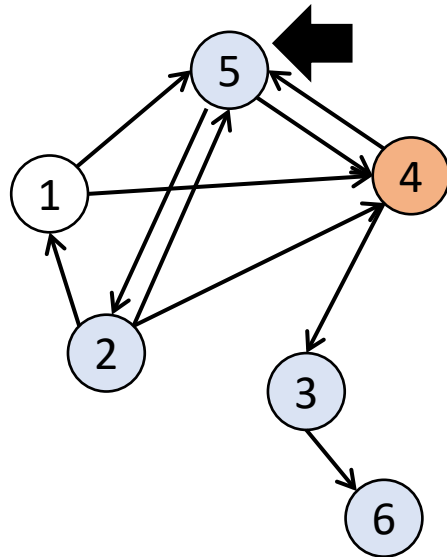
4, 3, 5, 6, 2

Traversed edges

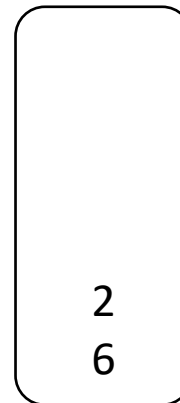
(4,3), (4,5), (3, 6), (5,2)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

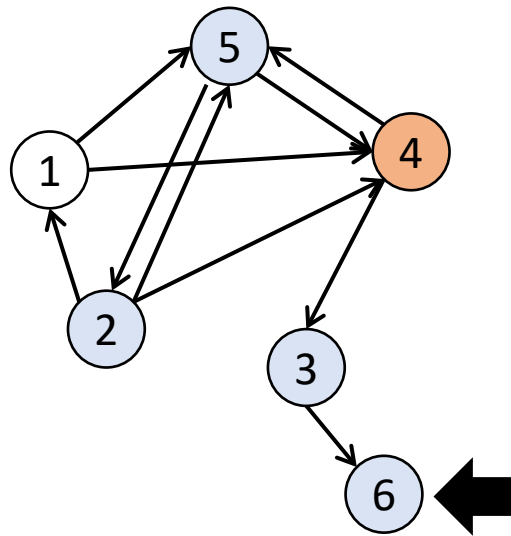
4, 3, 5, 6, 2

Traversed edges

(4,3), (4,5), (3, 6), (5,2)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

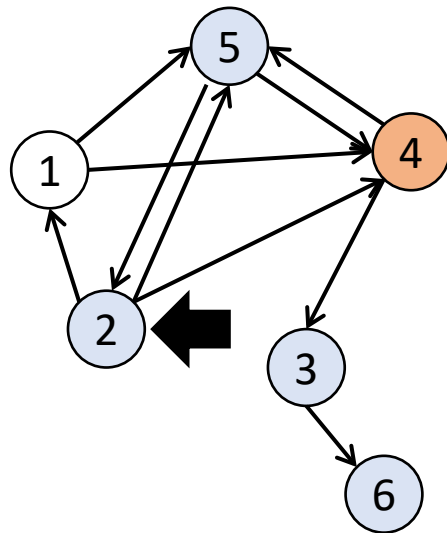
4, 3, 5, 6, 2

Traversed edges

(4,3), (4,5), (3, 6), (5,2)

BFS Traversal on Directed Graphs

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Queue



Traversal

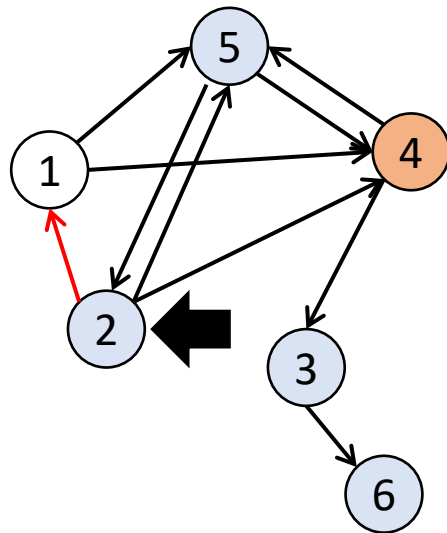
4, 3, 5, 6, 2

Traversed edges

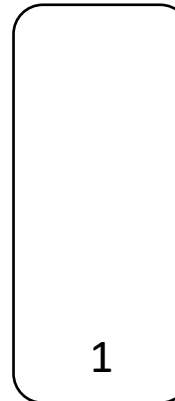
(4,3), (4,5), (3, 6), (5,2)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

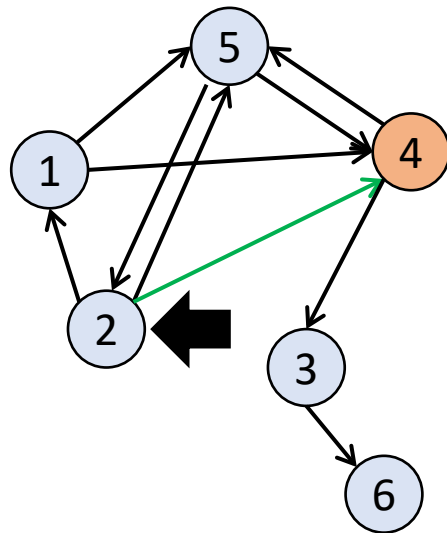
4, 3, 5, 6, 2, 1

Traversed edges

(4,3), (4,5), (3, 6), (5,2), (2,1)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

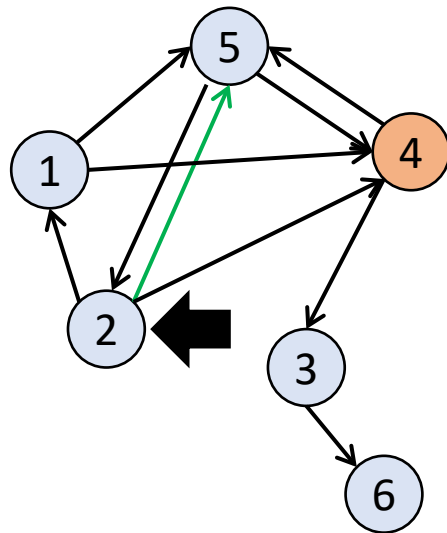
4, 3, 5, 6, 2, 1

Traversed edges

(4,3), (4,5), (3, 6), (5,2), (2,1)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

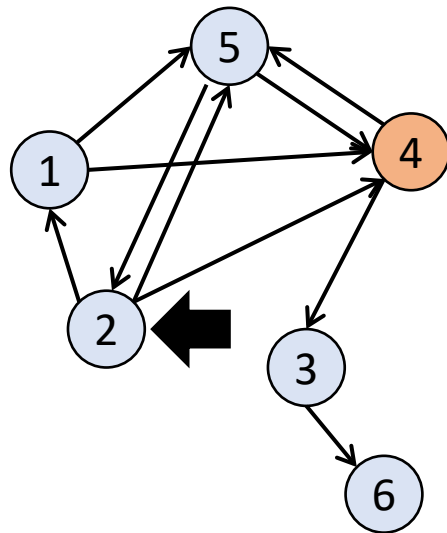
4, 3, 5, 6, 2, 1

Traversed edges

(4,3), (4,5), (3, 6), (5,2), (2,1)

BFS Traversal on Directed Graphs

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Queue



Traversal

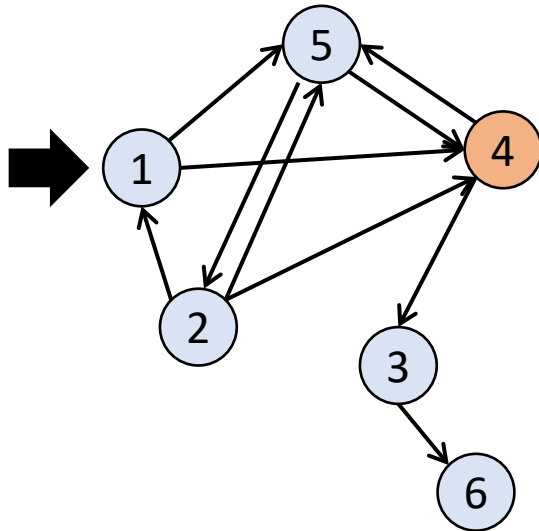
4, 3, 5, 6, 2, 1

Traversed edges

(4,3), (4,5), (3, 6), (5,2), (2,1)

BFS Traversal on Directed Graphs

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Queue



Traversal

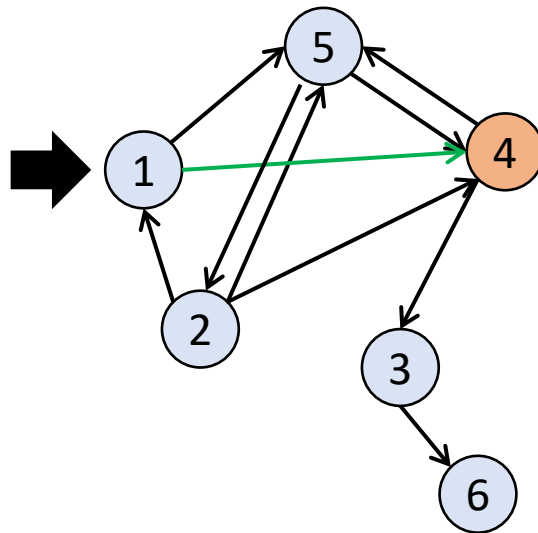
4, 3, 5, 6, 2, 1

Traversed edges

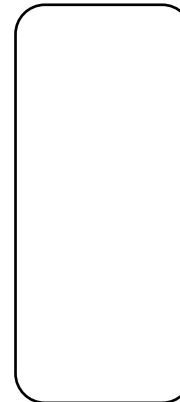
(4,3), (4,5), (3, 6), (5,2), (2,1)

BFS Traversal on Directed Graphs

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Queue



Traversal

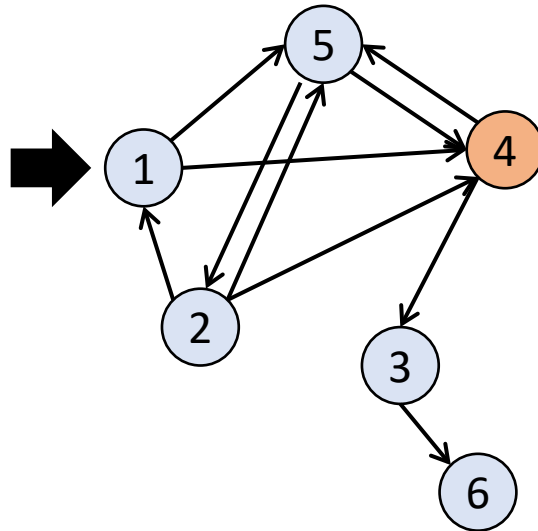
4, 3, 5, 6, 2, 1

Traversed edges

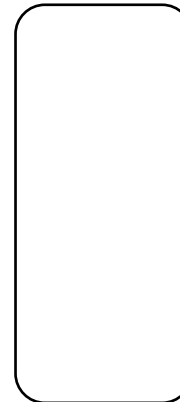
(4,3), (4,5), (3, 6), (5,2), (2,1)

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

4, 3, 5, 6, 2, 1

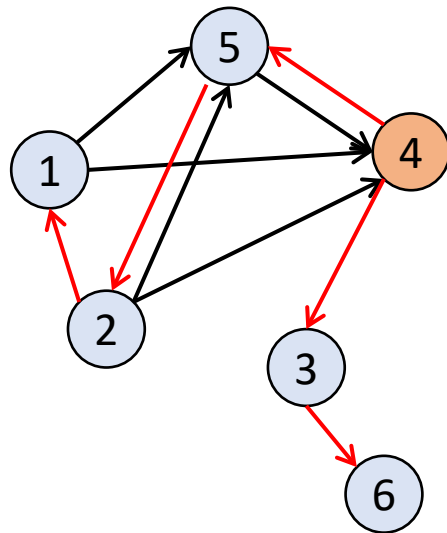
Traversed edges

(4,3), (4,5), (3, 6), (5,2), (2,1)

- BFS is done now.

