



Graph Algorithms

Fall 2020

School of Software Engineering
South China University of Technology

Graph Searching

Section 9.5 and 9.6

Graph Traversals

- Recall traversal of binary trees
 - Preorder, inorder, or postorder traversal
- **Graph traversal**: visit the vertices of a graph in some specific order based on the graph's topology.
- Traversal algorithms typically begins with a start vertex and attempt to visit the remaining vertices from there
 - The traversal can only follow the edges in the graph.
 - It may **not be possible to reach all vertices** if the graph is not connected
 - The algorithms shall make sure **not to go into an infinite loop** if the graph contains cycles.

Graph Traversals

- A **mark bit** is maintained for each vertex
 - If a marked vertex is encountered during traversal, it is not visited a second time
 - If not all vertices are marked when the algorithm completes, we continue the traversal from another unvisited vertex.

```
void graphTraverse(Graph* G) {  
    int v;  
    for (v=0; v<G->n(); v++)  
        G->setMark(v, UNVISITED); // Initialize  
  
    for (v=0; v<G->n(); v++)  
        if (G->getMark(v) == UNVISITED)  
            doTraverse(G, v);  
}
```

Graph Traversals

- Three typical graph traversal strategies
 - Depth-first search (DFS)
 - Breadth-first search (BFS)
- Topological sort

Graph Searching

- Find Properties of Graphs
 - Spanning trees
 - Connected components
 - Bipartite structure
 - Biconnected components
- Applications
 - Finding the web graph – used by Google and others
 - Garbage collection – used in Java run time system
 - Alternating paths for matching

Graph Searching Methodology

- Breadth-First Search (BFS)

- Use a queue to explore neighbors of source vertex, then neighbors of neighbors etc.
- All vertices at a given distance (in number of edges) are explored before we go further

- Depth-First Search (DFS)

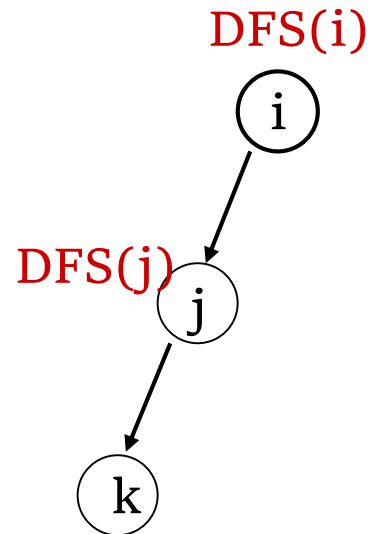
- Searches down one path as deep as possible
- When no vertices available, it backtracks
- When backtracking, it explores side-paths that were not taken
- Uses a stack (instead of a queue in BFS)
- Allows an easy recursive implementation

Depth First Search Algorithm

- Recursive marking algorithm
- Initially every vertex is unmarked

```
DFS(i: vertex)
  mark i;
  for each j adjacent to i do
    if j is unmarked then DFS(j)
  end{DFS}
```

Marks all vertices reachable from i



Depth First Search Algorithm

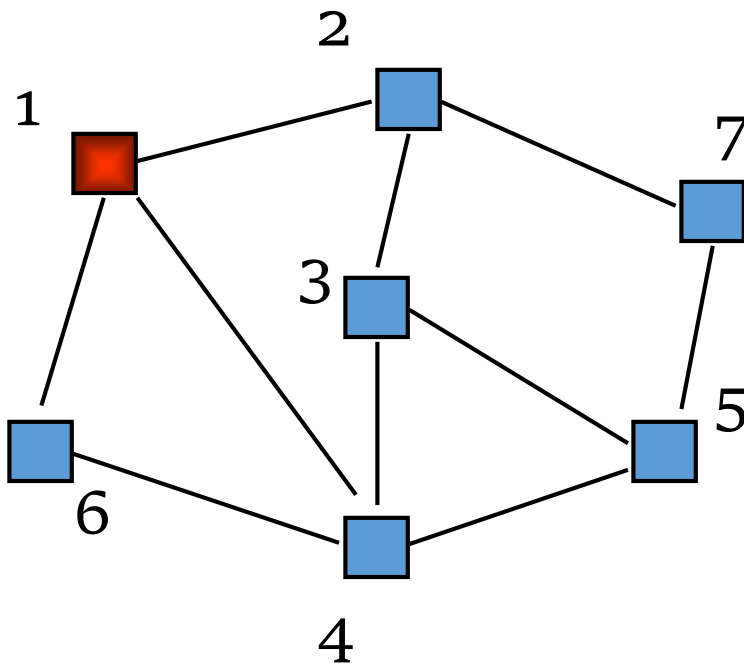
```
void DFS(Graph* G, int v) {  
    PreVisit(G, v); // Take some actions  
    G->setMark(v, VISITED); //mark v  
    for (int w=G->first(v); w<G->n(); w=G->next(v,w))  
        if (G->getMark(w) == UNVISITED)  
            DFS(G, w);  
    PostVisit(G, v); // Take some actions  
}
```

DFS Application: Spanning Tree

- Given a graph $G(V,E)$, a **spanning tree** of G is a graph $G'(V',E')$
 - $V' = V$, the tree touches all vertices (spans) the graph
 - E' is a subset of E such G' is connected and there is **no cycle** in G'
 - A graph is **connected** if given any two vertices u and v , there is a path from u to v

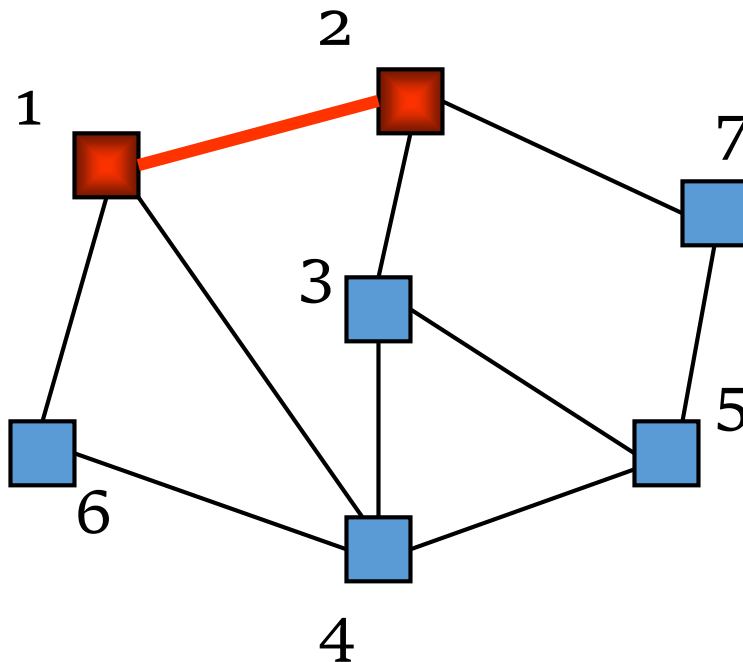
DFS Application: Spanning Tree

- Example of DFS: Graph connectivity and spanning tree



DFS(1)

