CSE 373: Graph traversal

Michael Lee

Friday, Feb 16, 2018

Today's goal: how do we traverse graphs?

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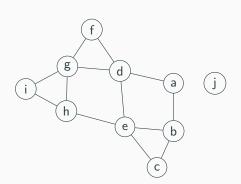
Solution: Use graph traversal algorithms like breadth-first search and depth-first search

```
search(v):
    visited = empty set

queue.enqueue(v)
    visited.add(v)

while (queue is not empty):
    curr = queue.dequeue()

    for (w : v.neighbors()):
        if (w not in visited):
            queue.enqueue(w)
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```



Current node:

Queue: a,

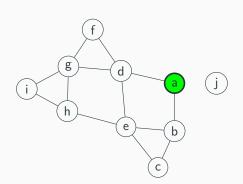
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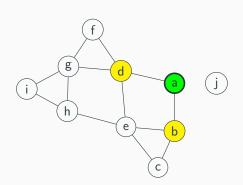
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Current node: a

Queue: b, d,

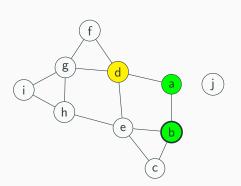
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Current node: b

Queue: d,

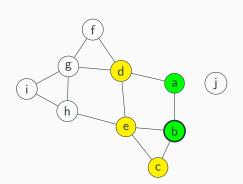
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Current node: b

Queue: d, c, e,

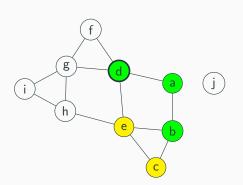
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Current node: d

Queue: c, e,

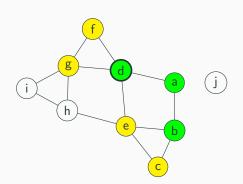
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Current node: d

Queue: c, e, f, g,

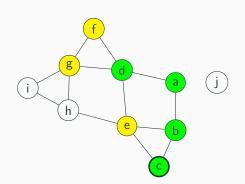
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Current node: c

Queue: e, f, g,

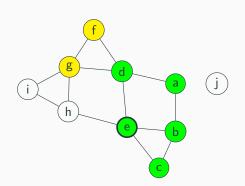
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Current node: e

Queue: f, g,

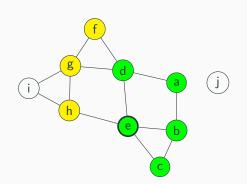
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Current node: e

Queue: f, g, h,

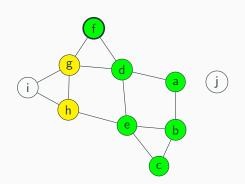
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Current node: f

Queue: g, h,

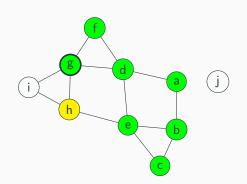
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Current node: g

Queue: h,

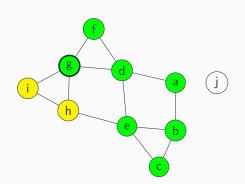
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Current node: g

Queue: h, i,

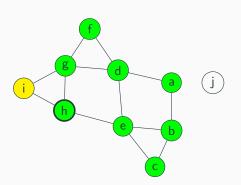
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Current node: h

Queue: i,

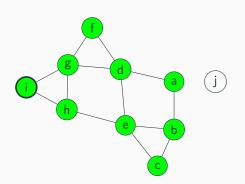
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Current node: i

Queue:

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Breadth-first traversal, core idea:

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So,
$$\mathcal{O}(|V|+2|E|)$$
, which simplifies to $\mathcal{O}(|V|+|E|)$.

Pseudocode:

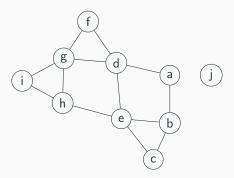
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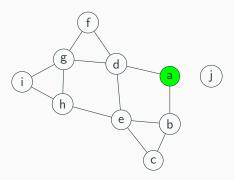
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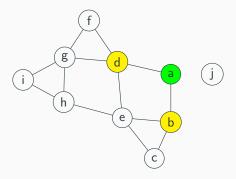
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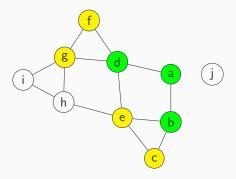


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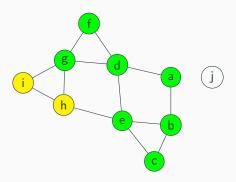


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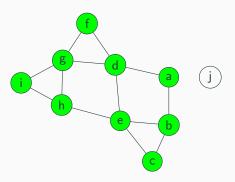
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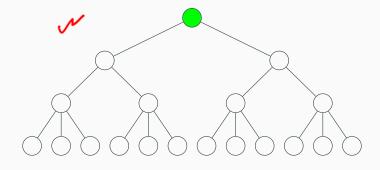


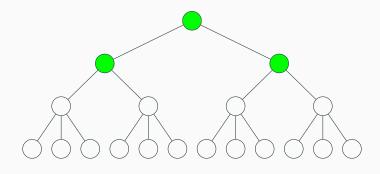
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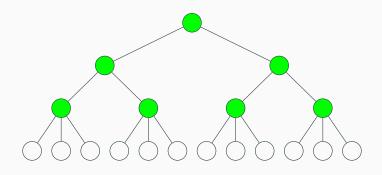


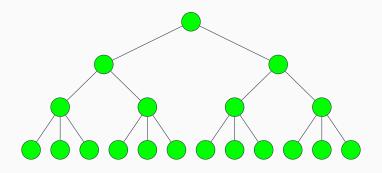
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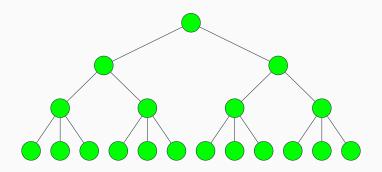








What does this look like for trees?



The algorithm traverses the width, or "breadth" of the tree

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The DFS algorithm:

```
search(v):
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    stack.push(v)
    visited.add(v)

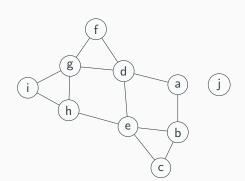
while (stack is not empty):
    curr = stack.pop()
    visited.add(curr)

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        stack.push(w)
        visited.add(v)
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Current node:

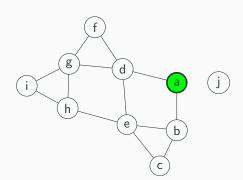
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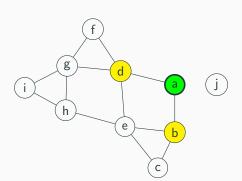
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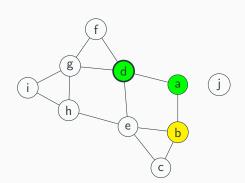
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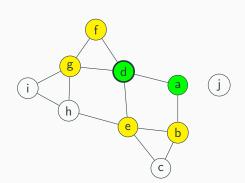
Stack: b,

Visited: a, b, d,

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```



Current node: d

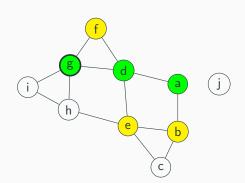
Stack: b, e, f, g,

Visited: a, b, d, e, f, g,

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Current node: g

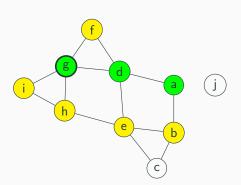
Stack: b, e, f,

Visited: a, b, d, e, f, g,

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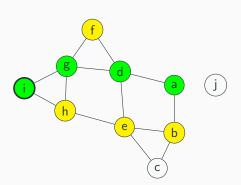
Current node: g

Stack: b, e, f, h, i,

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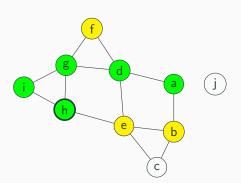
Current node: i

Stack: b, e, f, h,

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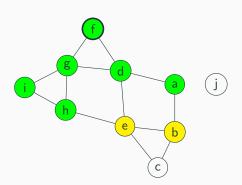
Current node: h

Stack: b, e, f,

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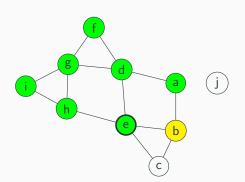
Current node: f

Stack: b, e,

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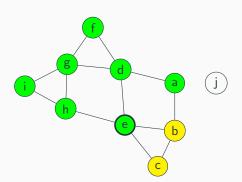
Current node: e

Stack: b, e,

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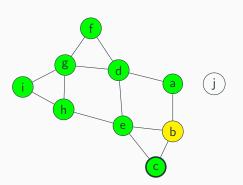
Current node: e

Stack: b, e, c,

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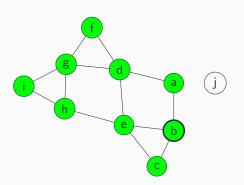
Current node: c