BFS Traversal on Directed Graphs

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

4, 3, 5, 6, 2, 1

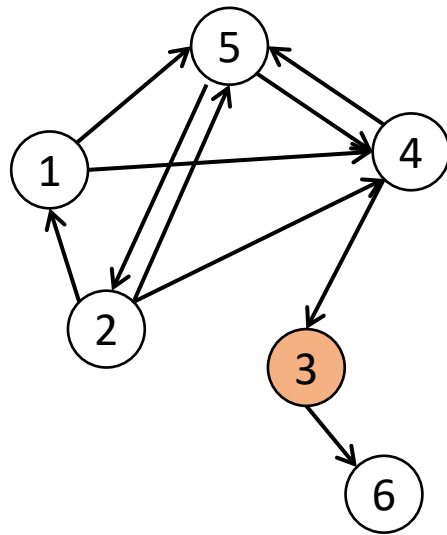
Traversed edges

(4,3), (4,5), (3, 6), (5,2), (2,1)

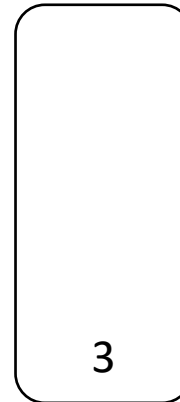
- BFS tree spans all nodes because all nodes can be reached from 4.

When Graphs are not Strongly Connected

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



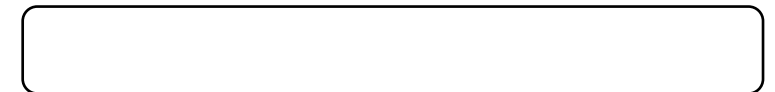
Queue



Traversal

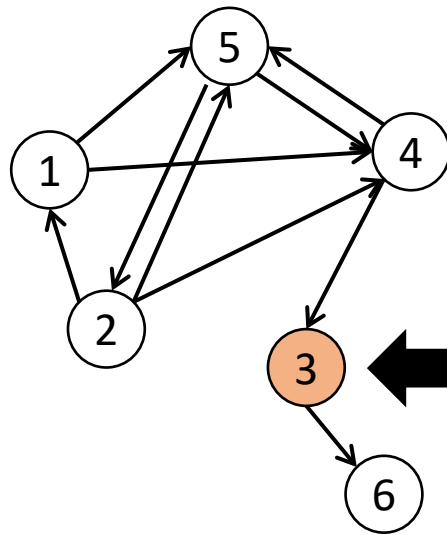


Traversed edges



When Graphs are not Strongly Connected

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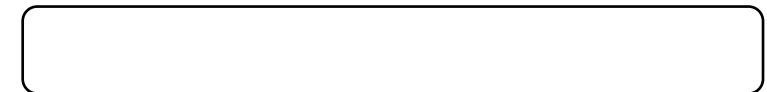
Queue



Traversal

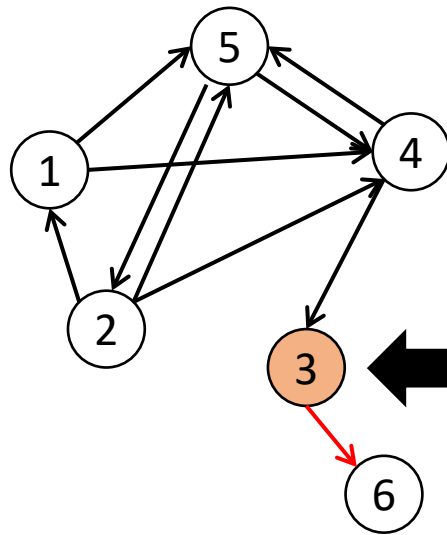


Traversed edges

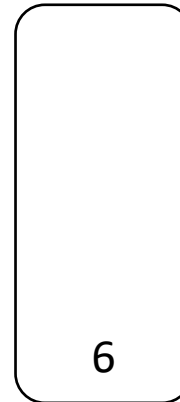


When Graphs are not Strongly Connected

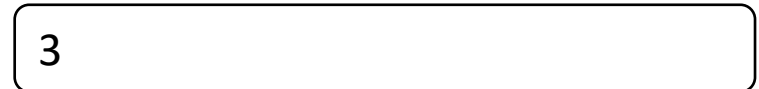
- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



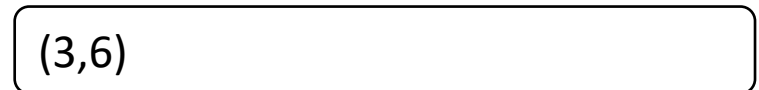
Queue



Traversal

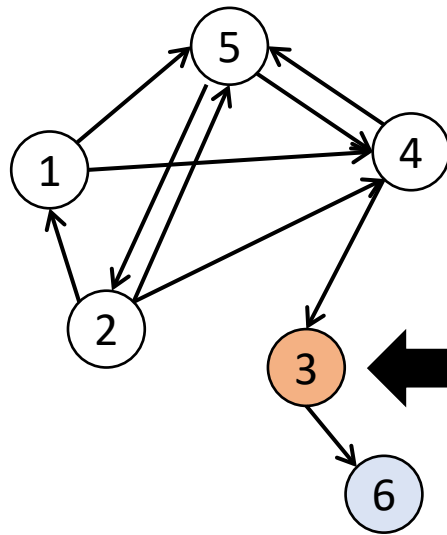


Traversed edges

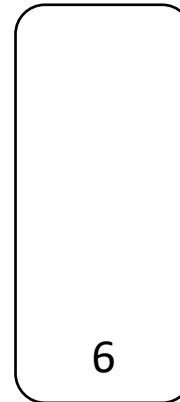


When Graphs are not Strongly Connected

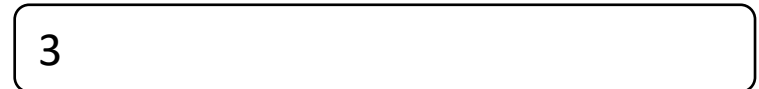
- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



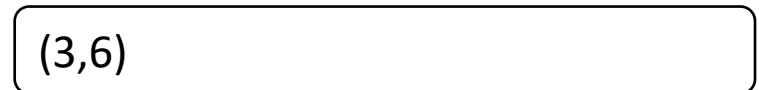
Queue



Traversal

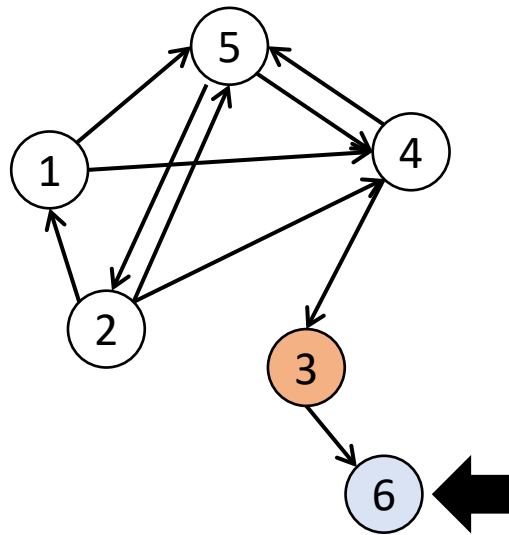


Traversed edges



When Graphs are not Strongly Connected

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

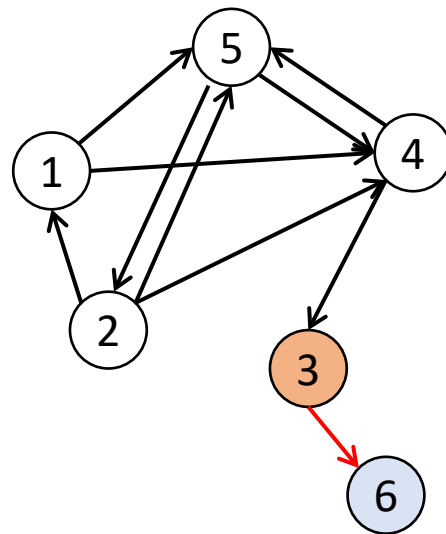
3

Traversed edges

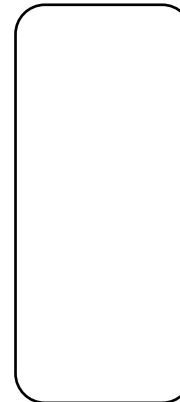
(3,6)

When Graphs are not Strongly Connected

- Consider a directed, unweighted graph G . Compute BFS tree rooted at 4.



