

# COMP2521 25T3

## Graphs (I)

### Introduction to Graphs

Sim Mautner

`cs2521@cse.unsw.edu.au`

graph fundamentals  
graph adt  
graph representations

**Graphs**

Types of Graphs

Graph Terminology

Graph ADT

Graph Reps

# Graph Fundamentals

## Graphs

Types of Graphs

Graph Terminology

Graph ADT

Graph Reps

Up to this point, we've seen a few collection types...

**lists:** a *linear* sequence of items  
each node is connected to its next node

**trees:** a *branched* hierarchy of items  
each node is connected to its child node(s)

what if we want something more general?  
each node is connected to arbitrarily many nodes

## Graphs

Types of Graphs

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Graph ADT

Graph Reps

Many applications need to model **relationships** between items.

... on a map: cities, connected by roads

... on the Web: pages, connected by hyperlinks

... in a game: states, connected by legal moves

... in a social network: people, connected by friendships

... in scheduling: tasks, connected by constraints

... in circuits: components, connected by traces

... in networking: computers, connected by cables

... in programs: functions, connected by calls

... etc. etc. etc.

## Graphs

Types of Graphs

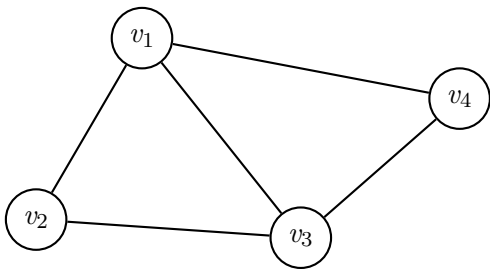
Graph Terminology

Graph ADT

Graph Reps

A graph is a data structure consisting of:

- A set of vertices  $V$ 
  - Also called nodes
- A set of edges  $E$  between pairs of vertices



$$V = \{v_1, v_2, v_3, v_4\}$$

$$E = \{(v_1, v_2), (v_1, v_3), (v_1, v_4), (v_2, v_3), (v_3, v_4)\}$$

## Graphs

Types of Graphs  
Graph Terminology

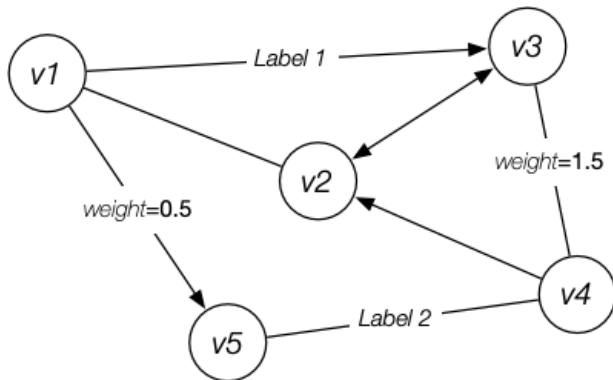
Graph ADT

Graph Reps

Vertices are distinguished by a unique identifier.

- In this course, usually an integer between 0 and  $|V| - 1$

Edges may be (optionally) directed, weighted and/or labelled.