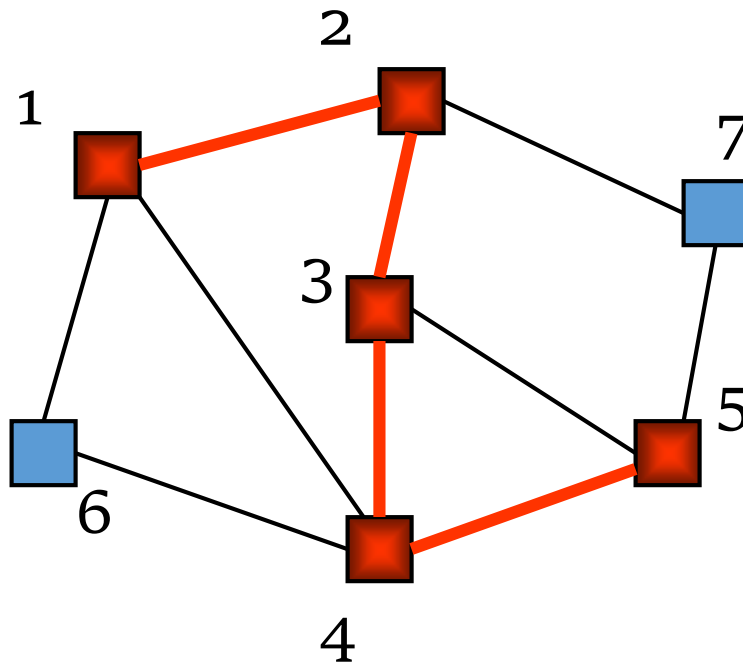
DFS Application: Spanning Tree



DFS(1)
DFS(2)

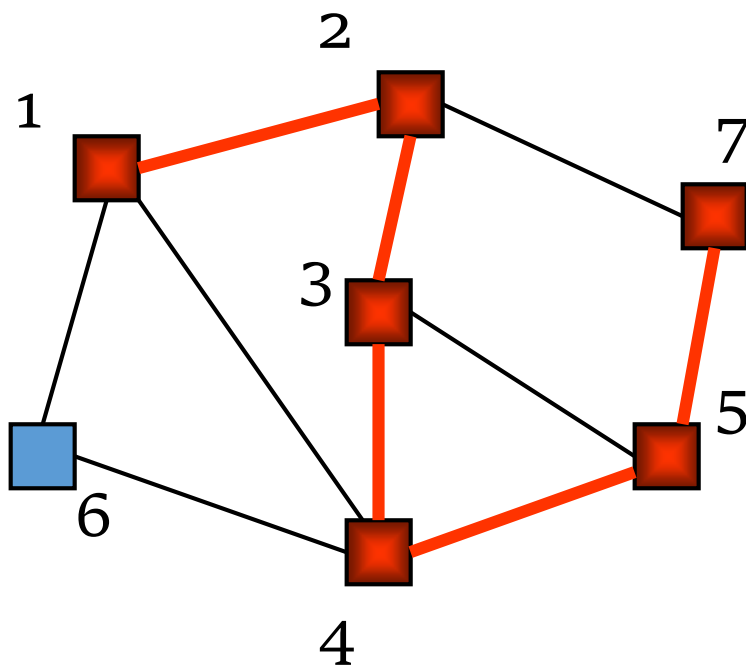
Red links will define the spanning tree
if the graph is connected

DFS Application: Spanning Tree



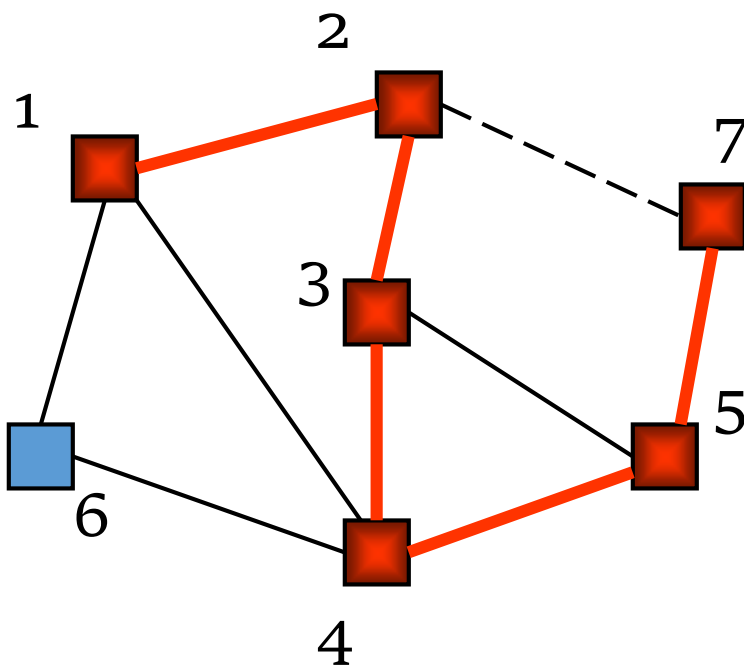
DFS(1)
DFS(2)
DFS(3)
DFS(4)
DFS(5)

DFS Application: Spanning Tree



DFS(1)
DFS(2)
DFS(3)
DFS(4)
DFS(5)
~~DFS(3)~~
DFS(7)

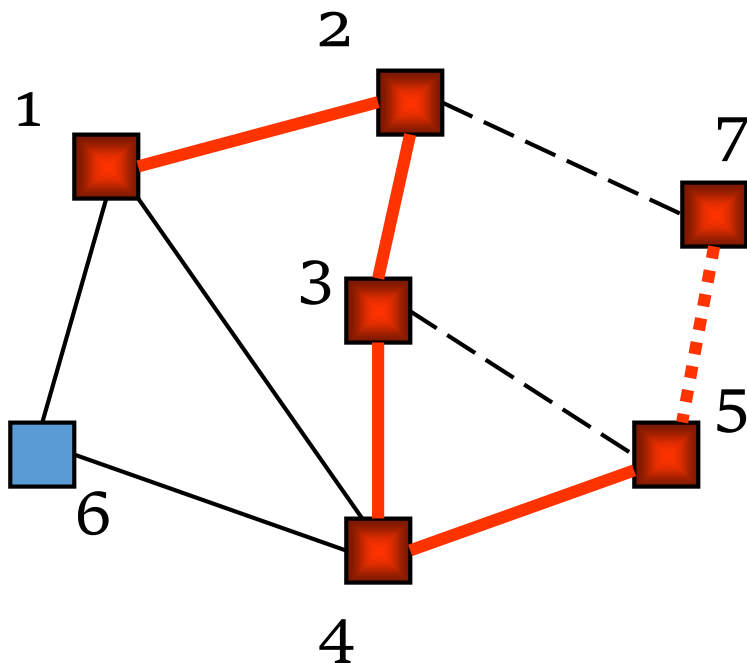
DFS Application: Spanning Tree



DFS(1)
DFS(2)
DFS(3)
DFS(4)
DFS(5)
DFS(7)

Now back up.

