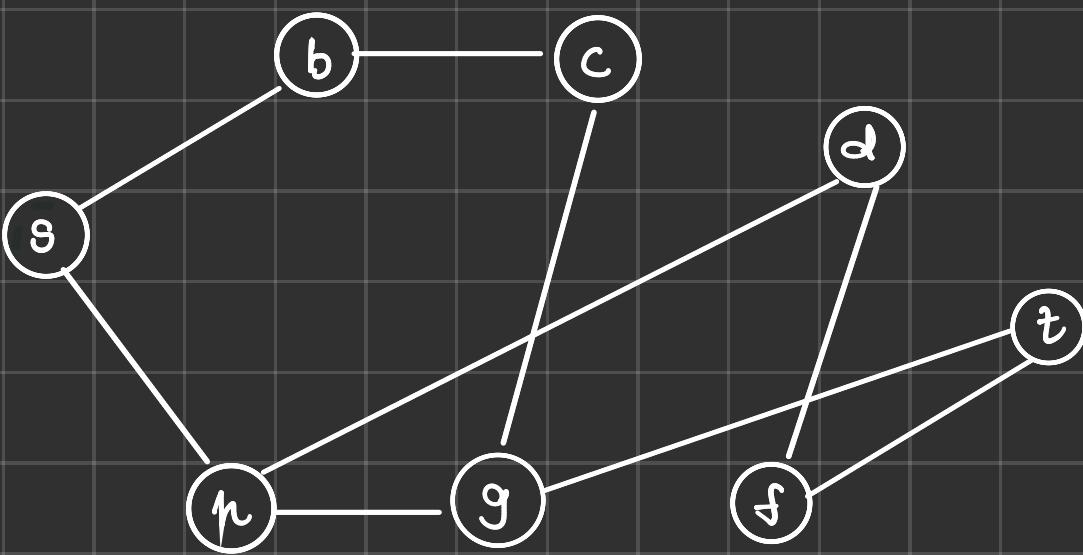
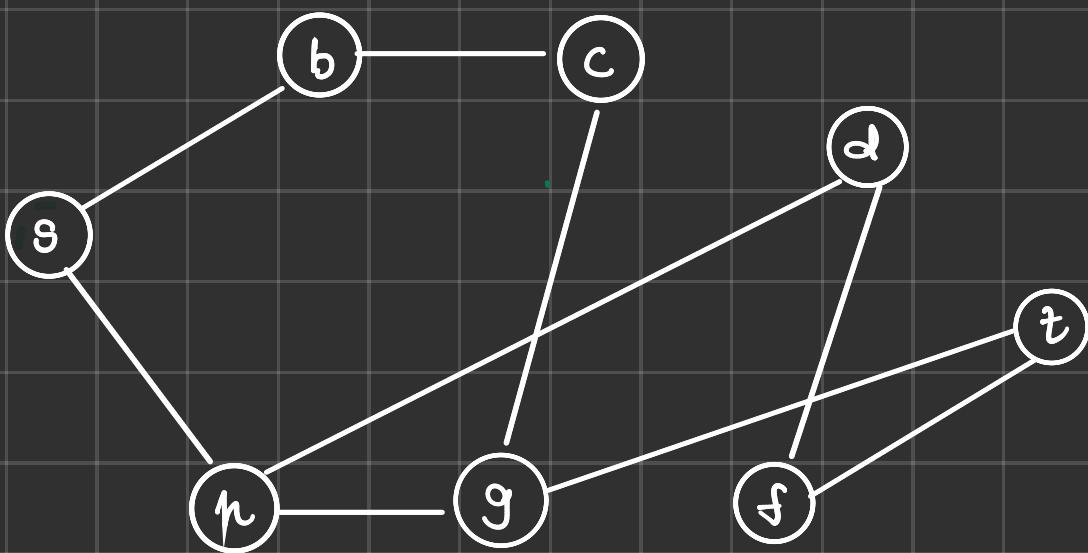


Graphs



A Graph has a set of nodes or vertices
and edges between them.

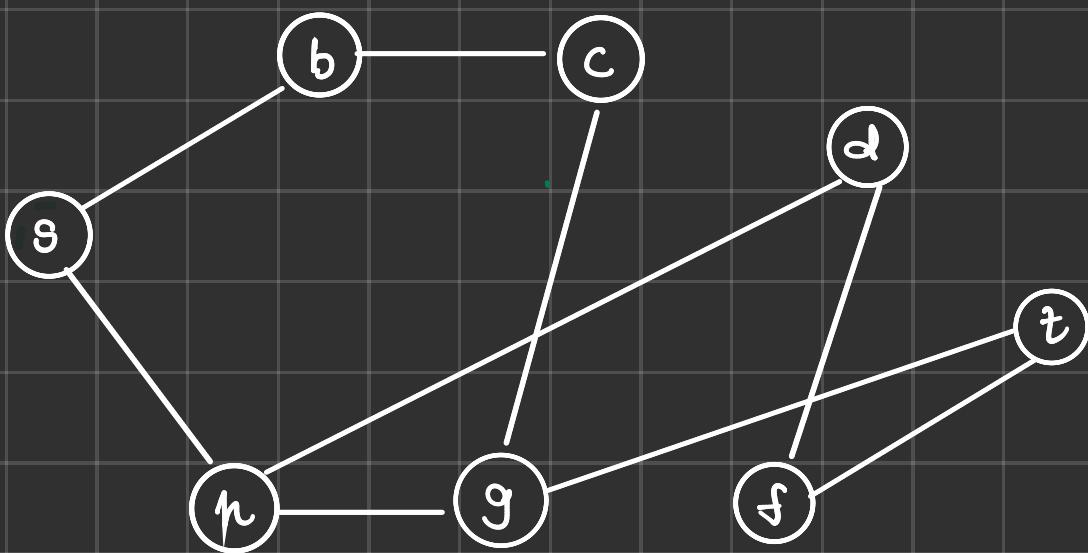
Graphs



A Graph has a set of nodes or vertices
and edges between them.

Formally : Graph G is a tuple (V, E)
where V is a set of nodes
and $E \subseteq V \times V$

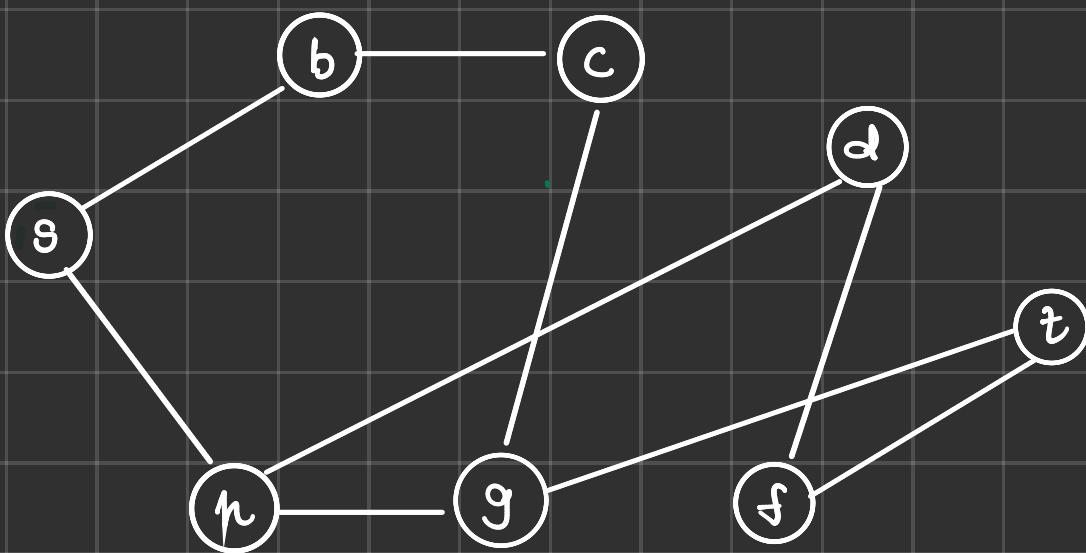
Graphs



A Graph has a set of nodes or vertices
and edges between them.

