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# Graphs

CSC-114 Data Structure and Algorithms



# Outline

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## Non-Linear Data Structures

### Graphs

- Intro

- Application

- Terminologies

- Representation

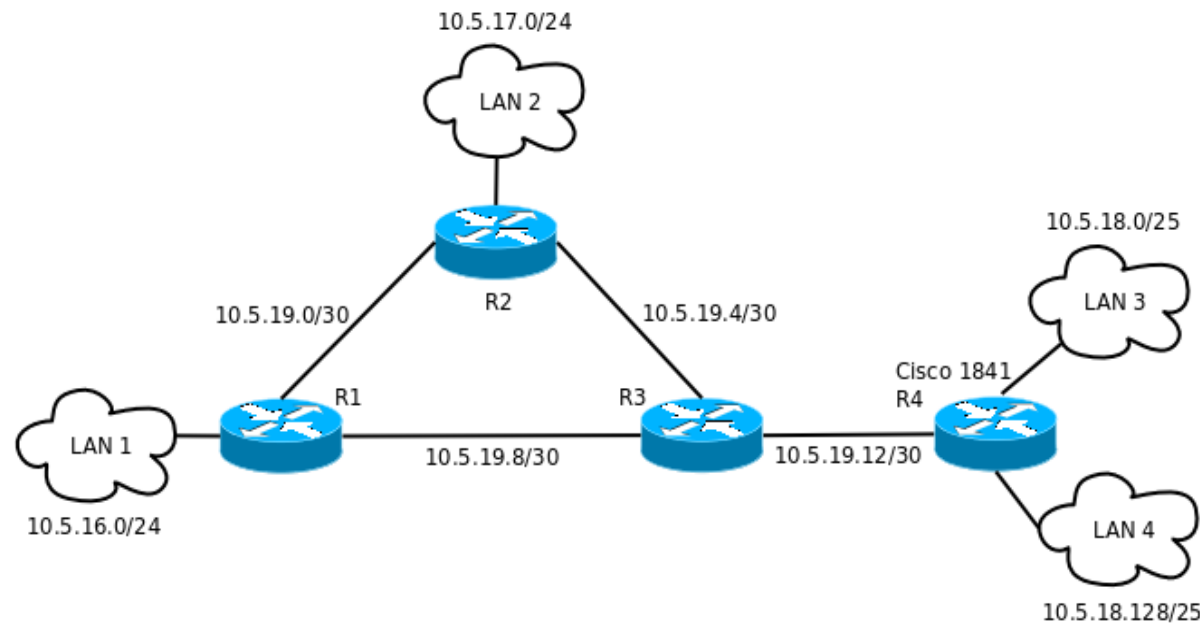
  - Adjacency List

  - Adjacency Matrix



# Graph

A graph is a way of representing relationships between pairs of objects.  
It is a set of objects, called vertices, together with a collection of pairwise connections between them, called edges





# Graph

Graph is a mathematical structure that is defined as  $G = (V, E)$ , where  $V$  is a set of vertices  $\{v_1, v_2, \dots, v_n\}$  and  $E$  is a set of edges  $\{e_1, e_2, e_3, \dots, e_m\}$

Where edge  $e$  is an ordered pair of two vertices, represents a connection between two vertices

Graph can be directed, or undirected

Example:

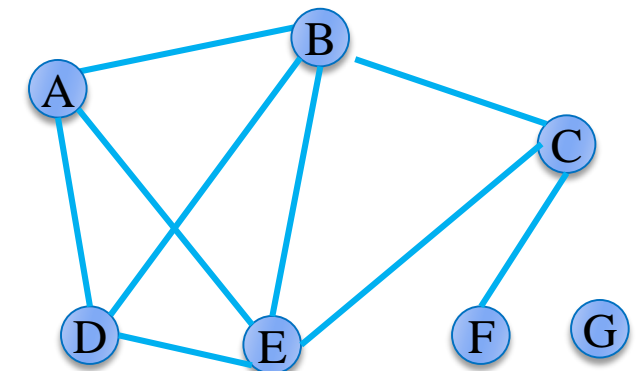
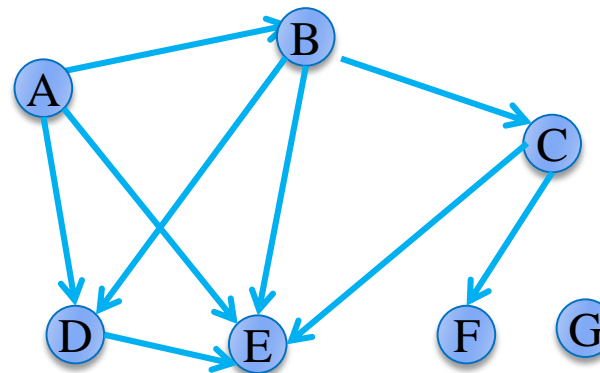
$$V = \{A, B, C, D, E, F, G\}$$

$$E = \{ \{A, B\}, \{A, D\}, \{A, E\}, \{B, C\}, \{B, D\}, \{B, E\}, \{C, E\}, \{C, F\}, \{D, E\} \}$$

Then the graph  $G=(V,E)$  is:

$$|V| = 7$$

$$|E| = 9$$



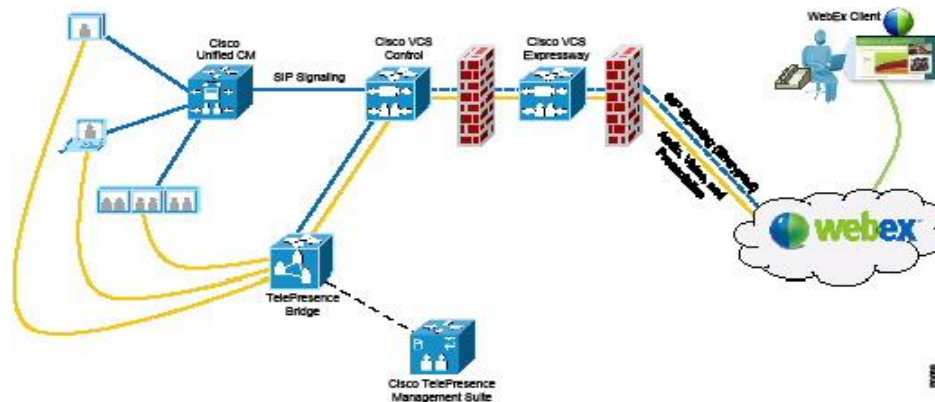


# Applications

## Maps



## Communication Networks



## Social networks





# Applications

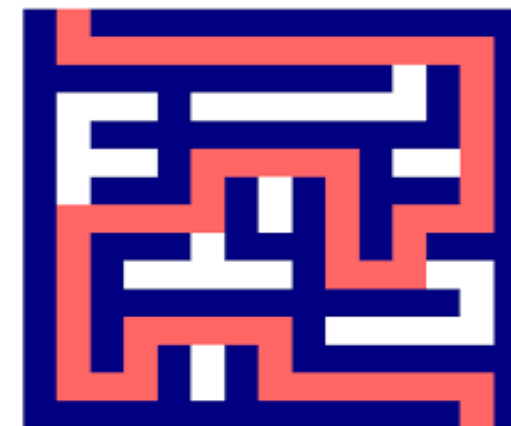
## Flight routes



## Web graphs



## Maze (games)



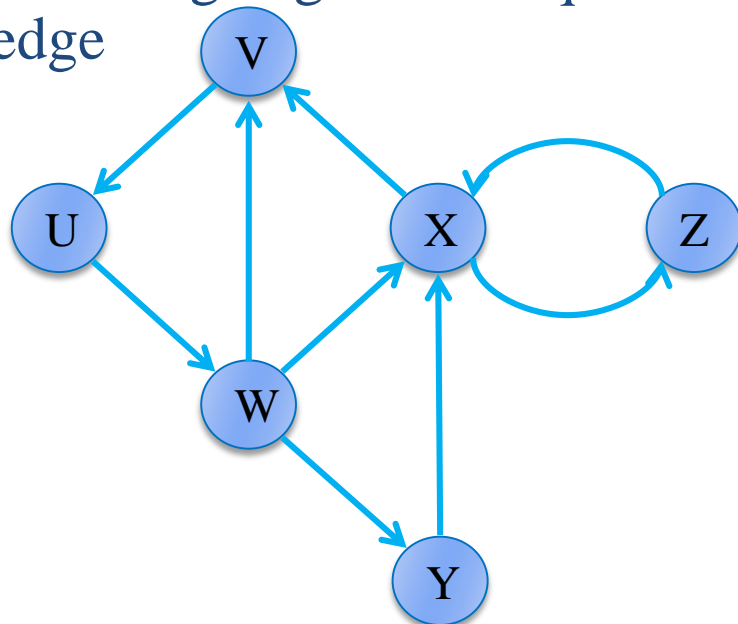


# Terminologies

## Directed Graph

Also called digraph

Every edge has a direction, an incoming edge is not equal to outgoing edge

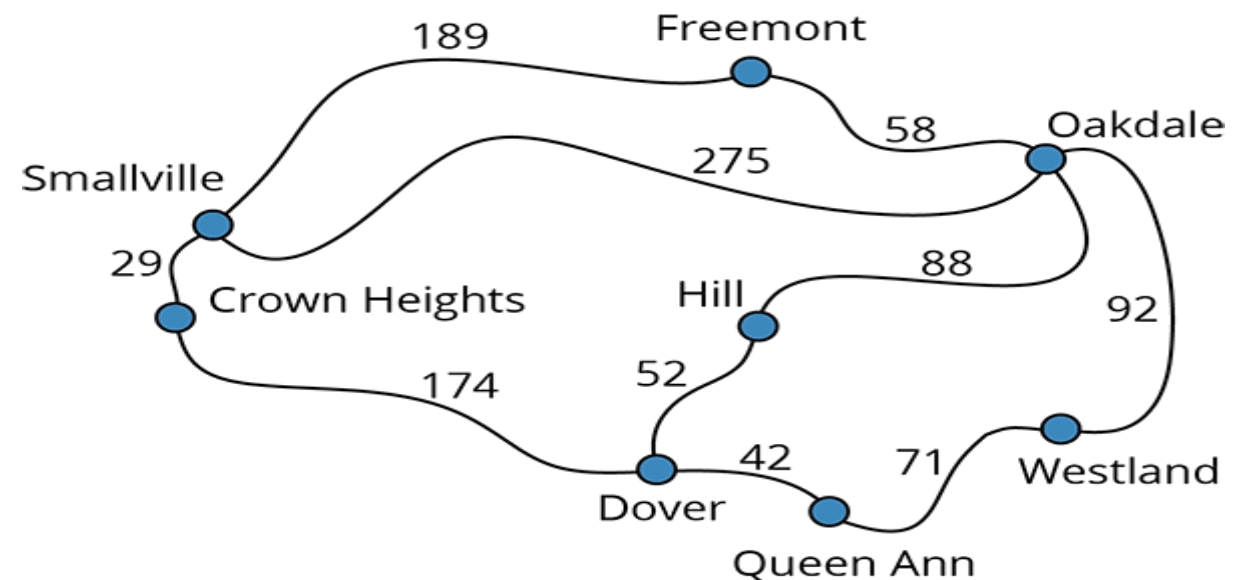


Vertex order is important

## Un-Directed Graph

Edge has no direction and considered as two-ways

Vertex order is not important





# Terminologies

## End Points

Vertices at both ends of an edge

## Incident Edge

If vertex is an end point of edge, edge is incident on that vertex

a is incident on u and v

## Adjacent/Neighbor Vertices

Vertices that are end points of same edge

u, v and w are adjacent

## Self Loop

Node connected to itself

Z is in self loop and j is self edge

## Degree of Node

Number of incident edges

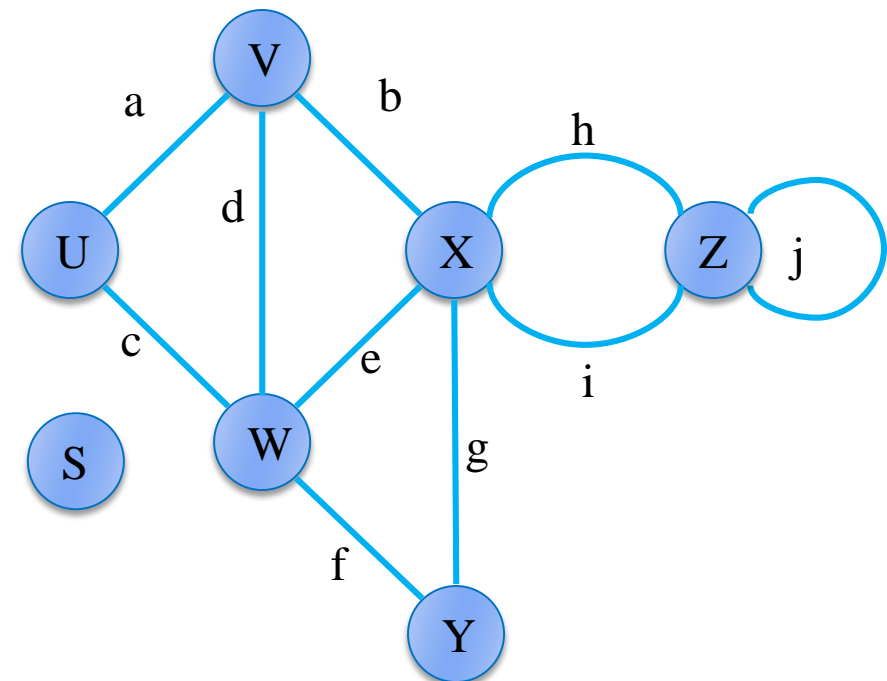
U has degree 2, X has degree 5

Self edge is considered twice, so z has degree 4

## Parallel Edges

Edges with same end points

h and i are parallel edges







# Terminologies

In a directed graph we can distinguish between

## Incoming Edges

Directed edges for which the given vertex is destination  
c is incoming edge of U