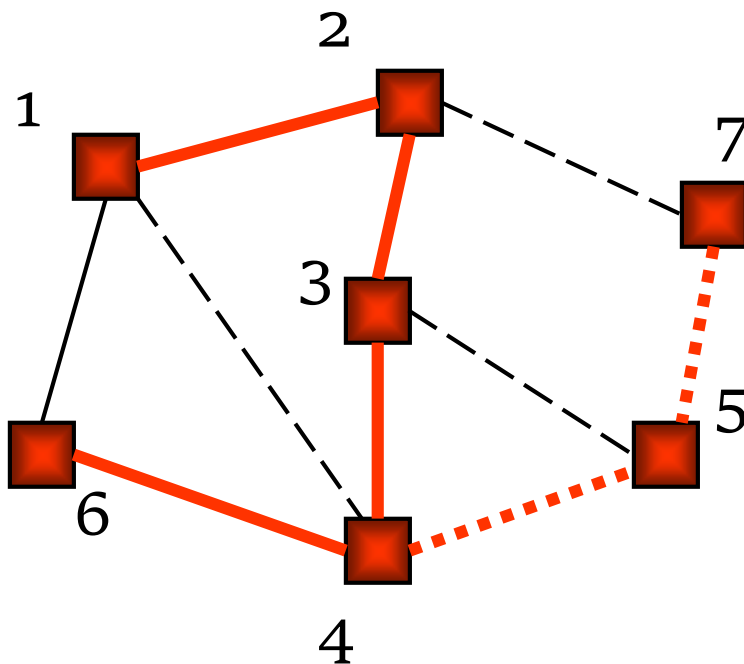
DFS Application: Spanning Tree



DFS(1)
DFS(2)
DFS(3)
DFS(4)
DFS(5)

Back to 5,
but it has no
more neighbors.

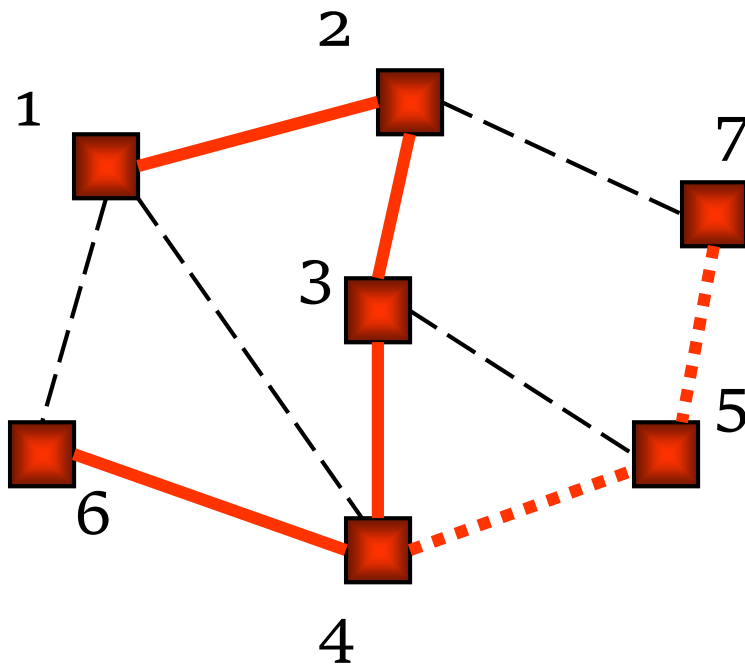
DFS Application: Spanning Tree



DFS(1)
DFS(2)
DFS(3)
DFS(4)
DFS(6)

Back up to 4.
From 4 we can
get to 6.

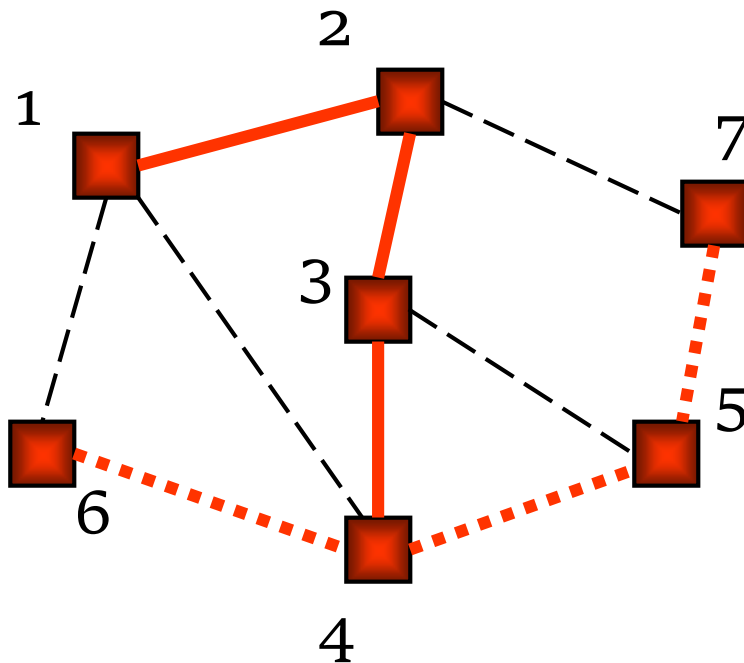
DFS Application: Spanning Tree



DFS(1)
DFS(2)
DFS(3)
DFS(4)
DFS(6)

From 6 there is
nowhere new
to go. Back up.

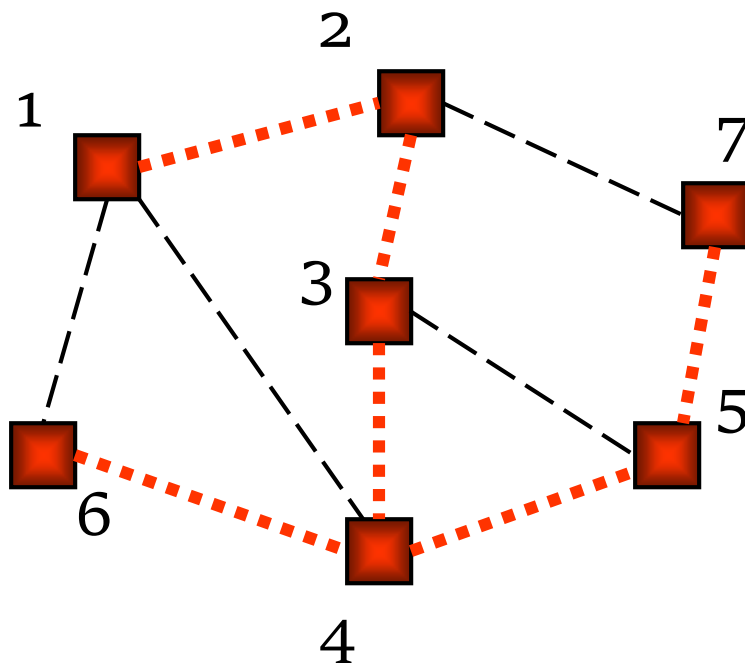
DFS Application: Spanning Tree



DFS(1)
DFS(2)
DFS(3)
DFS(4)

Back to 4.
Keep backing up.

