CS 3100
Data Structures and Algorithms 2
Lecture 6: Dijkstra's Shortest Path Algorithm

Co-instructors: Robbie Hott and Tom Horton

Fall 2023

Readings in CLRS 4th edition:

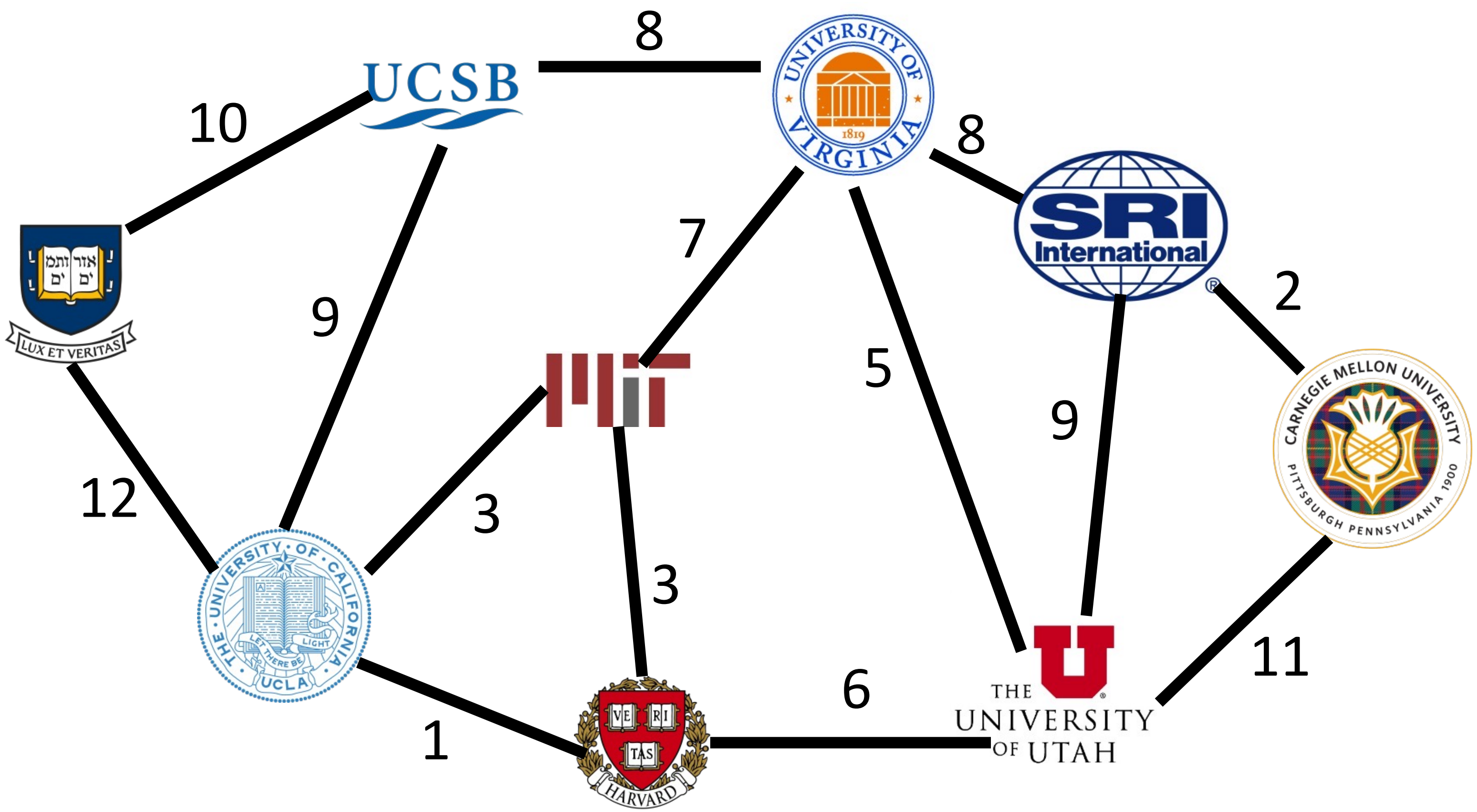
- Section 22.3

Announcements

- Upcoming dates
  - PS1 due ~~Sept 8 (Friday) at 11:59pm~~ Tuesday, Sept 12 at 11:59pm
  - PA1 due Sept 17 (Sunday) at 11:59pm
- Office Hours
  - Prof Hott: 3-5pm Monday, 4-5pm Thursday
  - Prof Horton: 2-3:30 Mon, 3:30-5 Tue, 2:30-4 Thu, 2-3 Fri
  - TA office hours posted online
- Extension request form now available (on course website)
- Course email (comes to both professors and head TAs):

cs3100@cshelpdesk.atlassian.net

Single-Source Shortest Path Problem



Find the <u>shortest path</u> based on sum of edge-weights from UVA to each of these other places.

The problem: Given a graph $G = (V, E)$ and a start node (i.e., source) $s \in V$,

for each $v \in V$ find the minimum-weight path from $s \to v$ (call this weight $\delta(s, v)$)

Assumption (for this unit): all edge weights are positive

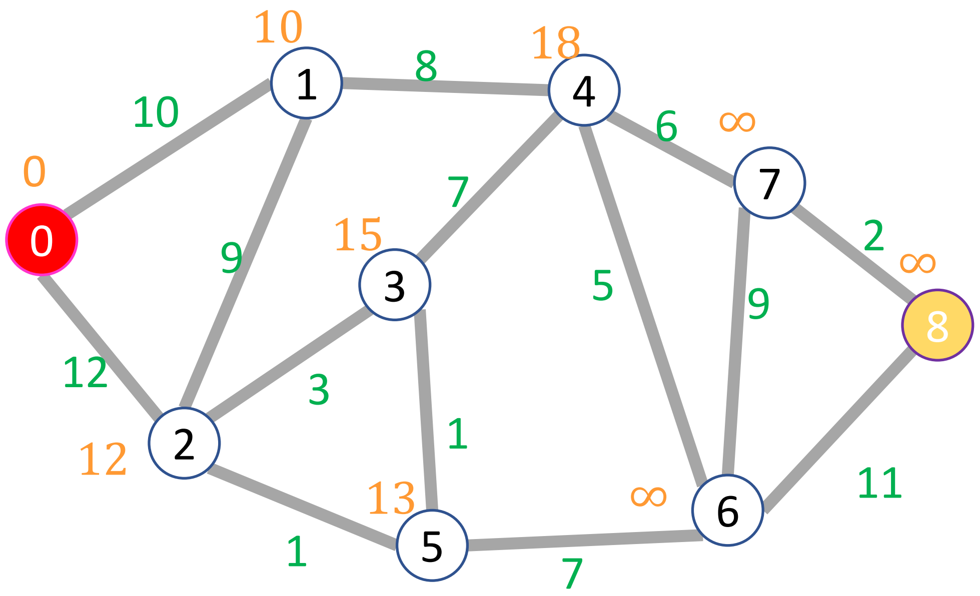
Dijkstra's Algorithm

Input: graph with **no negative edge weights**, start node s, end node t

Behavior: Start with node s, repeatedly go to the incomplete node "nearest" to s, stop when

Output:

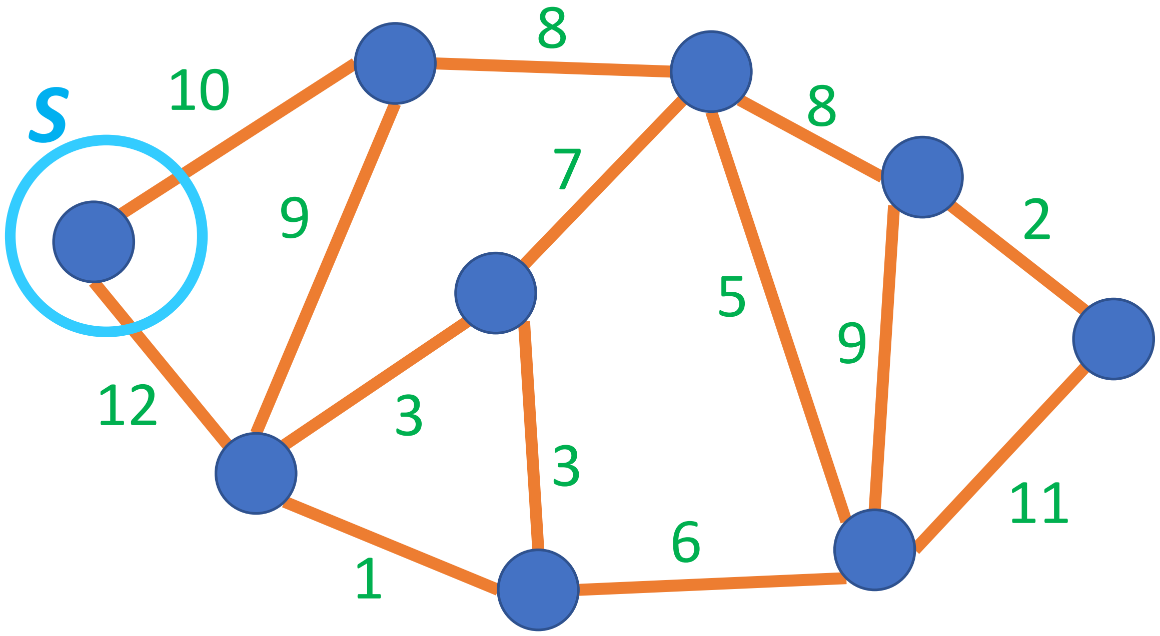
- Distance from start to end
- Distance from start to every node



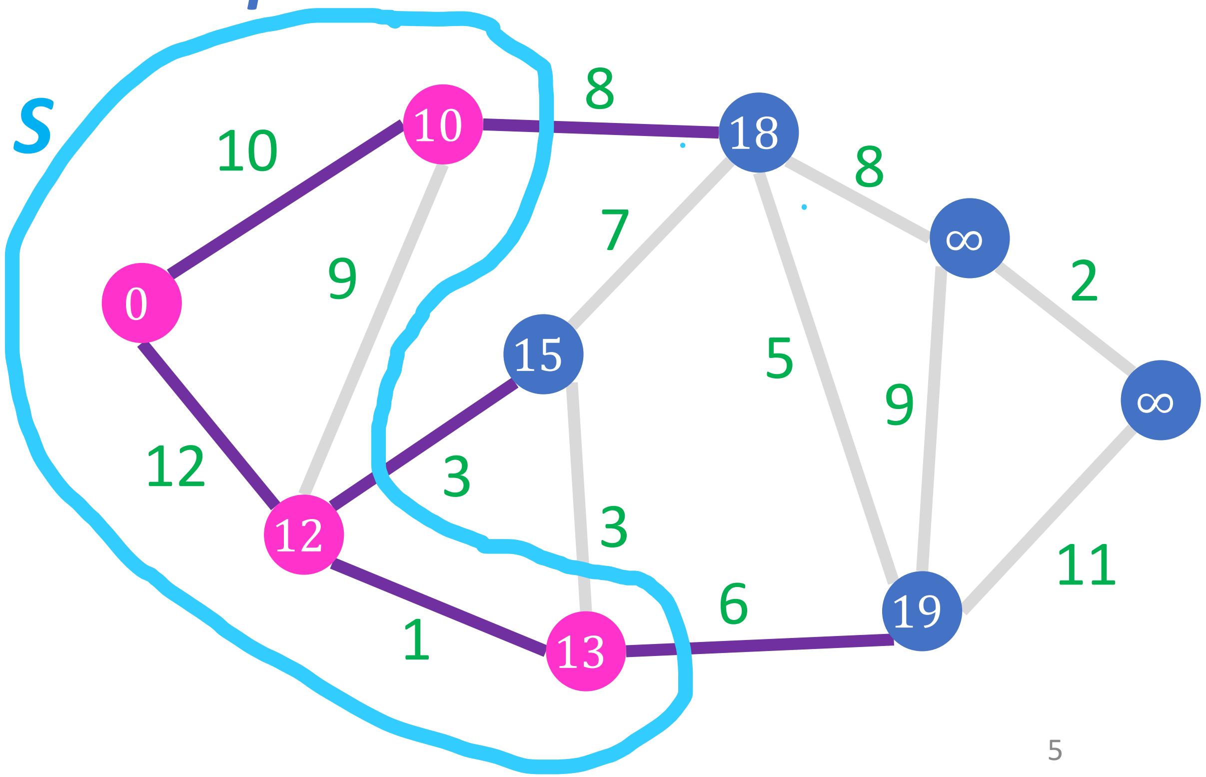
Dijkstra's Algorithm

1. Start with an empty tree S and add the source to S
2. Repeat $|V| - 1$ times:
   - At each step, add the node "nearest" to the source not yet in S to S

