## CS 10: Problem solving via Object Oriented Programming

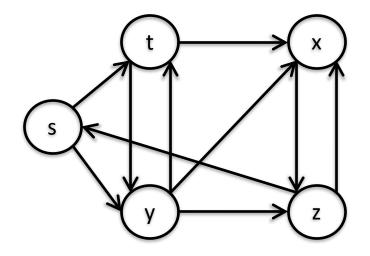
## **Shortest Path**

## Agenda

### 1. DFS and BFS on complex graph

- 2. Shortest-path simulation
- 3. Dijkstra's algorithm
- 4. A\* search
- 5. Implicit graphs

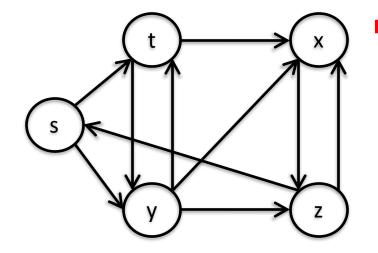
# Last class we looked simple graphs, today we look at more complicated graphs



Graph with directed edges and several cycles

#### **Depth First Search (DFS)**

- Use a **Stack**
- Move forward until can't proceed farther
- Go back to last decision point and try another edge

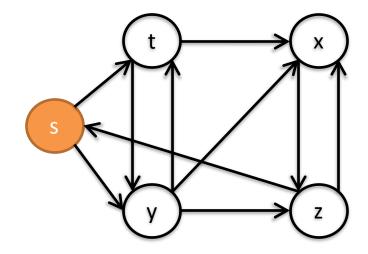


Graph with directed edges and several cycles

#### **DFS** algorithm

Stack





Graph with directed edges and several cycles

#### **DFS** algorithm

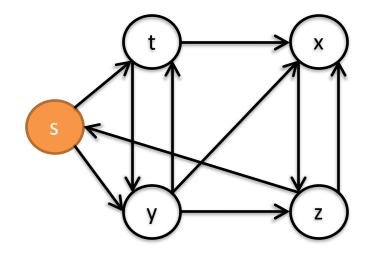
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stack.push(s) //start node
repeat until find goal vertex or stack
empty:
    u = stack.pop()
    if !u.visited
        u.visited = true
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        for v ∈ u.adjacent
```

if !v.visited

stack.push(v)

Stack

#### Pop -> s, mark visited



Graph with directed edges and several cycles

#### **DFS** algorithm

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stack.push(s) //start node
repeat until find goal vertex or stack
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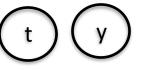
```
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```

🛑 for v 🗲 u.adjacent

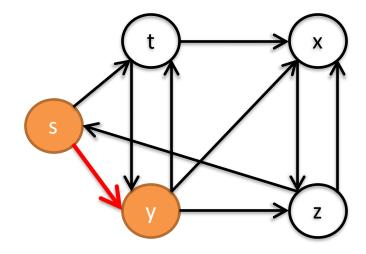
if !v.visited

stack.push(v)

#### Stack



Push s unvisited neighbors



Graph with directed edges and several cycles

Red edges are discovery edges

#### **DFS** algorithm

```
stack.push(s) //start node
repeat until find goal vertex or stack
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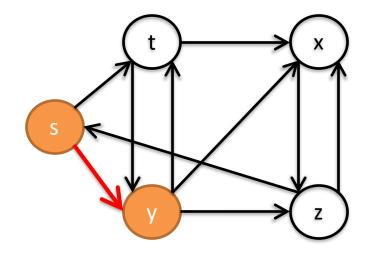
if !v.visited

stack.push(v)

Stack



Pop -> y, mark visited



Graph with directed edges and several cycles

Note: t is in Stack twice because two edges lead to t from explored vertices

#### **DFS** algorithm

```
stack.push(s) //start node
repeat until find goal vertex or stack
empty:
    u = stack.pop()
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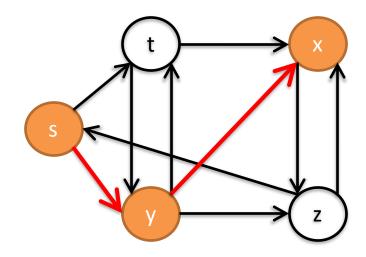
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stack.push(v)

Stack



Push y unvisited neighbors



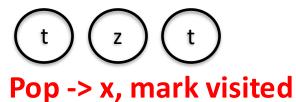
Graph with directed edges and several cycles

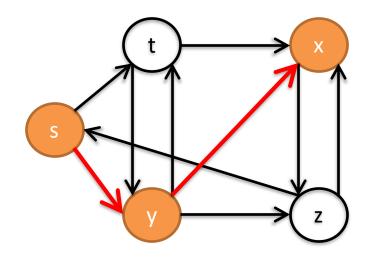
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repeat until find goal vertex or stack
empty:
    u = stack.pop()
    if !u.visited
```

```
if !u.visited
   u.visited = true
   (maybe do something while here)
   for v ∈ u.adjacent
        if !v.visited
        stack.push(v)
```

Stack





Graph with directed edges and several cycles

Note: z in Stack twice because two edges lead to z from explored vertices

#### **DFS** algorithm

```
stack.push(s) //start node
repeat until find goal vertex or stack
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🛑 for v E u.adjacent

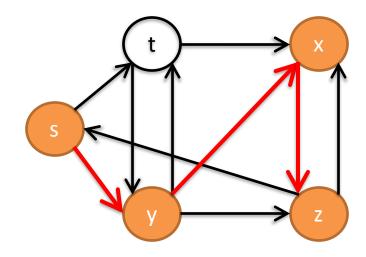
if !v.visited

stack.push(v)

