

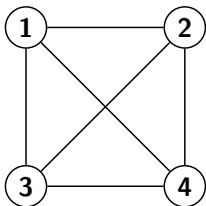
Definition of a Graph

- ▶ A graph G consists of a pair of sets V, E denoted by $G = (V, E)$.
- ▶ V : vertex set.
 - Each vertex $v \in V$ may represent some records, objects or a piece of information.
- ▶ E : edge set.
 - Each edge $e \in E$ links (relates) one pair of distinct vertices $u \neq v \in V$.
 - There is at most one edge which relates two distinct vertices.

Definition of a Graph

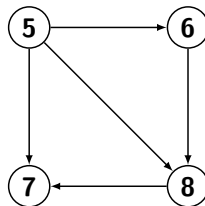
- ▶ G is undirected if each edge represents an unordered pair, i.e., $e = (u, v) = (v, u)$.
- ▶ In an undirected graph, E may define upto $\binom{|V|}{2}$ relations among vertices.
- ▶ If $(u, v) \neq (v, u)$, then the edges are said to be directed:
 - The edge (u, v) is oriented from u to v .
 - The edge (v, u) is oriented from v to u .
- ▶ When edges in a graph G are directed, G is known as directed.
- ▶ A directed graph may have upto $|V|(|V| - 1)$ edges.

Examples of Graphs



Undirected graph

$$V = \{1, 2, 3, 4\} \text{ and} \\ E = \{(1, 2), (1, 3), (1, 4), (2, 3), (3, 4)\}$$



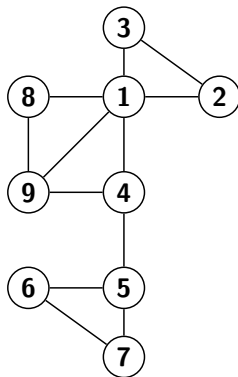
Directed graph

$$V = \{1, 2, 3, 4\} \text{ and} \\ E = \{(5, 6), (5, 7), (5, 8), (6, 8), (8, 6)\}$$

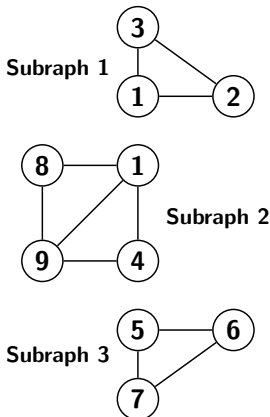
Graph Terminology

- ▶ A graph $H = (V_H, E_H)$ is a subgraph of $G = (V_G, E_G)$, if $V_H \subseteq V_G$ and $E_H \subseteq E_G$.
- ▶ A simple path in a graph is a sequence of distinct vertices v_1, v_2, \dots, v_k where $(v_i, v_{i+1}) \in E$, for $1 \leq i \leq k-1$.
- ▶ A cycle is a simple path in which the start and end vertices are same, i.e., $v_1 = v_k$.
- ▶ G is connected if there is a path between any two pair of distinct vertices in G .
- ▶ A connected component of a graph G is a maximally connected subgraph of G
- ▶ A graph which does not have any cycle is called acyclic.
- ▶ An acyclic undirected graph is a tree.

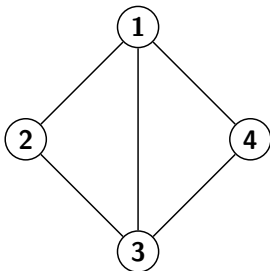
Examples of Subgraph



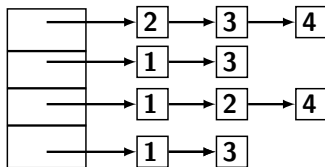
Original graph



Adjacency List Representation

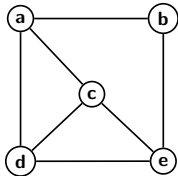


Adjacency list



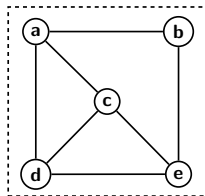
- ▶ Each list represents adjacency relations corresponding to a vertex.

Degrees of Vertices

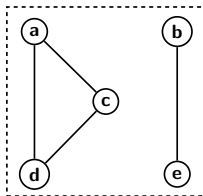


- ▶ $V = \{a, b, c, d, e\}$
- ▶ $E = \{(a, b), (a, b), (a, d), (b, e), (c, d), (c, e), (d, e)\}$
- ▶ Degree of a vertex v : # edges incident on v .
- ▶ $\deg(a) = 3, \deg(b) = 2, \deg(c) = 3, \deg(d) = 3, \deg(e) = 3,$
- ▶ # of odd degree vertices is even.

