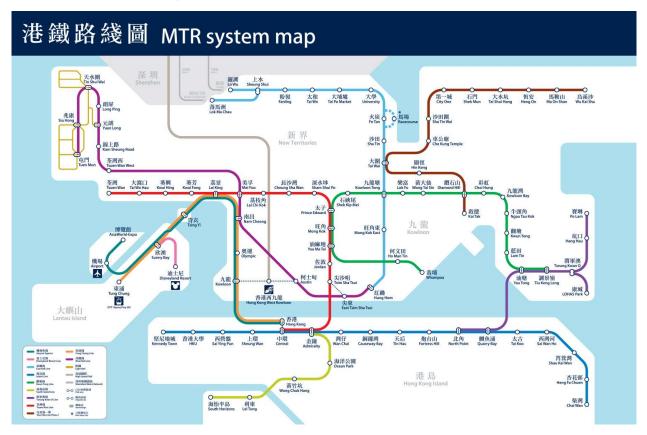
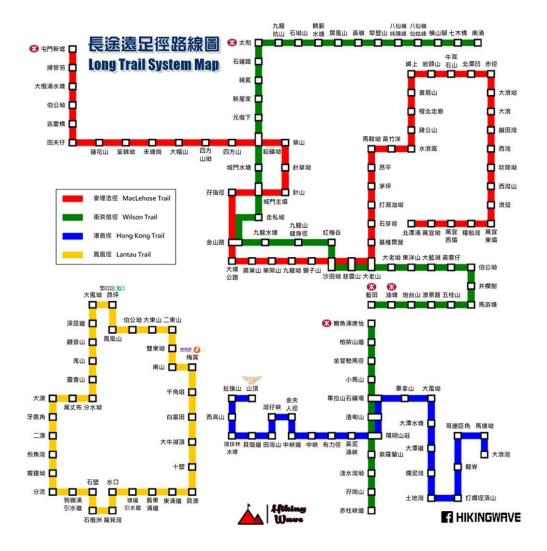
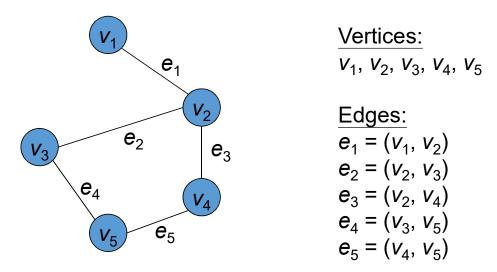
# Graphs

# Graph in daily life



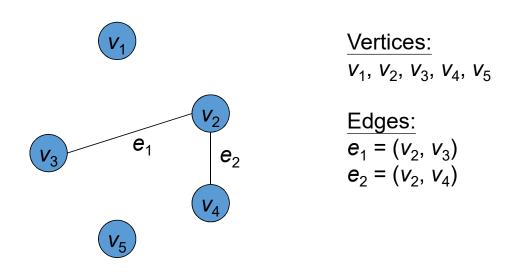


• A graph consists of some *vertices* (a.k.a. *nodes*) and some *edges* (a.k.a. *arcs*).



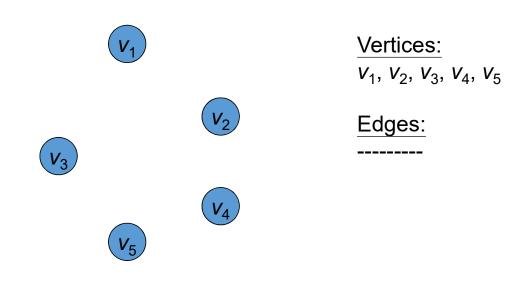
A graph with 5 *vertices* and 5 *edges*.

• A graph consists of some *vertices* and some *edges*.



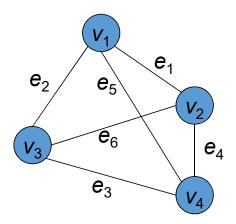
A graph with 5 *vertices* and 2 *edges*.

• A graph consists of some *vertices* and some *edges*.



A graph with 5 *vertices* and 0 *edges*.

• A graph consists of some *vertices* and some *edges*.