Initially:



At some point later:



Data Structure to Store Nodes

The strategy: At every step, choose node not in *S* that's closest to source

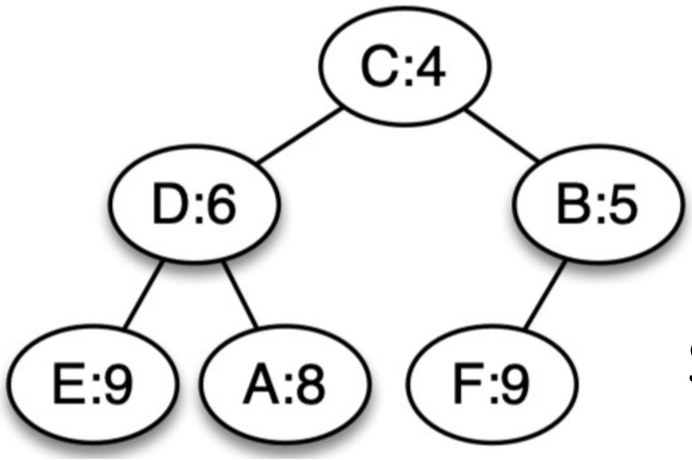
To do this efficiently, we need a data structure that:

- Stores a set of (node, distance) pairs
- Allows efficient removal of the pair with smallest distance
- Allows efficient additions and updates

This is the **Priority Queue** ADT (Abstract Data Type)!
Remember the **binary heap** data structure?

We'll need a **min-heap** (node with smallest priority at the root)

Review: Storing a Heap in an Array



Min-heap stored in array

0	1	2	3	4	5	6
:-1	C:4	D:6	B:5	E:9	A:8	F:9

Must store the key (priority) value, and maybe other info (e.g. node ID)

Store the elements in a one-dimensional array in strict left-to-right, **level order**

That is, we store all of the nodes on the tree's level *i* from left to right before storing the nodes on level *i* + 1.

- *Usually we ignore index position 0*
- *Simple formulas to find children, siblings,…*
  - ***2i**: left child, **2i+1**: right child*
  - ***floor(i/2)**: parent*

Review: Heap Operations

extractMin() *perhaps called poll() in CS 2100*

- Returns and removes the item with the min key (e.g. the heap's root)
- Move last item to root and "bubble it down" to correct location
- Complexity: O(log n)

insert(item, key) *perhaps called push() in CS 2100*

- Add new item at end of array and "bubble it up" to correct location
- Complexity: O(log n)

decreaseKey(item, newKey) *not covered in CS 2100!*

- Find item in min-heap, decrease its key, and "bubble it up" to correct location
- Complexity: uh oh! Can we find item quickly, i.e. in O(log n)?
- Could sequential search the array. Then complexity is O(n)
- We <u>**can**</u> do this in O(log n) if we use **indirect heaps** (details later)

Dijkstra's Algorithm Implementation

1. Start with an empty tree S and add the source to S
2. Repeat $|V| - 1$ times:
   - Add the node to S that's not yet in S and that's "nearest" to source

Implementation:

initialize $d_v = \infty$ for each node v
add all nodes $v \in V$ to the priority queue PQ, using d_v as the key
set $d_s = 0$
while PQ is not empty:
  $v = \mathrm{PQ}.\mathrm{extractMin}()$
  for each $u \in V$ such that $(v, u) \in E$:
    if $u \in \mathrm{PQ}$ and $d_v + w(v, u) < d_u$:
      $\mathrm{PQ}.\mathrm{decreaseKey}(u, d_v + w(v, u))$
      $u.\mathrm{parent} = v$

each node also maintains a parent, initially `NULL`

key: length of shortest path $s \to u$ using nodes in PQ

Dijkstra's Algorithm Implementation

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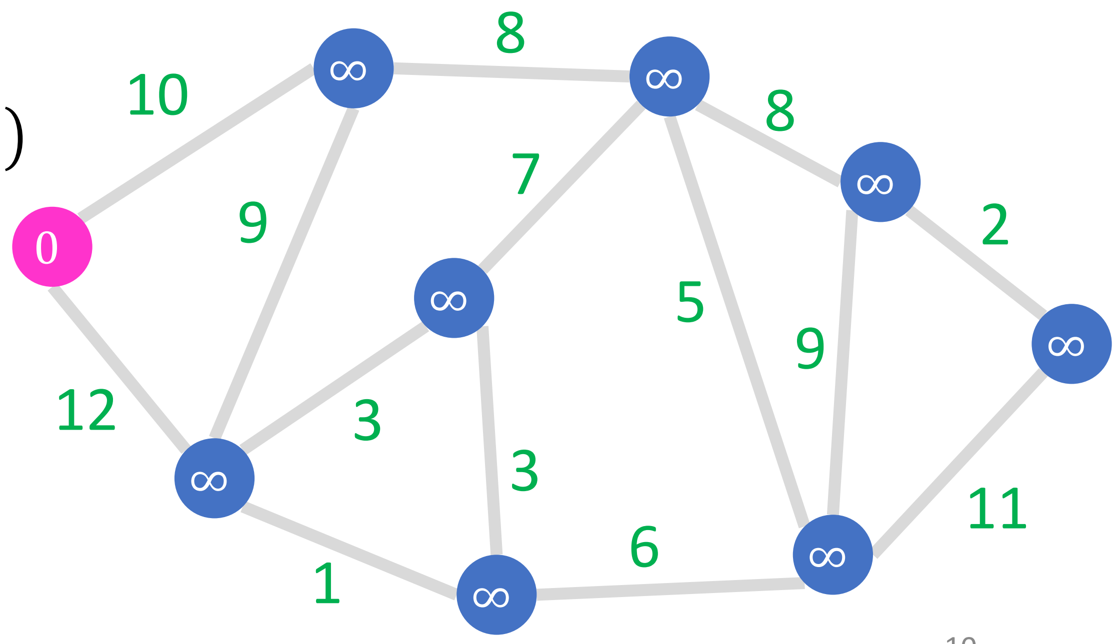

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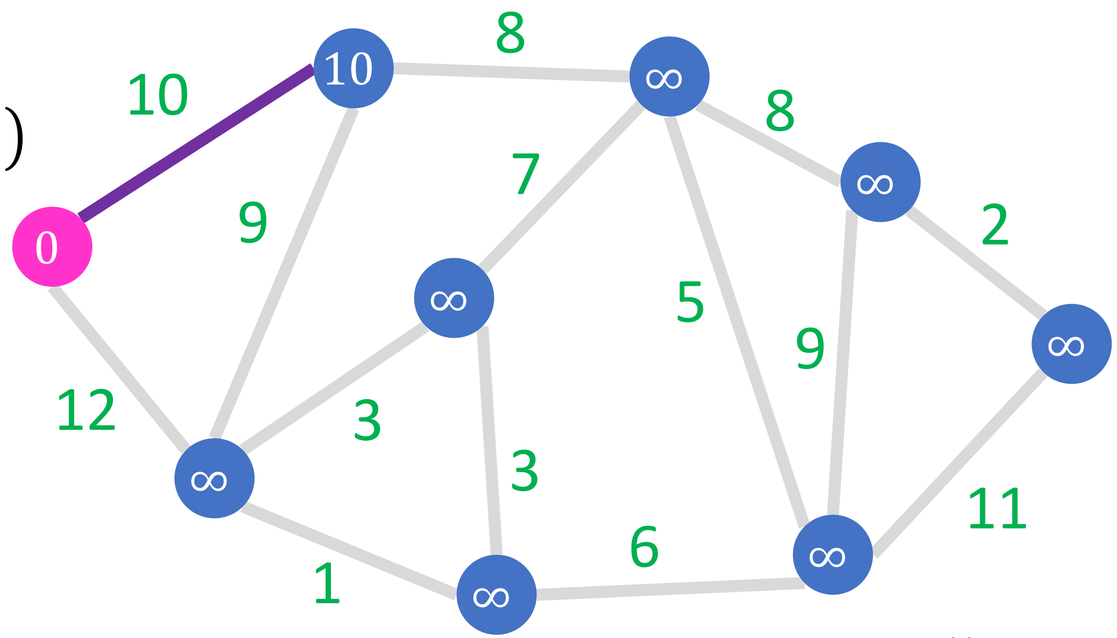

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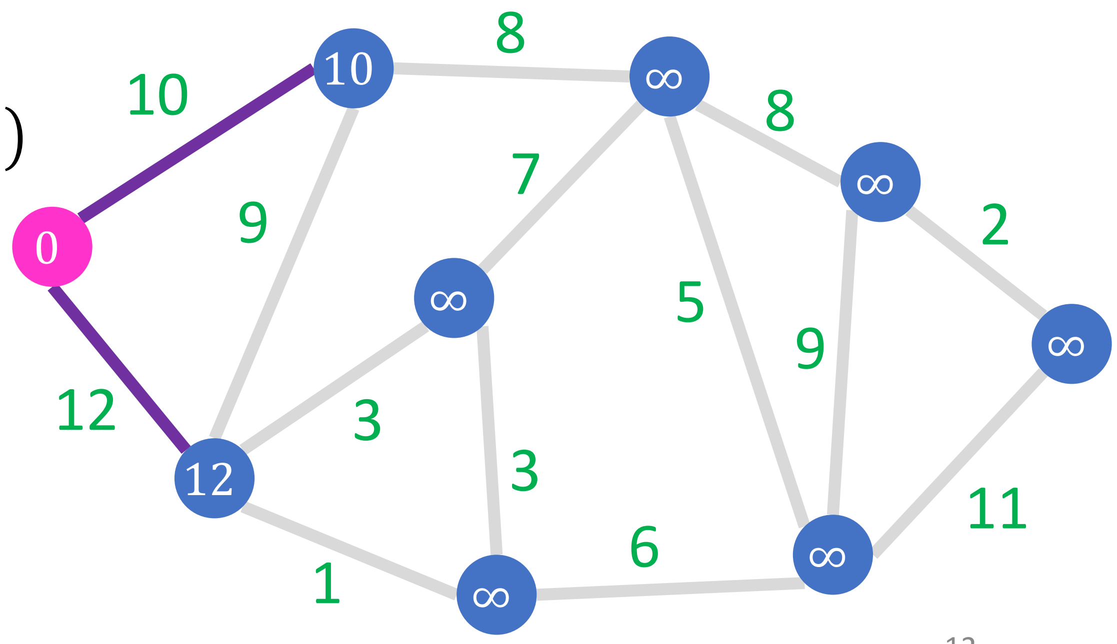