Connectedness of Graphs



Connected graph



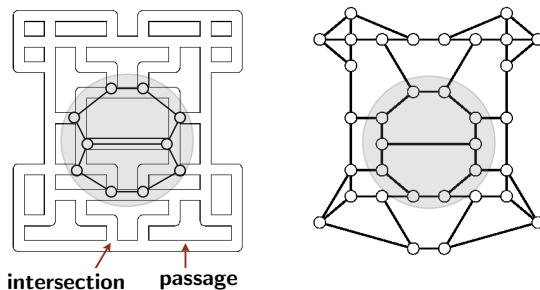
Disconnected graph

- ▶ Connected graphs: \exists a path between any two vertices.
- ▶ Disconnected graphs: Having more than one connected subgraphs.

Applications of Graph

- ▶ Tremaux was obsessed with problem of finding path out of a maze.
- ▶ He came up with technique as follows:
 - Unroll a ball of thread to trace of path that is already traversed.
 - Mark each intersection by putting a mark (color).
 - Retrace back to recent most intersection when no new visit options are present.

Maze to Graph



From Chapter 4 of Robert Sedgewick and Kevin Wayne's Algorithm book.

Depth First Search

- ▶ Basic form of processing graphs is traversal.
- ▶ DFS and BFS are two important traversal techniques.

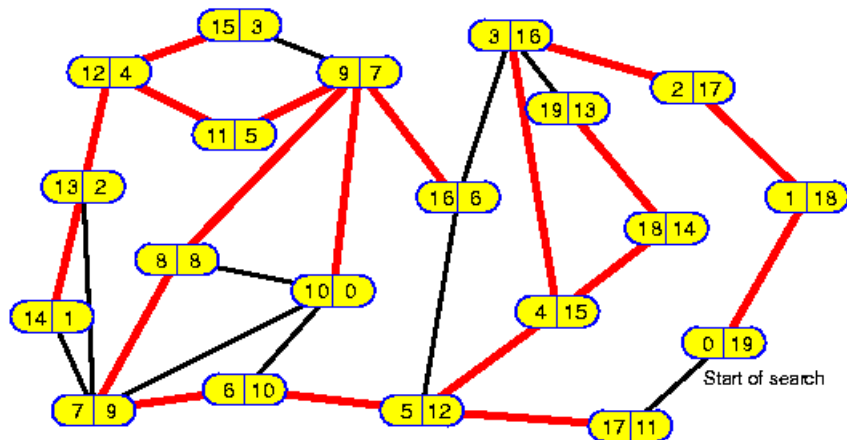
```
// Initializations  
index = 0;  
for all ( $v \in V$ ) {  
    mark[v] = "unvisited";  
     $T = \Phi$ ; // Tree edges  
}  
choose( $s$ ); // Start vertex  
DFS( $s, G$ );
```

Depth First Search

```
procedure DFS( $G, v$ ) {  
    mark[v] = "visited";  
    dfn[v] = ++index; // DFS numbers  
    for all ( $w \in \text{ADJ}_G(v)$ ) {  
        if (mark[w] == "unvisited") {  
             $T = T \cup \{(v, w)\}$ ; // Update T  
            DFS( $G, w$ ); // Recursive call  
        }  
    }  
}
```

Depth First Search Example

DFS Pre- and Postorder Numbering



Correctness of DFS

Lemma

DFS procedure is called exactly once for each vertex.

Proof.

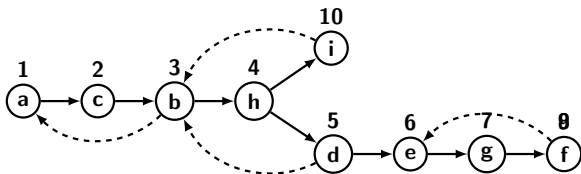
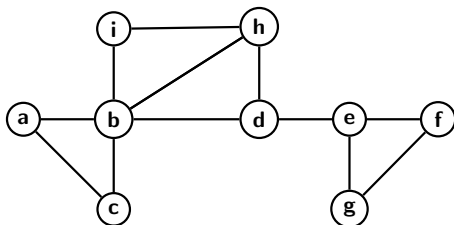
- ▶ Once DFS is called for a particular vertex v , it is marked as "visited".
- ▶ DFS is never called out on "visited" vertices.



