

# Graph Algorithms

CS 202 – Fundamental Structures of  
Computer Science II

Bilkent University

Computer Engineering Department

## Motivation

- We will now see how several problems in Graph Theory can be modeled and solved using Graph algorithms
- Many real life problems can be modeled with graphs
- We will give algorithms that solve some common graph problems
- We will see how choice of data structures is important in increasing the performance of algorithms

## Definitions

A *graph*  $G = (V, E)$  consists of a set of *vertices*,  $V$ , and a set of *edges*,  $E$ .

Each edge is a *pair*  $(u, w)$ , where  $u, w \in V$ .

Edges are also called as *arcs*

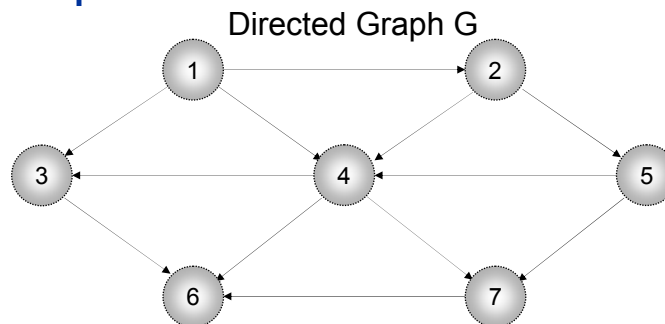
If the pair is ordered, then the graph is *directed* (*digraph*), otherwise it is *undirected* graph.

Vertex  $w$  is *adjacent* to  $v$  if and only if  $(v, w) \in E$ .

In an undirected graph with edge  $(v, w)$ , and hence  $(w, v)$ ,  $w$  is adjacent to  $v$ , and  $v$  is adjacent to  $w$ .

An edge may have a third component which is called *weight* or *cost*.

## Example



$G = (V, E)$   
 $V = \{1, 2, 3, 4, 5, 6, 7\}$   
 $E = \{(1, 2), (1, 3), (1, 4), (2, 5), (3, 6), (4, 3), (4, 6), (4, 7), (5, 4), (5, 7), (7, 6)\}$   
3 is *adjacent* to 1, but 1 is not adjacent to 3.

## Definitions

A *path* in a graph is a sequence of vertices  $w_1, w_2, \dots, w_N$ , such that  $(w_i, w_{i+1}) \in E$  for  $1 \leq i < N$ .

The *length* of such a path is the number of edges on the path, which is equal to  $N - 1$ .

There can be a path from a vertex to itself. If this path contains no edges, then the path length is 0.

If a graph contains a path from a vertex  $v$  to itself, then we say that the graph contains a *loop*.

A *simple path* is a path that all vertices are distinct, except that the first and last vertex could be the same.

A *cycle* in a directed graph is a path of length at least 1 such that  $w_1 = w_N$ . For undirected graphs, we require that the edges are distinct.

A directed graph is *acyclic* if it has no cycles. Such a graph is also referred to as *DAG*.

An undirected graph is *connected* if there is a path from every vertex to every other vertex.

If such a graph is directed, then it is said that it is *strongly connected*.

If a directed graph is not strongly connected, but the underlying graph (without directions) is connected, then the graph is said to be *weakly connected*.

A *complete graph* is a graph in which there is an edge between every pair of vertices.

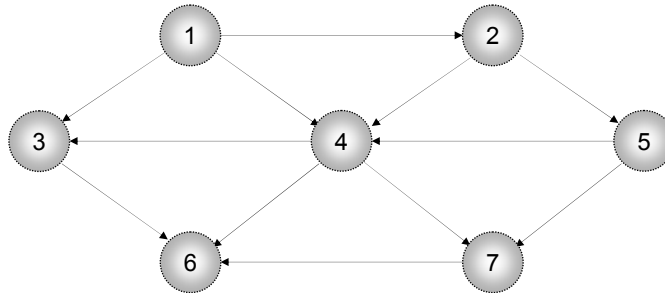
## Representation of Graphs

- We will consider representation of directed graphs. Undirected graphs are similarly represented.
- Support we number the vertices, starting from one.
- There are two methods
  1. *Adjacency matrix* representation
  2. *Adjacency list* representation

## Some Common Graph Problems and Algorithms

- Topological Sort
- Shortest-Path Algorithms
- Network Flow Problems
- Minimum Spanning Tree
- Depth First Search and Applications

## Representation of Graphs



- We will represent the graph above as an example.