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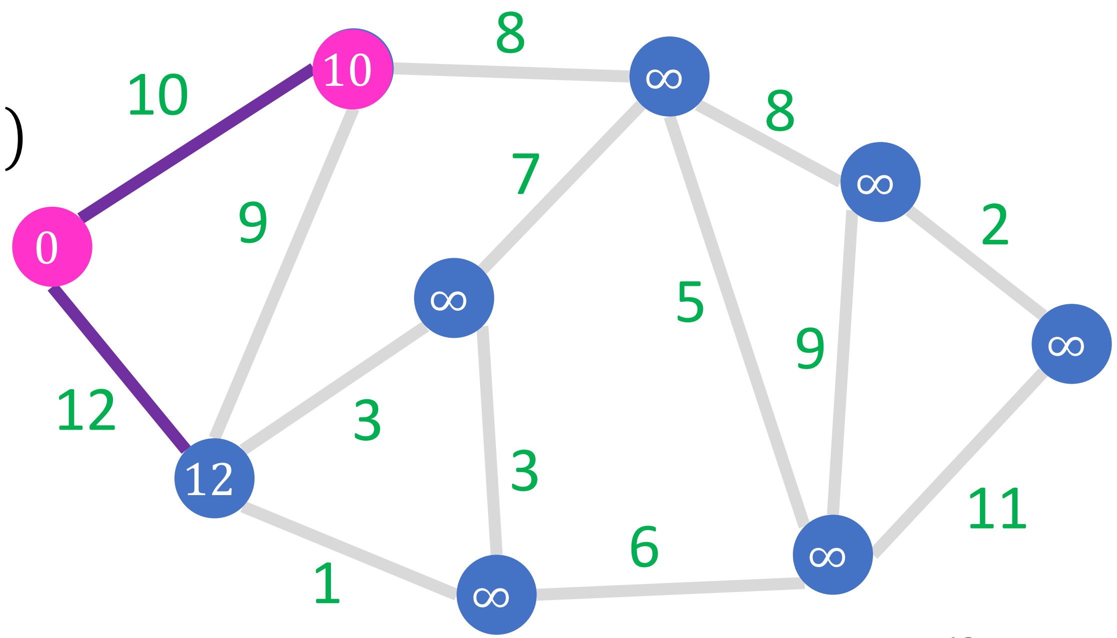

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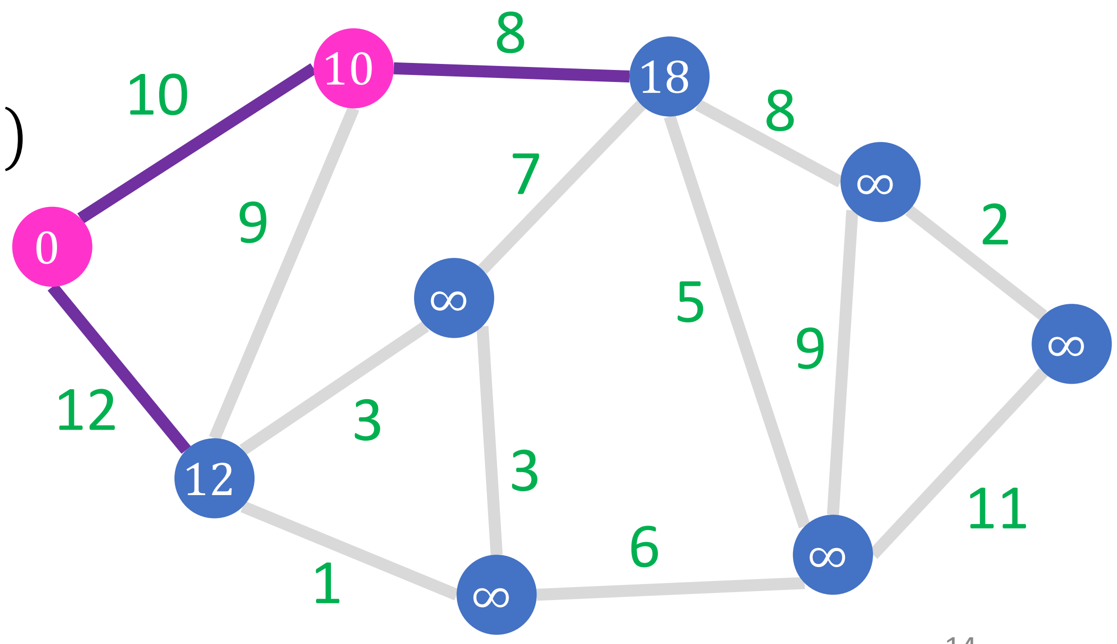

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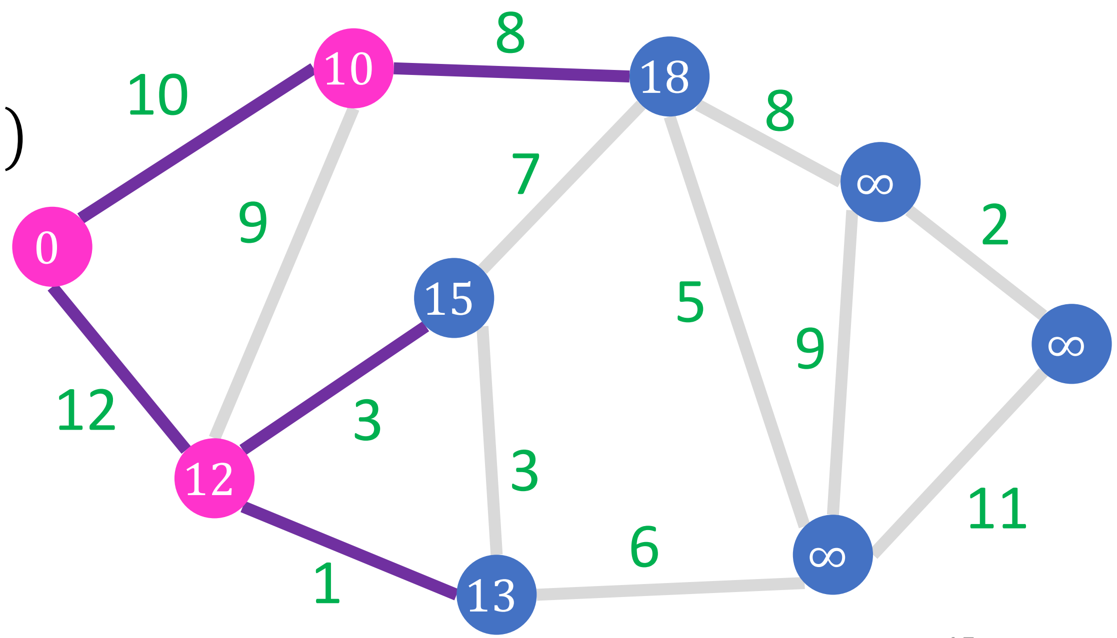

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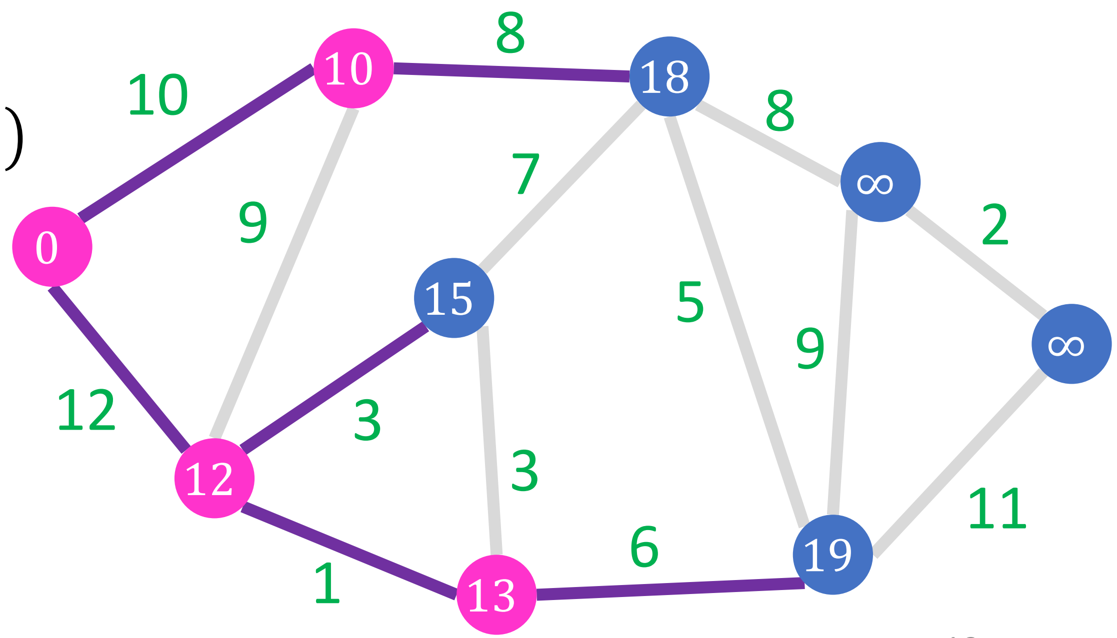

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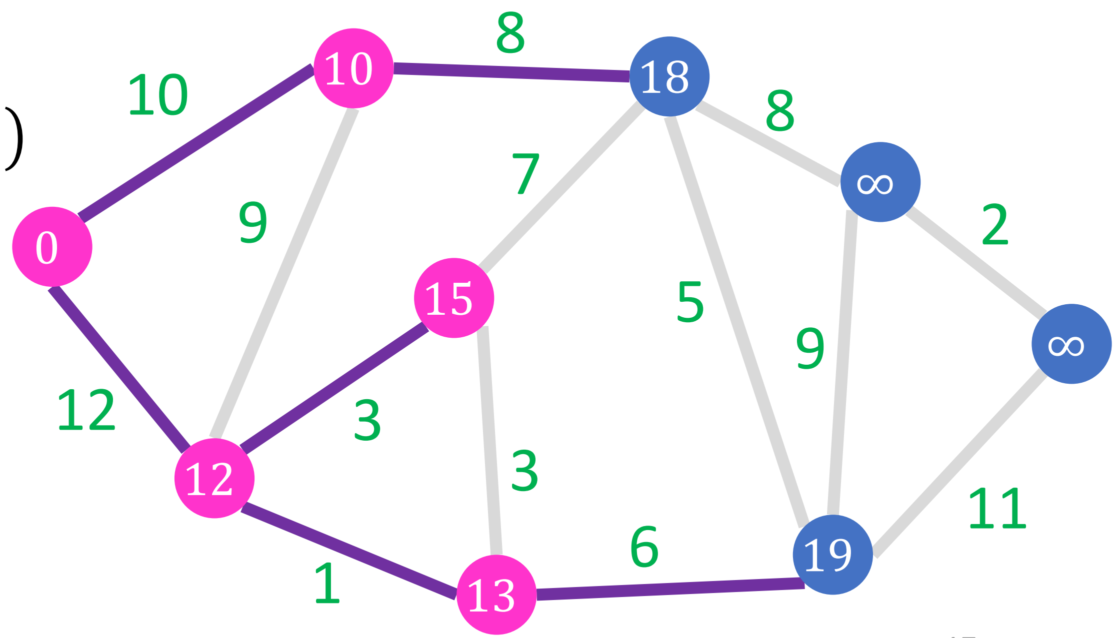

