

Graph Algorithm

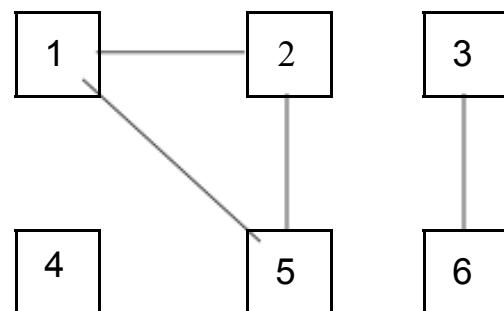
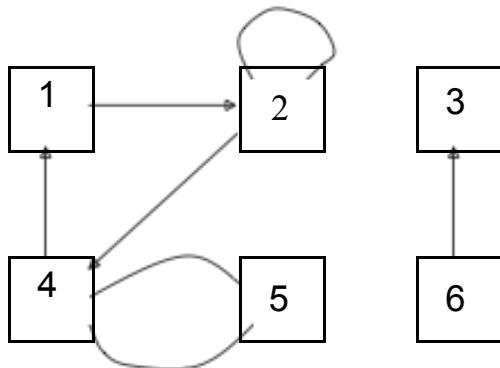
- IOI Training Oct. 2019

Outline

- Introduction
- Graph Data Structure
- Graph Theory
- BFS
- DFS
- Topological Sort
- Strongly Connected Component

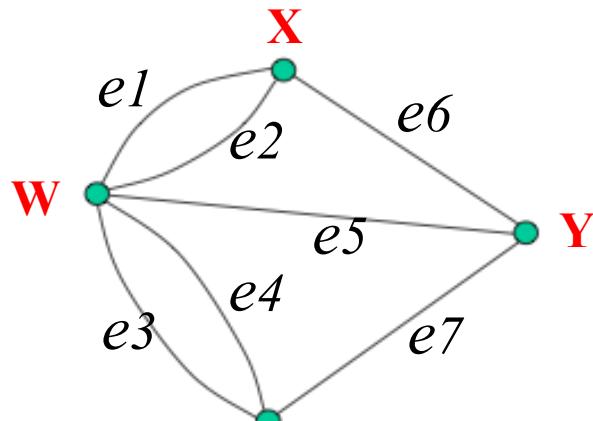
What is a Graph?

- Informally a *graph* is a set of nodes joined by a set of lines or arrows.



What Is a Graph?

- A graph G is a triple consisting of:
 - A vertex set $V(G)$
 - An edge set $E(G)$
 - A relation between an edge and a pair of vertices



Definitions

- Vertex
 - Basic Element
 - Drawn as a *node* or a *dot*.
 - Vertex set of G is usually denoted by $V(G)$, or V
- Edge
 - A set of two elements
 - Drawn as a line connecting two vertices, called end vertices, or endpoints.
 - The edge set of G is usually denoted by $E(G)$, or E .

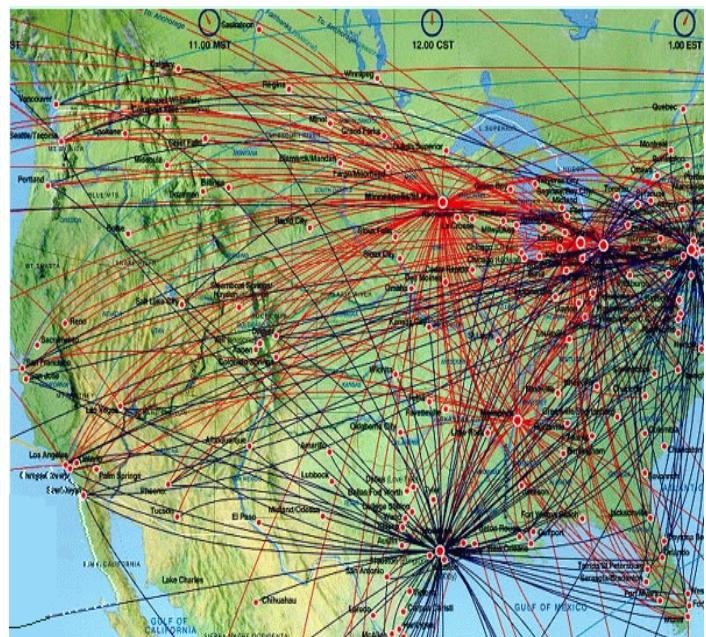
Graph-based representations

- Representing a problem as a graph can provide a different point of view
- Representing a problem as a graph can make a problem much simpler
- More accurately, it can provide the appropriate tools for solving the problem

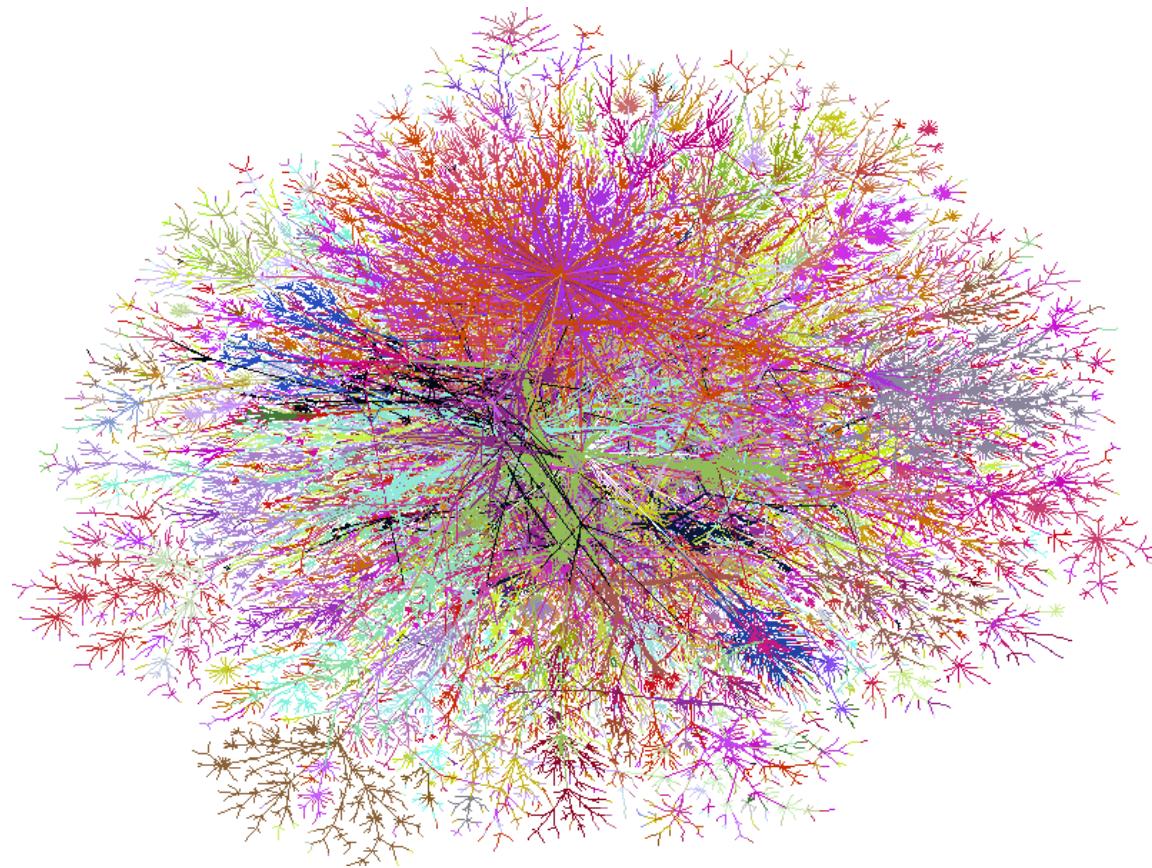
What makes a problem graph-like?

- There are two components to a graph
- Nodes and edges
- In graph-like problems, these components have natural correspondences to problem elements
 - Entities are nodes and interactions between entities are edges
- Most complex systems are graph-like

Transportation Networks

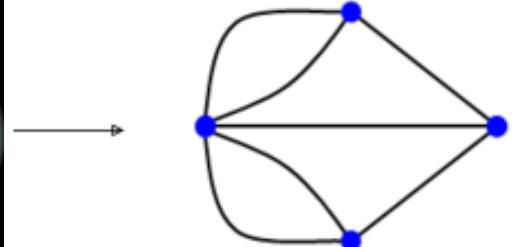
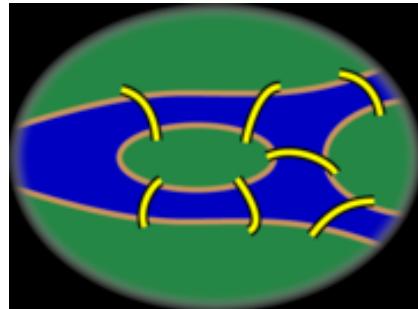
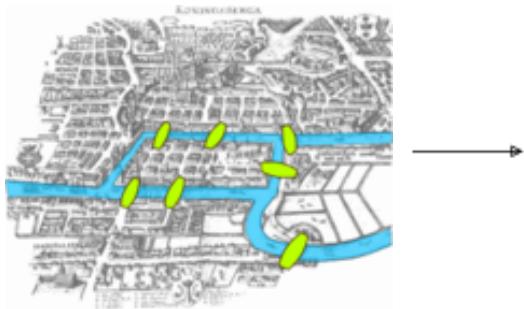


Internet



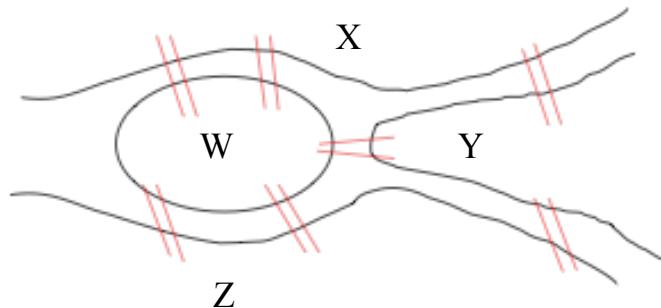
Graph Theory - History

Leonhard Euler's paper on
“Seven Bridges of
Königsberg”,
published in 1736.



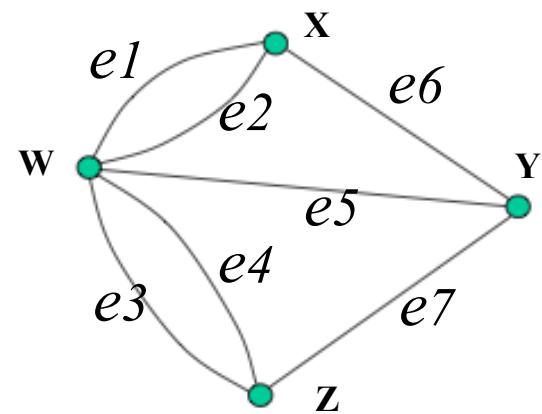
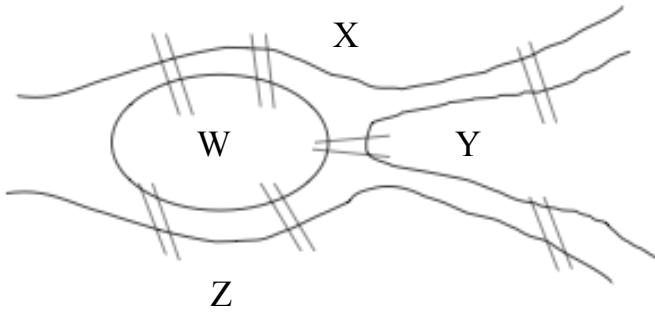
The Königsberg Bridge Problem

- Königsber is a city on the Pregel river in Prussia. The city occupied two islands plus areas on both banks
- Problem: Whether they could leave home, cross every bridge exactly once, and return home.