DFS Application: Spanning Tree



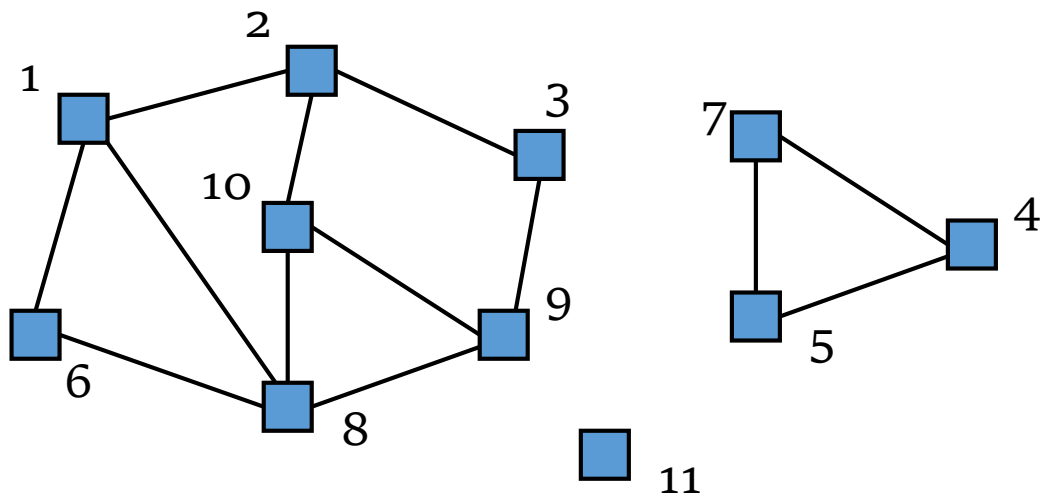
DFS(1)

All the way
back to 1.

Done.

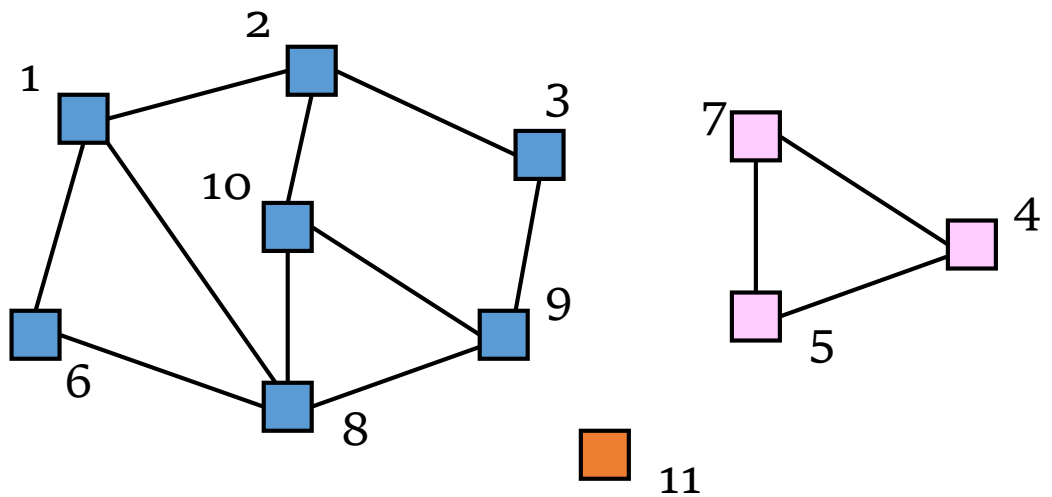
All nodes are marked so graph is
connected; red links define a spanning tree

Another Use for Depth First Search: Connected Components



3 connected components

Connected Components



3 connected components are labeled

Depth-first Search for Labeling Connected components

```
Main {  
  i : integer  
  for i = 1 to n do M[i] := 0; //initial label is zero  
  label := 1;  
  for i = 1 to n do  
    if M[i] = 0 then DFS(G,M,i,label); //if i is not labeled  
    label := label + 1;                //then call DFS  
  }  
  DFS(G[]: node ptr array, M[]: int array, i,label: int) {  
    v : node pointer;  
    M[i] := label;  
    v := G[i]; // first neighbor //  
    while v ≠ null do // recursive call (below)  
      if M[v.index] = 0 then DFS(G,M,v.index,label);  
      v := v.next; // next neighbor //  
  }  
}
```

Performance DFS

- n vertices and m edges
- Storage complexity $O(n + m)$
- Time complexity $O(n + m)$
- Linear Time!

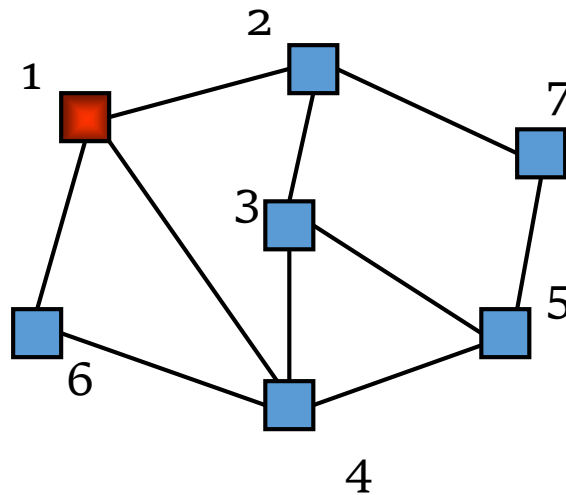
Breadth-First Search

//BFS

```
Initialize Q to be empty;  
Enqueue(Q,1) and mark 1;  
while Q is not empty do  
    i := Dequeue(Q);  
    for each j adjacent to i do  
        if j is not marked then  
            Enqueue(Q,j) and mark j;  
    end{BFS}
```

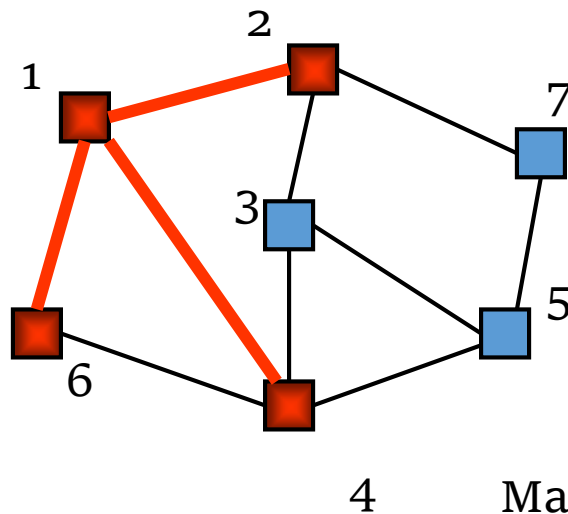
Can do Connectivity using BFS

- Uses a queue to order search



Queue = 1

Beginning of example



Queue = 2,4,6

Mark while on queue
to avoid putting in
queue more than once

Breadth-First Search

```
void BFS(Graph* G, int start, Queue<int>*Q) {  
    int v, w;  
    Q->enqueue(start);    // Initialize Q  
    G->setMark(start, VISITED);  
  
    while (Q->length() != 0) { // Process Q  
        v = Q->dequeue();  
        PreVisit(G, v);    // Take some actions  
  
        for(w=G->first(v); w<G->n(); w=G->next(v,w))  
            if (G->getMark(w) == UNVISITED) {  
                G->setMark(w, VISITED);  
                Q->enqueue(w);  
            }  
        }  
    }  
}
```