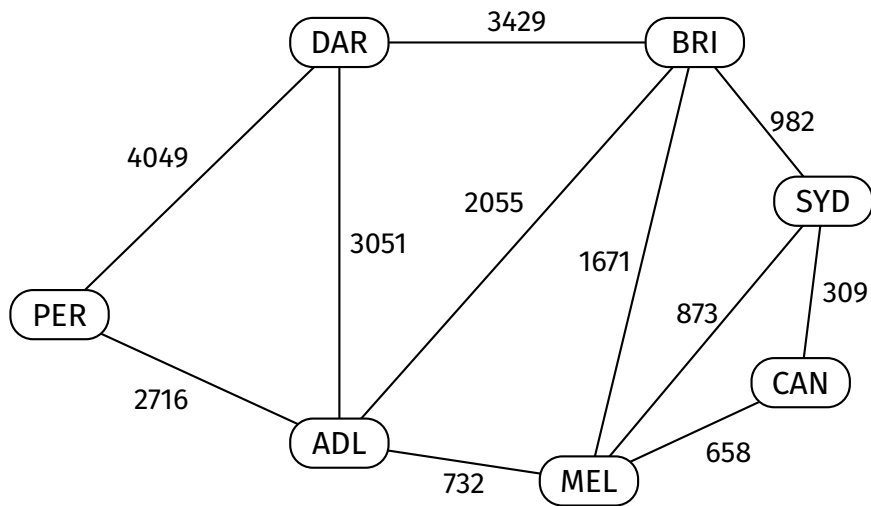
## Graphs

Types of Graphs  
Graph Terminology

Graph ADT

Graph Reps

## Example: Australian cities and roads



## Graphs

Types of Graphs

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Graph Reps

Questions we could answer with a graph:

- Is there a way to get from  $A$  to  $B$ ?
- What is the *best* way to get from  $A$  to  $B$ ?
- In general, what vertices can we reach from  $A$ ?
- Is there a path that lets me visit all vertices?
- Can we form a tree linking all vertices?
- Are two graphs “equivalent”?

Graph problems are generally more complex to solve than linked list problems:

- Items are not ordered
- Graphs may contain cycles
- Concrete representation is more complex



Graphs can be a combination of these types:

undirected or directed

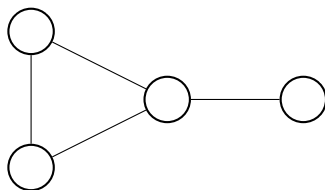
unweighted or weighted

without loops or with loops

non-multigraph or multigraph

... and others ...

In an **undirected graph**, edges do not have direction.  
For example, Facebook friends.



## Graphs

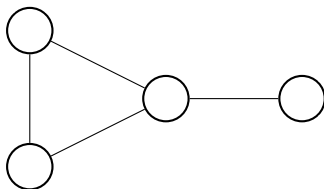
## Types of Graphs

## Graph Terminology

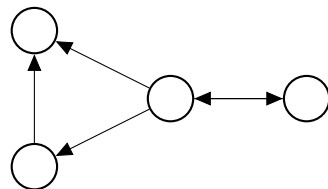
## Graph ADT

## Graph Reps

In a **directed graph** or **digraph**, each edge has a direction.  
For example, road maps, Twitter follows.

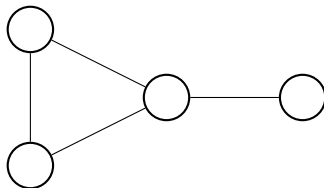


undirected graph

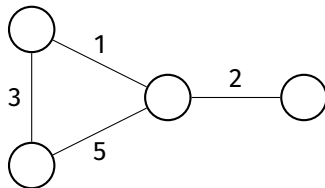


directed graph

In a **weighted graph**, each edge has an associated weight.  
For example, road maps, networks.



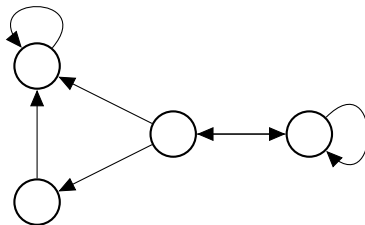
unweighted graph



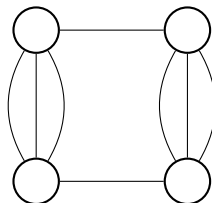
weighted graph

A **loop** is an edge from a vertex to itself.

Depending on the context,  
a graph may or may not be able to have loops.



In a **multigraph**,  
multiple edges are allowed between two vertices.  
For example, call graphs, maps.



Multigraphs will not be considered in this course.

## Graphs

## Types of Graphs

## Graph Terminology

## Graph ADT

## Graph Reps

A **simple graph** is an undirected graph  
with no loops and no multiple edges.

For now, we will only consider simple graphs.