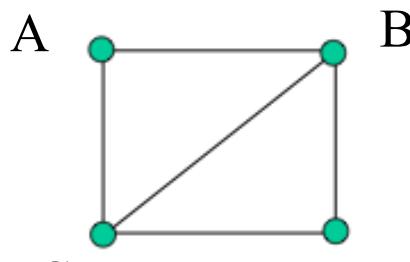
A Model

- A **vertex** : a region
- An **edge** : a path(bridge) between two regions



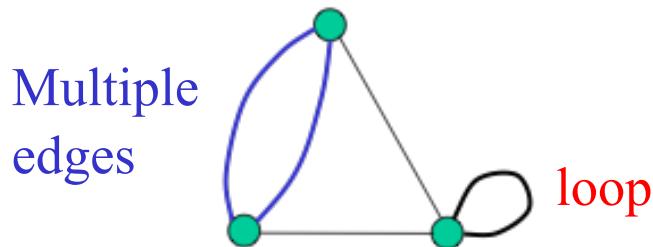
Adjacent, neighbors

- Two vertices are *adjacent* and are *neighbors* if they are the endpoints of an edge
- Example:
 - A and B are adjacent
 - A and D are not adjacent



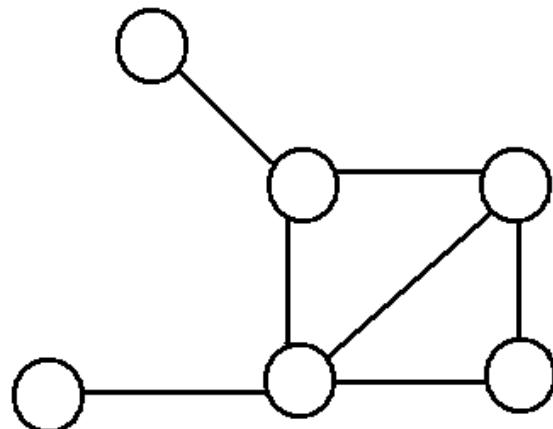
Loop, Multiple edges

- *Loop* : An edge whose endpoints are equal
- *Multiple edges* : Edges have the same pair of endpoints



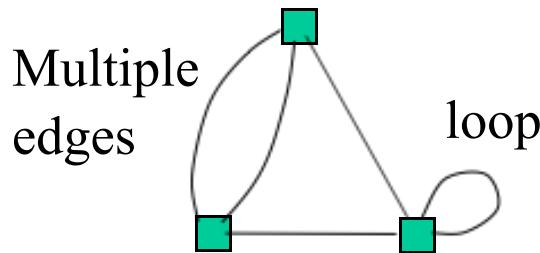
Simple Graphs

Simple graphs are graphs without multiple edges or self-loops.

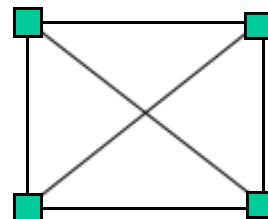


Simple Graph

- *Simple graph* : A graph has no loops or multiple edges



It is **not simple**.

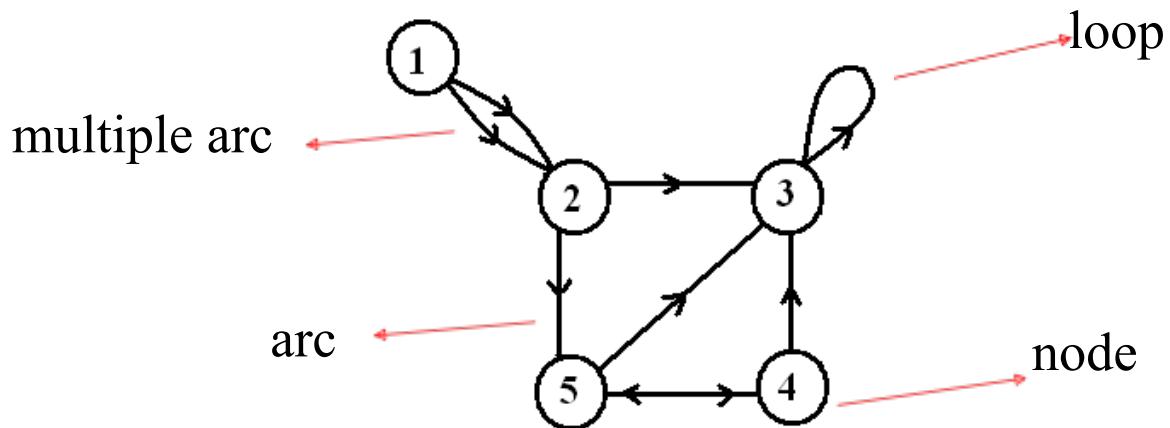


It is a **simple** graph.

Directed Graph (digraph)

Edges have directions

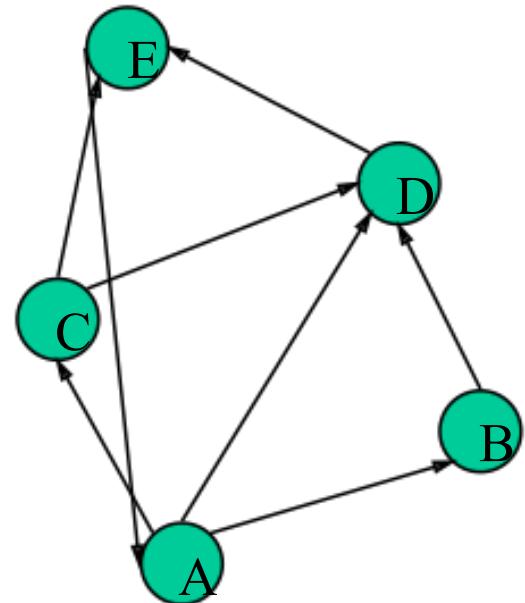
An edge is an *ordered* pair of nodes



Digraphs

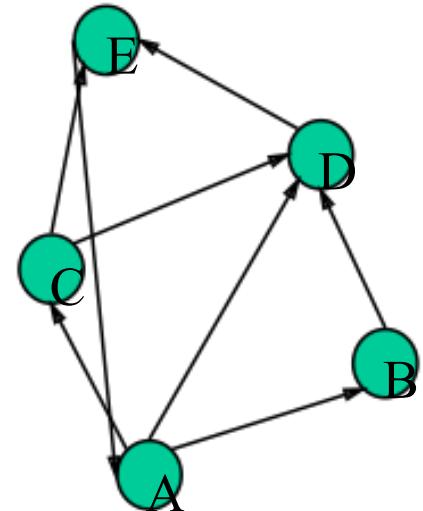
- Every undirected graph can be represented by a digraph.
- Applications
 - one-way streets
 - flights
 - task scheduling

Fundamental issue is reachability



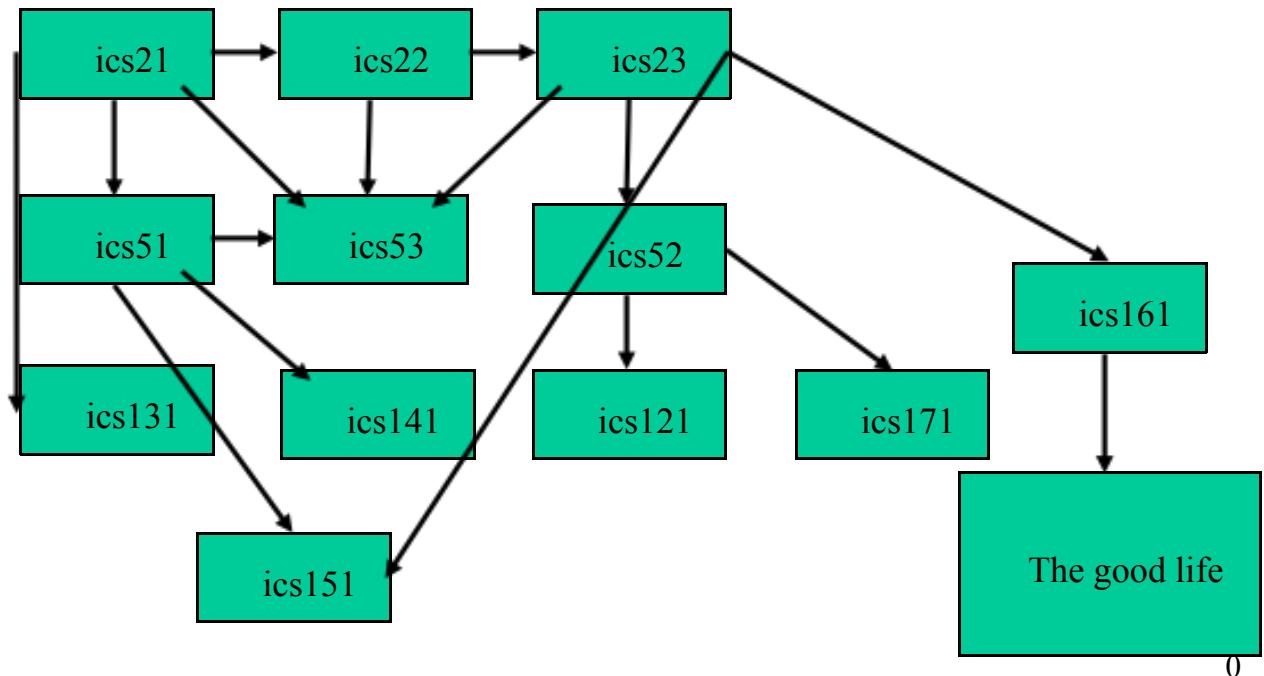
Digraph Properties

- A graph $G=(V,E)$ such that
 - Each edge goes in one direction:
 - Edge (a,b) goes from a to b , but not b to a .
- If G is simple, $m \leq n*(n-1)$ – at most an edge between each node and every *other* node.
- If we keep in-edges and out-edges in separate adjacency lists, we can perform listing of in-edges and out-edges in time proportional to their size.



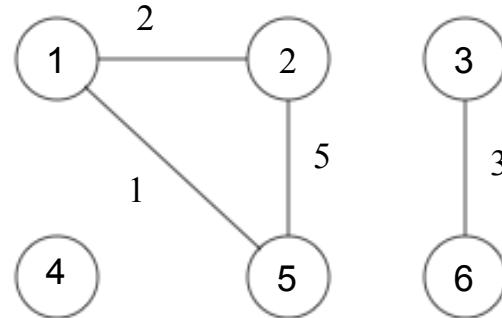
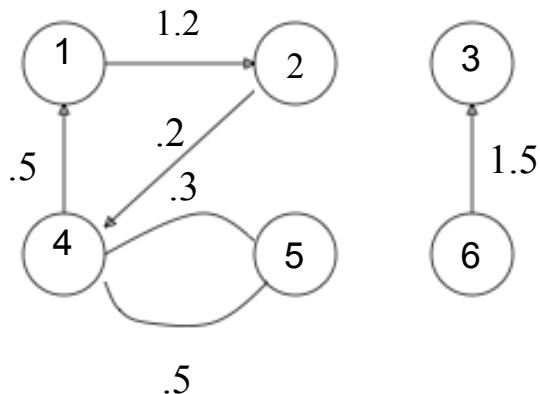
Digraph Application

- Scheduling: edge (a,b) means task **a** must be completed before **b** can be started

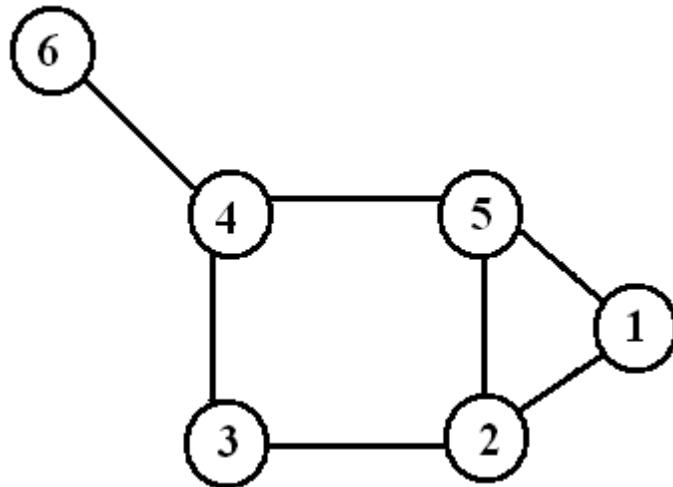


Weighted graphs

It is a graph for which each edge has an associated ***weight***, usually given by a ***weight function*** $w: E \rightarrow \mathbb{R}$.



