

Chapter 5. Graph Theory

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▶ 2. Path and Cycle

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▶ 3. Graph Property

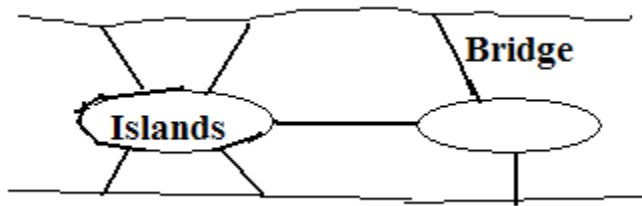
3.1 Isomorphism 3.2 Planar graphs

3.3 Vertex Coloring

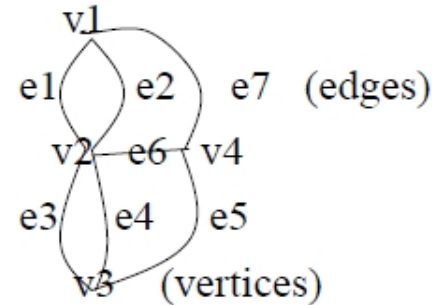


1. Introduction

Konisberg Bridge problem → developed into Graph Theory (by Leonhard Euler)



[Graph model]



Question: Starting and ending at the same point, is it possible to cross all seven bridges just once and return to the same point.

Answer: No path exists

Euler Path: Even edges leaving vertices

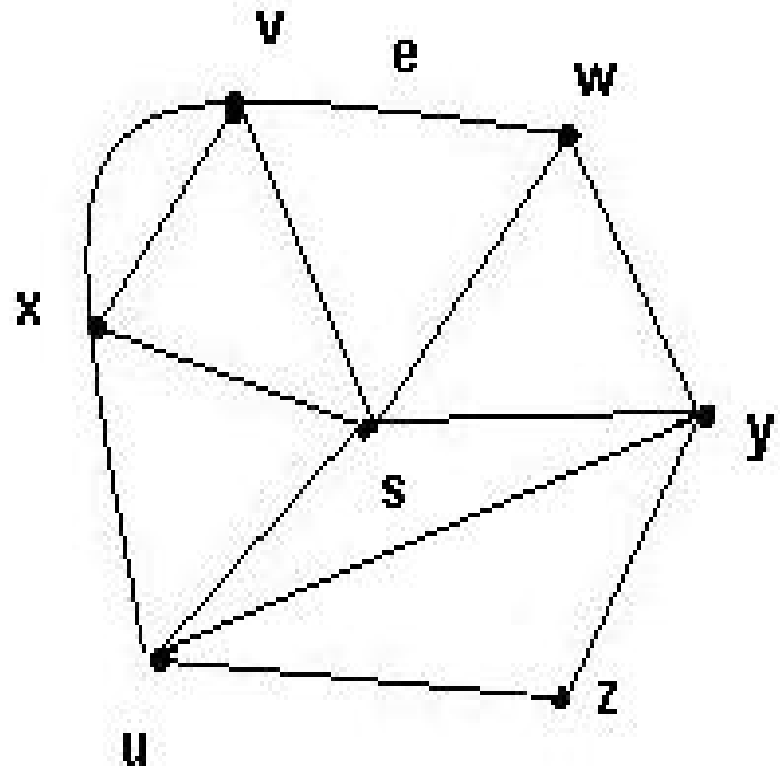
► Application area: Network, scheduling algorithm, state machine, circuit, data flow sorting and searching algorithm, social science, chemistry, EE, etc.

► Directed Graph - has arrow

Undirected Graph - no arrow

1.1 Undirected Graph

- ▶ What is a graph G ?
- ▶ It is a pair $G = (V, E)$, where
 - ▶ $V = V(G)$ = set of vertices
 - ▶ $E = E(G)$ = set of edges
- ▶ **Example:**
 - ▶ $V = \{s, u, v, w, x, y, z\}$
 - ▶ $E = \{(x,s), (x,v)_1, (x,v)_2, (x,u), (v,w), (s,v), (s,u), (s,w), (s,y), (w,y), (u,y), (u,z), (y,z)\}$
 - ▶ E is a symmetric relation on $V \Rightarrow (x,s) \in E$



Edges

- ▶ An edge may be labeled by a pair of vertices, for instance $e = (u, w)$.

e is between u and w and u

u is **adjacent** to w

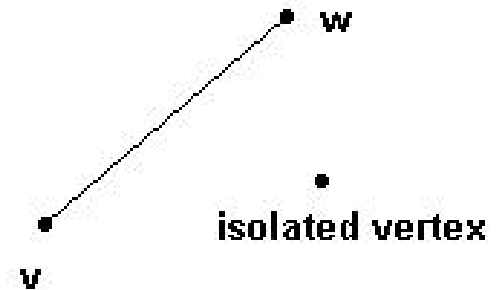
Edge e **connects** u and w

e is **unordered pair**, rather than $(u, w) \neq (w, u)$

- ▶ e is said to be ***incident*** on v and w .

- ▶ Isolated vertex =

a vertex without incident edges.



Special edges

▶ Parallel edges

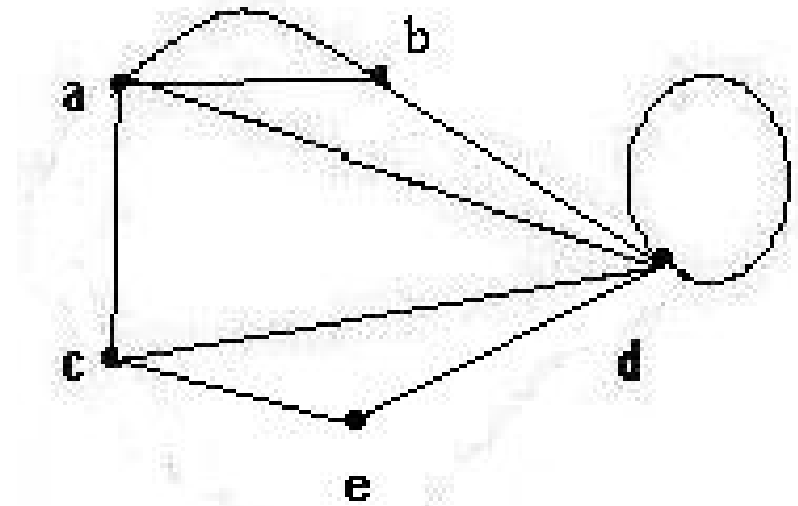
- ▶ Two or more edges joining a pair of vertices
 - ▶ in the example, **a** and **b** are joined by two parallel edges