Queue



Traversal

3

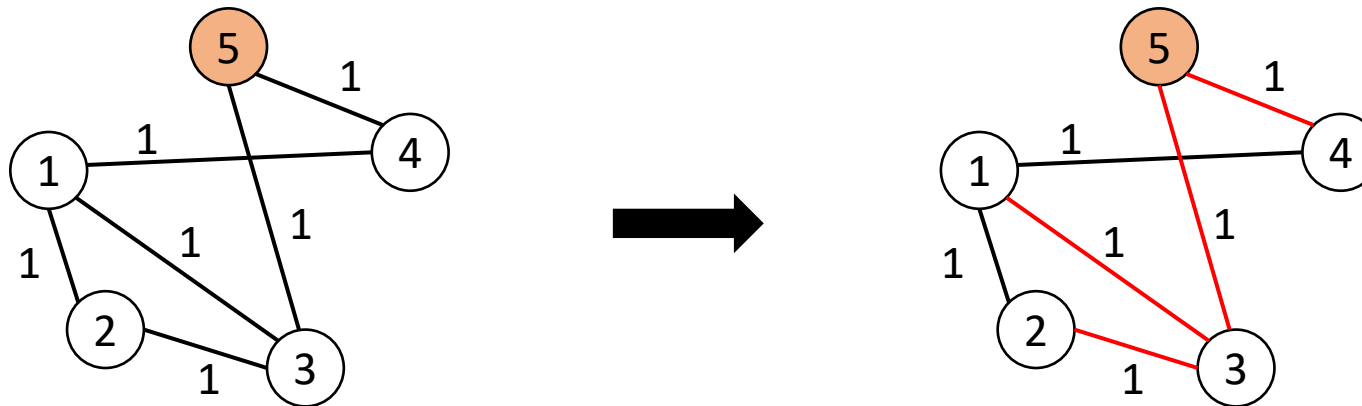
Traversed edges

(3,6)

- BFS is done...
- When the graph is **not strongly-connected**, the **BFS may not visit all nodes**

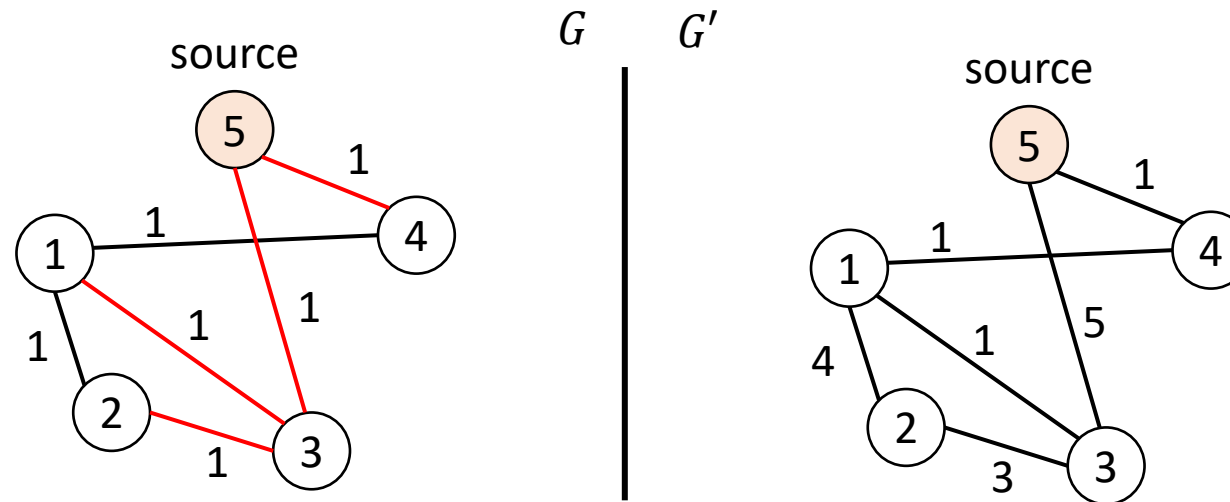
Shortest Paths in Unweighted Graphs

- BFS tree rooted at node 5



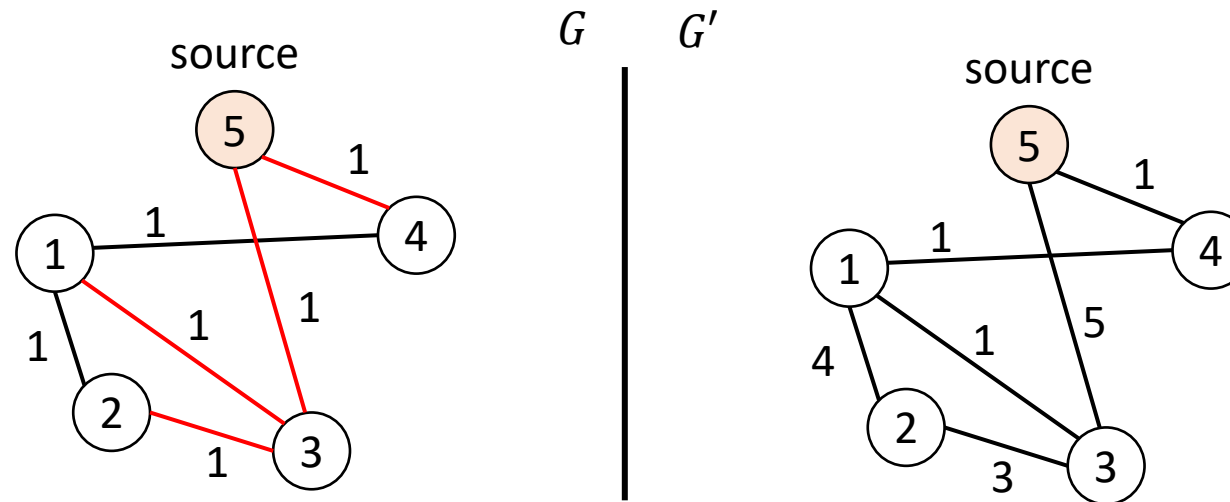
- BFS tree **contains** shortest paths from s to any node in G , when G is an (edge) unweighted graph.

Shortest Paths in Weighted Graphs?



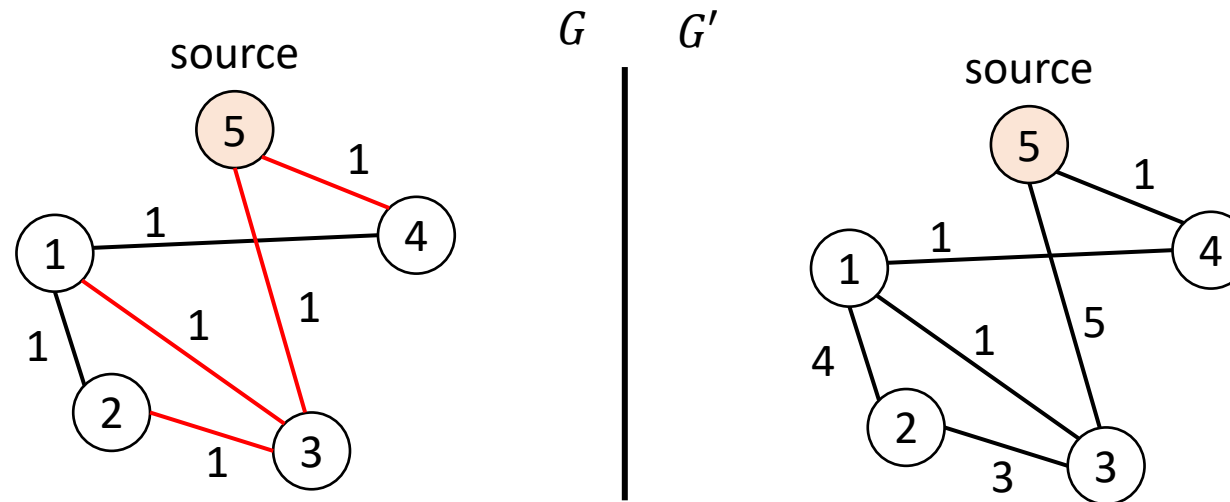
- **Shortest path** in weighted graph:
 - The sum of weights on that path should be smaller than the sum of weights on any other path.

Shortest Paths in Weighted Graphs?



- Shortest path from source (5) to node 3 in G' ?
(5,4,1,3) or 5 \rightarrow 4 \rightarrow 1 \rightarrow 3
- Shortest path when you consider **weights (or distances)**, not hops.

Shortest Paths in Weighted Graphs?



- How do you compute shortest paths on weighted graph ?
 - BFS does not work. Why?
 - **Because BFS tree does not take edge weights into account.**

Shortest Paths in Weighted Graphs

- Use **Dijkstra's algorithm** to solve the three shortest path problems
 1. Shortest distances (from source)
 2. Shortest paths (from source)
 3. Pathfinding (from source)
- Linked to network routing protocols or robot exploration (or search) algorithms.
- Several extensions:
 - A* search algorithm
 - Bellman-Ford algorithm
 - Floyd-Warshall algorithm

Shortest Distances via Dijkstra's Algorithm

- Keep two arrays: **visited[]** and **distanceToSource[]**
1. Start at source, and initialize:
 - **Initialize visited status** of all nodes (besides source) to unvisited.
 - **Initialize distances to source** to ∞ for all nodes (except source), and to 0 for the source.
 2. While not all nodes have been visited:
 - Visit (unvisited) node v with smallest distanceToSource.
 - For all neighbors of v , if the path going through v is shorter, then update distance.
 3. Return distanceToSource.

For visited node v and neighbor u :
If $\text{distToS}[u] > \text{distToS}[v] + \text{weight}(u,v)$,
then $\text{distToS}[u] = \text{distToS}[v] + \text{weight}(u,v)$

Shortest Distances via Dijkstra's Algorithm

Some intuition:

1. At the start, and through most of the algorithm, these are “approximate distances”
 - ∞ implies the node is “very far”, or more precisely unreachable,
 - 0 implies the node is the source.
2. The **key idea** of Dijkstra's algorithm is to **improve these approximations, as you visit more and more nodes, until all distances to the source are accurate.**
3. **(Invariant)** When a node is visited, their distance to the source is accurate.

