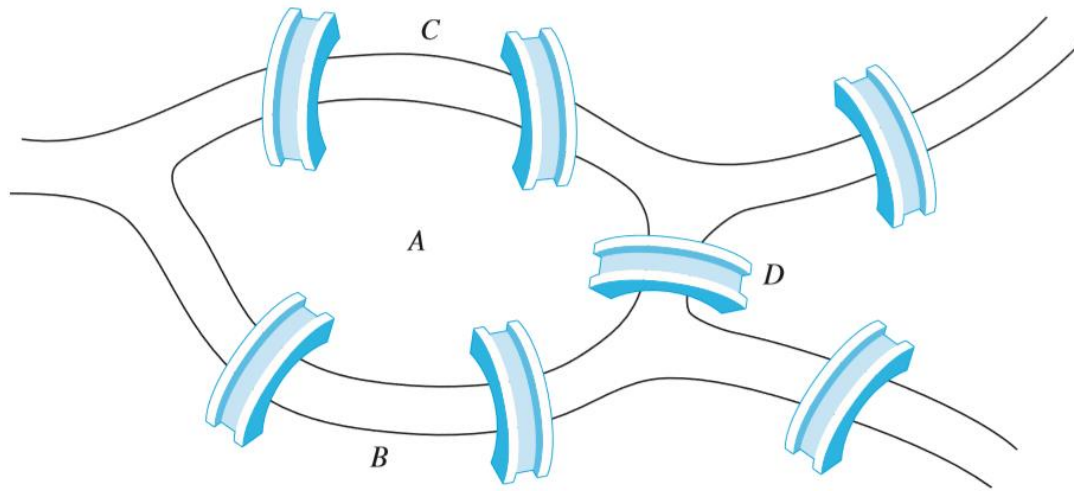


Chapter 9-Graphs

“One graph is worth a thousand logs.”

Michal Aharon, Gilad Barash, Ira Cohen and Eli Mordechai.

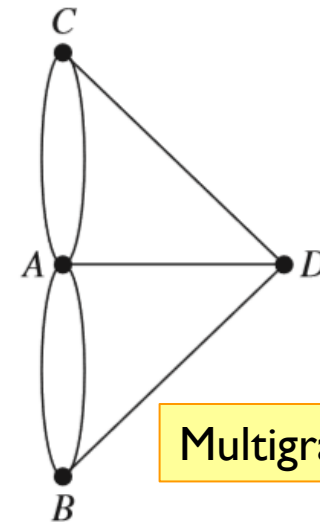
Introduction



The Seven Bridges of Königsberg.



LEONHARD **EULER**
(1707–1783)



Multigraph Model

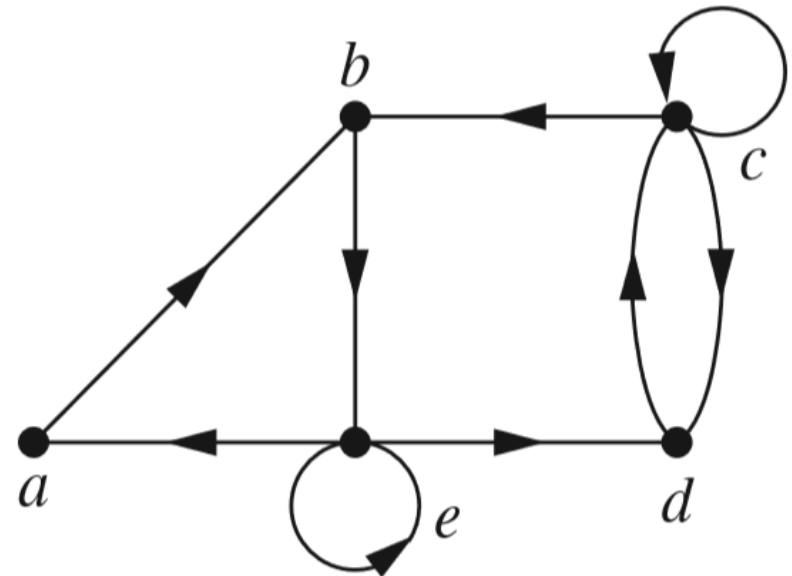
Introduction

Web Graph
Google PageRank

```
> G<-make_graph(e,v)
> page.rank(G)
$vector
[1] 0.1064619 0.1922395 0.2532244 0.1782088 0.2698655

$value
[1] 1

$options
NULL
```



A network with **5 websites** and **links**

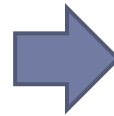
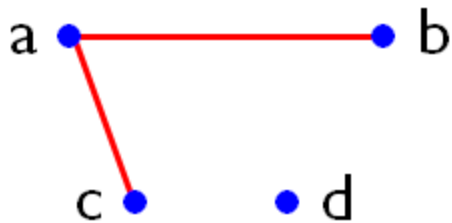
Objectives

- ▶ 9.1- Graphs and Graph Models
 - ▶ 9.2- Graph Terminology and Special Types of Graphs
 - ▶ 9.3- Representing Graphs and Graph Isomorphism
 - ▶ 9.4- Connectivity
 - ▶ 9.5- Euler and Hamilton Paths
 - ▶ 9.6- Shortest Path Problems
-

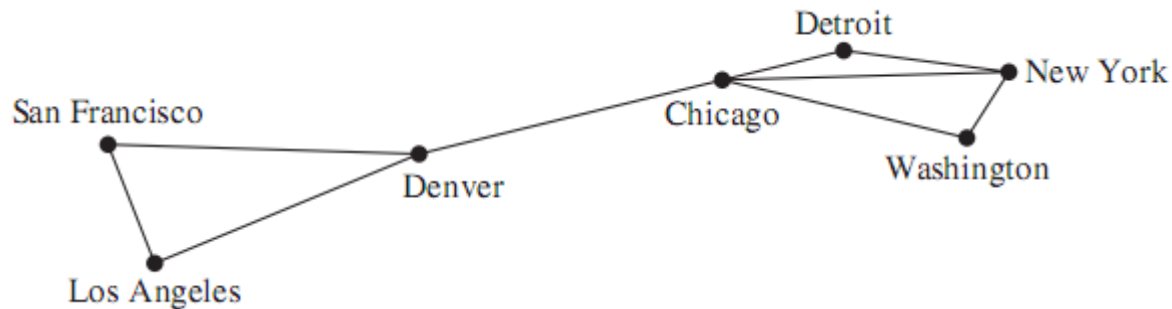


Graphs

► Graphs = (vertices, edges) $\rightarrow G = (V, E)$

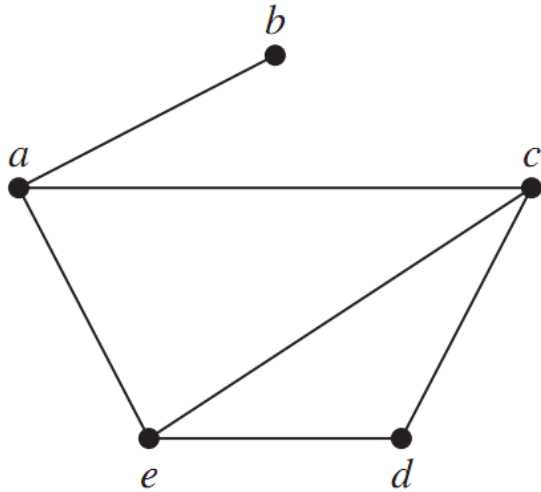


$V = \text{vertices} = \{ a, b, c, d \}$
 $E = \text{edges} = \{ \{a, b\}, \{a, c\} \}$

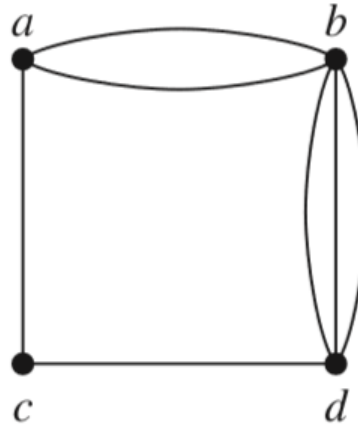


Computer network

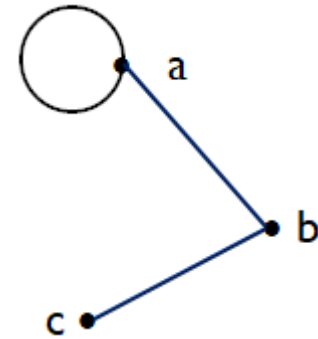
Simple graphs



Simple graph

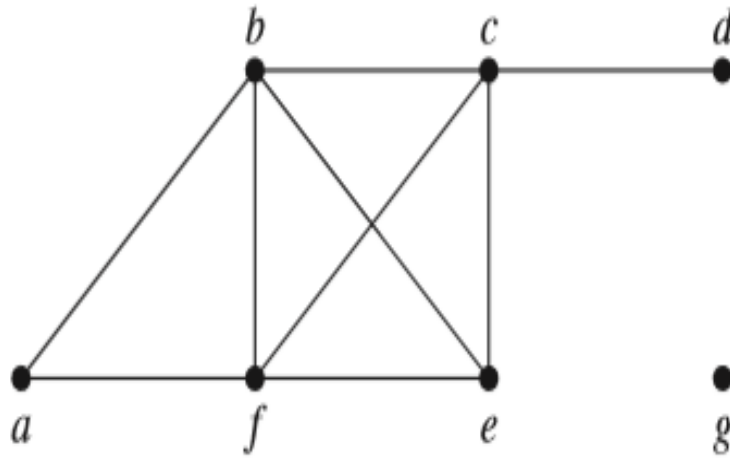


Non-simple graph
with *multi-edges*

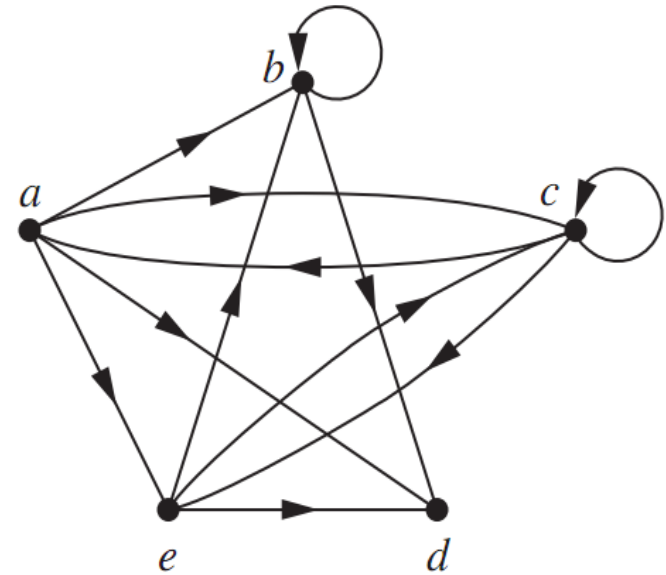


Non-simple graph
with *loops*

Types of graphs



An **undirected** graph



A **directed** graph
(digraph)

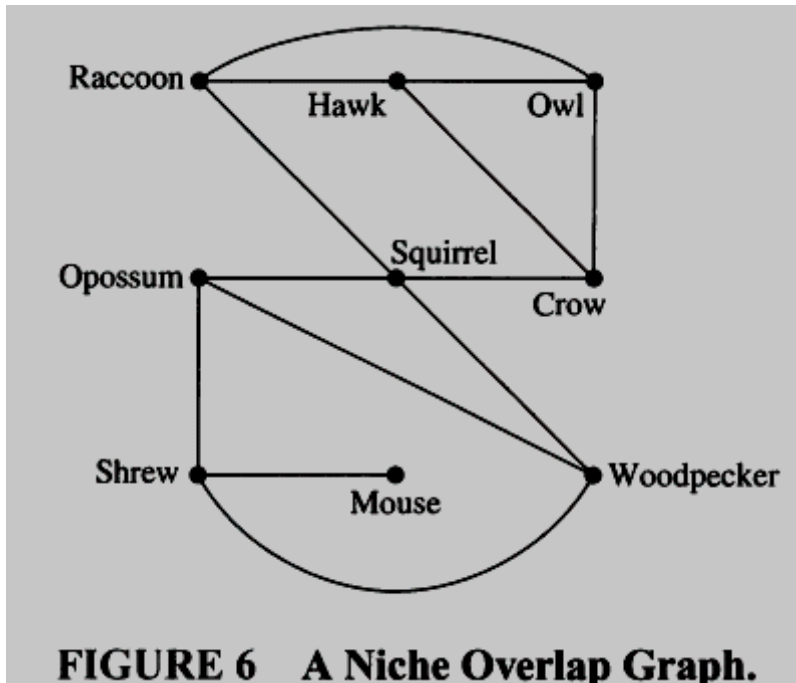
Graphs and Graph Models....

TABLE 1 Graph Terminology.