Graphs

Types of Graphs

Graph Terminology

Graph ADT

Graph Reps

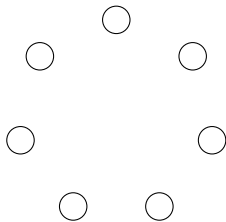
**Question:**

For a simple graph with  $V$  vertices,  
what is the *maximum* possible number of edges?

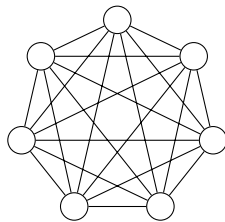


**Question:**

For a simple graph with  $V$  vertices,  
what is the *maximum* possible number of edges?



$$E = 0$$



$$E = V(V - 1)/2$$

**Note on notation:**

The number of vertices  $|V|$  and the number of edges  $|E|$   
are normally written as  $V$  and  $E$  for simplicity.

## Graphs

## Types of Graphs

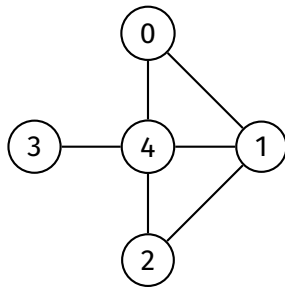
## Graph Terminology

## Graph ADT

## Graph Reps

Two vertices  $v$  and  $w$  are **adjacent** if an edge  $e := (v, w)$  connects them; we say  $e$  is **incident** on  $v$  and  $w$ .

The **degree** of a vertex  $v$  ( $\deg(v)$ ) is the number of edges incident on  $v$ .



$$\deg(0) = 2$$

$$\deg(1) = 3$$

$$\deg(2) = 2$$

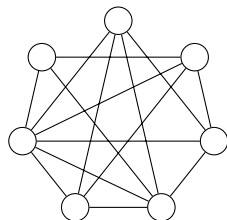
$$\deg(3) = 1$$

$$\deg(4) = 4$$

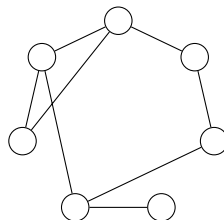
The ratio  $E:V$  can vary considerably.

If  $E$  is closer to  $V^2$ , the graph is **dense**.

If  $E$  is closer to  $V$ , the graph is **sparse**.



dense graph



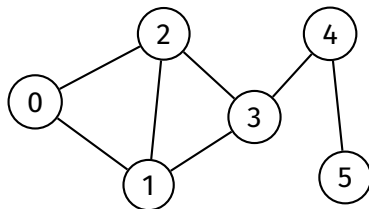
sparse graph

Knowing whether a graph is dense or sparse will affect our choice of representation and algorithms.

A **path** is  
a sequence of vertices where  
each vertex has a edge to the next in the  
sequence

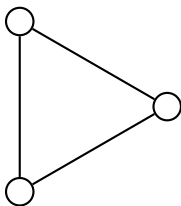
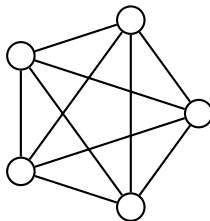
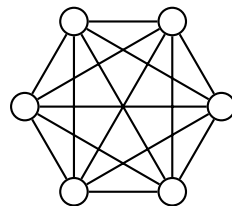
A path is **simple**  
if it has no repeating vertices

A **cycle** is a path where  
only the first and last vertices are the same  
0-1-2-0, 1-2-3-1, 0-1-3-2-0

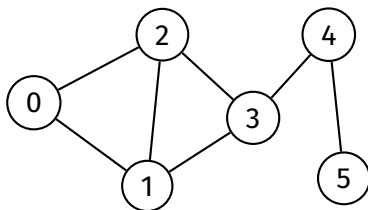


A **complete** graph is a graph where every vertex is connected to every other vertex via an edge.