▶ Loops

- ▶ An edge that starts and ends at the same vertex
 - ▶ In the example, vertex **d** has a loop

▶ Multi-graph

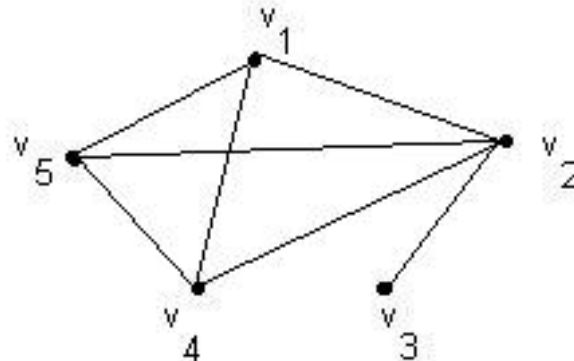
- ▶ G에서 2개 이상의 간선이 허용되는 그래프



Special graphs

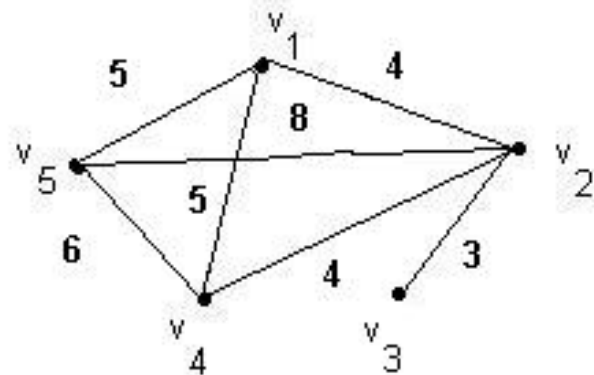
► Simple graph

- A graph without loops or parallel edges.



► Weighted graph

- A graph where each edge is assigned a numerical label or “weight”.



Subgraph, Directed Graph

- ▶ Let $G=(V,E)$ be a graph.

Let $G'=(V',E')$ be another graph, such that if

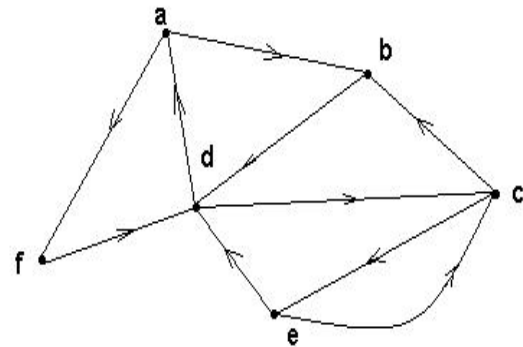
Then G' is **subgraph** of G .

$$V' \subseteq V \text{ and } E' \subseteq E$$

- ▶ G is a **directed graph** or **digraph**

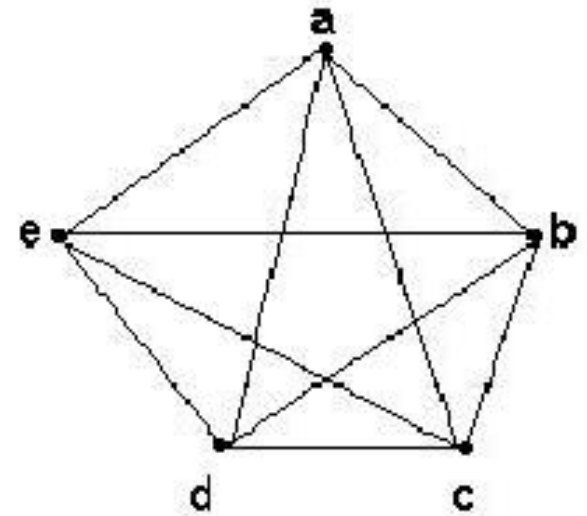
if each edge has been associated with an ordered pair of vertices,
(i.e. each edge has a direction)

$\langle v_1, v_2 \rangle$, v_1 에서 v_2 로의 간선은 화살표(\rightarrow)로 표시.



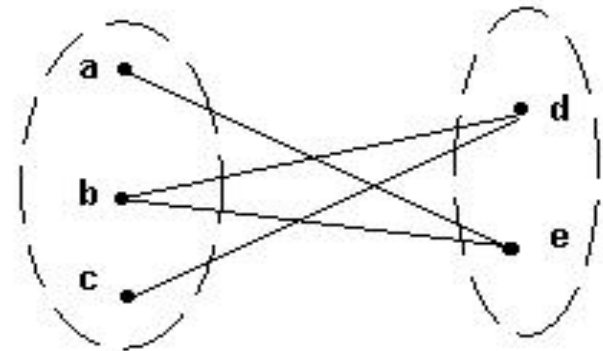
Complete graph K_n

- ▶ The **complete graph** K_n is the graph with **n vertices** and every pair of vertices is joined by an edge
- ▶ Figure represents K_5 , (when $n \geq 3$)
- ▶ Edges for $K_n = n(n-1)/2$
- ▶ Every graph is a subgraph of K_n

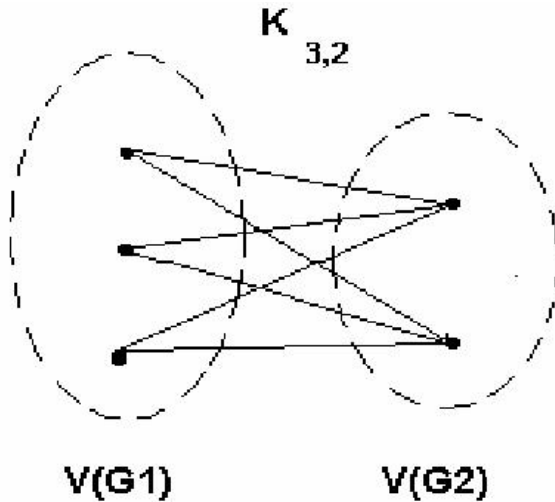


Bipartite graphs (이분그래프)