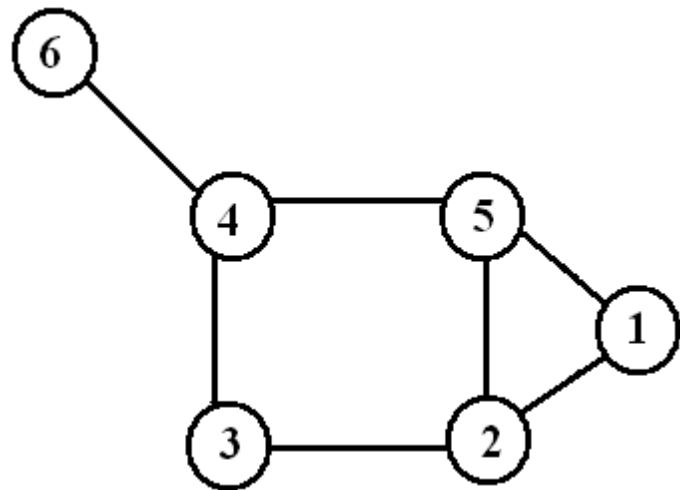
Example



- $V := \{1, 2, 3, 4, 5, 6\}$
- $E := \{\{1, 2\}, \{1, 5\}, \{2, 3\}, \{2, 5\}, \{3, 4\}, \{4, 5\}, \{4, 6\}\}$

Degree

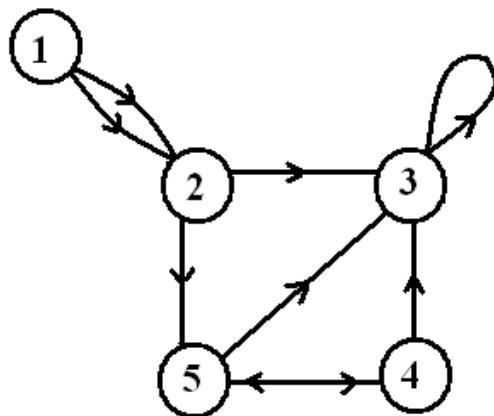
Number of edges incident on a node



The degree of 5 is 3

Degree (Directed Graphs)

- In-degree: Number of edges entering
- Out-degree: Number of edges leaving
- Degree = indeg + outdeg



$$\begin{aligned} \text{outdeg}(1) &= 2 \\ \text{indeg}(1) &= 0 \end{aligned}$$

$$\begin{aligned} \text{outdeg}(2) &= 2 \\ \text{indeg}(2) &= 2 \end{aligned}$$

$$\begin{aligned} \text{outdeg}(3) &= 1 \\ \text{indeg}(3) &= 4 \end{aligned}$$

Degree: Simple Facts

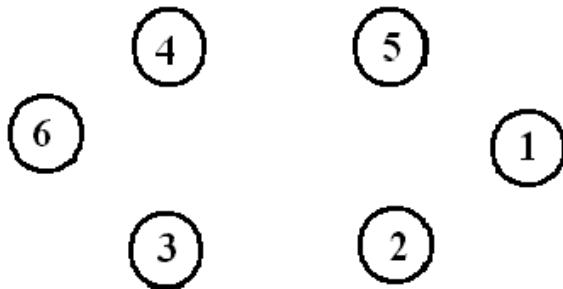
- If G is a graph with m edges, then
 - $\deg(v) = 2m = 2 |E|$
- If G is a digraph then
 - $\text{indeg}(v) = \text{outdeg}(v) = |E|$
- Number of Odd degree Nodes is even

Finite Graph, Null Graph

- *Finite graph* : an graph whose vertex set and edge set are finite
- *Null graph* : the graph whose vertex set and edges are empty

Special Types of Graphs

- **Empty Graph / Edgeless graph**
 - No edge

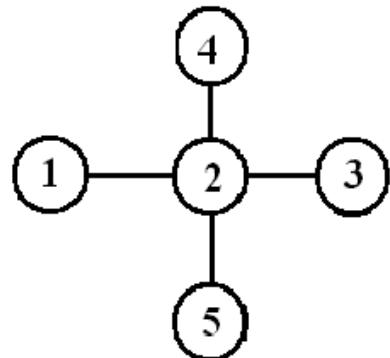
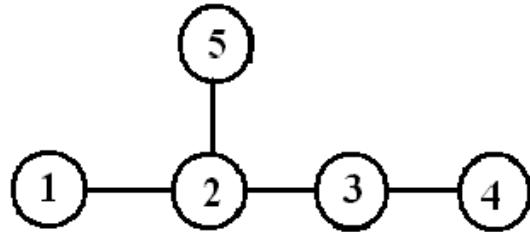
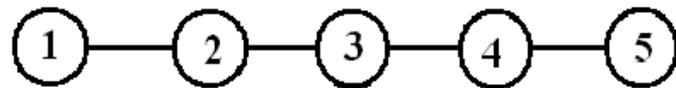


- **Null graph**
 - No nodes
 - Obviously no edge

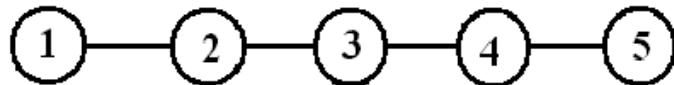
Trees

Connected Acyclic Graph

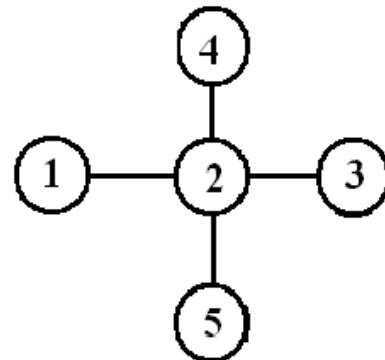
Two nodes have *exactly* one path between them



Special Trees



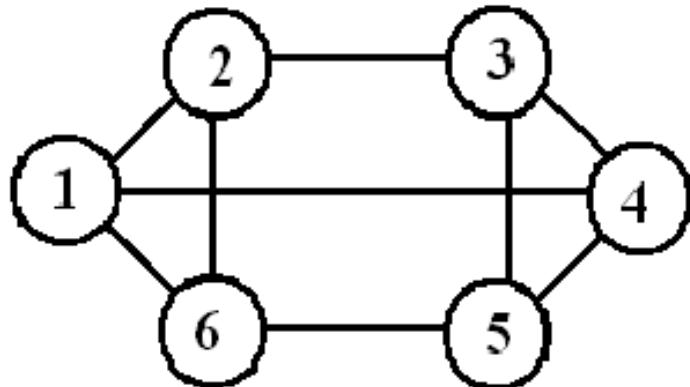
Paths



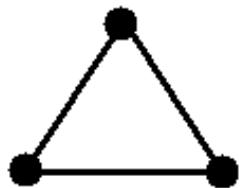
Stars

Regular

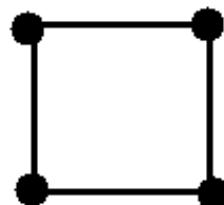
- Connected Graph
- All nodes have the same degree



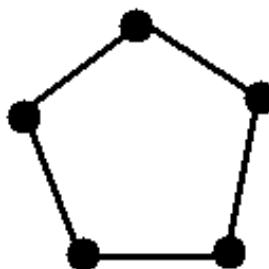
Special Regular Graphs: Cycles



C3



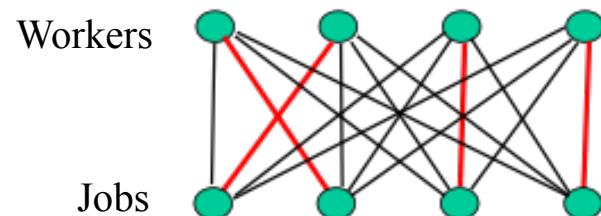
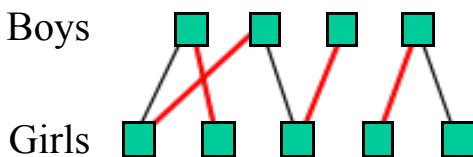
C4



C5

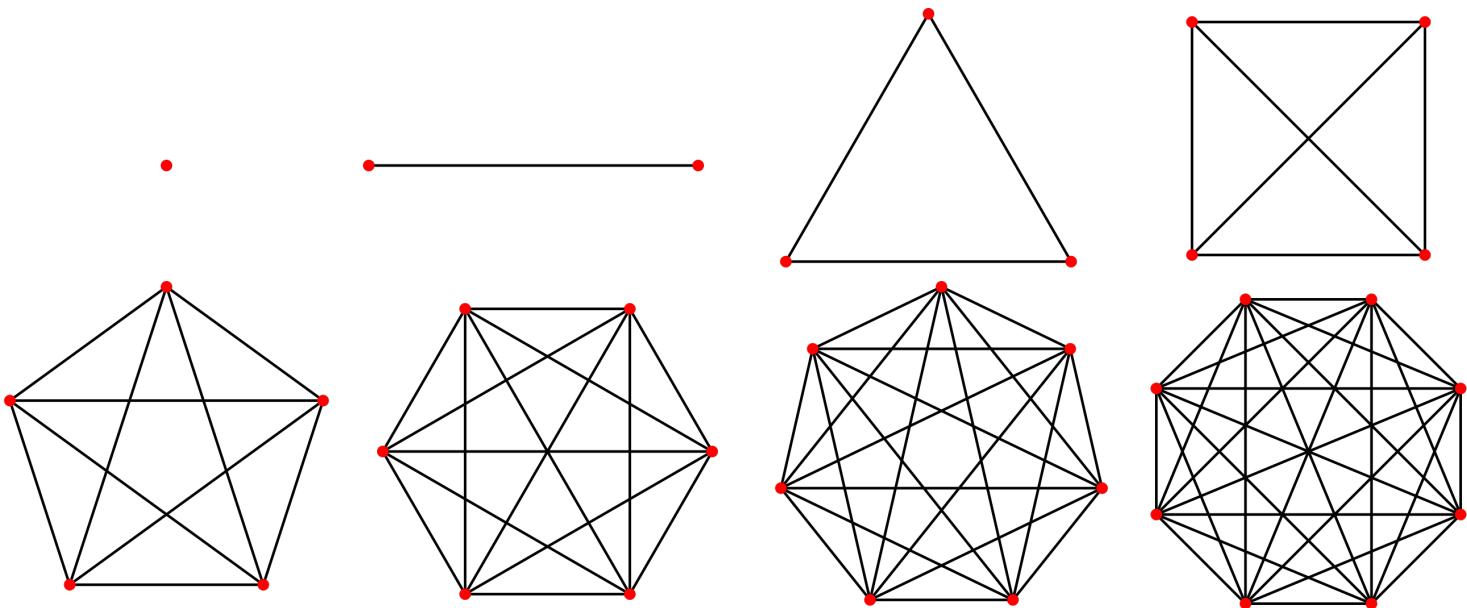
Bipartite Graphs

- A graph G is *bipartite* if $V(G)$ is the union of two disjoint independent sets called *partite sets of G*
- Also: The vertices can be partitioned into two sets such that each set is independent
 - Matching Problem
 - Job Assignment Problem



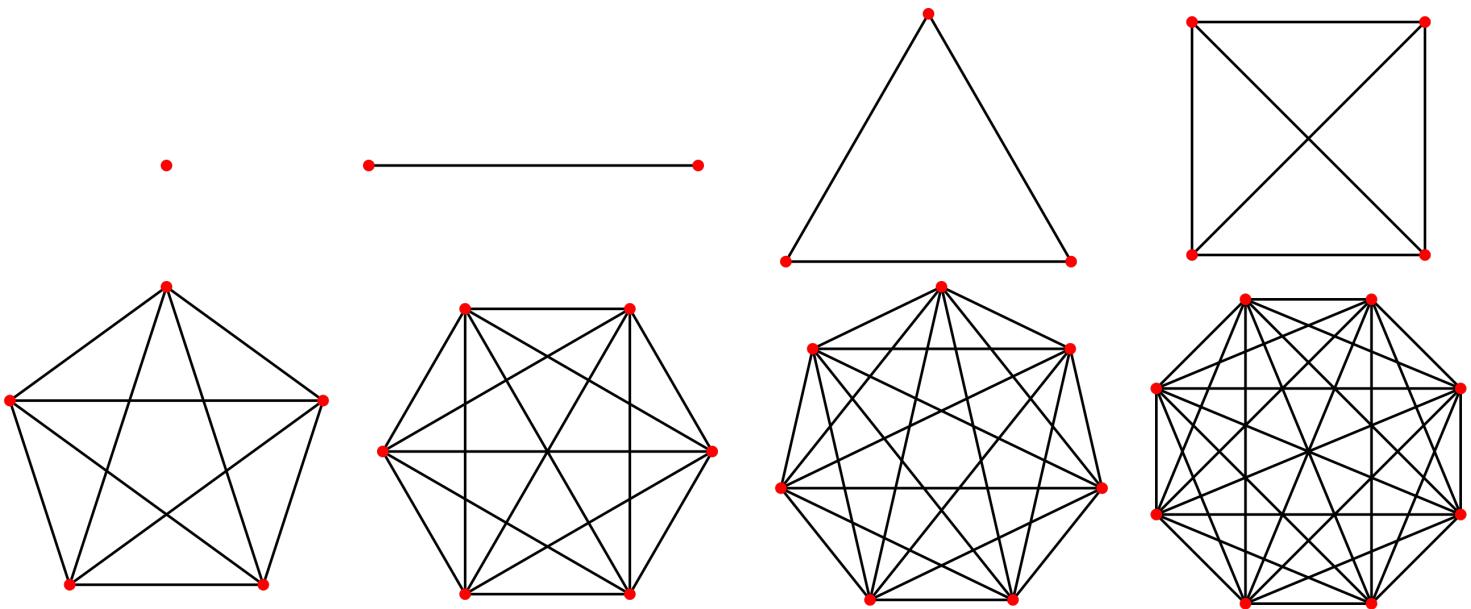
Complete Graph

- Every pair of vertices are adjacent
- For n nodes, how many edges are there?