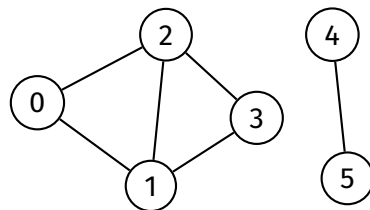
In a complete graph,  $E = \frac{1}{2} V(V - 1)$ .

 $K_3$  $K_5$  $K_6$

A **connected** graph is a graph where there is a path from every vertex to every other vertex.



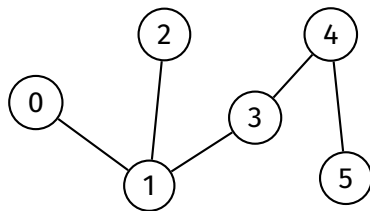
Connected graph



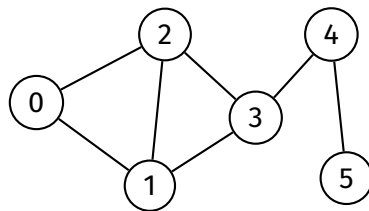
Disconnected graph

A **tree** is a connected graph with no cycles.

A tree has exactly one path between each pair of vertices.

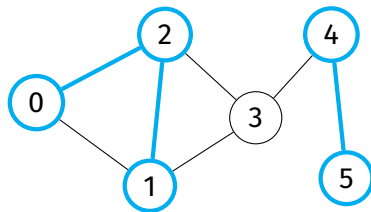
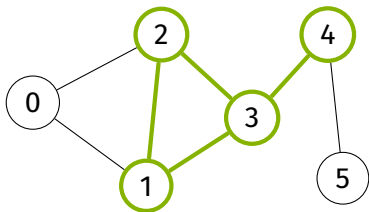


Tree



Not a tree

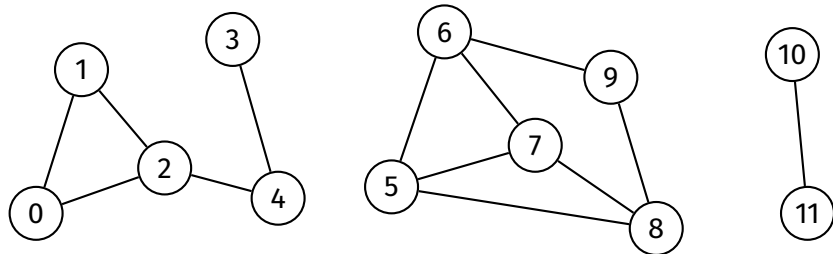
A **subgraph** of a graph  $G$   
is a graph that contains a subset of the vertices of  $G$   
and a subset of the edges between these vertices.





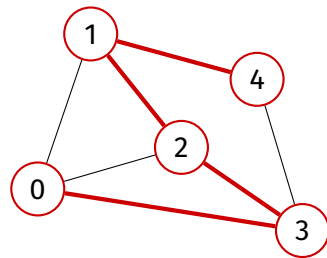
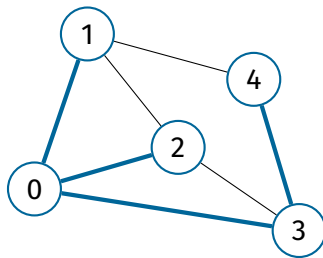
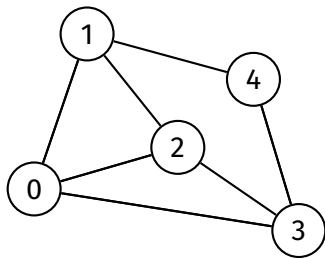
A **connected component** is a maximally connected subgraph.

A connected graph has one connected component — the graph itself.  
A disconnected graph has two or more connected components.