Stack



Push x unvisited neighbors



Graph with directed edges and several cycles

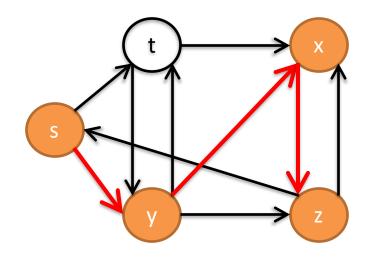
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Stack





Graph with directed edges and several cycles

#### **DFS** algorithm

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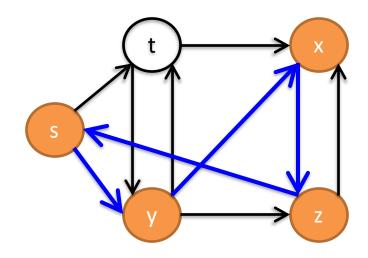
📫 for v 🗲 u.adjacent

if !v.visited

stack.push(v)

#### Stack





Graph with directed edges and several cycles

Found cycle! s is an already visited neighbor

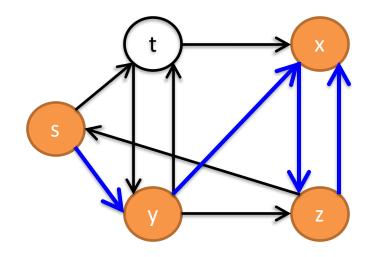
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        (maybe do something while here)
    for v ∈ u.adjacent
```

if !v.visited
 stack.push(v)

Stack





Graph with directed edges and several cycles

Found cycle! s is an already visited neighbor (so is x)

#### **DFS** algorithm

```
stack.push(s) //start node
repeat until find goal vertex or stack
empty:
    u = stack.pop()
    if !u.visited
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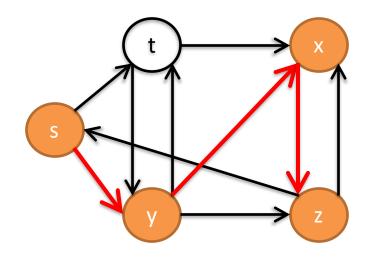
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stack.push(v)

#### Stack





Graph with directed edges and several cycles

#### **DFS** algorithm

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repeat until find goal vertex or stack
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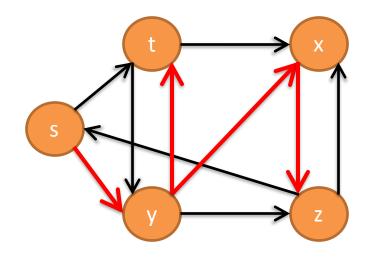
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#### Stack





Graph with directed edges and several cycles

#### **DFS** algorithm

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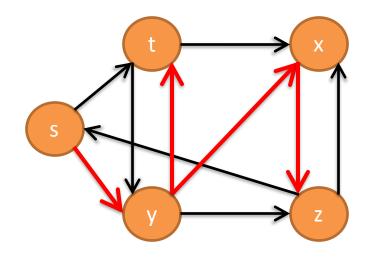
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stack.push(v)

#### Stack





Graph with directed edges and several cycles

#### **DFS** algorithm

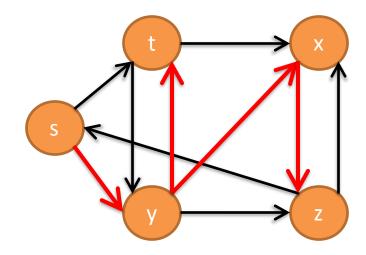
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```

```
if !v.visited
stack.push(v)
```

for v  $\in$  u.adjacent

Stack





## Graph with directed edges and several cycles

#### **DFS** algorithm

```
stack.push(s) //start node
repeat until find goal vertex or stack
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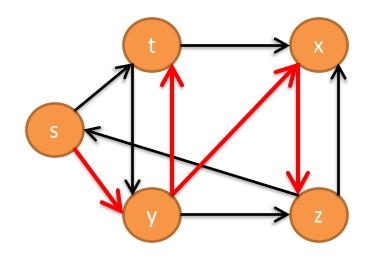
```
for v \in u.adjacent
```

```
if !v.visited
```

stack.push(v)

Stack

#### Pop -> t, skip, already visited



Graph with directed edges and several cycles

### s v t z

#### **DFS** algorithm

```
stack.push(s) //start node
repeat until find goal vertex or stack
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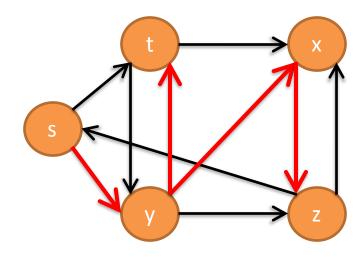
```
if !v.visited
```

stack.push(v)

#### Stack

#### Done

- Red lines indicate a tree (root and no cycles)
- Can traverse tree to find path from *s* to others <sup>19</sup>



Graph with directed edges and several cycles

Could DFS have produced another tree? Yes, depends on the order vertices pushed onto Stack

#### **DFS** algorithm

```
stack.push(s) //start node
repeat until find goal vertex or stack
empty:
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```

```
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```

```
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```