- ▶ A **bipartite** graph G is a graph such that
 - ▶ $V(G) = V(G_1) \cup V(G_2)$
(if vertex set V can be partitioned into two subsets)
 - ▶ $|V(G_1)| = m, |V(G_2)| = n$
 - ▶ $V(G_1) \cap V(G_2) = \emptyset$
- ▶ No edges exist between any two vertices in the same subset $V(G_k)$, $k = 1, 2$



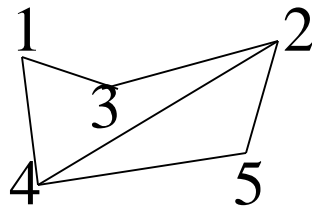
Complete bipartite graph $K_{m,n}$



- A bipartite graph is the *complete* bipartite graph $K_{m,n}$ if every vertex in $V(G_1)$ is joined to a vertex in $V(G_2)$ and conversely,
- $|V(G_1)| = m$
- $|V(G_2)| = n$

ex) Complete Bipartite graph ex) $K_{2,4}$ $K_{3,3}$?

ex)



Connected graphs

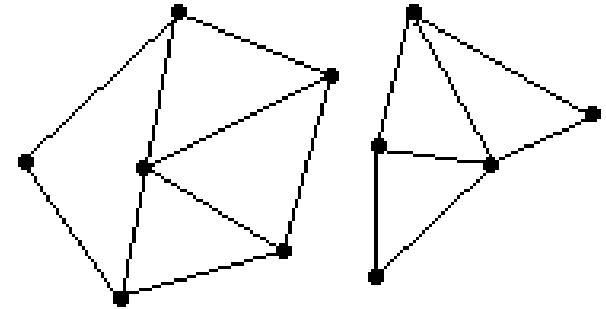
- ▶ A graph is *connected* if every pair of vertices can be connected by a path
(strongly connected: $(a,b) \in E$,
 $(b,a) \in E$)

- ▶ Each connected subgraph of a non-connected graph G is called a *component* of G

- ▶ **Connectivity Number** = Number of connected components

Connectivity number of $G = C(G)$

- ▶ G is connected iff $C(G) = 1$



2 connected components

$$C(G) = 2$$



Algorithm for Connectivity

► { Let $G=(V,E)$ be graph, $C=C(G)$ }

begin

$V' \leftarrow V$

$C \leftarrow 0$

while $V' \neq \emptyset$ do

begin

choose $y \in V'$

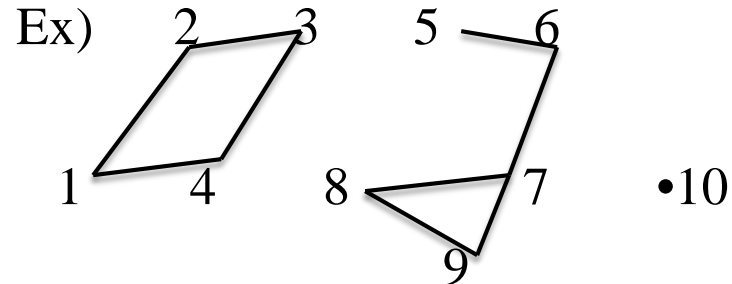
Find all vertices connected to y

remove these from V'

$C \leftarrow C+1$

end

end



$V' = \{1, 2, 3, \dots, 10\}$

Choose $y = 5$ (any number 1~10)

remove 5, 6, 7, 8, 9 from V' ,

$V' = \{1, 2, 3, 4, 10\}$ $C=1$

Choose $y=1$,

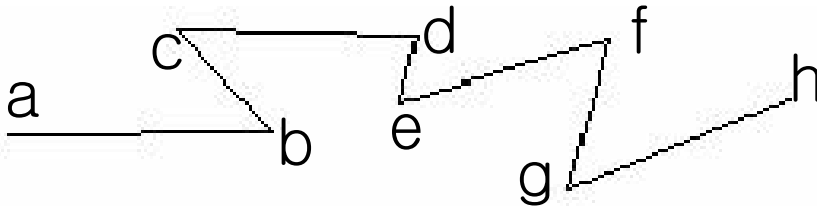
remove 1, 2, 3, 4 from V' , $V' = \{10\}$ $C=2$

Choose $y = 10$

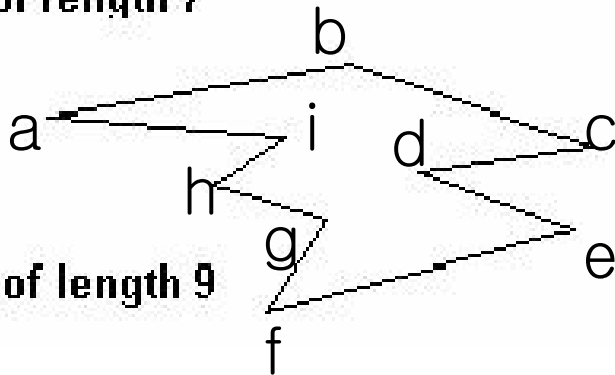
remove 10 from V' , $V' = \{\}$ $C=3$

Therefore $C = 3$

2. Path and cycle(Circuit)



Path of length 7



Cycle of length 9

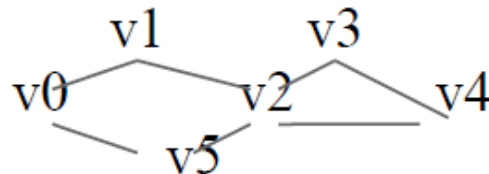
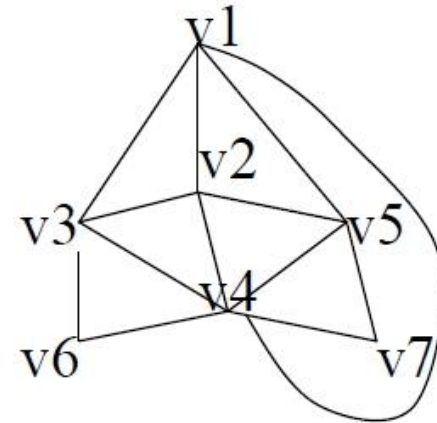
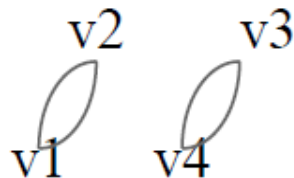
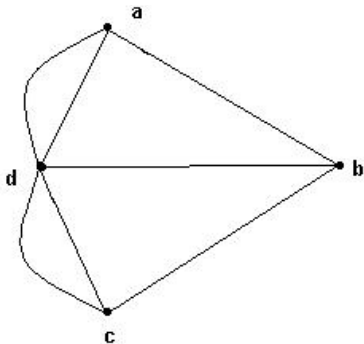
- ▶ A **path** of length n is a sequence of $n + 1$ vertices and n consecutive edges ($n+1$ vertices and n edges)
- ▶ A **cycle** is a path that begins and ends at the same vertex ($v_0 = v_k$), (no edges repeated)
- ▶ Must have at least 3 edges.
- ▶ Acyclic: does not have any cycle

2.1 Euler cycle (Circuit)

- ▶ Definition: Start and ends at the same vertex, uses every vertex at least once, and uses every edge exactly once.