Formally : Graph G is a tuple (V, E)
where V is a set of nodes
and $E \subseteq V \times V$

Graphs



A Graph has a set of nodes or vertices
and edges between them.

Formally : Graph G is a tuple (V, E)
where V is a set of nodes
and $E \subseteq V \times V$

$G (\{ s, b, c, d, f, g, h, t \}, \{ (s, b), (b, c), (s, h), (h, g), (c, g), (h, d), (d, f), (g, t), (f, t) \})$

Notation :-

- $m \leftarrow$ number of edges in the graph
- $n \leftarrow$ number of vertices in the graph
- $d(v)$ or $\deg(v) \leftarrow$ degree of v or
number of edges
adjacent to v .

Notation :-

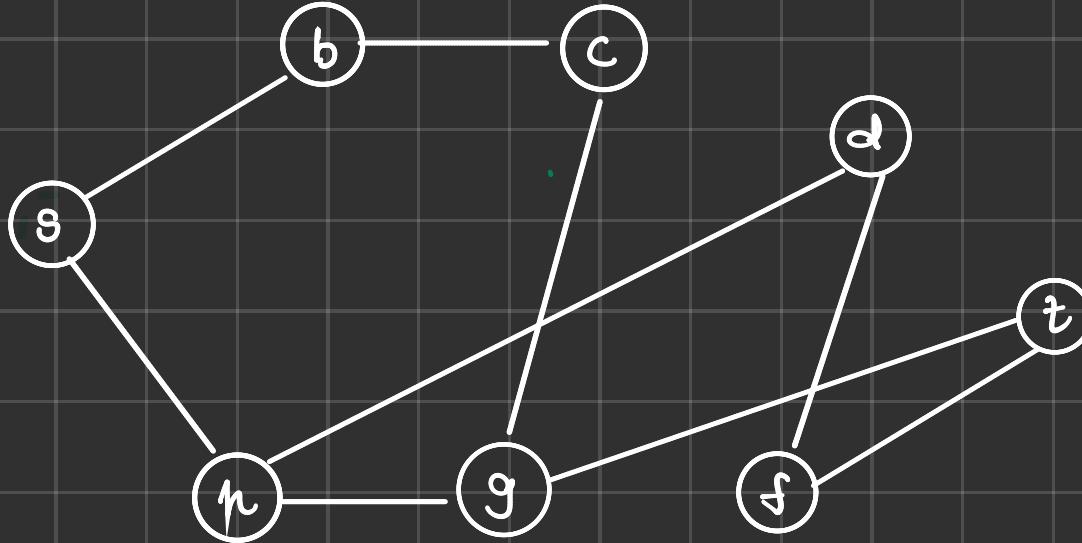
- $m \leftarrow$ number of edges in the graph
- $n \leftarrow$ number of vertices in the graph
- $d(v)$ or $\deg(v) \leftarrow$ degree of v or
number of edges
adjacent to v .

Lemma : $\sum_{v \in V} d_v =$

Notation :-

- $m \leftarrow$ number of edges in the graph
- $n \leftarrow$ number of vertices in the graph
- $d(v)$ or $\deg(v) \leftarrow$ degree of v or
number of edges
adjacent to v .

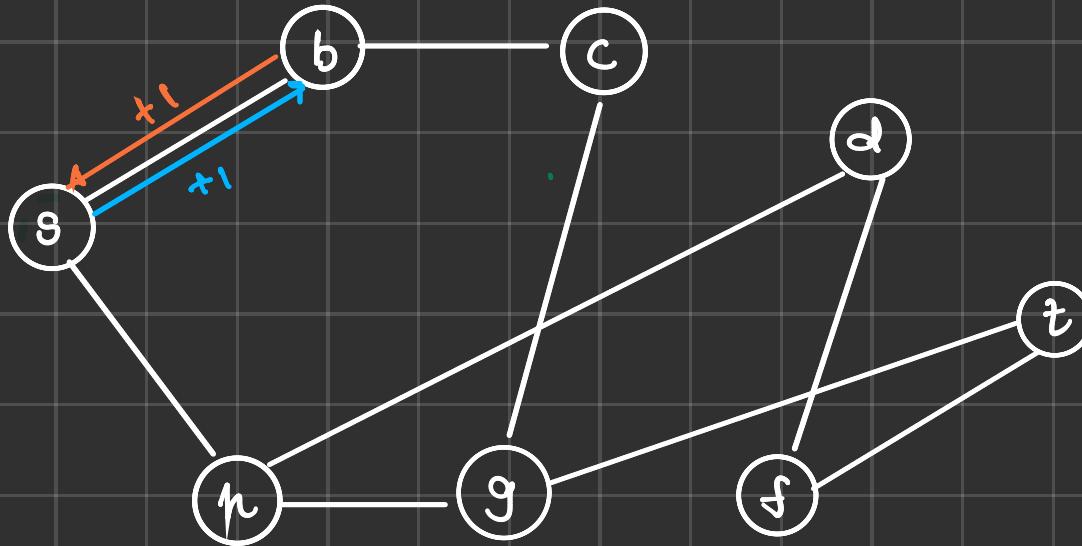
Lemma : $\sum_{v \in V} d_v = 2m$



Notation :-

- $m \leftarrow$ number of edges in the graph
- $n \leftarrow$ number of vertices in the graph
- $d(v)$ or $\deg(v) \leftarrow$ degree of v or
number of edges
adjacent to v .

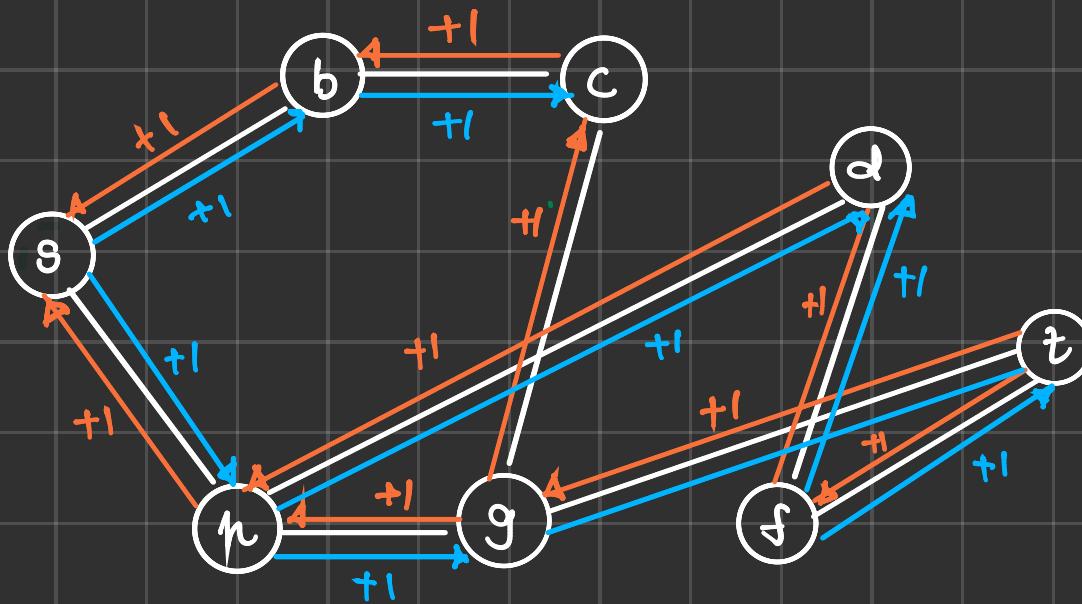
Lemma : $\sum_{v \in V} dv = 2m$



Notation :-

- $m \leftarrow$ number of edges in the graph
- $n \leftarrow$ number of vertices in the graph
- $d(v)$ or $\deg(v) \leftarrow$ degree of v or
number of edges
adjacent to v .