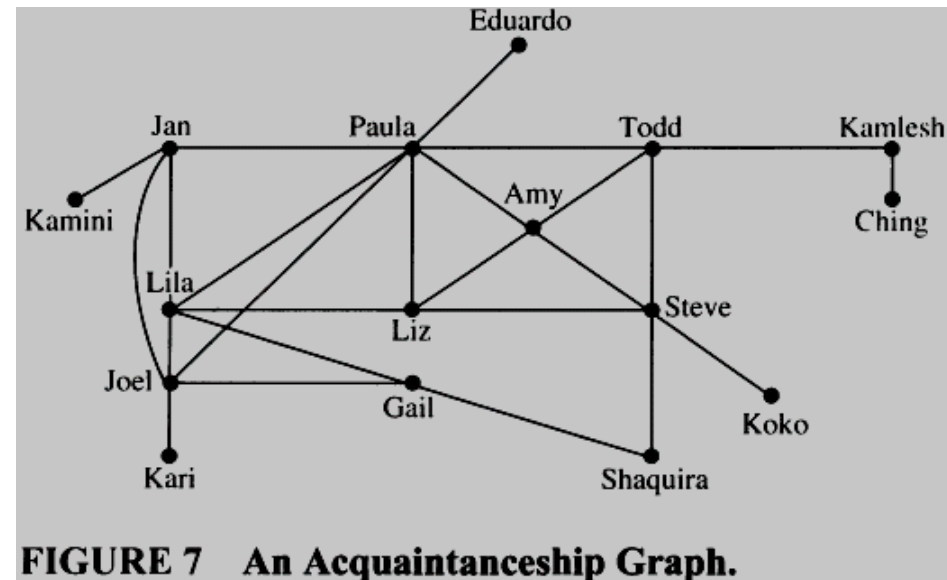
<i>Type</i>	<i>Edges</i>	<i>Multiple Edges Allowed?</i>	<i>Loops Allowed?</i>
Simple graph	Undirected	No	No
Multigraph	Undirected	Yes	No
Pseudograph	Undirected	Yes	Yes
Simple directed graph	Directed	No	No
Directed multigraph	Directed	Yes	Yes
Mixed graph	Directed and undirected	Yes	Yes



Graphs and Graph Models....



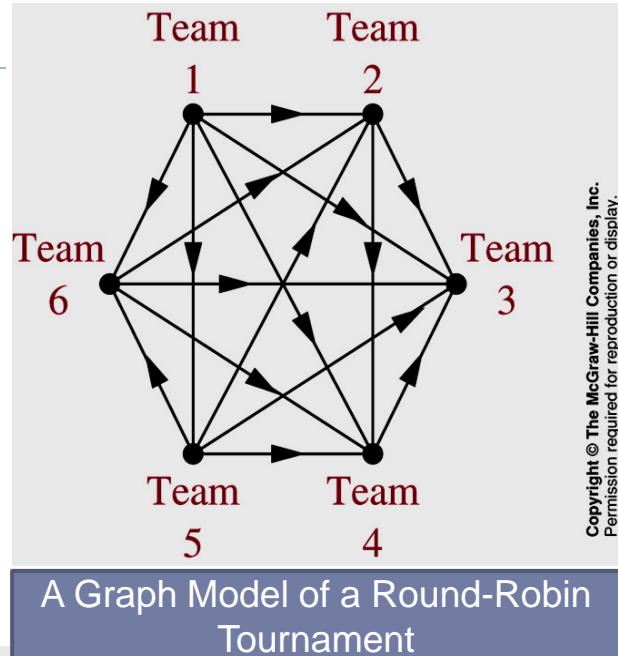
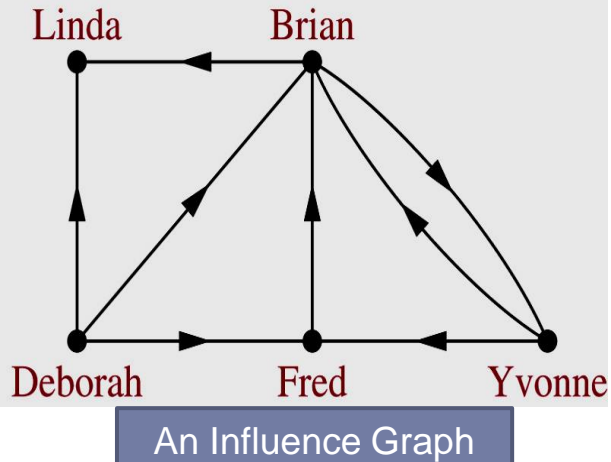
Niche Overlap Graph in Ecology
(sinh thái học) – Đồ thị lần tổ



Acquaintanceship Graph
Đồ thị cho mô hình quan hệ giữa người

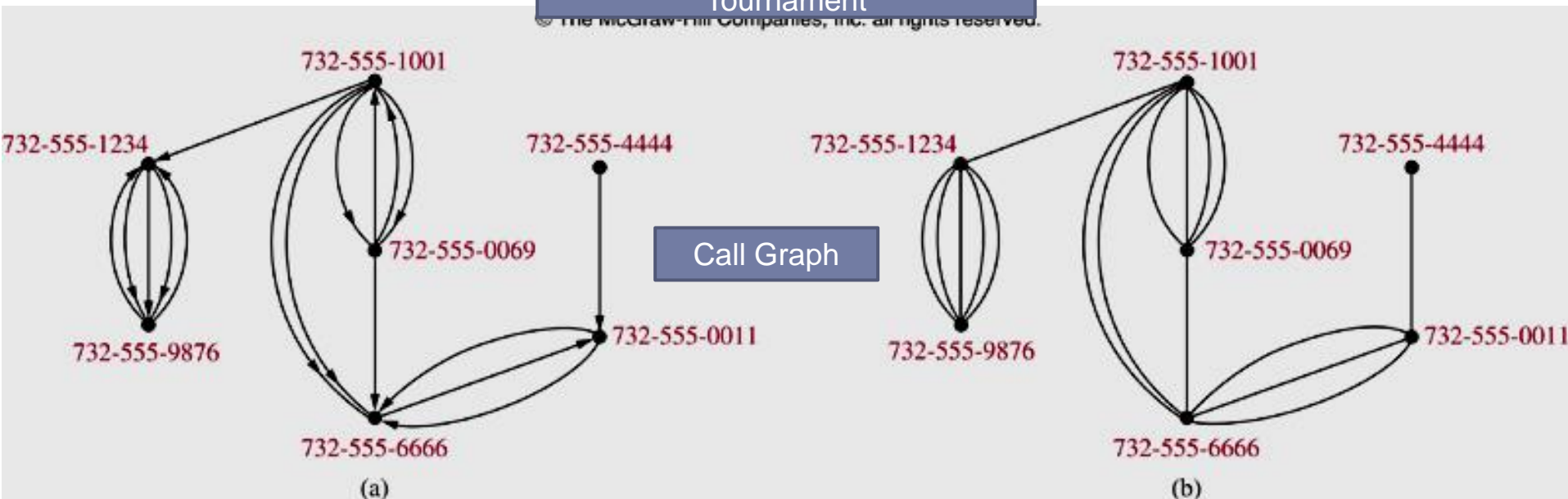
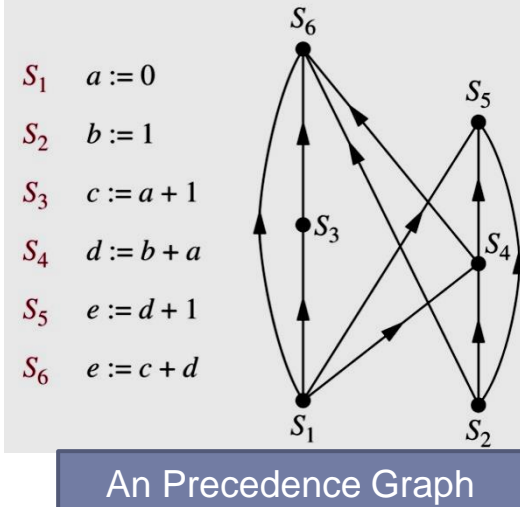
Graphs and Graph Models....

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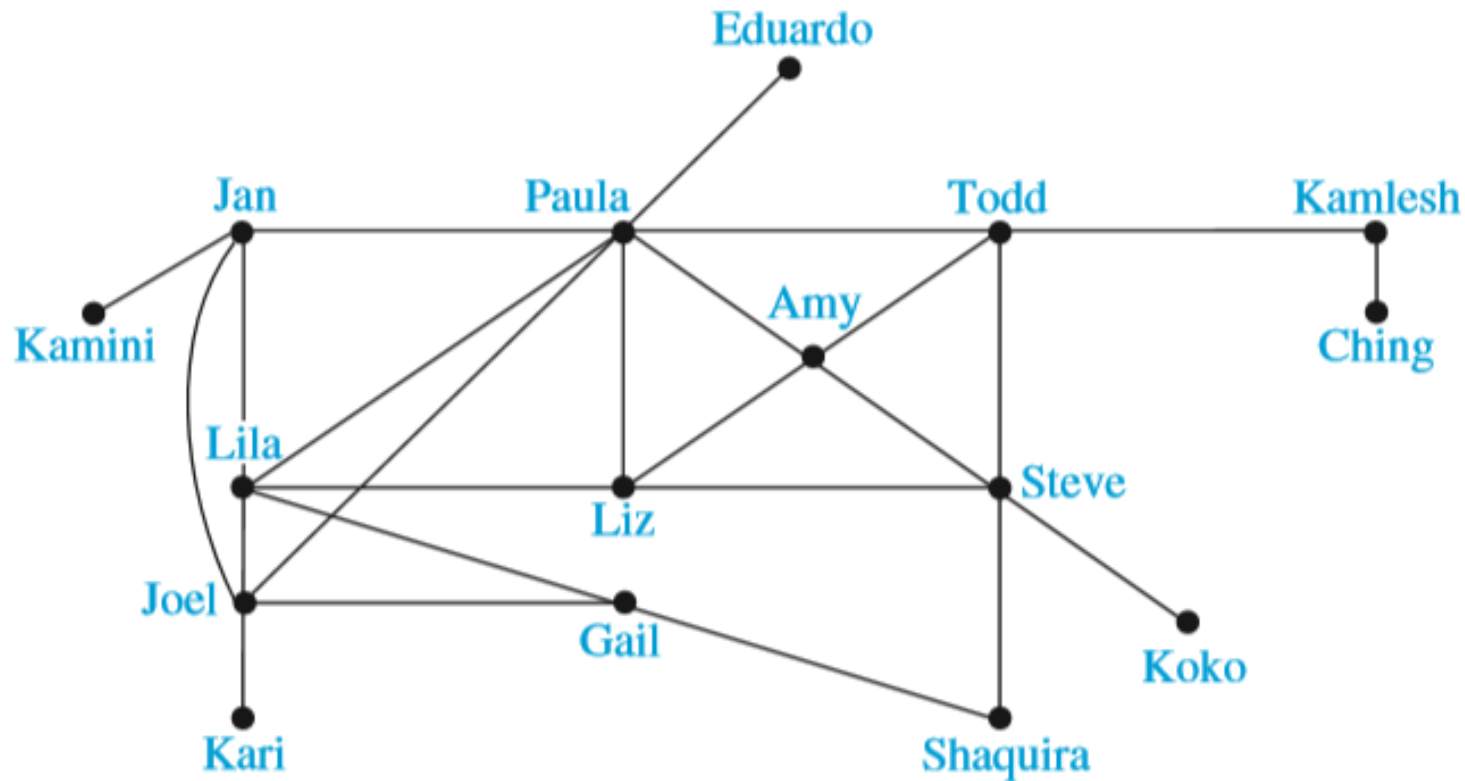


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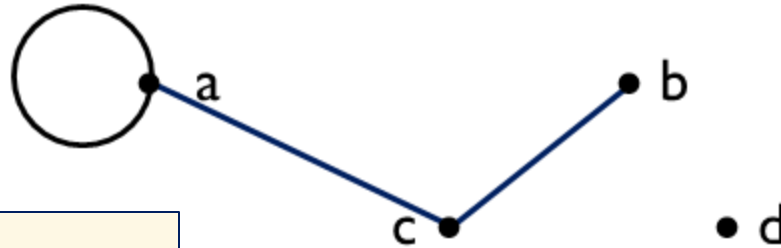
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Graph models - Social networks



Basic Terminology



If an edge $\{u, v\}$ exists, then u and v are called **adjacent**

vertex	adjacency list
a	a, c
b	c
c	a, b
d	

The edge $\{u, v\}$ is called **incident** with u and v

edge	incident vertices
$\{a, a\}$	a
$\{a, c\}$	a, c
$\{c, b\}$	c, b

Basic Terminology



The **degree** of a vertex **v**:

= the number of edges *incident* with **v**, except that *a loop* at a vertex *contributes twice*.

Notation: **deg(v)**

vertex	degree	
a	3	
b	1	b is called pendant
c	2	
d	0	d is called isolated

$$\sum_{\text{degree}} = 6$$

Remark: $\sum_{\text{degree}} = 2 | \text{Edges} |$

THE HANDSHAKING THEOREM (for undirected graphs)



3 edges: {a, a}, {c, b}, {a, c}

$$\deg(a) = 3$$

$$\deg(b) = 1$$

$$\deg(c) = 2$$

$$\deg(d) = 0$$

$$\sum_{\deg} = 6$$

THE HANDSHAKING THEOREM:

(one edge = two degrees)

$$\sum_{v \in V} \deg(v) = 2|E| \Rightarrow \text{always EVEN}$$

“the sum of the degrees *is twice* the number of edges”.