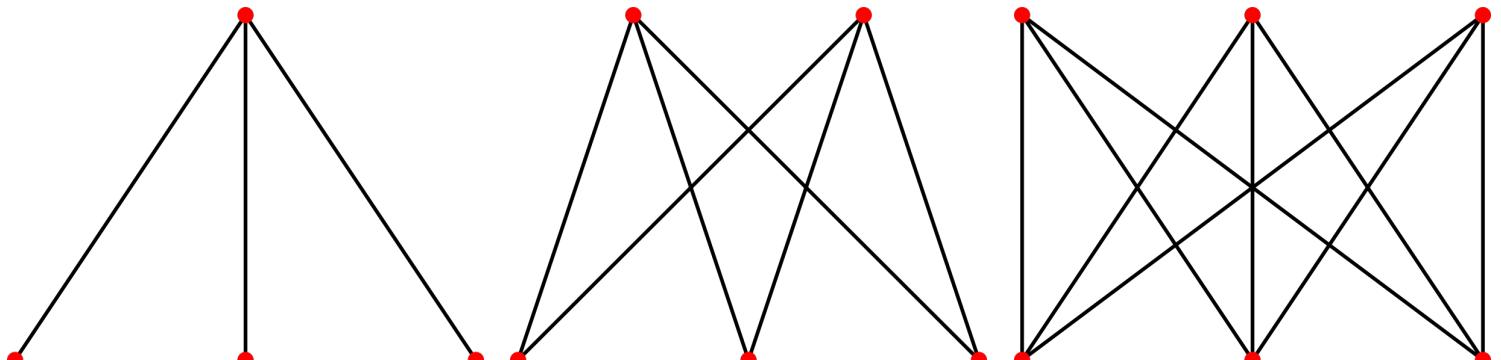
Complete Graph

- Every pair of vertices are adjacent
- Has $n(n-1)/2$ edges



Complete Bipartite Graph

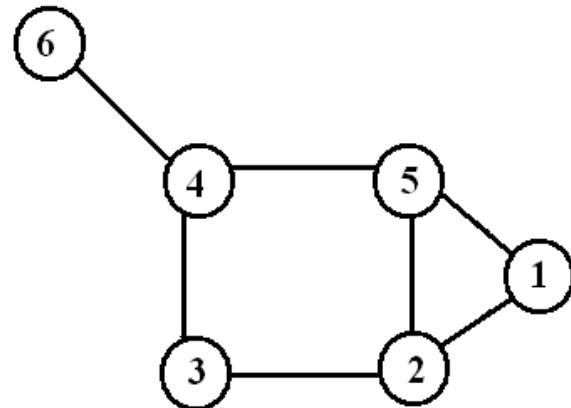
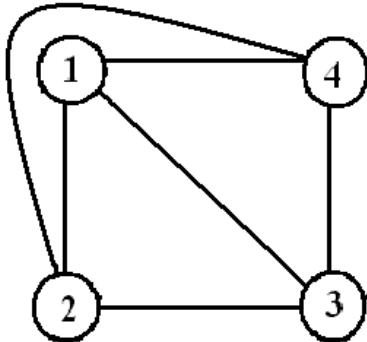
- Bipartite Variation of Complete Graph
- Every node of one set is connected to every other node on the other set



Stars

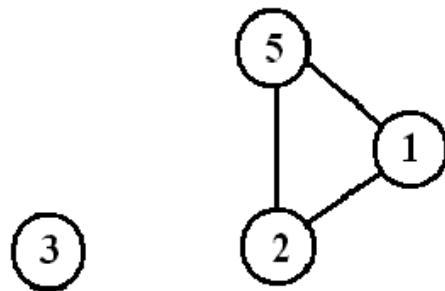
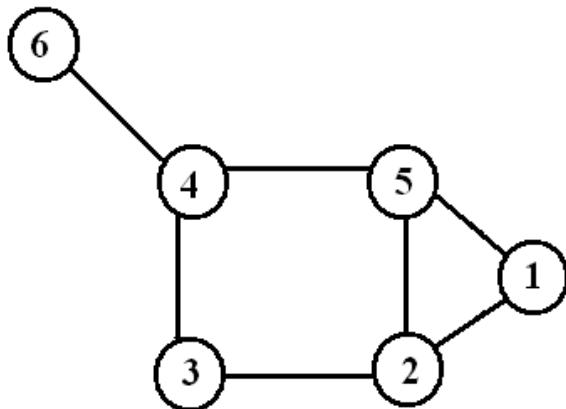
Planar Graphs

- Can be drawn on a plane such that no two edges intersect
- K_4 is the largest complete graph that is planar



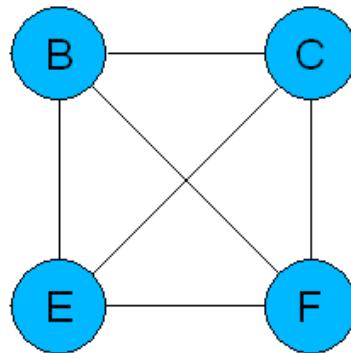
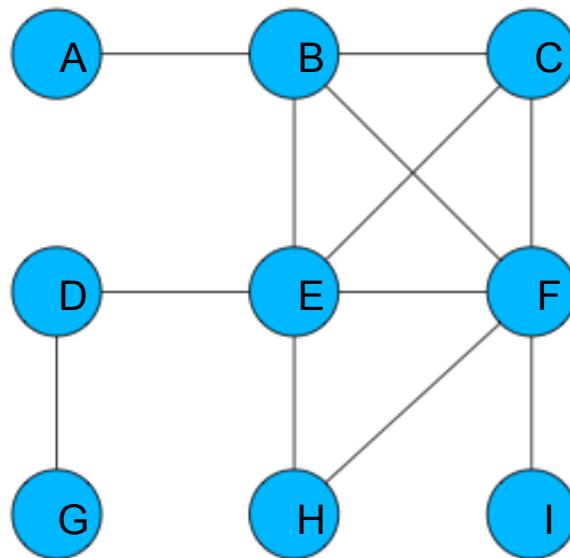
Subgraph

- Vertex and edge sets are subsets of those of G
 - a *supergraph* of a graph G is a graph that contains G as a subgraph.



Special Subgraphs: Cliques

A **clique** is a maximum complete connected subgraph.



GRAPH DATA STRUCTURE

Review

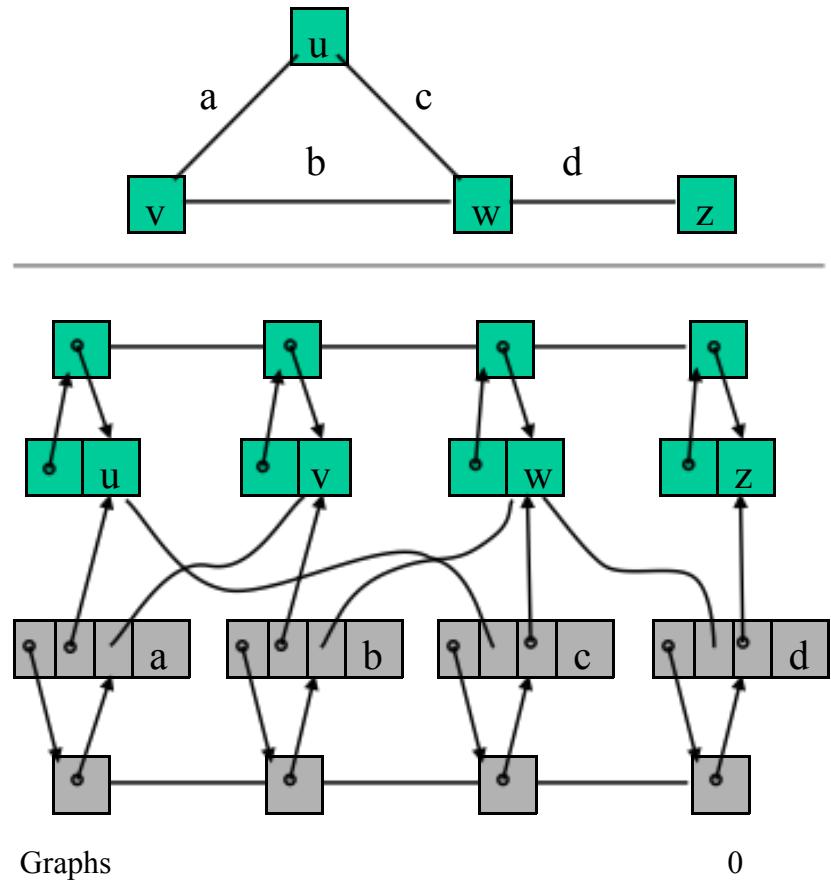
- Graph has two key components that we must keep:
 1. Node / Vertex
 2. Edge
- Can be directional
- Can have weights or more information

Representation (List)

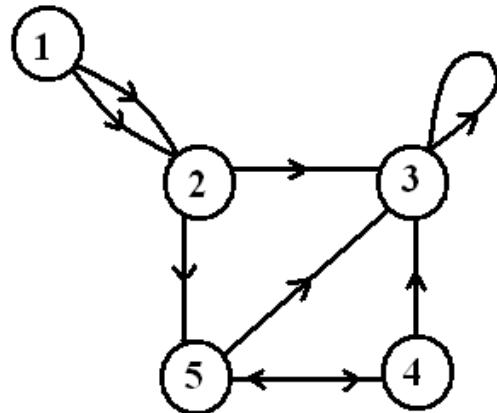
- Edge List
 - pairs (ordered if directed) of vertices
 - Optionally weight and other data
- Adjacency List (node list)
- *Adjacency-list representation*
 - an array of $|V|$ lists, one for each vertex in V .
 - For each $u \in V$, $ADJ[u]$ points to all its adjacent vertices.

