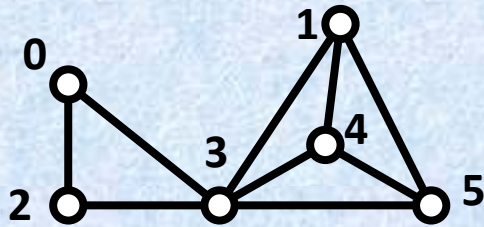


# Graph



- ❖ **Nodes, Vertices**
- ❖ Servers, cities...
- ❖ Persons, people...
- ❖ Objects in comp. science
- ❖ ... etc.

- ❖ **Edges**
- ❖ Connections, roads...
- ❖ Personal relations
- ❖ Relations among objects
- ❖ ... etc.

## Usual graph representations

| nodes<br>= indices | Node<br>degrees | Lists of<br>neighbours |
|--------------------|-----------------|------------------------|
| 0                  | 2               | 2 3                    |
| 1                  | 3               | 3 4 5                  |
| 2                  | 2               | 0 3                    |
| 3                  | 5               | 0 2 1 4 5              |
| 4                  | 3               | 1 3 5                  |
| 5                  | 3               | 1 3 4                  |

1D/2D array, vector, ArrayList...

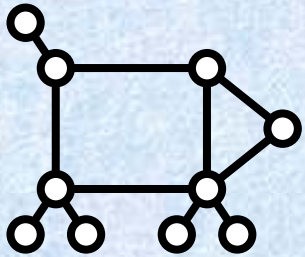
Less obvious, more effective

| Nodes = indices | 0 | 1 | 2 | 3 | 4 | 5 |
|-----------------|---|---|---|---|---|---|
| 0               | 0 | 0 | 1 | 1 | 0 | 0 |
| 1               | 0 | 0 | 0 | 1 | 1 | 1 |
| 2               | 1 | 0 | 0 | 1 | 0 | 0 |
| 3               | 1 | 1 | 1 | 0 | 1 | 1 |
| 4               | 0 | 1 | 0 | 1 | 0 | 1 |
| 5               | 0 | 1 | 0 | 1 | 1 | 0 |

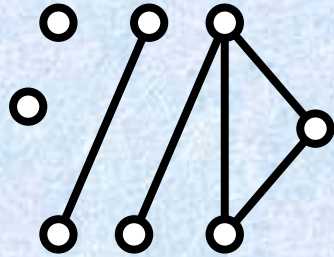
2D array, matrix

Plain, obvious, less effective

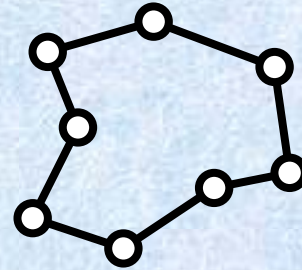
## Small graph zoo



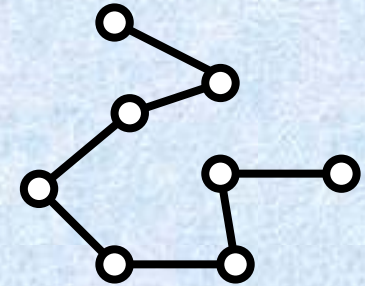
❖ **Connected graph**



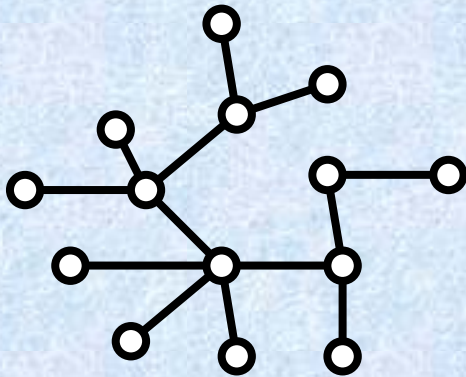
❖ **Disconnected graph**



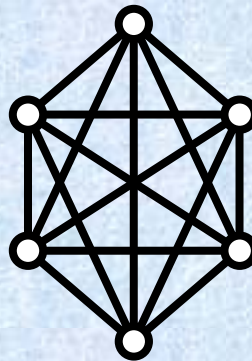
❖ **Cycle / circle**  
❖  $N$  nodes,  
 $N$  edges



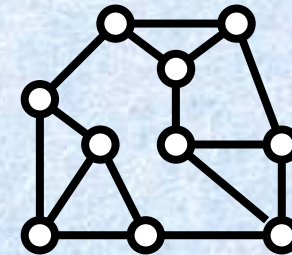
❖ **Path**  
❖  $N$  nodes,  
 $N-1$  edges



❖ **Tree**  
❖ Connected  
❖  $N$  nodes,  $N-1$  edges  
❖ is bipartite

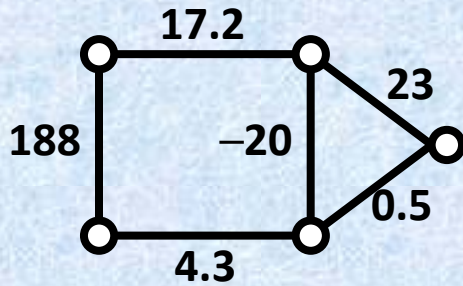


❖ **Complete graph**  
❖  $N$  nodes  
❖  $(N^2-N)/2$  edges

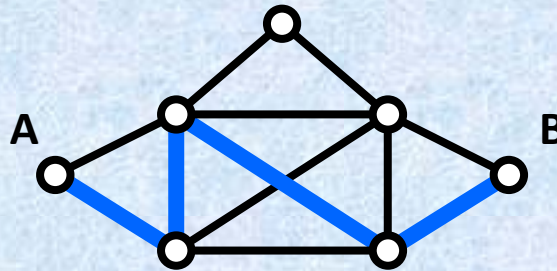


❖ **Regular graph**  
❖ All node degrees are the same

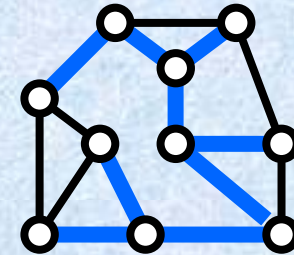
## Small graph zoo



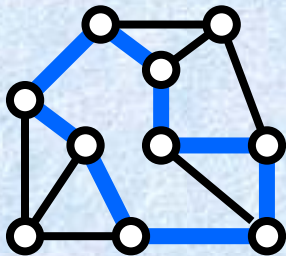
- ❖ **Weighted graph**
- ❖ Each edge has its cost (length, weight)



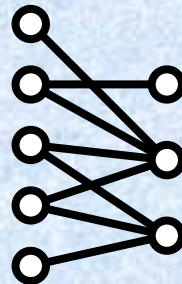
- ❖ **Path between A and B**
- ❖ Path visits each node at most once



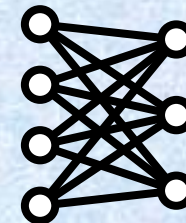
- ❖ **Spanning tree**
- ❖ subgraph which is a tree and it contains all nodes



- ❖ **Cycle in a graph**
- ❖ path which first and last node are the same

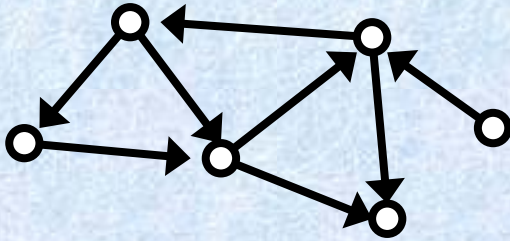


- ❖ **Bipartite graph**
- ❖ two-colorable
- ❖ cycles only of even length
- ❖ No edges inside partitions

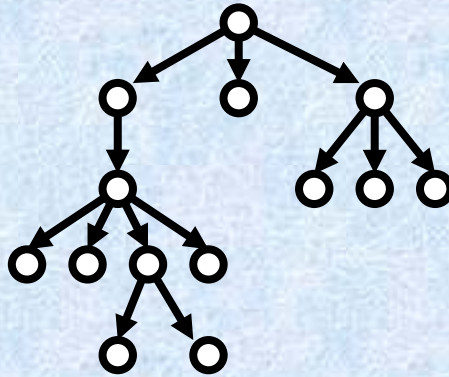


- ❖ **Complete bipartite graph**
- ❖ M and N nodes in partitions
- ❖ M x N edges

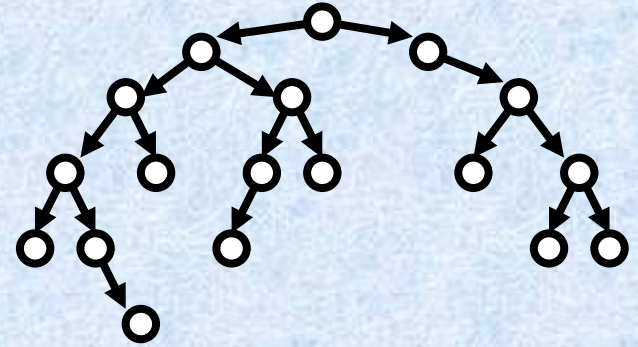
# Small graph zoo



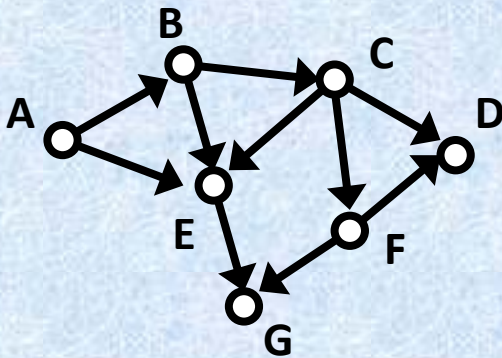
❖ Directed graph



❖ Rooted tree

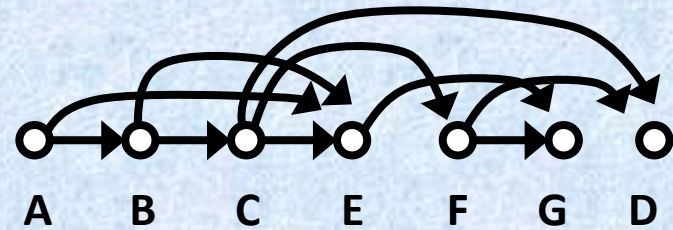


❖ Binary rooted tree



❖ Directed acyclic graph (DAG)