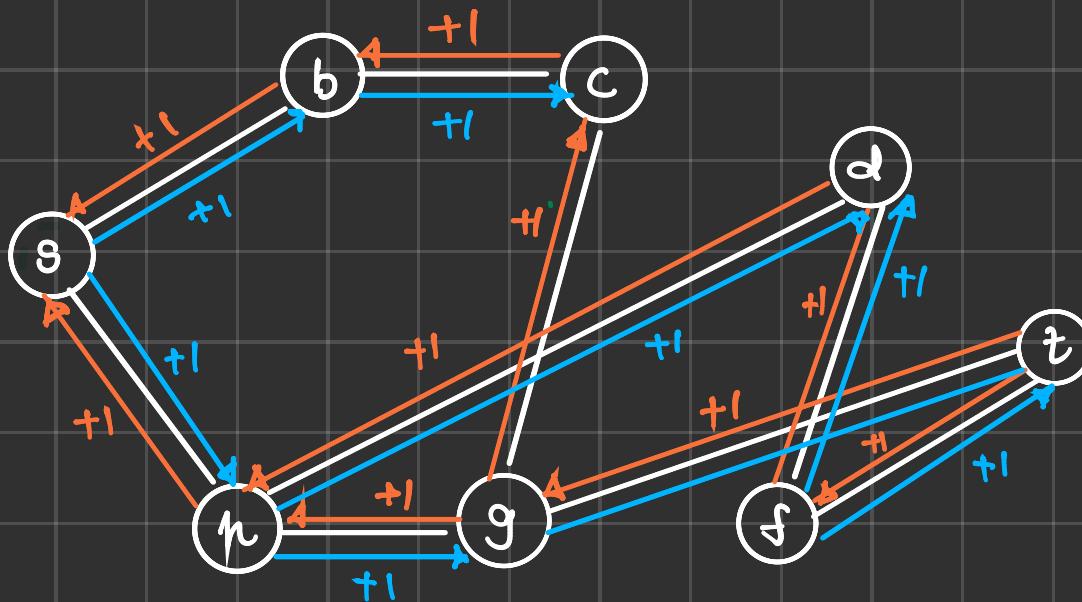
Lemma : $\sum_{v \in V} dv = 2m$



Notation :-

- $m \leftarrow$ number of edges in the graph
- $n \leftarrow$ number of vertices in the graph
- $d(v)$ or $\deg(v) \leftarrow$ degree of v or
number of edges
adjacent to v .

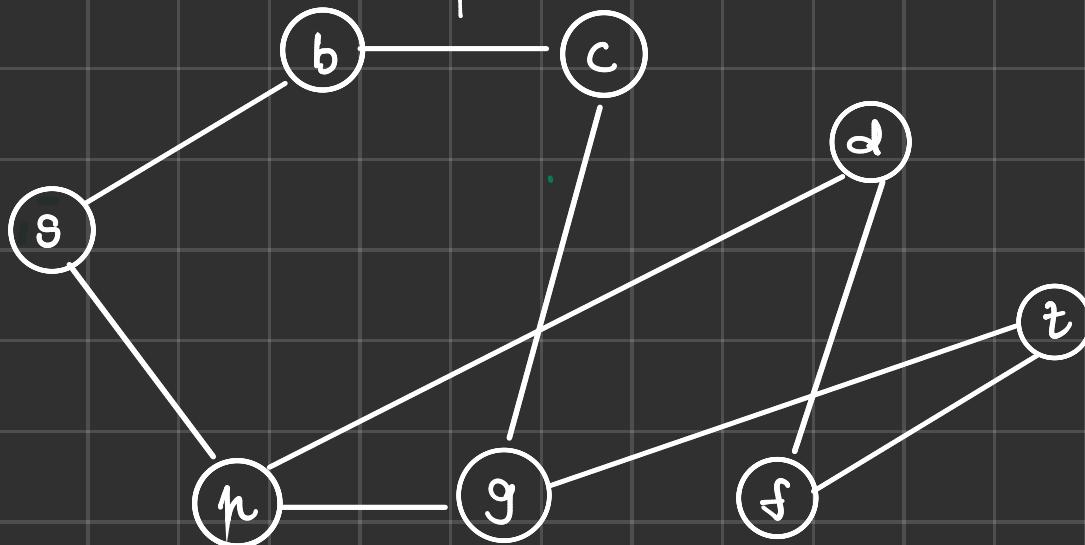
Lemma : $\sum_{v \in V} d_v = 2m$



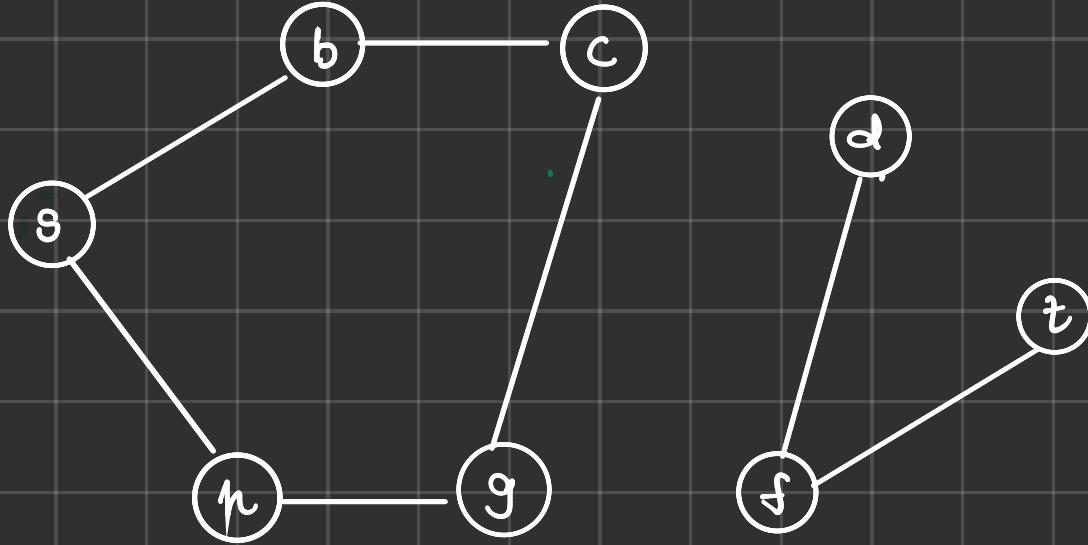
In $\sum_{v \in V} d_v$ each edge is added exactly twice.