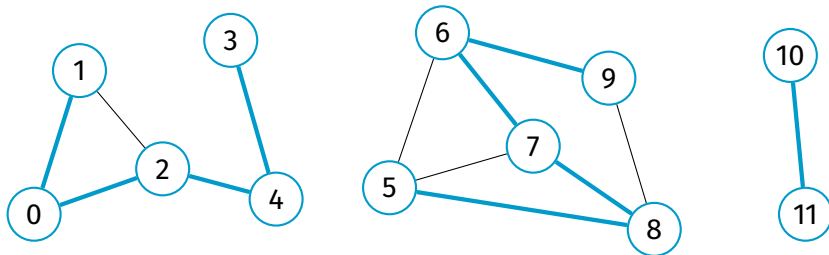


A **spanning tree** of a graph  $G$   
is a subgraph that contains all the vertices of  $G$   
and is a single tree.

Spanning trees only exist for connected graphs.

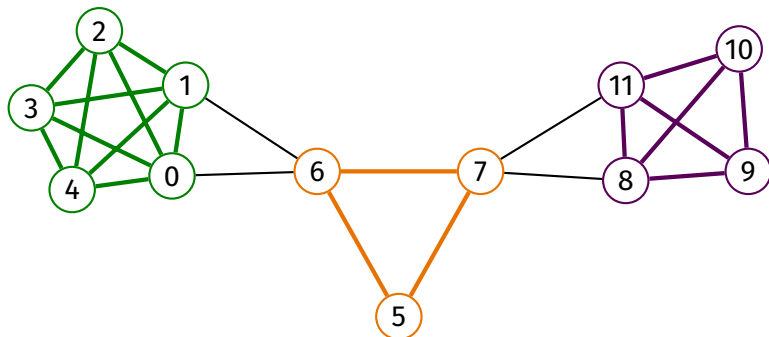


A **spanning forest** of a graph  $G$   
is a subgraph that contains all the vertices of  $G$   
and contains one tree for each connected component.



A **clique** is a complete subgraph.

A clique is non-trivial if it has 3 or more vertices.



# Graph ADT

Graphs

Graph ADT

Graph Reps

What do we need to represent?  
What operations do we need to support?

### What do we need to represent?

A set of vertices  $V := \{v_1, \dots, v_n\}$

A set of edges  $E := \{(v, w) \mid v, w \in V\}$

### What operations do we need to support?

- create/destroy graph

- add/remove edges

- get #vertices, #edges

- check if an edge exists

## **create/destroy**

create a graph

free memory allocated to graph

## **query**

get number of vertices

get number of edges

check if an edge exists

## **update**

add edge

remove edge

We will extend this ADT with more complex operations later.



```
typedef struct graph *Graph;

// vertices denoted by integers 0..V-1
typedef int Vertex;

/** Creates a new graph with nV vertices */
Graph GraphNew(int nV);

/** Frees all memory allocated to a graph */
void GraphFree(Graph g);
```

```
/** Returns the number of vertices in a graph */  
int GraphNumVertices(Graph g);  
  
/** Returns the number of edges in a graph */  
int GraphNumEdges(Graph g);  
  
/** Returns true if there is an edge between the given vertices  
    and false otherwise */  
bool GraphIsAdjacent(Graph g, Vertex v, Vertex w);
```

```
/** Inserts an edge into a graph */  
void GraphInsertEdge(Graph g, Vertex v, Vertex w);  
  
/** Removes an edge from a graph */  
void GraphRemoveEdge(Graph g, Vertex v, Vertex w);
```

Graphs

Graph ADT

**Graph Reps**

Adjacency Matrix

Adjacency List

Array of Edges

Summary

# Graph Representations

Graphs

Graph ADT

Graph Reps

Adjacency Matrix

Adjacency List

Array of Edges

Summary

3 main graph representations:

## **Adjacency Matrix**

Edges defined by presence value in  $V \times V$  matrix

## **Adjacency List**

Edges defined by entries in array of  $V$  lists

## **Array of Edges**

Explicit representation of edges as  $(v, w)$  pairs

We'll consider these representations for *unweighted, undirected* graphs.