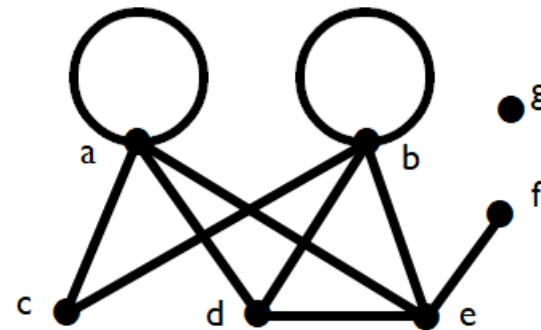
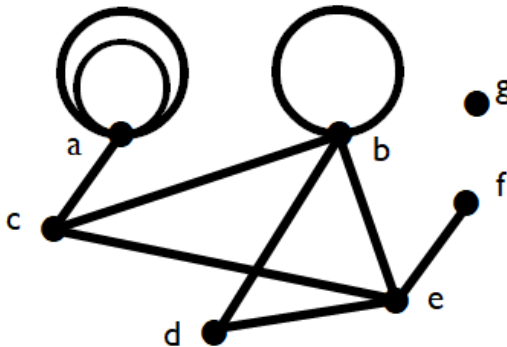
THE HANDSHAKING THEOREM -

Examples

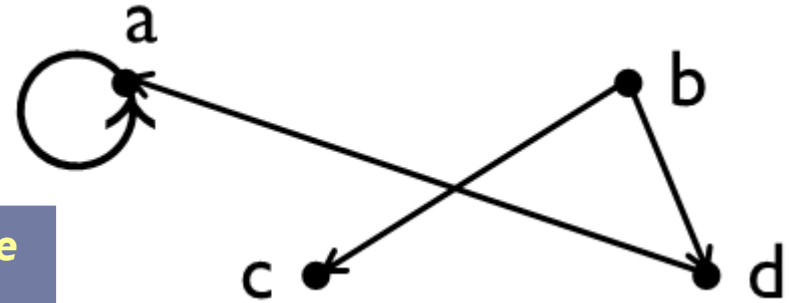
Ex2. How many edges does a graph have if its degree sequence is 5, 5, 4, 3, 2, 1, 0 ?

Draw a such graph.

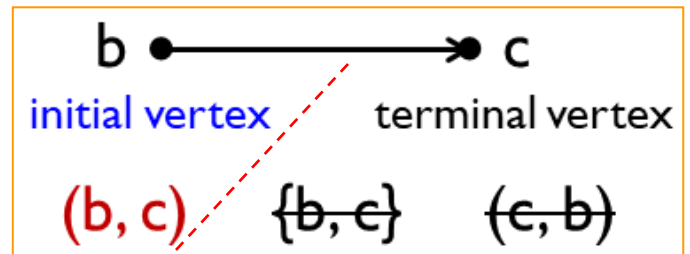
$$\begin{aligned}\sum_v \deg(v) &= 5 + 5 + 4 + 3 + 2 + 1 + 0 \\ &= 20 = 2|E| \quad \rightarrow |E| = 10.\end{aligned}$$



Directed graphs -Basic Terminology



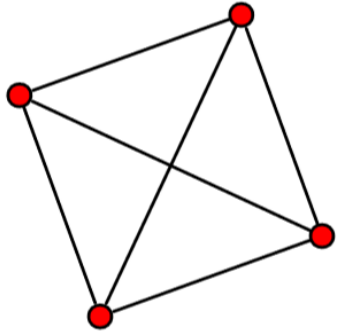
Vertex	In-degree deg^-	Out-degree deg^+
a	2	1
b	0	2
c	1	0
d	1	1



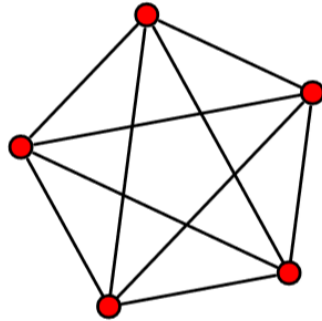
$$\sum_{\text{deg}^-} = \sum_{\text{deg}^+} = 4 \text{ directed edges}$$

Special simple graphs

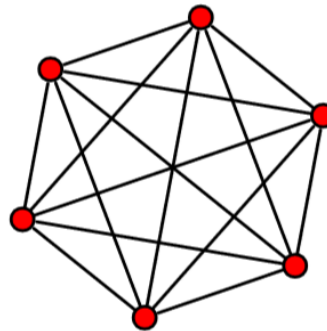
Complete graphs K_n ($n \geq 1$)



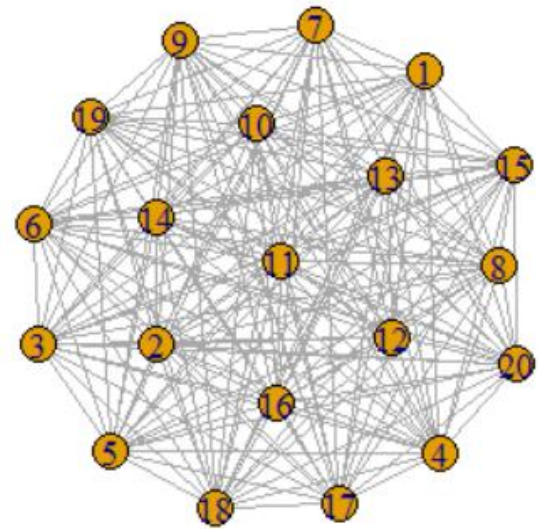
K_4



K_5



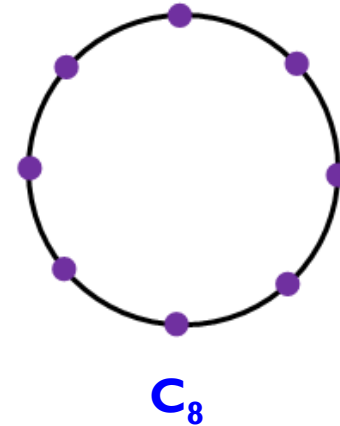
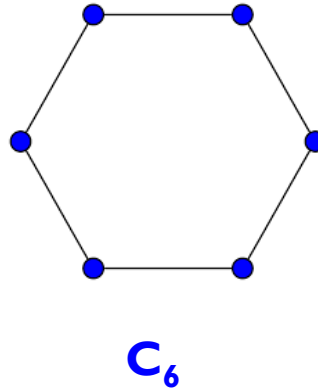
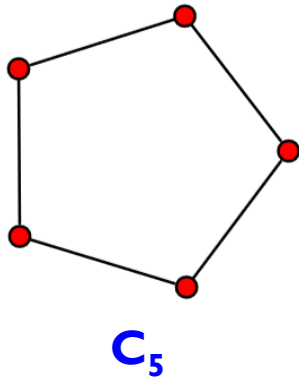
K_6



K_{20}

Cycles C_n

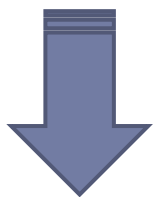
Cycles C_n ($n \geq 3$)



Wheels W_n

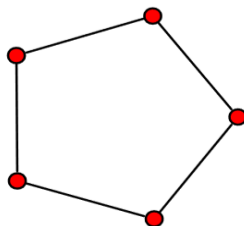
Cycles

C_n

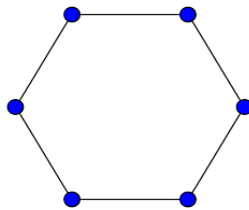


Wheels

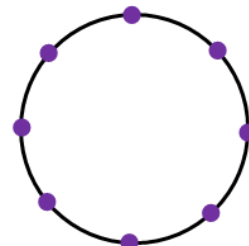
W_n ($n \geq 3$)



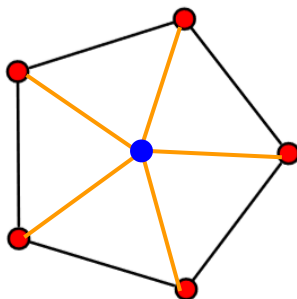
C_5



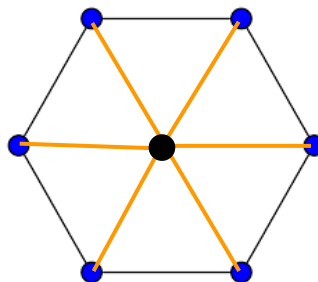
C_6



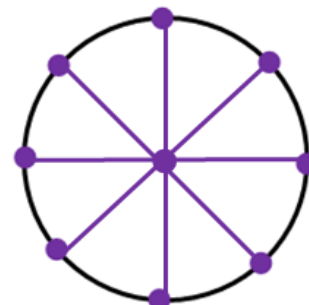
C_8



W_5



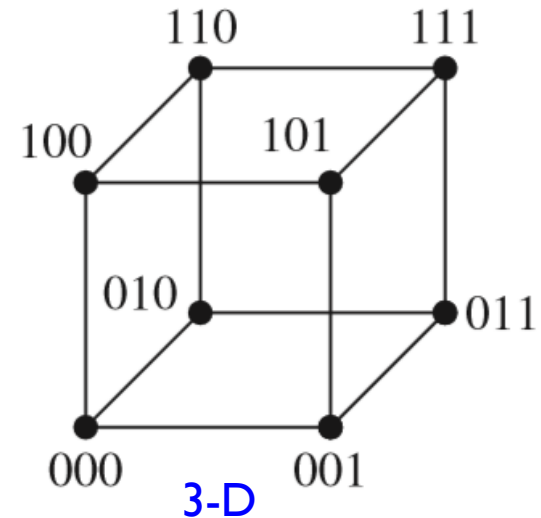
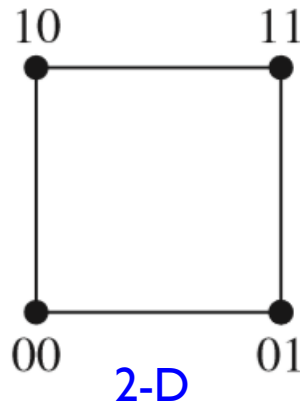
W_6



W_8

n-cubes Q_n

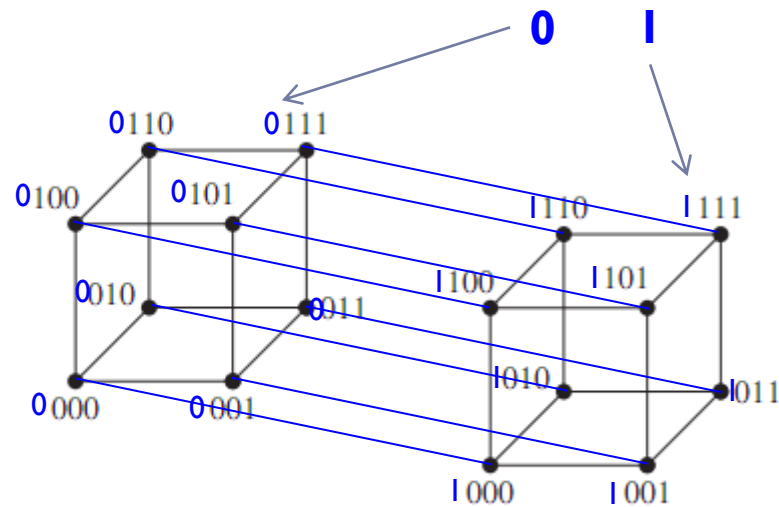
n-dimensional hypercube



Graph	$ V $ = number of vertices	$ E $ = number of edges
Q_n	2^n	$n \cdot 2^{n-1}$

n-cube Q_n

- Construct Q_4 from two copies of Q_3





Bipartite graphs

- ▶ A simple graph $G = (\mathbf{V}, E)$ is called **bipartite** if:
 - ▶ $\mathbf{V} = V_1 \cup V_2$, $V_1 \cap V_2 = \emptyset$
 - ▶ *no edge* connects two vertices in V_1
 - ▶ *no edge* connects two vertices in V_2
- ▶ We call the pair (V_1, V_2) a **bipartition** of V .

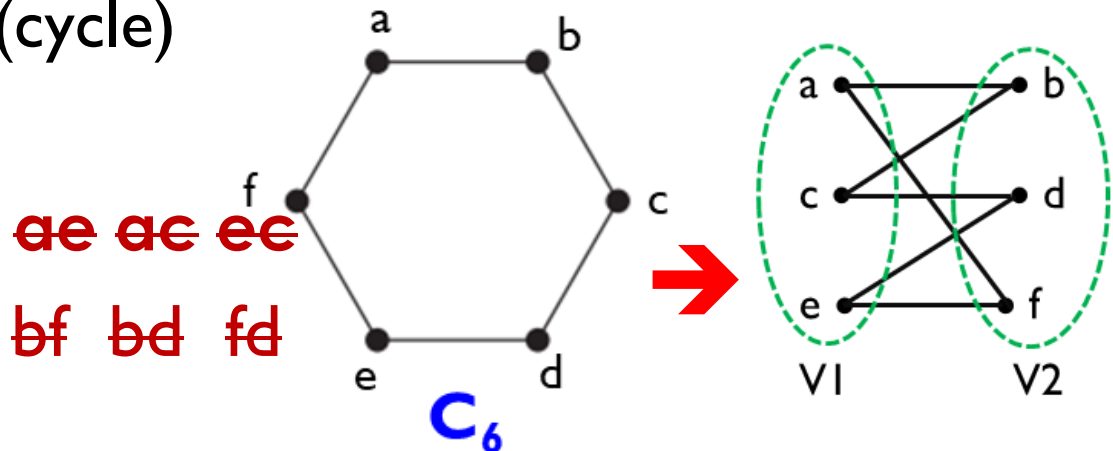
Ex. Study graph \mathbf{C}_6 (cycle)

$$V = \{a, b, c, d, e, f\}$$

$$V_1 = \{a, e, c\}$$

$$V_2 = \{b, f, d\}$$

→ C_6 is **bipartite**

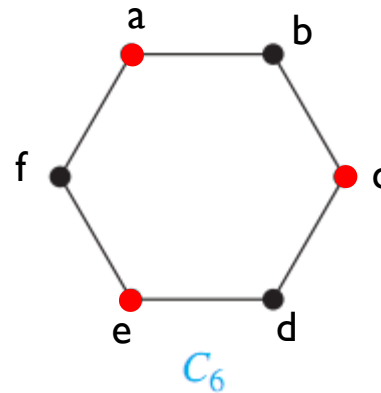


Bipartite graphs

► How to check?