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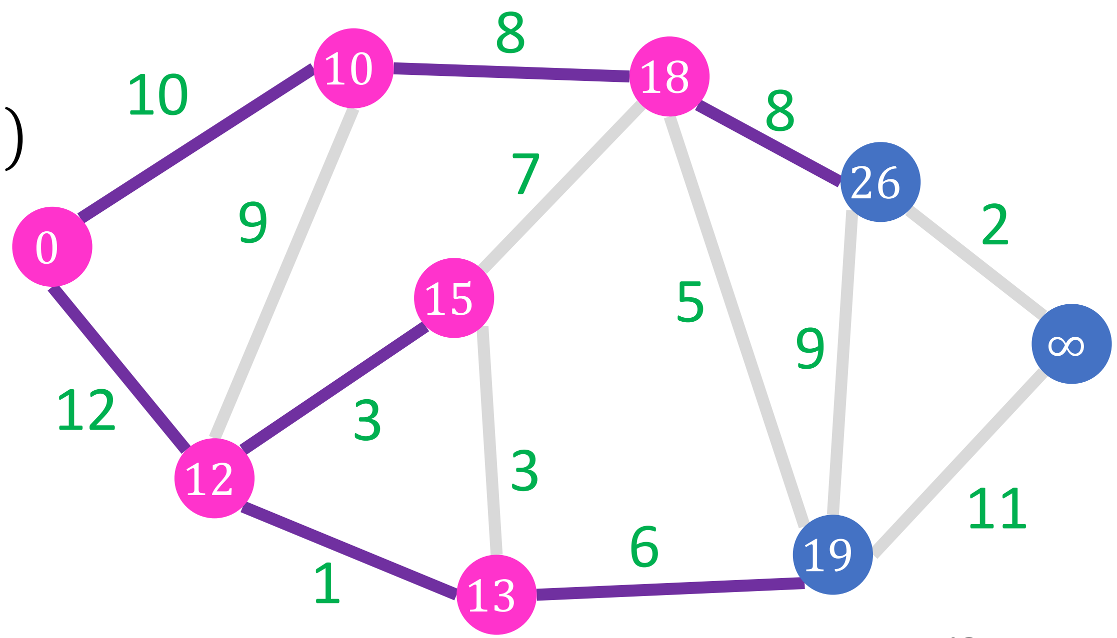

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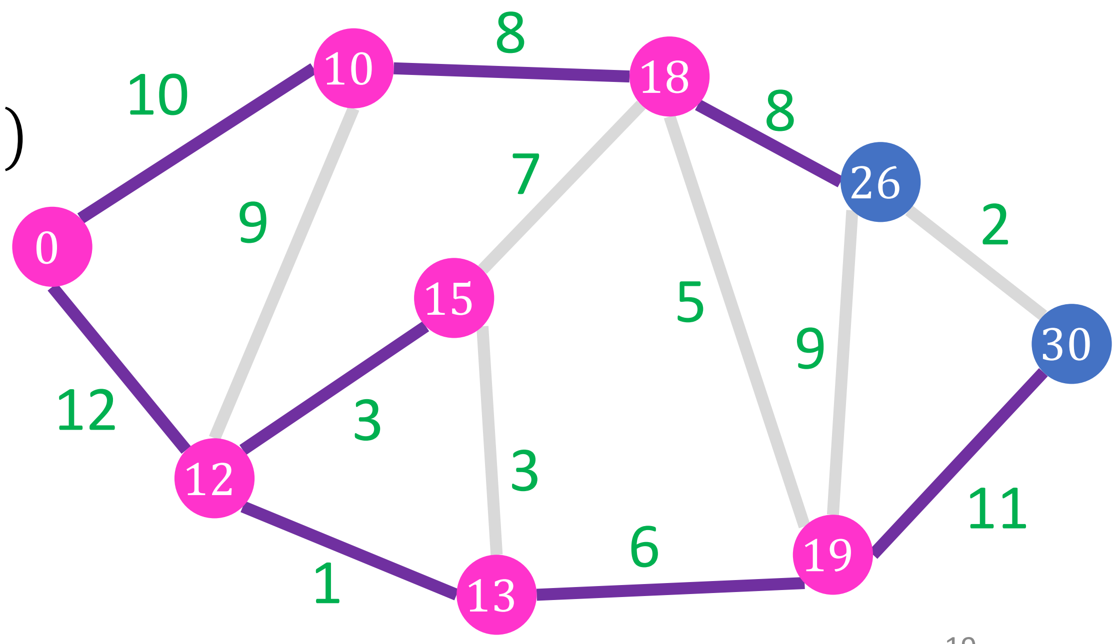

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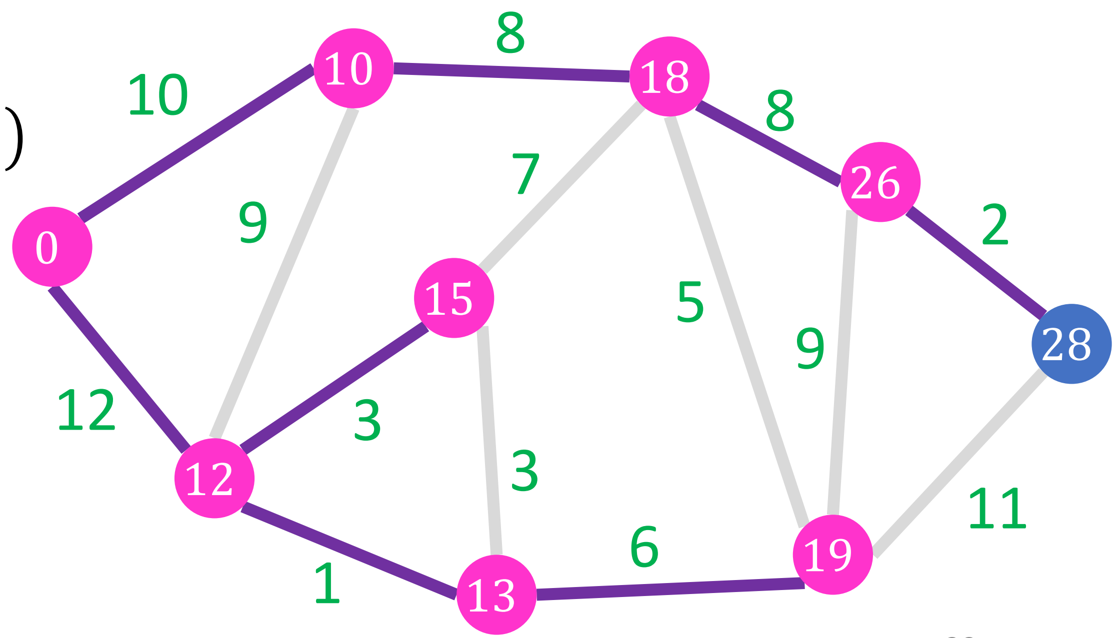

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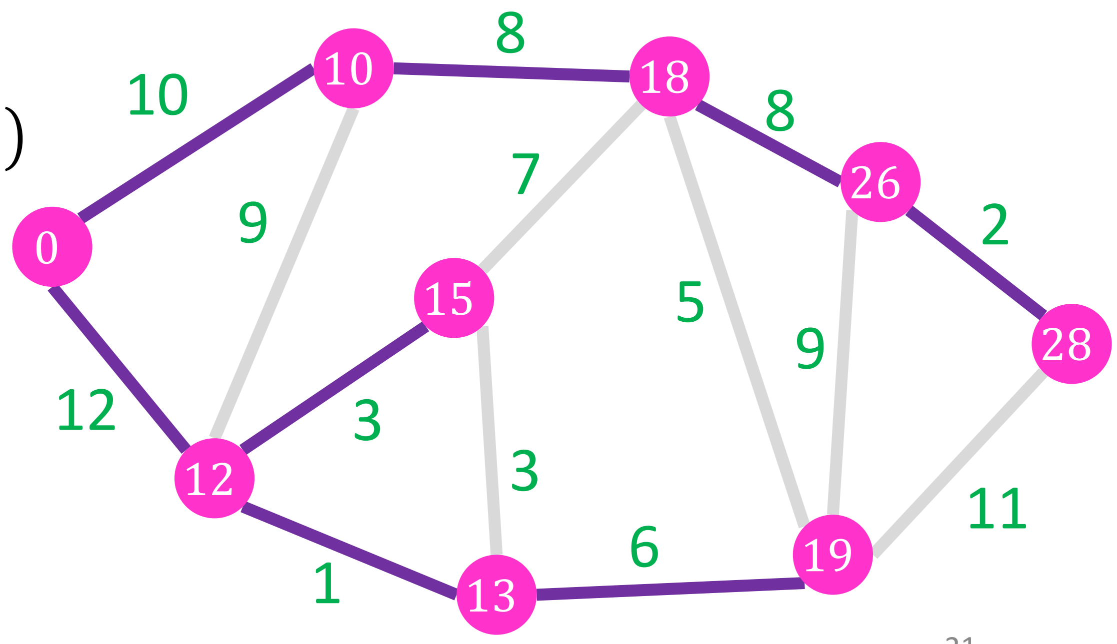

Observe: shortest paths from a source forms a tree, shortest path to every reachable node

Every subpath of a shortest path is itself a shortest path. (This is called the *optimal substructure property*.)