$$\Rightarrow \sum_{v \in V} d(v) = 2m.$$

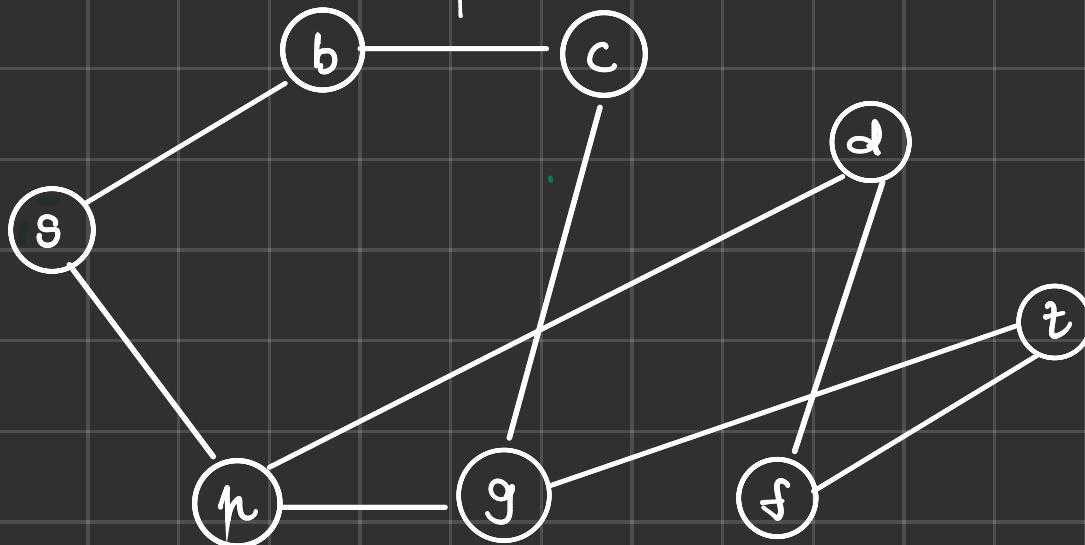
Connected Graph.



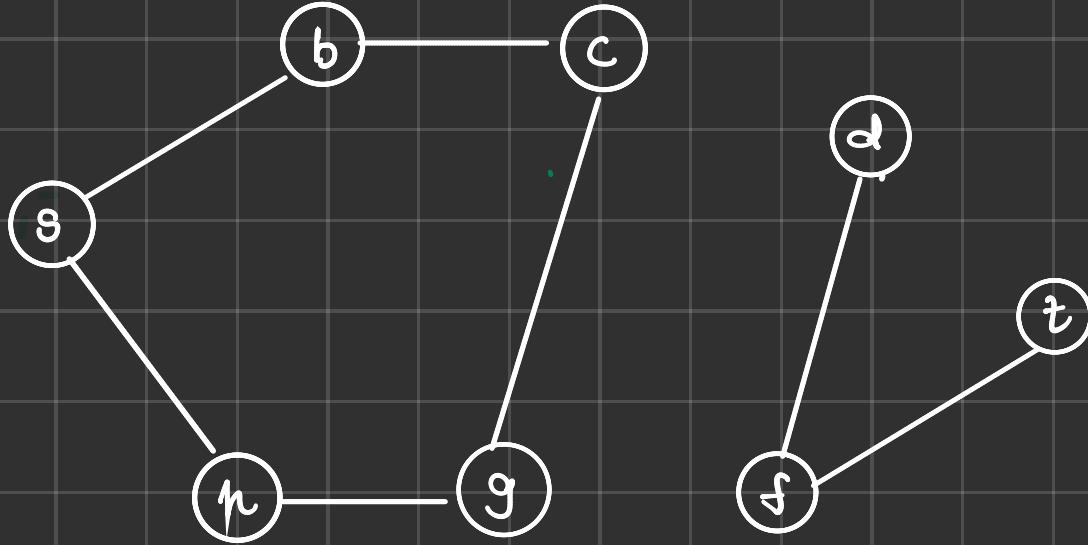
Disconnected Graph



Connected Graph.

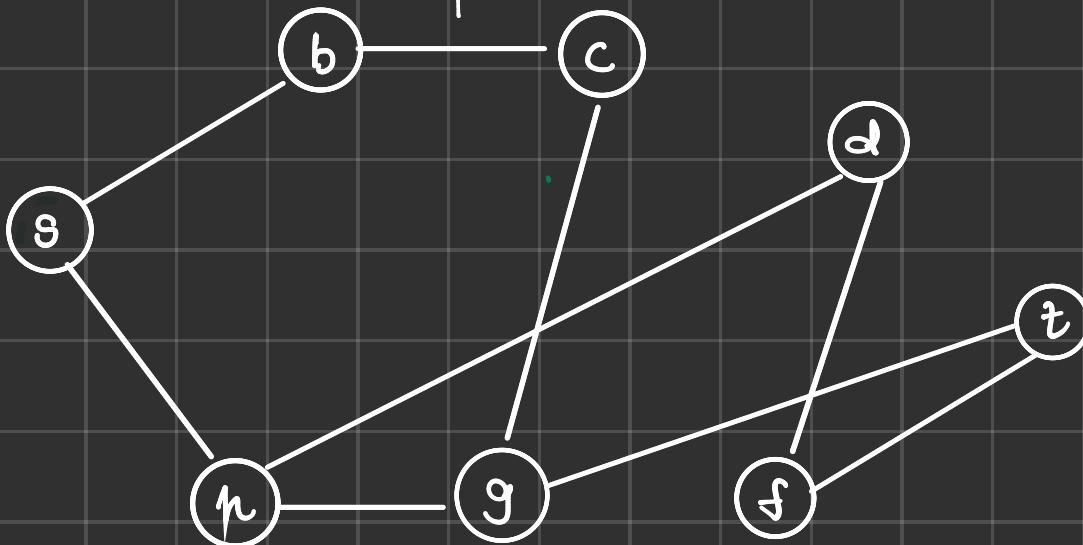


Disconnected Graph

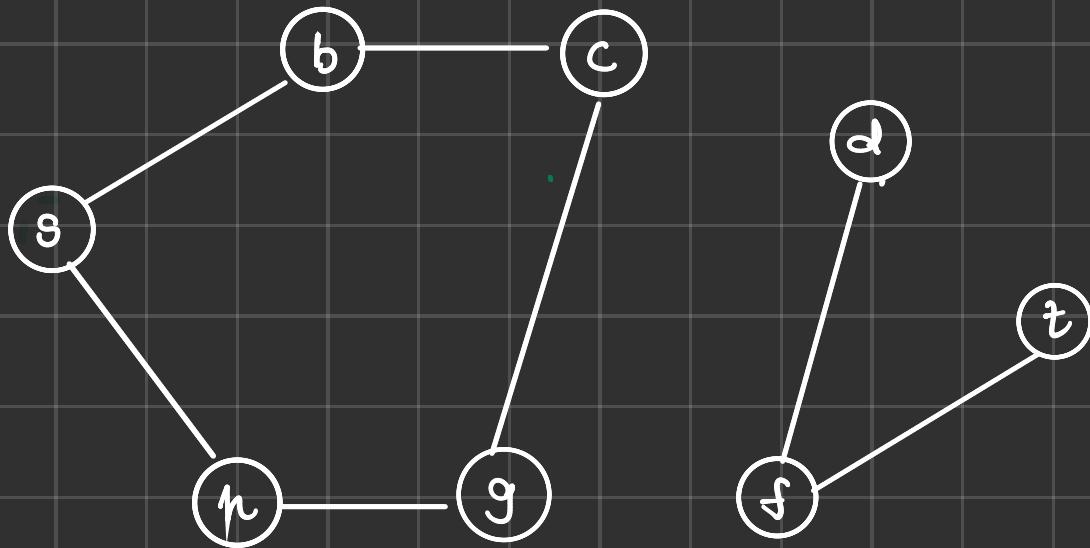


Q : What is the maximum number of edges in a connected graph ?

Connected Graph.



Disconnected Graph



Q : What is the maximum number of edges in a connected graph ?

A :

$$\frac{n \cdot (n-1)}{2}$$

Q: What is the minimum number of edges in a connected graph?

A: $n-1$



This graph is also called a tree.

Q: What is the minimum number of edges in a connected graph?

A: $n-1$



This graph is also called a tree.

Def: A tree is a connected graph with no cycle.

Lemma: The number of edges in a tree is $n-1$

Q: What is the minimum number of edges in a connected graph?

A: $n-1$



This graph is also called a tree.