#### Vertices:

 $V_1, V_2, V_3, V_4$ 

#### Edges:

$$e_1 = (v_1, v_2)$$

$$e_2 = (v_1, v_3)$$

$$e_3 = (v_3, v_4)$$

$$e_4 = (v_2, v_4)$$

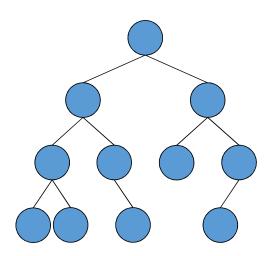
$$e_5 = (v_1, v_4)$$

$$e_6 = (v_2, v_3)$$

A graph with 4 *vertices* and 6 *edges*.

# Graph and Tree

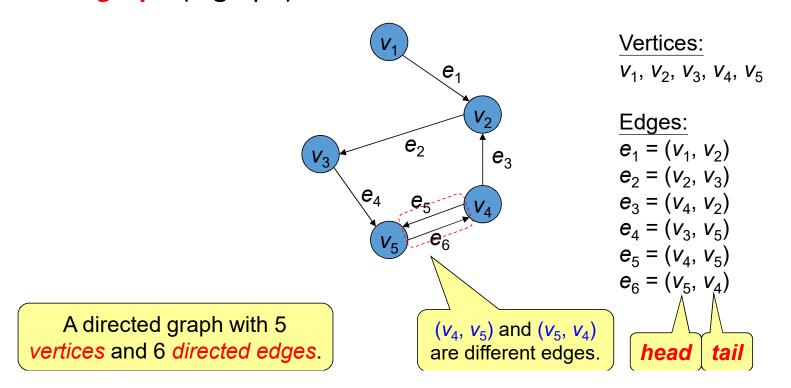
• A tree is also a graph (but not vice versa).



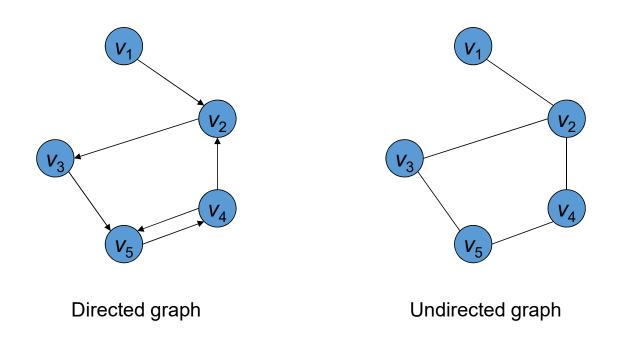
A graph with 11 *vertices* and 10 *edges*.

#### Directed Graph

Edges in a graph can be directed. A graph with directed edges is a directed graph (digraph).



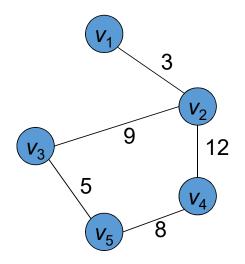
# Directed and Undirected Graphs



These two graphs are different.

#### Weighted Graph

Edges in a graph can have weights. A graph with weighted edges is a weighted graph.



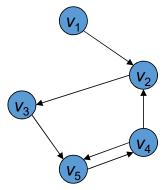
#### Vertices:

 $V_1$ ,  $V_2$ ,  $V_3$ ,  $V_4$ ,  $V_5$ 

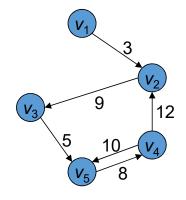
#### Edges:

 $(v_1, v_2)$ , weight = 3  $(v_2, v_3)$ , weight = 9  $(v_2, v_4)$ , weight = 12  $(v_3, v_5)$ , weight = 5  $(v_4, v_5)$ , weight = 8

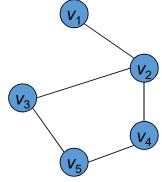
#### (Un)directed (Un)weighted Graph



Directed unweighted graph



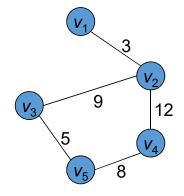
Directed weighted graph



Undirected unweighted graph

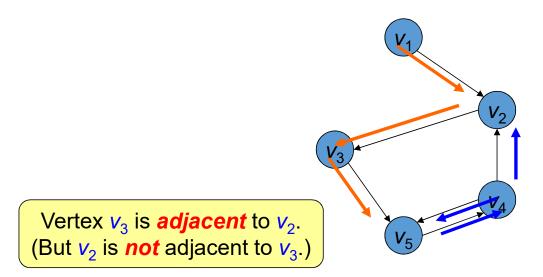
All four

graphs are different.