Dijkstra's Algorithm Running Time

Implementation:

initialize $d_v = \infty$ for each node v
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set $d_s = 0$
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Initialization:
$O(|V|)$

$|V|$ iterations

$O(\log|V|)$

$|E|$ iterations total

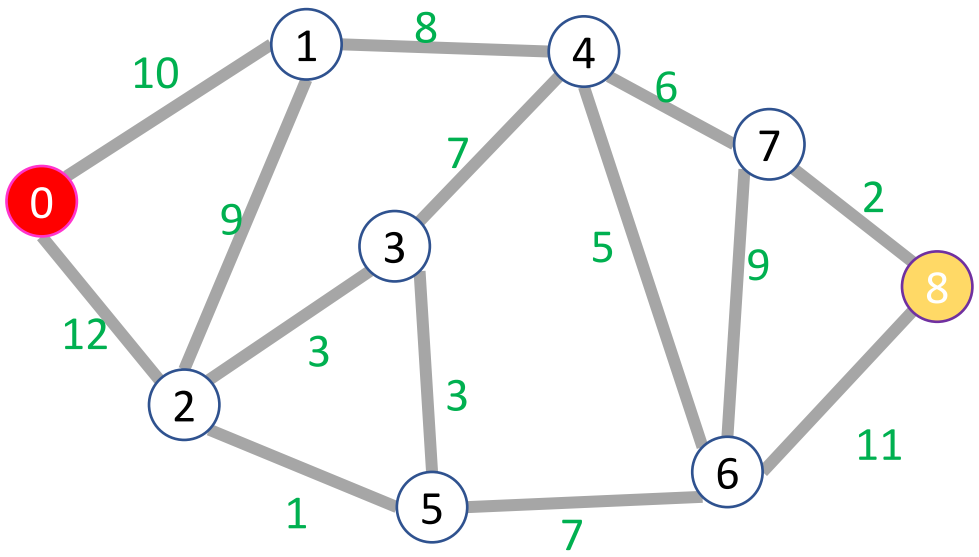
?? $O(\log|V|)$ if we use indirect heaps

$$\boxed{\begin{array}{l}|V| = n \\ |E| = m\end{array}}$$

Overall running time: $O(|V|\log|V| + |E|\log|V|) = O(|E|\log|V|)$
or, $O(m \log n)$

Python-like Code for Dijkstra's Algorithm

```
def Dijkstras(graph, start, end):
        distances = [∞, ∞, ∞,…]  # one index per node
        done = [False,False,False,…]  # one index per node
        PQ = priority queue  # e.g. a min heap
        PQ.insert((0, start))
        distances[start] = 0
        while PQ is not empty:
                current = PQ.extractmin()
                if done[current]: continue
                done[current] = True
                for each neighbor of current:
                        if not done[neighbor]:
                                new_dist = distances[current]+weight(current,neighbor)
                                if new_dist < distances[neighbor]:
                                        distances[neighbor] = new_dist
                                        PQ.insert((new_dist,neighbor))
        return distances[end]
```



Dijkstra’s Algorithm

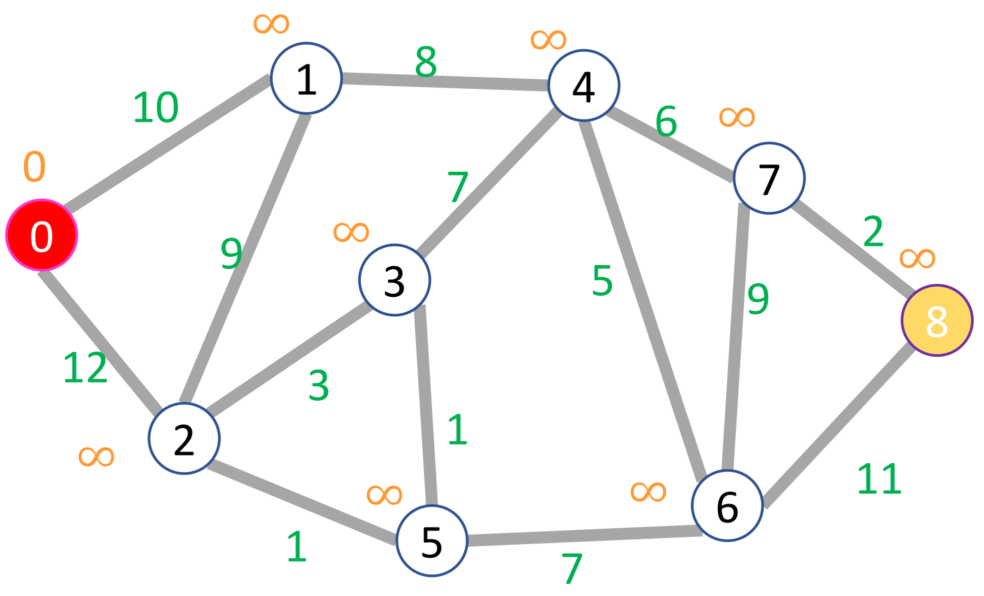
Start: 0

End: 8

Idea: When a node is the closest undiscovered thing to the start, we have found its shortest path

Node	Done?
0	F
1	F
2	F
3	F
4	F
5	F
6	F
7	F
8	F

Node	Distance
0	0
1	∞
2	∞
3	∞
4	∞
5	∞
6	∞
7	∞
8	∞



Dijkstra's Algorithm

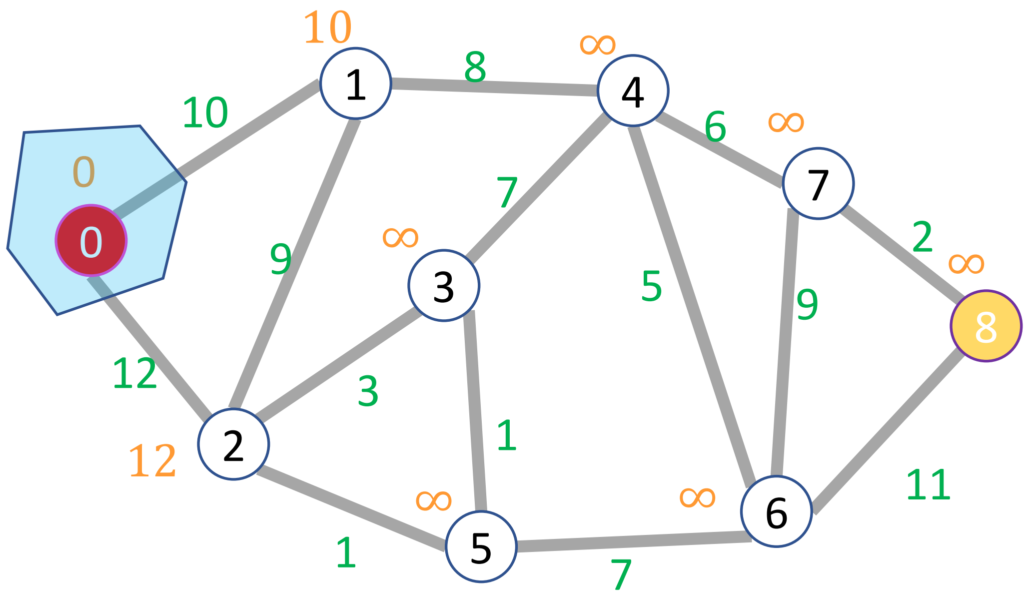
Start: 0

End: 8

Idea: When a node is the closest undiscovered thing to the start, we have found its shortest path

Node	Done?
0	T
1	F
2	F
3	F
4	F
5	F
6	F
7	F
8	F

Node	Distance
0	0
1	10
2	12
3	∞
4	∞
5	∞
6	∞
7	∞
8	∞



Dijkstra's Algorithm

Start: 0

End: 8

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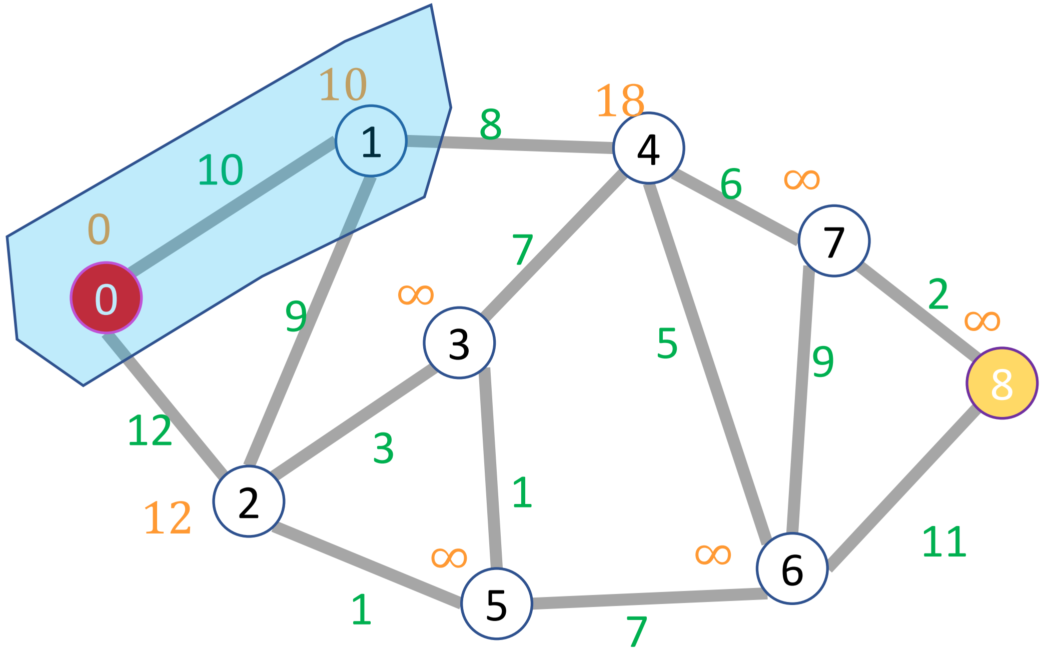
Node	Done?
0	T
1	T
2	F
3	F
4	F
5	F
6	F
7	F
8	F

Node	Distance
0	0
1	10
2	12
3	∞
4	18
5	∞
6	∞
7	∞
8	∞



Dijkstra's Algorithm

Start: 0

End: 8

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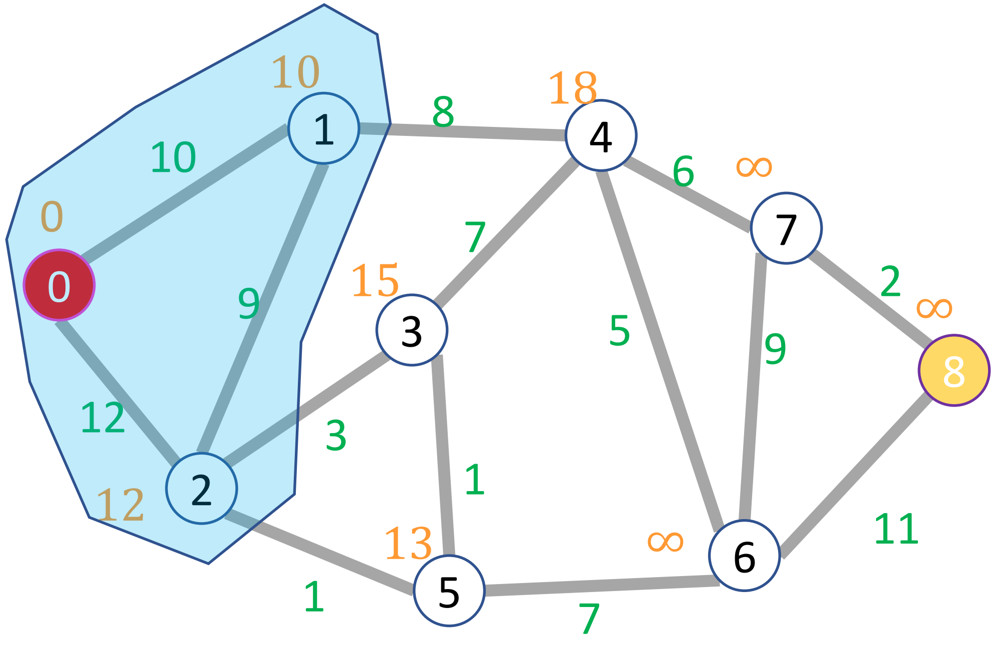
Node	Done?
0	T
1	T
2	T
3	F
4	F
5	F
6	F
7	F
8	F