(G has an Euler cycle if and only if G is connected and all its vertices have even degree)

- ▶ Ex) Find Euler Cycle



ex) Let G be a connected graph. Suppose that an edge e is in cycle.
Show that G with e removed is still connected

(pf) Suppose that $e = (v, w)$ is in cycle. Then there is a path P from v to w not including e .

► Thm: If a graph G has Euler cycle, then G is connected and every vertex has even degree

(pf) Suppose G has an Euler cycle. From the previous argument for the graph, every vertex in G has even degree.

If v and w are vertices in G , the portion of the Euler cycle that takes us from v to w serves as a path from v to w . Therefore, G is connected.

=> If some vertex of G has odd degree, then the G does not have an Euler cycle.



2.2 Eulerian Path

- ▶ $\text{Start} \neq \text{End}$,
- ▶ $v(\text{start}), w(\text{end}) \Rightarrow \text{odd degree}$ (2 vertices have odd degree)
- ▶ all other vertices of G have even degree

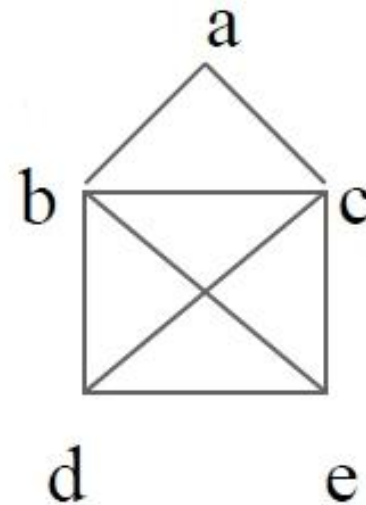
Ex)

$d, e \Rightarrow \text{degree } 3$ (odd degree)

all other $\Rightarrow \text{even degree}$

(must start from d or e)

$d, e, c, a, b, c, d, b, e \Rightarrow \text{has E. path}$

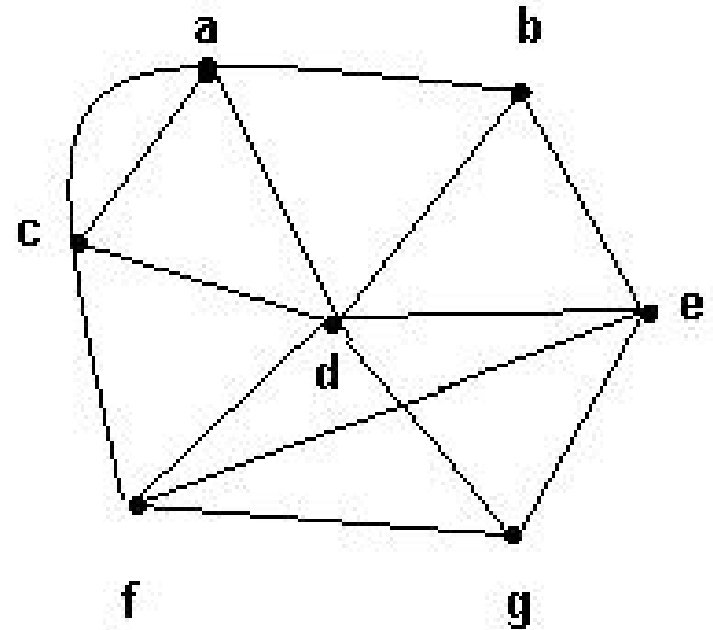


Degree of a vertex

- ▶ The *degree* of a vertex v , denoted by $\delta(v)$, is the number of edges incident on v

- ▶ Example:

$\delta(a) = 4$, $\delta(b) = 3$, $\delta(c) = 4$, $\delta(d) = 6$,
 $\delta(e) = 4$, $\delta(f) = 4$, $\delta(g) = 3$.

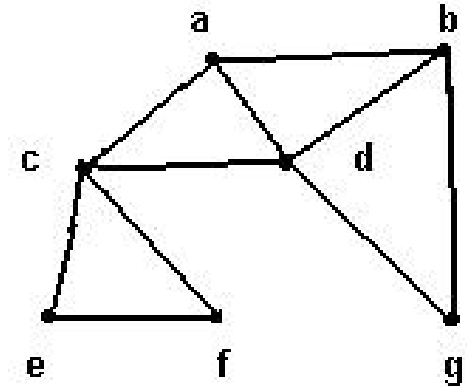


- ▶
$$\sum_{i=1}^n \delta(v_i) = 2 |E|$$

from example, number of $E = 14$,
sum of $\delta(v) = 28$

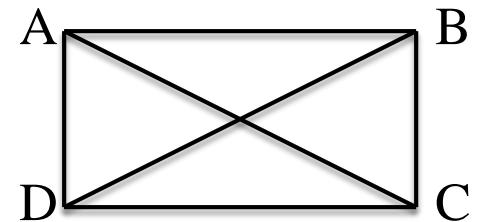
2.3 Hamiltonian cycles(circuit)

- ▶ Definition: Simple circuit that passes through **every vertex exactly once**
(No rule to find H.C)
- ▶ Every known algorithm requires exponential or factorial time in worst case