► **Ex.**

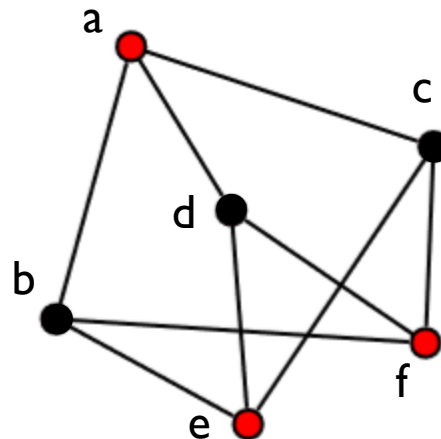
- Let **color** the vertices using *2 different colors*
- Two **adjacent** vertices must have **different colors** (e.g., **red** and **black**)



→ C_6 is **bipartite**

$V1 = \{a, c, e\}$

$V2 = \{b, d, f\}$



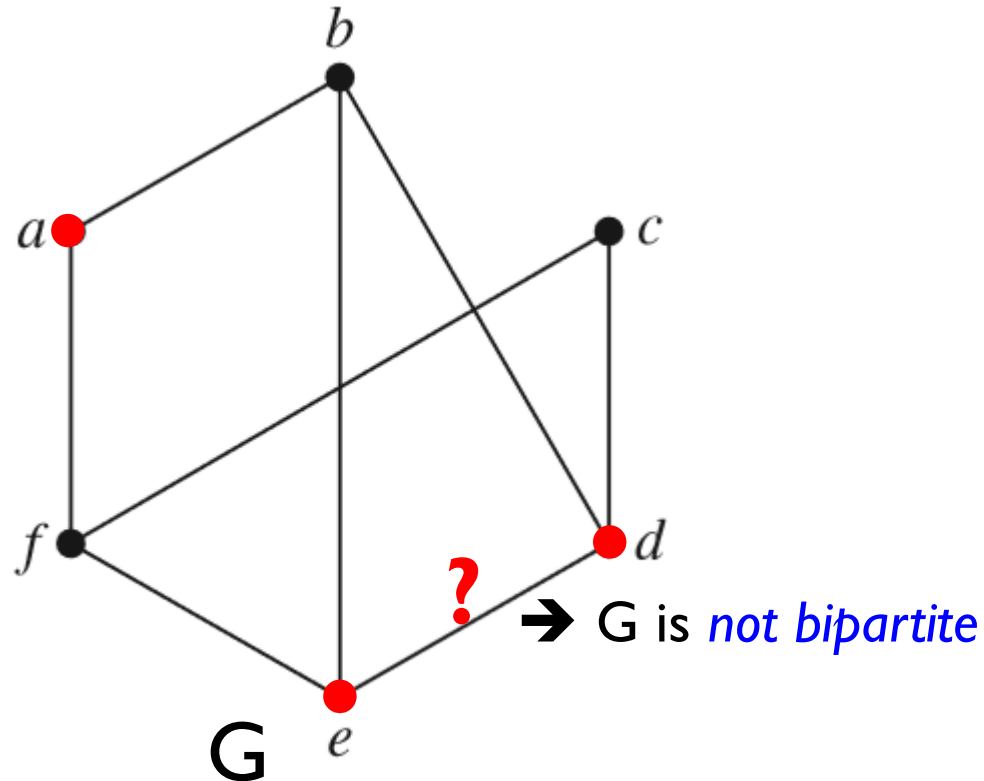
→ **bipartite**

$V1 = \{a, e, f\}$

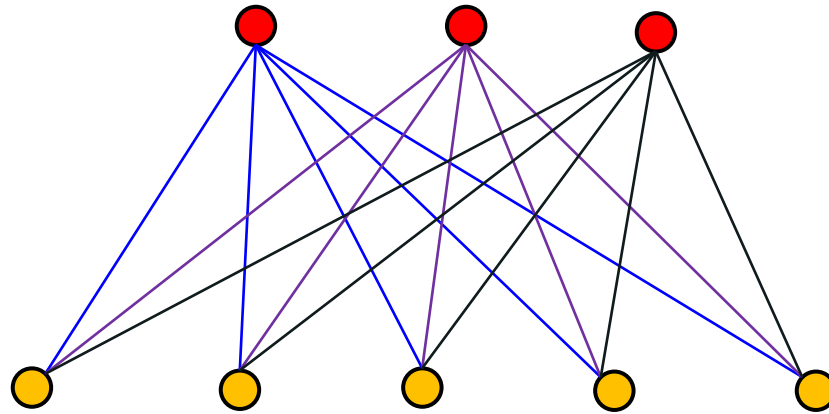
$V2 = \{b, c, d\}$

Example

Ex. Is the graph G *bipartite*?



$K_{m,n}$ - Complete bipartite graphs



$m = 3$

$n = 5$

$K_{3,5}$

Isomorphism



THE SAME

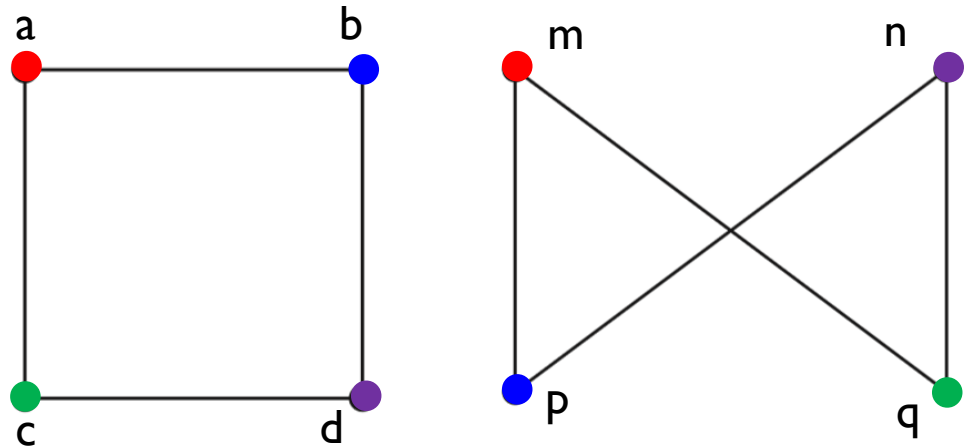
Isomorphism

$G1 = (V1, E1)$, $G2 = (V2, E2)$

$G1$ and $G2$ are called **isomorphic** if

\exists **function f** : $V1 \rightarrow V2$

- One-to-one
- Onto
- a, b are **adjacent** in $V1$
 $\Leftrightarrow f(a), f(b)$ are **adjacent** in $V2$

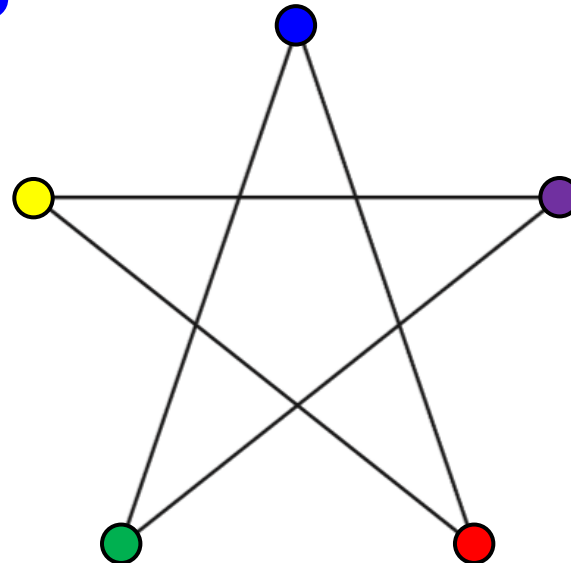
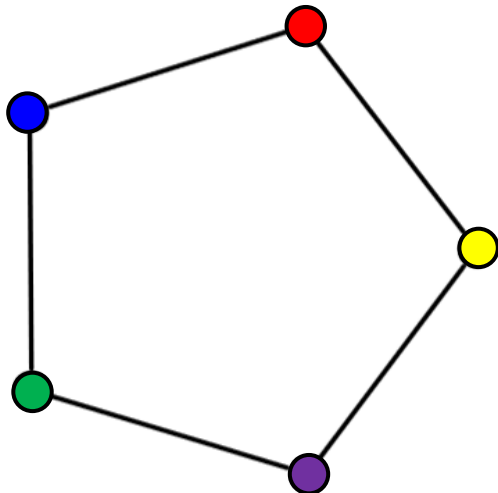


function $f = \{(a, m); (b, p); (d, n); (c, q)\}$

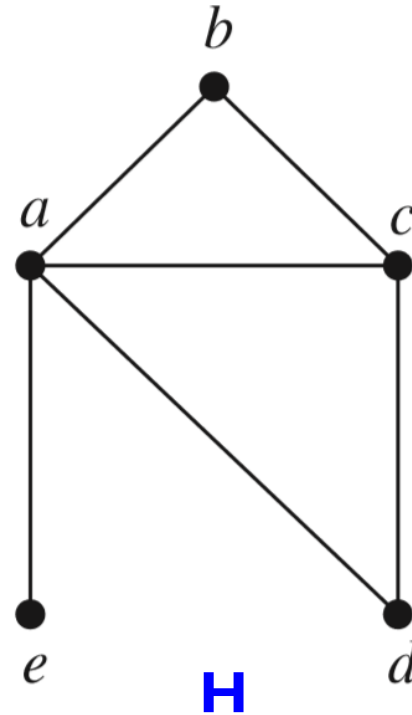
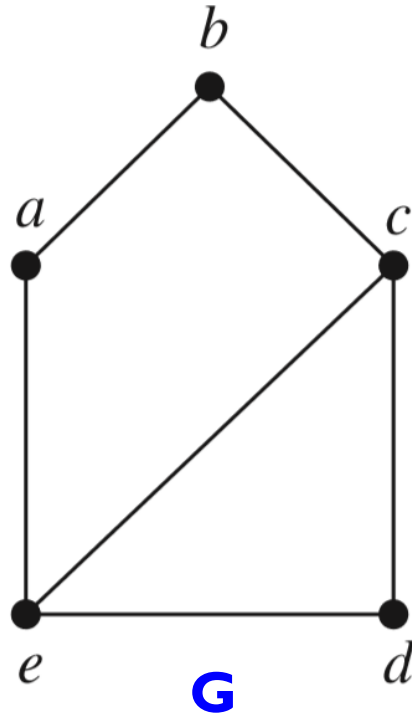
➔ Two graphs are called **isomorphic**

Isomorphic?

YES



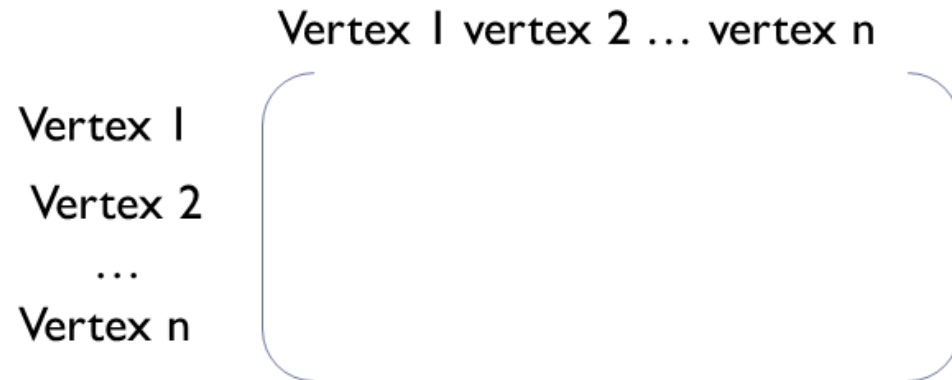
Isomorphic?