Depth-First vs Breadth-First

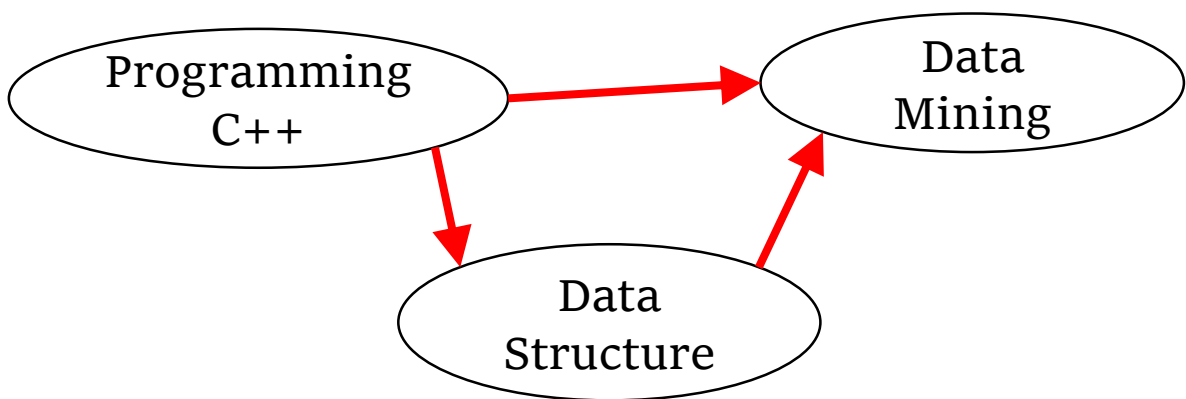
- Depth-First
 - Stack or recursion
 - Many applications
- Breadth-First
 - Queue (recursion no help)
 - Can be used to find shortest paths from the start vertex

Topological Sort

Section 9.2

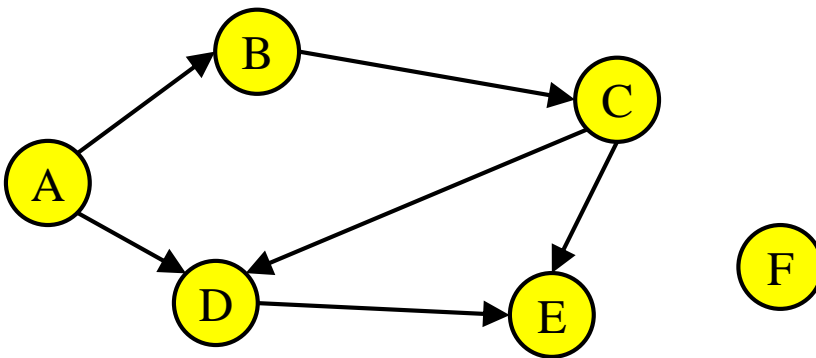
Topological Sort

- Given a series of tasks such as classes or jobs with **prerequisite constraints**, one task cannot be started until its prerequisites are completed.
- Organize the tasks into a **linear order** so that they are completed one at a time without violating any prerequisites.



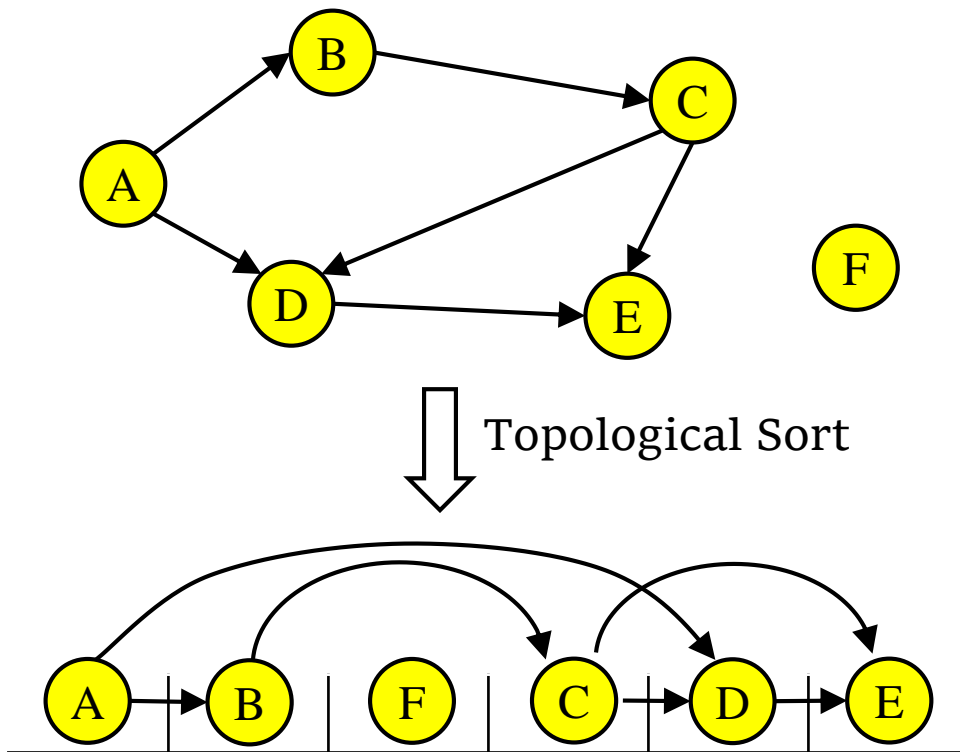
Topological Sort

- Given a **digraph** $G = (V, E)$, find a linear ordering of its vertices such that:
 - for any edge (v, w) in E , v precedes w in the ordering



