## CS 361

## Data Structures \& Algs Lecture II

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## Last Time

Priority Queues \& Heaps
Heapify (up and down)
1: Preserve shape of tree
2: Swaps restore heap order property
Balanced Binary Tree using Array
Quiz \#2
New Reading: secs 3.1 thru 3.4

## Quiz 2 grades

$20,20,20,20,19,17$
$16,16,15,15,15$
$14,14,14,14,13$
12, 12, 12
11, 11, 11, 11
10, 9, 9, 9
7, 7, 3, 0

## Today

P.A. 2 due Monday, Oct 11

Graphs and Trees, terminology
Connectedness, Components
Traversal Algorithms
Breadth First vs. Depth First
Testing Bipartiteness

## Graphs

A graph is a pair, $(\mathrm{V}, \mathrm{E})$, where:
V is the set of vertices (also called "nodes")
$E$ is a set of edges
Each edge consists of a pair of vertices, called the endpoints of the edge.

Example: V = \{1,2,3,4,5\},
$E=\{\{1,2\},\{2,3\},\{3,4\},\{4,5\},\{5,1\},\{1,4\}\}$.
(5 vertices, 6 edges).

## Kinds of Graphs

Vertices: can represent almost anything. Cities, people, computers, numbers.

Edges: represent some notion of "adjacency" or relationships like "knowing", "meeting", "liking", "being similar to." Anything that can involve (or not involve) a pair of vertices.

Sometimes: we also want to attach weights to the edges and/or the vertices. But not for today.

## Drawing a graph

A diagram of a graph is a picture, with a "dot" for each vertex, and a "segment" for each edge.
Example: $\mathrm{V}=\{1,2,3,4,5\}$,
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## Paths \& Connectedness

A graph is connected if, for any two nodes $\mathrm{v}, \mathrm{w}$, there is a sequence of edges that joins $v$ to $w$. A minimal such sequence of edges is called a "path" from $v$ to $w$.

Example: one path from 1 to 4 is $\{1,2\},\{2,3\},\{3,4\}$.
Another is $\{1,4\}$.
A third is
$\{1,5\},\{5,4\}$.
$\{2,6\}$ is on no path


## Components

Two nodes in a graph are said to be "in the same connected component" if there exists a path joining them.

Claim: this is an equivalence relation. Why?
Consequence: Every graph decomposes in a unique way into its connected components.

Obs: $G$ is connected iff $G$ has only one connected component.

## Equivalence Relations

Let $\sim$ be a binary relation on a set $S$. (For elements $a, b$ in $S$, " $a \sim b$ " is a proposition which can be true or false.)

We say " ~ is an equivalence relation" if 3 axioms hold:

1) reflexive. " $a \sim a$ " is always true.
2) symmetric. "a ~b" is equivalent to "b ~ a"
3) transitive. If $a \sim b$ and $b \sim c$, then $a \sim c$.

## Equivalence Classes

Suppose ~ is an equivalence relation on $S$.
Then $S$ can be decomposed into subsets $S_{1}, S_{2}$, $S_{3}$, etc. called "equivalence classes," meaning:

For all $a, b$ in same equiv. class $S_{i}$, we have $a \sim b$.
For all $a$ in $S_{i}, b$ in $S_{j}, i \neq j$, we have $\operatorname{NOT(a\sim b).~}$

Equivalence classes are an alternative way of defining an equivalence relation.

## Components

$a, b$ : vertices in graph $G$.
"a ~ b": "there is a path from a to b"
Equivalence relation.
Equivalence class containing a: All vertices that can be reached by a path from a. "Connected component containing a."
\# of connected components?

## Components

$\mathrm{a}, \mathrm{b}$ : vertices in graph G .
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Equivalence class containing a: All vertices that can be reached by a path from a. "Connected component containing a."
\# of connected components? Between 1 and $n$, where $\mathrm{n}=\#$ vertices in G .

## Cycles

Def: A cycle in a graph is a closed loop with no repeated edges or nodes (except the start and end).

Example: In this graph, $(1,2,3,4,5)$ is a cycle. So is $(1,4,5)$. So is $(1,4,3,2)$.


## Trees \& Forests

Def: A forest is a graph with no cycles.
Def: A tree is a connected graph with no cycles.
Remark: Every forest is a union of trees.
A tree is a special case of a forest.
Example: a tree.


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## Recall: Binary Trees

Data is stored in "nodes".
Each node has 4 fields: data

left_child (reference to a node or null)
right_child (reference to a node or null)
The graph for a binary tree is a tree.
(Connected, no cycles)

## Rooted Trees

A binary tree has a special node called the root.
Every node, v, has a unique path to the root. parent(v) is the first node along this path.
In a general tree, any node can be made the root.
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## Testing Connectedness

Input: A graph G, and vertices s,t.
Output: A path from s to $t$, if one exists, and otherwise output "Disconnected"
How do we proceed?
First issue: How do we store a graph in the computer?

## Storing a Graph

2 main approaches:
(a) Adjacency list representation. (Better)
(b) Adjacency matrix. (Worse)

## Adjacency List repn

Graph:
int $\mathrm{N}=$ how many vertices there are.
$\operatorname{Adj}[\mathrm{v}]=\mathrm{A}$ List of the neighbors of v .
So: we have an Array of Linked Lists.
Example: $\mathrm{V}=\{1,2,3,4,5\}$,
$E=\{\{1,2\},\{2,3\},\{3,4\},\{4,5\},\{5,1\},\{1,4\},\{1,3\}\}$.
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$\operatorname{Adj}[1]=\{2,5,4,3\}$
Adj[2] $=\{1,3\}$
Adj[3] $=\{2,4,1\}$
Adj[4] $=\{3,5,1\}$
$\operatorname{Adj}[5]=\{4,1\}$


## Adjacency Matrix repn

Graph:
int $\mathrm{N}=$ how many vertices there are.
$A=n \times n$ matrix of 0 's and 1's
$A[i, j]=1$ means the edge $\{i, j\}$ is included.

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$$
A=\begin{array}{lllll}
0 & 1 & 1 & 1 & 1 \\
1 & 0 & 1 & 0 & 0 \\
1 & 1 & 0 & 1 & 0 \\
1 & 0 & 1 & 0 & 1 \\
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\end{array}
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N-1. Proof?

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$\mathrm{N}-1$. Proof? Induction: Start with empty graph. Then there are N connected components. Each edge we add can reduce the number of components by 0 or by 1 . So it takes at least $\mathrm{N}-1$ edges to make G connected.

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$\mathrm{N}-1$. In this case, G is always a tree!
What is the most edges G can have?

$$
\binom{N}{2}=\frac{N(N-1)}{2}=\Theta\left(N^{2}\right)
$$

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Input: A graph G, and vertices s,t.
Output: A path from s to $t$, if one exists, and otherwise output "Disconnected" How do we proceed?

Start at s, and "search outward"
Build up a tree, rooted at s, as we go.
Eventually, we will find all nodes in the component of $s$. If $t$ is there, the path from $t$ to $s$ is $t$, parent $(t)$, parent $($ parent $(t)), \ldots, s$