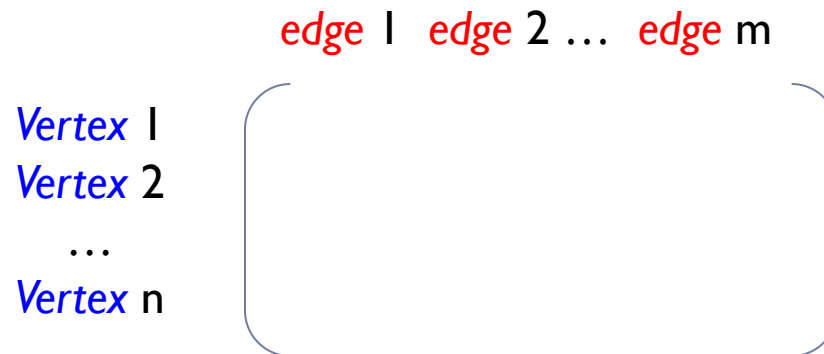
G and H are **NOT isomorphic**
(in H: $\deg(e) = 1$, no vertex in G has degree 1)

Representing graphs

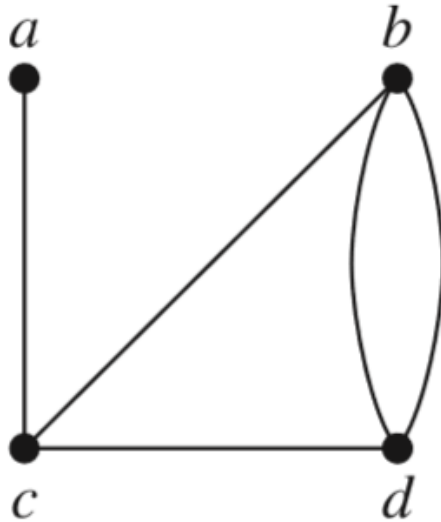
► *Adjacency* matrix



► *Incidence* matrix



Adjacency matrices



	a	b	c	d
a	0	0	1	0
b	0	0	1	2
c	1	1	0	1
d	0	2	1	0

Adjacency matrix.

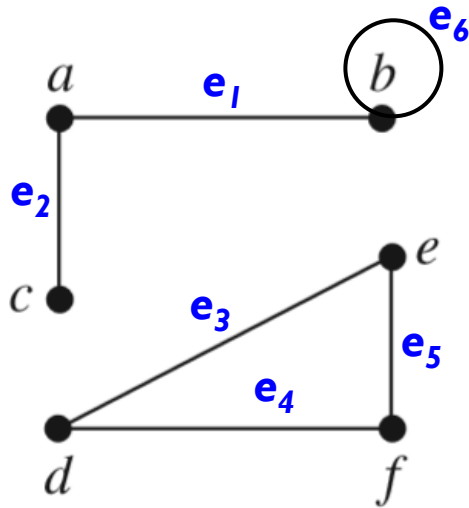
$$A = [a_{ij}],$$

where a_{ij} = the *number of edges* that are associated to $\{v_i, v_j\}$

In 2010 the **Web graph** was estimated to have at least **55 billion vertices** and one **trillion edges**.

➔ More than **40 TB** of computer memory would have been needed to represent its **adjacency matrix**.

Incidence matrices



Vertices = { a, b, c, d, e, f }

Edges = { e₁, e₂, e₃, e₄, e₅, e₆ }

edges

	e ₁	e ₂	e ₃	e ₄	e ₅	e ₆
a			0	0	0	0
b		0	0	0	0	
c	0		0	0	0	0
d	0	0			0	0
e	0	0		0		0
f	0	0	0			0
g	0	0	0	0	0	0

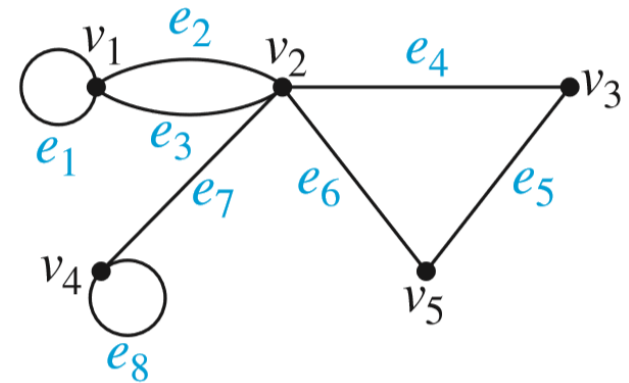
Incidence matrices

If the edge e_j is incident with the vertex v_i
the (v_i, e_j) -entry = 1

Else

the (v_i, e_j) -entry = 0

	e_1	e_2	e_3	e_4	e_5	e_6	e_7	e_8
v_1	1	1	1	0	0	0	0	0
v_2	0	1	1	1	0	1	1	0
v_3	0	0	0	1	1	0	0	0
v_4	0	0	0	0	0	0	1	1
v_5	0	0	0	0	1	1	0	0

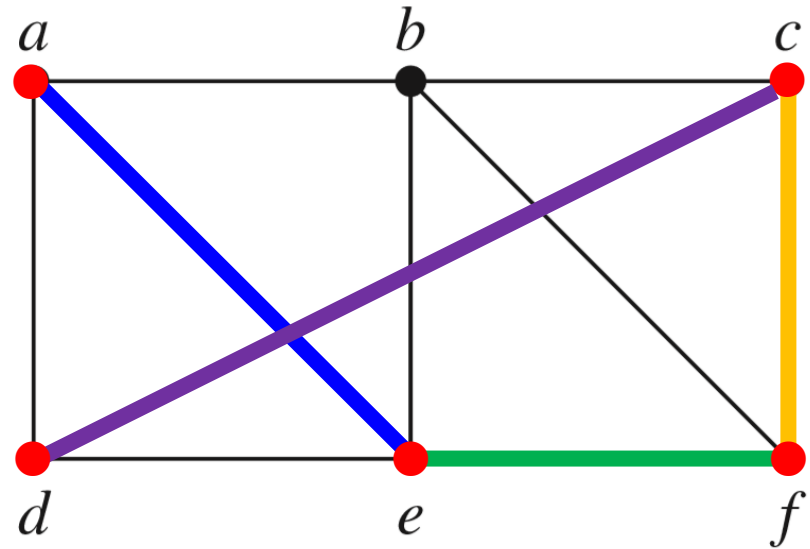


A path of length n

- A *path of length n* from u to v :
A sequence of n consecutive edges

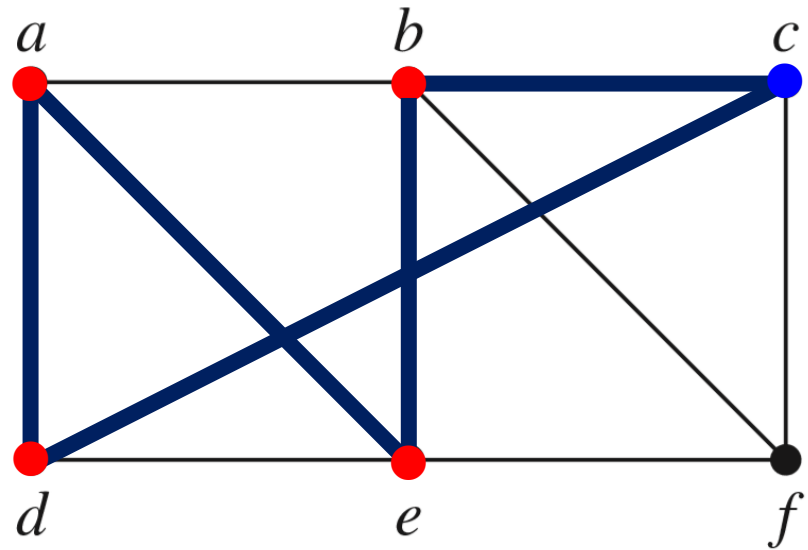
- **Ex.**

a, e, f, c, d
is a path of length 4.



Circuits

- A **circuit** is a path of length greater than zero that **starts** and **ends** at the *same vertex*.
- **Ex.**
c, b, e, a, d, **c** is **circuit**.



***Simple** paths/circuits*

- A path/circuit is **simple** if it does *not* contain the same edge *more than once*.

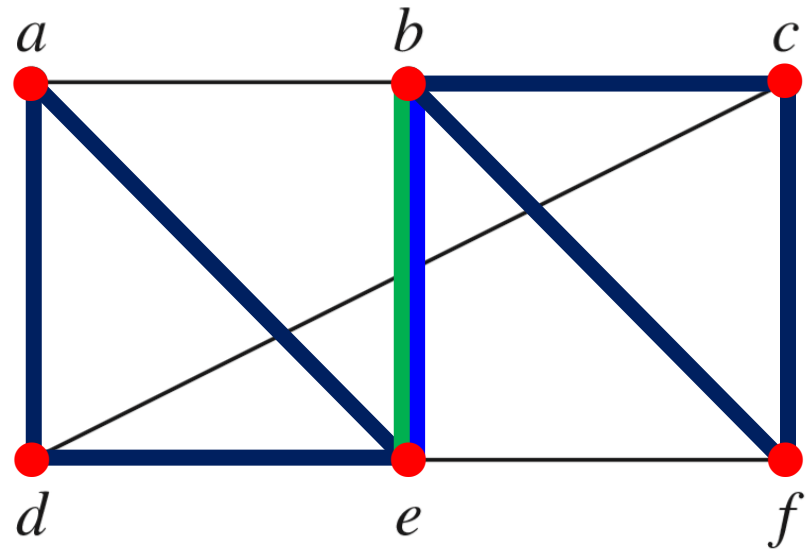
- **Ex.**

b, e, a, b, f, c

is a **simple path**.

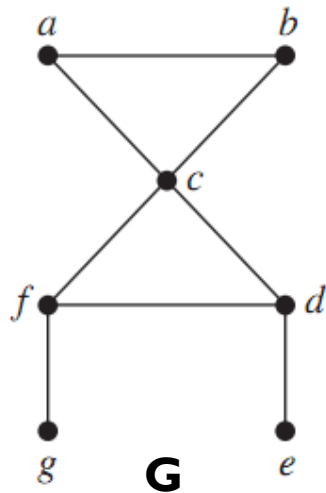
c, b, e, a, d, e, b, f, c

is **NOT** a **simple circuit**.

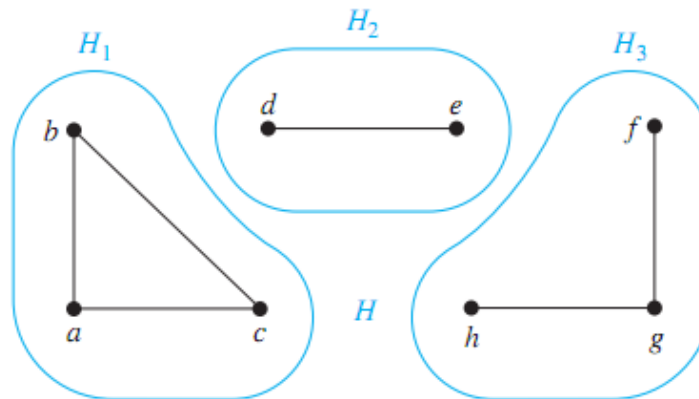


Connectedness in Undirected Graphs

- Connected = **there is a path** between every pair of distinct vertices of the graph.
- Not connected = **disconnected**.



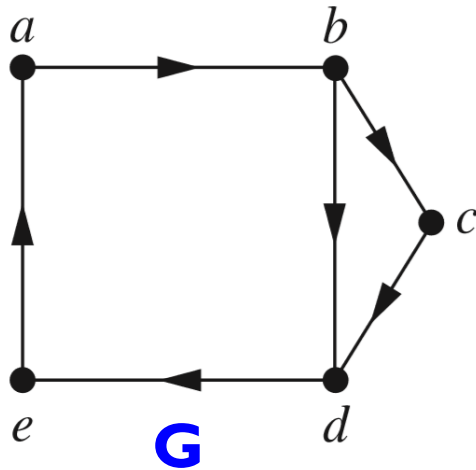
G is connected



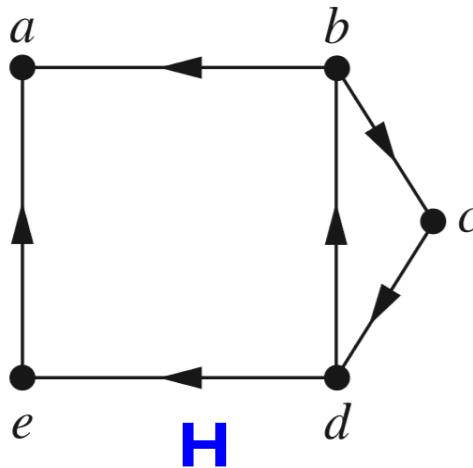
A disconnected with
3 connected **components**

Connectedness in *Directed Graphs*

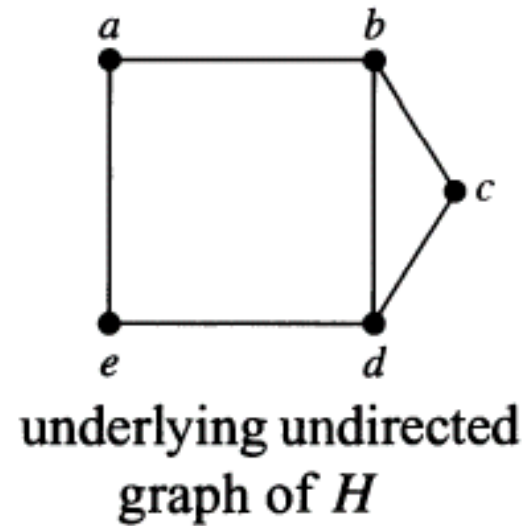
Strongly connected **vs** **weakly connected**