❖ No directed loops



❖ Topological order  
of the same DAG

**A few apparently innocuous problems  
related to graphs**

## A few apparently innocuous problems related to graphs

**Easy problem = a complete solution may be taught in bachelor courses.**

**Hard problem = a complete solution is unknown to this day.**

(However, there often exist satisfactory approximate solutions.  
Typically, they are quite advanced)

### Clay Mathematics Institute

*<http://www.claymath.org/millennium-problems/rules-millennium-prizes>*

Offers prize **1 000 000 \$** for a complete solution of any of those hard questions.

The prize exists since the year 2000.

Nobody has claimed it yet :-| ...



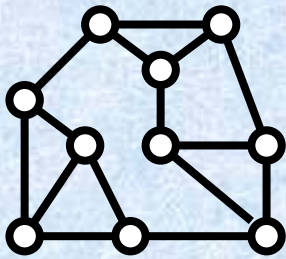
# Connectivity

Is there a path between any two nodes?

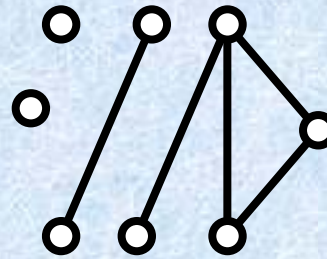
Easy problem

**Algorithm:** DFS, BFS, Union-Find

**Complexity:** DFS, BFS  $O(|V| + |E|)$ , Union-Find  $O(|E| \cdot \alpha(|V|))$



Yes,  
one connected component.



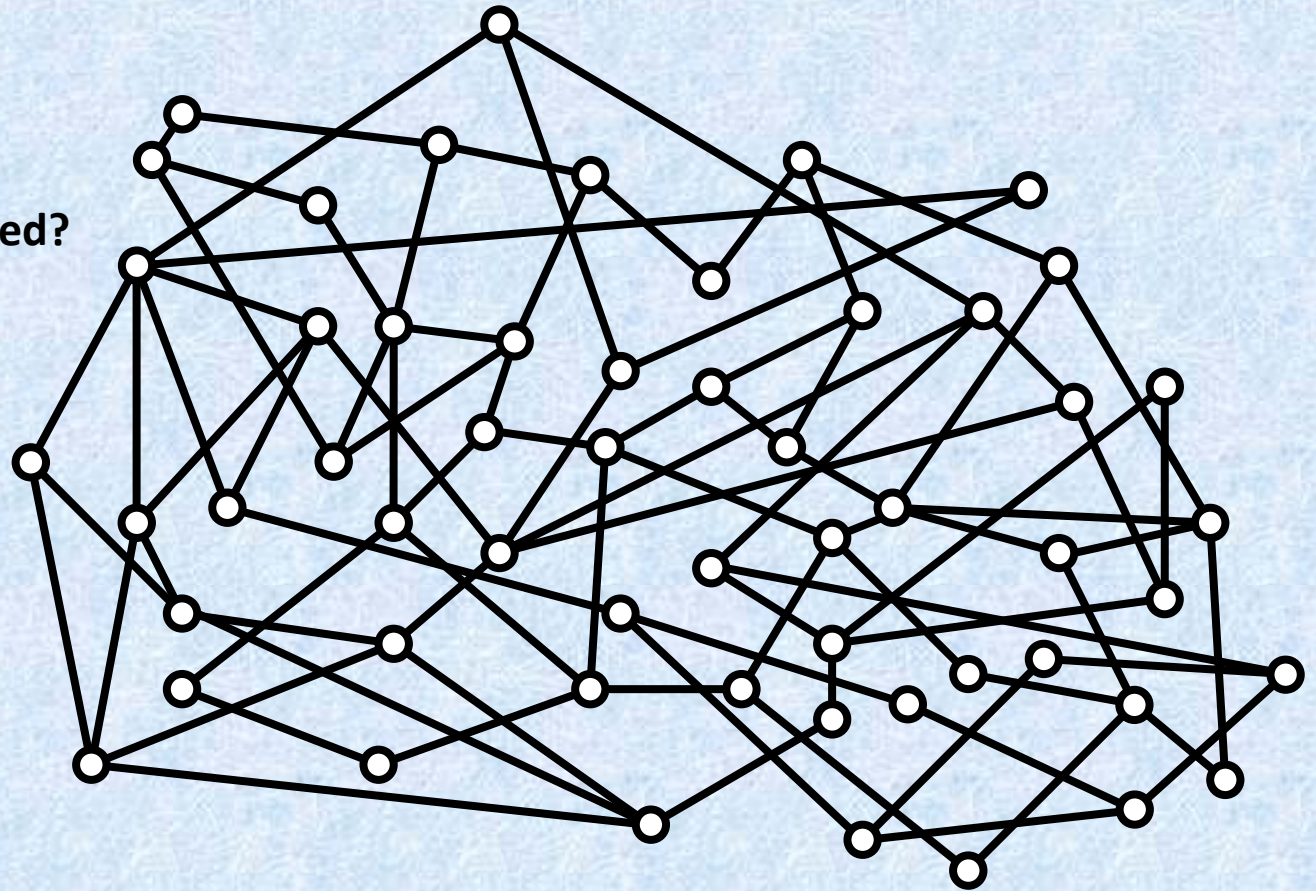
No,  
four connected components.

# Connectivity

Is there a path between any two nodes?

Easy problem

Is the graph connected?





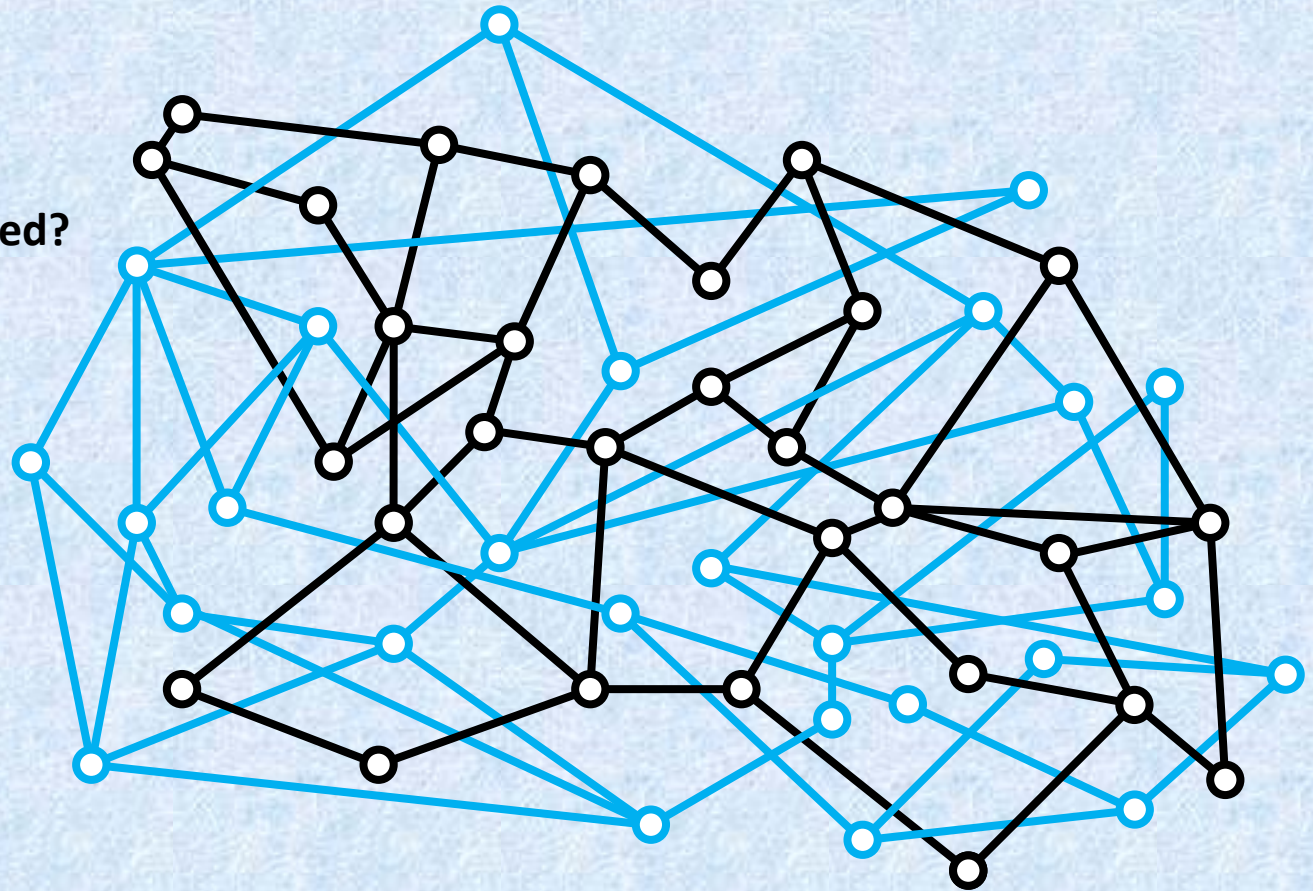
# Connectivity

Is there a path between any two nodes?