Node	Distance
0	0
1	10
2	12
3	15
4	18
5	13
6	∞
7	∞
8	∞



Dijkstra’s Algorithm

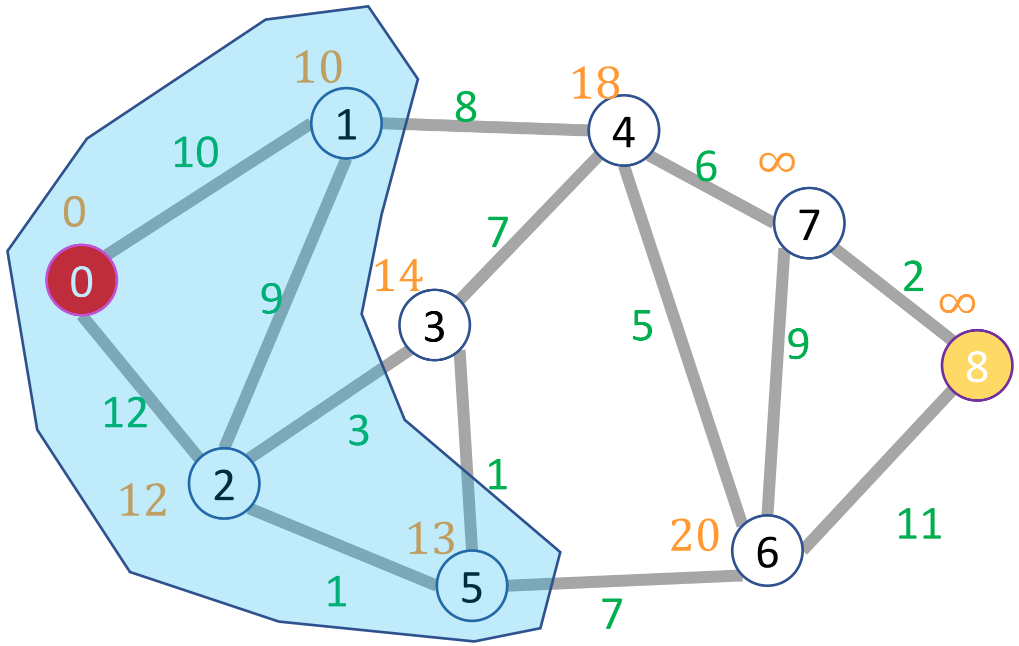
Start: 0

End: 8

Idea: When a node is the closest undiscovered thing to the start, we have found its shortest path

Node	Done?
0	T
1	T
2	T
3	F
4	F
5	T
6	F
7	F
8	F

Node	Distance
0	0
1	10
2	12
3	14
4	18
5	13
6	∞
7	20
8	∞



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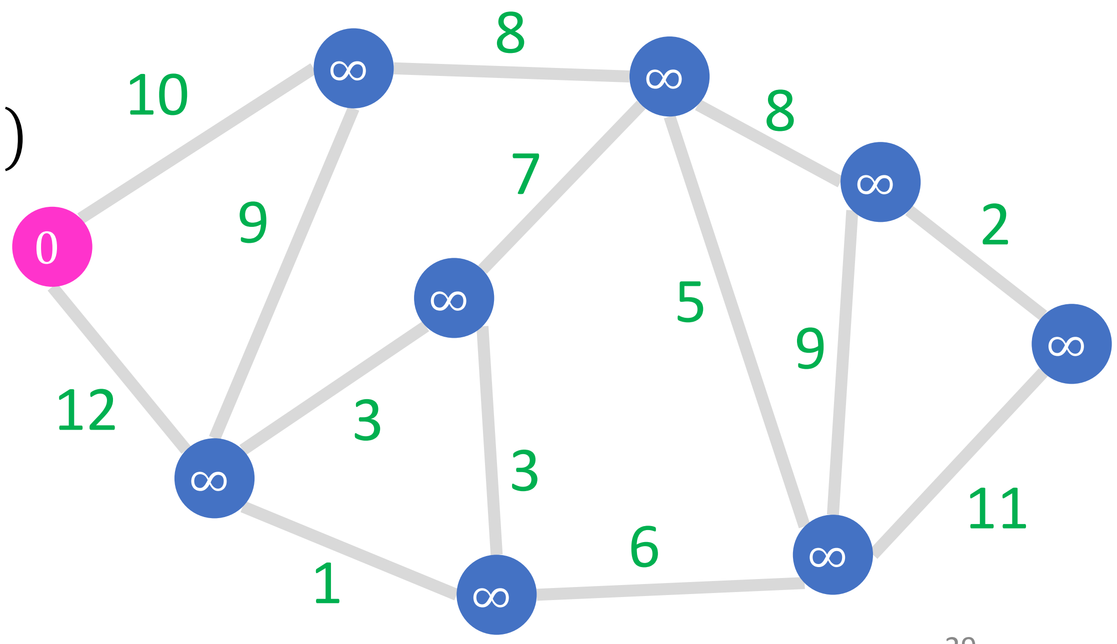


Dijkstra's Algorithm Proof Strategy

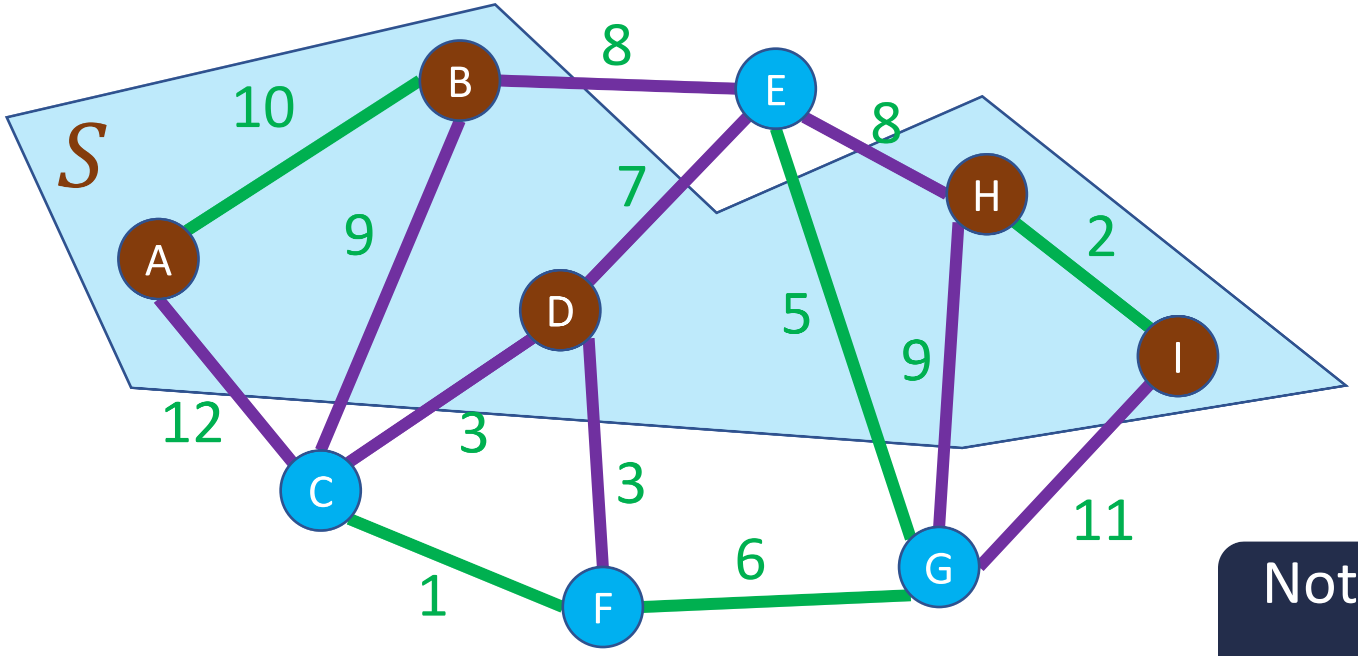
Proof by induction

Proof Idea: we will show that when node u is removed from the priority queue, $d_u = \delta(s, u)$ where $\delta(s, u)$ is the shortest distance

- **Claim 1:** There is a path of length d_u (as long as $d_u < \infty$) from s to u in G
- **Claim 2:** For every path $(s, \dots, u)$, $w(s, \dots, u) \geq d_u$

Graph Cuts

A **cut** of a graph $G = (V, E)$ is a partition of the nodes into two sets, S and $V - S$



Notion extends naturally to a set of edges

An edge $(v_1, v_2) \in E$ crosses a cut if $v_1 \in S$ and $v_2 \in V - S$

An edge $(v_1, v_2) \in E$ respects a cut if $v_1, v_2 \in S$ or if $v_1, v_2 \in V - S$

Correctness of Dijkstra's Algorithm

Inductive hypothesis: Suppose that nodes $v_1 = s, \ldots, v_i$ have been removed from PQ, and for each of them $d_{v_i} = \delta(s, v_i)$, and there is a path from s to v_i with distance d_{v_i} (whenever $d_{v_i} < \infty$)

Base case:

- $i = 0$: $v_1 = s$
- Claim holds trivially

Correctness of Dijkstra's Algorithm: Claim 1

Let u be the $(i+1)^{\text{st}}$ node extracted

Claim 1: There is a path of length d_u (as long as $d_u < \infty$) from s to u in G

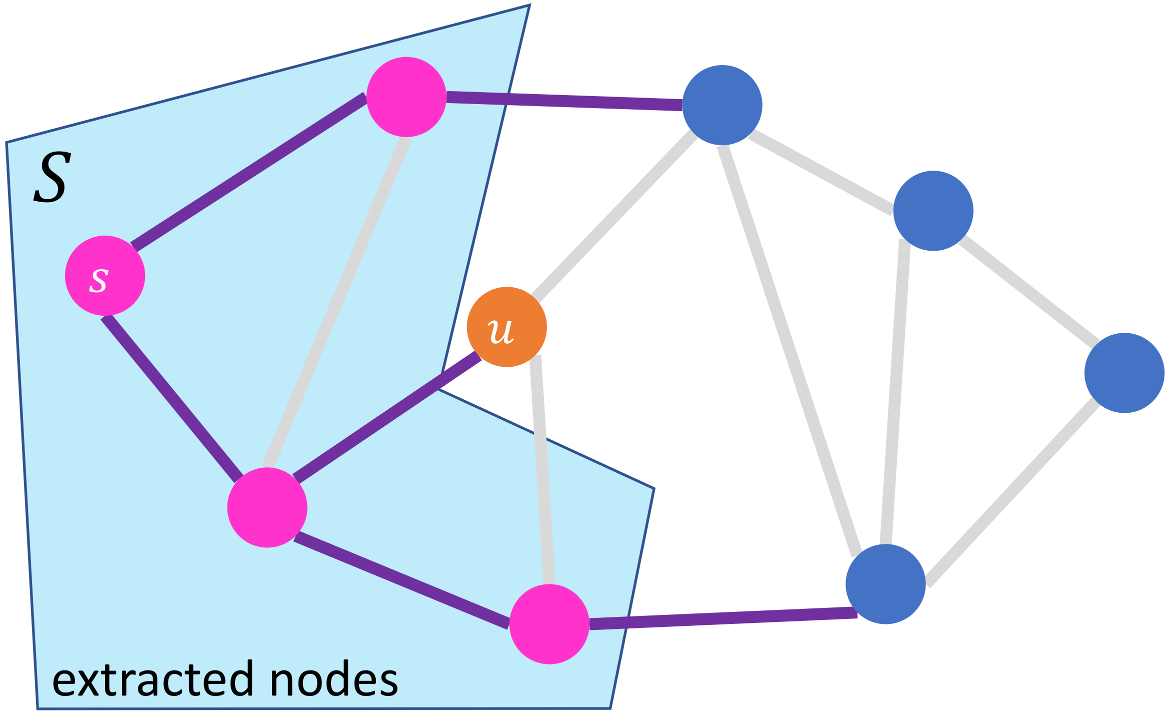
Proof:

- Suppose $d_u < \infty$
- This means that $\mathrm{PQ.decreaseKey}$ was invoked on node u on an earlier iteration
- Consider the last time $\mathrm{PQ.decreaseKey}$ is invoked on node u
- $\mathrm{PQ.decreaseKey}$ is only invoked when there exists an edge $(v, u) \in E$ and node v was extracted from PQ in a previous iteration
- In this case, $d_u = d_v + w(v, u)$
- By the inductive hypothesis, there is a path $s \rightarrow v$ of length d_v in G and since there is an edge $(v, u) \in E$, there is a path $s \rightarrow u$ of length d_u in G

Correctness of Dijkstra's Algorithm: Claim 2

Let u be the $(i+1)^{\text{st}}$ node extracted

Claim 2: For every path $(s, \dots, u)$, $w(s, \dots, u) \geq d_u$

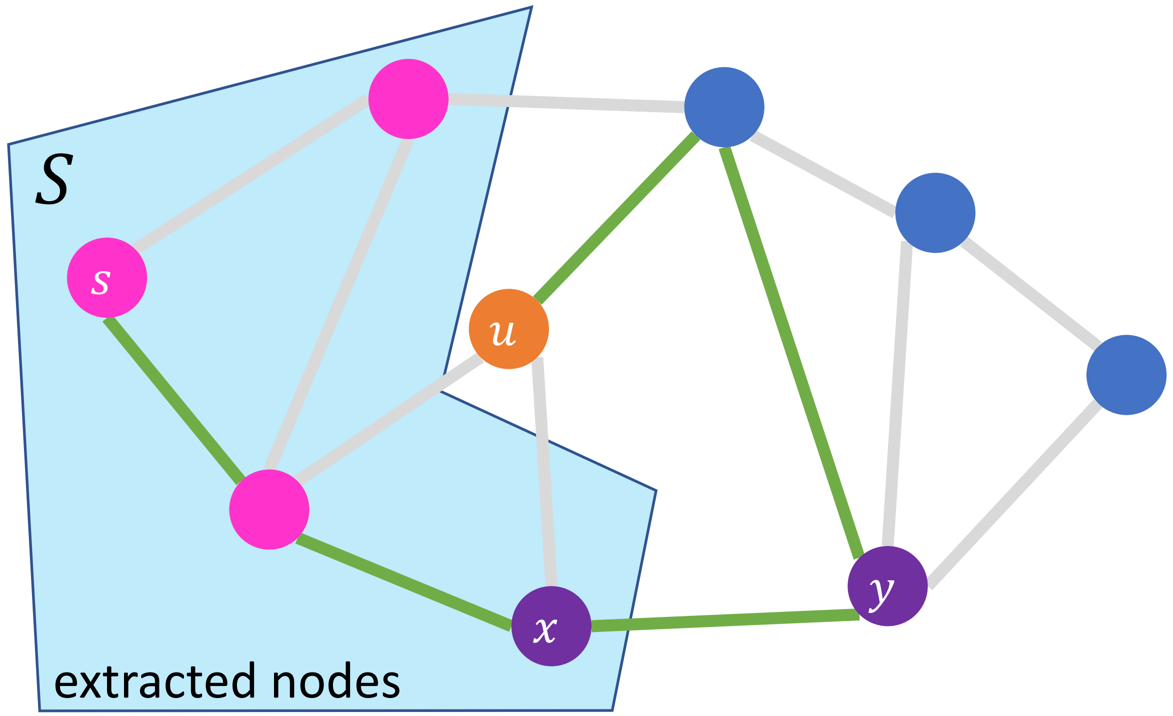


Extracted nodes "cuts" G into two subsets, $(S, V - S)$

Correctness of Dijkstra's Algorithm: Claim 2

Let u be the $(i+1)^{\text{st}}$ node extracted

Claim 2: For every path $(s, \dots, u)$, $w(s, \dots, u) \geq d_u$



Extracted nodes "cuts" G into $(S, V - S)$

Take any path $(s, \dots, u)$

Since $u \notin S$, $(s, \dots, u)$ crosses the cut somewhere

- Let (x, y) be last edge in the path that crosses the cut

$$w(s, \dots, u) \geq \delta(s, x) + w(x, y) + w(y, \dots, u)$$

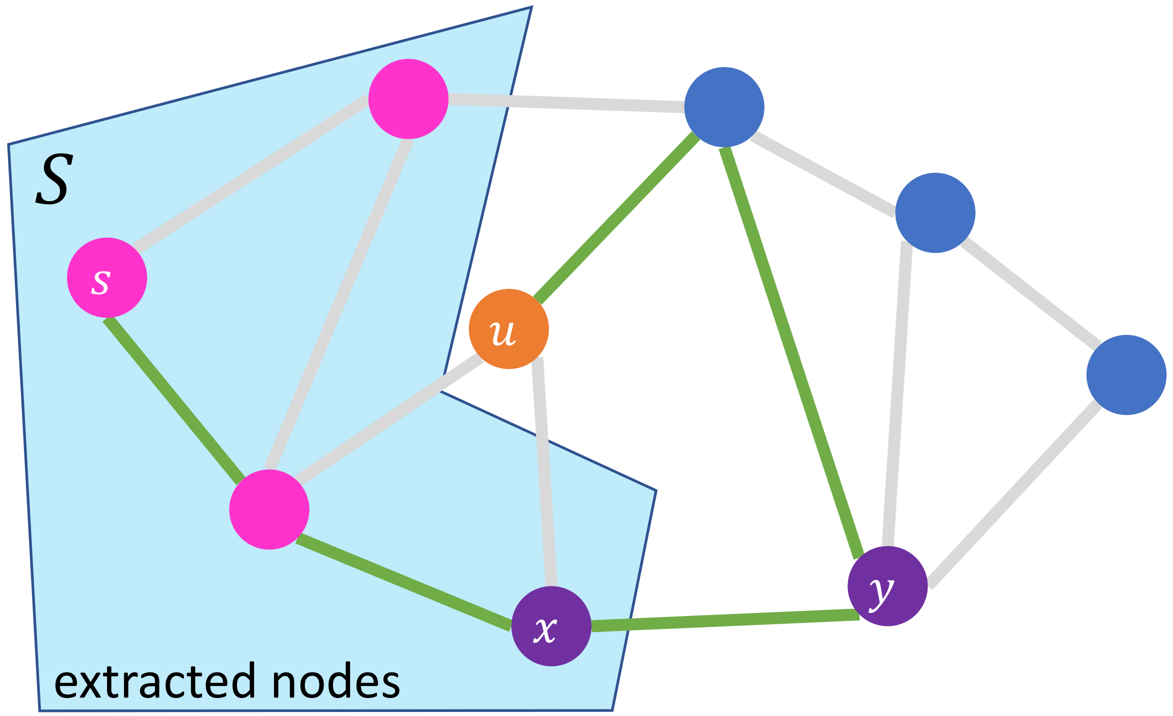
$$w(s, \dots, u) = w(s, \dots, x) + w(x, y) + w(y, \dots, u)$$

$w(s, \dots, x) \geq \delta(s, x)$ since $\delta(s, x)$ is weight of shortest path from s to x

Correctness of Dijkstra's Algorithm: Claim 2

Let u be the $(i+1)^{\text{st}}$ node extracted

Claim 2: For every path $(s, \dots, u)$, $w(s, \dots, u) \geq d_u$



Extracted nodes "cuts" G into $(S, V - S)$

Take any path $(s, \dots, u)$

Since $u \notin S$, $(s, \dots, u)$ crosses the cut somewhere

- Let (x, y) be last edge in the path that crosses the cut

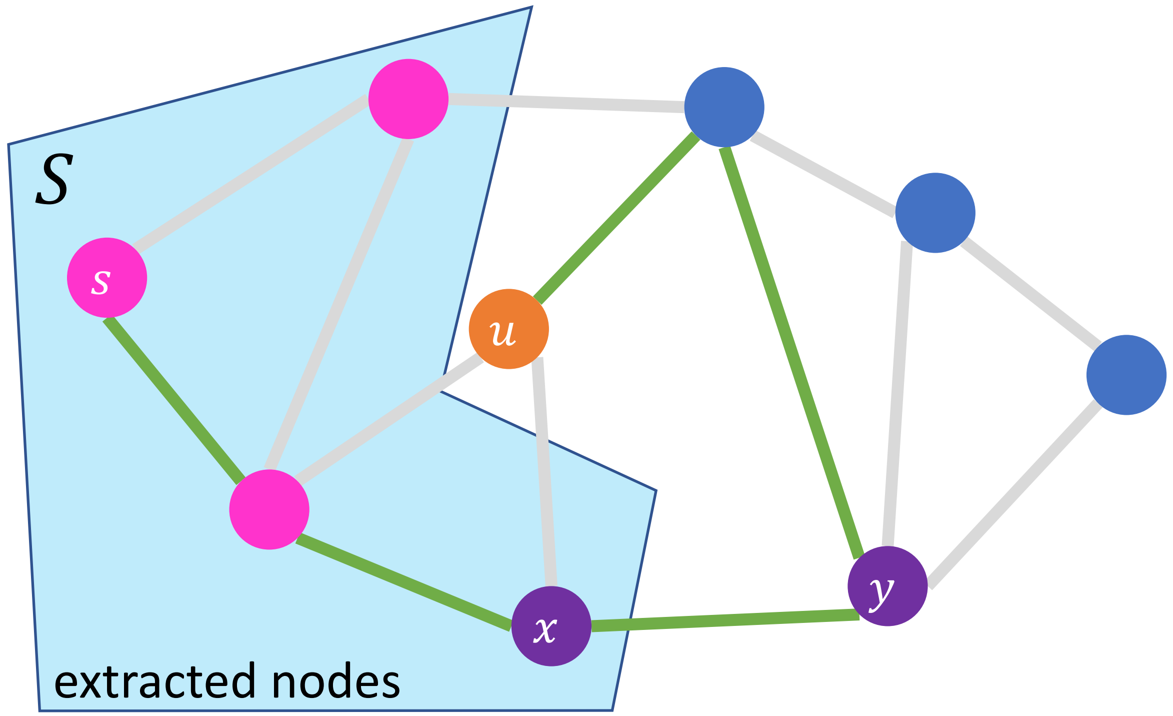
$$\begin{aligned} w(s, \dots, u) &\geq \delta(s, x) + w(x, y) + w(y, \dots, u) \\ &= d_x + w(x, y) + w(y, \dots, u) \end{aligned}$$