Classification of Edges

- ▶ DFS gives an orientation to edges of an undirected graph.
- ▶ Traversing some edges lead to unvisited vertices.
- ▶ While the remaining edges lead to visited vertices.
- ▶ If a vertex w is found visited during $\text{DFS}(v)$, then w must be an ancestor of v in the DFS tree.
 - $\text{DFS}(v)$ must have been called during the time $\text{DFS}(w)$ call itself.
 - In other words, $\text{DFS}(w)$ is still incomplete when $\text{DFS}(v)$ was called.
- ▶ So edges are classified into two types: tree edges, and back edges.

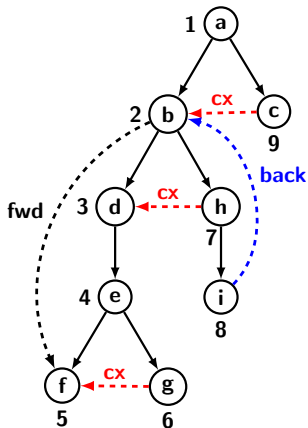
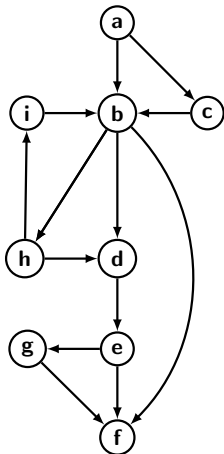
Edge Types in DFS of Undirected Graphs



DFS of Directed Graphs

- ▶ DFS of directed graphs must explore the edges by respecting the direction of orientation of the edges.
- ▶ As usual, tree edges are those edges that always lead to new (unvisited) vertices.
- ▶ Remaining edges are partitioned into three other types.
 - Back edges: which lead from a descendant to an ancestor.
 - Forward edges: which lead from a proper ancestor to a descendant
 - Cross edges: connects two unrelated vertices w and v . If the orientation is $v \rightarrow w$, then v is visited after w .

Edge Types in DFS of Directed Graphs



DFS of Disconnected Graphs

- ▶ Algorithm we have presented works for connected graph.
- ▶ For DFS of disconnected graphs, we need to change initial calling of procedure a bit.

```
// Initializations
index = 0;
for all ( $v \in V$ ) {
    mark[v] = "unvisited";
     $T = \Phi$ ; // Tree edges
}
for all ( $v \in V$ ) {
    if (mark[v] == "unvisited")
        DFS( $v, G$ );
}
```

Iterative DFS

- ▶ Use a stack to allow for backtracking during DFS.
- ▶ Initialize stack by placing a start vertex v .
- ▶ As long as stack is nonempty pop the last vertex and mark it visited if it is not visited.
- ▶ Then push all the other end vertices of the edges incident on the current vertex.

Iterative DFS

```
IterativeDFS( $G, v$ ) {  
  // Initialization  
  index = 0;  
   $T = \Phi$ ;  
  makeNull( $S$ ); // Define an empty stack  
  for all ( $v \in V$ )  
    mark[ $v$ ] = unvisited;  
  choose( $s$ ); // Start vertex  
   $S.push(s)$ ;  
  // Remaining part in next slide  
}
```

Iterative DFS

```
while (!isEmpty(S)) {  
    v = S.pop();  
    if (marked[v] == "unvisited") {  
        mark[v] = "visited";  
        dfn[v] = ++index;  
        for all  $w \in \text{ADJ}_G(v)$  {  
            if (marked[w] == "unvisited") {  
                S.push(w);  
            }  
        }  
    }  
}
```

Iterative DFS

- ▶ There may be multiple copies of vertices on the stack.
- ▶ But the total number of iterations of stack loop cannot exceed number edges.
- ▶ Thus the size of the stack cannot exceed $|E|$.
- ▶ Try out how you can avoid having multiple copies a vertex in the stack.

