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# Graphs

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Course 600.226: Data Structures, Professor: Jonathan Cohen




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## What is a Graph?


(in computer science, it's not a data plot)

General structure for representing positions with an arbitrary connectivity structure

- Collection of *vertices* (nodes) and *edges* (arcs)
  - Edge is a pair of vertices - it connects the two vertices, making them *adjacent*
- A tree is a special type of graph!

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## What can graphs represent?

- City map
- Computer network
- Transportation system
- Electrical wiring
- etc.

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## What can we do with graphs?

- Find a *path* from one place to another
- Find the *shortest path* from one place to another
- Find the “weakest link”
  - check amount of redundancy in case of failures
- Draw them

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## Types of Graphs

- Undirected / directed**
  - Edges are symmetric / one-way
- Acyclic**
  - no path of unique edges starts and ends at same vertex
- Connected**
  - There is a path between each pair of nodes
- Forest: acyclic graph**
- Tree: connected forest (not necessarily rooted)**

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## (undirected) Graph ADT

- `numVertices()`: return # of vertices or edges
- `vertices()`, `edges()`: return iterator of vertices or edges
- `degree(v)`: return # of incident edges on a vertex
- `incidentEdges(v)`: return iterator of incident edges on vertex
- `endVertices(e)`: return two vertices of edge *e*
- `opposite(v, e)`: return endpoint of *e* that is not *v*
- `areAdjacent(v, w)`: return whether an edge connects *v* to *w*
- `insertEdge(v, w, o)`: create and return an edge between *v* and *w* storing object *o*
- `insertVertex(o)`: insert and return new vertex storing *o*
- `removeVertex(v)`: remove vertex *v* and its adjacent edges
- `removeEdge(e)`: remove edge *e*

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## Concrete graph representations

**Edge List:** simple but inefficient in time

**Adjacency List:** moderately simple and efficient

**Adjacency Matrix:** simple but inefficient in space

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## Edge List

**Container (list/vector/dictionary) of vertices**

- Each vertex just has its object

**Container (list/vector/dictionary) of edges**

- Each edge has its object
- Edge also has references to its two endpoint vertices

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## Edge list (linked list) efficiency

**vertices( ) :**  $O(n)$   
**edges( ) :**  $O(m)$   
**endVertices( $e$ ):**  $O(1)$   
**incidentEdges( $v$ ):**  $O(m)$   
**areAdjacent( $v, w$ ):**  $O(m)$   
**removeEdge( $e$ ):**  $O(1)$   
**removeVertex( $v$ ):**  $O(m)$

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## Adjacency List

**Similar to Edge List**

**Each vertex also has container of references to incident edges**

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## Adjacency list (linked list) efficiency

**vertices( ) :**  $O(n)$   
**edges( ) :**  $O(m)$   
**endVertices( $e$ ):**  $O(1)$   
**incidentEdges( $v$ ):**  $O(\text{deg}(v))$   
**areAdjacent( $v, w$ ):**  $O(\min(\text{deg}(v), \text{deg}(w)))$   
**removeEdge( $e$ ):**  $O(\text{deg}(u) + \text{deg}(v))$   
 $e = (u, v)$   
**removeVertex( $v$ ):**  $O(\text{deg}(v) + \sum_{u \in \text{adj}(v)} \text{deg}(u))$

(note: the last two are incorrect in the textbook)

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## Adjacency Matrix

**Extend edge list with  $v \times v$  array**

- each entry holds null reference or reference to edge connected vertex  $i$  to vertex  $j$

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## Adjacency Matrix efficiency

**vertices()** :  $O(n)$   
**edges()** :  $O(m)$   
**endVertices( $e$ ):**  $O(1)$   
**incidentEdges( $v$ ):**  $O(n)$   
**areAdjacent( $v, w$ ):**  $O(1)$   
**removeEdge( $e$ ):**  $O(1)$   
**removeVertex( $v$ ):**  $O(n^2)$   
 • perhaps  $O(n)$  with amortization

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## Traversing Graphs

Traversal visits all nodes and edges of graph  
 (preferably in linear time)

- Depth-first search
- Breadth-first search

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## Depth-first Search (DFS)

### Basic approach

- Visit node, then recursively visit children
- Traverse a path all the way to dead-end before traversing other paths

First, label all vertices and edges as unvisited

```

DFS( $G, v$ )
  for all edges,  $e$ , in  $G.incidentEdges(v)$  do
    if  $e$  is unvisited then
       $w = G.opposite(v, e)$ 
      if  $w$  is unvisited then
        label  $e$  as tree edge
        DFS( $G, w$ )
      else
        label as back edge
  
```

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## Performance of DFS

Each vertex is visited exactly once

Each edge is used exactly once

Each edge is considered exactly twice

Run time is  $O(n + m)$

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## Uses for DFS

All  $n$  nodes and  $m$  edges are visited

- if graph is not connected, all nodes and edges in connected component are visited

Useful for:

- Find a *spanning tree* of a graph
- Find a path between two vertices
- Find all connected components of a graph
- Finding a cycle (if any) in a graph

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## Breadth-first search

### Basic approach

- Visit a node, then put all its children on a queue to be visited
- Visit nodes in order of queue  
 —visits “close” nodes first, then “farther” nodes

```

BFS( $G, s$ )
  mark all vertices and edges unvisited
  Initialize queue,  $Q$  to contain vertex,  $s$ 
  while not  $Q.isEmpty()$  do
     $v = Q.dequeue()$ , mark  $v$  visited
    for each edge,  $e$  of  $v$  do
      if  $e$  is unvisited then
         $w = G.other(v, e)$ 
        if  $w$  is unvisited then
          label  $e$  as tree edge,  $Q.enqueue(w)$ 
        else label  $e$  as cross edge
  
```

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