## Adjacency Matrix Representation

- Use a two-dimensional array  $A$ .
- For each edge  $(u,v)$ , set  $A[u][v]$  to true, otherwise to false.
- If the edge has a weight (cost) associated with it then we set the  $A[u][v]$  equal to the weight.
  - Use a very large or very small weight as a *sentinel* to indicate nonexistent edges.
- Space requirement  $O(|V|^2)$
- Good if the graph is *dense*.

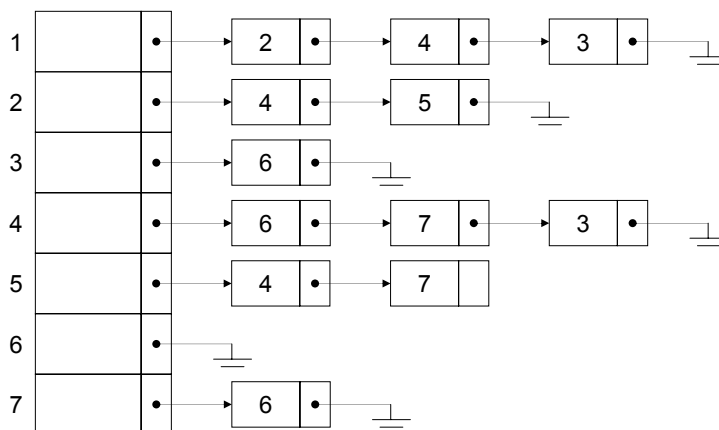
## Adjacency Matrix Representation

	1	2	3	4	5	6	7
1	0	1	1	1	0	0	0
2	0	0	0	1	1	0	0
3	0	0	0	0	0	1	0
4	0	0	1	0	0	1	1
5	0	0	0	1	0	0	1
6	0	0	0	0	0	0	0
7	0	0	0	0	0	1	0

## Adjacency List Representation

- For each vertex, keep a list of all adjacent vertices.
- Space requirement is  $O(|E| + |V|)$ 
  - Linear in the size of the graph.
- Standard way to represent graphs
- Undirected graphs can be similarly represented; each edge  $(u,v)$  appears in two lists.
  - Space usage doubles.

## Adjacency List Representation



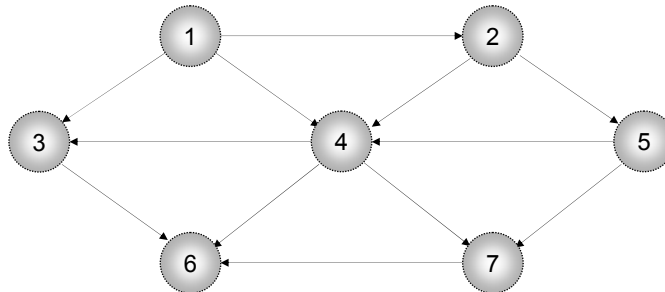
## Some Common Graph Problems and Algorithms

- Topological Sort
- Shortest-Path Algorithms
- Network Flow Problems
- Minimum Spanning Tree
- Depth First Search and Applications

## Topological Sort

- A *topological sort* is an ordering of vertices in a directed acyclic graph, such that *if there is a path from  $v_i$  to  $v_j$ , then  $v_j$  appears after  $v_i$  in ordering*.
  - A topological ordering is not possible if the graph contains cycles, since for two vertices  $v$  and  $w$  on a cycle,  $v$  precedes  $w$  and  $w$  precedes  $v$ .
- Ordering is not necessarily unique.
  - $v_1, v_2, v_5, v_4, v_3, v_7, v_6$  (one ordering)
  - $v_1, v_2, v_5, v_4, v_7, v_3, v_6$  (an other ordering)

## Topological Ordering



*A topological ordering*



*An other topological ordering*





## Topological Sort Algorithm Sketch

- 1. Find a vertex,  $v$ , with no incoming edges.
- 2. Print this vertex  $v$ ; and remove it, along with all its edges, from the graph.
- 3. Repeat steps 1 and 2 until graph is empty.