Easy problem

Is the graph connected?

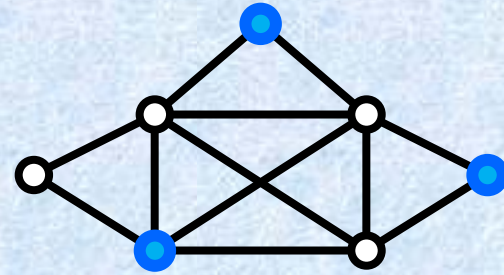
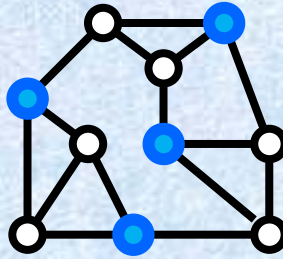
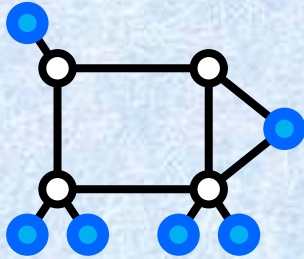
No,  
it consists of  
two components.



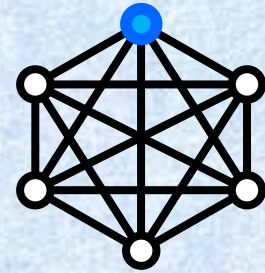
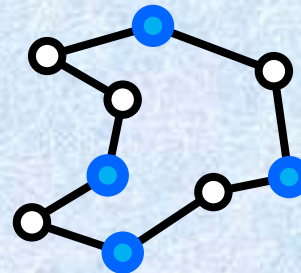
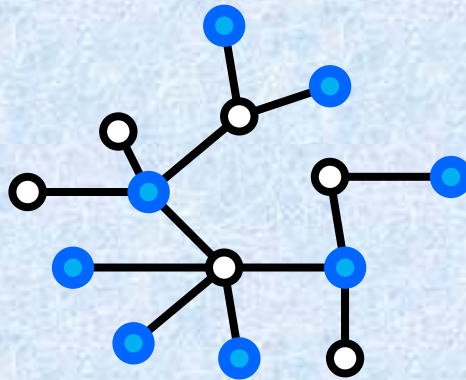
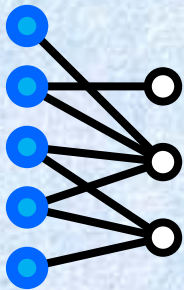
# Independence

Maximum size of a set of nodes in which no two nodes are adjacent.

Hard problem in general



Easy problem on graphs with some particular structure



❖ Bipartite graph

❖ Tree is always bipartite

❖ Cycle

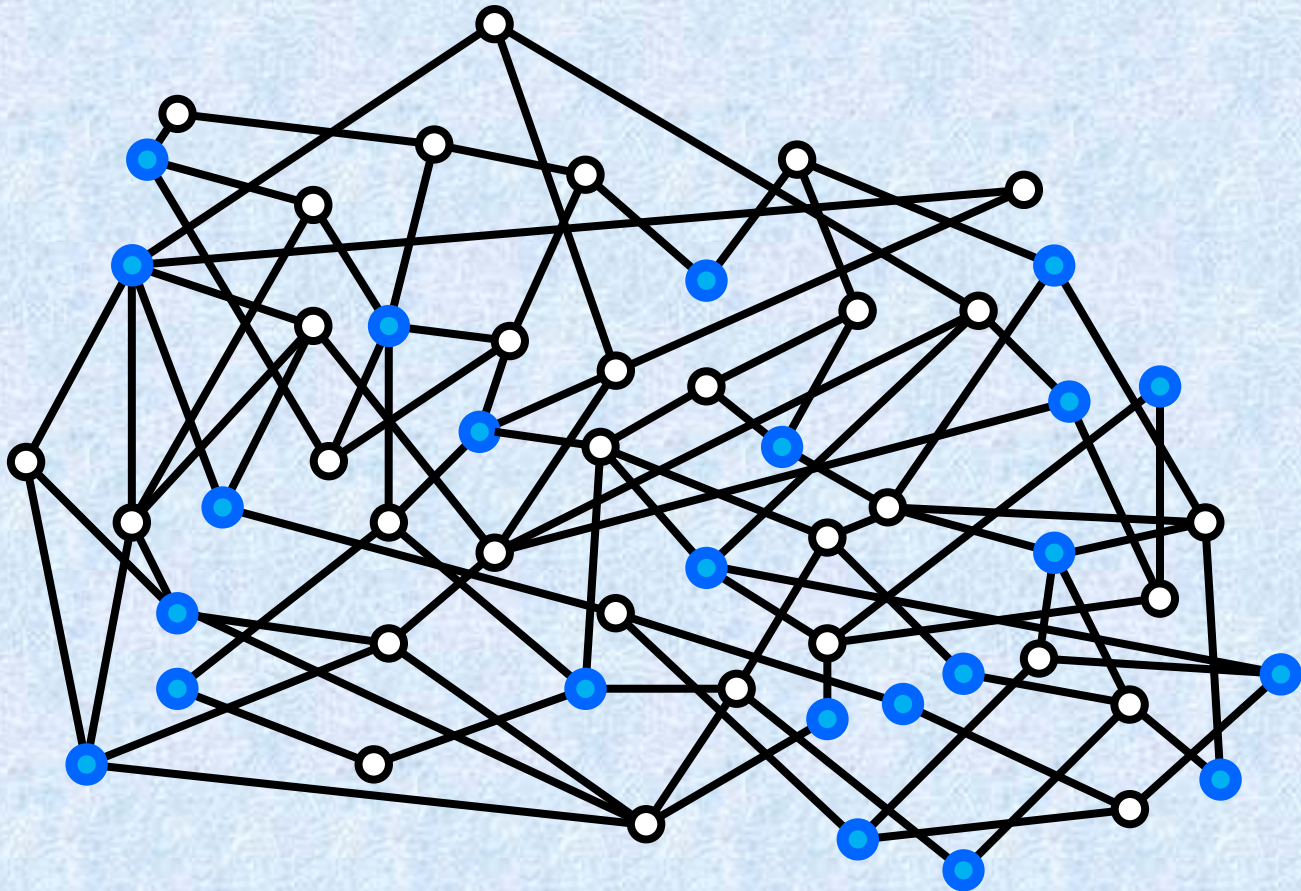
❖ Complete graph

# Independence

Maximum size of a set of nodes in which no two nodes are adjacent.

*Ex: How many of them in this graph? more than 23?*

**Hard problem**

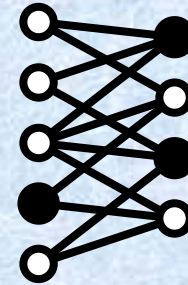
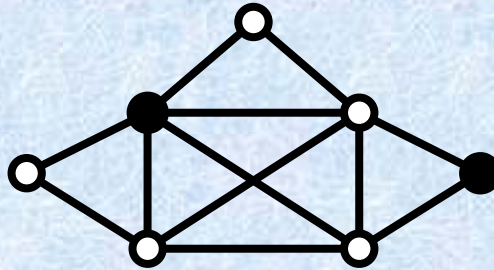
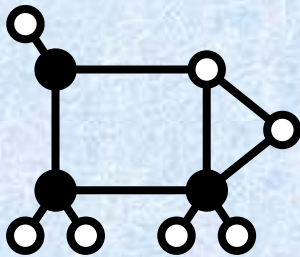


# Dominance

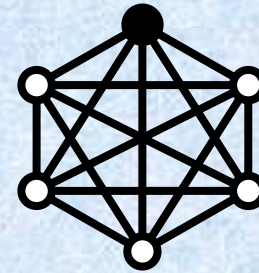
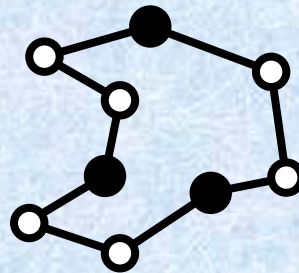
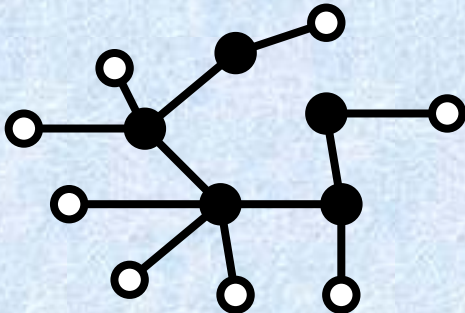
Maximum size of such set  $M$  of nodes that each node in the graph is either in  $M$  or is a neighbour of some node in  $M$ .