G: *strongly connected*
→ weakly connected



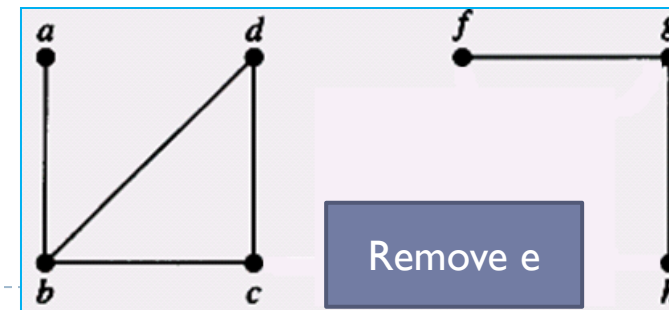
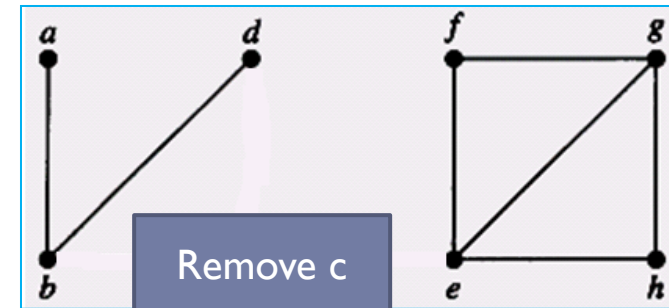
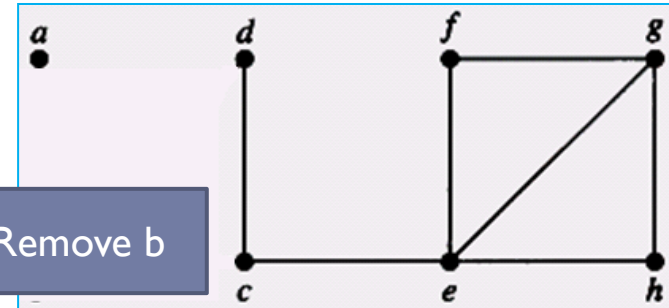
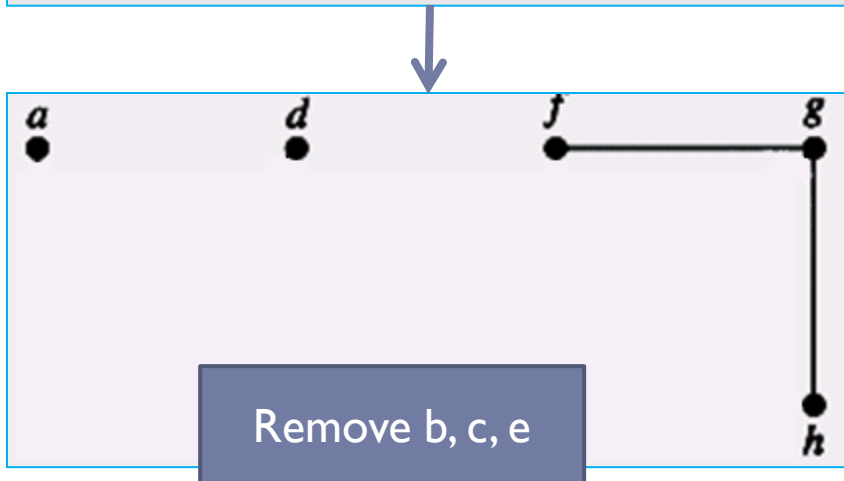
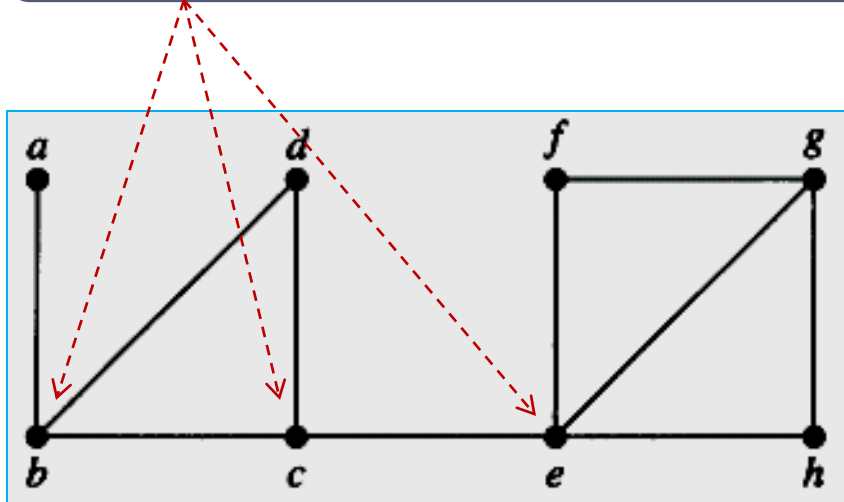
H: *weakly connected*



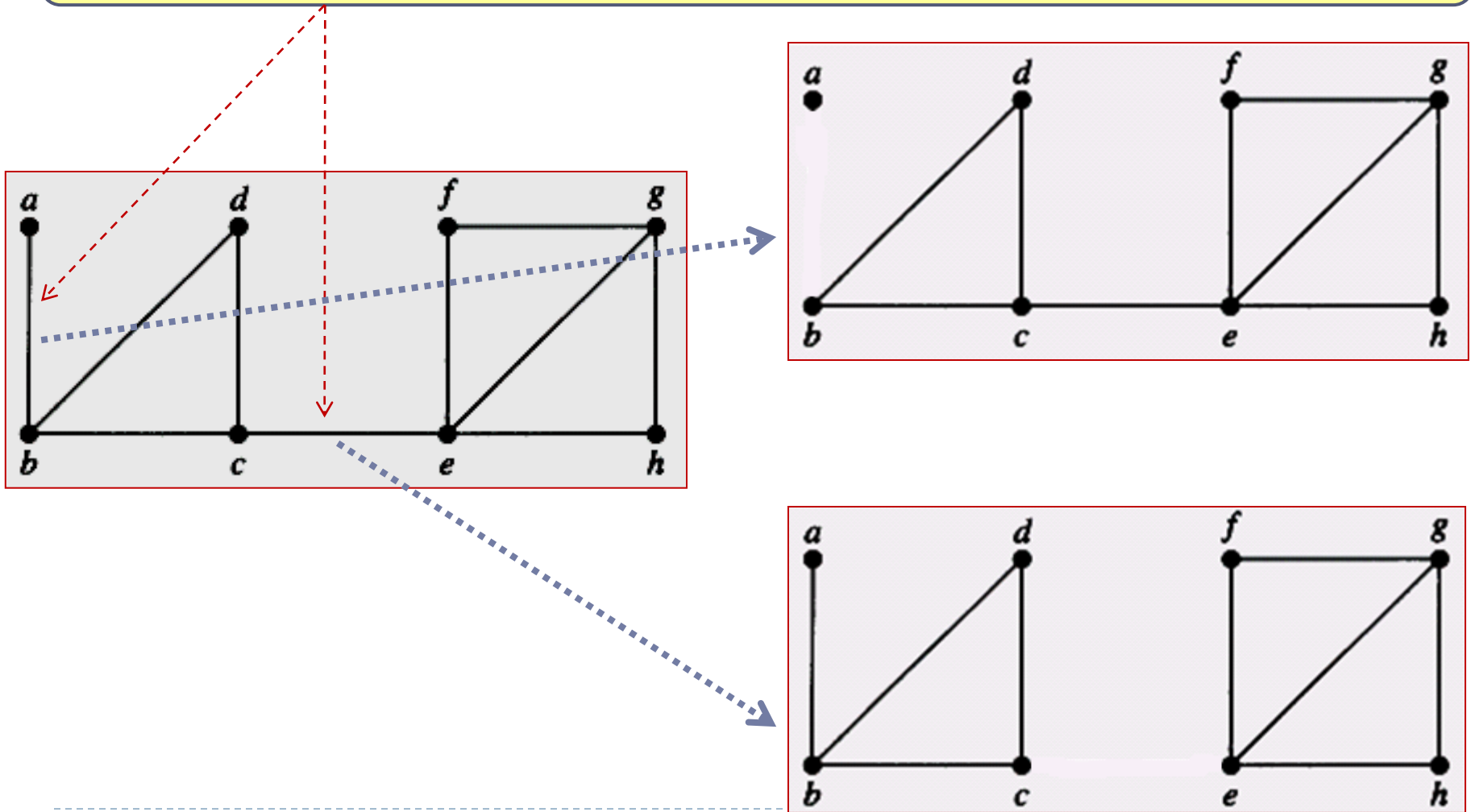
← connected

Cut vertex, cut edge

Cut vertex (articulation point): It's removal will produce disconnected subgraph from original connected graph.



Cut edge (bridge): It's removal will produce subgraphs which are more connected components (thành phần liên thông) than in the original graph

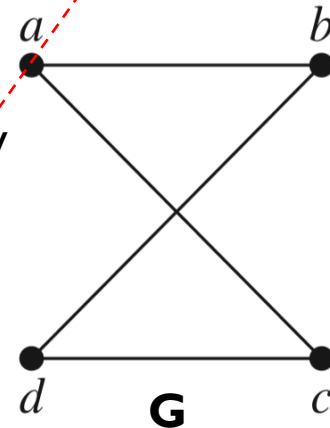


Counting Paths Between Vertices

How many *paths of length four* from *a to d* in the simple graph *G*?

The *adjacency matrix* of *G* is given below (ordering the vertex as *a, b, c, d*)

$$\begin{matrix} & \text{to} \\ \text{from} \\ \mathbf{A} = \end{matrix} \begin{bmatrix} 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 1 \\ 1 & 0 & 0 & 1 \\ 0 & 1 & 1 & 0 \end{bmatrix}$$

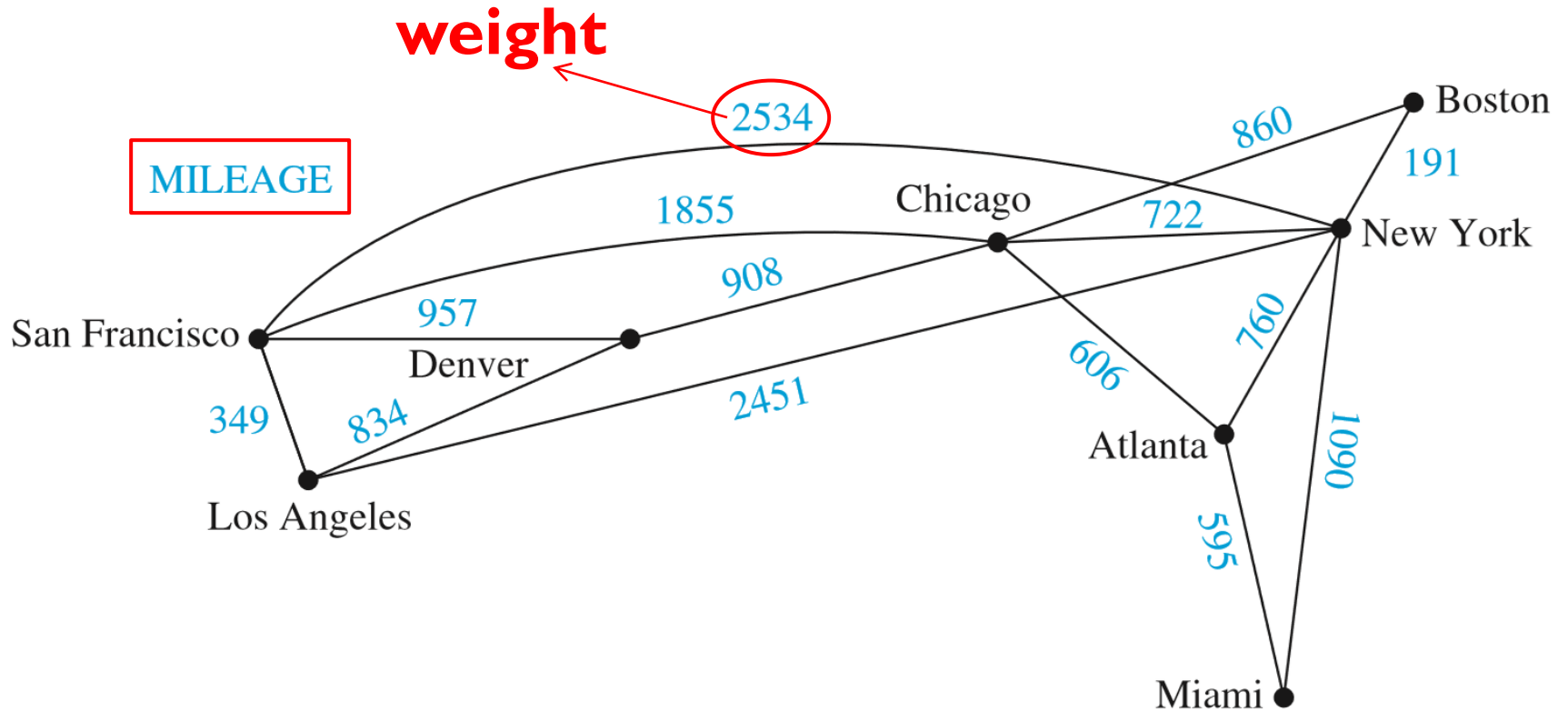


$$\Rightarrow \mathbf{A}^4 = \begin{bmatrix} 8 & 0 & 0 & 8 \\ 0 & 8 & 8 & 0 \\ 0 & 8 & 8 & 0 \\ 8 & 0 & 0 & 8 \end{bmatrix}$$