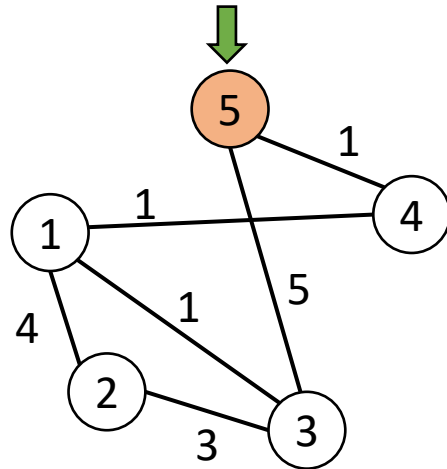
Shortest Distances via Dijkstra's algorithm

```
function Dijkstra(int source){
    for(int i = 1; i <= graph.size; i++){
        distanceToSource[i-1] = infinity
        visited[i-1] = false
    }
    distToS[source-1] = 0;

    while(there remains unvisited vertices){
        visitedNode = unvisited node with min distanceToSource    // Nodes are ints from 1 to size
        visited[visitedNode-1] = true;
        for(each neighborNode of visitedNode){
            estimatedDistance = distanceToSource[visitedNode] + weight(visitedNode, neighborNode);
            if(estimatedDistance < distanceToSource[visitedNode])
                distanceToSource[visitedNode] = estimatedDistance;
        }
    }
    return distanceToSource; }
```

Dijkstra's Algorithm: Example Execution

- Source is node 5.



visited

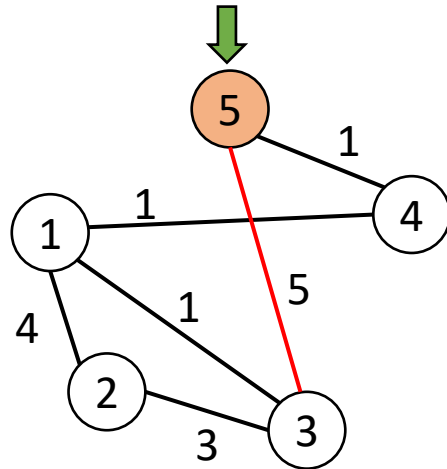
F	F	F	F	T
---	---	---	---	---

DistanceToSource

∞	∞	∞	∞	0
----------	----------	----------	----------	---

Dijkstra's Algorithm: Example Execution

- Look at neighbors of 5.



visited

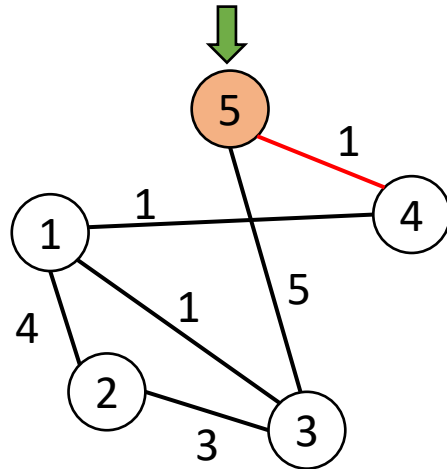
F	F	F	F	T
---	---	---	---	---

DistanceToSource

∞	∞	5	∞	0
----------	----------	---	----------	---

Dijkstra's Algorithm: Example Execution

- Look at neighbors of 5.



visited

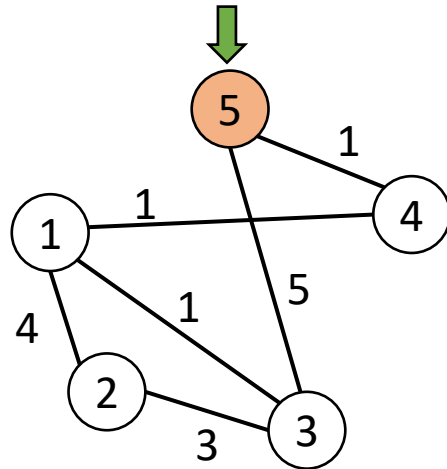
F	F	F	F	T
---	---	---	---	---

DistanceToSource

∞	∞	5	1	0
----------	----------	---	---	---

Dijkstra's Algorithm: Example Execution

- Next, visit node with smallest distance to source among unvisited nodes.



visited

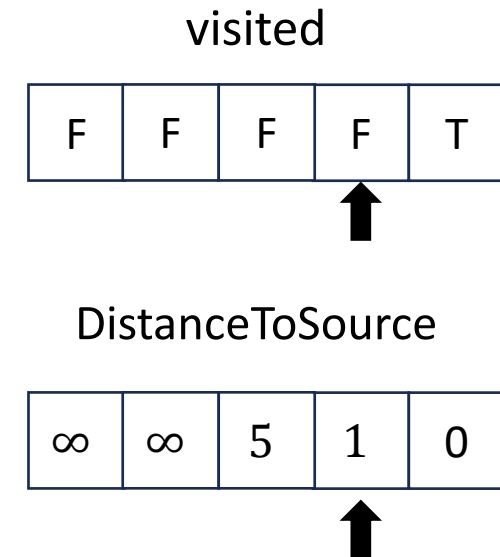
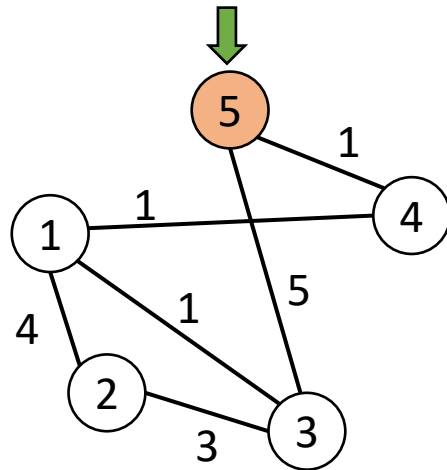
F	F	F	F	T
---	---	---	---	---

DistanceToSource

∞	∞	5	1	0
----------	----------	---	---	---

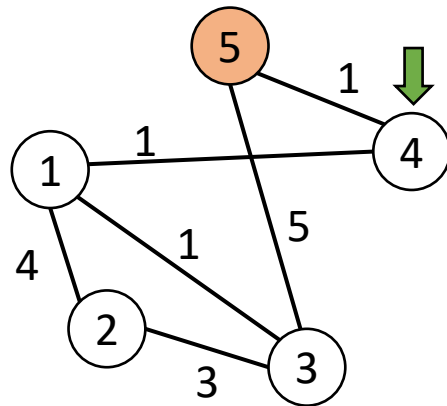
Dijkstra's Algorithm: Example Execution

- Next, visit node with smallest distance to source among unvisited nodes.



Dijkstra's Algorithm: Example Execution

- Now, we visit node 4 and update the distance to source of its (unvisited) neighbors.



visited

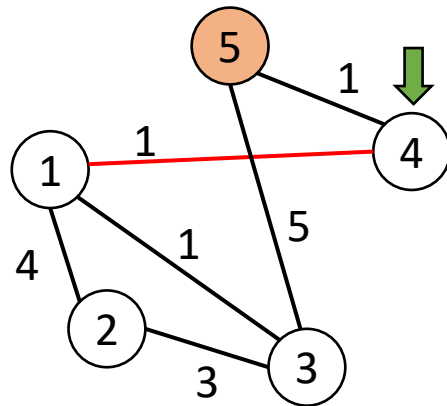
F	F	F	T	T
---	---	---	---	---

DistanceToSource

∞	∞	5	1	0
----------	----------	---	---	---

Dijkstra's Algorithm: Example Execution

- Now, we visit node 4 and update the distance to source of its (unvisited) neighbors.



visited

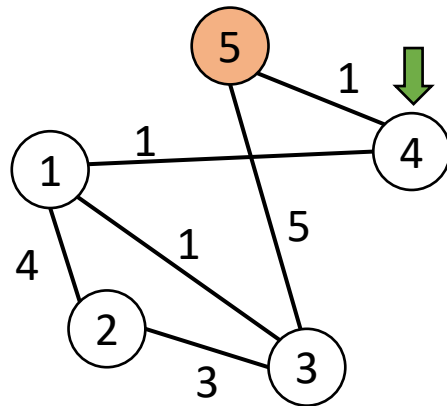
F	F	F	T	T
---	---	---	---	---

DistanceToSource

2	∞	5	1	0
---	----------	---	---	---

Dijkstra's Algorithm: Example Execution

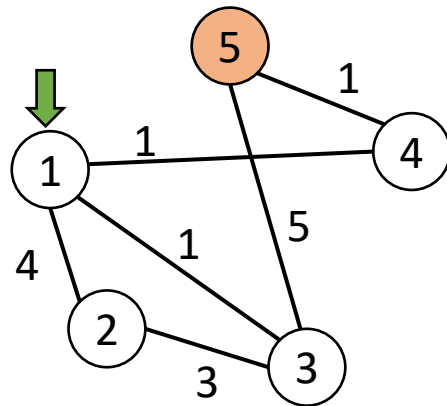
- Next, visit node with smallest distance to source among unvisited nodes.



visited				
F	F	F	T	T
↑				
DistanceToSource				
2	∞	5	1	0
↑				

Dijkstra's Algorithm: Example Execution

- Now, we visit node 1 and update the distance to source of its (unvisited) neighbors.



visited

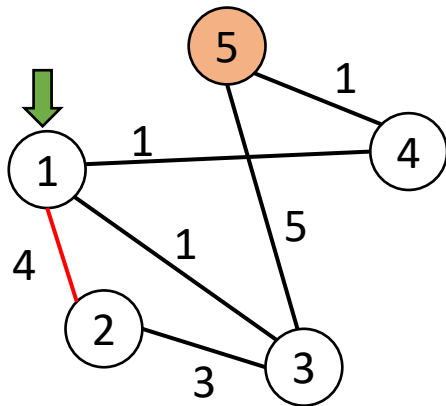
T	F	F	T	T
---	---	---	---	---

DistanceToSource

2	∞	5	1	0
---	----------	---	---	---

Dijkstra's Algorithm: Example Execution

- Now, we visit node 1 and update the distance to source of its (unvisited) neighbors.



visited

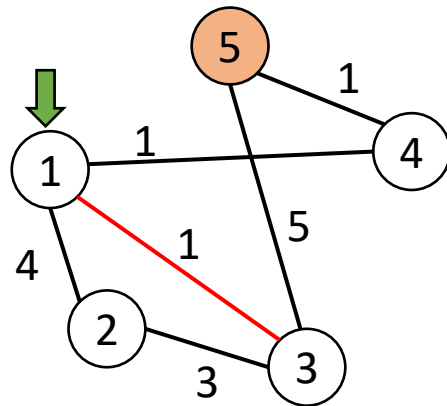
T	F	F	T	T
---	---	---	---	---

DistanceToSource

2	6	5	1	0
---	---	---	---	---

Dijkstra's Algorithm: Example Execution

- Now, we visit node 1 and update the distance to source of its (unvisited) neighbors.



$\text{distanceToSource}[\text{node } 1] + \text{weight}(\text{node } 1, \text{node } 3) < \text{distanceToSource}[\text{node } 3]$

visited

T	F	F	T	T
---	---	---	---	---

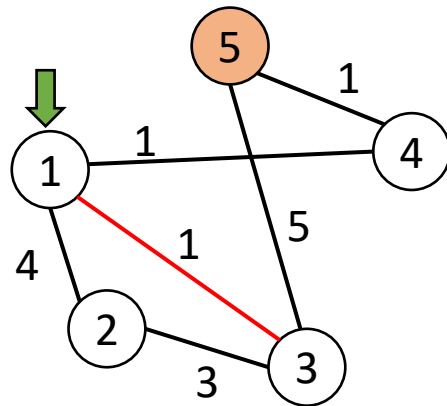
DistanceToSource

2	6	5	1	0
---	---	---	---	---

↑
 $3 < 5$

Dijkstra's Algorithm: Example Execution

- Now, we visit node 1 and update the distance to source of its (unvisited) neighbors.