*Ex. A fire station must be located either in a village or in the immediately neighbour village. How many fire stations are enough to serve the region?*

## Hard problem



## Easy problem on graphs with some particular structure



❖ Tree, apply Dynamic programming

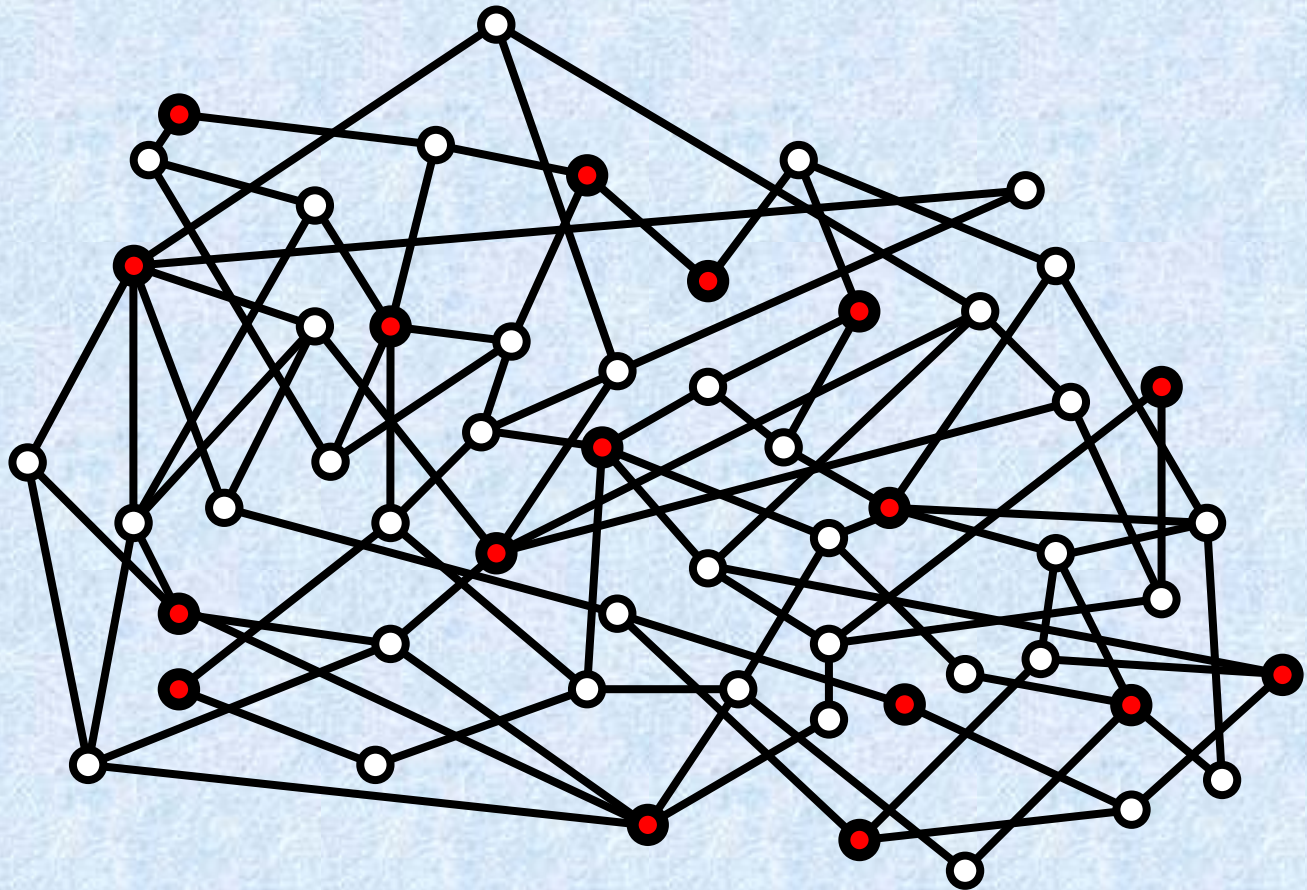
❖ Circle

❖ Complete graph

# Dominance

*Ex. A fire station must be located either in a village or in the immediately neighbour village. Can there be less than 17 fire stations to serve the region?*

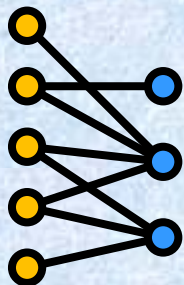
**Hard problem**



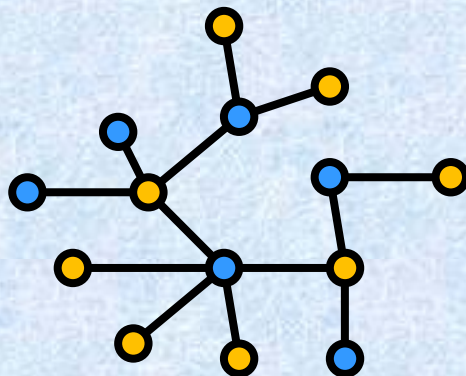
# Colorability, chromatic number

Minimum number of colors needed to color each node so that any two neighbours have different color.

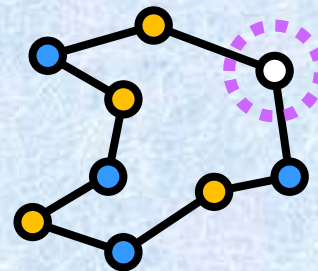
Is 2 colors enough? -- Easy problem. Graph must be bipartite.



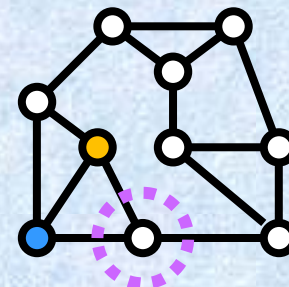
2 colors ,  
bipartite graph



2 colors for  
any tree



2 colors are not  
enough in a cycle  
of odd length.



2 colors are not  
enough, there is  
a cycle of odd length  
in the graph

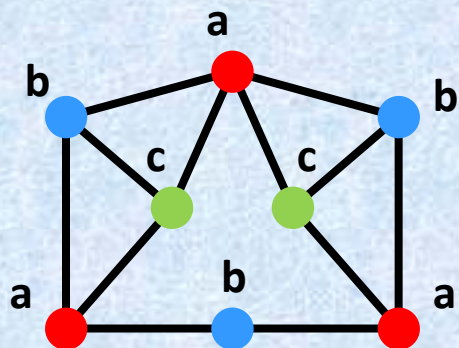
Is graph bipartite? Apply BFS.

Mark by 1 all nodes in odd distance from the start and mark by 0 all nodes in even distance from start. If any two nodes with the same mark are connected by an edge, the graph is not bipartite (two-colorable).

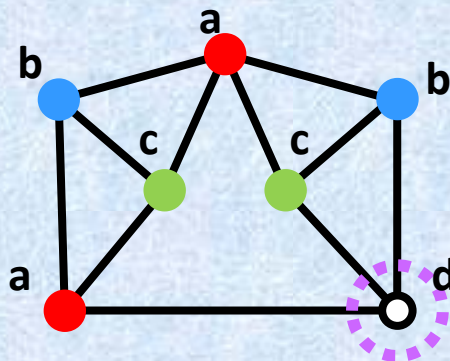
# Colorability, chromatic number

Minimum number of colors needed to color each node so that any two neighbours have different color.

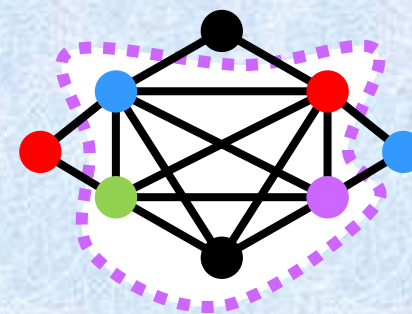
**Hard problem -- Are 3 colors enough?**