Topological Sort

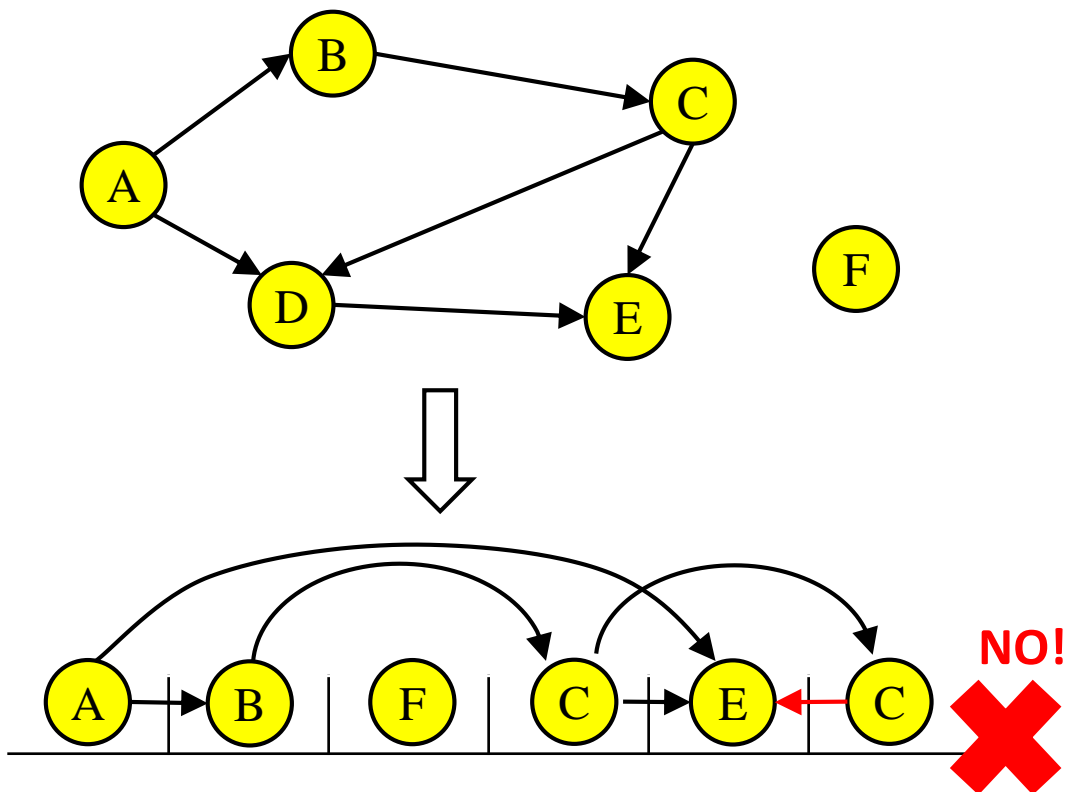
- **Any** linear ordering in which all the arrows go to the right is a valid solution



Note that F can go anywhere in this list because it is not connected. Also **the solution is not unique**.

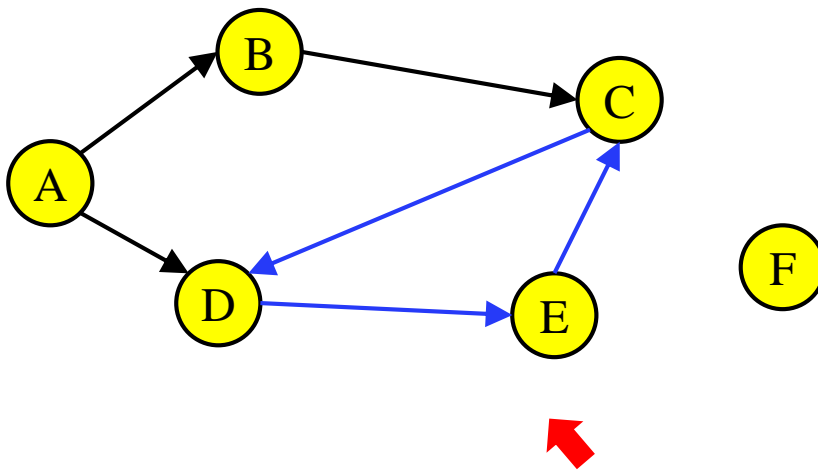
Topological Sort

•bad example



Topological Sort

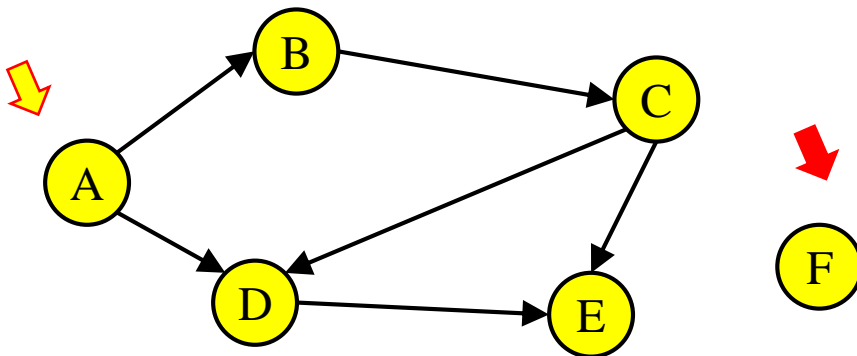
- **Only** direct acyclic graphs (DAG) can be topological sorted



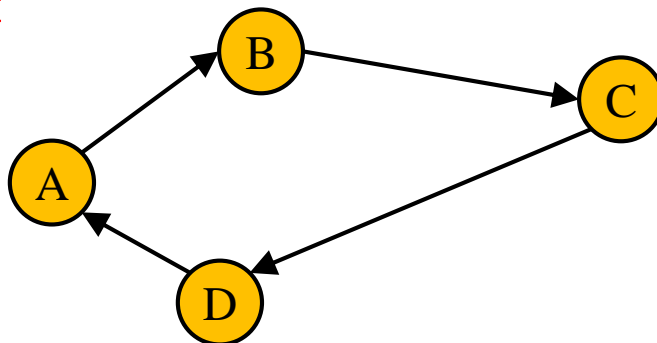
cyclic graph

Topological Sort Algorithm

- Step 1: Identify vertices that have no incoming edges
 - The “in-degree” of these vertices is zero
 - Select one of such vertices

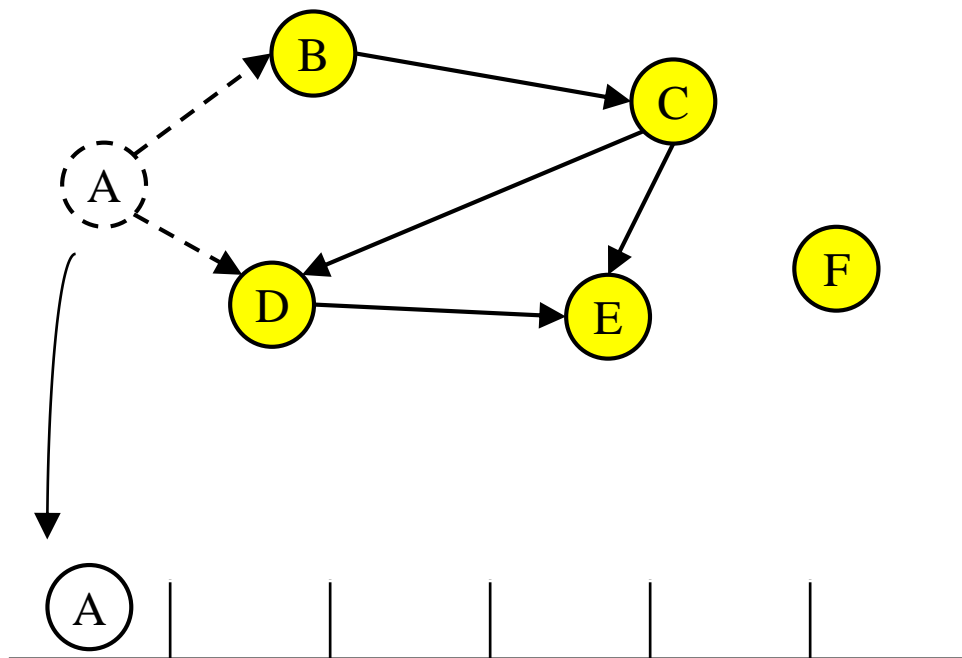


- If no such vertices, graph has only cycle(s) (cyclic graph), Topological sort not possible
 - Halt



