# Lecture 34: Graphs II 

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## Number of Edges

- If $|V|=n$, then:
- minimum number of edges: 0
- A graph can have only nodes
- For simple directed graphs, maximum number: $n(n-1)$
- For simple undirected graphs, maximum number: $\frac{n(n-1)}{2}$
- Dense graphs $\rightarrow$ \#edges close to maximum
- Sparse graphs $\rightarrow$ \#edges close to $n$


## Graph Representations

- Adjacency Matrix
- Adjacency List



## Adjacency Matrix

|  | A | B | C | D |
| :--- | :--- | :--- | :--- | :--- |
| A | 0 | 1 | 1 | 1 |
| B | 1 | 0 | 0 | 1 |
| C | 1 | 0 | 0 | 0 |
| D | 1 | 1 | 0 | 0 | -

- Good for dense graphs
- Constant time for lookup for edges.
- Constant time for adding/removing an edge
- Symmetric if undirected.
- Can hold weights.



## Adjacency Lists



- Good for sparse graphs, saves space.
- Linear time lookup for edges.



## Time complexity comparison

| Operation | Adjacency Matrix | Adjacency List |
| :--- | :---: | :---: |
| Store graph | $O\left(\|V\|^{2}\right)$ | $O(\|V\|+\|E\|)$ |
| Add vertex | $O\left(\|V\|^{2}\right)$ | $O(1)$ |
| Add edge | $O(1)$ | $O(1)$ |
| Remove vertex | $O\left(\|V\|^{2}\right)$ | $O(\|E\|)$ |
| Remove edge | $O(1)$ | $O(\|V\|)$ |
| Are two vertices adjacent? | $O(1)$ | $O(\|V\|)$ |

## Spanning Trees

- Tree: connected undirected graph with no cycles
- Spanning tree of $G$ : includes every vertex of $G$ and is a subgraph of $G$ (every edge belongs to $G$ )
- Can have properties like minimum-cost
- Can be constructed by search algorithms


Graph G

## Depth-First Search

- Explore the graph without revisiting nodes
- Depth-first means go until you hit a dead end, then back up to branch out



## Recursive DFS pseudocode

```
DFS(G,v){
    visited[v] = true;
    for(every edge (v,w)){
                if(!visited[w]){
                DFS(G,w);
        }
    }
}
```



Order of visit: A B D F E C G

## Practice time



Order of visit: A B S C D E H G F

## Non-recursive DFS pseudocode

```
for(every vertex v)
    visited[v]=false;
s=new Stack();
s.push(v1);
while(!s.isEmpty())
{
    v = s.pop();
    if (!visited[v])
    {
        visited[v] = true;
        for (every edge (v, w))
        if (!visited[w])
            s.push(w);
    }
}
```



Order of visit: A E F B D C G

## Practice time



Order of visit: A S G H E C F D B

## Breadth-First Search

- Replace stack with queue
- Now we explore in order of distance from start
- Algorithm:

1. Mark start vertex
2. Add all unmarked neighbors to queue and mark them 3. Repeat step 2 with next from queue until it's empty

## BFS pseudocode

```
for(every vertex v)
    visited[v]=false;
q=new Queue();
q.enqueue(v1);
while(!q.isEmpty())
{
    v = q.dequeue();
    if (!visited[v])
    {
            visited[v] = true;
            for (every edge (v, w))
                if (!visited[w])
                    q.enqueue(w);
    }
}
```



Order of visit: A B C E D F G

## Practice time



Order of visit: A B S C G D E F H

## DFS/BFS traversal

- Can be performed in $O(n+m)$, where $n=|V|, m=|E|$
- Can:
- Test if $G$ is connected
- If traversal visited all vertices, then graph is connected
- Compute a spanning tree of $G$, if $G$ is connected
- Find a path between two vertices, if it exits
- Compute the connected components of $G$ (needs to loop over all vertices and run DFS/BFS again)


## Connectivity in Digraphs

- reachable vertices: when there is a directed path from one to another.
- strongly connected vertices: if mutually reachable
- strongly connected digraph: directed path from every vertex to every other vertex
- weakly connected graph: a digraph that would be connected if all of its directed edges were replaced by undirected edges.


## Testing connectivity

- For an undirected graph:
- Run DFS/BFS from any vertex without restarting and see if all vertices are marked
- For strong connectivity on a directed graph:
- 1. Initialize all vertices are not visited
- 2. Run DFS/BFS from an arbitrary vertex $v$.
- If traversal does not visit all vertices return false
- 3. Reverse all edges
- 4. Start from same vertex $v$ and perform DFS/BFS. Graph is strongly connected iff all vertices are marked as visited again.