$\text{distanceToSource}[\text{node } 1] + \text{weight}(\text{node } 1, \text{node } 3) < \text{distanceToSource}[\text{node } 3]$

visited

T	F	F	T	T
---	---	---	---	---

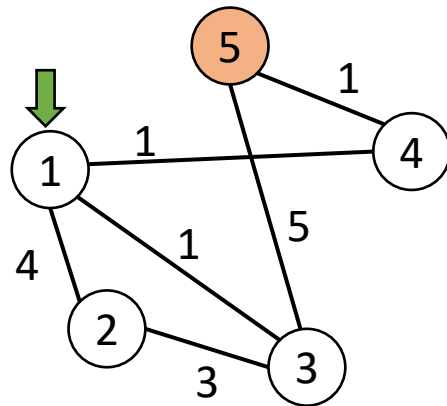
DistanceToSource

2	6	3	1	0
---	---	---	---	---

↑
 $3 < 5$

Dijkstra's Algorithm: Example Execution

- Next, visit node with smallest distance to source among unvisited nodes.



visited

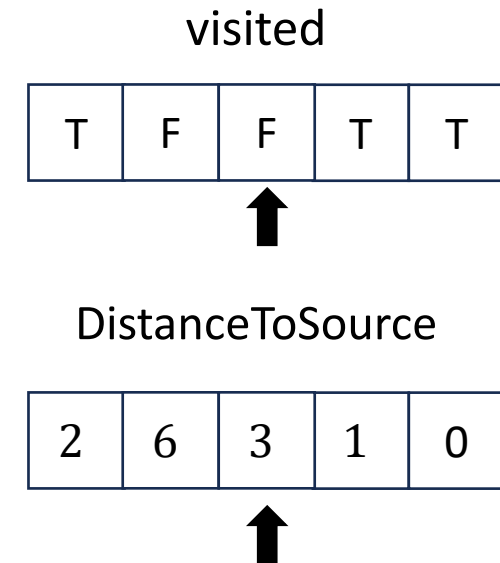
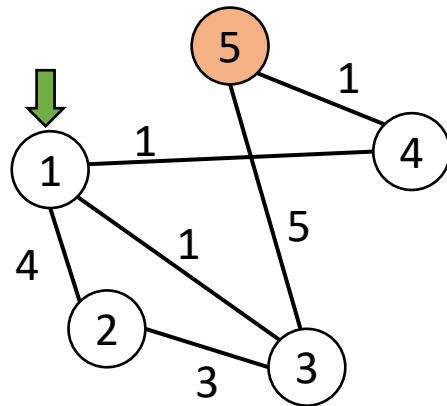
T	F	F	T	T
---	---	---	---	---

DistanceToSource

2	6	3	1	0
---	---	---	---	---

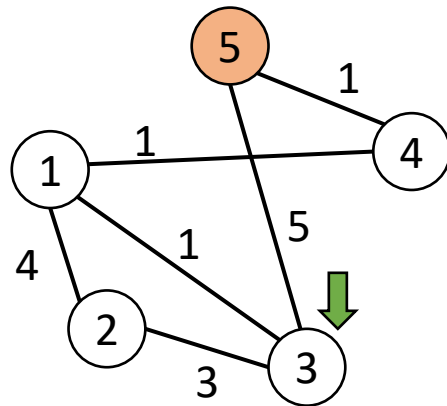
Dijkstra's Algorithm: Example Execution

- Next, visit node with smallest distance to source among unvisited nodes.



Dijkstra's Algorithm: Example Execution

- Now, we visit node 3 and update the distance to source of its (unvisited) neighbors.



visited

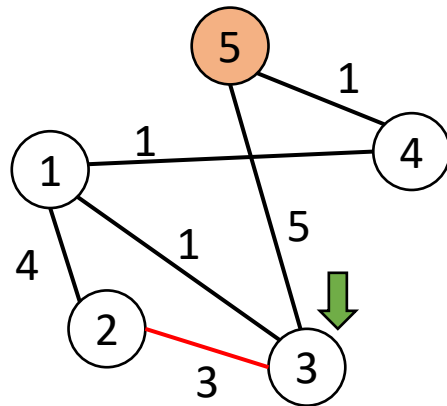
T	F	T	T	T
---	---	---	---	---

DistanceToSource

2	6	3	1	0
---	---	---	---	---

Dijkstra's Algorithm: Example Execution

- Now, we visit node 3 and update the distance to source of its (unvisited) neighbors.



$\text{distanceToSource}[\text{node } 3] + \text{weight}(\text{node } 3, \text{node } 2) < \text{distanceToSource}[\text{node } 2]$

visited

T	F	T	T	T
---	---	---	---	---

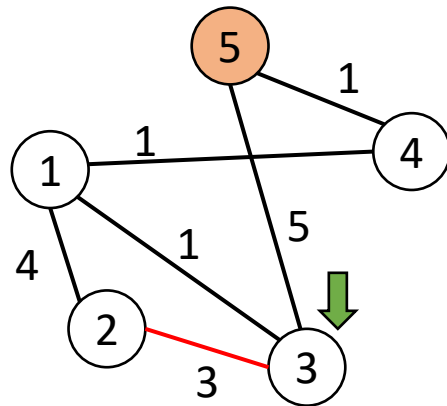
DistanceToSource

2	6	3	1	0
---	---	---	---	---

↑
6 vs 6

Dijkstra's Algorithm: Example Execution

- Now, we visit node 3 and update the distance to source of its (unvisited) neighbors.



visited

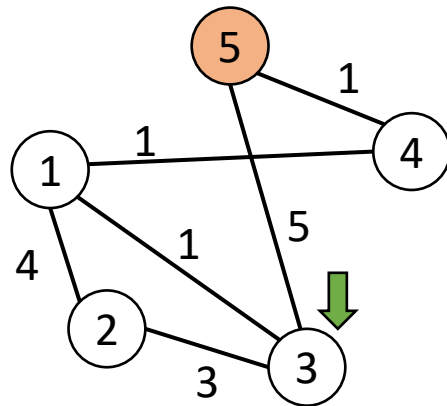
T	F	T	T	T
---	---	---	---	---

DistanceToSource

2	6	3	1	0
---	---	---	---	---

Dijkstra's Algorithm: Example Execution

- Next, visit node with smallest distance to source among unvisited nodes.



visited

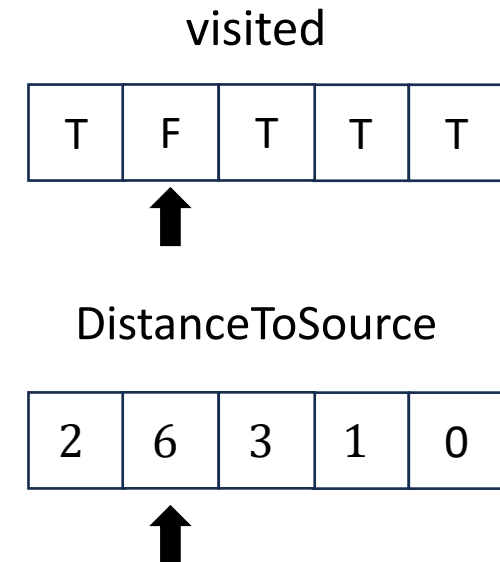
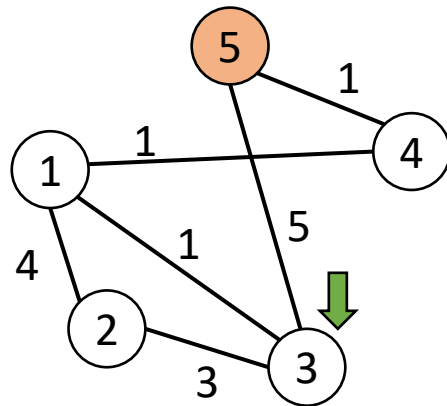
T	F	T	T	T
---	---	---	---	---

DistanceToSource

2	6	3	1	0
---	---	---	---	---

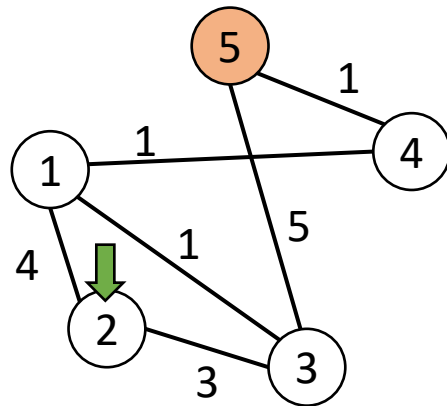
Dijkstra's Algorithm: Example Execution

- Next, visit node with smallest distance to source among unvisited nodes.



Dijkstra's Algorithm: Example Execution

- Now, we visit node 3 and update the distance to source of its (unvisited) neighbors.



visited

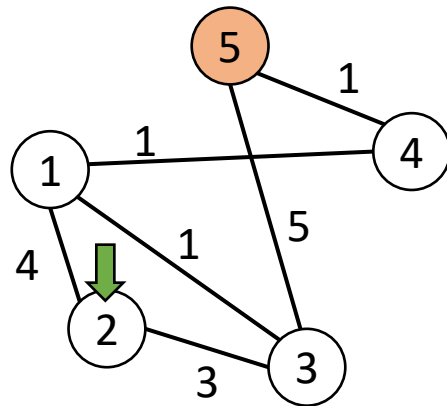
T	T	T	T	T
---	---	---	---	---

DistanceToSource

2	6	3	1	0
---	---	---	---	---

Dijkstra's Algorithm: Example Execution

- There are no unvisited neighbors, but also no unvisited nodes remaining.



visited

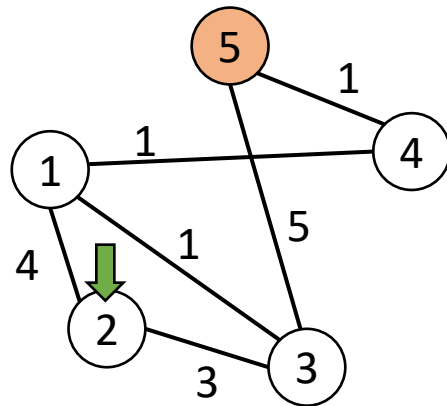
T	T	T	T	T
---	---	---	---	---

DistanceToSource

2	6	3	1	0
---	---	---	---	---

Dijkstra's Algorithm: Example Execution

- There are no unvisited neighbors, but also no nodes remains unvisited.



visited

T	T	T	T	T
---	---	---	---	---

DistanceToSource

2	6	3	1	0
---	---	---	---	---

- Dijkstra's algorithm terminates by returning distanceToSource



Shortest Paths via Dijkstra's Algorithm

- Keep three arrays: `visited[]`, **`previousNode[]`** and `distanceToSource[]`
- 1. Start at source, and initialize:
 - Initialize visited status of all nodes (besides source) to unvisited.
 - Initialize distances to source to ∞ for all nodes (except source), and to 0 for the source.
 - **Initialize previousNodes entries** to null.
- 2. While not all nodes have been visited:
 - Visit (unvisited) node v with smallest `distanceToSource`.
 - For all neighbors of v , if the path going through v is shorter, then update distance **and set `previousNode[neighbor]` to v**
- 3. Return `distanceToSource` and **`previousNode`**.