Def: A tree is a connected graph with no cycle.

Lemma: The number of edges in a tree is $n-1$

Proof: By induction on n

Base case $n=1$



Trivially true.

Q: What is the minimum number of edges in a connected graph?

A: $n-1$



This graph is also called a tree.

Def: A tree is a connected graph with no cycle.

Lemma: The number of edges in a tree is $n-1$

Proof: By induction on n

Base case $n=1$



Trivially true.

Induction Hypothesis

Assume that the statement is true for all values in range $[1, n-1]$

Prove the statement when there are n vertices

Q: What is the minimum number of edges in a connected graph?

A: $n-1$



This graph is also called a tree.

Def: A tree is a connected graph with no cycle.

Lemma: The number of edges in a tree is $n-1$

Proof: By induction on n

Base case $n=1$

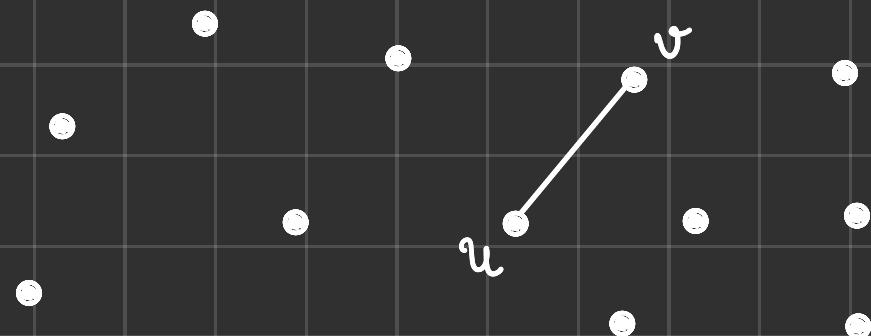


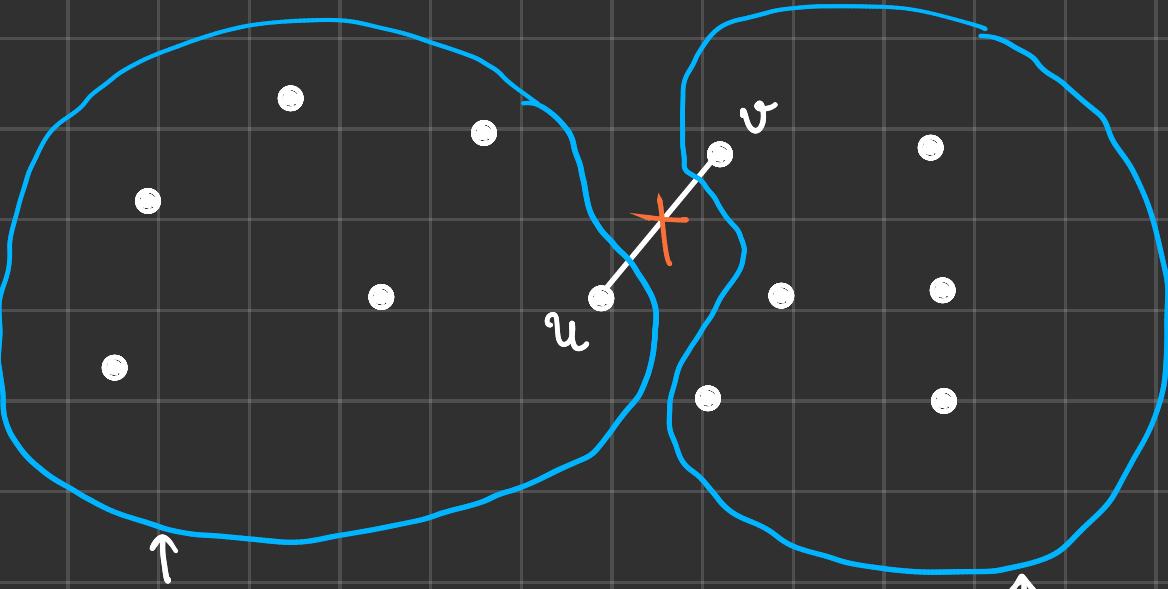
Trivially true.

Induction Hypothesis

Assume that the statement is true for all values in range $[1, n-1]$

Prove the statement when there are n vertices
Assume that there exists a tree on n vertices