A non-Hamiltonian graph

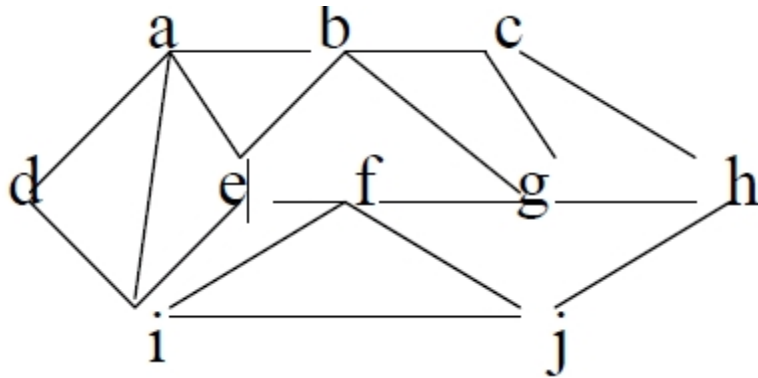
- ▶ If edges are assigned positive weights, and object is to find H.C. of least total weight
 \Rightarrow *Traveling salesperson problem(TSP)*
 - Given a weighted graph G, find a minimum- length Hamiltonian cycle in G.
 - No known algorithm to solve TSP in polynomial time.



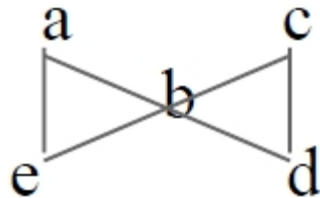
HC \Rightarrow (A, B, C, D, A)

Hamiltonian Cycle ('cont)

* Find Hamiltonian Cycle



Q: Give an Example of a graph that has an EULER cycle, but contains no H.C



Hamiltonian Cycle ('cont)

► **Nearest Neighbor Method** (sub-optimal solution)

1. Choose any $v_1 \in V$
2. $v' \leftarrow v_1$
3. $w \leftarrow 0$
4. add v' to list of vertices in path
5. while unmarked vertices remain do
 mark v'
 choose any unmarked vertex u , that is closest to v'
 add u to list of vertices in path
 $w \leftarrow w + \text{the weight of edge } \{v', u\}$
 $v' \leftarrow u$
6. add v' to list of path
7. $w \leftarrow w + \text{weight of edge } \{v', v_1\}$



apply Nearest Neighbor Algorithm

(choose any vertex, start at B)

. $w = 0$; path list = B

. unmarked vertices \Rightarrow A, C, D

A is closest (since weight = 5)

add A to path ($w=5$)

mark A

unmarked vertices \Rightarrow C, D, (C is closest)

add C to path ($w=5+6$) ; mark C

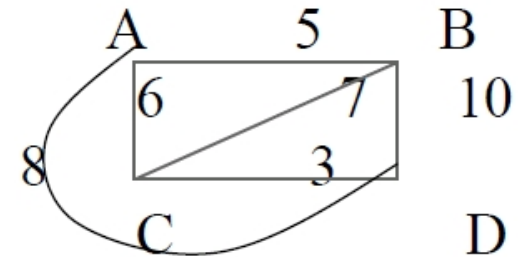
unmarked \Rightarrow D

add D to path ($w=14$)

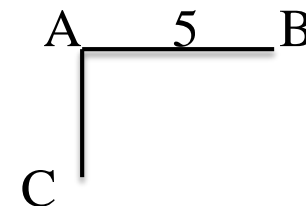
no unmarked vertices

. Add B to path (path = B A C D B) A 5 B and $w = 14 + 10 = 24$

Therefore, results & weight = 24.



A — 5 — B



➔ It may not be best solution!! (Because there is shorter path, 23)

2.4 A shortest-path algorithm (Dijkstra)

- ▶ Dijkstra's algorithm finds the length of the shortest path from a single vertex to any other vertex in a connected weighted graph.

(shortest path \Rightarrow least total weight)

- ▶ Weight matrix representation \Rightarrow

$w(x,y) = 1) 0$, if $x=y$

2) ∞ , if (x,y) is not an edge

3) the weight of edge (x,y)

* Input: weighted graph (positive)

Output: $L(z)$, the length of shortest path from a to z

Procedure dijkstra (w, a, z, L)

$L(a) := 0$

for all vertices $x \neq a$ do

$L(x) = \infty$

$T :=$ set of all vertices

While $z \in T$ do

begin

choose $v \in T$ with minimum $L(v)$

$T := T - \{v\}$

for each $x \in T$ adjacent to v do

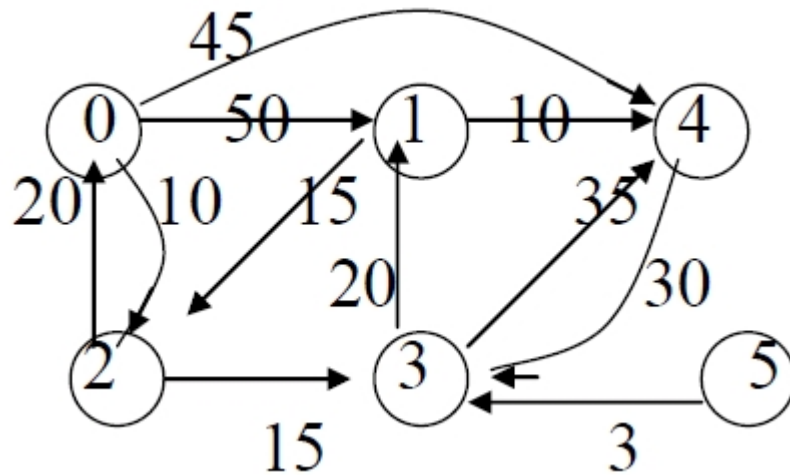
$L(x) = \min\{L(x), L(v) + w(v,x)\}$

end

end dijkstra

if (distance[v] + cost[v,x] < distance[x])
distance[x] = distance[v] + cost[v,x];