Pathfinding via Dijkstra's Algorithm

- Find shortest paths between two nodes: source and target.
- In Dijkstra's algorithm:
 2. While not all nodes have been visited:
 - Visit (unvisited) node v with smallest distanceToSource.
 - **If current visited node is the target node, return distanceToSource[v] and pathToSource[v], where pathToSource[v] = (previousNode[v], previousNode[previousNode[v]], ...).**
 - For all neighbors of v , if the distance of the path going through v is a better approximation, ...
 3. Throw an exception: "target node not found"

Complexity of Dijkstra's Algorithm

- **Worst-case time complexity of $O(n^2)$:**
 - We visit each node once, and during each visit, we do $O(1)$ operations per neighbors.
 - This amounts to $O(m)$ operations where m is the number of edges.
 - And to get each new visited node, we find the unvisited node with minimum distance to source, which takes $O(n)$ operations.
 - In total, this amounts to $O(n^2)$ operations.
- We can use **better data structures** (priority queues based on Fibonacci heaps, or self-balanced binary search trees, or other heaps) to improve Dijkstra's algorithm to:

$O(m + n \log n)$ worst-case time complexity

Correctness of Dijkstra's Algorithm

- Dijkstra's algorithm only works **if all edge weights are non-negative**
- **Correctness sketch:**
 - **Invariant** = Whenever a node is visited, its distance to the source is correct.
 - Base case: True for the source at the beginning of the algorithm.
 - Induction step:
 1. For each newly visited node v_i , it has minimum value in distanceToSource array among all unvisited nodes.
 2. If there exists a shorter path from the source to v_i , then there must be an edge in that path between a visited node and an unvisited node u .
 3. In distanceToSource, the value of u should be smaller than distanceToSource[v_i], which is a contradiction.

Better Shortest Path Algorithms?

1. When we have extra information (heuristic) on distances from some nodes to source, we can use the **A* algorithm**.
2. If we have edges with negative weights (but not negative cycles) then you can use **Bellman-Ford**.
3. If you are fine with approximating the distances (or getting some “almost” shortest paths), then there are faster algorithms...

A* Search Algorithm

- For pathfinding only (from specified source to specified target), not from the source to all other nodes
- **Core idea:** use heuristics (on the distance from current node to specified target) to guide (i.e., be more efficient in) the search
 - For example, if **graph weights** represent **Manhattan distances** (e.g., driving along roads)
 - Then the **heuristics** could be **straight-line distance** (e.g., distance as the bird flies)
- If $d(v)$ is the estimated distance from source to v in Dijkstra's algorithm, and $h(v)$ the heuristic distance from node v to the target, then **in A* we compare the values:**

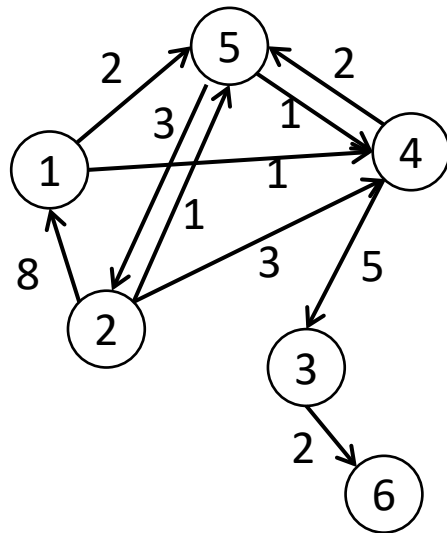
$$d(v) + h(v)$$

Bellman-Ford

- Computes shortest path from specified source to all other nodes (like Dijkstra's algorithm)
 - Works for wider class of graphs, as it can work for (some) graphs with negative weights
 - Still, a major problem if there is a **negative cycle** (with negative total weight sum)
 - When there is a negative cycle, Bellman-Ford finds that cycle (but not all shortest paths)
- **Core idea** (like Dijkstra's algorithm): **compute (over)estimations of the distances** from the source to all other nodes, **which you iteratively improve upon (or relax)**.
 - In Dijkstra's algorithm, you use a priority queue to decide which edge to relax,
 - In Bellman-Ford, you relax all edges every iteration, for a total of $n - 1$ iterations
- **Worst-Case Time Complexity:** $O(n \cdot m)$

Dijkstra's algorithm on Directed Graphs

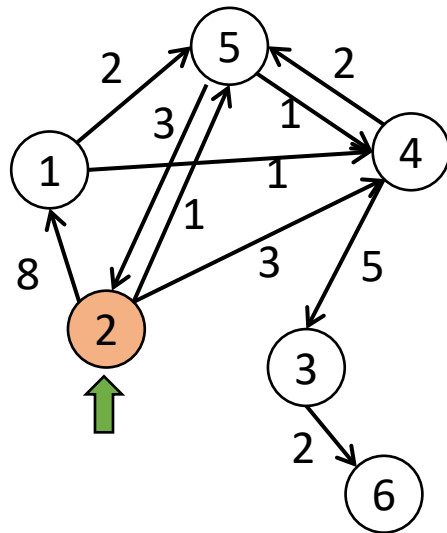
- Consider a directed, weighted graph G .



	(1)	(2)	(3)	(4)	(5)	(6)
(1)	0	0	0	1	2	0
(2)	8	0	0	3	1	0
(3)	0	0	0	0	0	2
(4)	0	0	5	0	2	0
(5)	0	3	0	1	0	0
(6)	0	0	0	0	0	0

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	F	F	F
---	---	---	---	---	---

DistanceToSource

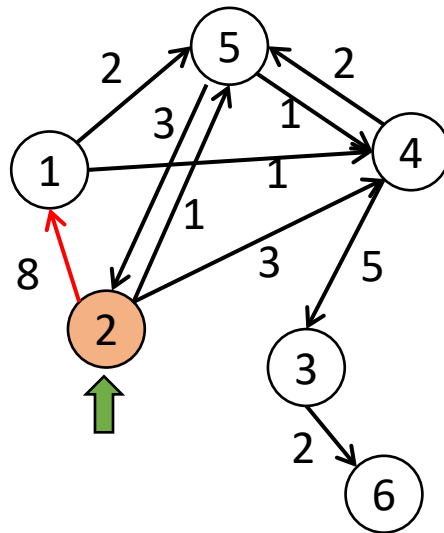
∞	0	∞	∞	∞	∞
----------	---	----------	----------	----------	----------

previousNode

null	null	null	null	null	null
------	------	------	------	------	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	F	F	F
---	---	---	---	---	---

DistanceToSource

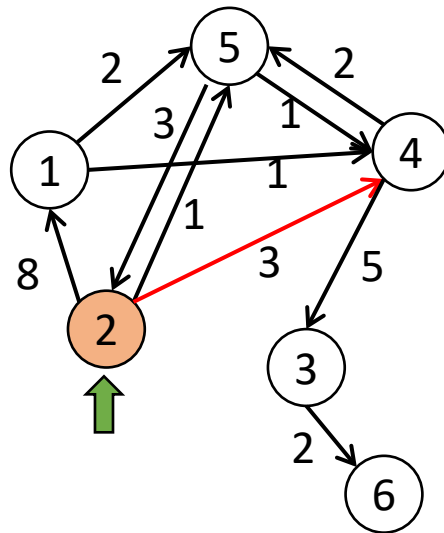
8	0	∞	∞	∞	∞
---	---	----------	----------	----------	----------

previousNode

2	null	null	null	null	null
---	------	------	------	------	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	F	F	F
---	---	---	---	---	---

DistanceToSource

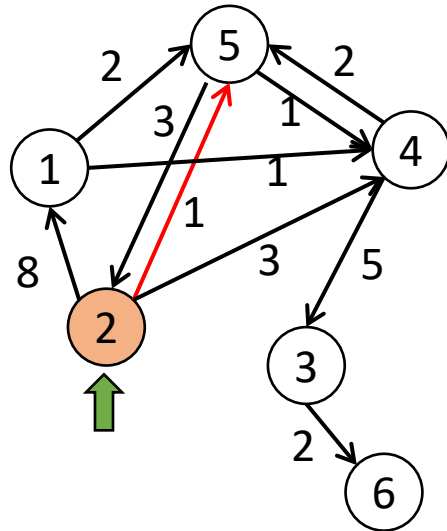
8	0	∞	3	∞	∞
---	---	----------	---	----------	----------

previousNode

2	null	null	2	null	null
---	------	------	---	------	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	F	F	F
---	---	---	---	---	---

DistanceToSource

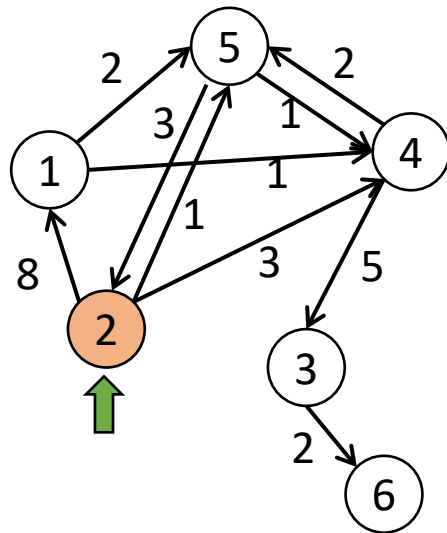
8	0	∞	3	1	∞
---	---	----------	---	---	----------

previousNode

2	null	null	2	2	null
---	------	------	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



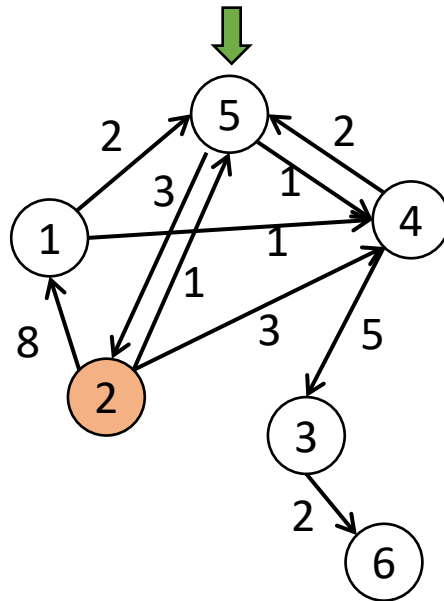
visited					
F	T	F	F	F	F

DistanceToSource					
8	0	∞	3	1	∞

previousNode					
2	null	null	2	2	null

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	F	T	F
---	---	---	---	---	---

