## Last Course Topic: Graphs \& Trees

- Motivation for Graphs
- Definition
$\Rightarrow$ Directed and undirected graphs
$\uparrow$ Representing Graphs
- Paths, Circuits, and Trees
$\downarrow$ Famous Graph Problems
$\star$ Covered in Chapters 9 and 10 in the text (we will cover mainly 9.1 and 10.1 ; you can browse the other sections)



## What are graphs? (Take 1)

$\uparrow$ Yes, this is a graph....

$\star$ But we are interested in a different kind of "graph"

## Course Prerequisites for CSE at UW



## Representing a Maze or Floor Plan of a House



Nodes $=$ rooms
Edge $=$ door or passage


## Representing Electrical Circuits

Nodes $=$ battery, switch, resistor, etc.
Edges = connections


## Representing Expressions in Compilers



## Dependency structure of statements



## Data Centers and Connections



## Data Centers with Multiple Connections



## Data Centers with Diagnostic Connections



Network with One-Way Links


## People and Tasks

Alvarez Berkowitz Chen Davis
requirements architecture implementation testing

## Competition between Species



## Facebook Friends



## Soap Opera Relationships



# Six Degrees of Separation from Kevin Bacon 



Nodes $=$ computers
Weights on edges = transmission rates

## Traffic Flow on Highways



Flight times between cities


## Fares between cities




## Bayesian Networks

(Nodes + Edges + Probabilities)


## Bayesian Network for Gene Interactions



## Bayesian Network for Medical Diagnosis



## Image Analysis ("Markov Random Field")



Background

## Graphs: Definition

$\downarrow$ A graph is simply a collection of nodes plus edges
$\Rightarrow$ Linked lists, trees, and heaps are all special cases of graphs
$\uparrow$ The nodes are known as vertices (node $=$ "vertex")
$\downarrow$ Formal Definition: A graph $G=(V, E)$ where
$\Rightarrow V$ is a set of vertices or nodes
$\Leftrightarrow E$ is a set of edges that connect vertices

## Graphs: An Example

- Here is a graph $G=(V, E)$
$\Rightarrow$ Each edge is a pair $\left(v_{1}, v_{2}\right)$, where $v_{1}, v_{2}$ are vertices in $V$
$V=\{\mathrm{A}, \mathrm{B}, \mathrm{C}, \mathrm{D}, \mathrm{E}, \mathrm{F}\}$
$E=\{(\mathrm{A}, \mathrm{B}),(\mathrm{A}, \mathrm{D}),(\mathrm{B}, \mathrm{C}),(\mathrm{C}, \mathrm{D}),(\mathrm{C}, \mathrm{E}),(\mathrm{D}, \mathrm{E})\}$


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## Directed versus Undirected Graphs

$\leftrightarrow$ If order of edge pairs $\left(v_{1}, v_{2}\right)$ matters, graph is directed (also called a digraph $):\left(v_{1}, v_{2}\right) \neq\left(v_{2}, v_{1}\right)$

$\uparrow$ If order of edge pairs $\left(v_{1}, v_{2}\right)$ does not matter, graph is called an undirected graph: in this case, $\left(v_{1}, v_{2}\right)=\left(v_{2}, v_{1}\right)$ so the edge $=\left\{v_{1}, v_{2}\right\}$


## Degree, In-Degree, Out-Degree

$\downarrow$ Degree of a vertex in an undirected graph = number of edges incident on the vertex
$\star$ In-Degree/Out-degree in a digraph = number of edges entering/exiting a vertex


$$
\operatorname{Deg}(1)=2
$$

$$
\operatorname{Deg}(4)=3
$$



In-Deg(2) = 2
Out-Deg(2) = 1
In-Deg(4)=Out-Deg(4)=2

## Graph Representations

There are two ways of representing graphs:

- The adjacency matrix representation
- The adjacency list representation


## Graph Representation: Adjacency Matrix

The adjacency matrix representation:

$$
M(v, w)=\left\{\begin{array}{ll}
1 & \text { if }(v, w) \text { is in } \mathrm{E} \\
0 & \text { otherwise } \\
\mathrm{A} \\
\mathrm{~B} \\
\text { R. Rao, } \operatorname{CSE} 311
\end{array}\left(\begin{array}{cccccc}
\mathrm{A} & \mathrm{~B} & \mathrm{C} & \mathrm{D} & \mathrm{E} & \mathrm{~F} \\
0 & 1 & 0 & 1 & 0 & 0 \\
1 & 0 & 1 & 0 & 0 & 0 \\
0 & 1 & 0 & 1 & 1 & 0 \\
1 & 0 & 1 & 0 & 1 & 0 \\
0 & 0 & 1 & 1 & 0 & 0 \\
0 & \mathrm{E} \\
0 & 0 & 0 & 0 & 0 & 0
\end{array}\right)\right.
$$

## Graph Representation: Adjacency List

The adjacency list representation: For each $v$ in $V$,
$L(v)=$ list of $w$ such that $(v, w)$ is in $E$


## Adjacency List for a Digraph



Digraph


## Paths in Graphs

$\uparrow$ Path of length k from vertex u to vertex $\mathrm{u}^{\prime}$ in $\mathrm{G}=(\mathrm{V}, \mathrm{E})=$ sequence of vertices $\left\langle\mathrm{v}_{0}, \mathrm{v}_{1}, \ldots, \mathrm{v}_{\mathrm{k}}\right\rangle$ where $\mathrm{v}_{0}=\mathrm{u}, \mathrm{v}_{\mathrm{k}}=\mathrm{u}^{\prime}$, and $\left(v_{i-1}, v_{i}\right) \in E$ for $i=1,2, \ldots, k$.


A path from a to $c$ <a, b, c>

Another path:
<a, e, b, f, e, b, c>

## Simple Paths and Circuits

- Simple Path: Path that does not repeat an edge
$\uparrow$ Circuit: Path that begins and ends at the same vertex
A simple path from a to $c$

<a, b, c>
Not a simple path:
<a, e, b, f, e, b, c>


## Circuit:

<a,b,c, f, b, a>
Simple circuit:
<a,b,c,f,e,a>
Simple circuit visiting all vertices:
R. Rao, CSE 311
<a,b,c,f,e,d,a>

## Connected Graphs

$\uparrow$ An undirected graph is connected iff there is a path between every pair of vertices
$\uparrow$ A directed graph is (weakly) connected iff the underlying undirected graph is connected


Connected


Not connected


Connected

## Trees

$\downarrow$ A tree is a connected graph with no circuits


Tree


Tree


Not a tree


Not a tree

## Examples of Trees: Folders and file system

|  |
| :---: |

## Example: Connecting Multi-Processors


E.g., Multiplying 8 large numbers in 3 steps

## Binary Search Trees



## Game Trees

Which move do you choose? ( $a^{\prime} X^{\prime \prime}$ )




Famous Graph Problems: Topological Sort

Problem: Find an order in which all these courses can be taken.
Example: 142, 143,
331, 311, 312, 332, 351, 352, 333


To take a course, all its prerequisites must be taken first

Famous Graph Problems: Euler Circuits

- Find a circuit going through every edge exactly once.


No Euler circuit
No Euler circuit (An Euler path exists though)

Theorem: For Euler circuit to exist, every vertex must have even degree (Why? If entering vertex, must exit)
R. Rao, CSE $311 \quad \Rightarrow$ Fast algorithm for checking if Euler circuit exists

## Hamiltonian Circuit Problem

$\rightarrow$ Find a circuit passing through every vertex exactly once.


San Francisco, Chicago, Boston, New York, Miami, Atlanta, Denver, LA, San Francisco

## Hamiltonian Circuit Problem

$\uparrow$ Find a circuit in $G=(\mathrm{V}, \mathrm{E})$ passing through every vertex exactly once.
$\rightarrow$ Naïve algorithm:
$\Rightarrow$ Try all permutations of the vertices
$\Rightarrow$ Check to see if any permutation is a valid Hamiltonian circuit in the graph.
$\star$ There are $|\mathrm{V}|$ ! permutations $\Rightarrow$ running time is $>$ exponential in size of input.

## Can show this is an "NP-Complete" Problem:

## Fast algorithm unlikely to exist!!

(More on this in CSE 312)