Shortest path example



Vertex	0	1	2	3	4	5
<i>Distance</i>	0	50	10	999	45	999
<i>S</i>	1	0	0	0	0	0

1. $S = \{v_0\}$: 초기는 공백

distance(1) = 50

distance(2) = 10

distance(3) = 999

distance(4) = 45

distance(5) = 999

$\leq \min$

Vertex	0	1	2	3	4	5
<i>distance</i>	0	50	10	999	45	999
<i>S</i>	1	0	1	0	0	0

<< 비용인접행렬 >>

	0	1	2	3	4	5
0		50	10		45	
1			15		10	
2	20			15		
3		20			35	
4				30		
5				3		

Shortest path example

2. $S = S \cup \{v_2\} = \{v_0, v_2\}$

distance(1) ← min{distance(1), distance(2)+(v₂,v₁,999)} **50**
distance(3) ← min{distance(3), distance(2)+(v₂,v₃,15)} **25 ≤ min**
distance(4) ← min{distance(4), distance(2)+(v₂,v₄,999)} **45**
distance(5) ← min{distance(5), distance(2)+(v₂,v₅,999)} **999**

vertex	0	1	2	3	4	5
<i>distance</i>	0	50	10	25	45	999
S	1	0	1	1	0	0

3. $S = S \cup \{v_3\} = \{v_0, v_2, v_3\}$

distance(1) ← min{distance(1), distance(3)+v₃,v₁,20)} **45 ≤ min**
distance(4) ← min{distance(4), distance(3)+(v₃,v₄,35)} **45**
distance(5) ← min{distance(5), distance(3)+(v₃,v₅,999)} **999**

Vertex	0	1	2	3	4	5
<i>Distance</i>	0	45	10	25	45	999
S	1	1	1	1	0	0

Shortest path example

$$4. S = S \cup \{v1\} = \{v0, v1, v2, v3\}$$

distance(4) <- min{distance(4), distance(1)+(v1,v4,10)} 45 <= min
distance(5) <- min{distance(5), distance(1)+(v1,v5,999)} 999

Vertex	0	1	2	3	4	5
<i>distance</i>	0	45	10	25	45	999
S	1	1	1	1	1	0

$$5. S = S \cup \{v4\}$$

distance(5) <- min{distance(5), distance(4)+(v4,v5,999)} 999 <= in

Vertex	0	1	2	3	4	5
<i>Distance</i>	0	45	10	25	45	999
S	1	1	1	1	1	1

$$6. S = S \cup \{v5\}$$



Representations of graphs

► Adjacency matrix

Rows and columns are labeled with ordered vertices

Write '1' if there is an edge
'0' if no edge exists

► **THM:** Let $G = (V, E)$, $n = |V|$

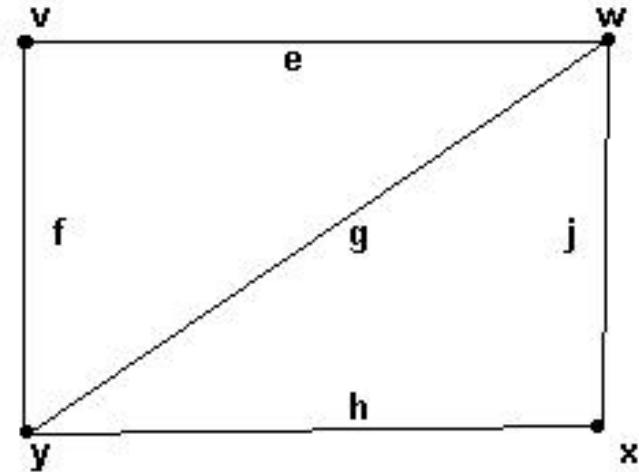
$E^* = E^1 \cup E^2 \cup E^3 \dots \cup E^n$: composition of relation.

Given E has adjacency matrix M .

We compute M^* by successive products of M itself.

$$M^* = M^1 \cup M^2 \cup M^3 \dots \cup M^n$$

⇒ Too laborious, ..



	v	w	x	y
v	0	1	0	1
w	1	0	1	1
x	0	1	0	1
y	1	1	1	0

3. Graph Properties

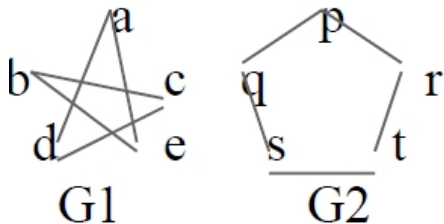
3.1 Isomorphic graphs

- DEF: In math terms, when two objects have essentially same structure, they are Isomorphic.

- Finding Isomorphic: 1) G_1 and G_2 are **isomorphic**, if there exist one-to-one onto (bijection) functions . Let $G_1=(V_1, E_1)$, $G_2=(V_2, E_2)$ be graphs.

Let $f:V_1 \rightarrow V_2$, $\forall u,v \in V_1$, $\{u,v\} \in E_1$, iff $\{f(u), f(v)\} \in E_2$

- Ex) Show two graphs are Isomorphic



v	a	b	c	d	e
f(v)	p	s	t	r	q

{u,v}	{f(u), f(v)}
a d	p r
a e	p q
b c	s t
b e	s q
c d	t r

arbitrarily, $f(a) = p$, a 's neighbor $\rightarrow d,e \Rightarrow f(d) = r$

p 's neighbor $\rightarrow q,r$, $f(e) = q$, $f(b) = s$, since $f(e)=q$, $f(a) = p \therefore f(c) = t$

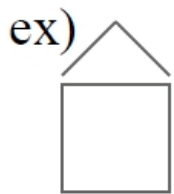
➔ Difficult if complex Graph

Isomorphic graphs

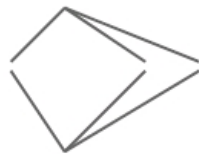
2) Alternative Method : G_1 and G_2 are isomorphic iff their **Adjacency matrices are equal**

3) Easy way to find NOT isomorphic (Invariant property)

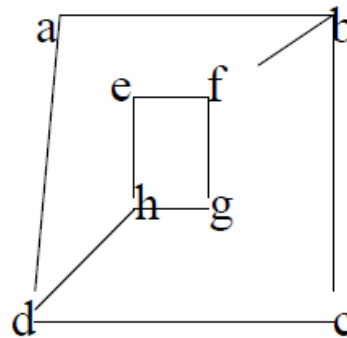
- compare same vertex, edges, if not \Rightarrow NOT isomorphic
- try to find cycles in the graph (try to find some characteristics)



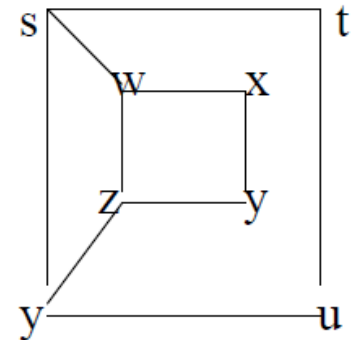
G_1



G_2



G



H

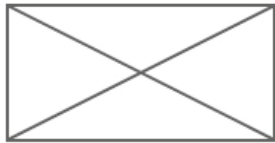
G_1 has cycle of length 3, G_2 ?