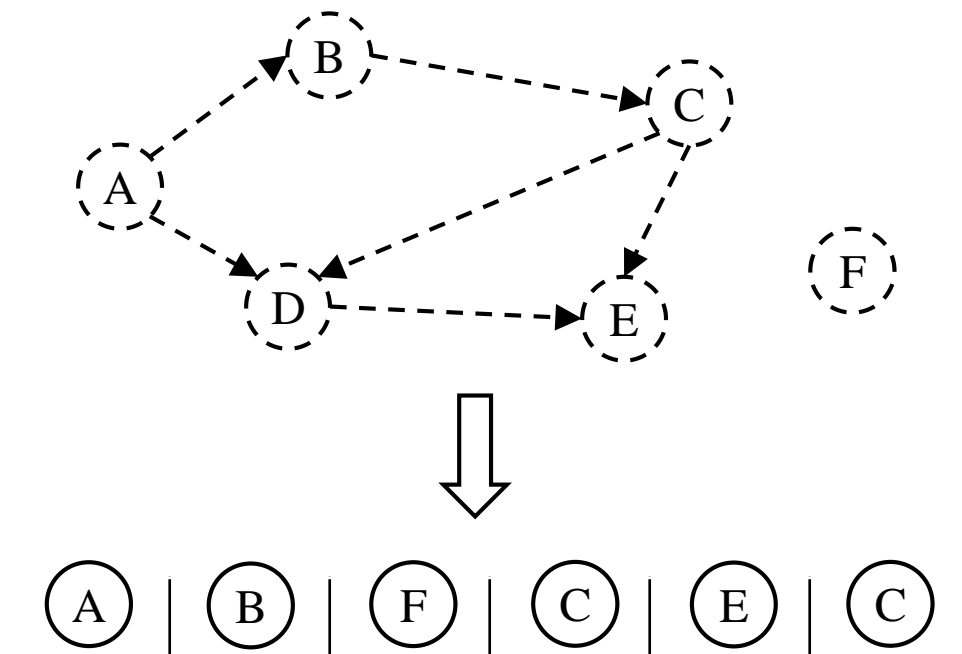
Topological Sort Algorithm

- Step 2: Delete this vertex of in-degree 0 and all its outgoing edges from the graph. Place it in the output



Topological Sort Algorithm

- Repeat Step 1 and Step 2 until graph is empty



- Assume adjacency list representation



```

graph LR
    0[0] --> 1[1]
    1[1] --> 2[2]
    2[2] --> 3[3]
    3[3] --> 4[4]
    4[4] --> 5[5]
    5[5] --> null[ ]
  
```

Topological Sort Algorithm Implementation

② Calculate In-degrees

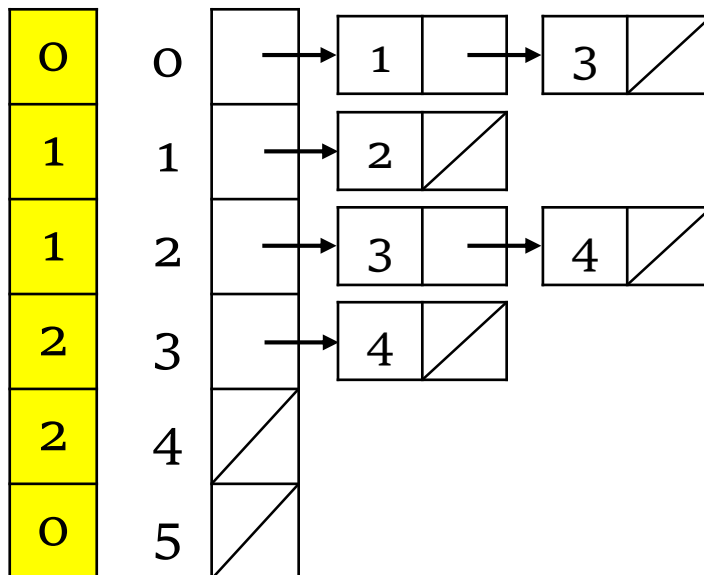
```
// in-degree array D[];  
// vertex array A[]  
for i = 0 to n-1 do D[i] := 0;  
endfor  
for i = 0 to n-1 do  
  x := A[i];  
  while x ≠ null do  
    D[x.value] := D[x.value] + 1;  
    x := x.next;  
  endwhile  
endfor
```


Topological Sort Algorithm Implementation

② Calculate In-degrees

0	1	2	3	4	5
0	1	1	2	2	0

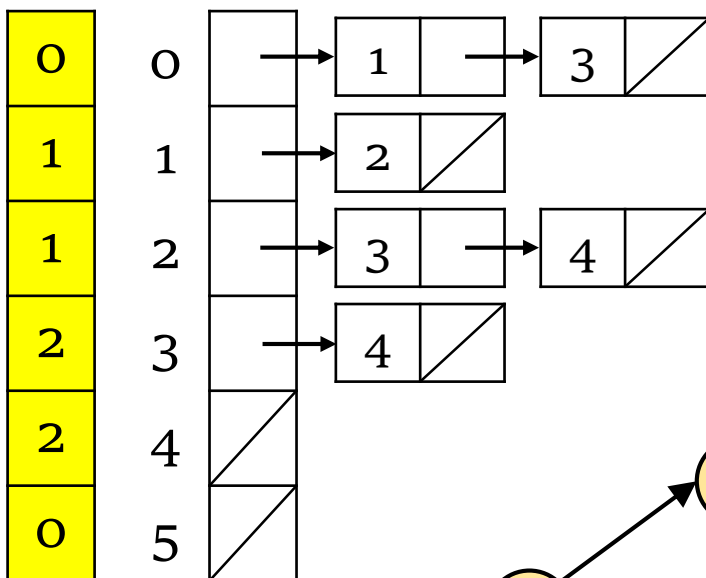
In-Degree array; or add a field to vertex array



Topological Sort Algorithm Implementation

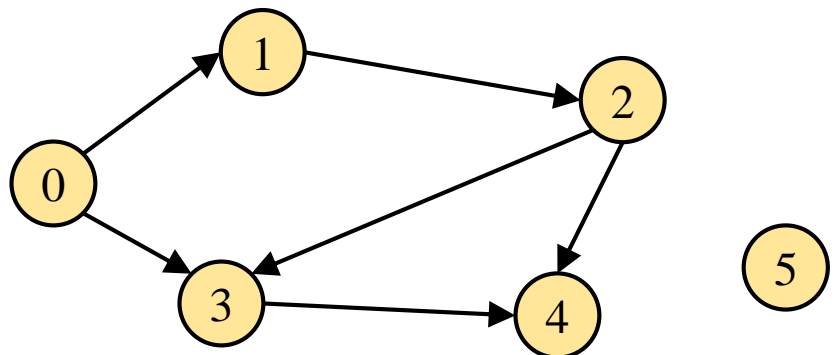
- Maintaining Degree 0 Vertices

- **Key idea:** Initialize and maintain a queue (or stack) of vertices with In-Degree 0