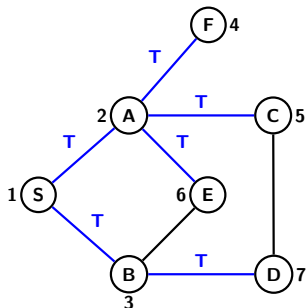
Breadth First Search

```
// Initialization  
index = 0;  
T =  $\Phi$ ;  
Q = NULL;  
for all ( $v \in V$ )  
    mark[v] = "unvisited";  
choose( $s$ ); // Start vertex  
bfn[ $s$ ] = ++index;  
ENQUEUE(Q,  $s$ );  
// Remaining part in next slide
```


Breadth First Search

```
while (!isEmpty(Q)) {  
     $v = \text{DEQUEUE}(Q);$   
     $\text{mark}[v] = \text{"visited"};$   
    for all ( $w \in \text{ADJ}_G(v)$ ) {  
        if ( $\text{mark}[w] == \text{"unvisited"}$ ) {  
             $\text{mark}[w] = \text{"visited"};$   
             $T = T \cup \{(v, w)\};$   
             $\text{bfn}[v] = ++\text{index};$   
             $\text{ENQUEUE}(Q, w);$   
        }  
    }  
}
```

Breadth First Search



| v | w | Action | Queue |
|---|---|-------------------------|-----------|
| - | - | bf _n (S) = 1 | {S} |
| S | A | bf _n (A) = 1 | {A} |
| | B | bf _n (B) = 2 | {A,B} |
| A | F | bf _n (F) = 4 | {B,F} |
| | C | bf _n (C) = 5 | {B,F,C} |
| | E | bf _n (E) = 6 | {B,F,C,E} |
| B | D | BF _N (D) = 7 | {F,C,E,D} |
| | E | None | {F,C,E,D} |
| | S | None | {F,C,E,D} |
| F | A | None | {C, E, D} |
| C | A | None | {E, D} |
| | D | None | {E, D} |
| E | A | None | {D} |
| | B | None | {D} |
| D | C | None | {} |
| | B | None | {} |

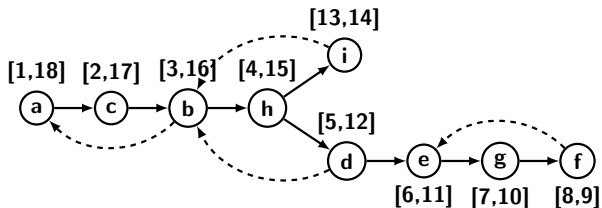
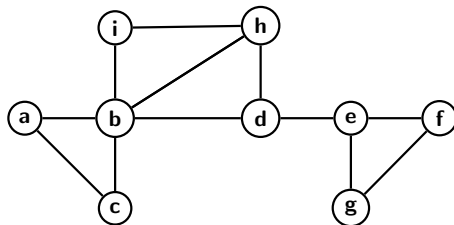
Classification of Edges by BFS

- ▶ There can be no back edges or forward edges in BFS of undirected graphs.
- ▶ For each tree edge (u, v) , $\text{dist}[v] = \text{dist}[u] + 1$
- ▶ For each cross edge (u, v) , $\text{dist}[u] = \text{dist}[v]$ or $\text{dist}[v] = \text{dist}[u] + 1$

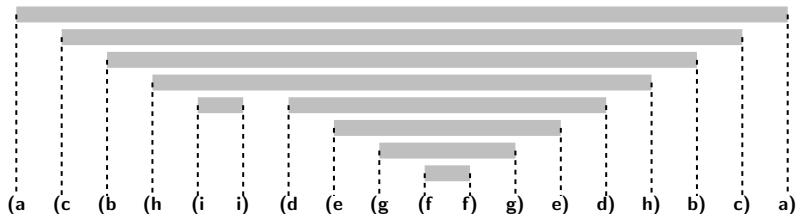
Parenthesis Theory

- ▶ Consider DFS numbers and reverse DFS numbers generated during DFS of a graph.
- ▶ Let u and v be any two vertices in the graph and let $d[v]$ and $f[u]$ respectively denote discovery time and finishing time of DFS then exactly one of the following three conditions hold.
 - If the intervals $[d[u], f[u]]$ and $[d[v], f[v]]$ are disjoint neither u nor v is a descendant of the other in DFS tree/forest.
 - If $[d[v], f[v]]$ completely enclosed within $[d[u], f[u]]$ then v is a descendant of u .
 - If $[d[u], f[u]]$ completely enclosed within $[d[v], f[v]]$ then u is a descendant of v .

Parenthesis Theory



Parenthesis Theory



- ▶ Opening parenthesis corresponds to discovery time d .
- ▶ Closing parenthesis corresponds to finish time f .
- ▶ Resulting expression is a valid parenthetical matching string.

Connected Components

- ▶ How to obtain connected components?
 - Using DFS/BFS it is possible.
- ▶ Outline of the algorithm is as follows:
 - Initialize a connected component number to 0.
 - Inside the second for-loop increment connected component number each time before calling DFS procedure.