**3 colors suffice**



**4 colors.**  
The node colors are chosen WLOG, the color of node at the bottom right cannot be any of a, b, c.



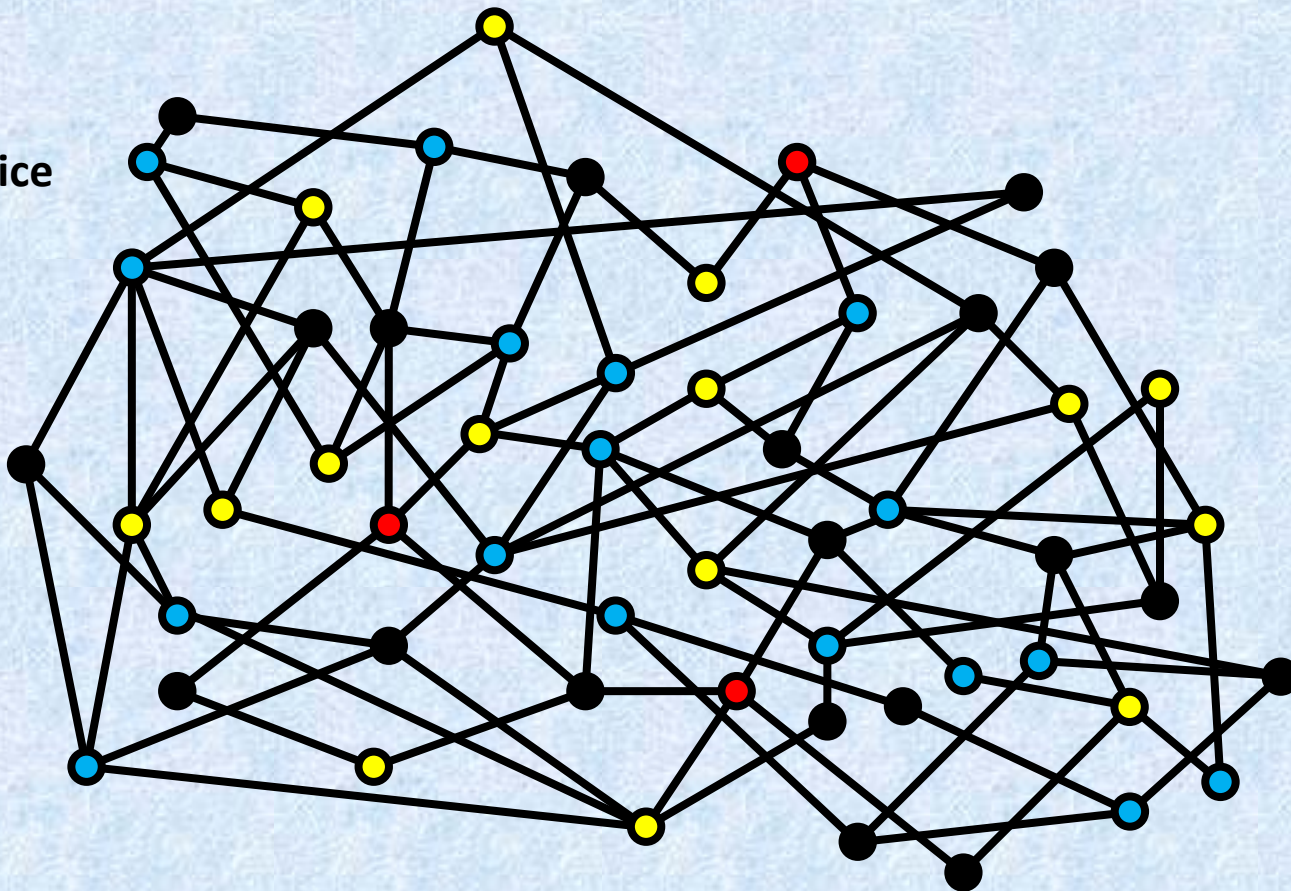
**5 colors.**  
The graph contains a clique (complete subgraph) of size 5.  
Clique detection is a hard problem.

# Colorability, chromatic number

Minimum number of colors needed to color each node so that any two neighbours have different color.

**Hard problem -- Are 3 colors enough?**

4 colors are suffice  
in this graph.  
Maybe 3 colors  
would suffice  
too? ... ??





## Shortest paths

Minimum possible number of edges (nodes) on a path from A to B.

Easy problem

**Algorithms:** BFS, Dijkstra, Bellman–Ford, Floyd–Warshall, Johnson...

**Complexities:** Polynomial, mostly less than  $O(|V|^3)$ .

## Longest paths

Typically, each node/edge can be visited at most once.

Hard problem for general graphs

Easy problem for trees and DAGs

**Algorithm:** Dynamic programming

**Complexity:**  $O(|V|+|E|)$

# Minimum spanning tree

Minimum total cost (weight) of selected edges which connect all nodes in the graph. The selected edges form a tree.

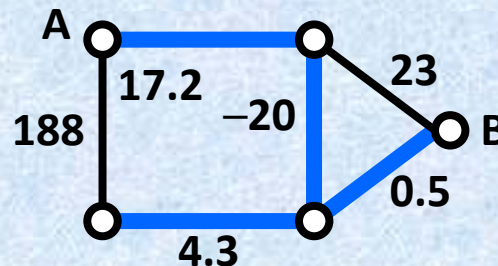
## Easy problem

**Algorithms: Prim's**  $O(|V|^2)$   
 $O(|E| \cdot \log(|V|))$

with matrix representation  
with linked list representation  
and with binary heap

**Kruskal's**  $O(|E| \cdot \log(|V|))$

**Borůvka's**  $O(|E| \cdot \log(|V|))$

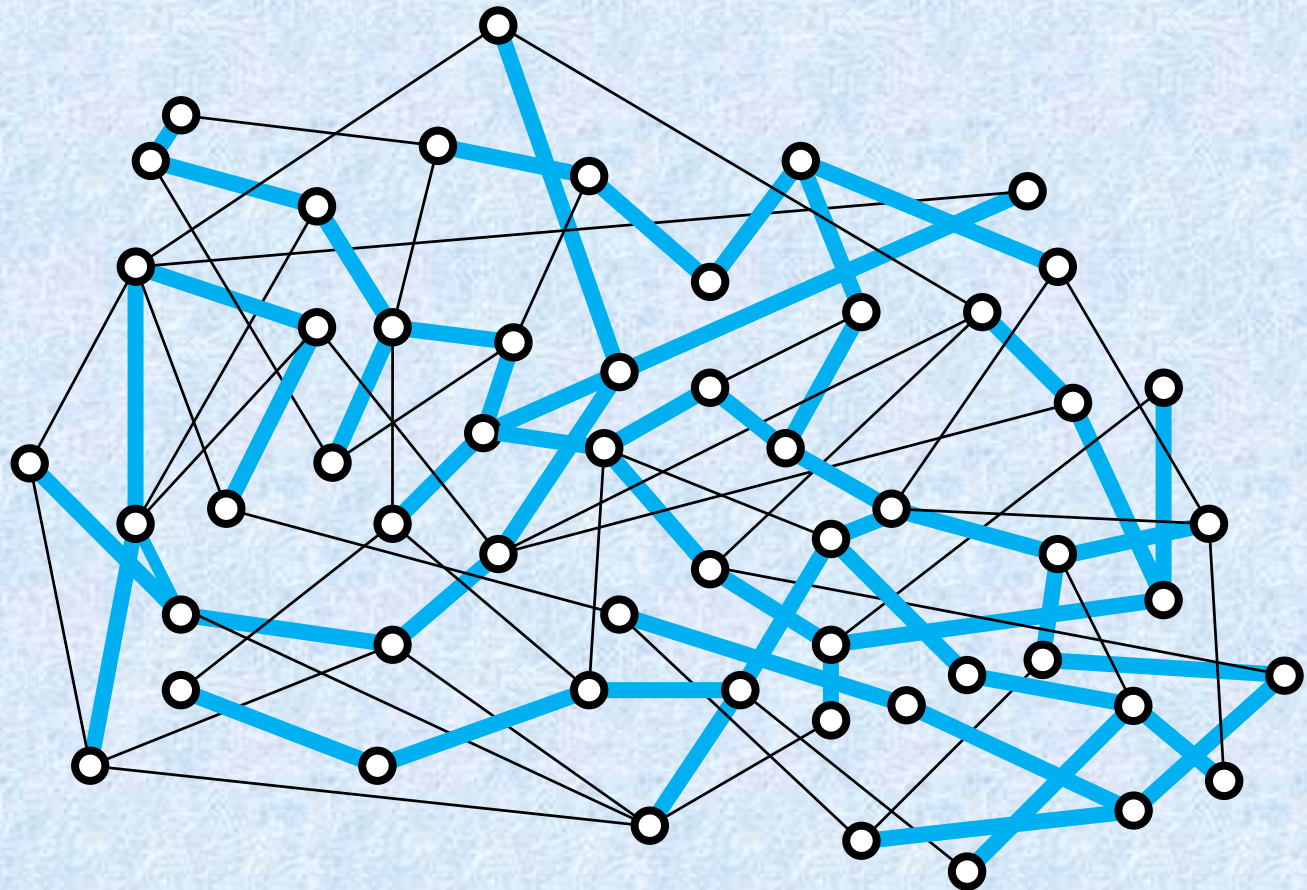


# Minimum spanning tree

Minimum total cost (weight) of selected edges which connect all nodes in the graph. The selected edges form a tree.

Easy problem

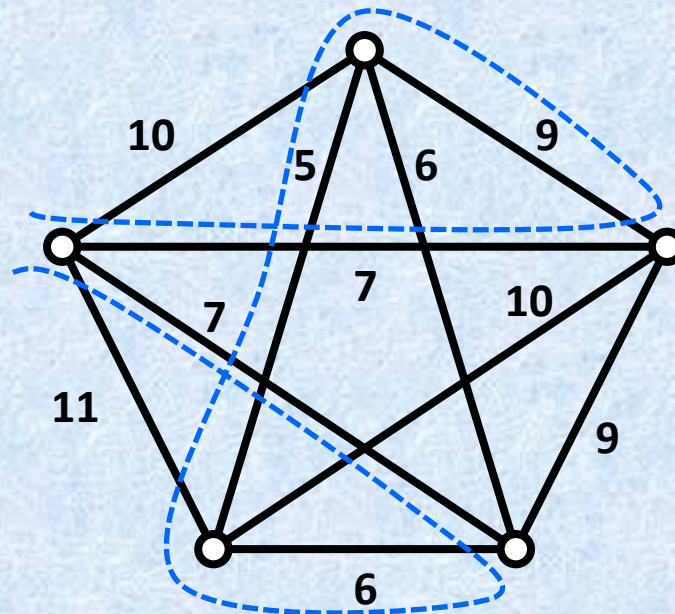
Here, the cost of an edge is proportional to its length (prefer shortest edges possible)



# Travelling salesman problem (TSP)

Traverse a complete weighted graph, visit each node once and pay the minimum price for the journey = sum of costs of all visited edges.