Graphs

Graph ADT

Graph Reps

Adjacency Matrix

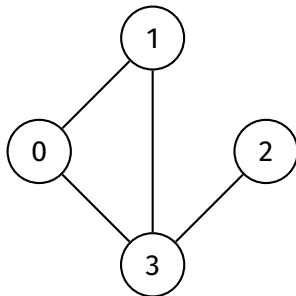
Adjacency List

Array of Edges

Summary

A  $V \times V$  matrix

Each cell represents a pair of vertices,  
with a 1 indicating an edge between them



	[0]	[1]	[2]	[3]
[0]	0	1	0	1
[1]	1	0	0	1
[2]	0	0	0	1
[3]	1	1	1	0

Graphs

Graph ADT

Graph Reps

Adjacency Matrix

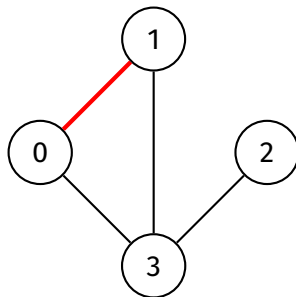
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Graphs

Graph ADT

Graph Reps

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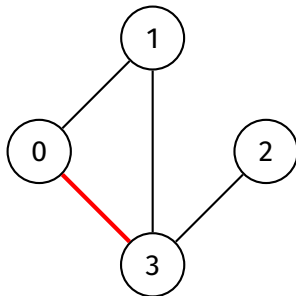
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Graphs

Graph ADT

Graph Reps

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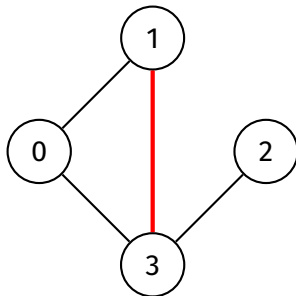
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Graphs