## Outgoing Edges

Directed edges for which the given vertex is origin  
a is outgoing edge of U

## ▶ In-Degree of Vertex

Number of incoming edges

## ▶ Out-Degree of Vertex

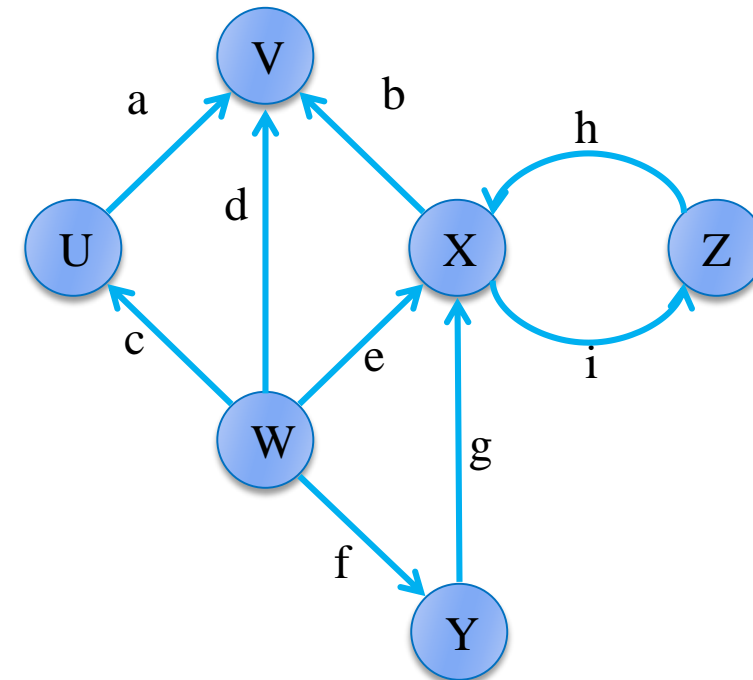
Number of outgoing edges

## ▶ Source Vertices

Vertices with an in-degree of zero  
w is source vertex

## Sink Vertices

Vertices with an out-degree of zero  
v is sink vertex

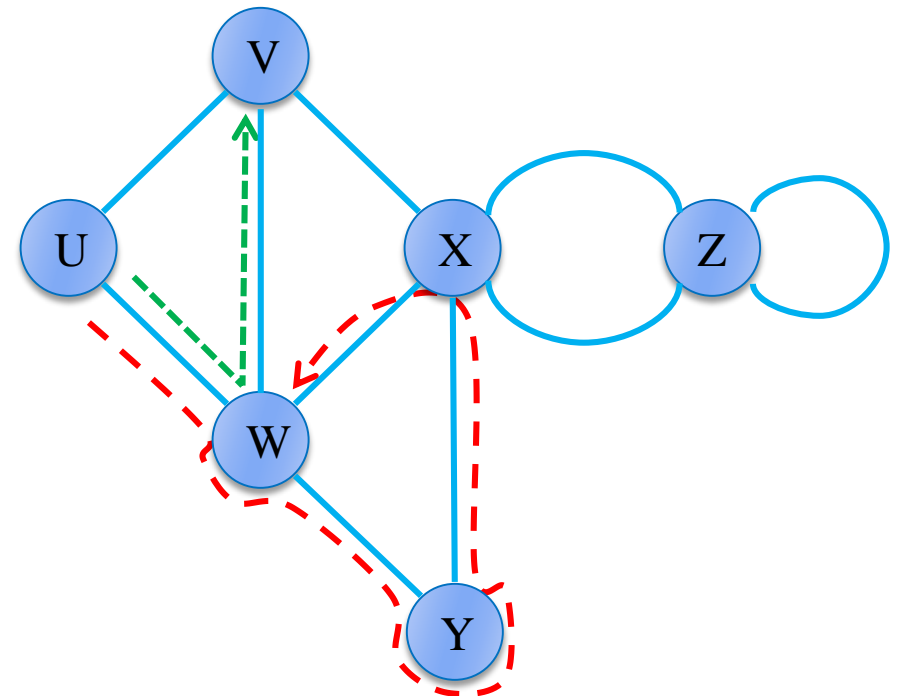
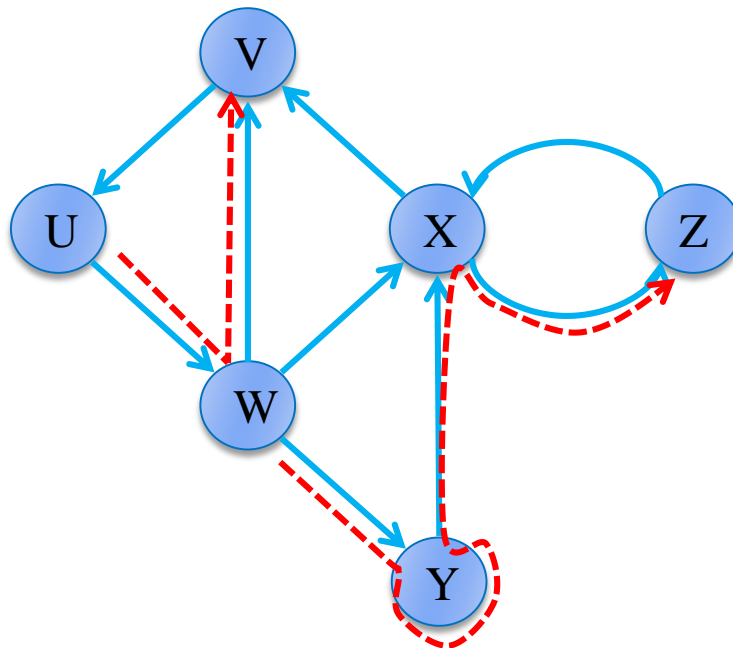




# Terminologies

## Path

A path between two vertices is sequence of alternating vertices and edges, where each successive vertex is connected.





# Terminologies

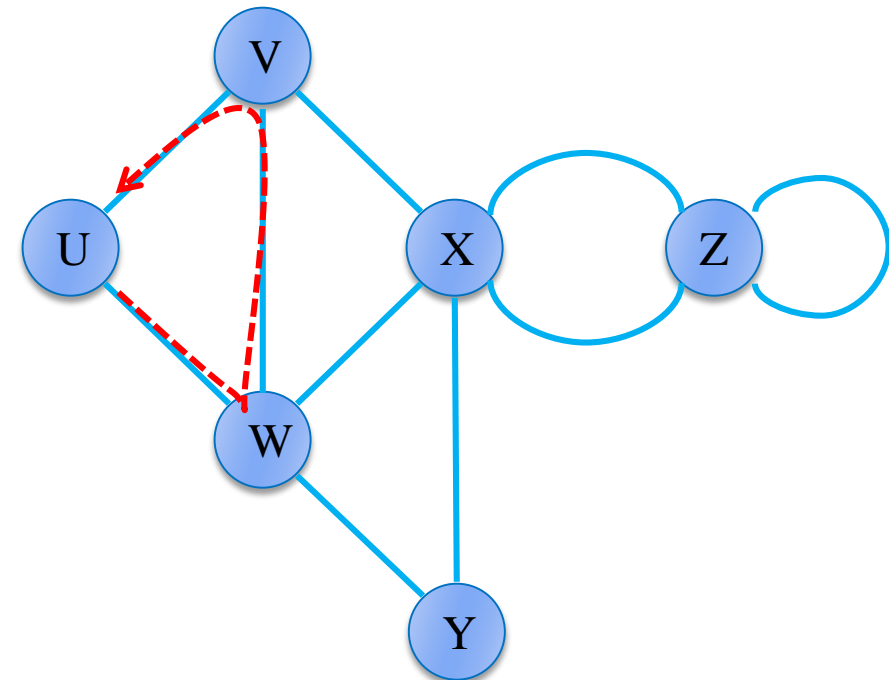
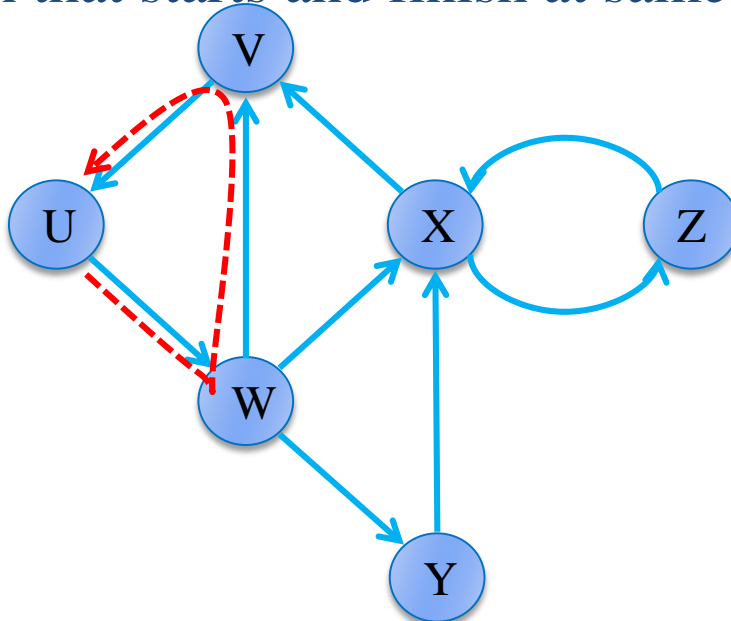
## Simple Path