Undirected weighted graph

#### Graph Terminologies



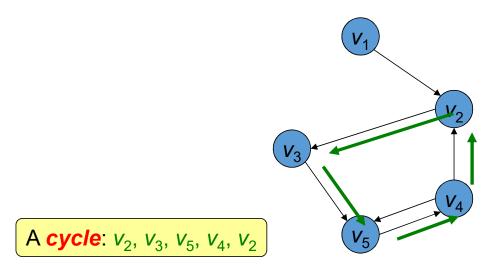
A **path**:  $V_1$ ,  $V_2$ ,  $V_3$ ,  $V_5$  (**Length** of path = 3)

Another **path**:  $v_5$ ,  $v_4$ ,  $v_5$ ,  $v_4$ ,  $v_2$  (**Length** of path = 4)

A **simple** path is a path with no duplicating vertices.

E.g., the path  $v_1$ ,  $v_2$ ,  $v_3$ ,  $v_5$  is simple, while  $v_5$ ,  $v_4$ ,  $v_5$ ,  $v_4$ ,  $v_2$  is not simple.

#### Graph Terminologies

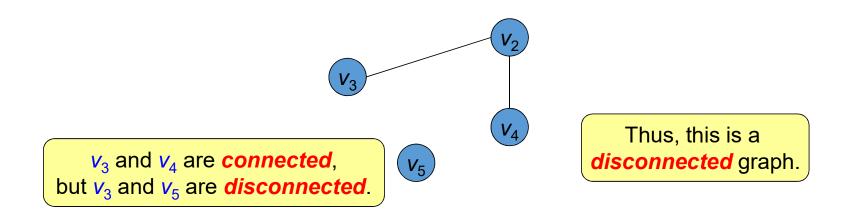


A **simple** cycle is a cycle with no duplicating vertices except the first and last vertex.

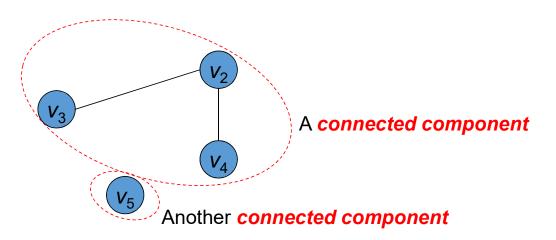
An *acyclic* graph is a graph with *no* cycles.

A directed acyclic graph is sometimes called a DAG.

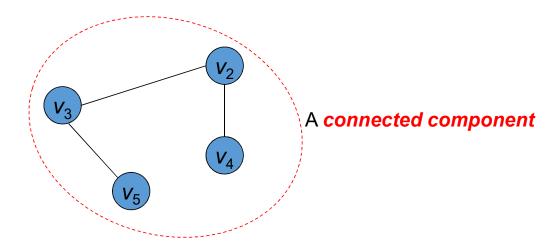
- In an undirected graph, two vertices u and v are connected if there is a path from u to v.
- An undirected graph is connected if all pairs of vertices are connected.



This graph has 2 connected components.

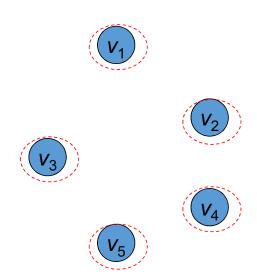


This graph has 1 *connected component*.



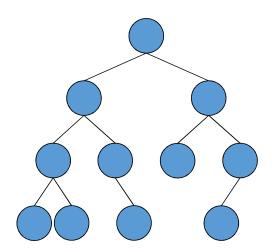
A **connected** graph is a graph that has only **one connected component**.

This graph has 5 *connected components*.



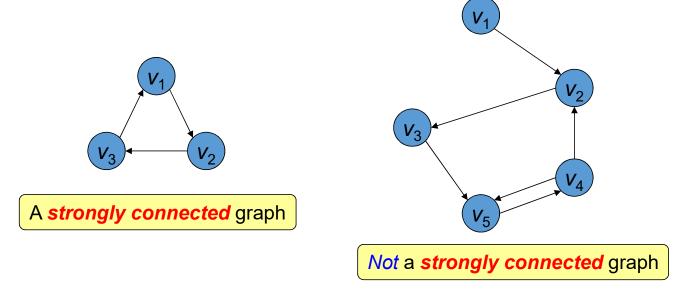
# Graph and Tree

• A tree is a connected acyclic undirected graph.