DistanceToSource

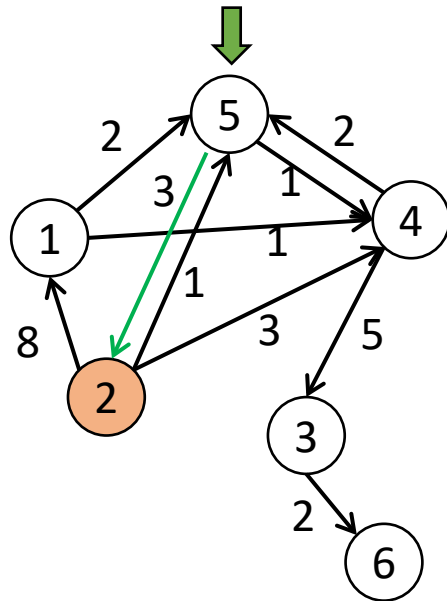
8	0	∞	3	1	∞
---	---	----------	---	---	----------

previousNode

2	null	null	2	2	null
---	------	------	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	F	T	F
---	---	---	---	---	---

DistanceToSource

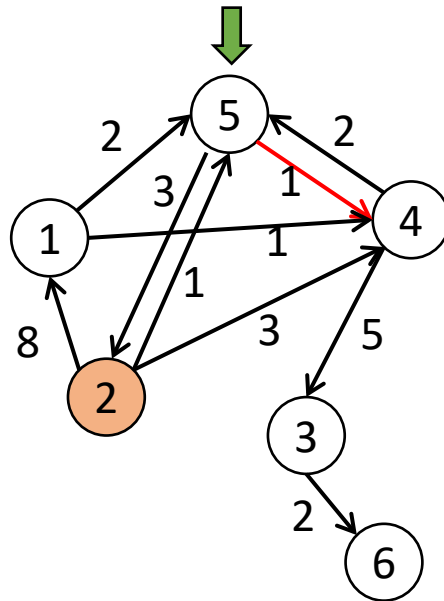
8	0	∞	3	1	∞
---	---	----------	---	---	----------

previousNode

2	null	null	2	2	null
---	------	------	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



$\text{distToSource}[\text{node } 5] + \text{weight}(\text{node } 5, \text{node } 4) < \text{distToSource}[\text{node } 4]$

visited

F	T	F	F	T	F
---	---	---	---	---	---

DistanceToSource

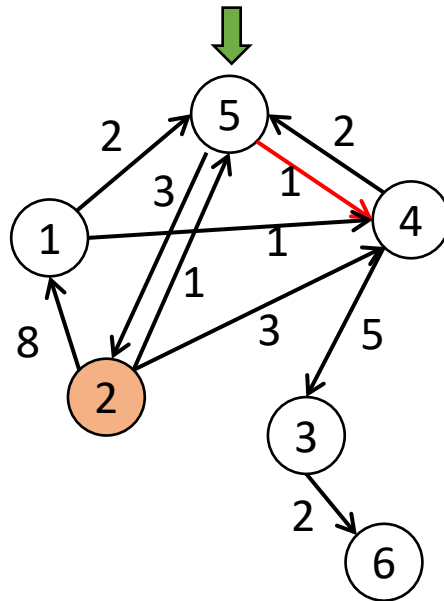
8	0	∞	3	1	∞
---	---	----------	---	---	----------

previousNode

2	null	null	2	2	null
---	------	------	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	F	T	F
---	---	---	---	---	---

DistanceToSource

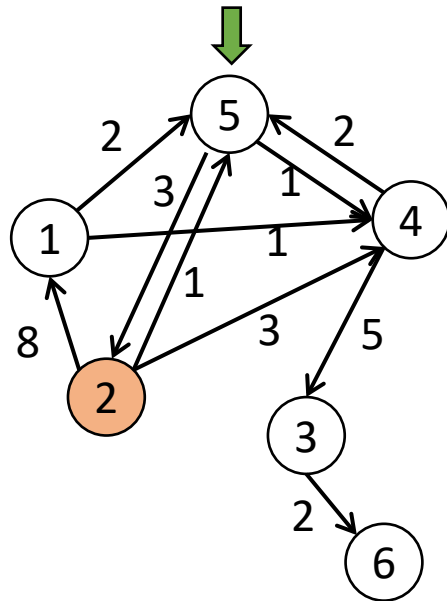
8	0	∞	2	1	∞
---	---	----------	---	---	----------

previousNode

2	null	null	5	2	null
---	------	------	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



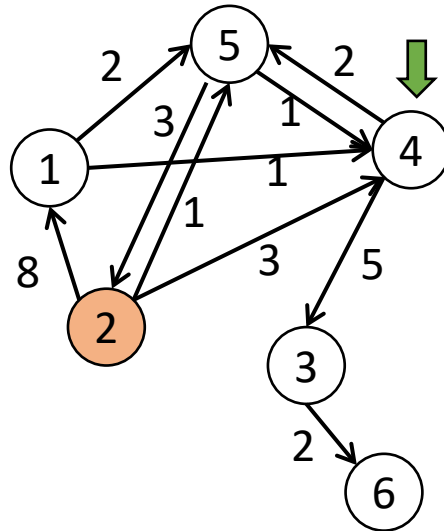
visited					
F	T	F	F	T	F

DistanceToSource					
8	0	∞	2	1	∞

previousNode					
2	null	null	5	2	null

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	T	T	F
---	---	---	---	---	---

DistanceToSource

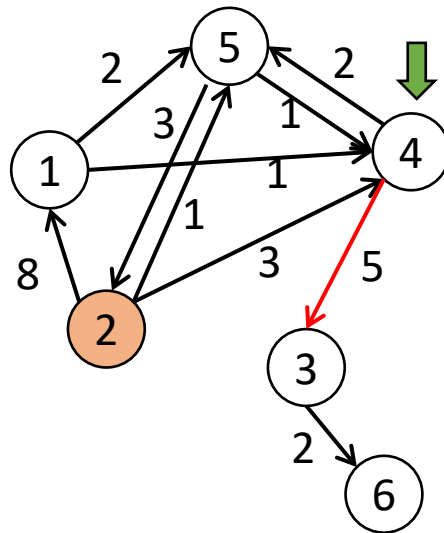
8	0	∞	2	1	∞
---	---	----------	---	---	----------

previousNode

2	null	null	5	2	null
---	------	------	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	T	T	F
---	---	---	---	---	---

DistanceToSource

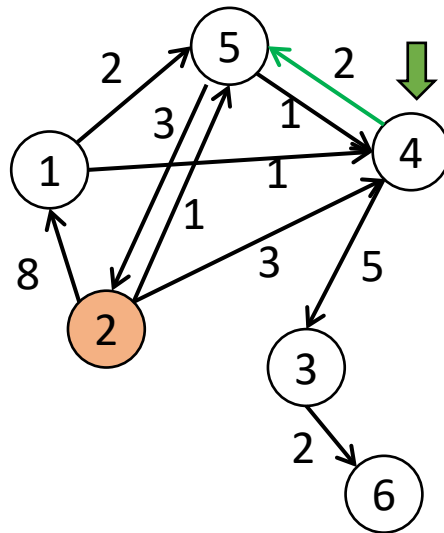
8	0	7	2	1	∞
---	---	---	---	---	----------

previousNode

2	null	4	5	2	null
---	------	---	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	T	T	F
---	---	---	---	---	---

DistanceToSource

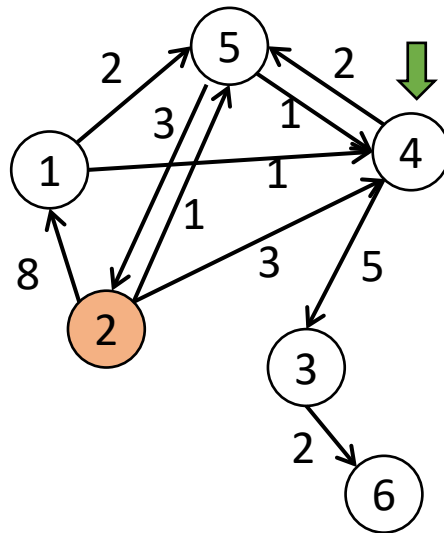
8	0	7	2	1	∞
---	---	---	---	---	----------

previousNode

2	null	4	5	2	null
---	------	---	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	F	T	T	F
---	---	---	---	---	---

DistanceToSource

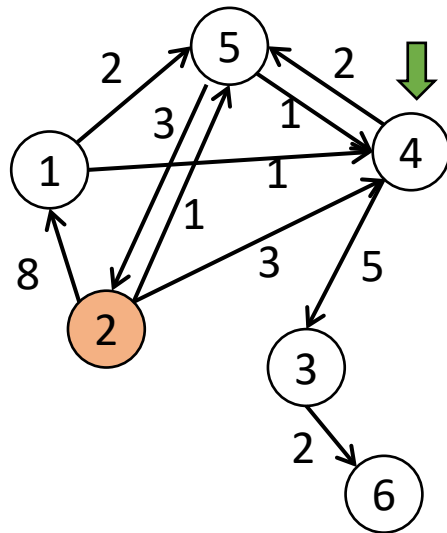
8	0	7	2	1	∞
---	---	---	---	---	----------

previousNode

2	null	4	5	2	null
---	------	---	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



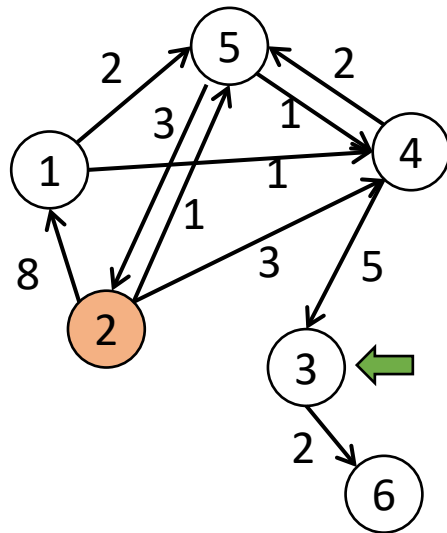
visited					
F	T	F	T	T	F

DistanceToSource					
8	0	7	2	1	∞

previousNode					
2	null	4	5	2	null

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	T	T	T	F
---	---	---	---	---	---