Inductive hypothesis: since x was extracted before, $d_x = \delta(s, x)$

Correctness of Dijkstra's Algorithm: Claim 2

Let u be the $(i+1)^{\text{st}}$ node extracted

Claim 2: For every path $(s, \dots, u)$, $w(s, \dots, u) \geq d_u$



Extracted nodes "cuts" G into $(S, V - S)$

Take any path $(s, \dots, u)$

Since $u \notin S$, $(s, \dots, u)$ crosses the cut somewhere

- Let (x, y) be last edge in the path that crosses the cut

$$
\begin{aligned}
w(s, \dots, u) &\geq \delta(s, x) + w(x, y) + w(y, \dots, u) \\
&= d_x + w(x, y) + w(y, \dots, u) \\
&\geq d_y + w(y, \dots, u)
\end{aligned}
$$

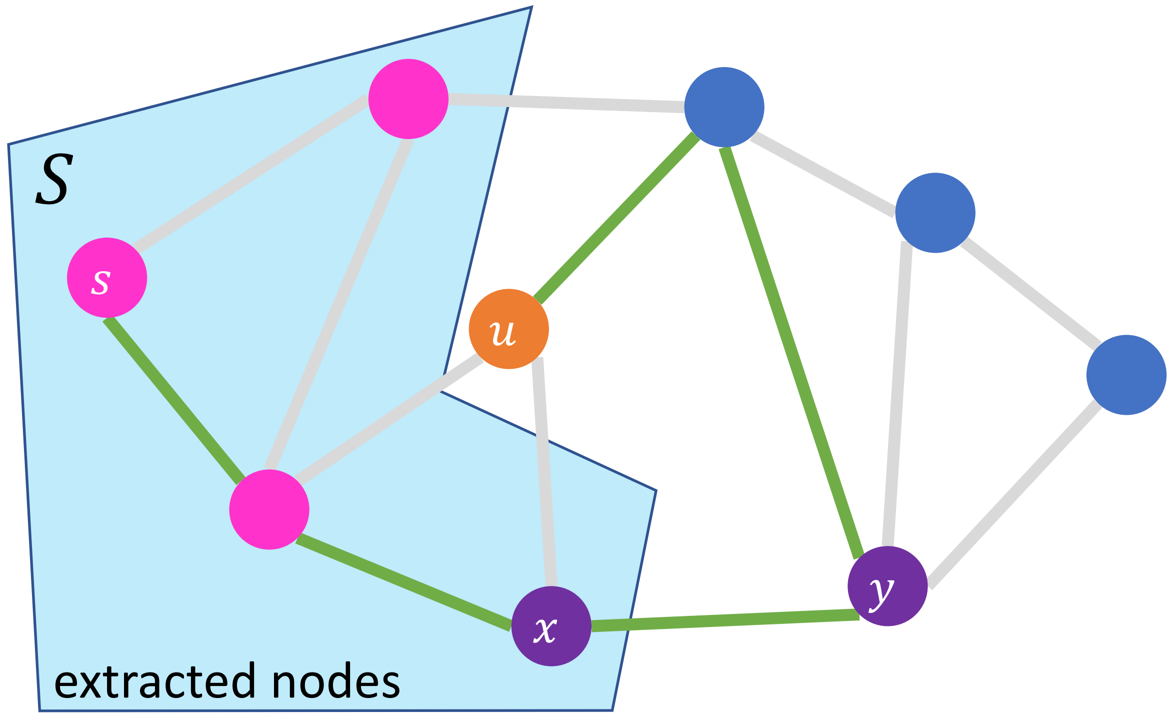
By construction of Dijkstra's algorithm, when x is extracted, d_y is updated to satisfy

$$d_y \leq d_x + w(x, y)$$

Correctness of Dijkstra's Algorithm: Claim 2

Let u be the $(i+1)^{\text{st}}$ node extracted

Claim 2: For every path $(s, \ldots, u)$, $w(s, \ldots, u) \geq d_u$



Extracted nodes "cuts" G into $(S, V - S)$

Take any path $(s, \ldots, u)$

Since $u \notin S$, $(s, \ldots, u)$ crosses the cut somewhere

- Let (x, y) be last edge in the path that crosses the cut

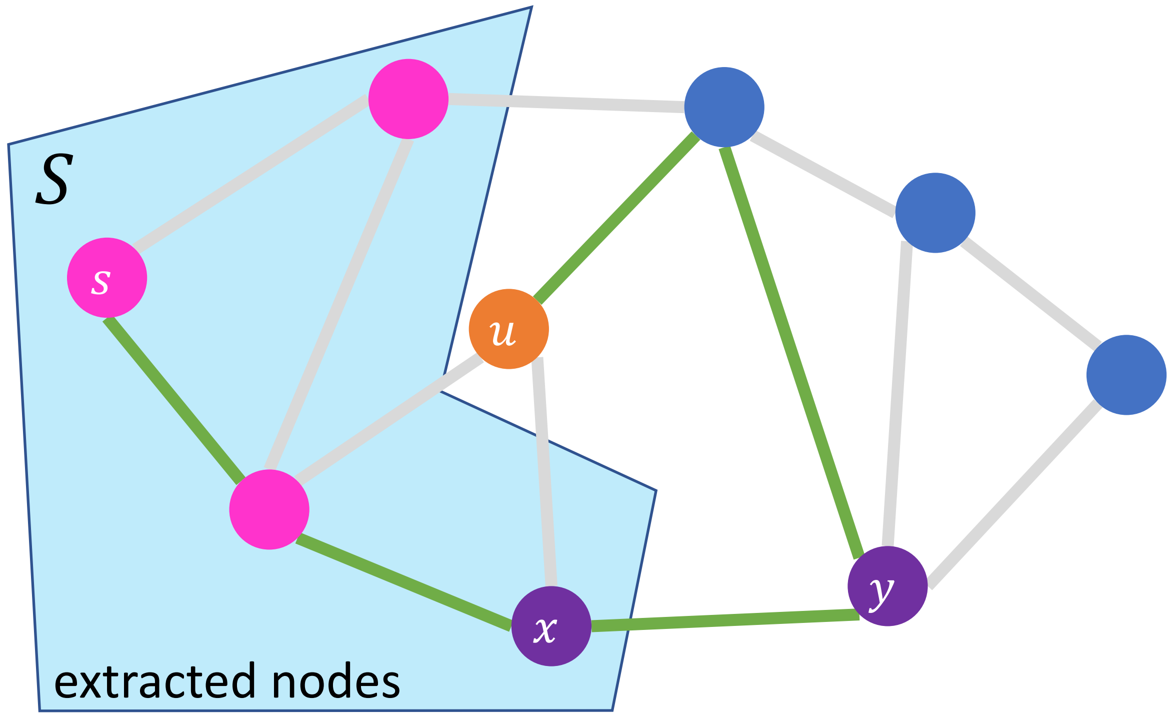
$$
\begin{aligned}
w(s, \ldots, u) &\geq \delta(s, x) + w(x, y) + w(y, \ldots, u) \\
&= d_x + w(x, y) + w(y, \ldots, u) \\
&\geq d_y + w(y, \ldots, u) \\
&\geq d_u + w(y, \ldots, u)
\end{aligned}
$$

Greedy choice property: we always extract the node of minimal distance so $d_u \leq d_y$

Correctness of Dijkstra's Algorithm: Claim 2

Let u be the $(i+1)^{\text{st}}$ node extracted

Claim 2: For every path $(s, \dots, u)$, $w(s, \dots, u) \geq d_u$



Extracted nodes "cuts" G into $(S, V - S)$

Take any path $(s, \dots, u)$

Since $u \notin S$, $(s, \dots, u)$ crosses the cut somewhere

- Let (x, y) be last edge in the path that crosses the cut

$$\begin{aligned} w(s, \dots, u) &\geq \delta(s, x) + w(x, y) + w(y, \dots, u) \\ &= d_x + w(x, y) + w(y, \dots, u) \\ &\geq d_y + w(y, \dots, u) \\ &\geq d_u + w(y, \dots, u) \\ &\geq d_u \end{aligned}$$

All edge weights assumed to be positive

Correctness of Dijkstra's Algorithm

Conclusion: We used proof by induction to show:

When node u is removed from the priority queue, $d_u = \delta(s, u)$

- **Claim 1:** There is a path of length d_u (as long as $d_u < \infty$) from s to u in G
- **Claim 2:** For every path $(s, \dots, u)$, $w(s, \dots, u) \geq d_u$

In other words, all paths $(s, \dots, u)$ are no shorter than d_u

which makes it the shortest path (or one of equally shortest paths).

Indirect Heaps

The Concern: Make decreaseKey O(log n)

Indirect heaps are an example of the common computing principle of ***indirection***:

- Simple example: an implementation of *FindMax(anArray)* that returns the array index of the max value instead of the value itself
- Pointers in languages like C and C++
- Object references in Java and Python
- A short read: https://en.wikipedia.org/wiki/Indirection

Indirect heaps:

- The idea: have some kind of "index" that, given a node's "ID", you can quickly find where that node is in the heap's tree
- Several ways to implement these
- What's shown in the next slides works well if you identify nodes with strings and you can easily use a good hashtable (dictionary)

Indirect Heap Uses >1 Data Structure

item_at_posn[i] – an array that tells us what item is stored at the position **i** in the tree

0	1	2	3	4	5	6
:-1	C:4	D:6	B:5	E:9	A:8	F:9

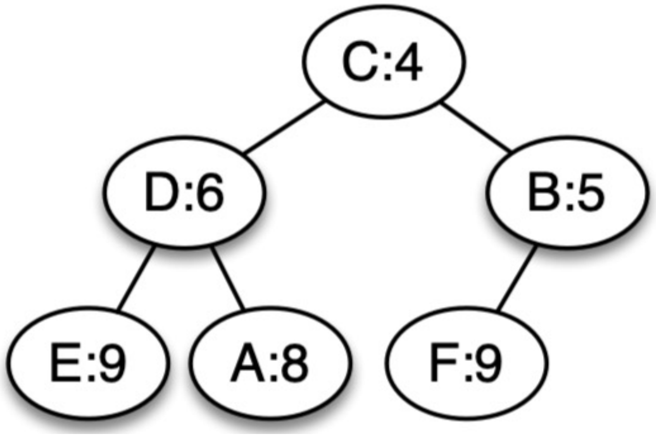
posn_of_item[item] – a hashtable that gives the position in the tree where a given **item** ID is stored

A	B	C	D	E	F
5	3	1	2	4	6

Example usage:

- What's the item at the root? **item_at_posn[1] → 'C'**
- Where in the tree is E? **posn_of_item['E'] → 4**
- What item is E's parent?
  item_at_posn[posn_of_item['E']/2] = item_at_posn[2] → 'D'

There will be some way of getting the PQ key value from the item, which we'll show as **item.key.** E.g. the min key is **item_at_posn[1].key → 4**



Is decreaseKey more efficient now?

This code shows the idea: decrease B's key and bubble it up one level:

```
item = 'B'
item.key = 3 # it was 5
itemPosn = posn_of_item[item]   # 3
parentPosn = itemPosn / 2    # 1
parent = item_at_posn[parentPosn] # 'C'

if item.key < parent.key:  # need to swap?
   item_at_posn[parentPosn] = item    # item_at_posn[1] = 'B'
   item_at_posn[itemPosn] = parent    # item_at_posn[3] = 'C'
   posn_of_item[parent] = itemPosn    # posn_of_item['C'] = 3
   posn_of_item[item] = parentPosn    # posn_of_item['B'] = 1
```

Assuming hashtable lookup is O(1), everything here is O(1). decreaseKey() might have to do this for the height of the tree, so O(log n) overall.