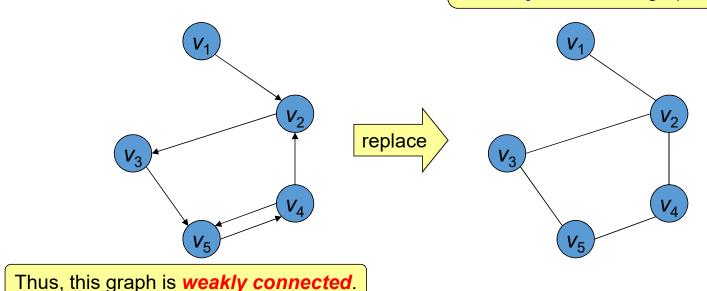
A graph with 11 *vertices* and 10 *edges*.

 A directed graph is strongly connected if for every pair of vertices, u and v, it contains a directed path from u to v.



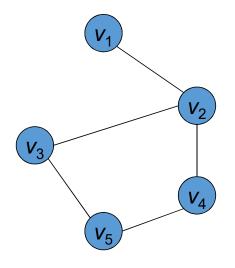
• A *directed* graph is *weakly connected* if replacing all directed edges with undirected edges produces a connected (undirected) graph.

Note that a **strongly connected** graph is also a **weakly connected** graph, but **not** vice versa.



# Degree of Graph

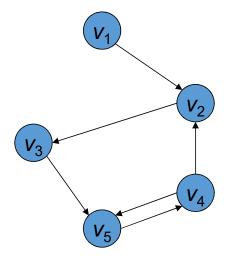
• In an *undirected* graph, the *degree* of a vertex *v* is the number of adjacent vertices to *v*.



Vertex	Degree
<b>v</b> <sub>1</sub>	1
<b>V</b> <sub>2</sub>	3
<i>V</i> <sub>3</sub>	2
<i>V</i> <sub>4</sub>	2
<b>V</b> <sub>5</sub>	2

# Degree of Graph

- In a directed graph,
  - the *out-degree* of a vertex *v* is the number of edges whose *head* is *v*.
  - the *in-degree* of a vertex *v* is the number of edges whose *tail* is *v*.

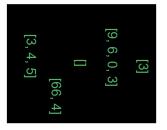


Vertex	Out-degree	In-degree
<b>v</b> <sub>1</sub>	1	0
<b>V</b> <sub>2</sub>	1	2
<i>V</i> <sub>3</sub>	1	1
<i>V</i> <sub>4</sub>	2	1
<b>V</b> <sub>5</sub>	1	2

#### Graph Representations

- Two most common and popular representations for graphs as a data structure
  - Adjacency matrix
  - Adjacency list

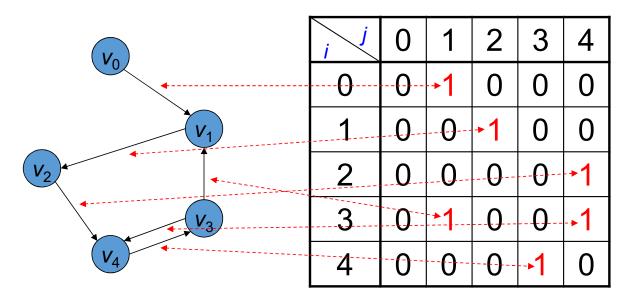




#### Adjacency Matrix: Unweighted Graph

- Suppose a graph has n vertices  $v_0, ..., v_{n-1}$ .
- The *adjacency matrix* of an *unweighted* graph is a two-dimensional  $n \times n$  array M such that
  - M[i][j] = 1 if the graph contains the edge  $(v_i, v_i)$ ;
  - M[i][j] = 0 otherwise.

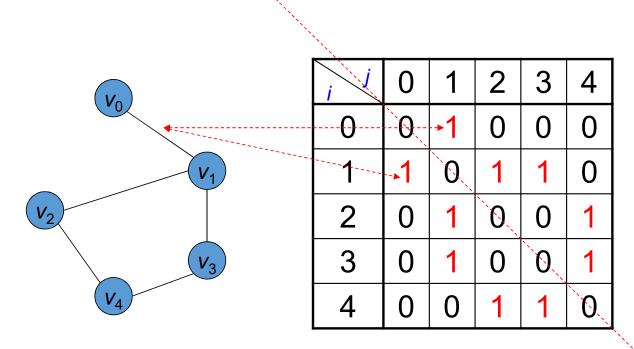
# Adjacency Matrix: Example (Directed Graph)