```
if !v.visited
```

stack.push(v)

#### Stack

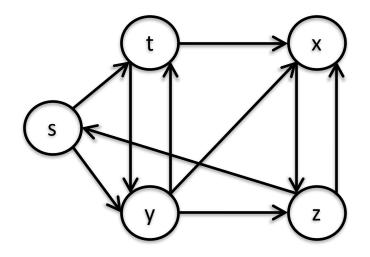
#### Done

V

X

t

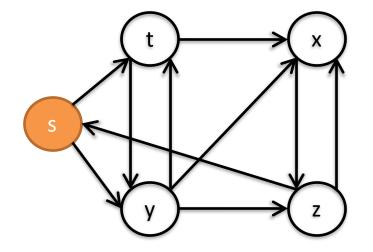
- Red lines indicate a tree (root and no cycles)
- Can traverse tree to find path from *s* to others <sup>20</sup>



Graph with directed edges and several cycles

#### **Breadth First Search (BFS)**

- Use a **Queue**
- Ripple outward from start
- Finds <u>shortest</u> path to each node from start (DFS finds <u>a</u> path)



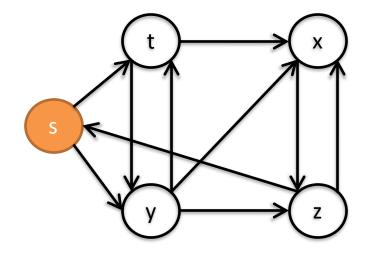
Graph with directed edges and several cycles

#### **BFS** algorithm

```
enqueue(s) //start node
s.visited = true
repeat until find goal vertex or
queue empty:
    u = dequeque()
    for v € u.adjacent
        if !v.visited
            v.visited = true
            enqueue(v)
```



Queue



## Graph with directed edges and several cycles

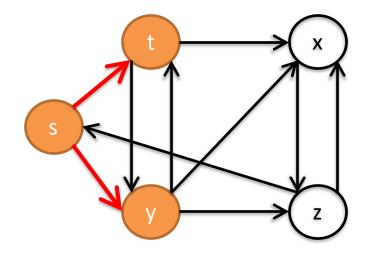
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 if !v.visited
 v.visited = true
 enqueue(v)

Queue

#### dequeue -> s



Graph with directed edges and several cycles

#### **BFS** algorithm

enqueue(s) //start node
s.visited = true
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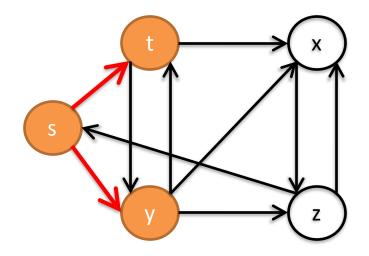
```
for v E u.adjacent
```

if !v.visited
 v.visited = true
 enqueue(v)

#### Queue



enqueue s unvisited adjacent



Graph with directed edges and several cycles

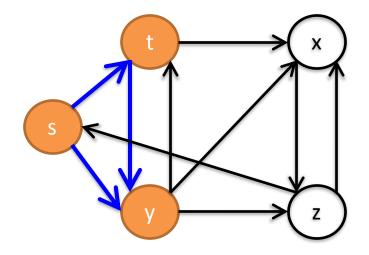
#### **BFS** algorithm

```
v.visited = true
```

```
enqueue (v)
```

### Queue





Graph with directed edges and several cycles

Adjacent vertex y is visited Found cycle? NO! Just another way to get to y DFS easier for cycle detection

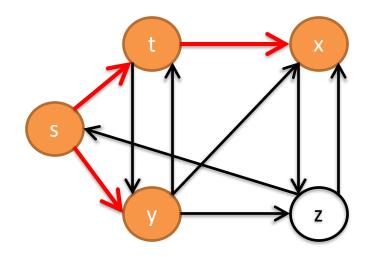
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v.visited = true enqueue(v)

#### Queue





**BFS** algorithm

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Queue

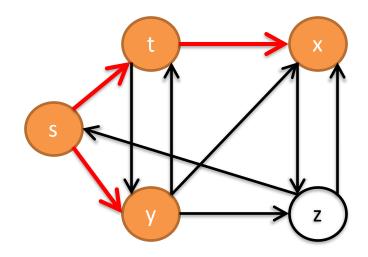
```
for v \in u.adjacent
```

if !v.visited
 v.visited = true
 enqueue(v)

Graph with directed edges and several cycles

y x

enqueue t unvisited adjacent



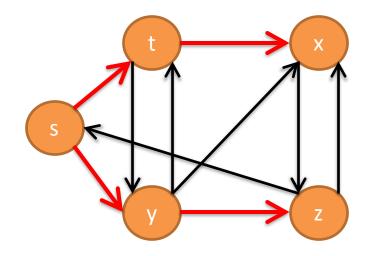
Graph with directed edges and several cycles

#### **BFS** algorithm

v.visited = true
enqueue(v)

Queue

dequeue -> y



**BFS** algorithm

enqueue(s) //start node
s.visited = true
repeat until find goal vertex or
queue empty:

u = dequeque()

Queue

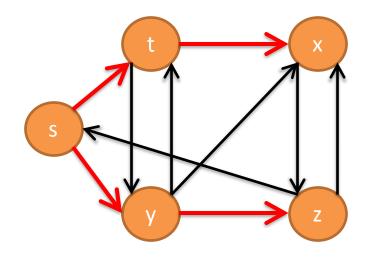
for v  $\in$  u.adjacent

if !v.visited
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Graph with directed edges and several cycles

x

enqueue y unvisited adjacent



Graph with directed edges and several cycles

#### **BFS** algorithm

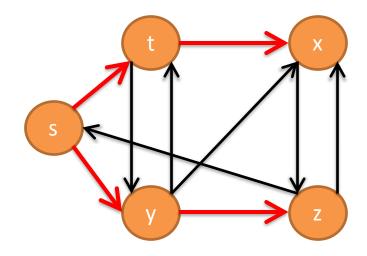
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v.visited = true

enqueue (v)







## Graph with directed edges and several cycles

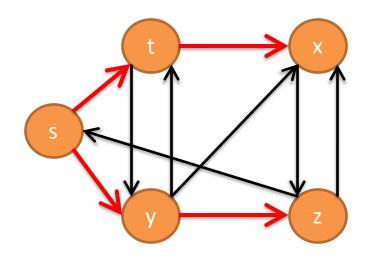
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if !v.visited
v.visited = true
```

enqueue(v)