## Topological Sort Algorithm - Formally

- **Definition:**
  - Indegree of a vertex  $v$  is the number of edges in the form  $(u,v)$ .
- **Algorithm:**
  - Compute the indegrees of all vertices in the graph.
  - Read the graph into an adjacency list.
  - Apply the algorithm in the previous slide.

## Topological Sort Algorithm - Formally

```
void
Graph::topsort()
{
    Vertex v; // vertex, v, that has indegree equal to 0
    Vertex w; // vertex adjacent to v
    int counter; // keeps the topological order number: 0,1,2,...

    for (counter = 0; counter < NUM_VERTICES; counter++)
    {
        v = findNewVertexOfDegreeZero(); // O(N)
        if (v == NOT_A_VERTEX)
            throw CycleFound();
        v.topNum = counter; // index in topological order
        for each w adjacent to v
            w.indegree--;
    }
}
```

- Running time =  $O(|V|^2)$

## More efficient algorithm

- Keep the vertices which have indegree equal to zero in a separate *box* (stack or queue).
  - 1. Start with an empty box.
  - 2. Scan all the vertices in the graph
  - 3. Put vertices that have indegree equal to zero into the box.
  - 4. While the box (queue) is not empty
    - 4.1. Remove head of queue: vertex *v*.
    - 4.2. Print *v*
    - 4.3. Decrease the indegrees of all the vertices adjacent to *v* by one.
    - 4.4. Go to step 4.

**Indegrees**

$v_1$	0
$v_2$	1
$v_3$	2
$v_4$	3
$v_5$	1
$v_6$	3
$v_7$	2

*After Enqueue*

$v_1$
....

*After Dequeue*

....

*Print*  
 $v_1$

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**Updated Indegrees**

$v_1$	0
$v_2$	0
$v_3$	1
$v_4$	2
$v_5$	1
$v_6$	3
$v_7$	2

*After Enqueue*

$v_2$
....

*After Dequeue*

....

*Print*  
 $v_2$

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**Updated Indegrees**

v <sub>1</sub>	0
v <sub>2</sub>	0
v <sub>3</sub>	1
v <sub>4</sub>	1
v <sub>5</sub>	0
v <sub>6</sub>	3
v <sub>7</sub>	2

*After Enqueue*

v <sub>5</sub>
....

*After Dequeue*

....

*Print*  
v<sub>5</sub>

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**Updated Indegrees**

v <sub>1</sub>	0
v <sub>2</sub>	0
v <sub>3</sub>	1
v <sub>4</sub>	0
v <sub>5</sub>	0
v <sub>6</sub>	3
v <sub>7</sub>	1

*After Enqueue*

v <sub>4</sub>
....

*After Dequeue*

....

*Print*  
v<sub>4</sub>

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**Updated Indegrees**

$v_1$	0
$v_2$	0
$v_3$	0
$v_4$	0
$v_5$	0
$v_6$	2
$v_7$	0

**After Enqueue**

$v_3$
$v_7$
....

**After Dequeue**

$v_7$
....

**Print**  
 $v_3$

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**Updated Indegrees**

$v_1$	0
$v_2$	0
$v_3$	0
$v_4$	0
$v_5$	0
$v_6$	1
$v_7$	0

**After Enqueue**

$v_7$
....

**After Dequeue**

....

**Print**  
 $v_3$

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Updated Indegrees

v <sub>1</sub>	0
v <sub>2</sub>	0
v <sub>3</sub>	0
v <sub>4</sub>	0
v <sub>5</sub>	0
v <sub>6</sub>	0
v <sub>7</sub>	0

After Enqueue: [v<sub>6</sub>, ..., ]

After Dequeue: [ , ..., ]

Print: v<sub>6</sub>

**Finished! Result: 1,2,5,4,3,7,6**

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```

void Graph::topsort()
{
    Queue q(NUM_VERTICES);
    int counter = 0; //topological order of a vertex:1,2,3,...,NUM_VERTICES
    Vertex v, w;

    q.makeEmpty();
    for each vertex v
        if (v.indegree == 0)
            q.enqueue(v);
    while (!q.isEmpty())
    {
        v = q.dequeue();
        v.topNum = ++counter;

        for each w adjacent to v
            if (--w.indegree == 0)
                q.enqueue(w);
    }
    if (counter != NUM_VERTICES)
        throw CycleFound();
}

```

*Pseudocode of Efficient Topological Sort Algorithm*

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