Graph ADT

Graph Reps

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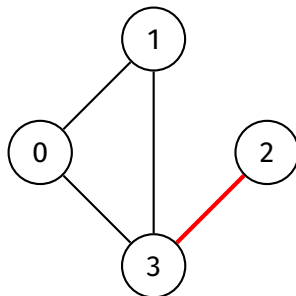
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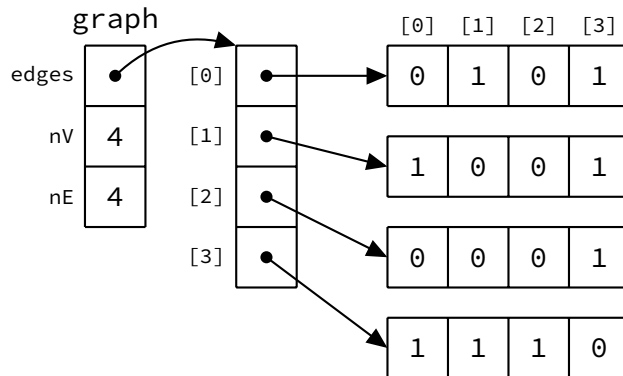
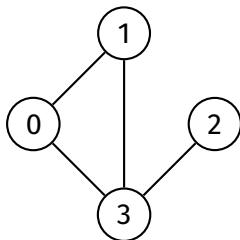
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```
struct graph {  
    int nV;  
    int nE;  
    bool **edges;  
};
```



Graphs

Graph ADT

Graph Reps

Adjacency Matrix

Adjacency List

Array of Edges

Summary

### Advantages

Efficient  
edge insertion/deletion  
and adjacency check ( $O(1)$ )

### Disadvantages

Huge memory usage ( $O(V^2)$ )  
sparse graph  $\Rightarrow$  wasted space!  
undirected graph  $\Rightarrow$  wasted space!

Graphs

Graph ADT

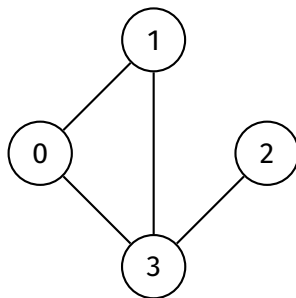
Graph Reps

Adjacency Matrix

Adjacency List

Array of Edges

Summary

Array of  $V$  listsList at index  $v$  contains the neighbours of vertex  $v$ 

[0]	1, 3
[1]	0, 3
[2]	3
[3]	0, 1, 2

Graphs

Graph ADT

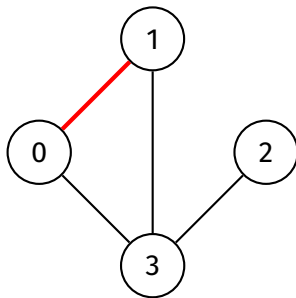
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Graphs

Graph ADT

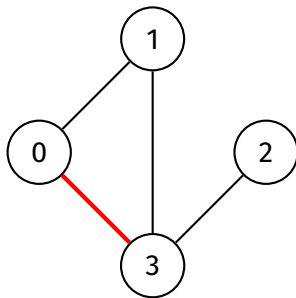
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Graphs

Graph ADT

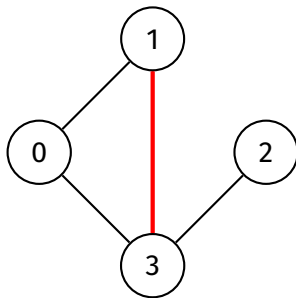
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Graphs

Graph ADT

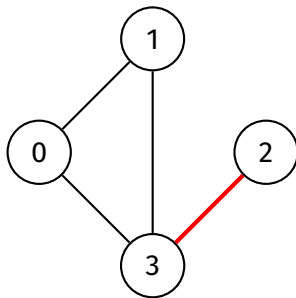
Graph Reps

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## Graphs

## Graph ADT

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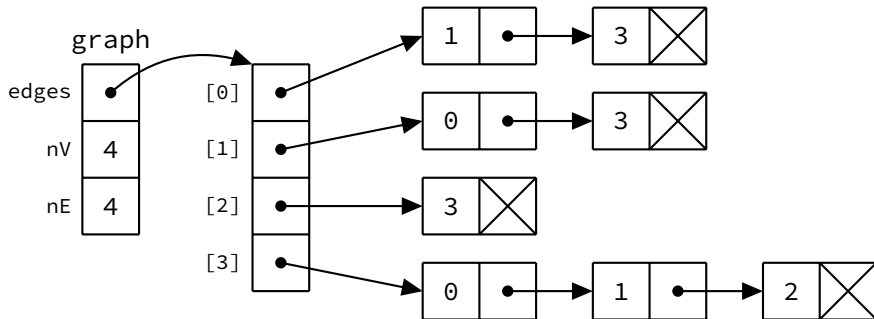
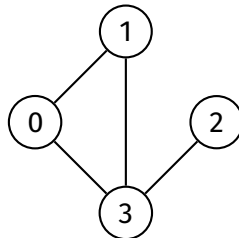
## Adjacency Matrix

## Adjacency List

## Array of Edges

## Summary

```
struct graph {  
    int nV;  
    int nE;  
    struct adjNode **edges;  
};  
  