Queue

#### dequeue -> z



#### **BFS** algorithm

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enqueue(s) //start node
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repeat until find goal vertex or
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for v E u.adjacent
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```
v.visited = true
```

enqueue(v)

#### Graph with directed edges and several cycles

#### Queue

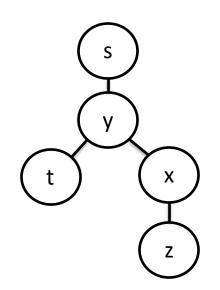
#### Done

S

- Red lines indicate a tree (root and no cycles)
- Can traverse tree to find path from *s* to others <sup>32</sup>

## DFS and BFS can create different trees, both find path from start to other vertices

DFS



t y t z

BFS

Why do we care if path has cycles?

If cycles, could get caught in endless loop computing path from s to end

#### No cycles with tree

- Has path from start to all other reachable vertices
- No cycles
- Path s to z = 3 edges

- Has <u>shortest</u> path from start to all other reachable vertices
- No cycles
- Path s to z = 2 edges



### 1. DFS and BFS on complex graph

- 2. Shortest-path simulation
  - 3. Dijkstra's algorithm
  - 4. A\* search
  - 5. Implicit graphs

# BFS considers the number of steps, but not how long each step could take

#### Fastest driving route to Seattle from Hanover



Could try to take the most direct route

- Take local roads
- Try to keep on a line between Start and Goal

OR could try to take major highways:

- New York
- Chicago
- Seattle

# Now we consider the idea that not all steps are the same

#### Fastest driving route to Seattle from Hanover



BFS would choose the direct route (one leg)

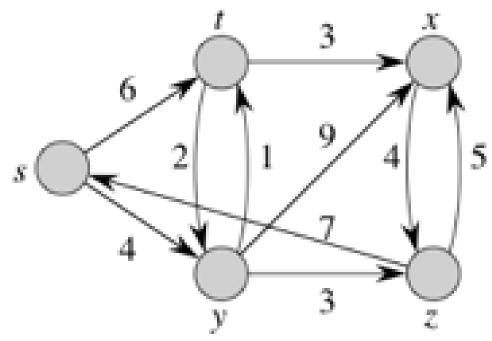
Highway travel makes larger number of steps more attractive

Note: our metric now is driving time, not number of edges, however total distance is longer!

Need a way to account for the idea that each step might have different "weight" (drive time here)

# With no negative edge weights, we can use Dijkstra's algorithm to find short paths

Goal: find shortest path to all nodes considering edge weights



Use weight as edge label (e.g., driving distance between nodes)

Start at node s (single source)

Find path with smallest sum of weights to all other nodes

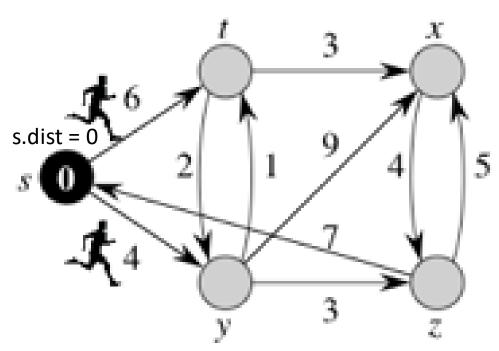
Store shortest path weights in v.dist instance variable

Keep back pointer to previous node in v.pred

Updated v.dist and v.pred if find shorter path later found  $_{\rm 37}$ 

# To get intuition, imagine sending runners from the start to all adjacent nodes

Time 0



Weights must be non-negative Why?

Could end up arriving before you left! If edge from *t* to *y* was -2, then could back up in time

### Simulation

s.dist = 0

Runners take edge weight minutes to arrive at adjacent nodes