Directed unweighted graph

Adjacency matrix M

# Adjacency Matrix: Example (Undirected Graph)



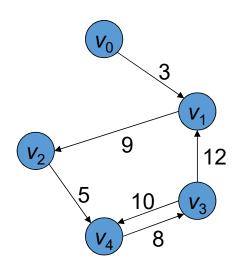
Undirected unweighted graph

Adjacency matrix M

#### Adjacency Matrix: Weighted Graph

- In a weighted graph, we can store the weights in the adjacency matrix.
  - M[i][j] =  $weight(v_i, v_i)$  if the graph contains the edge  $(v_i, v_i)$ ;
  - M[i][j] = ∞ otherwise.
     Other specific values may be used to denote non-existent edges, such as 0 or -∞.

# Adjacency Matrix: Example (Directed Graph)

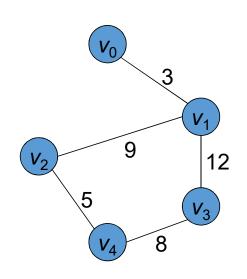


Directed weighted graph

j	0	1	2	3	4
0	8	3	8	8	8
1	8	8	9	8	8
2	8	8	$\infty$	$\infty$	5
3	8	12	8	8	10
4	8	8	8	8	8

Adjacency matrix M

# Adjacency Matrix: Example (Undirected Graph)



Undirected weighted graph

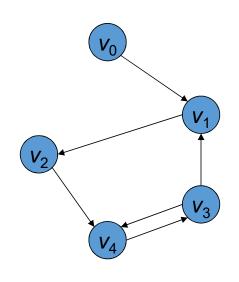
j	0	1	2	3	4
0	8	က	8	8	8
1	3	00	9	12	8
2	8	9	8	8	5
3	8	12	8	8	8
4	8	$\infty$	5	8	00

Adjacency matrix M

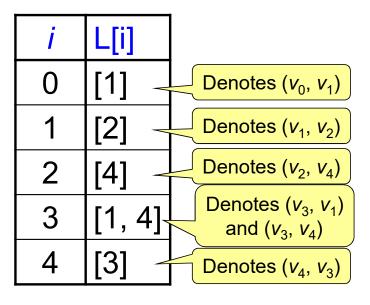
# Adjacency List: Unweighted Graph

- Suppose a graph has n vertices  $v_0, ..., v_{n-1}$ .
- The adjacency list of an unweighted graph is an array L of n lists such that
  - the elements of list L[i] contain the vertices that are adjacent to  $v_i$ .

# Adjacency List: Example (Directed Graph)

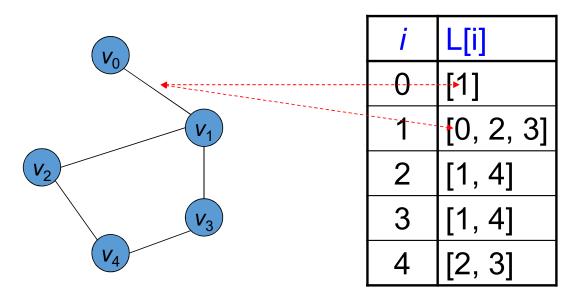


Directed unweighted graph



Adjacency list L

#### Adjacency List: Example (Undirected Graph)



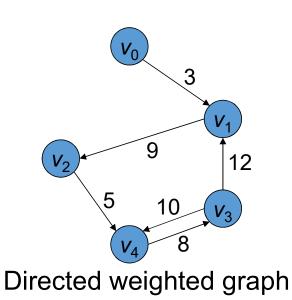
Undirected unweighted graph

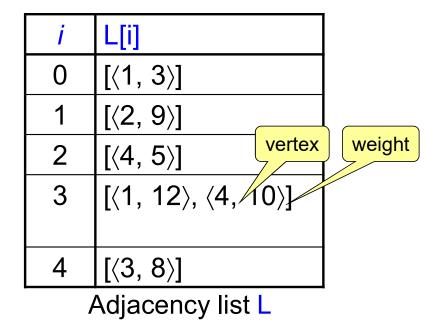
Adjacency list L

#### Adjacency List: Weighted Graph

• In a weighted graph, the elements of list L[i] contains the vertices  $v_j$  that are adjacent to  $v_i$  as well as the weights weight( $v_i$ ,  $v_i$ ).