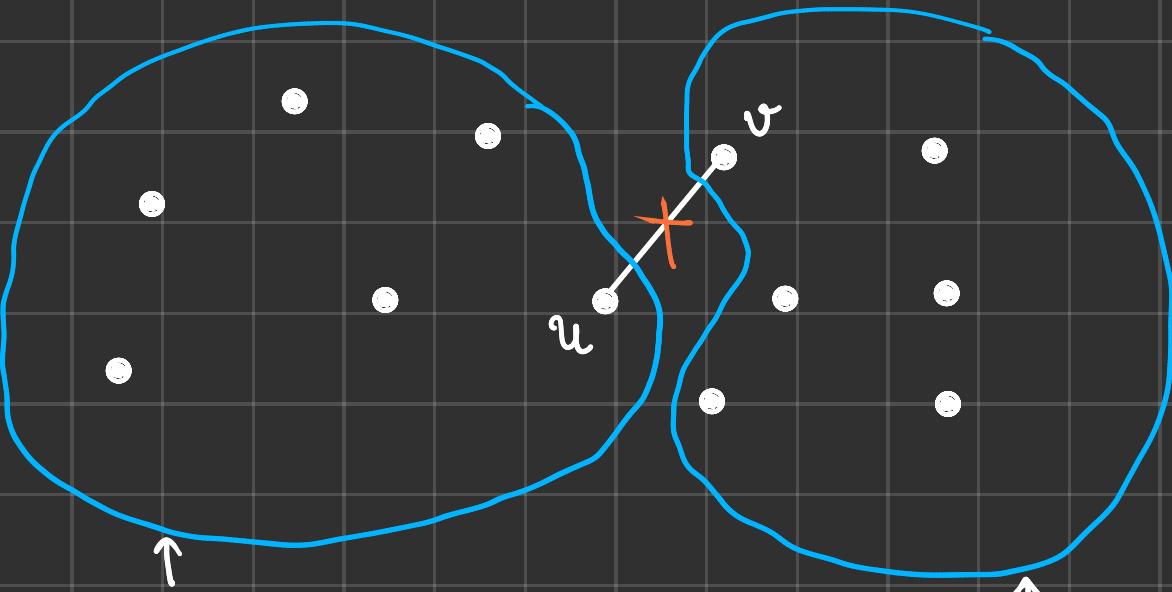
S

All vertices connected
to u

All vertices connected to
 v

v/S

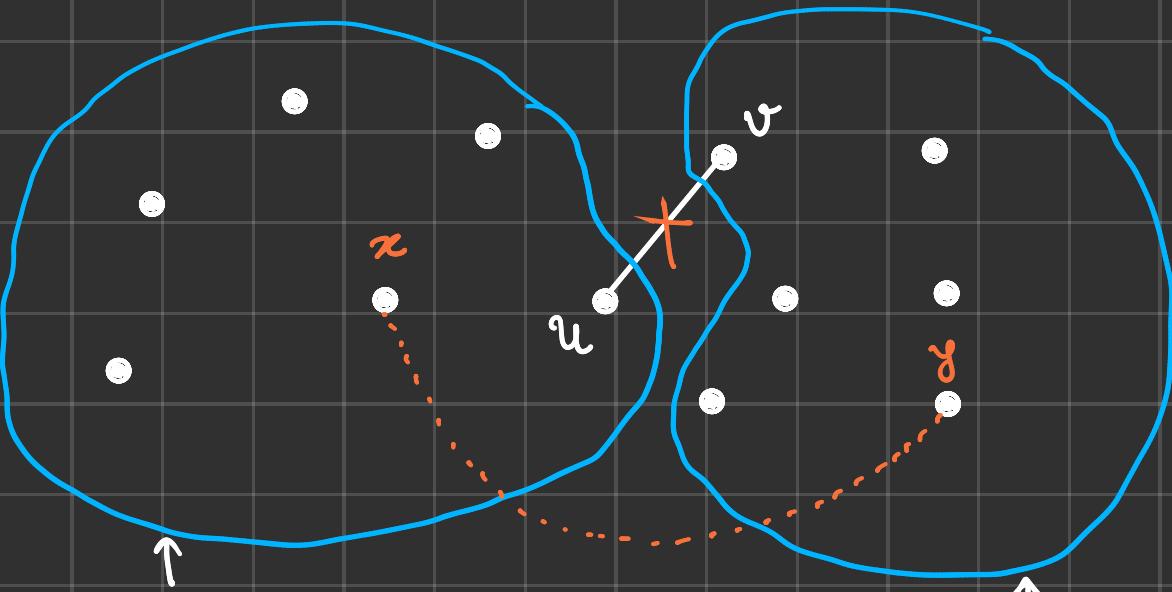
We have divided the graph into two connected
components.



All vertices connected
to u

All vertices connected to
 v

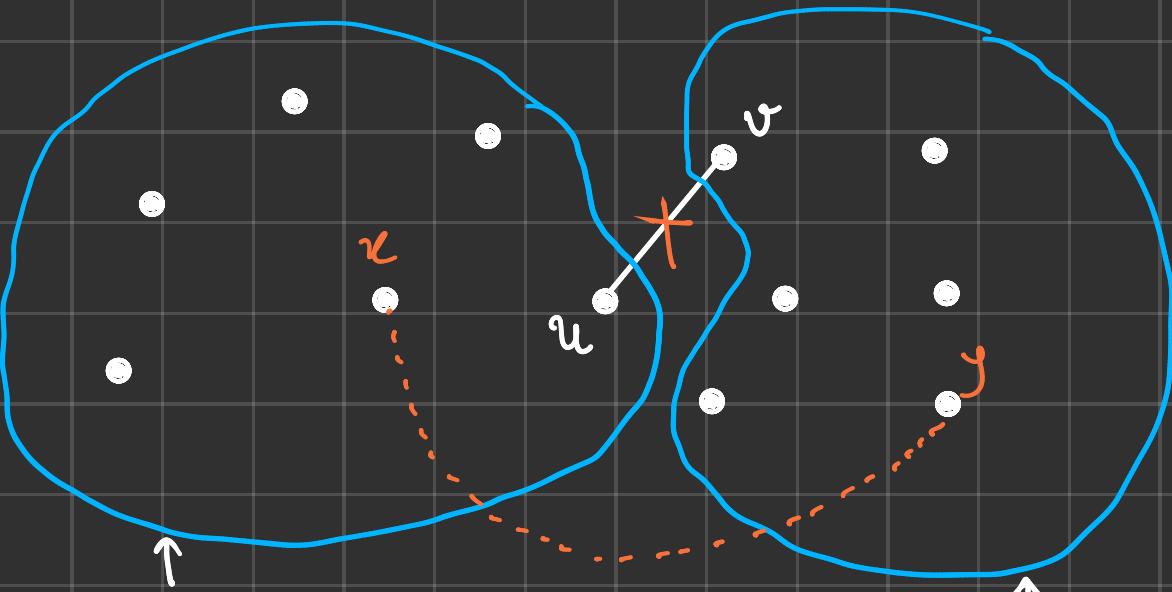
We have divided the graph into two connected
components. Or have we??



All vertices connected
to u

All vertices connected to
 v

We have divided the graph into two connected
components. or have we ??



All vertices connected
to u

All vertices connected to
 v

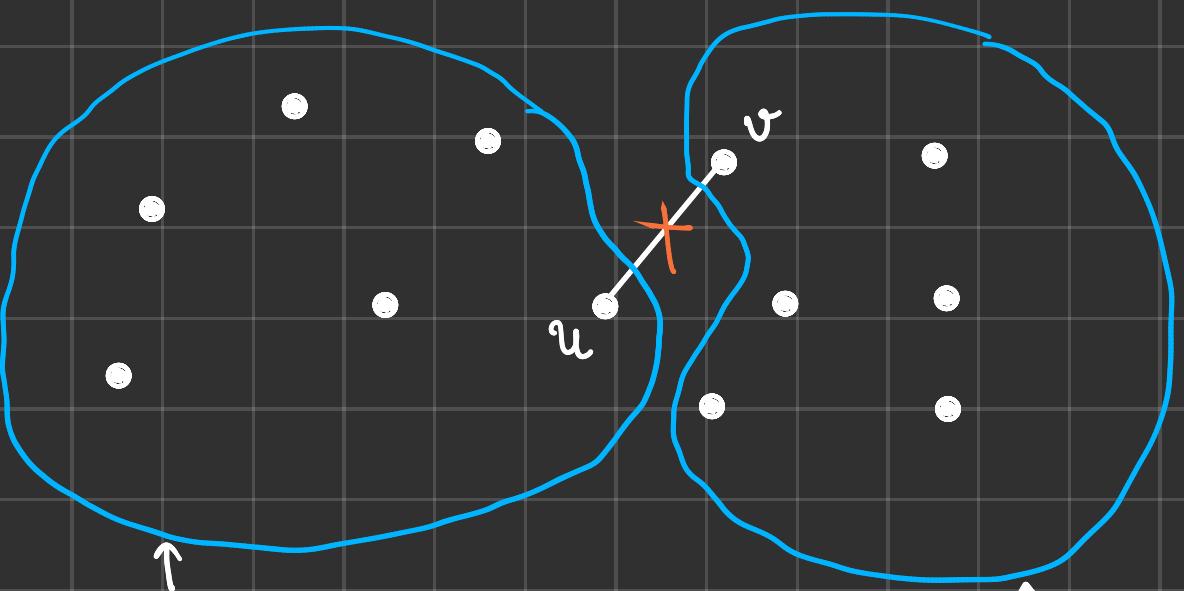
We have divided the graph into two connected components. or have we ??

$\Rightarrow u \rightarrow x + xy + y \rightarrow v + vu$ is a cycle.
But we started out with a tree

\Rightarrow Edge xy cannot exist

$$|S| = k$$

$$|V/S| = n - k$$



All vertices connected
to u

All vertices connected to
 v

We have divided the graph into two connected
components.

$$|S| = k$$

$$|V/S| = n - k$$

#edges in $|S| =$

#edges in $|V/S| =$

We have divided the graph into two connected components.

$$|S| = k$$

$$|V/S| = n-k$$

$$\# \text{edges in } |S| = k-1$$

$$\# \text{edges in } |V/S| = n-k-1$$

We have divided the graph into two connected components.

$$|S| = k$$

$$|V/S| = n-k$$

$$\# \text{edges in } |S| = k-1$$

$$\# \text{edges in } |V/S| = n-k-1$$

We have divided the graph into two connected components.

