## Introduction to Graphs

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## Admin

- Last week's quiz back Wednesday
- Any questions?

Graphs

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- Trees were, in some cases, able to store relationships between pieces of data
- Family tree: parent/child relationships
- Lexicon trie: relationship between nodes in the trie represented stored words
- Graphs: a new data structure to store relationships between data. (Graphs are not particularly useful for Dictionary-like operations.)

Graphs

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## Graphs

- Graphs consist of nodes and edges
- Much like a tree! But no restrictions on how edges may connect nodes
- An edge may be directed or undirected
- Directed edges represent a relationship from (say) node $A$ to node $B$. Undirected represent a relationship between node $A$ and node $B$ (no direction on the relationship)


## Drawing Graphs



An undirected graph


A directed graph

We usually draw graphs much like we drew trees. In directed graphs, we show the direction of an edge with an arrow.
height


What are the nodes here? Edges?
height


What are the nodes here? Edges?
Nodes: subway stops. An edge between two stops if there is a train between them.

## (Simplified) US Train Map



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## (Simplified) US Train Map



What are the nodes here? Edges?
Nodes: cities. An edge between two cities if there is a train between them. Note that it's not important how we draw the edges.

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## Internet Circa 1972



What are the nodes here? Edges?

## Internet Circa 1972



What are the nodes here? Edges?
Nodes: network access points. Edges represent a connection.

Internet Circa 1998


## Word Game



Goal of the game: given two words, transform one into the other by changing one letter at a time, always maintaining a legal word.

$$
\text { CORD } \rightarrow \text { WORD } \rightarrow \text { WORM }
$$

Two words are connected if they differ by one letter.

## CS Prerequisite Graph



What are the nodes? Edges?

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What are the nodes? Edges?
Is this graph a tree?

## Relationships to Trees

- Every tree is a graph!


## Relationships to Trees

- Every tree is a graph!
- But not every graph is a tree.


## Flight Routes



## Basic Definitions

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- The neighbors of $v$ are all nodes $u$ that are adjacent to $v$


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- Note that this needs to follow the direction of the edge in a directed graph; for an undirected graph the can go in either direction
- No edge can appear more than once: $e_{i} \neq e_{j}$ if $i \neq j$
- In a simple path, no vertex appears more than once


## Path Continued

- A cycle is a simple path that begins and ends at the same vertex


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- A cycle is a simple path that begins and ends at the same vertex
- The length of a path or cycle is the number of edges in the sequence


## Word Game



Goal of the game: given two words, transform one into the other by changing one letter at a time, always maintaining a legal word.

What does a path mean in this graph? What is the meaning of the length of the path?

## Flight Routes



What is a path? What is a cycle? What is the length of the path?

## Flight Routes



What is a path? What is a cycle? What is the length of the path?
Takeaway: graphs really can represent a very broad variety of real-world problems.

## Reachability and Connectedness

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- A graph is connected if for every path of vertices $u$ and $v, v$ is reachable from u.
- What does it mean if one vertex is reachable from another in the graph of flights? What does it mean if the flight graph is connected?


## Connected Component

- All vertices reachable from $v$, along with all edges of $G$ connecting two of them, constitute the connected component of $v$.

Reachability Example


## Determining Reachability

First Graph Algorithm Example

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- Then recurse! Check all of their neighbors, and so on.


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- How can we implement this?


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- Given vertices $u$ and $v$, determine if they are adjacent
- Given a vertex $v$ and an edge $e$, determine if $v$ is incident to $e$
- Get all adjacent edges of $v$


## Implementing our idea

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- Basic premise: start with $v$. Check its neighbors, then their neighbors, and so on.
- This algorithm is called Breadth-First Search
- What does this look like?


## Breadth-First Search Example 1



Nodes that we have already traversed are marked in green. The node we are currently traversing is marked in orange.

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- Let's plan this out in more detail


## Plan

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- Start with a node. Explore its children in order. Then, explore their children (in the same order)
- Plan: use a queue to store nodes that are waiting
- Let's plan this out in more detail
- Use pseudocode: a description of an algorithm in code-like notation (without worrying about language-specific details)


## Breadth-First Search

```
// pre: all vertices are marked as unvisited
BFS(G, v) // Do a breadth-first search of G starting at v
    count }\leftarrow
    Create empty queue Q
    enqueue v
    mark v as visited
    count++
    while Q isn't empty:
    current }\leftarrow\mathrm{ Q.dequeue()
    for each unvisited neighbor u of current:
        add u to Q
        mark u as visited
        count++
return count;
```


## Implementing Graphs in Java

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- How can we store the vertices?
- How can we store the edges?