struct adjNode {  
    Vertex v;  
    struct adjNode *next;  
};
```



Graphs

Graph ADT

Graph Reps

Adjacency Matrix

**Adjacency List**

Array of Edges

Summary

### Advantages

Space-efficient for  
sparse graphs  
 $O(V + E)$  memory usage

### Disadvantages

Inefficient  
edge insertion/deletion ( $O(V)$ )  
(matters less for sparse graphs)

Graphs

Graph ADT

Graph Reps

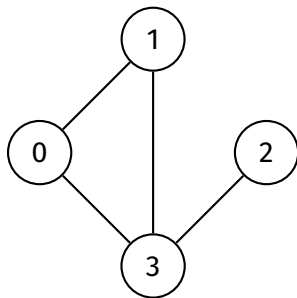
Adjacency Matrix

Adjacency List

Array of Edges

Summary

## Explicit array of edges (pairs of vertices)



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

Graphs

Graph ADT

Graph Reps

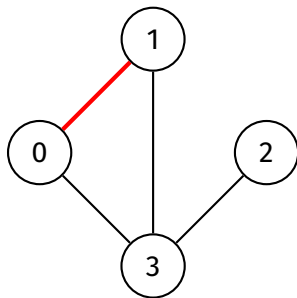
Adjacency Matrix

Adjacency List

Array of Edges

Summary

## Explicit array of edges (pairs of vertices)



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

Graphs

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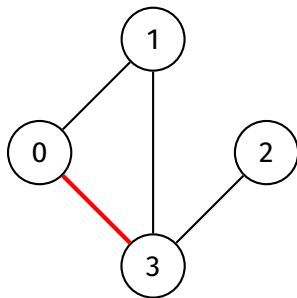
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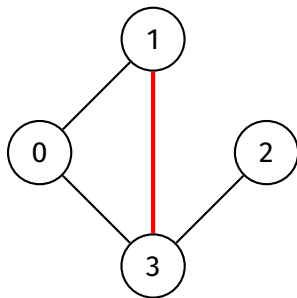
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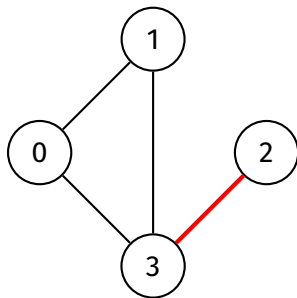
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## Graphs

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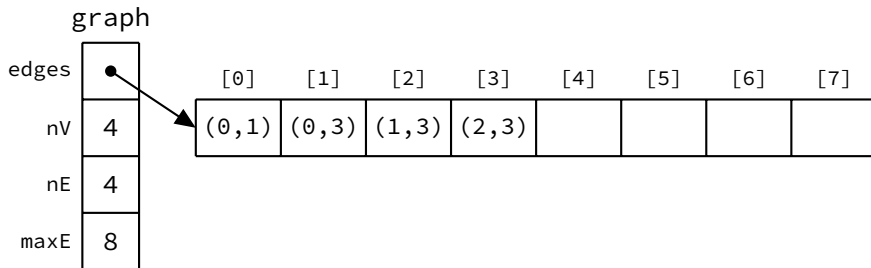
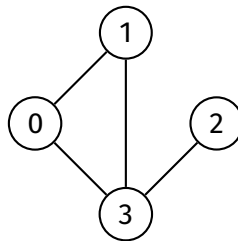
Adjacency Matrix

Adjacency List

Array of Edges

Summary

```
struct graph {  
    int nV;  
    int nE;  
    int maxE;  
    struct edge *edges;  
};  
  
struct edge {  
    Vertex v;  
    Vertex w;  
};
```



Graphs

Graph ADT

Graph Reps

Adjacency Matrix

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**Array of Edges**

Summary

### Advantages

Very space-efficient for  
sparse graphs where  $E < V$

### Disadvantages

Inefficient  
edge insertion/deletion ( $O(E)$ )

## Graphs

## Graph ADT

## Graph Reps

Adjacency Matrix

Adjacency List

Array of Edges

Summary

	Adjacency Matrix	Adjacency List	Array of Edges
Space usage	$O(V^2)$	$O(V + E)$	$O(E)$
Create	$O(V^2)$	$O(V)$	$O(1)$
Destroy	$O(V)$	$O(V + E)$	$O(1)$
Insert edge	$O(1)$	$O(V)$	$O(E)$
Remove edge	$O(1)$	$O(V)$	$O(E)$
Is adjacent	$O(1)$	$O(V)$	$O(E)^*$
Degree	$O(V)$	$O(V)$	$O(E)^*$

\* Can be  $O(\log E)$  if the array is ordered  
and both directions of each edge are stored in an undirected graph