Edge List Structure

- Vertex object
 - element
 - reference to position in vertex sequence
- Edge object
 - element
 - origin vertex object
 - destination vertex object
 - reference to position in edge sequence
- Vertex sequence
 - sequence of vertex objects
- Edge sequence
 - sequence of edge objects



Edge and Node Lists



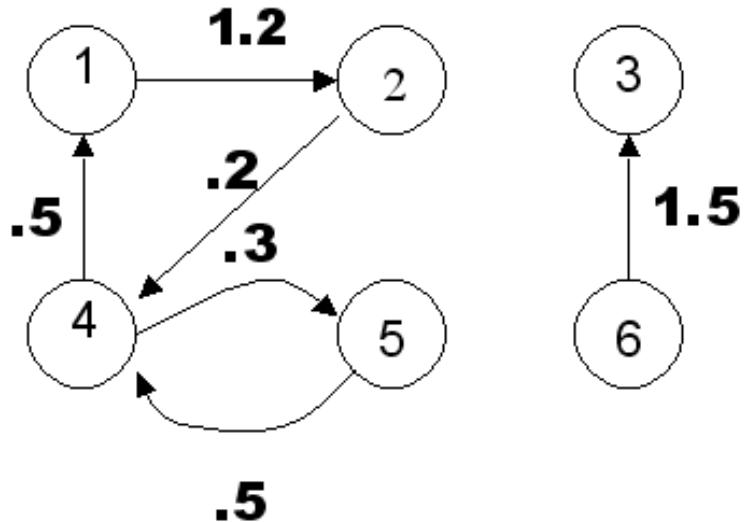
Edge List

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

Node List

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

Edge Lists for Weighted Graphs



Edge List

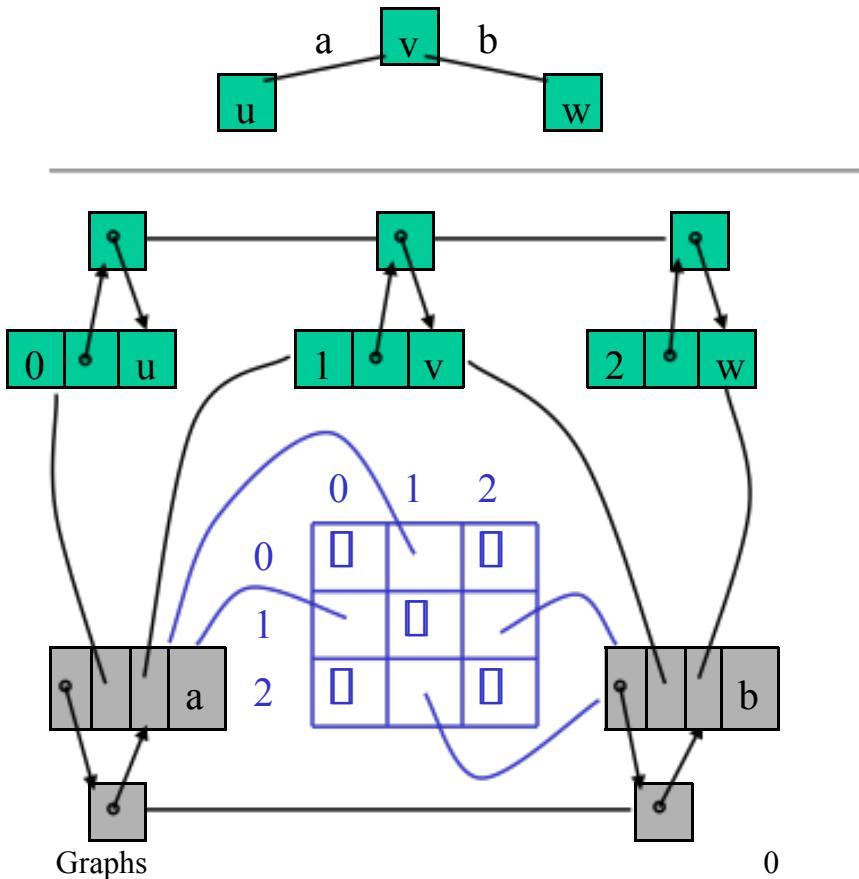
1	2	1.2
2	4	0.2
4	5	0.3
4	1	0.5
5	4	0.5
6	3	1.5

Representation (Matrix)

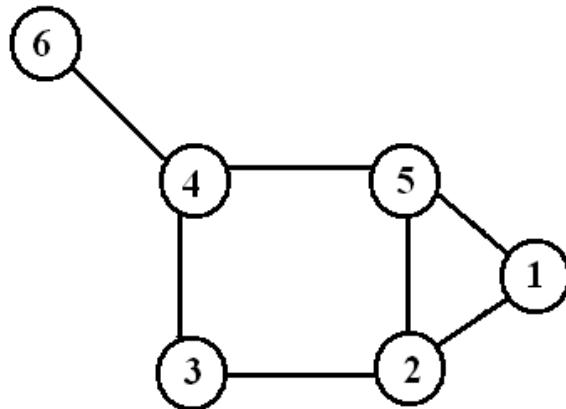
- Incidence Matrix
 - $V \times E$
 - [vertex, edges] contains the edge's data
- Adjacency Matrix
 - $V \times V$
 - Boolean values (adjacent or not)
 - Or Edge Weights

Adjacency Matrix Structure

- Edge list structure
- Augmented vertex objects
 - Integer key (index) associated with vertex
- **2D adjacency array**
 - Reference to edge object for adjacent vertices
 - Null for non adjacent vertices
- The “old fashioned” version just has 0 for no edge and 1 for edge



Adjacency Matrices



	1,2	1,5	2,3	2,5	3,4	4,5	4,6
1	1	1	0	0	0	0	0
2	1	0	1	1	0	0	0
3	0	0	1	0	1	0	0
4	0	0	0	0	1	1	1
5	0	1	0	1	0	1	0
6	0	0	0	0	0	0	1

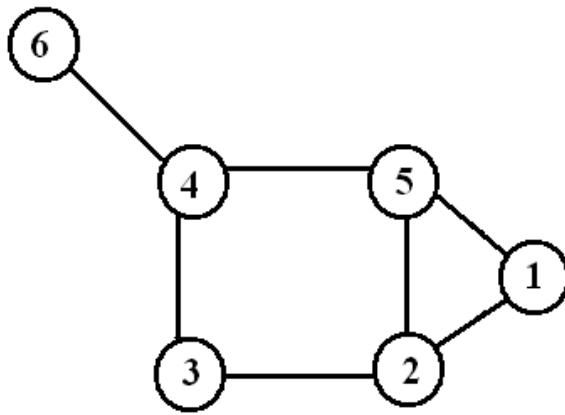
	1	2	3	4	5	6
1	0	1	0	0	1	0
2	1	0	1	0	1	0
3	0	1	0	1	0	0
4	0	0	1	0	1	1
5	1	1	0	1	0	0
6	0	0	0	1	0	0

Topological Distance

- A shortest path is the minimum path connecting two nodes.
- The number of edges in the shortest path connecting p and q is the ***topological distance*** between these two nodes, $d_{p,q}$

Distance Matrix

$|V| \times |V|$ matrix $D = (d_{ij})$ such that
 d_{ij} is the topological distance between i and j .



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

เรื่องที่ต้องคิดในทางปฏิบัติ

- เราเห็นการอธิบายกราฟด้วย Edge listing กับ Adjacency list มาแล้ว
 - แต่คำถามก็คือว่าเราจะเก็บข้อมูลพวกนี้ในหน่วยความจำอย่างไร
(How to keep graph description in memory?)
 - แล้วเราจะทำอะไรกับข้อมูลพวกนี้บ้าง
(What operations are we going to do with a graph?)
- ธรรมชาติของโครงสร้างข้อมูลที่ดีก็คือว่า มันต้องสามารถทำในสิ่งที่เราต้องการทำบ่อย ๆ ได้อย่างมีประสิทธิภาพ
 - เรามักถามว่า โหนดหมายเลข x มีเส้นเชื่อมต่อกับโหนดหมายเลข y หรือไม่
 - เรามักถามว่า มีเส้นทางจาก โหนดหมายเลข x ไปโหนดหมายเลข y หรือไม่

เปรียบเทียบการใช้ Edge listing กับ Adjacency list

อ่าน

- ถ้าเราถามว่าโนนดหมายเลข x มีเส้นเชื่อมต่อกับโนนดหมายเลข y หรือไม่

0	1
1	0 2 3
2	1 3
3	1 2 4
4	3
5	
6	7 8
7	6
8	6

- Edge listing: เราต้องวิ่งไปทั้งลิสต์เพื่อหาว่ามีคู่เส้นเชื่อม (x, y) หรือ (y, x) หรือไม่
 - จากตัวอย่าง เราไม่มีเส้นเชื่อมทั้งหมด 7 เส้น ถ้าถามแบบนี้ 100 รอบ ในกรณีที่เลขรายที่สุดก็ต้องวิ่งหาเส้นเชื่อมทั้งหมด 700 ครั้ง
- Adjacency list: เราสร้างลิสต์แยกของแต่ละโนนดออกมา แล้วตรวจเฉพาะลิสต์ของโนนดที่สนใจ เช่นถ้า $x = 1$ และ $y = 2$
 - เราเก็บตรวจเฉพาะลิสต์ของโนนด 1 หรือโนนด 2 อย่างใดอย่างหนึ่ง
 - ถ้าเราเลือกตรวจลิสต์โนนด 1 เราจะใช้เวลาตรวจรอบละ 3 ครั้ง ถ้าต้องตรวจ 100 รอบ ก็เสียเวลาแค่ 300 ครั้ง
- Adjacency list เร็วกว่ามาก ดังนั้นเรามาดูเรื่องวิธีเก็บในหน่วยความจำ

การเก็บโครงสร้างกราฟในหน่วยความจำ

- อย่างที่บอกไว้ตั้งแต่ต้นว่ากราฟคือโครงสร้างข้อมูล
→ ถ้าเราไม่รู้ว่าจะเก็บโครงสร้างข้อมูลไว้ได้อย่างไรก็ไม่มีความหมาย
- สมมติว่าเรารู้จำนวนโหนดและเส้นเชื่อมของแต่ละโหนดว่าเป็นจำนวนที่แน่นอนตามตัวในกราฟที่เราสนใจ

0	1
1	0 2 3
2	1 3
3	1 2 4
4	3
5	
6	7 8
7	6
8	6

- ดังนั้นโหนดแต่ละโหนดจะมีอาร์ของเลขจำนวนเต็มเพื่อเก็บว่ามันเชื่อมต่อกับใครอยู่บ้าง
- เราสามารถนำอาร์ของแต่ละโหนดมามัดรวมกันเป็นอาร์สองมิติ
 - มิติแรกจะบุ่าว่าเป็นลิสต์ของโหนดไหน
 - มิติที่สองจะบุ่าว่าโหนดที่สนใจเชื่อมกับใคร
 - ขนาดของมิติที่สองของแต่ละโหนดต่างกันได้ (แบลกใจมั้ย)

ตัวอย่างการเก็บ Adjacency list

```
0 1  
1 0 2 3  
2 1 3  
3 1 2 4  
4 3  
5  
6 7 8  
7 6  
8 6
```

```
public class GraphStructDemo {  
    int[][] arNode;  
  
    private void prepareSpace() {  
        arNode = new int[9][];  
  
        arNode[0] = new int[1];  
        arNode[1] = new int[3];  
        arNode[2] = new int[2];  
        arNode[3] = new int[3];  
        arNode[4] = new int[1];  
        .  
        .  
        arNode[5] = new int[0];  
        arNode[6] = new int[2];  
        arNode[7] = new int[1];  
        arNode[8] = new int[1];  
    }  
}
```

ประกาศอาร์เรย์สำหรับเก็บข้อมูล
การเชื่อมต่อไว้

เริ่มสร้างอาร์เรย์ แต่อย่าเพิ่งรีบบอก
ขนาดของมิติที่สอง เก็บไว้ทำทีหลัง
ได้ (ทำแบบนี้ได้จริง ๆ นะ)

ระบุขนาดของลิสต์การเชื่อมต่อของ
แต่ละโหนดทีละอันตามปริมาณที่
ต้องใช้จริง

ป้อนข้อมูลเข้า Adjacency list

```
private void insertData() {  
    arNode[0][0] = 1;  
    arNode[1][0] = 0;    arNode[1][1] = 2;    arNode[1][2] = 3;  
    arNode[2][0] = 1;    arNode[2][1] = 3;  
    arNode[3][0] = 1;    arNode[3][1] = 2;    arNode[3][2] = 4;  
    arNode[4][0] = 3;  
  
    //arNode[5][]; // No edge to insert  
    arNode[6][0] = 7;    arNode[6][1] = 8;  
    arNode[7][0] = 6;  
    arNode[8][0] = 6;  
}
```

ตรวจว่าโหนดเชื่อมกันหรือไม่

การตรวจดูว่าโหนด x เชื่อมกับโหนด y หรือไม่

```
public boolean isLinked(int x, int y) {  
    int numNodes = arNode[x].length;  
  
    for(int i = 0; i < numNodes; ++i) {  
        if(arNode[x][i] == y) {  
            return true; // y is found  
        }  
    }  
  
    return false; // y not found  
}
```

เนื่องจากอาร์เรย์ของแต่ละโหนดมีความยาวไม่เท่ากัน เราจึงต้องหาความยาวลิสต์ของโหนดมาเก็บไว้ก่อน

จากโครงสร้างของลูป เราเห็นได้ว่าการจะทำการเชื่อมต่อของโหนด ในกรณีที่แย่ที่สุด เกิดขึ้นเมื่อไม่พบการเชื่อมต่อ (return false) เพราะเราจะต้องหาตั้งแต่เริ่มจนจบ

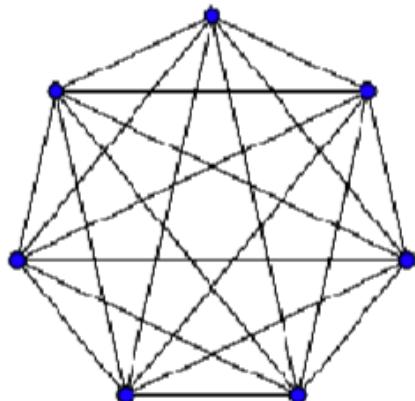
มีวิธีที่ทำให้ฟังก์ชันนี้ทำงานเร็วขึ้นหรือไม่ ?