DistanceToSource

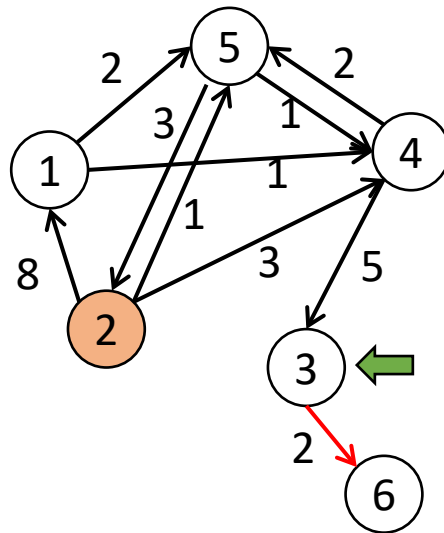
8	0	7	2	1	∞
---	---	---	---	---	----------

previousNode

2	null	4	5	2	null
---	------	---	---	---	------

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	T	T	T	F
---	---	---	---	---	---

DistanceToSource

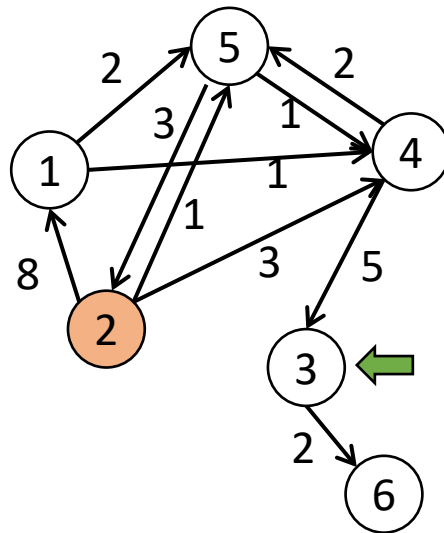
8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

F	T	T	T	T	F
---	---	---	---	---	---

DistanceToSource

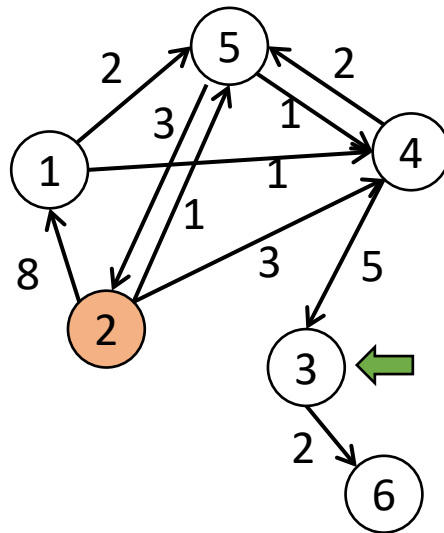
8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited					
F	T	T	T	T	F

↕

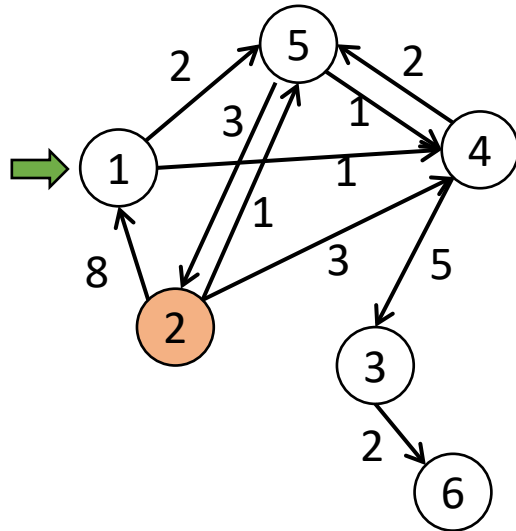
DistanceToSource					
8	0	7	2	1	9

↕

previousNode					
2	null	4	5	2	3

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

T	T	T	T	T	F
---	---	---	---	---	---

DistanceToSource

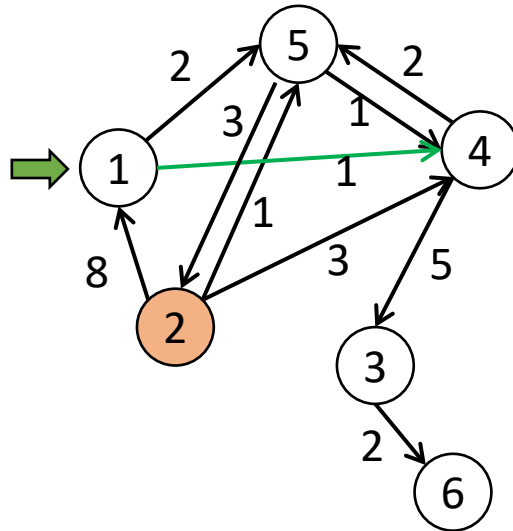
8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

T	T	T	T	T	F
---	---	---	---	---	---

DistanceToSource

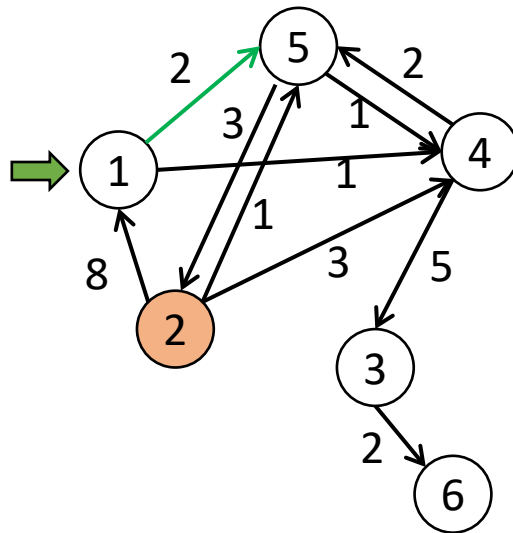
8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

T	T	T	T	T	F
---	---	---	---	---	---

DistanceToSource

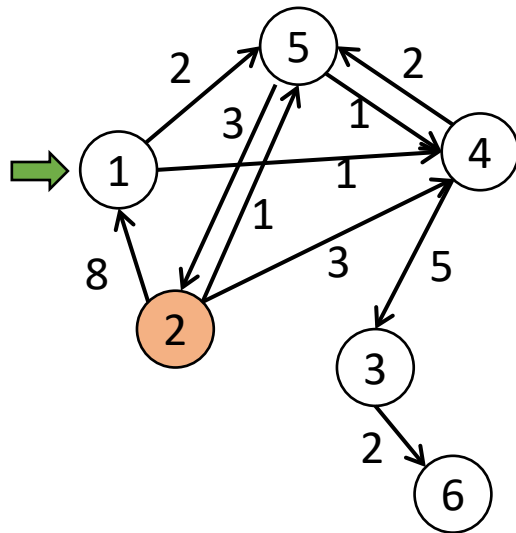
8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

T	T	T	T	T	F
---	---	---	---	---	---

DistanceToSource

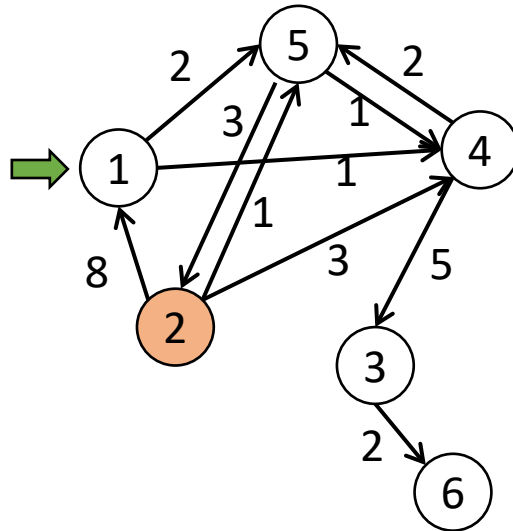
8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited					
T	T	T	T	T	F

↕

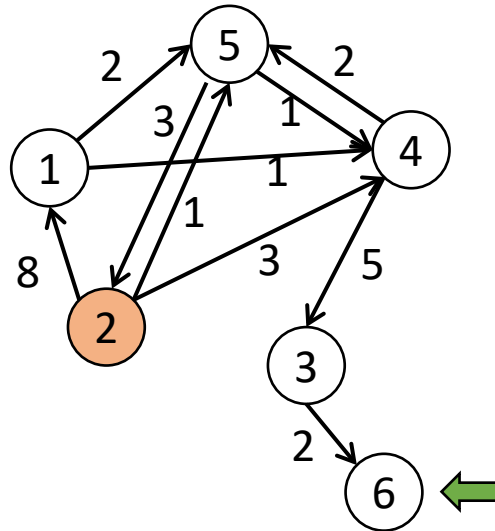
DistanceToSource					
8	0	7	2	1	9

↕

previousNode					
2	null	4	5	2	3

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



visited

T	T	T	T	T	T
---	---	---	---	---	---

DistanceToSource

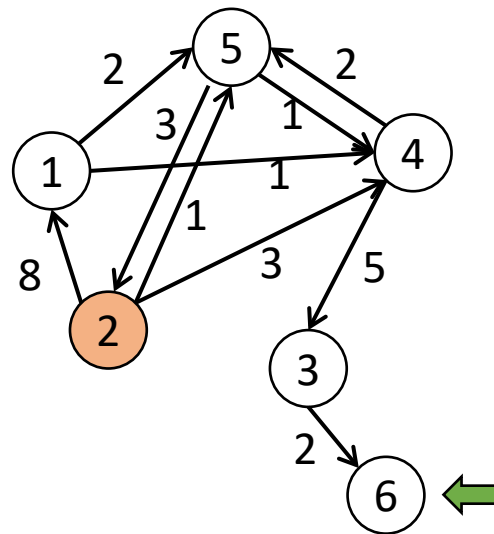
8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

Dijkstra's algorithm on Directed Graphs

- Consider a directed, weighted graph G . Computes shortest paths from node 2.



No unvisited or
unreachable nodes



visited

T	T	T	T	T	T
---	---	---	---	---	---

DistanceToSource

8	0	7	2	1	9
---	---	---	---	---	---

previousNode

2	null	4	5	2	3
---	------	---	---	---	---

- Dijkstra's algorithm terminates now.

Summary

Today's lecture:

- More examples of BFS graph traversals (undirected and directed),
 - BFS graph traversals do not suffice to compute shortest paths in weighted graphs,
 - Instead, Dijkstra's algorithm can compute shortest paths (and more) on weighted graphs (with non-negative edge weights).
-
- **Next Lecture:** Greedy algorithms.
 - **Any questions?**