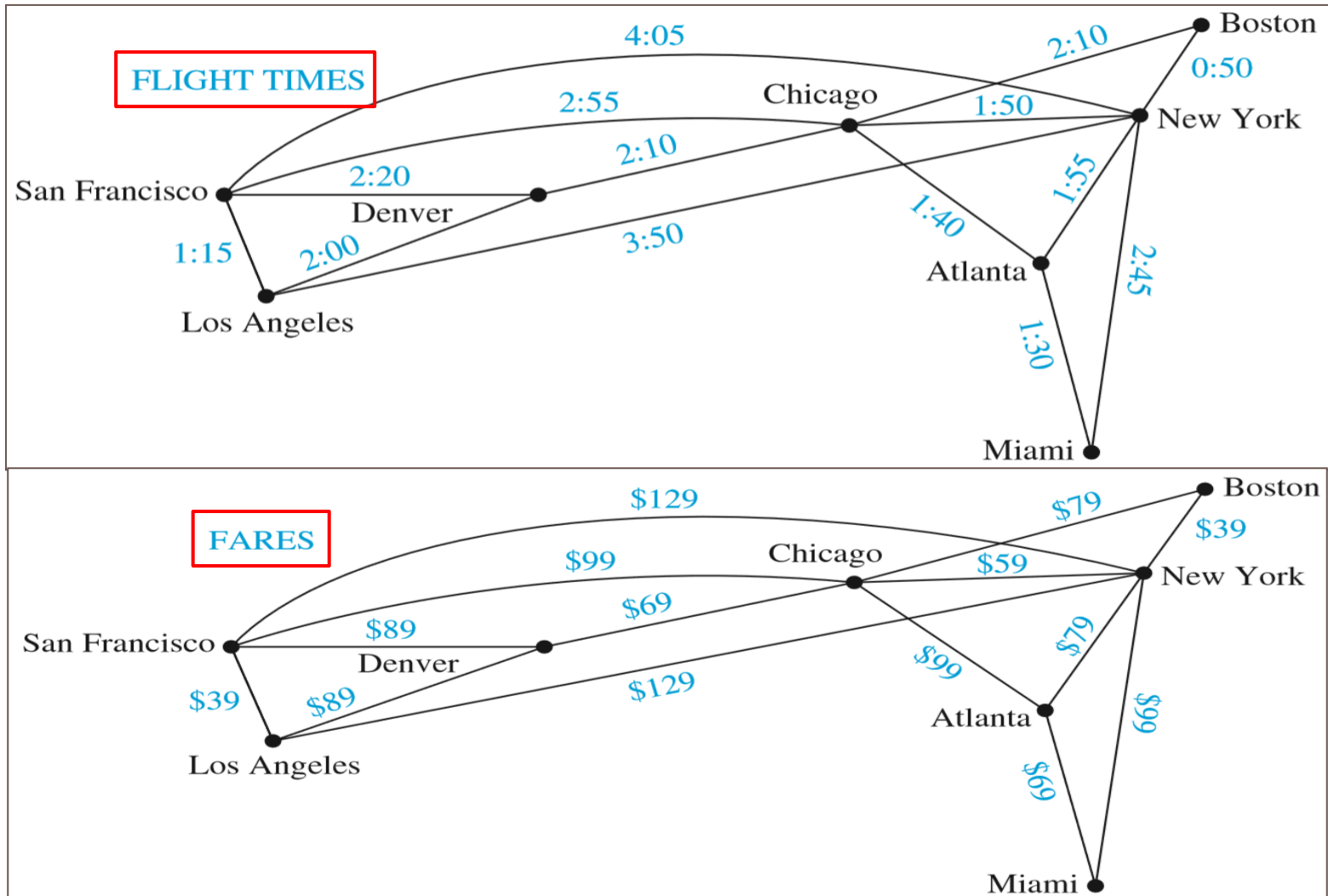
Result = 8

a, b, a, b, d
a, b, a, c, d
a, b, d, b, d
a, b, d, c, d
a, c, a, b, d
a, c, a, c, d
a, c, d, b, d
a, c, d, c, d

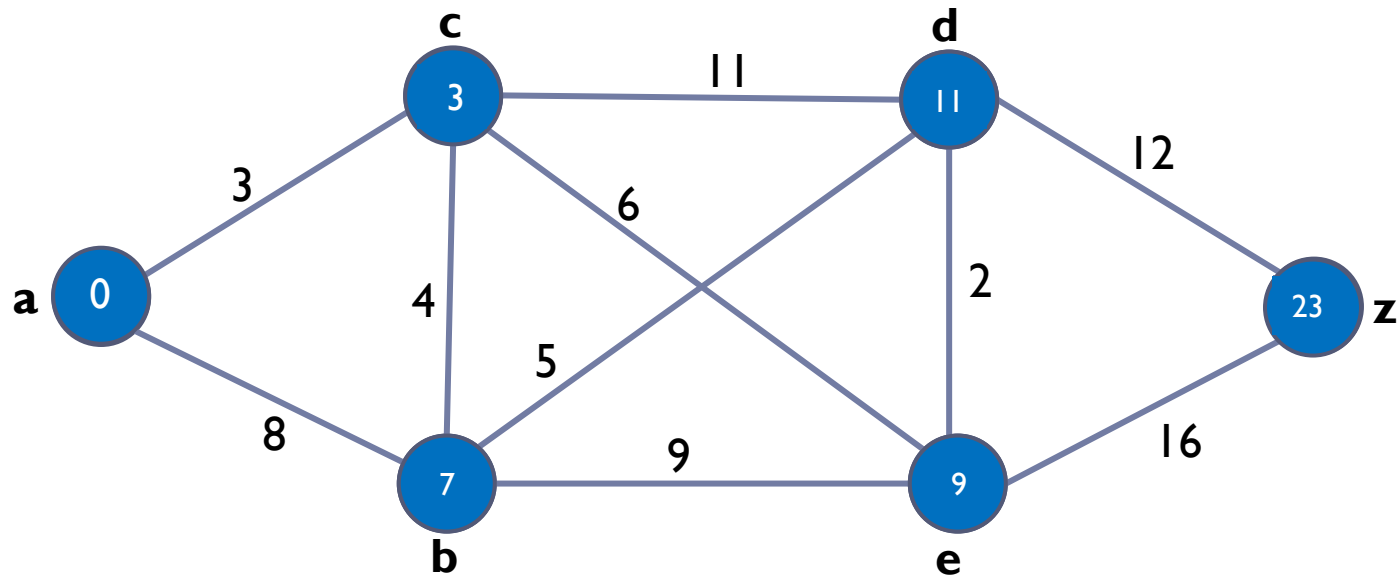
Shortest-path problems



Shortest-path problems



Dijkstra's algorithm



$S = \{a, c, b, e, d, z\}$

The **shortest path** from a to z: a, c, e, d, z

Dijkstra's Algorithm

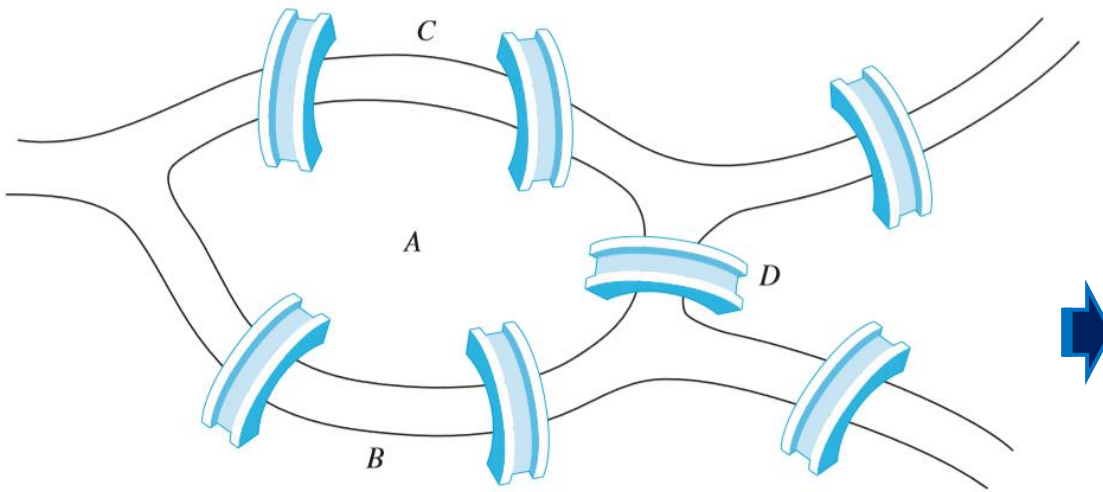
ALGORITHM 1 Dijkstra's Algorithm.

```
procedure Dijkstra( $G$ : weighted connected simple graph, with  
    all weights positive)  
    { $G$  has vertices  $a = v_0, v_1, \dots, v_n = z$  and weights  $w(v_i, v_j)$   
    where  $w(v_i, v_j) = \infty$  if  $\{v_i, v_j\}$  is not an edge in  $G$ }  
    for  $i := 1$  to  $n$   $L(v_i) := \infty$   
     $L(a) := 0$   
     $S := \emptyset$   
    {the labels are now initialized so that the label of  $a$  is 0 and all  
    other labels are  $\infty$ , and  $S$  is the empty set}  
    while  $z \notin S$   
    begin  
         $u :=$  a vertex not in  $S$  with  $L(u)$  minimal  
         $S := S \cup \{u\}$   
        for all vertices  $v$  not in  $S$   
            if  $L(u) + w(u, v) < L(v)$  then  $L(v) := L(u) + w(u, v)$   
        {this adds a vertex to  $S$  with minimal label and updates the  
        labels of vertices not in  $S$ }  
    end { $L(z)$  = length of a shortest path from  $a$  to  $z$ }
```

$O(n^2)$
time complexity

Euler and Hamilton paths - introduction

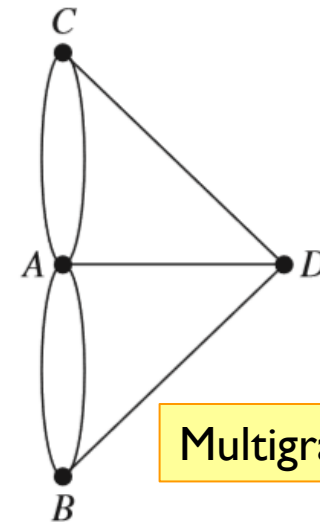
Can one travel across *all the bridges once* and *return* to the starting point?



The Seven Bridges of Königsberg.



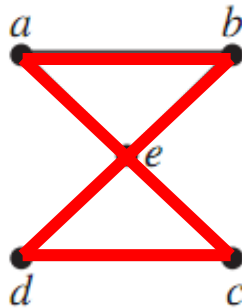
LEONHARD **EULER**
(1707–1783)



Multigraph Model

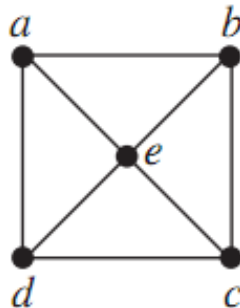
Euler circuit/path - definitions

- An **Euler path/circuit** in a graph G is a *simple path/circuit* containing every edge of G .

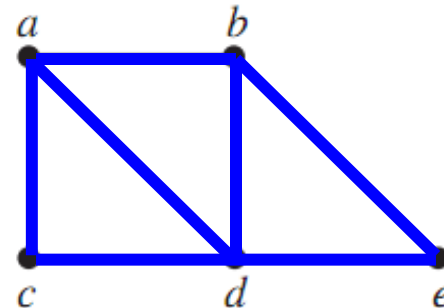


G_1

G_1 has an **Euler circuit**
a, b, e, d, c, e, **a**



G_2



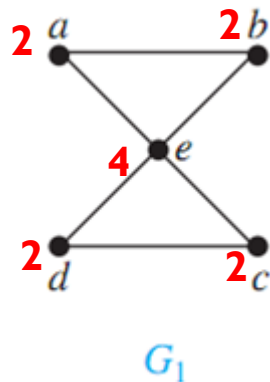
G_3

G_3 has *no* an **Euler circuit**,
But G_3 has an **Euler path**
a, c, d, e, b, d, a, **b**

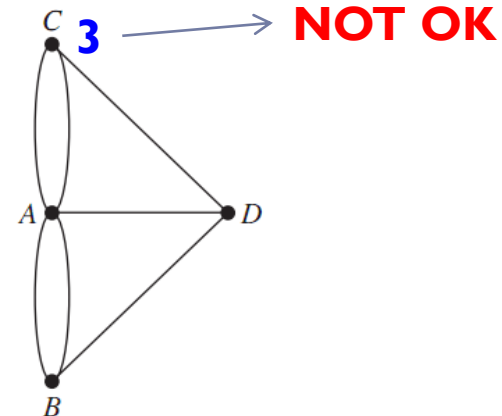
Euler circuit

Theorem.