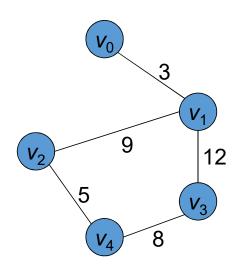
Adjacency list for directed unweights graph	
i	L[i]
0	[1]
1 [2]	
2 [4]	
3 [1, 4]	
4 [3]	





34

# Adjacency List: Example (Undirected Graph)



Undirected weighted graph

i	L[i]
0	[(1, 3)]
1	$[\langle 0, 3 \rangle, \langle 2, 9 \rangle, \langle 3, 12 \rangle]$
2	$[\langle 1, 9 \rangle, \langle 4, 5 \rangle]$
3	$[\langle 1, 12 \rangle, \langle 4, 8 \rangle]$
4	$[\langle 2, 5 \rangle, \langle 3, 8 \rangle]$

Adjacency list L

#### Adjacency Matrix vs Adjacency List

• Space complexities of different operations

n: number of vertices

e: number of edges

d: degree/out-degree of vertex

Adjacency matrix	Adjacency list
M[i][j], i, j = 0,, n-1 $O(n^2)$	L[i], i = 0,n-1 O(n+e)

Number of lists and total number of nodes

#### Adjacency Matrix vs Adjacency List

• Time complexities of different operations

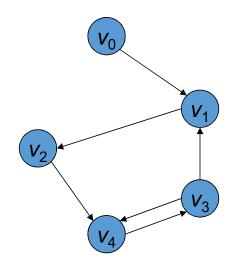
n: number of vertices

e: number of edges

d: degree/out-degree of vertex

	Adjacency matrix	Adjacency list
Is there an edge from	M[i][j] == 1?	Traverse L[i]
$v_i$ to $v_j$ ?	O(1)	O( <i>d</i> )
Find all vertices	Traverse row, M[i][?] == 1?	Traverse L[i]
adjacent to <i>v<sub>i</sub></i> .	O( <i>n</i> )	O( <i>d</i> )
How many edges are	Traverse M, M[?][?] == 1 ?	Traverse L
there in a graph?	$O(n^2)$	O(n + e)

Number of lists and total number of nodes



Directed unweighted graph

(0,	,1),
(1,	,2),
	,4),
	,1),
	,4),
	,3)

Edge list L

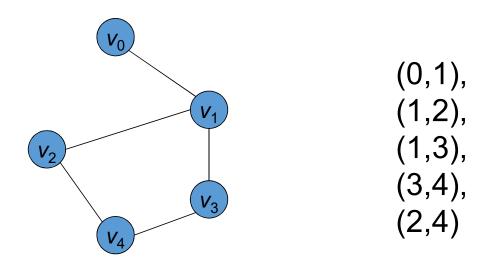
Adjacency list	
i	L[i]
0	[1]
1	[2]
2	[4]
3	[1, 4]
4	[3]

- Edge List
  - One list with elements denoting the edges

$$[(0,1), (1,2), (2,4), (3,1), (3,4), (4,3)]$$

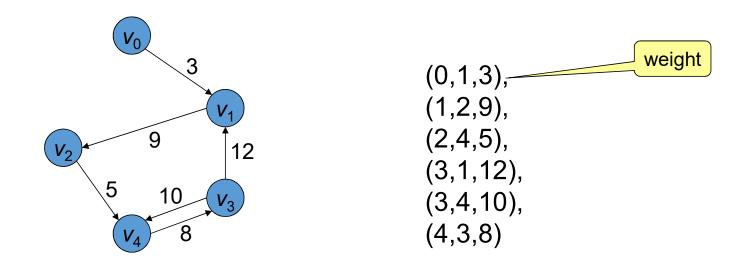
- Adjacency List
  - n lists with elements denoting the adjacent nodes

L[0]	1
L[1]	2
L[2]	4
L[3]	1, 4
L[4]	3



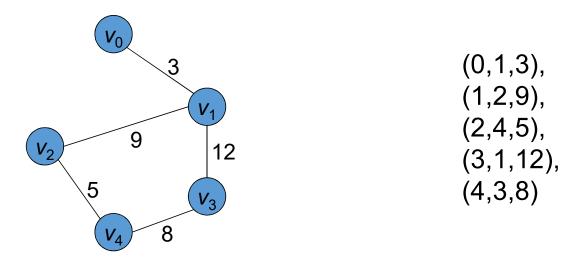
Undirected unweighted graph

Edge list L



Directed weighted graph

Edge list L



Undirected weighted graph

Edge list L