ทำอย่างไรจึงจะหาคำตอบเกี่ยวกับการเชื่อมต่อได้เร็ว ๆ

- จากฟังก์ชัน `isLinked` ลูปเป็นบริเวณที่ใช้เวลาในการค้นหานานที่สุด
- แต่เรากรุ่มก่อนแล้วว่าวิธีที่ใช้ในการค้นหาที่เร็วนั้นมีอยู่
 - เช่น การใช้ **binary search** จะย่นเวลาในการหาข้อมูลในแต่ละลิสต์ เหลือเพียง $O(\log M)$ เมื่อ M คือจำนวนโหนดในลิสต์ที่เราสนใจ
 - ดังนั้นถ้าเราจัดเรียงข้อมูลในลิสต์แต่ละอันก่อน เราจะสามารถใช้ **binary search** เพื่อทำให้การหาคำตอบเกี่ยวกับการเชื่อมต่อเป็นไปอย่างรวดเร็ว
- แล้วที่จริงยังมีทางทำให้เร็วกว่า $O(\log M)$ หรือไม่
 - มีเหมือนกัน แต่เราต้องเลิกใช้ **Adjacency list** และไปใช้ของอย่างอื่นแทน

หน่วยความจำที่ต้องใช้ในการอธิบายโครงสร้างกราฟ

- การใช้ Edge listing หรือ Adjacency list เหมาะกับกราฟที่มีเส้นเชื่อมน้อยเมื่อเทียบกับจำนวนโหนด (เหมาะสมกับ Sparse Graph)
- ลองพิจารณากราฟที่มีเส้นเชื่อมสมบูรณ์ (Complete Graph)



กราฟมี 7 โหนด 21 เส้นเชื่อม

Edge listing ใช้พื้นที่เก็บเลขจำนวนเต็ม 2 ตัวต่อเส้นเชื่อม

→ ใช้ integer 42 ตัว (168 bytes)

→ ถ้าเส้นเชื่อมมาก ปริมาณหน่วยความจำที่ต้องใช้จะเพิ่มขึ้นมากตาม

→ กราฟจำนวนมากมีปริมาณเส้นเชื่อมเป็น $O(|V|^2)$
[$|V$ คือจำนวนโหนด $|V|$ ก็คือจำนวนโหนดในเซ็ต]

ดังนั้นปริมาณเส้นเชื่อมและหน่วยความจำที่ต้องใช้จึงอยู่ในระดับ $O(|V|^2)$ ไปด้วย

หน่วยความจำที่ต้องใช้ในการอธิบายโครงสร้างกราฟ (2)

- แล้วถ้าเป็น Adjacency matrix ล่ะ
 - เนื่องจากเป็นอาร์เรย์สองมิติ เราเห็นได้ชัดว่าใช้หน่วยความจำ $O(|V|^2)$
 - แต่ว่าเราไม่จำเป็นต้องเก็บเลขจำนวนเต็มเหมือนกับการใช้ลิสต์
 - ถ้าเราใช้ boolean เราจะเสียพื้นที่ต่อช่อง 1 ไบต์ (ถ้าเป็นจำนวนเต็มแบบลิสต์จะใช้ 4 ไบต์)
 - ถ้าเราใช้ `java.util.BitSet` เราจะใช้พื้นที่ต่อช่องแค่ 1 บิต
- ด้วยเทคนิคด้านการจัดการหน่วยความจำ ถ้ากราฟมีเส้นเชื่อมมาก ๆ การใช้ Adjacency matrix เป็นทางออกที่ดีที่สุดอย่างไม่ต้องสงสัย
 - ตอบคำถามเรื่องการเชื่อมต่อได้เร็วกว่า เข้าใจง่ายกว่า
 - ถ้าเส้นเชื่อมมากพอก็ มักจะใช้หน่วยความจำน้อยกว่าด้วย

Asymptotic Performance

<ul style="list-style-type: none"> • n vertices, m edges • no parallel edges • no self-loops • Bounds are “big-Oh” 	Edge List	Adjacency List	Adjacency Matrix
Space	$n + m$	$n + m$	n^2
incidentEdges(v)	m	$\deg(v)$	n
areAdjacent (v, w)	m	$\min(\deg(v), \deg(w))$	1
insertVertex(o)	1	1	n^2
insertEdge(v, w, o)	1	1	1
removeVertex(v)	m	$\deg(v)$	n^2
removeEdge(e)	1	1	1

BASIC GRAPH THEORY

Walks

A *walk of length k* in a graph is a succession of k (not necessarily different) edges of the form

$uv, vw, wx, \dots, yz.$

This walk is denote by $uvw\cdots xz$, and is referred to as a *walk between u and z*.

A walk is *closed* is $u=z$.

Walks VS. Trails

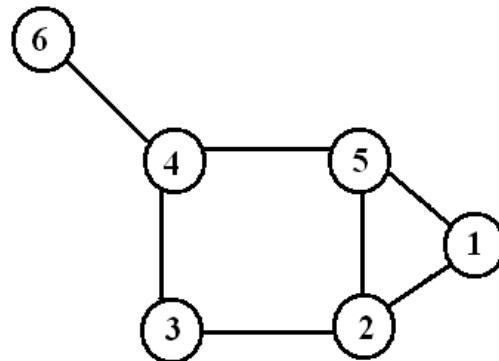
- A **walk** : a list of vertices and edges $v0, e1, v1, \dots, ek, vk$ such that, for $1 \leq i \leq k$, the edge ei has endpoints $vi-1$ and vi .
- A **trail** : a walk with no repeated edge.

Circuit

- A circuit is a closed trail (A trail whose starting and ending nodes are the same).

Path

- A *path* is a walk in which all the edges and all the nodes are different.
- Note: The length of a walk, trail, path, or cycle is its number of edges.



Walks and Paths

1,2,5,2,3,4

walk of length 5

1,2,5,2,3,2,1

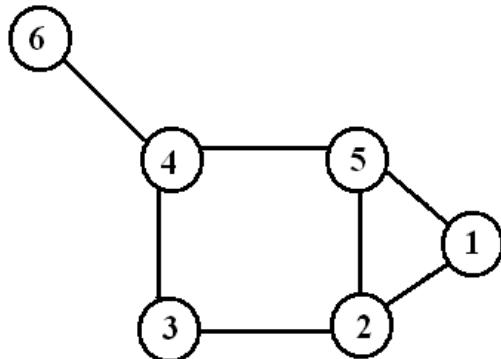
CW of length 6

1,2,3,4,6

path of length 4

Cycle

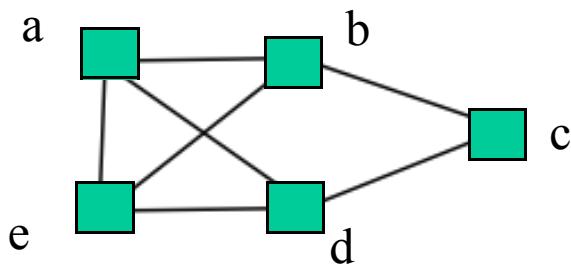
- A *cycle* is a closed walk in which all the edges are different.



1,2,5,1 2,3,4,5,2
3-cycle 4-cycle

Checkpoint: Path and Cycle

- **Path** : a sequence of **distinct** vertices such that two consecutive vertices are adjacent
 - Example: (a, d, c, b, e) is a path
 - (a, b, e, d, c, b, e, d) is not a path; it is a walk
- **Cycle** : a closed Path
 - Example: (a, d, c, b, e, a) is a cycle



Lemma: Every u,v -walk contains a u,v -path 1.2.5

Proof:

- Use induction on the length of a u, v -walk W .
- Basis step: $l = 0$.
 - Having no edge, W consists of a single vertex ($u=v$).
 - This vertex is a u,v -path of length 0.

to be continued

Lemma: Every u,v -walk contains a u,v -path 1.2.5

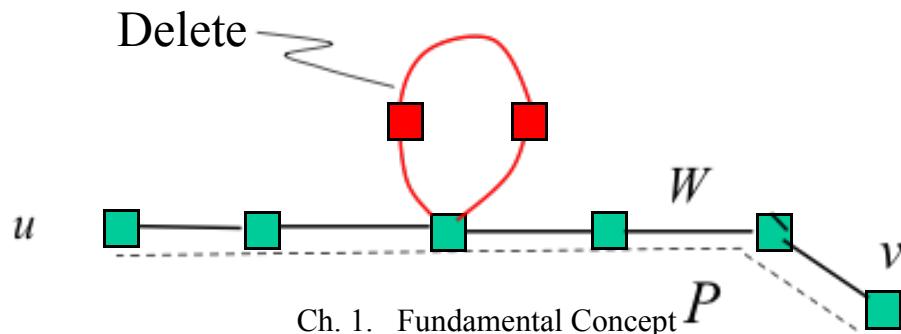
Proof: Continue

- Induction step : $l \square 1.$
- Suppose that the claim holds for walks of length less than l .
- If W has no repeated vertex, then its vertices and edges form a u,v -path.

Lemma: Every u,v -walk contains a u,v -path 1.2.5

Proof: Continue

- Induction step : $l \sqsupseteq 1$. Continue
- If W has a repeated vertex w , then deleting the edges and vertices between appearances of w (leaving one copy of w) yields a shorter u,v -walk W' contained in W .
- By the induction hypothesis, W' contains a u,v -path P , and this path P is contained in W .

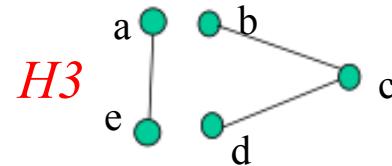
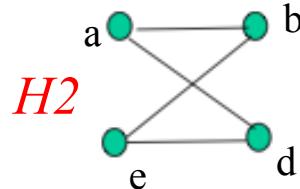
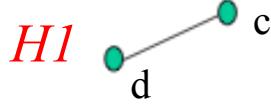


Connectivity

- a graph is *connected* if
 - you can get from any node to any other by following a sequence of edges OR
 - any two nodes are connected by a path.
- A directed graph is *strongly connected* if there is a directed path from any node to any other node.