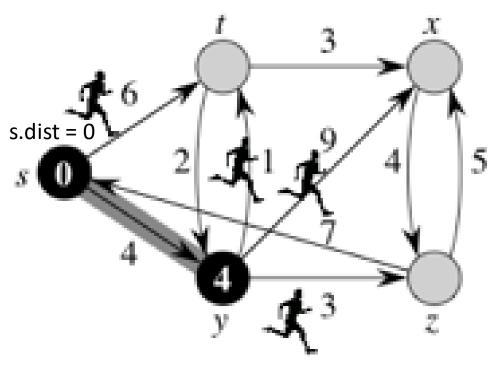
Runners arrive at node v:

- Record arrival time in v.dist
- Record prior node in v.pred

Runners immediately leave for an adjacent node

Runners leave  $\, {\tt s}$  for  ${\tt y}$  and  ${\tt t}$ 

#### Time 4



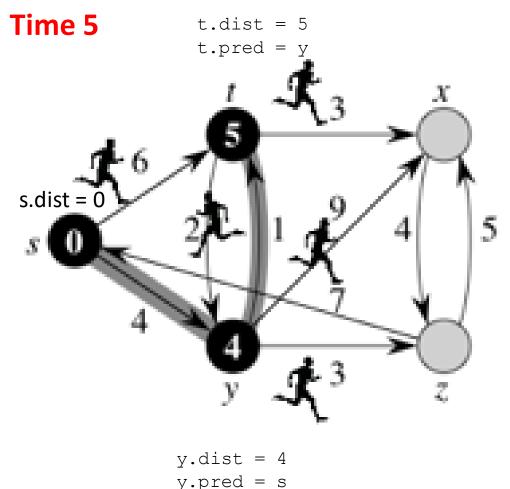
y.dist = 4 y.pred = s

Runner arrives at  $_{\rm Y}$  in 4 minutes

- Record y.dist = 4
- Record y.pred = s

Runners leave  $_{\rm Y}$  for adjacent nodes  ${\tt t},~{\tt x},~{\tt and}~{\tt z}$ 

Runner from s has not reached t yet

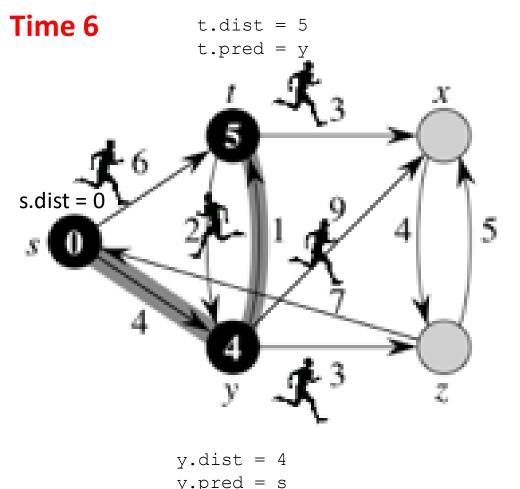


Runner from  $\gamma$  arrives at t at time 5

- t.dist = 5
- t.pred = y

Runners from  ${\tt s}\,$  still hasn't made it to  ${\tt t}\,$ 

Runners leave t for adjacent nodes x and y

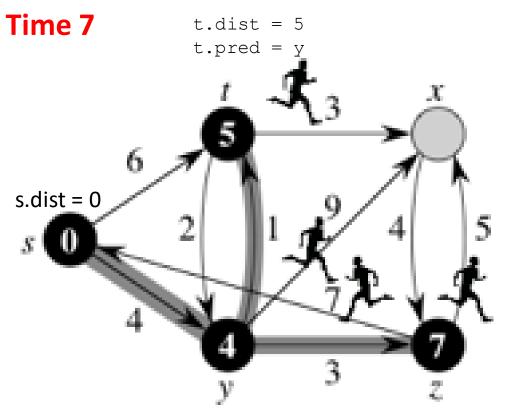


Runner from  $\, {\rm s}$  arrives at  ${\rm t}$  at time 6

Runner from y has already arrived, so best route is from y, not direct from s

Do not update t.dist and t.pred

NOTE: BFS would have chosen the direct route to  $\ensuremath{\,\mathrm{t}}$ 



Runner from y arrives at z at time 7

Record z.dist = 7 and z.pred = y

Runners leave z for s and x

y.dist = 4 z.dist = 7 y.pred = s z.pred = y

Time 8 t.dist = 5x.dist = 8t.pred = yx.pred = t $\mathbf{x}$ 6 s.dist = 0

> y.dist = 4 y.pred = s

z.dist = 7 z.pred = y

- What ADT have we seen that works well for a simulation of this nature?
- PriorityQueue!

Runner from t arrives at x at time 8

x.dist = 8, x.pred = t

All nodes explored

Now have shortest path from  ${\rm s}$  to all other nodes

Shaded lines indicate best path to each node

Path forms a tree on graph

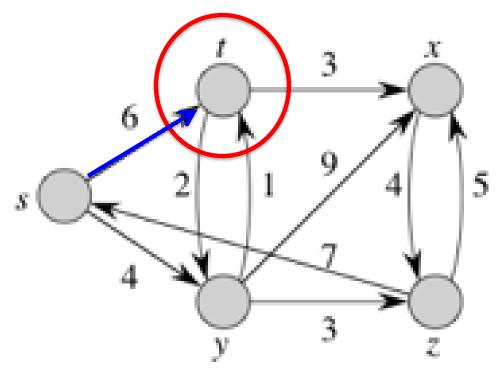
Y To find path from start to end:
 start at end and back track
 predecessors back to start 43



- 1. DFS and BFS on complex graph
- 2. Shortest-path simulation
- 3. Dijkstra's algorithm
  - 4. A\* search
  - 5. Implicit graphs

# Dijkstra's algorithms works similarly but doesn't rely on waiting for runners

### Dijkstra's algorithm



#### Overview

Start at s

Process all out edges at the same time

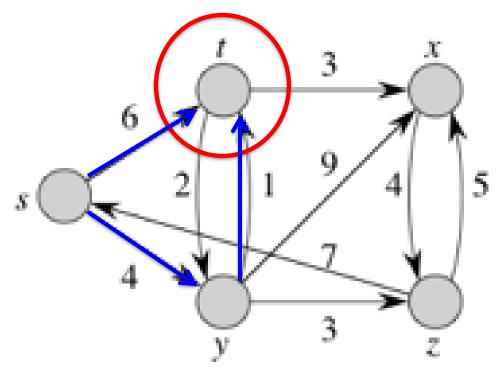
Compare distance to adjacent nodes with best so far

If current path < best, update best distance and predecessor node

Example: one hop from s set
t.dist = 6, t.pred = s

# Dijkstra's algorithms works similarly but doesn't rely on waiting for runners

### Dijkstra's algorithm



#### Overview

Start at s

Process all out edges at the same time

Compare distance to adjacent nodes with best so far

If current path < best, update best distance and predecessor node

Example: one hop from s set
t.dist = 6, t.pred = s, then
update t.dist = 5, t.pred = y
on second hop

# Dijkstra uses a Min Priority Queue with dist values as keys to get closest vertex

Dijkstra's algorithm starting from s