A path with distinct nodes

One of the possible paths from u to v is u-w-v

## Cycle

A path that starts and finish at same vertex



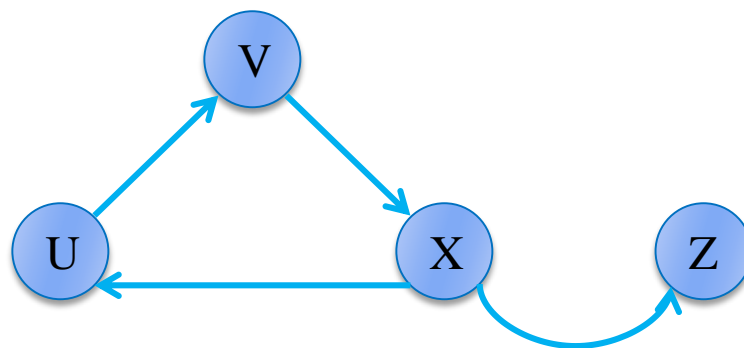


# Terminologies

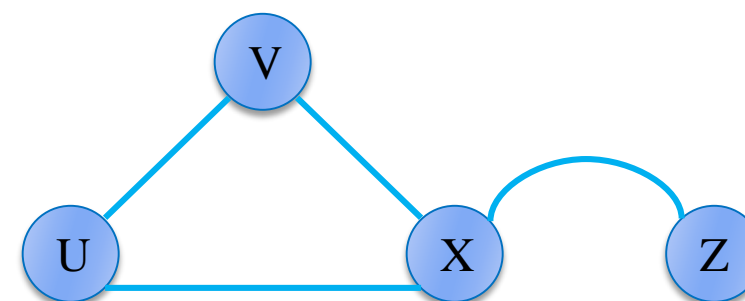
## Reachability of Vertex

A vertex is  $v$  reachable from other vertex if there exists a path from other vertex to vertex  $v$

In undirected graph, edge is considered as 2-ways, so every vertex is reachable in following example.



U , V and X are not reachable from Z



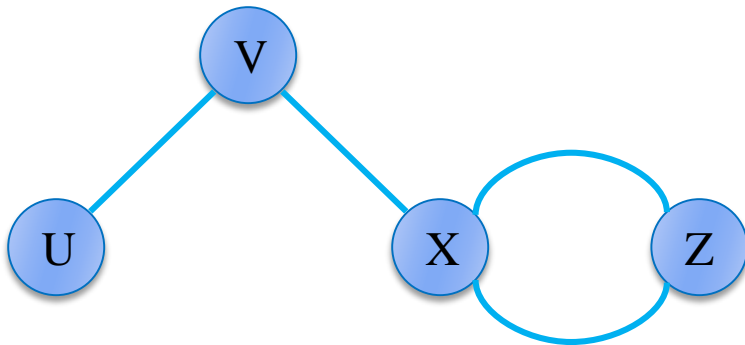
all vertices are reachable from each other



# Terminologies

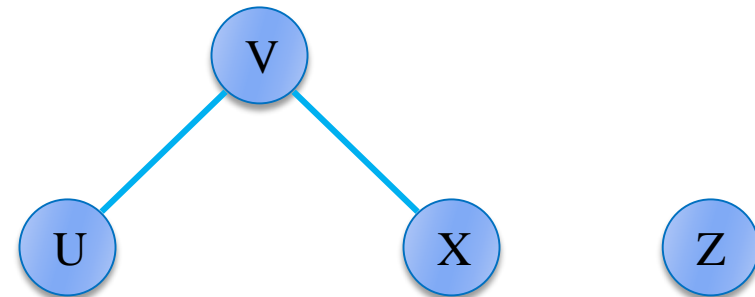
## Connected Graph

Each vertex is reachable from every other vertex, in other words there exists a path from each vertex to every other vertex



## Disconnected Graph

A graph that is not connected

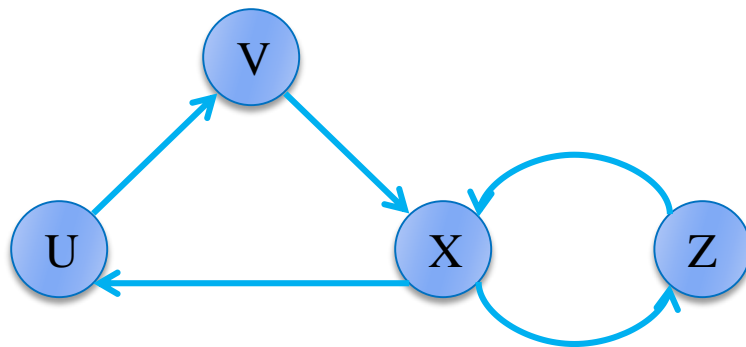




# Terminologies

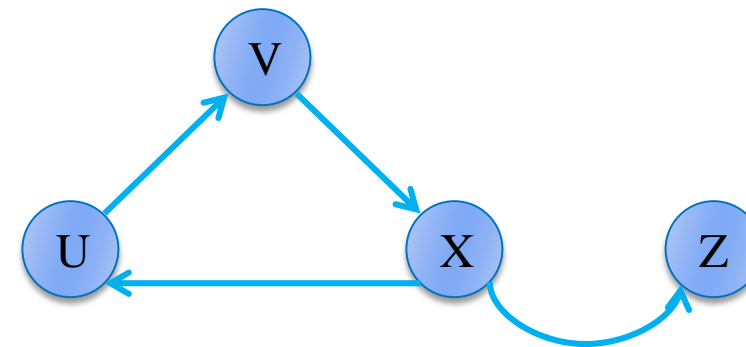
## Strongly Connected Graph

If there exists a directed path between each pair of vertices



## Weakly Connected Graph

If there exists a path between each pair of vertices which ignores direction



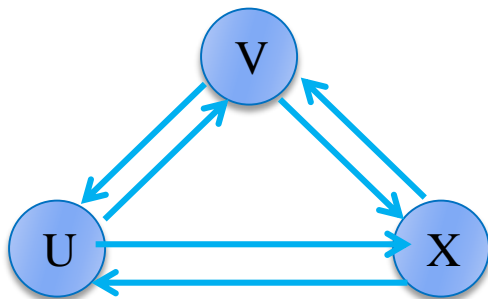


# Terminologies

## Completely Connected Graph

If there exists an edge between each pair of vertices

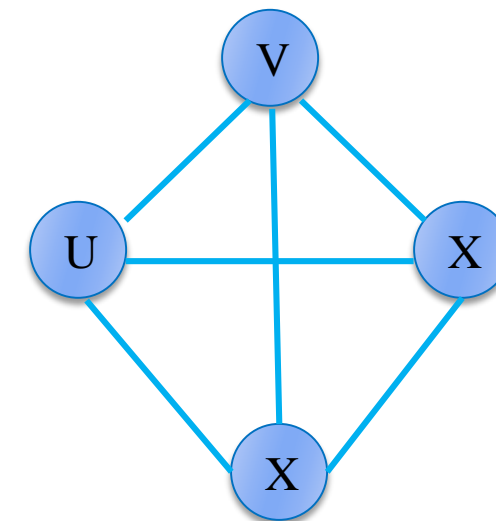
Directed



Maximum Edges?