**Hard problem**



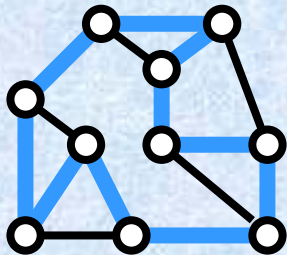
## Hamilton path

Is there a path in the graph which contains each node (exactly once) ?

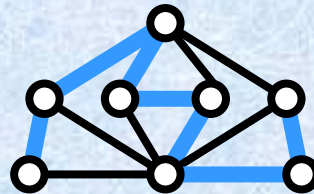
## Hamilton cycle

Is there a cycle in the graph which contains each node?

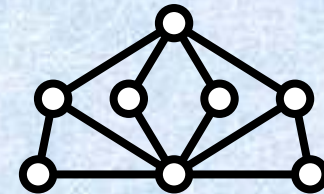
### Hard problem



Both Hamilton path  
and Hamilton cycle exist.



Only Hamilton path  
exists. There is no  
Hamilton cycle.



Neither a Hamilton path  
nor a Hamilton cycle  
exists.

# Euler trail

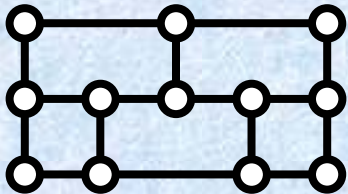
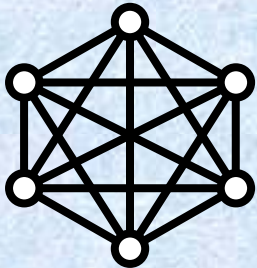
A trail that visits every edge exactly once (allowing for revisiting vertices)?

*Ex: Can a postman walk through each street in their region exactly once?*

**Easy problem**

**Graph must be connected  
and it must contain at most 2 nodes of odd degree.**

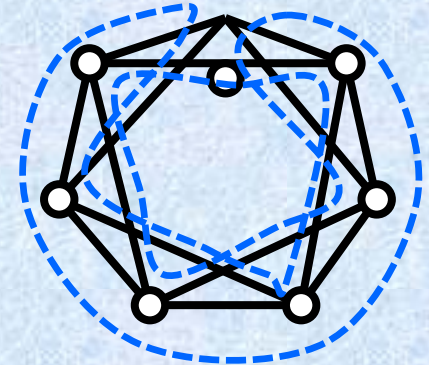
**Algorithm: Hierholzer's  $O(|E|)$**



**Euler trail does not exist, there are  $> 2$  nodes with odd degree**



**The trail starts and ends in the nodes with odd degree**



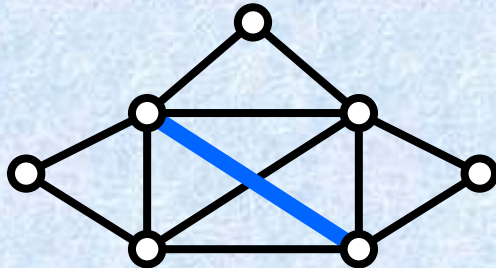
**The trail is closed, all node degrees are even**

# Planar graph

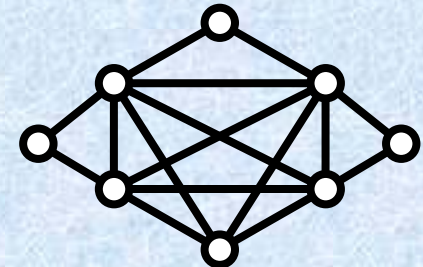
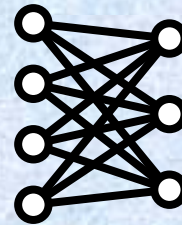
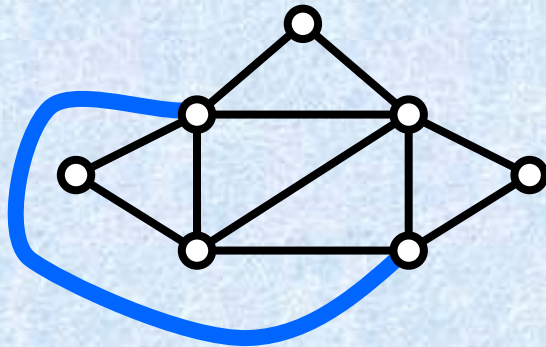
Can the graph be drawn in a plane without crossing its edges?

Easy question (however, little bit more advanced) 😊

Algorithms: Hopcroft and Tarjan,  $O(|V|)$   
Boyer and Myrvold,  $O(|V|)$



The graph is planar, the blue edge can be drawn differently:



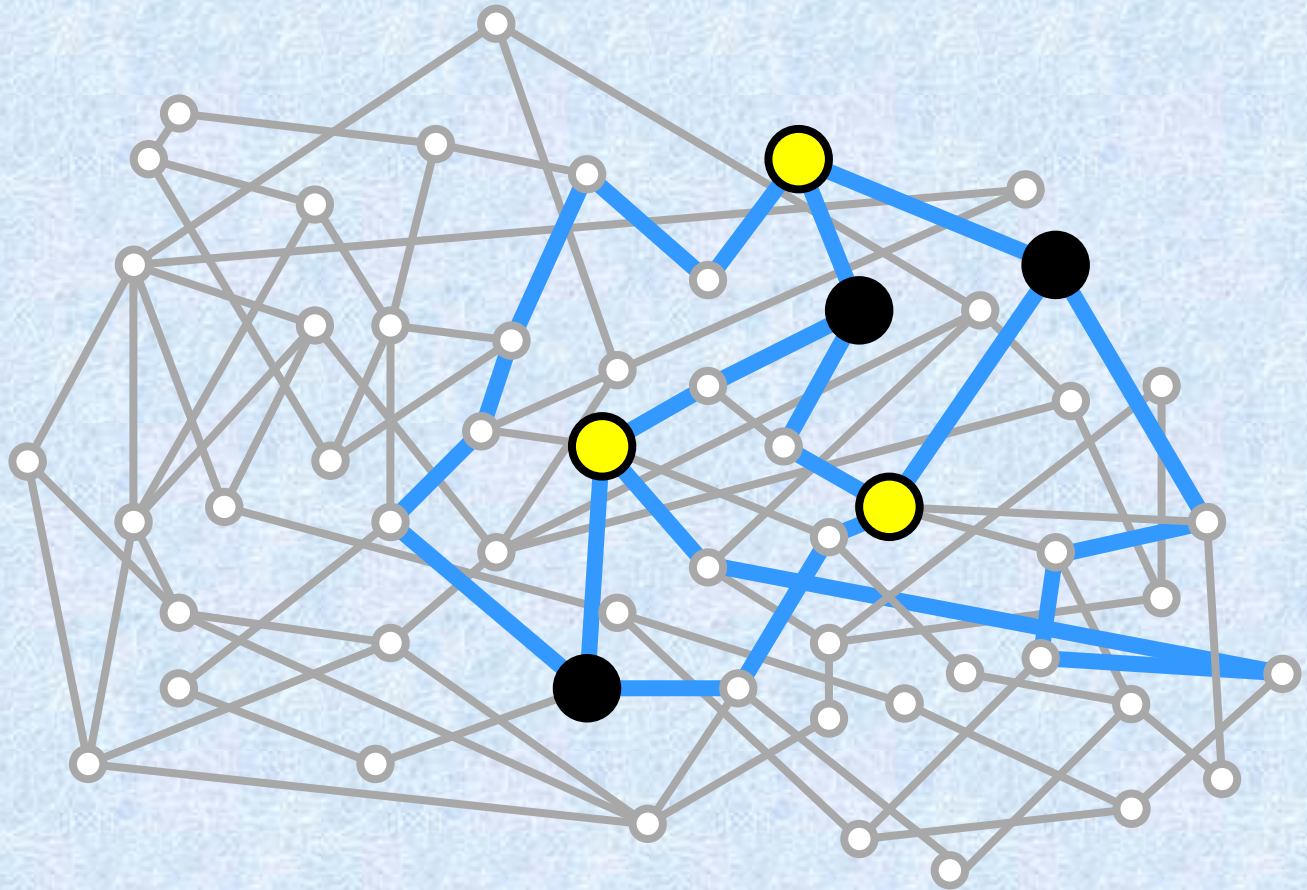
Not planar.

Non planar graphs "contain" either a *complete graph on 5 nodes* or a *complete bipartite graph on 3 and 3 nodes*.

The planar graphs do not "contain" them.

# Planar graph

Can the graph be drawn in a plane without crossing its edges?



It is impossible here. Each black node is connected to each yellow node by a separate path. It is the case of a complete bipartite graph with partitions of size 3 and 3 (so called  $K_{3,3}$ ). That graph cannot be drawn in the plane without edges crossing(s).