$$\# \text{edges in our tree} = k-1 + n-k-1 + 1$$

$$|S| = k$$

$$|V/S| = n-k$$

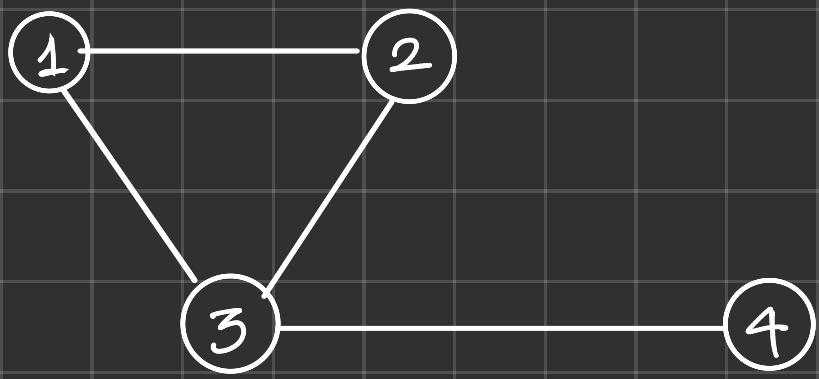
$$\# \text{edges in } |S| = k-1$$

$$\# \text{edges in } |V/S| = n-k-1$$

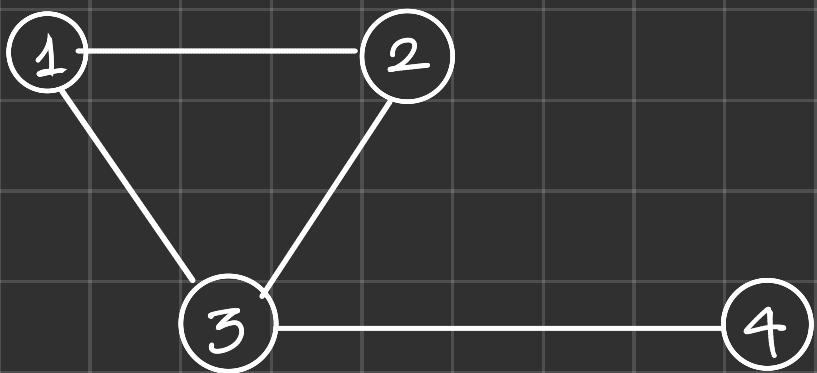
We have divided the graph into two connected components.

$$\begin{aligned}\# \text{edges in our tree} &= k-1 + n-k-1 + 1 \\ &= n-1\end{aligned}$$

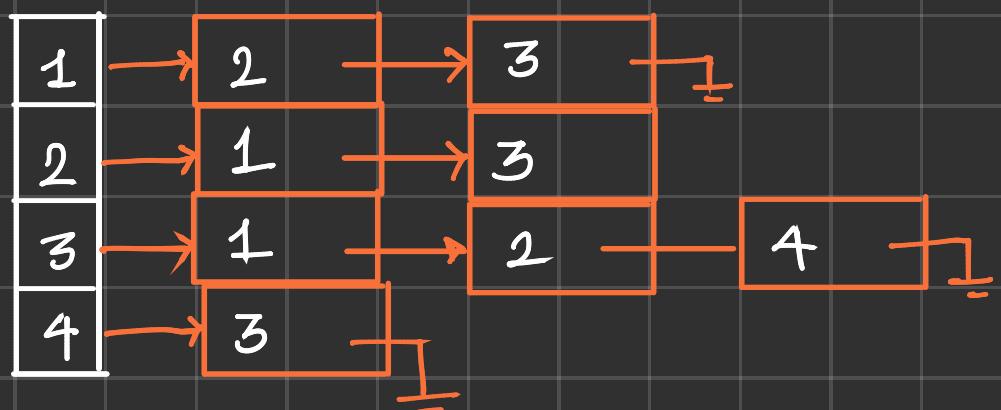
Data Structure for graph representation



Data Structure for graph representation



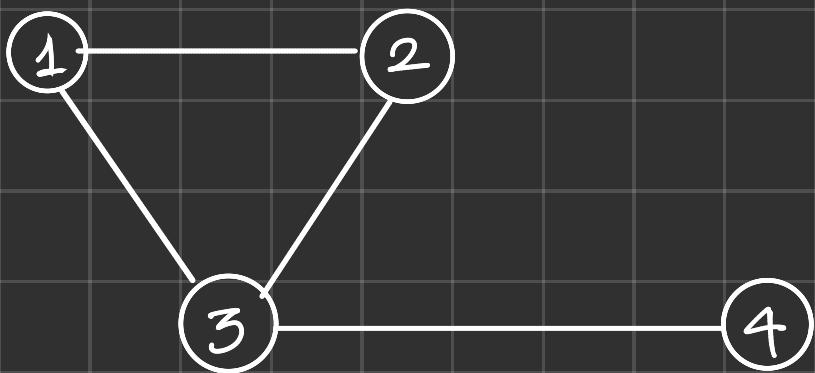
Adjacency list



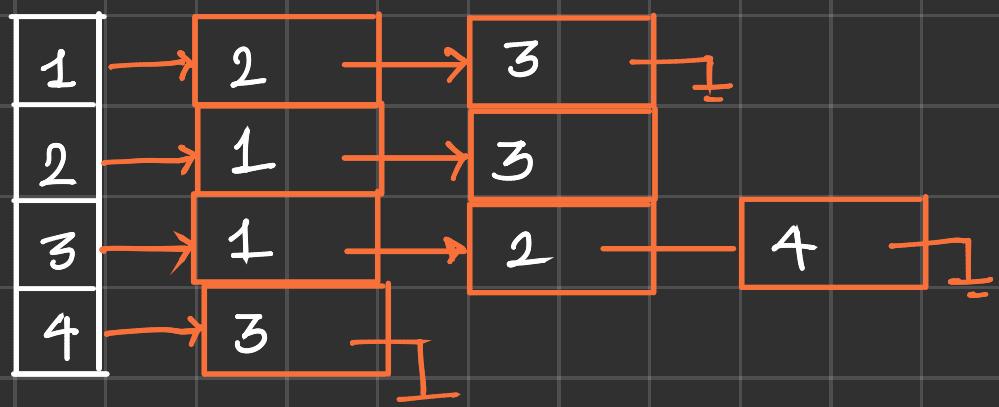
Adjacency matrix

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

Data Structure for graph representation



Adjacency list

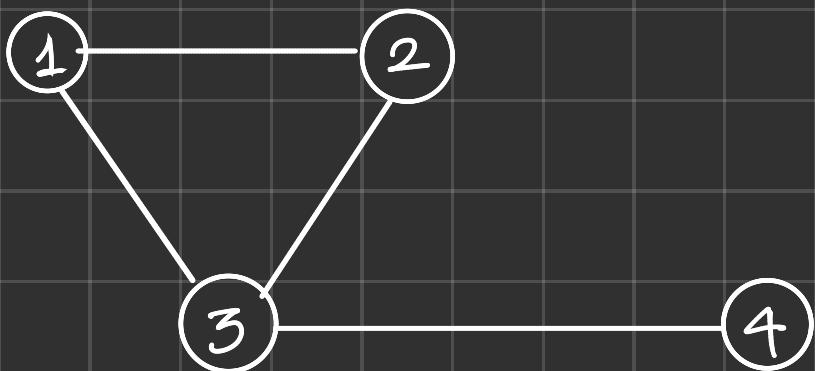


Adjacency matrix

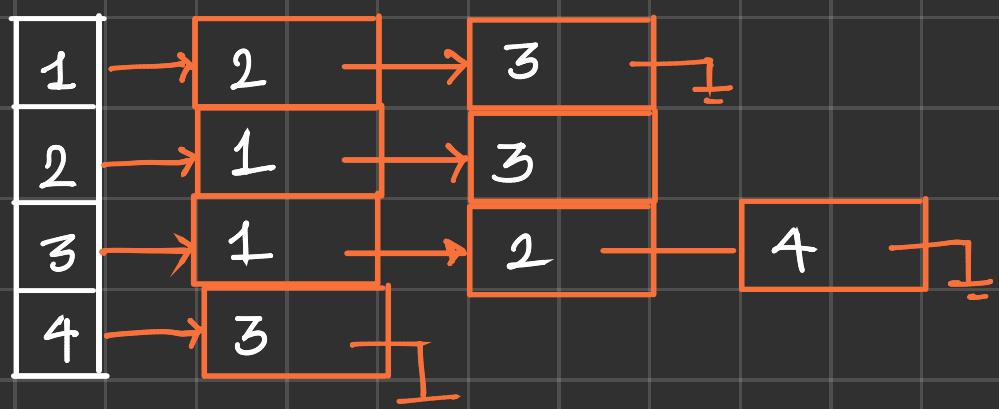
	1	2	3	4
1	0	1	1	0
2	1	0	1	0
3	1	1	0	1
4	0	0	1	0