$$|E| = |V| * |V-1| = O(|V|^2)$$

Undirected



Maximum Edges

$$|E| = |V| * |V-1| / 2 = O(|V|^2)$$

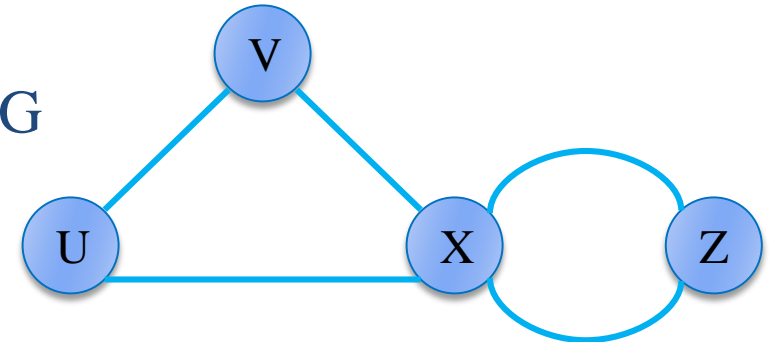
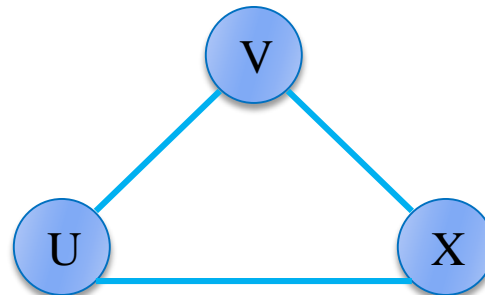
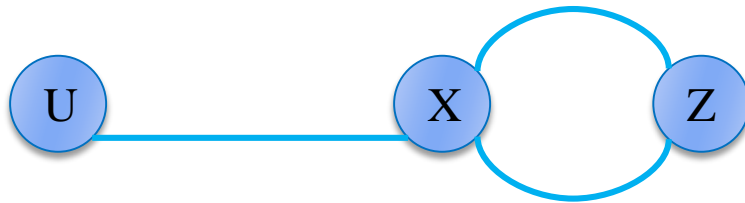


# Terminologies

## Sub Graph

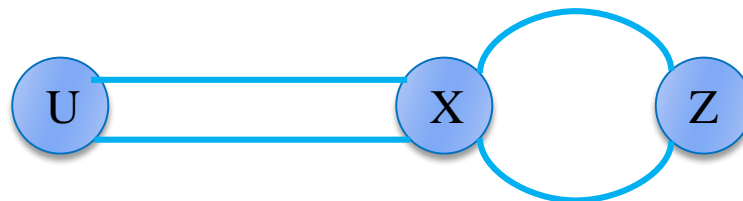
A graph that consists of subset of vertices and edges of  $G$

Two possible sub-graphs



Following is not valid sub-graph of  $G$ , why?

Look at definition of sub-graph





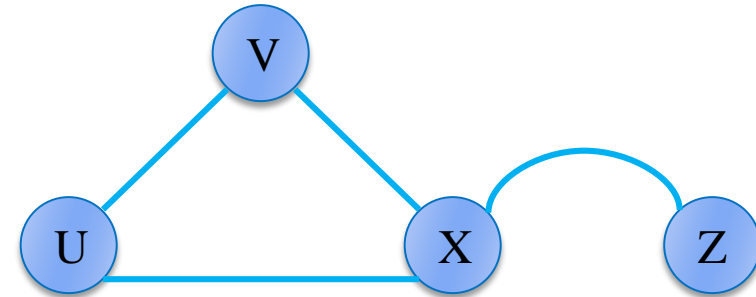


# Terminologies

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## Simple Graph

A graph with no parallel and self edges





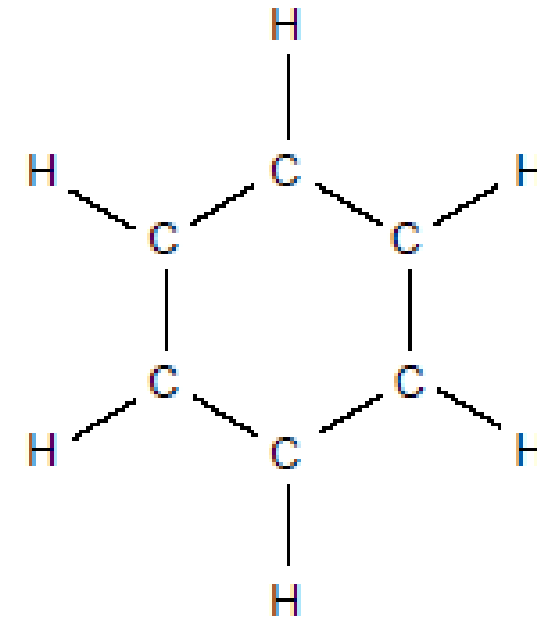
# Terminologies

## Weighted Graph

Weights on edge means cost or distance  
between end points of edge



## Non-Weighted Graph



Benzene molecule



# Terminologies

## Path Length

Sum of weights of edges on path from one vertex to other.

Length of path between u and w is 2

Length of path between u and y is 3

There are two paths from u to x

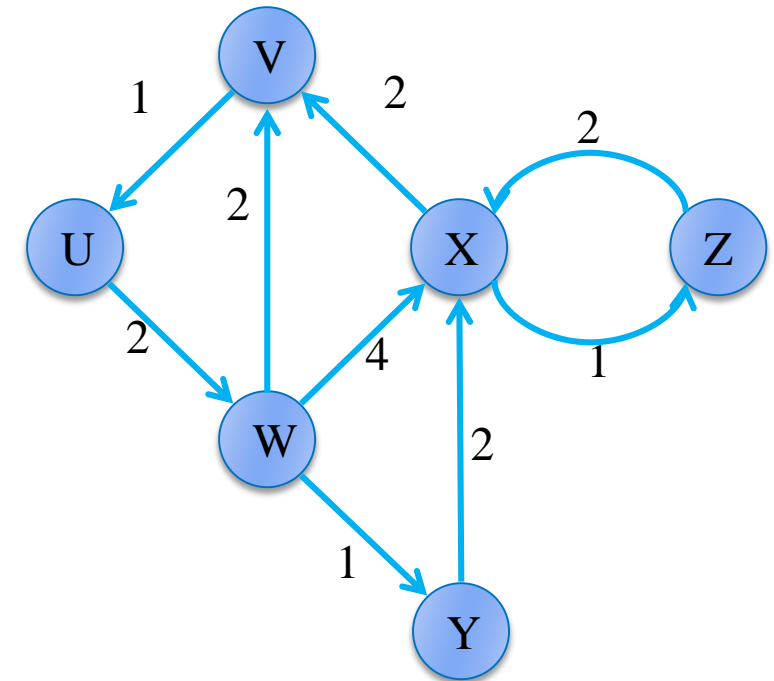
Path u-w-x has length 6 and path u-w-y-x has length 5

## Shortest Path

Path with minimum length

From u to x is 5

From u to v is 4





# Terminologies

## Tree

An undirected graph  $G$  is tree if it fulfills any of the following condition:

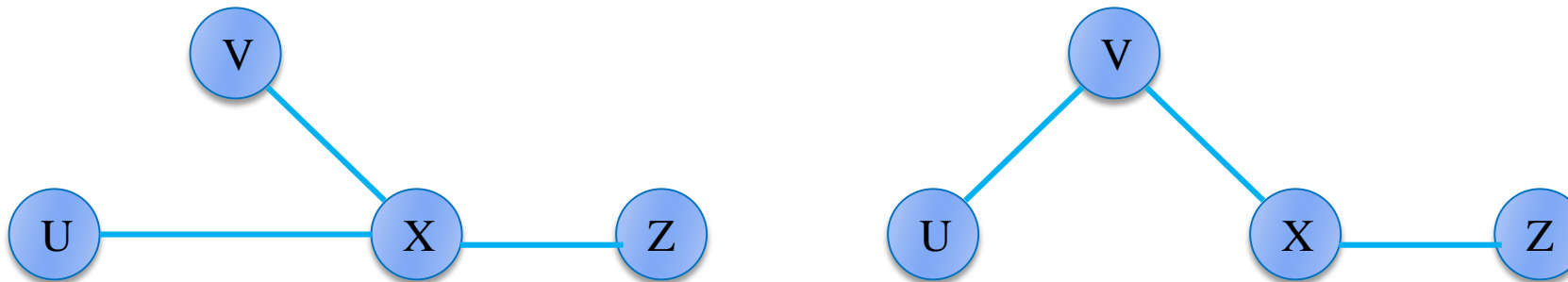
$G$  has  $V-1$  edges and no cycles

$G$  has  $V-1$  edges and is connected

$G$  is connected, but removing any edge disconnects it

$G$  is acyclic, but adding any edges creates a cycle

Exactly one simple path between each pair of vertices in  $G$

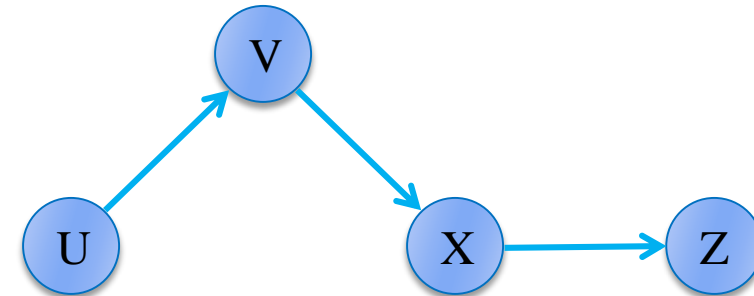




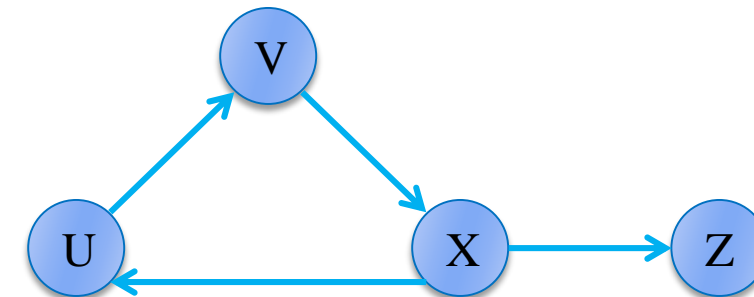
# Terminologies

## Directed Acyclic Graph (DAG)

Directed graph without cycles



Following graph is not DAG, as it contains a cycle

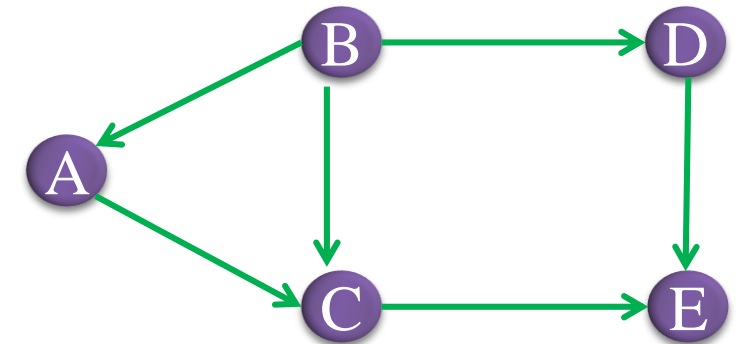




# Terminologies

## Directed Acyclic Graph (DAG)

A directed graph without cycles



### Applications:

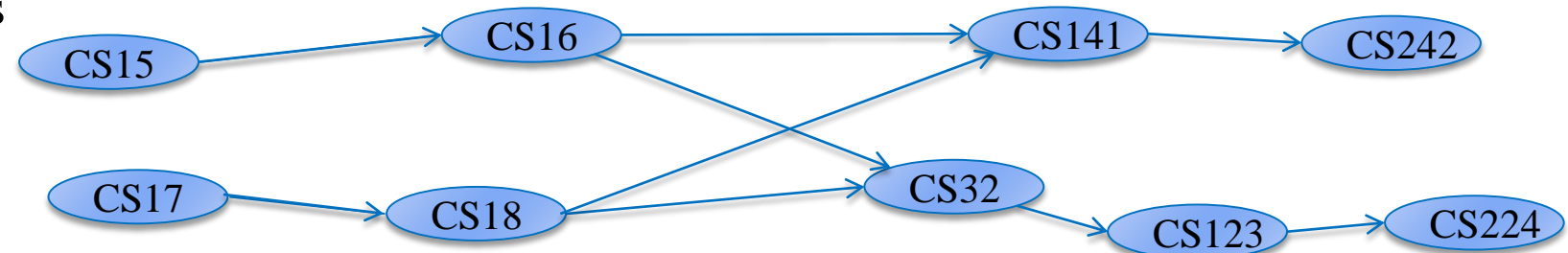
The parse tree constructed by a compiler to execute sequential statements

Dependency graphs for task scheduling

Dependency graphs between classes formed by inheritance relationships in object-oriented programming languages

Information categorization systems, such as folders in a computer

Course pre-requisites





# Graph ADT

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Common methods for Graph ADT can be:

- numVertices()
- vertices()
- numEdges()
- edges()
- outgoingEdges(v)
- incomingEdges(v)
- getEdge(v1, v2)
- endVertices(e)
- opposite(v, e)
- insertVertex(value)
- insertEdge(v1, v2, value)
- removeVertex(v)
- removeEdge(e)

Run time depends upon underlying implementation



# Memory Representation

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There are multiple ways to represent a graph in memory:

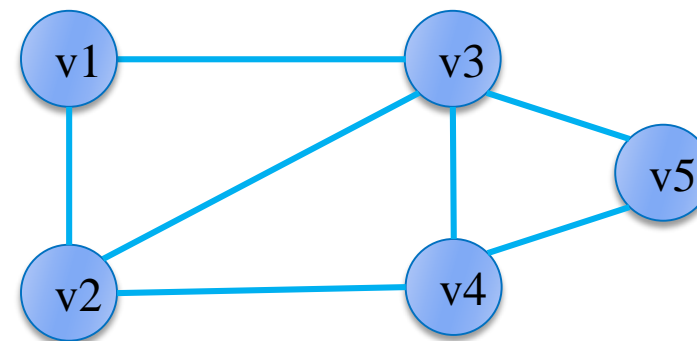
Adjacency Matrix

Adjacency List

Edge List

Adjacency Map

Assume following example for all representations







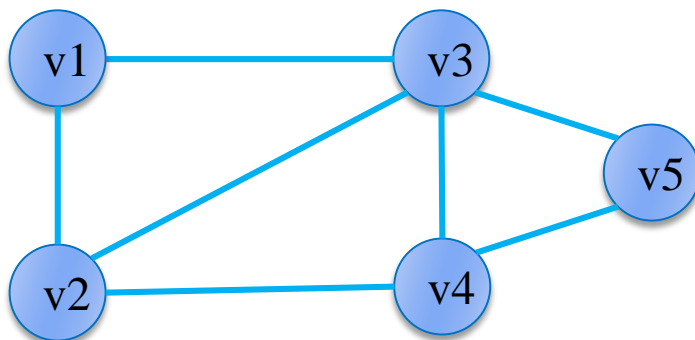
# Adjacency Matrix

The adjacency matrix of a graph  $G = (V, E)$  is a  $|V| \times |V|$  matrix  $E$ , where each entry  $E_{ij}$  is equal to 1 if there exists an edge  $e = (v_i, v_j) \in E$  and 0 otherwise.