Stack: b,

```
search(v):
    visited = empty set
    stack.push(v)

while (stack is not empty):
    curr = stack.pop()
    visited.add(curr)

for (w : v.neighbors()):
    if (w not in visited):
        stack.push(w)
```



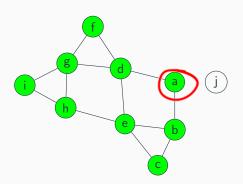
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Current node:

Stack:

Depth-first traversal, core idea:

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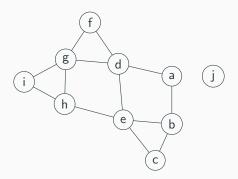
Pseudocode:

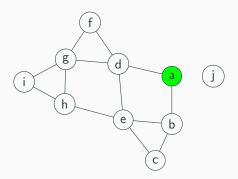
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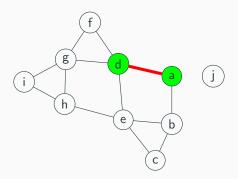
    stack.push(v)
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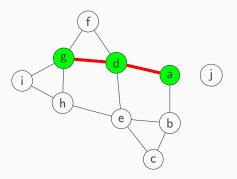
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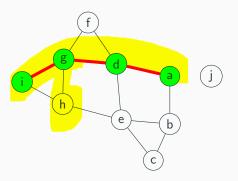
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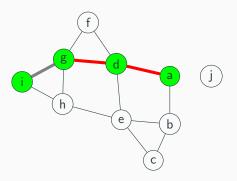