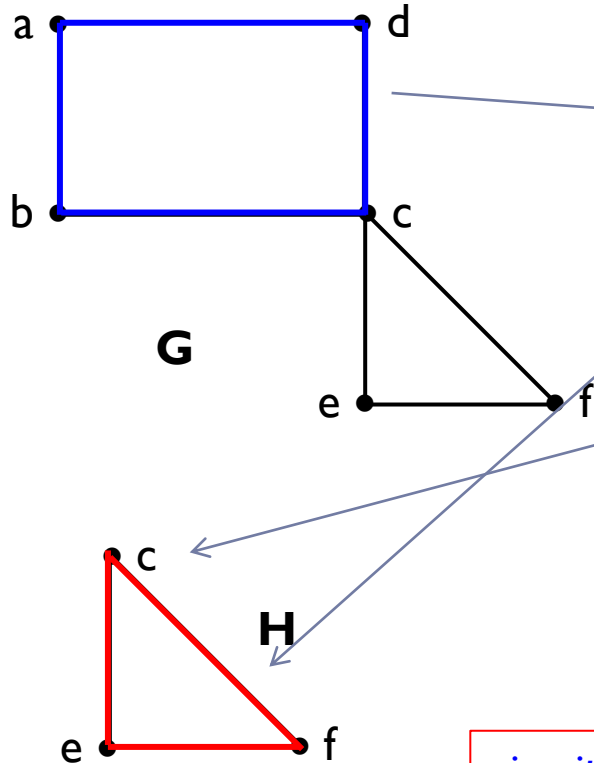
A connected multigraph, ≥ 2 vertices,
has an *Euler circuit* \Leftrightarrow every vertex has **even degree**



OK



How to construct an Euler circuit?



procedure *Euler*(*G*: connected, every vertex has even degree)

construct a simple **circuit** in *G*

H := *G* – **circuit** // remove passed edges

while *H* has edges

construct a simple **subcircuit** in *H*

beginning at a vertex in **circuit**

H := *H* – **subcircuit** // remove passed edges

circuit := add **subcircuit** to **circuit**

{ **circuit** is an *Euler circuit* }

circuit:

a, b, c, d, a

subcircuit:

c, e, f, c

→ circuit:

a, b, c, e, f, c, d, a

Euler path

Theorem.

A connected multigraph has
an ***Euler path*** but not an Euler circuit



it has exactly

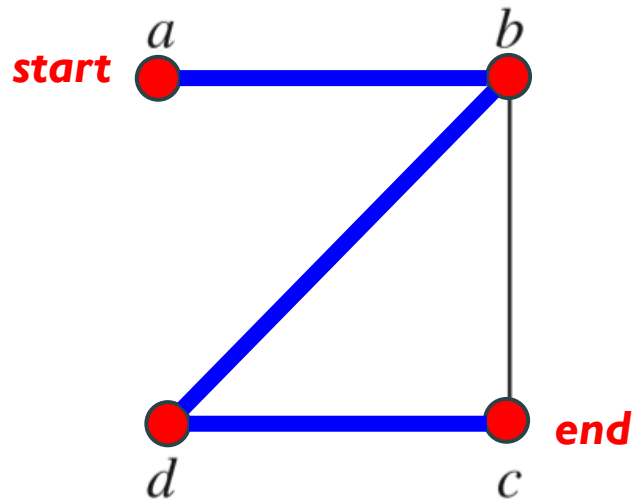
two vertices of odd degree

Note that: an Euler circuit is also an Euler path

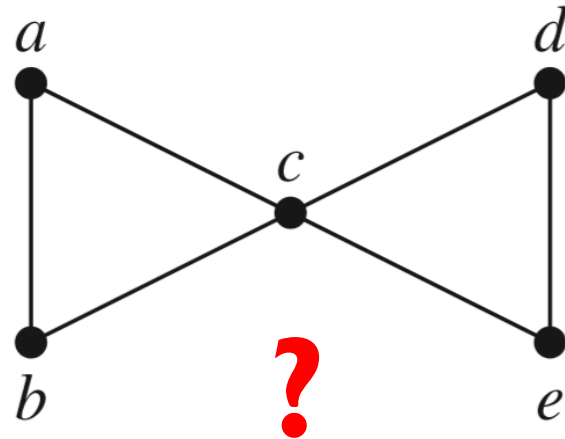
Hamilton Paths and Circuits

Hamilton circuit/path:

A simple circuit/path passes through **every vertex** exactly *once*.

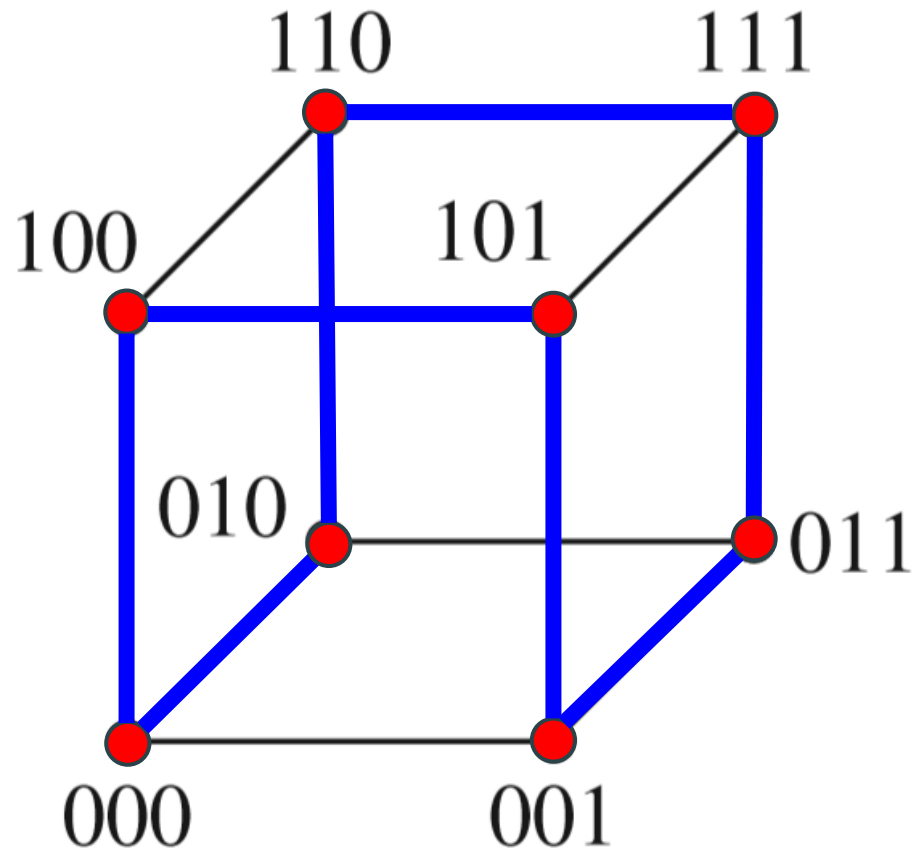


Hamilton path



No Hamilton circuit
a,b,c,d,e is a Hamilton path

Example - *A Hamilton* circuit for Q_3



Hamilton Paths and Circuits

There are
NO known simple
necessary and sufficient criteria
for the existence of
Hamilton circuits

Hamilton circuits - sufficient conditions

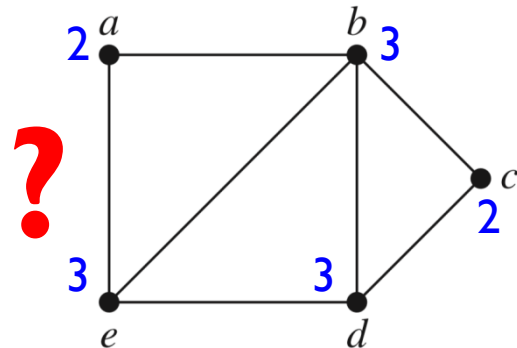
Dirac's theorem.

G is a graph:

- *simple*
- $n (\geq 3)$ vertices
- $\forall v_i, \deg(v_i) \geq \frac{n}{2}$



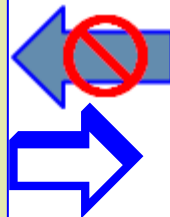
G has a **Hamilton circuit**



Ore's theorem.

G is a graph:

- *simple*
- $n (\geq 3)$ vertices
- $\forall u, \forall v, \text{non-adjacent}$
 $\deg(u) + \deg(v) \geq n$



G has a **Hamilton circuit**

The Traveling Salesman Problem

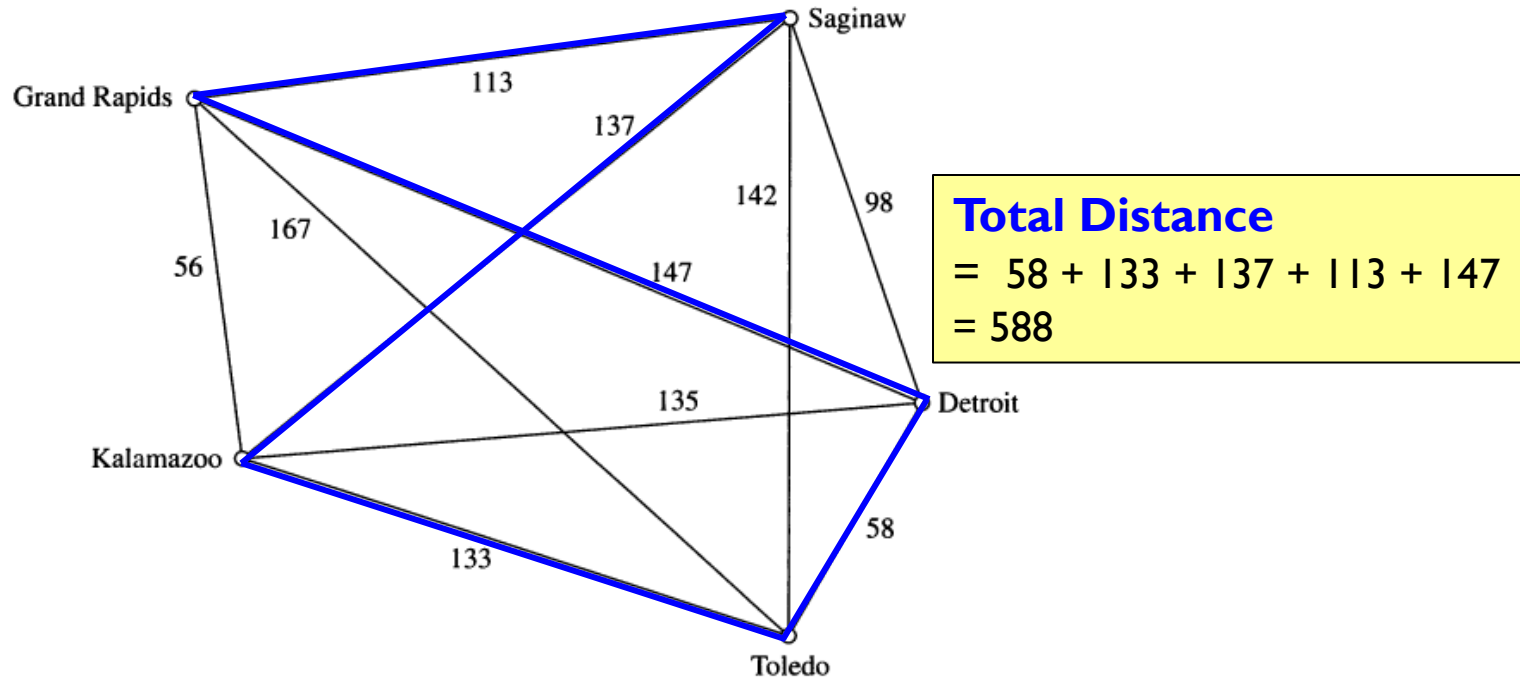


FIGURE 5 The Graph Showing the Distances between Five Cities.

Salesman starts in one city (ex. Detroit). He wants to visit n cities *exactly once* and return to his starting point (Detroit). In which order should he visit these cities to travel the **minimum total distance** ?

The Traveling Salesman Problem

<i>Route</i>	<i>Total Distance (miles)</i>
Detroit–Toledo–Grand Rapids–Saginaw–Kalamazoo–Detroit	610
Detroit–Toledo–Grand Rapids–Kalamazoo–Saginaw–Detroit	516
Detroit–Toledo–Kalamazoo–Saginaw–Grand Rapids–Detroit	588
Detroit–Toledo–Kalamazoo–Grand Rapids–Saginaw–Detroit	458
Detroit–Toledo–Saginaw–Kalamazoo–Grand Rapids–Detroit	540
Detroit–Toledo–Saginaw–Grand Rapids–Kalamazoo–Detroit	504
Detroit–Saginaw–Toledo–Grand Rapids–Kalamazoo–Detroit	598
Detroit–Saginaw–Toledo–Kalamazoo–Grand Rapids–Detroit	576
Detroit–Saginaw–Kalamazoo–Toledo–Grand Rapids–Detroit	682
Detroit–Saginaw–Grand Rapids–Toledo–Kalamazoo–Detroit	646
Detroit–Grand Rapids–Saginaw–Toledo–Kalamazoo–Detroit	670
Detroit–Grand Rapids–Toledo–Saginaw–Kalamazoo–Detroit	728

$$\frac{4!}{2} = 12$$

Exhaustive search technique // vét cạn

$[(n-1)(n-2)(n-2) \dots 3 \cdot 2 \cdot 1] / 2 = (n-1)! / 2 \rightarrow O((n-1)!) \text{ complexity}$

→ Approximation algorithm

Summary

- ▶ 9.1- Graphs and Graph Models
- ▶ 9.2- Graph Terminology and Special Types of Graphs
- ▶ 9.3- Representing Graphs and Graph Isomorphism
- ▶ 9.4- Connectivity
- ▶ 9.5- Euler and Hamilton Paths
- ▶ 9.6- Shortest Path Problems

THANKS