1 and 0 can also be replaced with true/false.

Vertex list itself is stored in 1D array

0	1	2	3	4
"V1"	"V2"	"V3"	"V4"	"V5"



	V1	V2	V3	V4	V5
V1	0	1	1	0	0
V2	1	0	1	1	0
V3	1	1	0	1	1
V4	0	1	1	0	1
V5	0	0	1	1	0

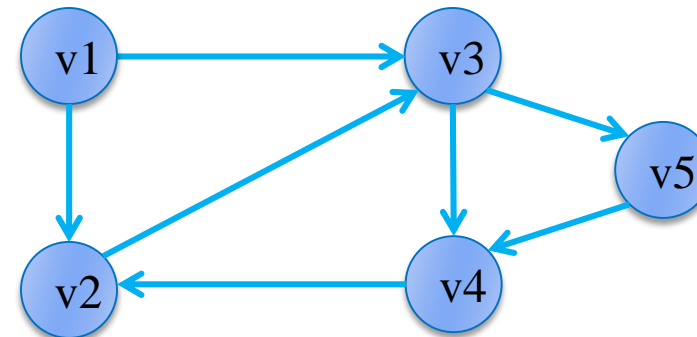


# Adjacency Matrix

If graph is directed?

Then entry  $E_{ij}$  is equal to 1 if there exists an edge  $e = \text{from } v_i \text{ to } v_j$  and 0 otherwise.

	V1	V2	V3	V4	V5
V1	0	1	1	0	0
V2	0	0	1	0	0
V3	0	0	0	1	1
V4	0	1	0	0	0
V5	0	0	0	1	0



Weighted Graph:

1 and 0 are replaced with respective weights

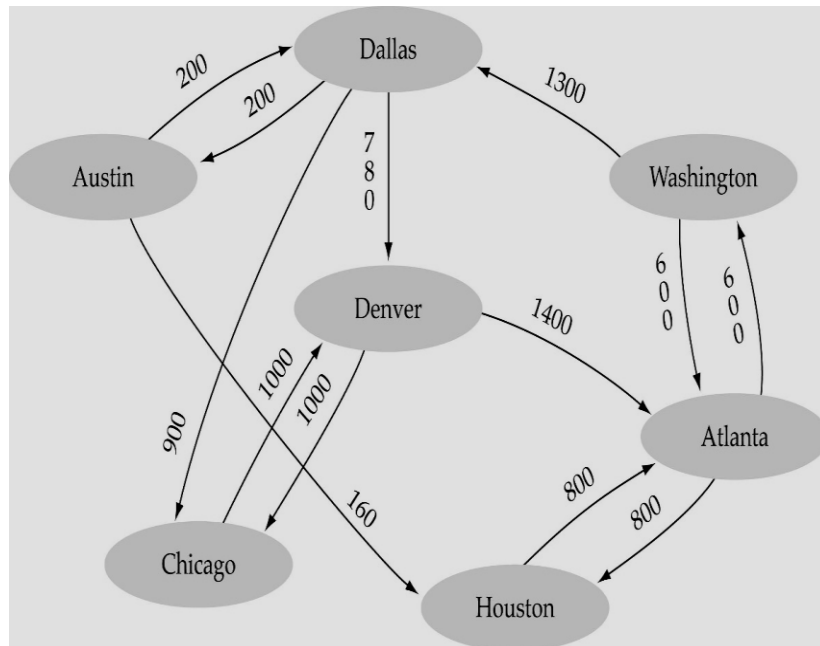
0 or -1 presents no edge

# Example



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graph

.numVertices 7

.vertices

[0]	"Atlanta"	"
[1]	"Austin"	"
[2]	"Chicago"	"
[3]	"Dallas"	"
[4]	"Denver"	"
[5]	"Houston"	"
[6]	"Washington"	"
[7]		
[8]		
[9]		

.edges

[0]	0	0	0	0	0	800	600	•	•	•
[1]	0	0	0	200	0	160	0	•	•	•
[2]	0	0	0	0	1000	0	0	•	•	•
[3]	0	200	900	0	780	0	0	•	•	•
[4]	1400	0	1000	0	0	0	0	•	•	•
[5]	800	0	0	0	0	0	0	•	•	•
[6]	600	0	0	1300	0	0	0	•	•	•
[7]	•	•	•	•	•	•	•	•	•	•
[8]	•	•	•	•	•	•	•	•	•	•
[9]	•	•	•	•	•	•	•	•	•	•
	[0]	[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]	[9]

(Array positions marked '•' are undefined)





# Adjacency Matrix

Vertex list and Edge list are given

Running Time?

- Get a vertex's out-edges

- Get a vertex's in-edges

- Decide if some edge exists

- Insert an edge

- Delete an edge

- Inset a vertex

- Remove a vertex

Memory

- $O(|V|^2)$

Good for?

- Dense graphs

  - Edges are close to  $|V|^2$

0	1	2	3	4
"V1"	"V2"	"V3"	"V4"	"V5"

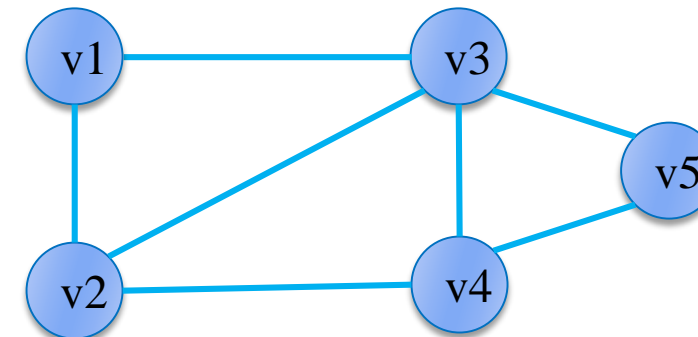
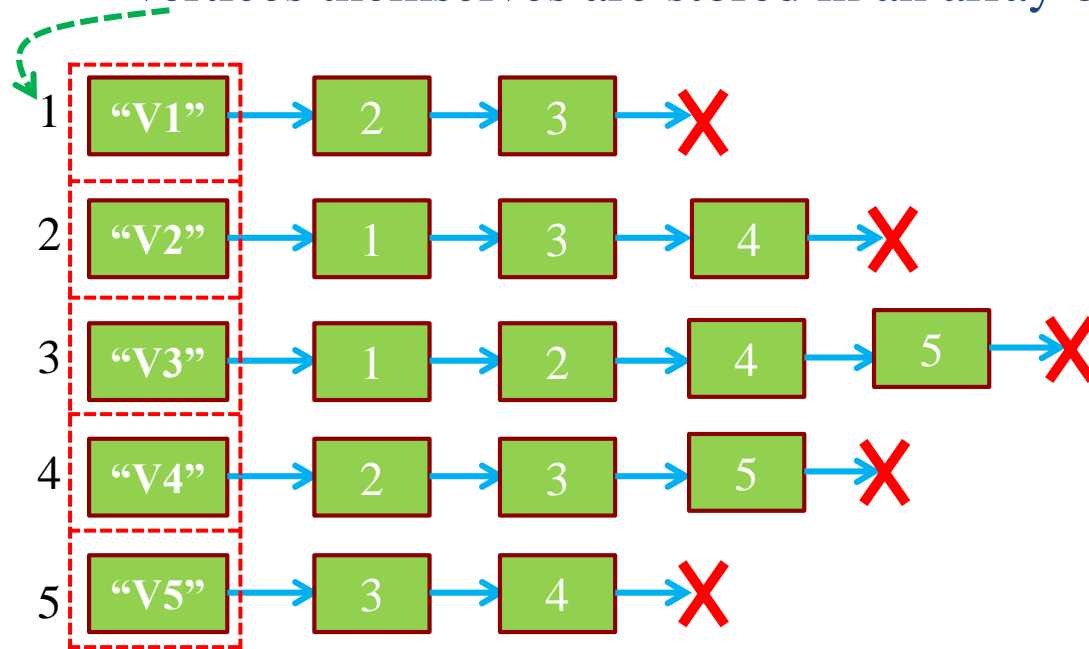
	V1	V2	V3	V4	V5
V1	0	1	1	0	0
V2	0	0	1	0	0
V3	0	0	0	1	1
V4	0	1	0	0	0
V5	0	0	0	1	0