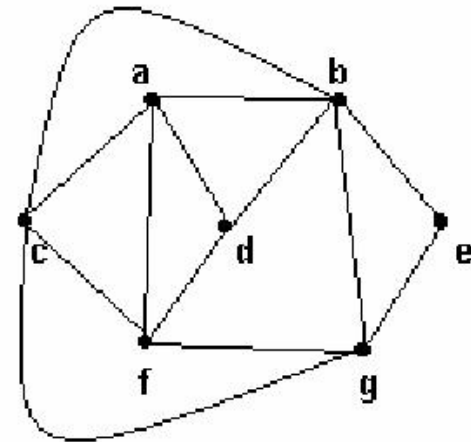
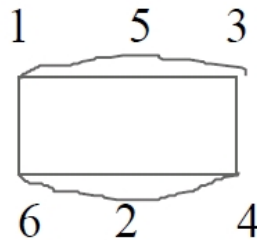
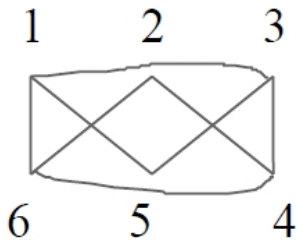
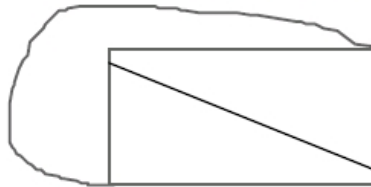
3.2 Planar graphs

Definition: A graph is *planar* if it can be drawn in the plane without crossing edges

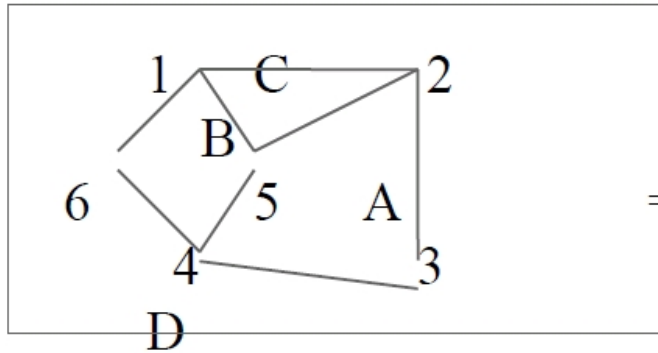
K_4 (complete graph)



noncrossing edges



Finite Planar Graph (MAP)



6 vertices , 8 edges
 \Rightarrow divides the plane into 4 regions
 (A,B,C,D)

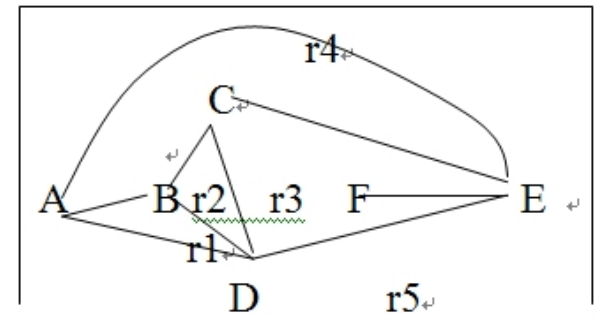
. MAP divides the plane into various regions
 \Rightarrow FACES

. we can assume map is contained in large rectangle
 \rightarrow border of each region consists of edges

. Degree of region, $\deg(r) = \text{length of cycle borders } r$.

Thm:

The sum of degrees of the regions of map is equal to twice the number of edges ($\sum \deg(r) = 2E$)



$\deg(r1) = 3$, $\deg(r2) = 3$,
 $\deg(r3) = 5$, $\deg(r4) = 4$,
 $\deg(r5) = 3$,
 sum of $\deg = 18$,
 number of edges $= 9 \times 2 = 18$

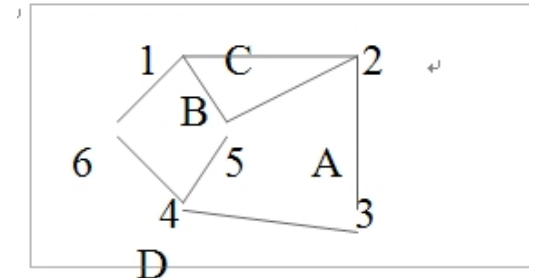


Finite Planar Graph (MAP)

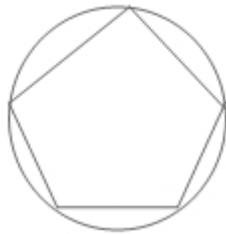
- **Euler's formula: (used to show certain Graph is not planar)**

$$f = e - v + 2 \quad (\text{or } V - E + F = 2)$$

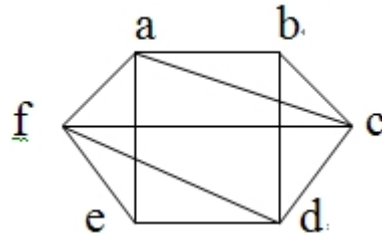
ex) $V = 6, E = 8$, so, $f = 8 - 6 + 2 \Rightarrow 4$ faces(regions)



ex) $f = 10 - 5 + 2 = 7$



ex)



Ex) A connected planar graph has nine vertices having degrees, 2,2,2,3,3,3,4,4,5.

How many edges are there? How many faces are there?

(sol) $2e = 2+2+2+3+3+3+4+4+5 = 28$ so, $e = 14$ $f = e - v + 2 = 14 - 9 + 2 = 7$

Ex) Why can there not exist a graph whose degree sequence is 5,4,4,3,2,1?