Connected and Disconnected

- ***Connected*** : There exists at least one path between two vertices
- ***Disconnected*** : Otherwise
- Example:
 - $H1$ and $H2$ are connected
 - $H3$ is disconnected

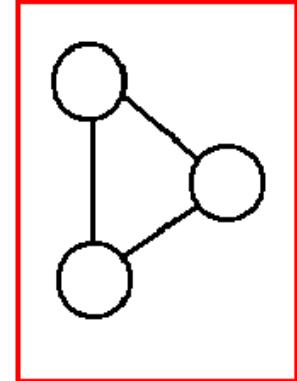
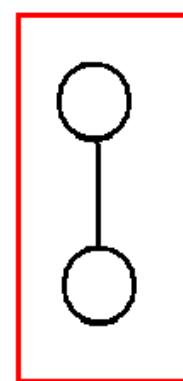
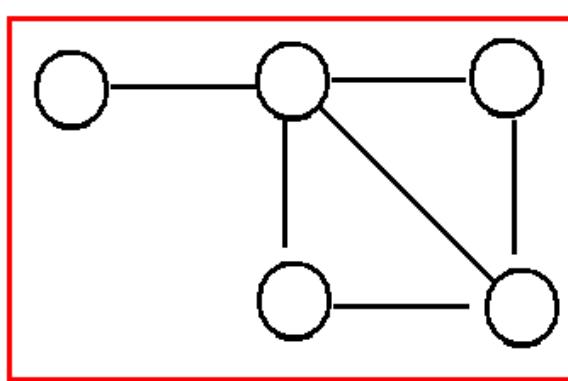


Theorem: *There is a simple path between every pair of distinct vertices of a connected undirected graph.*

Proof Idea: Let u and v be two distinct vertices of the connected undirected graph $G = (V, E)$. Since G is connected, there is at least one path between u and v .

Component

- Every disconnected graph can be split up into a number of connected *components*.



Theorem: Every graph with n vertices and k edges has at least $n-k$ components 1.2.11

Proof:

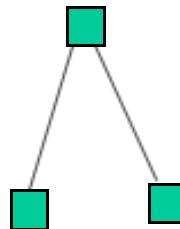
- An n -vertex graph with no edges has n components
- Each edge added reduces this by at most 1
- If k edges are added, then the number of components is at least $n - k$

Theorem: Every graph with n vertices and k edges has at least $n-k$ components 1.2.11

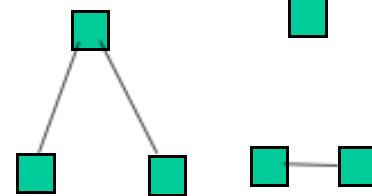
- Examples:



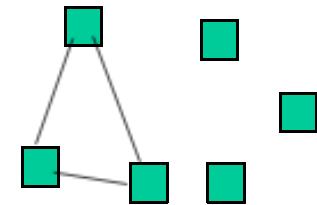
$n = 2, k = 1,$
1 component



$n = 3, k = 2,$
1 component



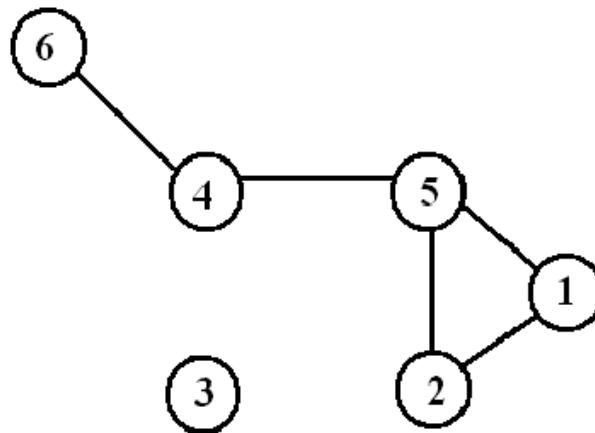
$n = 6, k = 3,$
3 components



$n = 6, k = 3,$
4 components

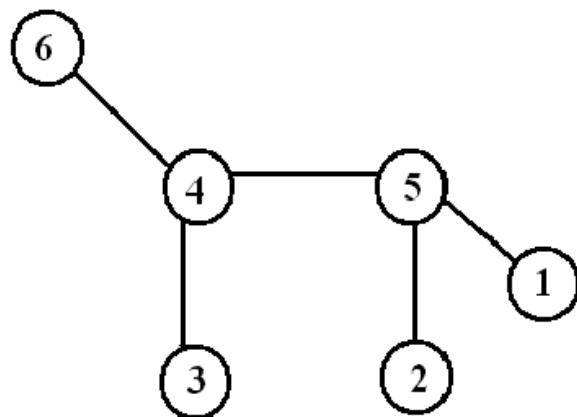
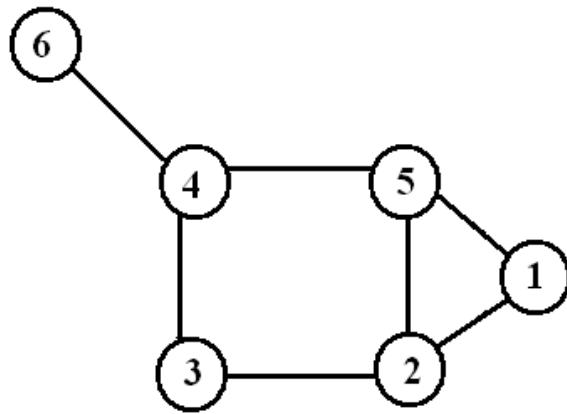
Spanning subgraph

- Subgraph H has the same vertex set as G .
 - Possibly not all the edges
 - “ H spans G ”.



Spanning tree

- Let G be a connected graph. Then a *spanning tree* in G is a subgraph of G that includes every node and is also a tree.



Isomorphism

- Bijection, i.e., a one-to-one mapping:
$$f : V(G) \rightarrow V(H)$$

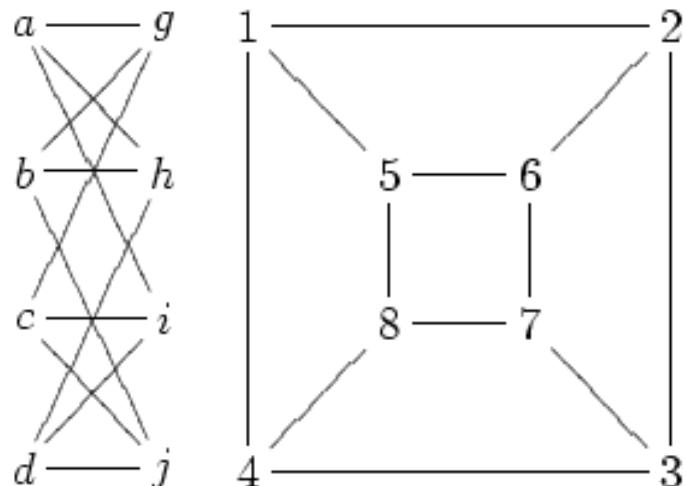
u and v from G are adjacent if and only if
 $f(u)$ and $f(v)$ are adjacent in H.
- If an isomorphism can be constructed
between two graphs, then we say those
graphs are *isomorphic*.

Isomorphism Problem

Determining whether two graphs are isomorphic

Although these graphs look very different, they are isomorphic; one isomorphism between them is

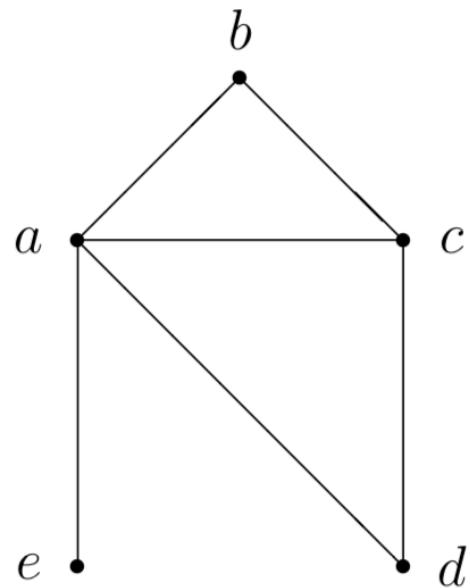
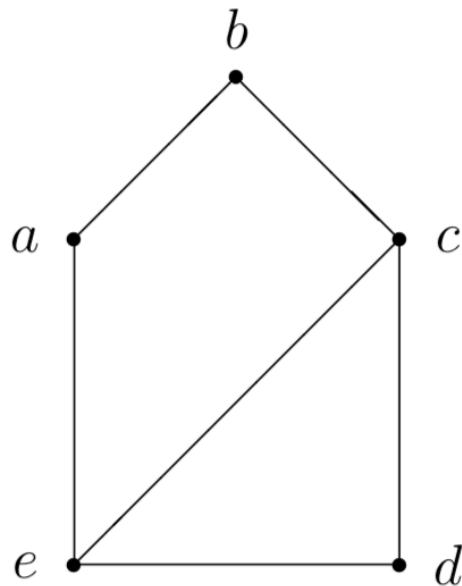
$$\begin{aligned} f(a) &= 1 & f(b) &= 6 & f(c) &= 8 & f(d) &= 3 \\ f(g) &= 5 & f(h) &= 2 & f(i) &= 4 & f(j) &= 7 \end{aligned}$$



Two graphs are not isomorphic

- Show that they do not share a property that isomorphic simple graphs must have:
 - Have the same number of vertices
 - Have the same number of edges
 - The degrees of the vertices in isomorphic simple graphs must be the same.

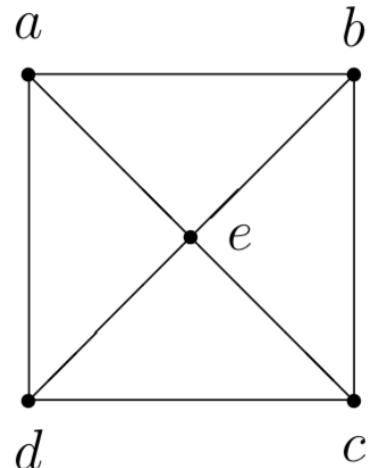
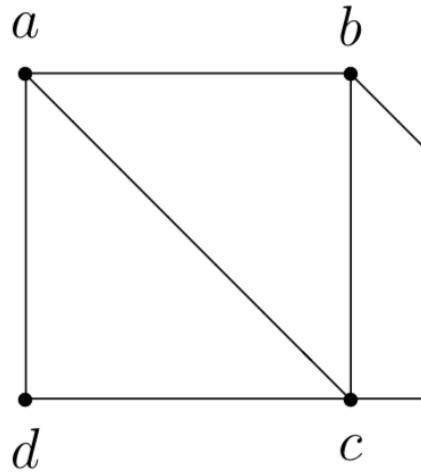
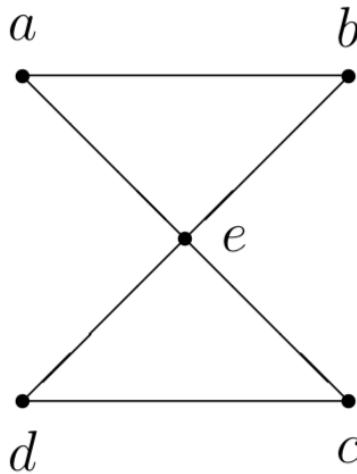
Show that the following two graphs
are not isomorphic.



Euler circuit

- *Definition:* An **Euler circuit** in a graph G is a simple circuit containing every edge of G . (An Euler path in G is a simple path containing every edge of G).

Which of the following graphs
have an Euler circuit?



Theorem: A connected multigraph has an Euler circuit if and only if each of its vertices has even degree.

- How should we construct an Euler Circuit from such graph?