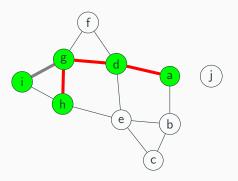


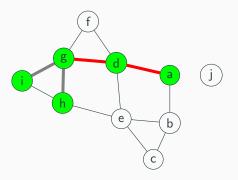


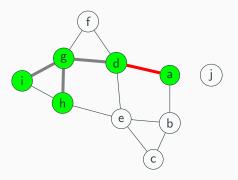


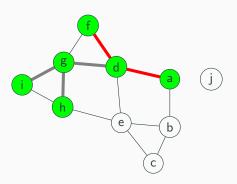


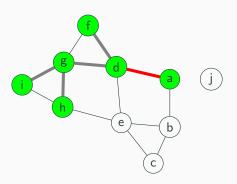


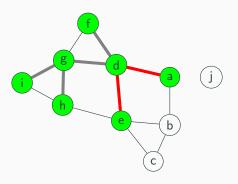


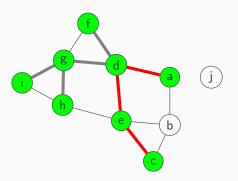


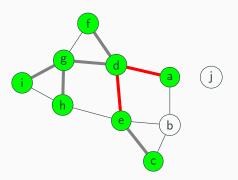


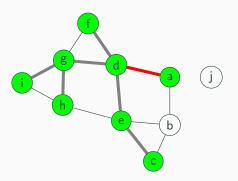


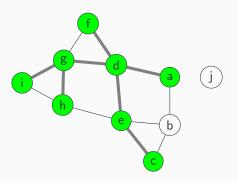


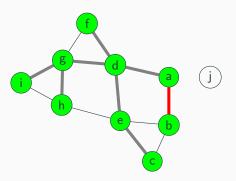


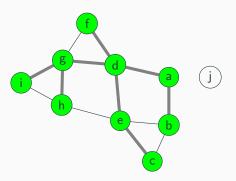


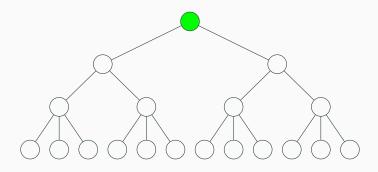


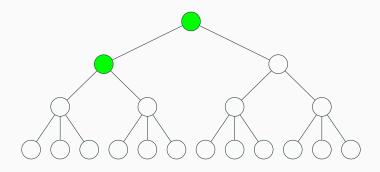


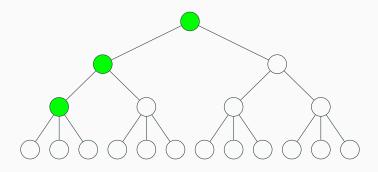


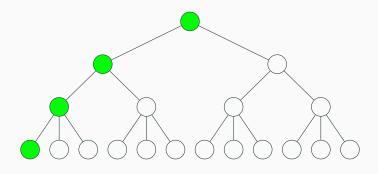


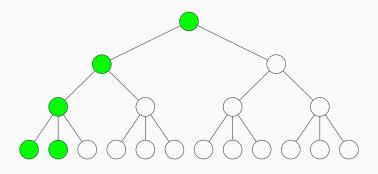


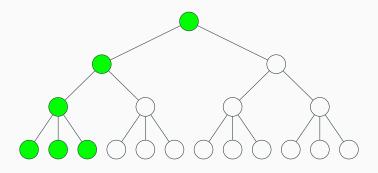


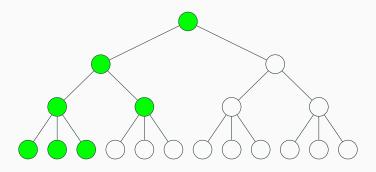


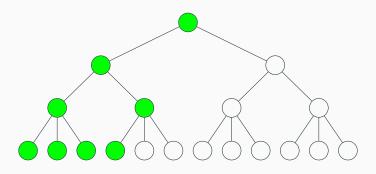




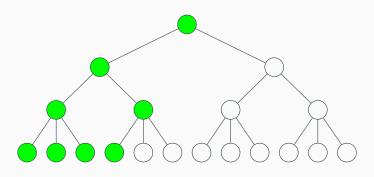








What does this look like for trees?



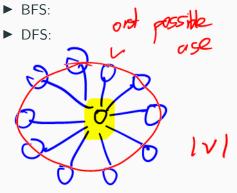
The algorithm traverses to the bottom first: it prioritizes the "depth" of the tree $\label{eq:continuous} % \begin{center} \$

Note: rest of algorithm omitted

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Related question: How much memory does BFS and DFS use in the worst case?



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Related question: How much memory does BFS and DFS use in the worst case?

- ▶ BFS: $\mathcal{O}(|V|)$ what if every node is connected to the start?
- **▶** DFS: *O*(|*V*|)

So, in the worst case, BFS and DFS both have the same worst-case runtime and memory usage.

They only differ in what order they visit the nodes.

How much memory does BFS and DFS use in the average case?

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Related question: how much memory do they use when we want to traverse a tree?

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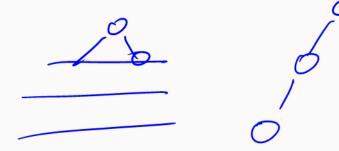
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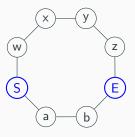
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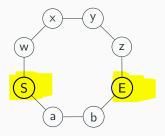
- ▶ Use BFS if graph is "narrow", or if solution is "near" start
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In practice, graphs are often large/very wide, so DFS is often a good default choice. (It's also possible to implement DFS recursively!)

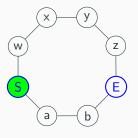
Question: How would you modify BFS to find the shortest path between every node?



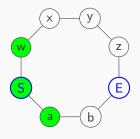
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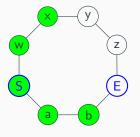
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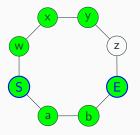


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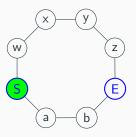
Observation: Since BFS moves out in rings, we will reach the end node via the path of length 3 first.

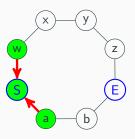
Idea: when we enqueue, store where we came from in some way. (e.g. mark node, use a dictionary...)

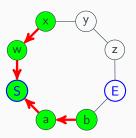
After BFS is done, backtrack.

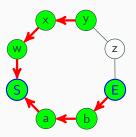
Design challenge: pathfinding

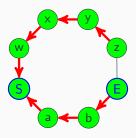
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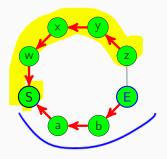






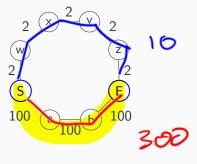


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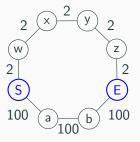


Now, start from any node, follow arrows, then reverse to get path.

Question: What if the edges have weights?



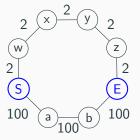
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This number can represent anything, but is often (but not always!) used to indicate the "cost" of traveling down that edge.

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Today: Dijkstra's algorithm

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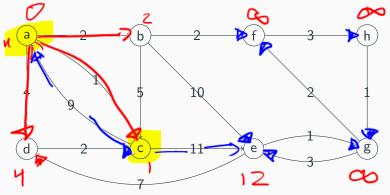
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Pronunciation: DYKE-struh ("dijk" rhymes with "bike")

Suppose we start at vertex "a":



Some implementation details...

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- ► If we're using a heap, how do we update node costs?
 - ► Could add a changeKeyPriority(...) method to heap
 - ► Alternatively, add the node and the cost to the heap again (and ignore duplicates)