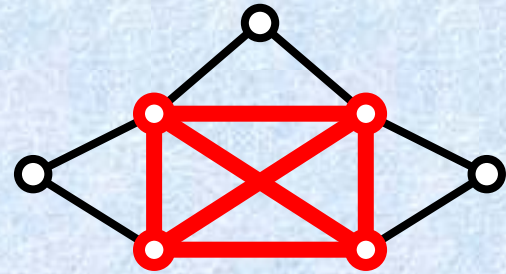
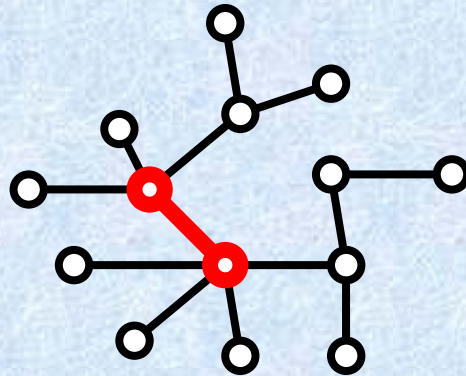
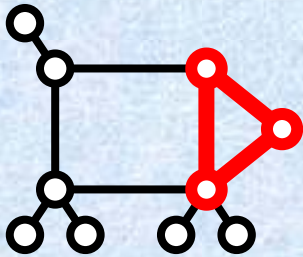


# Clique number

The size of the maximal clique, that is, of a subgraph which is complete, that is, of the subgraph where each node is connected to each other node.

*Ex. Choose a largest group of your friends in which everybody knows each other.*

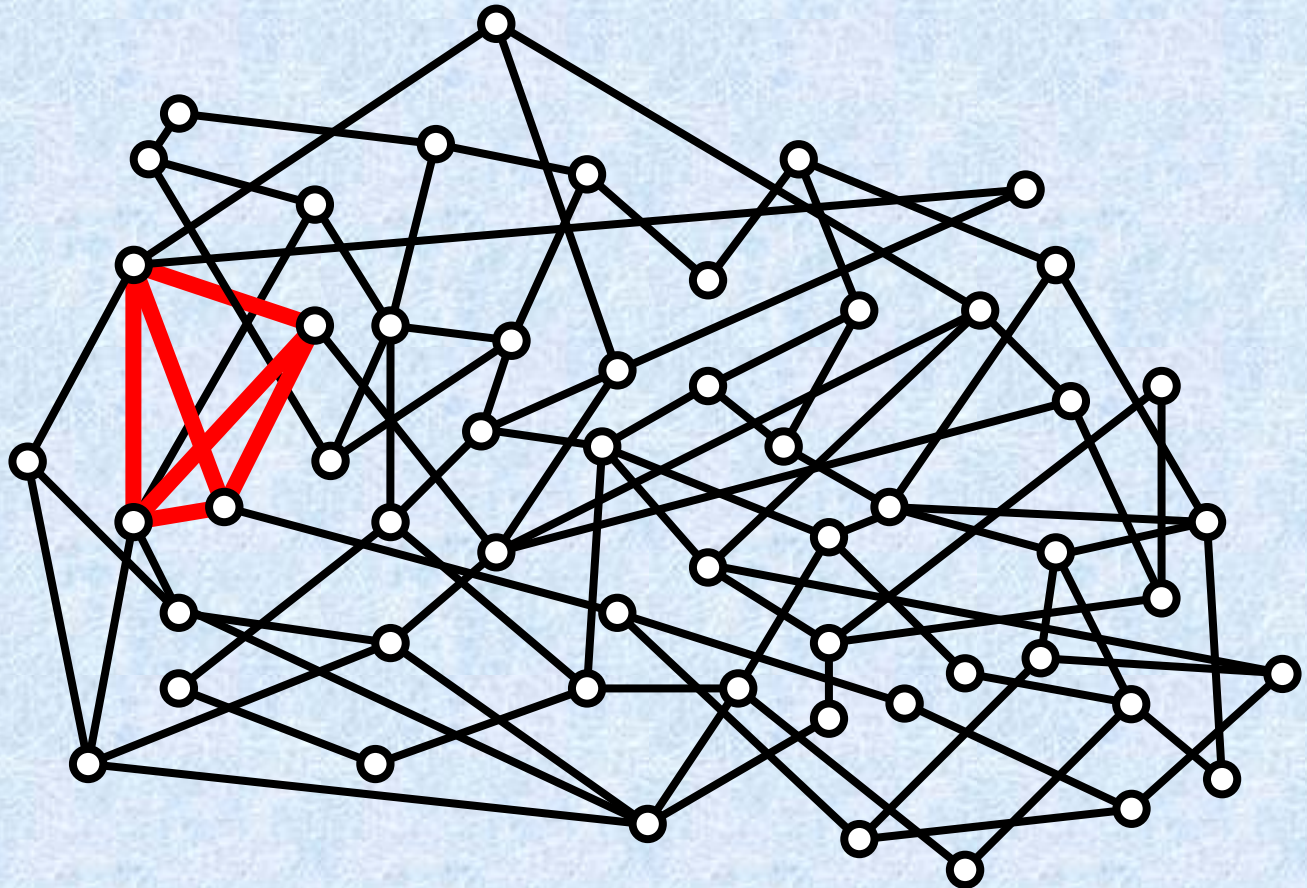
**Hard problem**



**Clique number of all trees is 2.  
(Rather obviously)**

# Clique number

The size of the maximal clique, that is, of a subgraph which is complete, that is, of the subgraph where each node is connected to each other node.

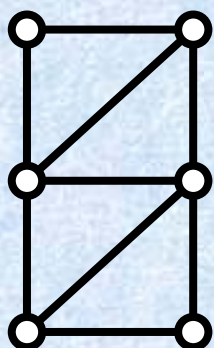


Clique of size 5 (or bigger) is not in the graph. To verify it mechanically, it is enough to check neighbour relations in all 5-element subsets of nodes. The number of those subsets is  $\text{COMB}(55, 5) = 3\,478\,761$ .

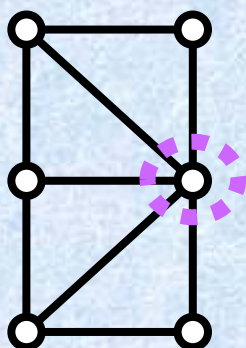
# Graph isomorphism

Is the structure of two graphs identical? In other words, can one graph be drawn in such way that it looks exactly as the other one?

**It is not known if this is a hard problem or an easy problem.**

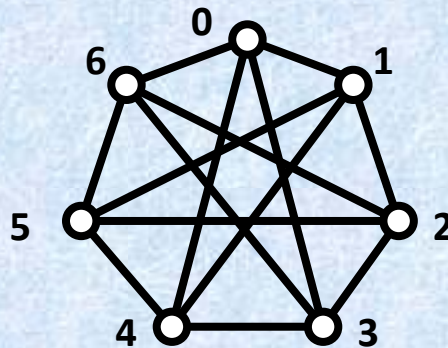


A

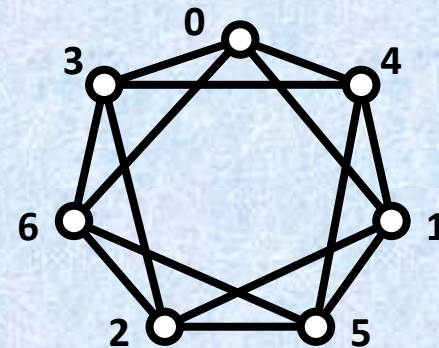


B

A and B are not isomorphic, right central node in B has degree 5, there is no analogous node anywhere in A. The structure of A and B must be different.



C



D

C and D are isomorphic, the nodes with the same labels correspond to each other, the edges in both C and D connect the nodes with the same labels

# Partial recapitulation of the jungle of graph problems and their complexities

## Easy problem

Connectivity?

Shortest path?

Min. spanning tree?

Euler trail?

Planarity?

## "It depends... "

Colorability?

1,2 colors

3 or more colors

easy

hard

Isomorphism?

Trees, ciculants...

regular graphs...

etc...

easy

hard

Longest path?

DAG, tree

general graph

easy

hard

## Hard problem

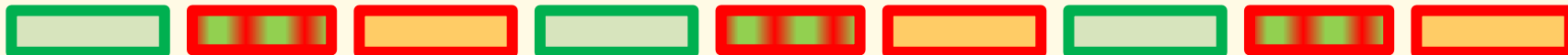
Travelling salesman?

Independence?

Dominancy?

Hamiltonicity?

Clique number?

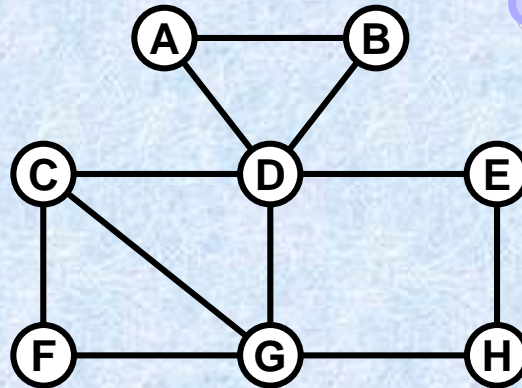


Many more questions ... ? Again, "it depends". There is no definite cookbook for determining the difficulty of a problem.