```
Set up Min Priority
void dijkstra(s) {
                                                        Queue
  queue = new PriorityQueue<Vertex>();
  for (each vertex v) {
                                                         Initialize dist and
     v.dist = infinity;
                                                        pred
     v.pred = null;
                                                        Use dist as key for
     queue.enqueue(v);
                                                        Min Priority Queue
  }
                                                        (initially infinite)
                          Initialize s distance to zero
  s.dist = 0;
                                                   While not all nodes
  while (!queue.isEmpty()) {
                                                   have been explored
     u = queue.extractMin();
     for (each vertex v adjacent to u)
                                                   Get closest node based
       relax(u, v);
                                                   on distance (initially s)
                                                   Examine adjacent and
```

relax

# Dijkstra defines a relax method to update best path if needed

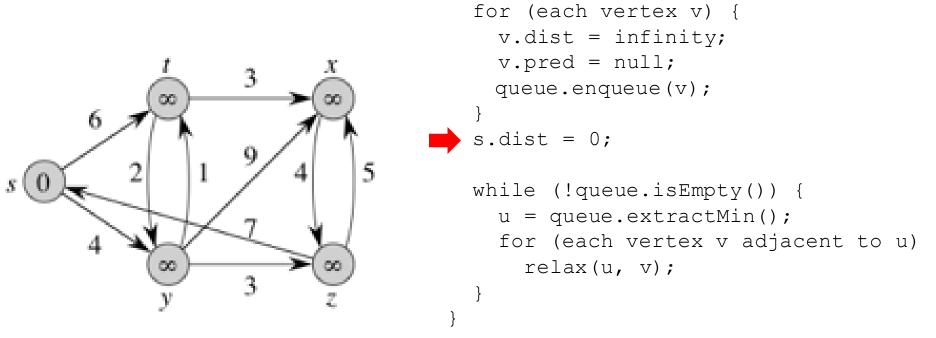
## Dijkstra's relax method

```
void relax(u, v) {
    if (u.dist + w(u,v) < v.dist) {
        v.dist = u.dist + w(u,v);
        v.pred = u;
    }
}</pre>
```

Currently at vertex u, considering distance to vertex v Check if distance to u + distance from u to v < best distance to v so far Distance from u to v is w(u, v)If shorter total distance to v than previous, then update:

```
v.dist = u.dist + w(u,v)
v.pred = u
```

### Dijkstra's algorithm

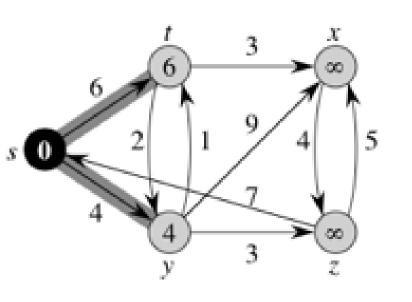


void dijkstra(s) {

queue = new PriorityQueue<Vertex>();

All nodes have distance Infinity, except Start with distance 0 Distances shown in center of vertices extractMin() from Min Priority Queue first selects s (dist =0)

### Dijkstra's algorithm

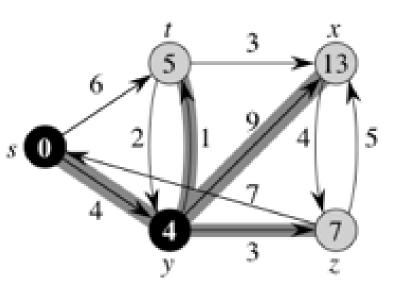


```
void dijkstra(s) {
  queue = new PriorityQueue<Vertex>();
  for (each vertex v) {
    v.dist = infinity;
    v.pred = null;
   queue.enqueue(v);
  s.dist = 0;
  while (!queue.isEmpty()) {
    u = queue.extractMin();
    for (each vertex v adjacent to u)
      relax(u, v);
```

Loop over all adjacent nodes  ${\rm v}$ 

- If distance less than smallest so far, then relax
- That is the case here, so update dist and pred on t and y

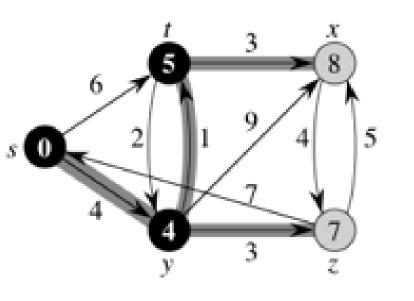
### Dijkstra's algorithm



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    u = queue.extractMin();
    for (each vertex v adjacent to u)
        relax(u, v);
  }
}
```

extractMin() now picks y (dist=4) Look at adjacent t, x, and z Relax each of them