- (sol) because $\sum(d)$ is 19, which is not even, not $2|E|$

Non Planar Graph

ex) Show that $K_{3,3}$ is not planar

(sol) $V=6$, $E=9$ edges, by Euler's formula, F must be 5 ($F=9-6+2 \Rightarrow 5$)

but no three vertices connected together, so degree of each regions 4 or more
and total degree is $\Rightarrow (5 \text{ regions} \times 4 \text{ or more degree/region}) = 20$ or more
degrees. but by the theorem “sum of degrees = $2E = 18$ ”, Graph has only 9
edges, which is contradiction

► **Thm: if G is connected & $V \geq 3$ then, $E \leq 3V-6$**

(pf) $V-E+F=2$, ($\sum \deg(r) = 2E$), $2E \geq 3F$ (each region's degree \geq degree 3)

$F \leq 2E/3$, $2 \leq V-E + 2E/3$ ($v-e+f=2$ 에 서), $2 \leq V-E/3 \Rightarrow E \leq 3V-6$

ex) $V=5$, $E=10$, $3V-6=3 \times 5-6=9$ $E=10$, $10 \leq 9$

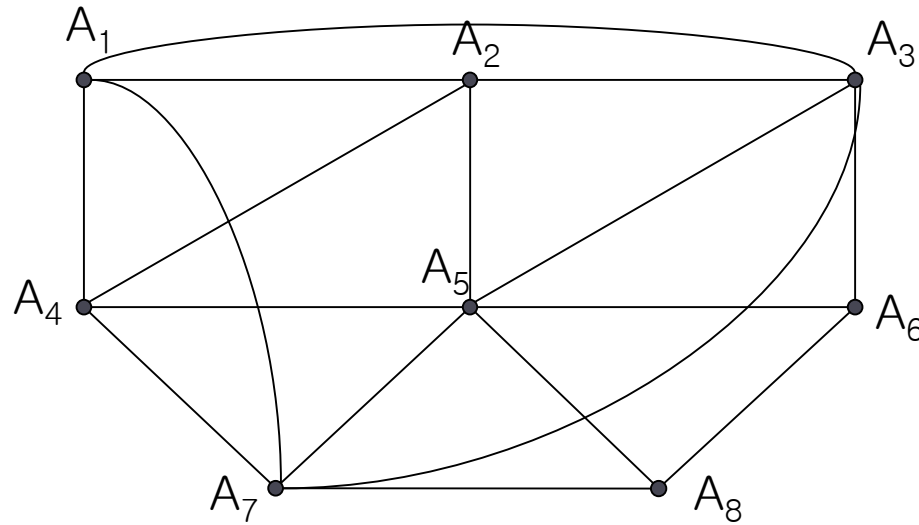
The graph is not Planar



3.3 Vertex Coloring (정점의 착색)

- ▶ 두 개의 서로 다른 인접한 정점이 같은 색을 갖지 않으면 이러한 착색을 정점 착색(vertex coloring)이라 한다
- ▶ N 가지 색으로 color가 가능하다면 N -colorable이라고 하고, 최소 색의 가지수를 착색수(chromatic number)라 하고, $X(G)$ 로 표기함.
- ▶ **Welch-Powell의 알고리즘**
 - ▶ (1) G 의 정점의 차수가 내림차순이 되게 배열한다(이 배열은 차수가 같은 정점이 여러 개 있을 수 있으므로 몇 가지 다른 순서가 존재할 수 있다).
 - ▶ (2) 배열의 첫 번째 정점은 첫 번째 색으로 착색하고 계속해서 배열의 순서대로 이미 착색된 정점과 인접하지 않은 정점을 모두 같은 색으로 착색한다.
 - ▶ (3) 배열에서 착색되지 않은 다음 정점을 두 번째 색으로 착색하고 배열의 순서대로 이미 착색된 정점과 인접하지 않은 정점을 모두 착색한다.
 - ▶ (4) 계속해서 위의 과정을 그래프의 모든 정점이 착색될 때까지 반복한다.

Ex) 다음 그래프를 Welch-Powell 알고리즘으로 착색하라.

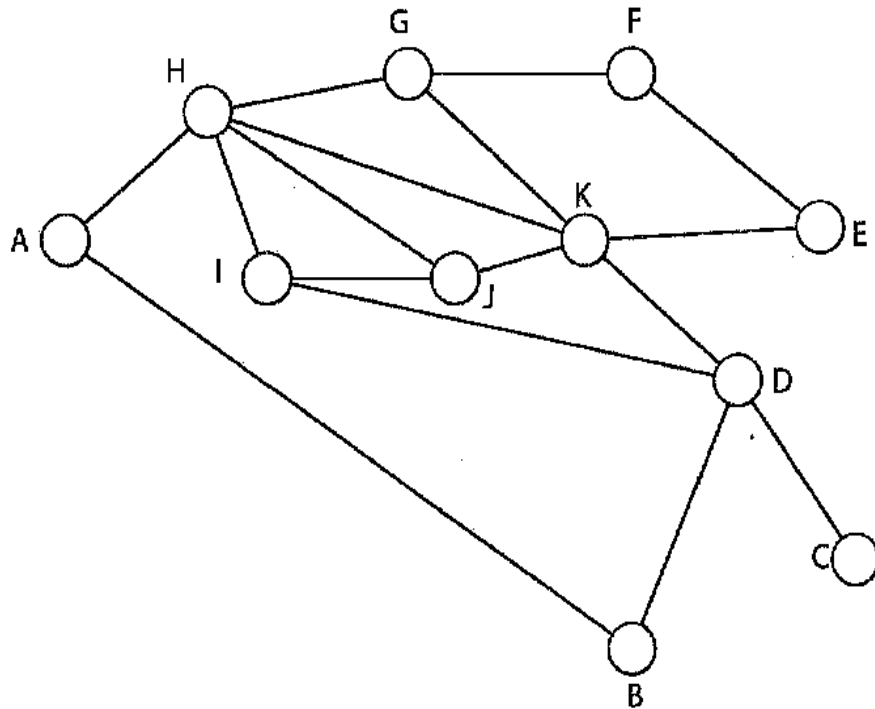


[sol] 정점들을 내림차순으로 배열하면 $A_5, A_3, A_7, A_1, A_2, A_4, A_6, A_8$ 이다. A_5 와 A_1 이 먼저 첫 번째 색으로 착색되고, 다음 A_3, A_4, A_8 이 두 번째 색으로 착색되며, 마지막으로 A_7, A_2, A_6 이 세 번째 색으로 착색된다.

따라서 그래프는 3-색이 (3-colorable) 가능하다.



Coloring example



Vertex	Valence
A	2
B	2
C	1
D	4
E	2
F	2
G	3
H	5
I	3
J	3
K	5

H, K, D, G, I, J, A, B, E, F, C