**Graph most usual representations**

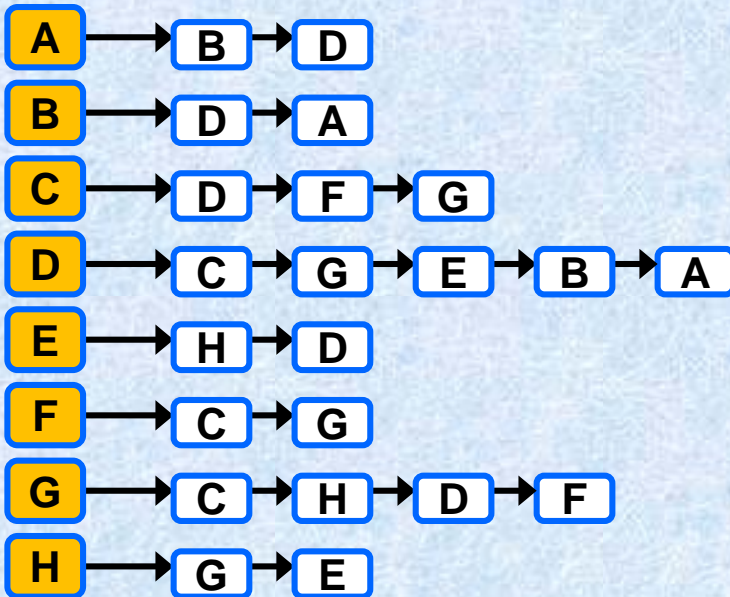
# Graph most usual representations

## Undirected graph



## Adjacency matrix

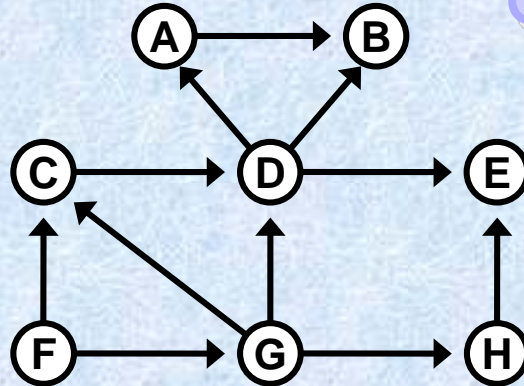
## Linked list representation



|   | A | B | C | D | E | F | G | H |
|---|---|---|---|---|---|---|---|---|
| A | 0 | 1 | 0 | 1 | 0 | 0 | 0 | 0 |
| B | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 |
| C | 0 | 0 | 0 | 1 | 0 | 1 | 1 | 0 |
| D | 1 | 1 | 1 | 0 | 1 | 0 | 1 | 0 |
| E | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 1 |
| F | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 0 |
| G | 0 | 0 | 1 | 1 | 0 | 1 | 0 | 1 |
| H | 0 | 0 | 0 | 0 | 1 | 0 | 1 | 0 |

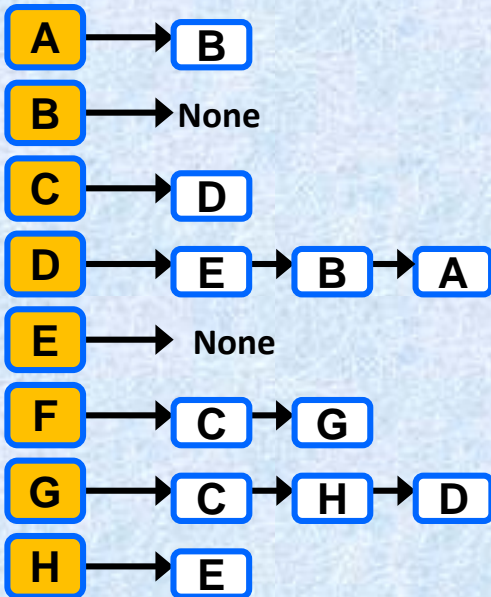
# Graph most usual representations

## Directed graph



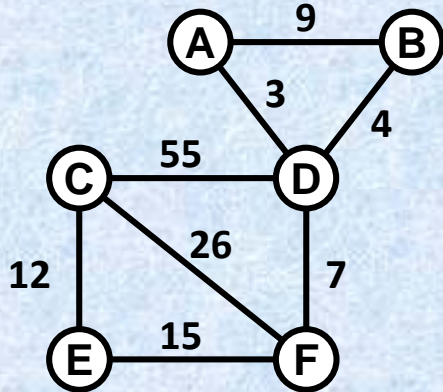
## Adjacency matrix

## Linked list representation



|   | A | B | C | D | E | F | G | H |
|---|---|---|---|---|---|---|---|---|
| A | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 |
| B | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| C | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 |
| D | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 |
| E | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| F | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 0 |
| G | 0 | 0 | 1 | 1 | 0 | 0 | 0 | 1 |
| H | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 |

# Graph most usual representations



## Undirected weighted graph

## Weight (cost) matrix

|   | A | B | C  | D  | E  | F  |
|---|---|---|----|----|----|----|
| A | 0 | 9 | 0  | 3  | 0  | 0  |
| B | 9 | 0 | 0  | 4  | 0  | 0  |
| C | 0 | 0 | 0  | 55 | 12 | 26 |
| D | 3 | 4 | 55 | 0  | 0  | 7  |
| E | 0 | 0 | 12 | 0  | 0  | 15 |
| F | 0 | 0 | 26 | 7  | 15 | 0  |

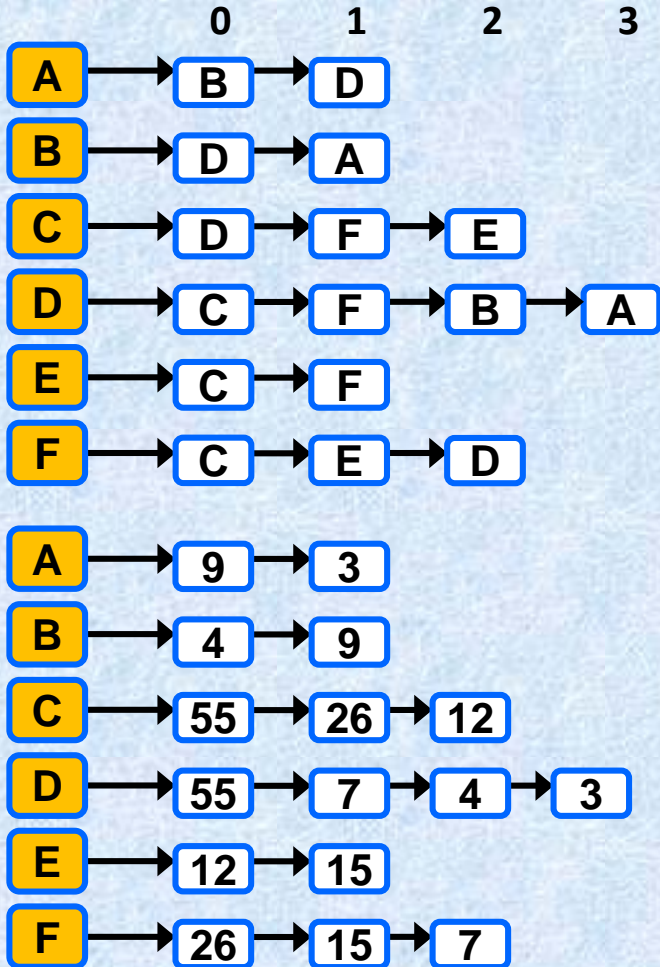
## Linked list representation



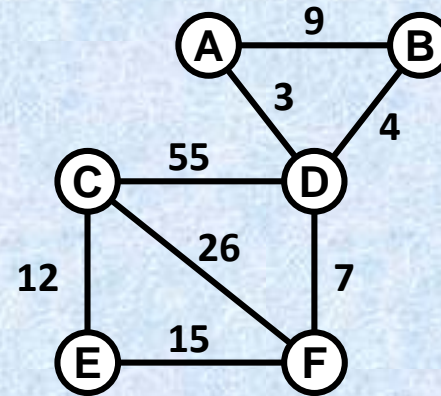


## Graph most usual representations

### Linked list/ array representation



### Undirected weighted graph

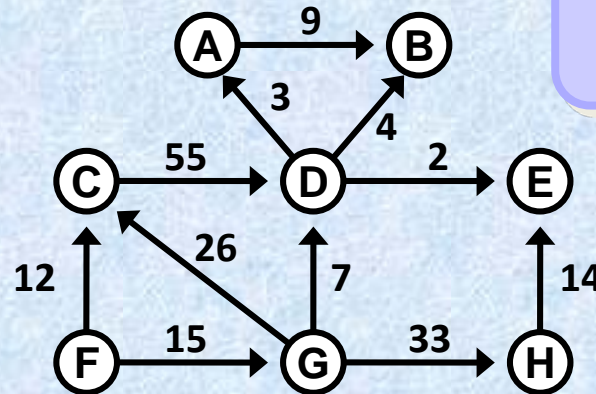


The weights of edges are at the same index in the second list.

- + Pro: Simpler object or even no object at all in the arrays.
- Con: Keeping lists in sync needs more care and caution in the code.

## Graph most usual representations

### Directed weighted graph



The representation is usually a more or less obvious combination of the methods in the previous cases --  
Weight matrix or linked list.