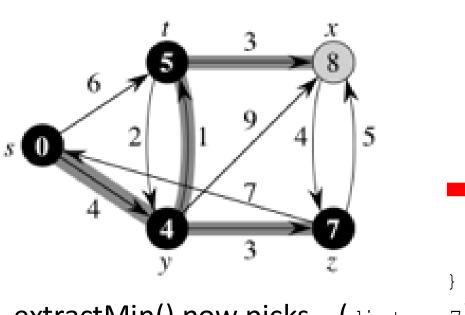
### Dijkstra's algorithm



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    v.dist = infinity;
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    queue.enqueue(v);
  }
  s.dist = 0;
  while (!queue.isEmpty()) {
    u = queue.extractMin();
    for (each vertex v adjacent to u)
        relax(u, v);
  }
```

extractMin() now picks t (dist =5)
Look at adjacent x and y
Relax x, but not y

### Dijkstra's algorithm

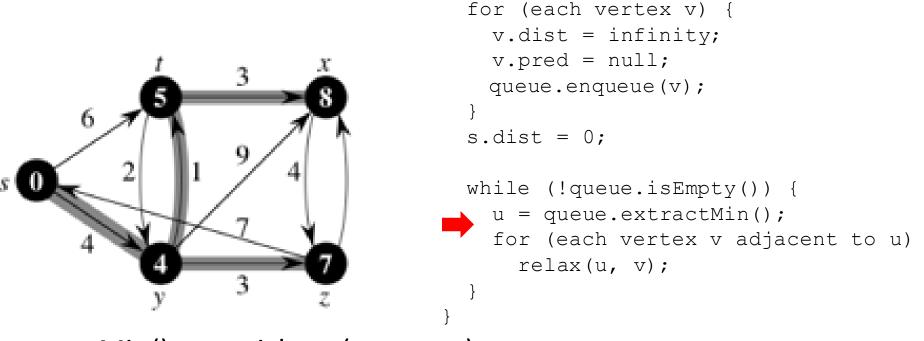


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  for (each vertex v) {
    v.dist = infinity;
    v.pred = null;
    queue.enqueue(v);
  }
  s.dist = 0;
  while (!queue.isEmpty()) {
    u = queue.extractMin();
    for (each vertex v adjacent to u)
```

relax(u, v);

extractMin() now picks z (dist = 7) Look at adjacent x and s Do not relax x or s

### Dijkstra's algorithm



void dijkstra(s) {

queue = new PriorityQueue<Vertex>();

- extractMin() now picks x (dist = 8)
- Look at adjacent z
- Do not relax  $\rm z$
- Done!

## Run-time complexity is O(n log n + m log n)

## Dijkstra's algorithm

- Assume n nodes and m edges
- Add and remove each vertex once in Priority Queue
- Relax each edge (and perhaps reduce key) once
- O(n\*(insert time + extractMin) + m\*(reduceKey))
- If using heap-based Priority Queue, then each queue operation takes O(log n)
- Total =  $O(2n \log n + m \log n) = O(n \log n + m \log n)$
- Can implement with a Fibonacci heap with O(n<sup>2</sup>)
- Take CS31 to find out how!



- 1. DFS and BFS on complex graph
- 2. Shortest-path simulation
- 3. Dijkstra's algorithm
- 📥 4. A\* search
  - 5. Implicit graphs

## Dijkstra's algorithm can find shortest path but what about a huge graph?

Consider a GPS device that finds path from current location to destination

How does it find path quickly?

Roads from Hanover can lead up to Alaska or down to Argentina!

Does the "little" GPS computer consider all those roads?

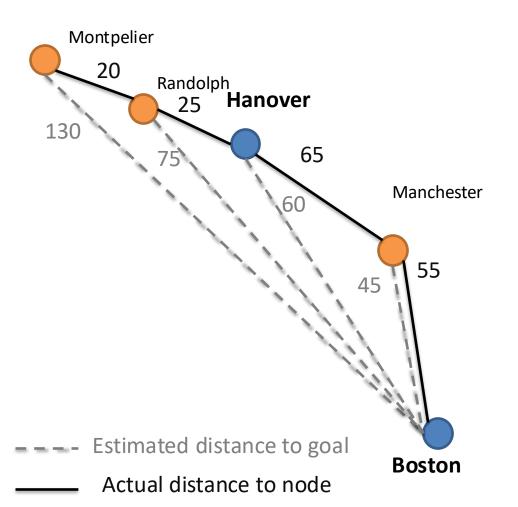
NO! It uses variant of Dijkstra called A\* to rule out paths that will clearly be longer than best path discovered so far



A\* is able to "stop early", without considering every possible path

Interview example

#### A\* algorithm from Hanover to Boston

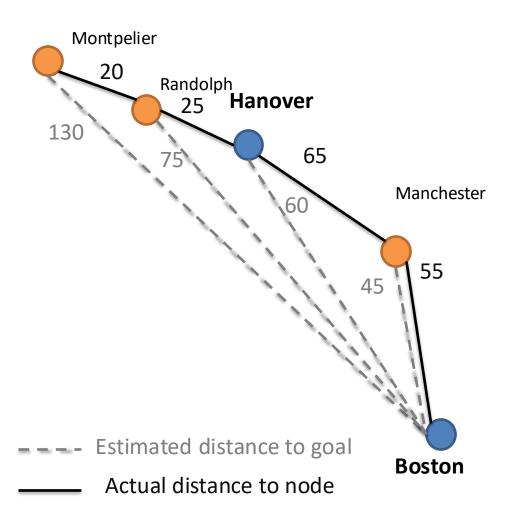


Estimate distance to goal (maybe use Euclidean distance) from each node

Estimate must be ≤ actual distance (admissible)

Distances non-negative (distance monotonically increasing; driving further cannot make trip shorter!)