# Adjacency List

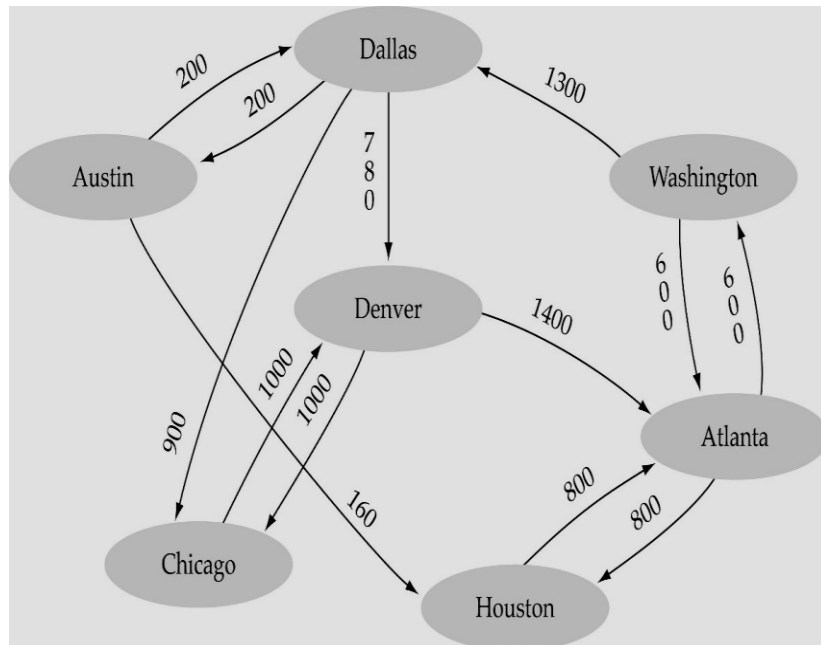
Each vertex is associated with its list of adjacent nodes.

Vertices themselves are stored in an array or hashmap

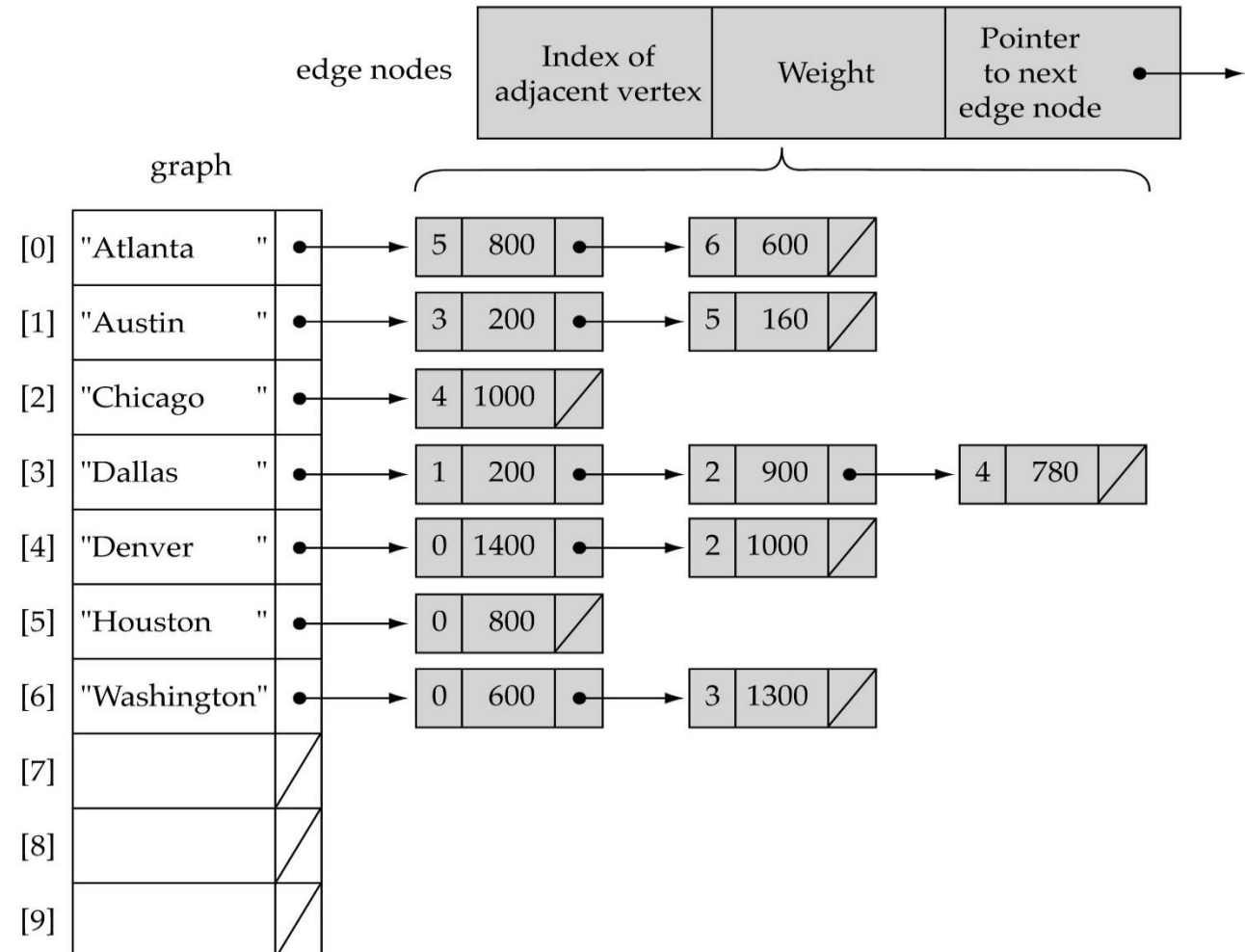


List can be of simple integers/ characters/ strings which represents vertex label or number

Here assumes a hashmap with <key,value> pair where key is vertex label and values is list of its connected vertices



(a)





# Adjacency List

## Running Time?

Get a vertex's out-edges

Get a vertex's in-edges

Decide if some edge exists

Insert an edge

Delete an edge

Insert a vertex

Remove a vertex

## Memory

$O(|V| + |E|)$

## Good for?

Sparse

Edges are significantly less than  $|V|^2$