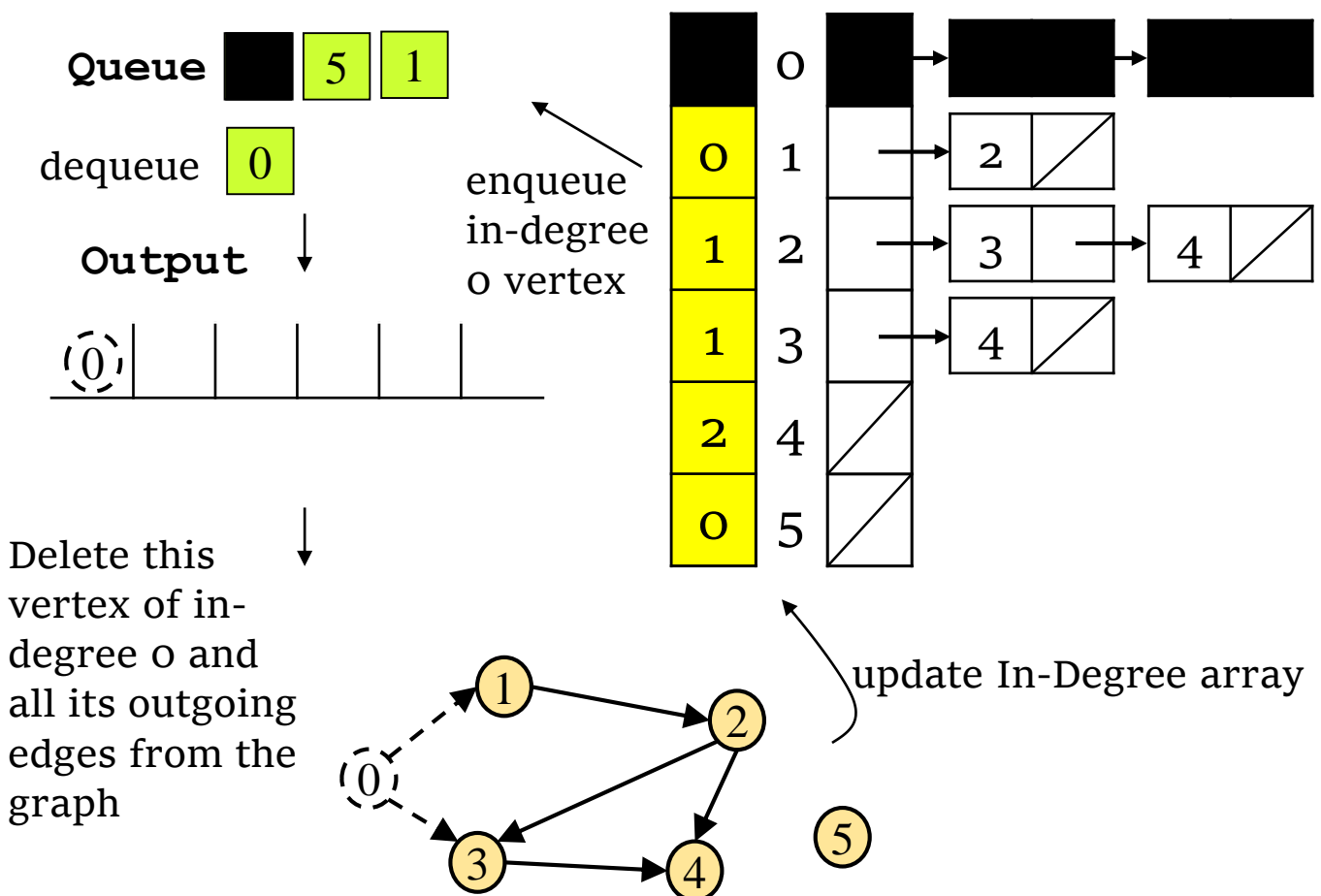
③ enqueue the vertices with In-Degree 0

Queue 0 5



Topological Sort Algorithm Implementation

- ④ dequeue vertex from queue to output;
 update In-Degree array;
 enqueue any vertex whose In-Degree becomes zero.



Topological Sort Algorithm

1. Store each vertex's In-Degree in an array D
2. Initialize queue with all “in-degree=0” vertices
3. While there are vertices remaining in the queue:
 - (a) Dequeue and output a vertex
 - (b) Reduce In-Degree of all vertices adjacent to it by 1
 - (c) Enqueue any of these vertices whose In-Degree became zero
4. If all vertices are output then success, otherwise there is a cycle.

Topological Sort

//Queue-based topological sort

```
void topsort(Graph* G, Queue<int>* Q) {
    int InDgree[G->n()]; //the size is the number of vertices
    int v, w;
    for (v=0; v<G->n(); v++) InDgree[v] = 0; //initialize

    //compute indgree for every vertex
    for (v=0; v<G->n(); v++) // Process every edge
        for (w=G->first(v); w<G->n(); w=G->next(v,w))
            InDgree [w]++; // Add to w's InDgree

    for (v=0; v<G->n(); v++) // Initialize Queue Q
        if (InDgree[v] == 0) // enqueue v with no prerequisites
            Q->enqueue(v);

    while (Q->length() != 0) { //process vertices in Q
        v = Q->dequeue();
        printout(v); // output v

        for (w=G->first(v); w<G->n(); w=G->next(v,w)) {
            InDgree[w]--; // One less prerequisite
            if (InDgree[w] == 0) //vertex v is now free
                Q->enqueue(w);
        }
    }
}
```

breadth-first

Topological Sort Analysis

- Initialize In-Degree array: $O(|V| + |E|)$
- Initialize Queue with In-Degree 0 vertices: $O(|V|)$
- Dequeue and output vertex:
 - $|V|$ vertices, each takes only $O(1)$ to dequeue and output: $O(|V|)$
- Reduce In-Degree of all vertices adjacent to a vertex and Enqueue any In-Degree 0 vertices:
 - $O(|E|)$
- For input graph $G=(V,E)$ run time = $O(|V| + |E|)$
 - **Linear time!**

Another Topological Sort Algorithm

- Topological Sort using a depth-first strategy
 - When a vertex is visited, do nothing
 - When the recursion pops back to that vertex, print the vertex
 - A topological sort is printed **in reversed order**.

```
void topsort(Graph* G) {
    int i;
    for (i=0; i<G->n(); i++) // Initialize Mark
        G->setMark(i, UNVISITED);
    for (i=0; i<G->n(); i++) // Process vertices
        if (G->getMark(i) == UNVISITED)
            tophelp(G, i);    // Call helper
}

void tophelp(Graph* G, int v) { // Process v
    G->setMark(v, VISITED);
    for (int w=G->first(v); w<G->n(); w=G->next(v,w))
        if (G->getMark(w) == UNVISITED)
            tophelp(G, w);
    printout(v); // output v
}
```

DFS, BFS and Topological Sort

- Depth-first search (DFS)
 - For both **directed** and **undirected** graphs
 - It is implemented using a **stack or recursion**
- Breadth-first search (BFS)
 - For both **directed** and **undirected** graphs
 - It is implemented using a **queue**
- Topological sort
 - For **directed acyclic** graphs (DAG)
 - It is implemented using **DFS** or a **queue-based** method

Homework 7-1

- Textbook Exercises 9.1