Connected Components

```
index = 0;
count = 1; // initialize
for all ( $v \in V$ ) {
    mark[v] = "unvisited";
}
for all ( $v \in V$ ) {
    if (mark[v]=="unvisited"){
        DFS(G, v);
        increment(count); // Component number
    }
}
```


Depth First Search

```
DFS(G, v) {  
    mark[v] = "visited";  
    cID[v] = get(count); // Component ID  
    dfn[v] = ++index; // DFS number  
    for all (w  $\in$  ADJG(v)) {  
        if (mark[w]=="unvisited") {  
            parent[w] = v;  
            DFS(G, w);  
        }  
    }  
}
```

Topological Sorting

Definition

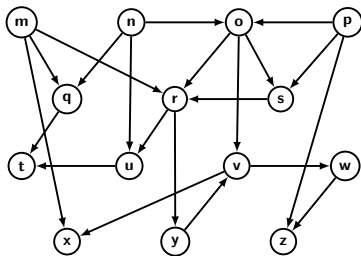
A linear total ordering of the vertices of directed graph, such that for each edge $u \rightarrow v$, u appears before v in the list.

- ▶ Scheduling constraints between lectures.
- ▶ Pre-requisites of your B. Tech degree.
- ▶ Various stages or tasks related to completion of projects.

Topological Sorting

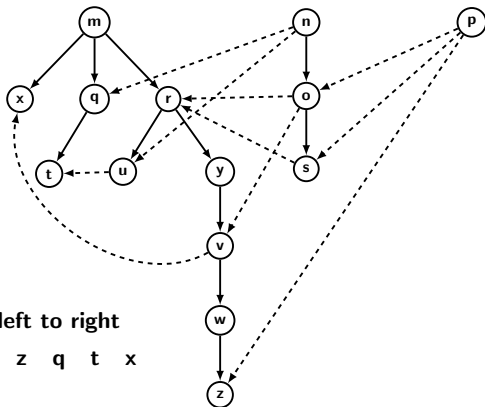
- ▶ Just call DFS to compute reverse DFS number.
- ▶ As numbering to a vertex get assigned insert it to the front of an initially empty linked list.
- ▶ Linked list gives the topological sorted sequence in decreasing order of finish time of the task.

Topological Sorting

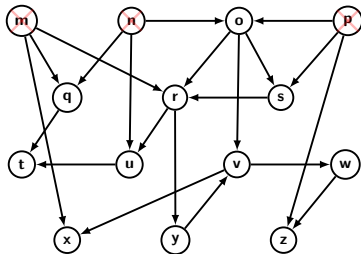


Topological Sort: all edges from left to right

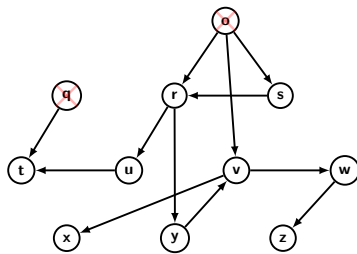
p n o s m r u y v w z q t x



Topological Sorting



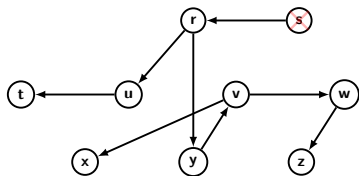
List: m, n, p



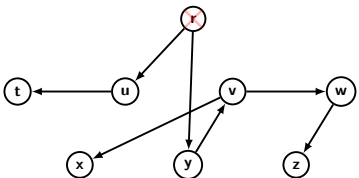
List: m, n, p, o, q

- ▶ Another simple way to get topological sort is as follows:
 - List out all vertices with no incoming edges.
 - Remove these vertices and keep repeating two step until all vertices as listed.

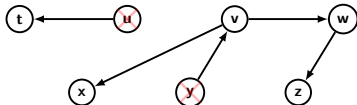
Topological Sorting



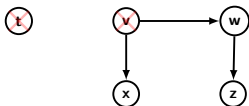
List: m, n, p, o, q, s



List: m, n, p, o, q, s, r

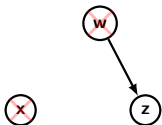


List: m, n, p, o, q, s, r, u, y



List: m, n, p, o, q, s, r, u, y, t, v

Topological Sorting



List: m, n, p, o, q, s, r, u, y, t, v, w, x

Final List:

m, n, p, o, q, s, r, u, y, t, v, w, x, z

- ▶ After deleting w and x only z is left out.
- ▶ Just append z to the list.
- ▶ As we can check the list orders that nodes such that edges always directed from left to right.