Constructing Euler Circuits

procedure *Euler* (G : connected multigraph with all vertices of even degree)

circuit:= a circuit in G beginning at an arbitrarily chosen vertex with edges successively added to form a path that returns to this vertex

$H := G$ with the edges of this circuit removed

while H has edges

begin

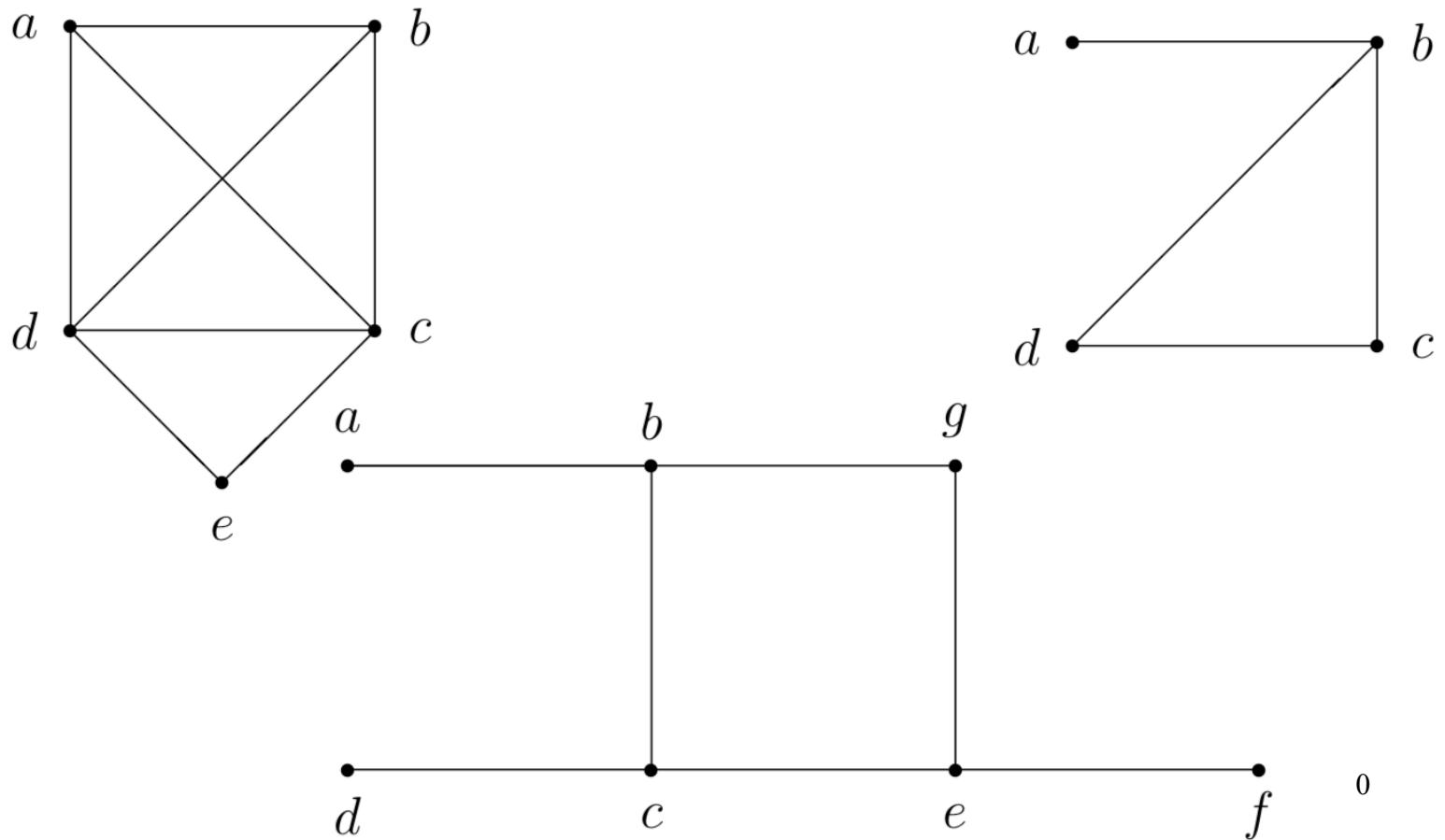
subcircuit := a circuit in H beginning at a vertex in H that also is an endpoint of an edge of circuit

$H := H$ with edges of *subcircuit* and all isolated vertices removed

circuit := circuit with *subcircuit* inserted at the appropriate vertex

end { circuit is an Ruler circuit }

Definition 2.9 A path v_0, v_1, \dots, v_n in the graph $G = (V, E)$ is called a Hamilton path if $V = \{v_0, v_1, \dots, v_{n-1}, v_n\}$ and $v_i \neq v_j$ for $0 \leq i < j \leq n$. A circuit $v_0, v_1, \dots, v_{n-1}, v_n, v_0$ (with $n > 1$) in a graph $G = (V, E)$ is called a Hamilton circuit if $v_0, v_1, \dots, v_{n-1}, v_n$ is a Hamilton path.



Theorem 2.10 (*Dirac*) *If G is a simple graph with n vertices with $n \geq 3$, such that the degree of each vertex is at least $n/2$, then G has a Hamilton circuit.*

Theorem 2.11 (*Ore*) *If G is a simple graph with n vertices with $n \geq 3$, such that $\deg(u) + \deg(v) \geq n$ for every pair of nonadjacent vertices u and v in G , then G has a Hamilton circuit.*

Check Point:

Main Methods of the Graph ADT

- Vertices and edges
 - are positions
 - store elements
- Accessor methods
 - aVertex()
 - incidentEdges(v)
 - endVertices(e)
 - isDirected(e)
 - origin(e)
 - destination(e)
 - opposite(v, e)
 - areAdjacent(v, w)
- Update methods
 - insertVertex(o)
 - insertEdge(v, w, o)
 - insertDirectedEdge(v, w, o)
 - removeVertex(v)
 - removeEdge(e)
- Generic methods
 - numVertices()
 - numEdges()
 - vertices()
 - edges()

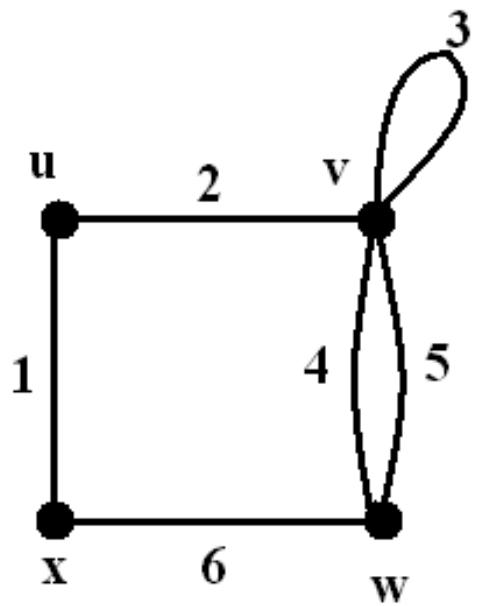
References

- Aldous & Wilson, *Graphs and Applications. An Introductory Approach*, Springer, 2000.
- Wasserman & Faust, *Social Network Analysis*, Cambridge University Press, 2008.

Exercise 1

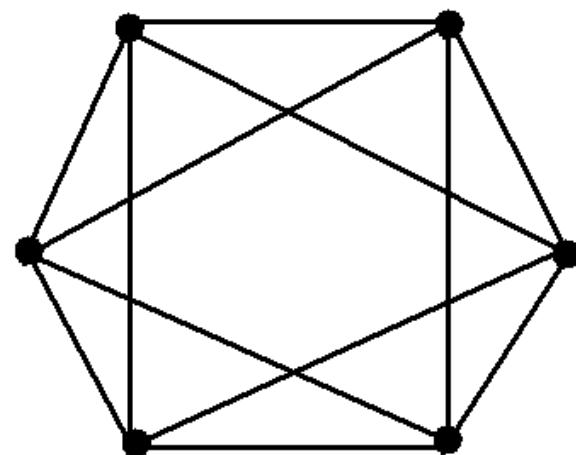
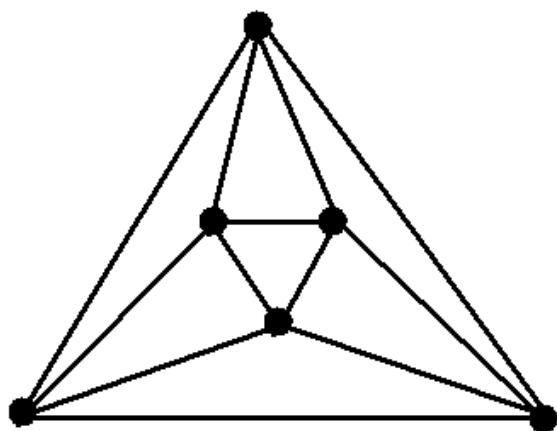
Which of the following statements hold for this graph?

- (a) nodes v and w are adjacent;
- (b) nodes v and x are adjacent;
- (c) node u is incident with edge 2;
- (d) Edge 5 is incident with node x.



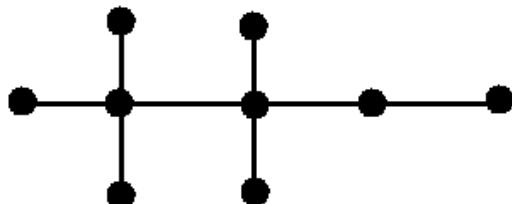
Exercise 2

Are the following two graphs isomorphic?

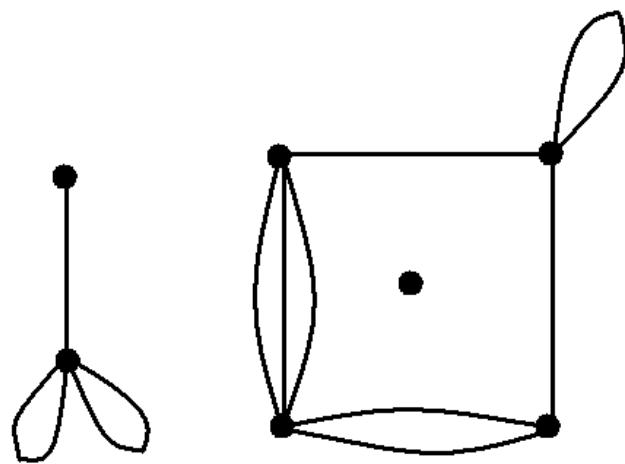


Exercise 3

Write down the degree sequence of each of the following graphs:



(a)

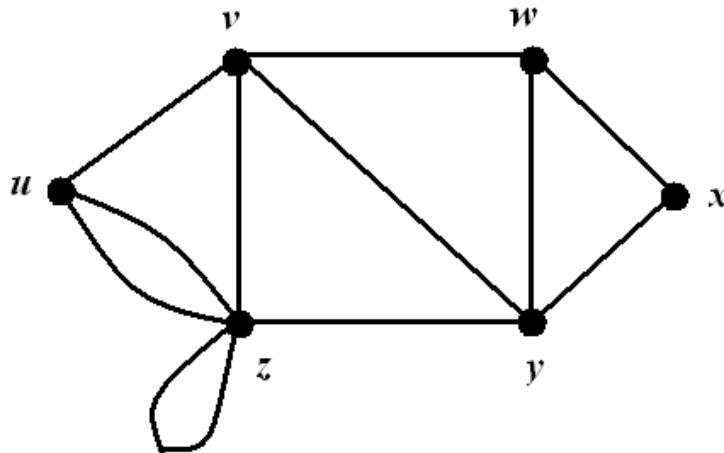


(b)

Exercise 3

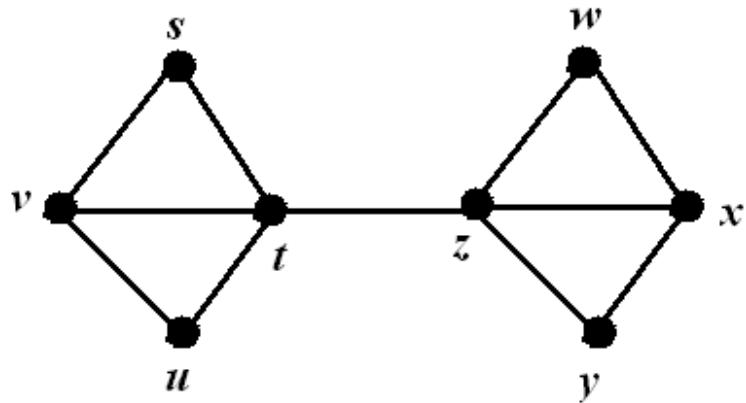
Complete the following statements concerning the graph given below:

- (a) $xyzzvy$ is a _____ of length ____ between ___ and ___;
- (b) $uvyz$ is _____ of length ____ between ___ and ___.



Exercise 4

Write down all the paths between s and y in the following graph. Build the distance matrix of the graph.



Exercise 5

Draw all the non-isomorphic trees with 6 nodes.

Exercise 6

Draw the graphs given by the following representations:

Node list

1 2 3 4

2 4

3 4

4 1 2 3

5 6

6 5

Edge list

1 2

1 4

2 2

2 4

2 4

3 2

4 3

Adjacency matrix

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

Exercise 7*

- (a) Complete the following tables for the number of walks of length 2 and 3 in the above digraph.
- .
- .
- .
- (b) Find the matrix products A^2 and A^3 , where A is the Adjacency matrix of the above digraph.
- (c) Comment on your results.