#### A\* algorithm from Hanover to Boston



Keep Priority Queue using distance so far + estimate for each node ("open set")

Keep "closed set" where we know we already found the best route

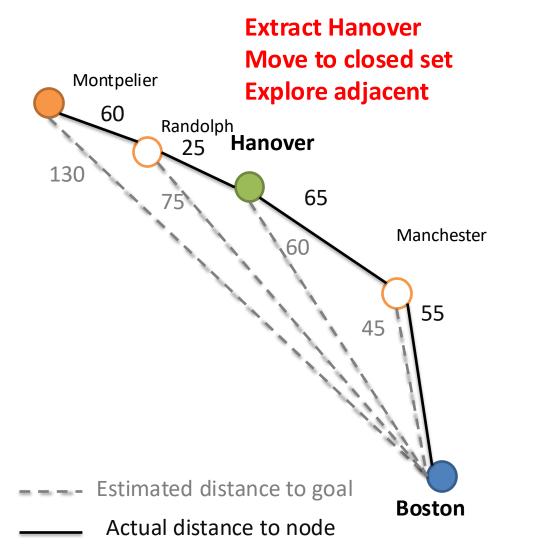
#### Step 1: Start at Hanover, add to Open set

Montpelier 20 Randolph Hanover 25 130 65 Manchester 55 45 Estimated distance to goal **Boston** Actual distance to node

**Open set (Priority Queue)** Hanover 0 + 60 = 60

**Closed set** 

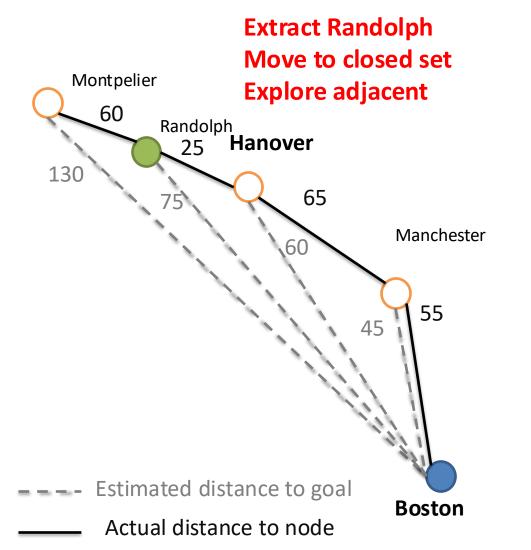
#### Step 2: extractMin from Open set and explore adjacent



**Open set (Priority Queue)** Randolph 25 + 75 = 100 Manchester = 65 + 45 = 110

Closed set Hanover 0 + 60 = 60

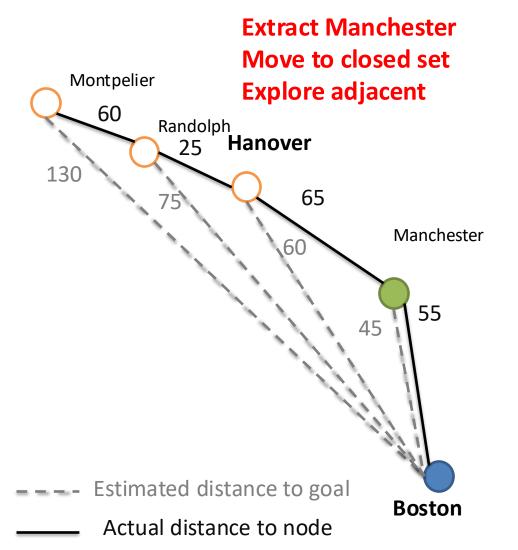
#### Step 3: extractMin from Open set and explore adjacent



**Open set (Priority Queue)** Manchester = 65 + 45 = 110 Montpelier = 25 + 60 + 130 = 215

**Closed set** Hanover 0 + 60 = 60 Randolph 25 + 75 = 100

#### Step 4: extractMin from Open set and explore adjacent

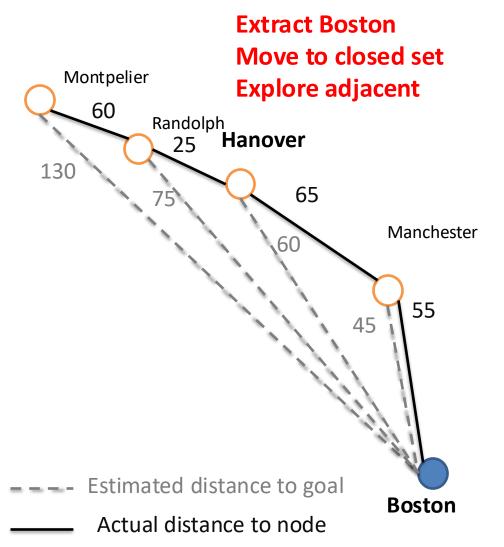


**Open set (Priority Queue)** Boston = 65 + 55 + 0 = 120 Montpelier = 25 + 60 + 130 = 215

#### **Closed set**

Hanover 0 + 60 = 60 Randolph 25 + 75 = 100 Manchester = 65 + 45 = 110

#### Step 5: extractMin from Open set and explore adjacent



**Open set (Priority Queue)** Montpelier = 25 + 60 + 130 = 215

#### **Closed set**

Hanover 0 + 60 = 60Randolph 25 + 75 = 100 Manchester = 65 + 45 = 110Boston = 65 + 55 + 0 = 120Found goal at distance of 120

- Still check nodes in open set with estimate less than this route (120)
- No need to check other routes
- Montpelier can't be closer, a straight line would be greater than best path so far



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# Demo: Model maze intersections as vertices and run DFS/BFS/A\*

## MazeSolver.java

- Run
- Load map 5
- Try with:
  - Stack == DFS
  - Queue = BFS
  - A\*