Space:

Data Structure for graph representation



Adjacency list



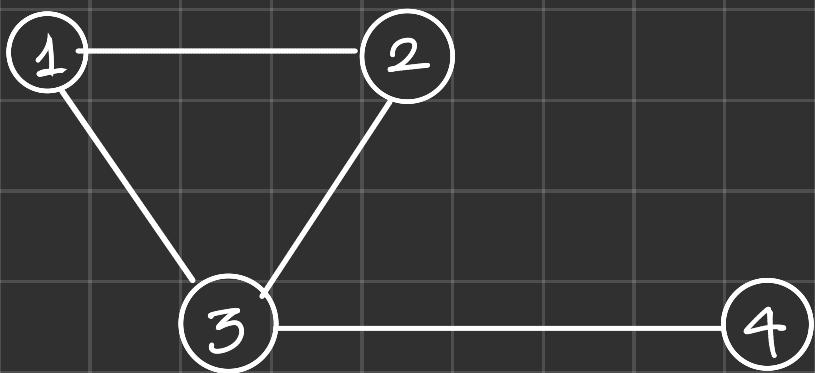
Adjacency matrix

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

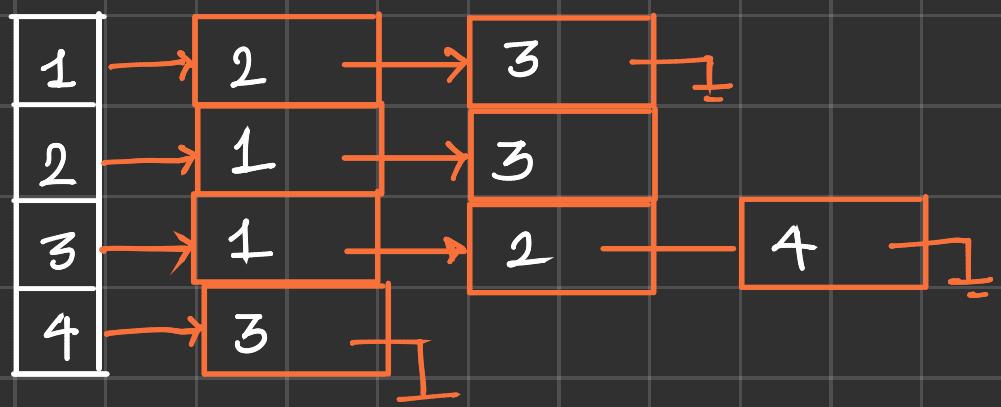
Space: $O(m+n)$

$O(n^2)$

Data Structure for graph representation



Adjacency list



Adjacency matrix

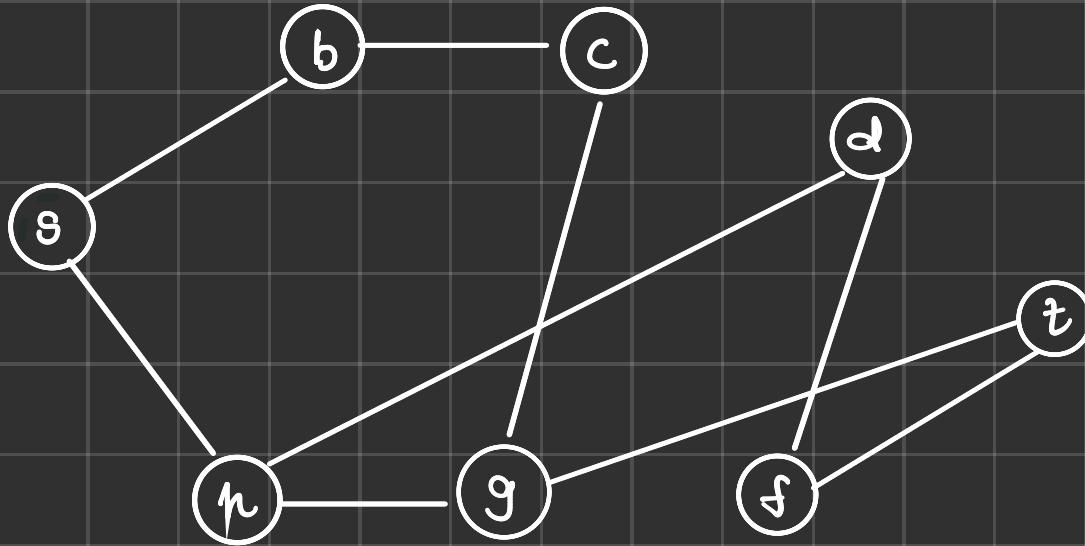
	1	2	3	4
1	0	1	1	0
2	1	0	1	0
3	1	1	0	1
4	0	0	1	0

Space: $O(m+n)$

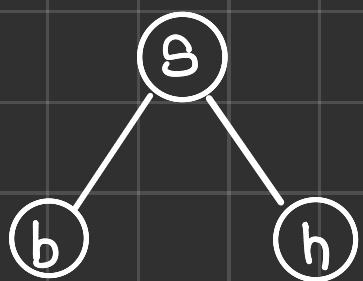
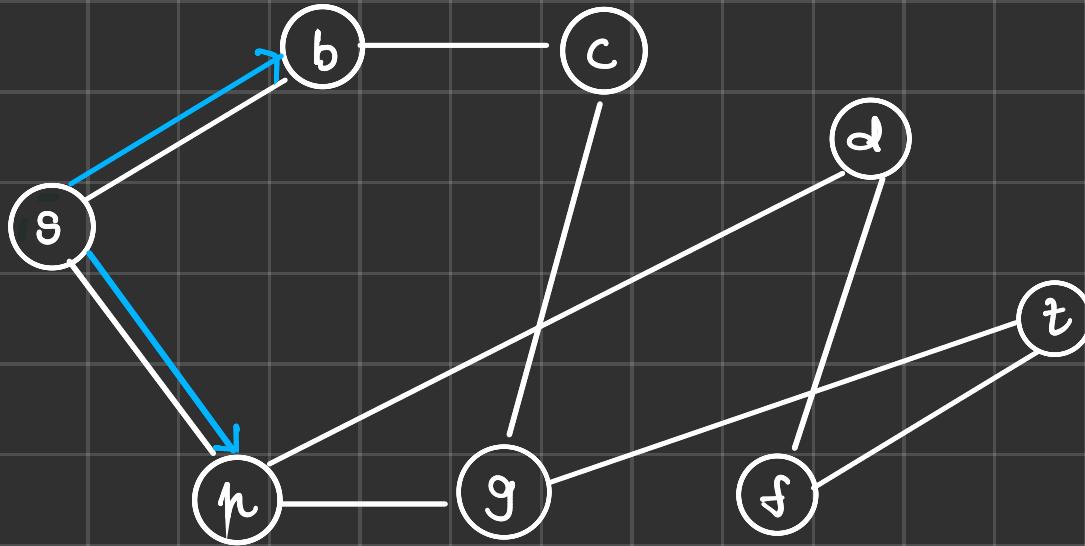
$O(n^2)$

Unless stated otherwise, we will assume that the graph is given in adjacency form list.

Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .



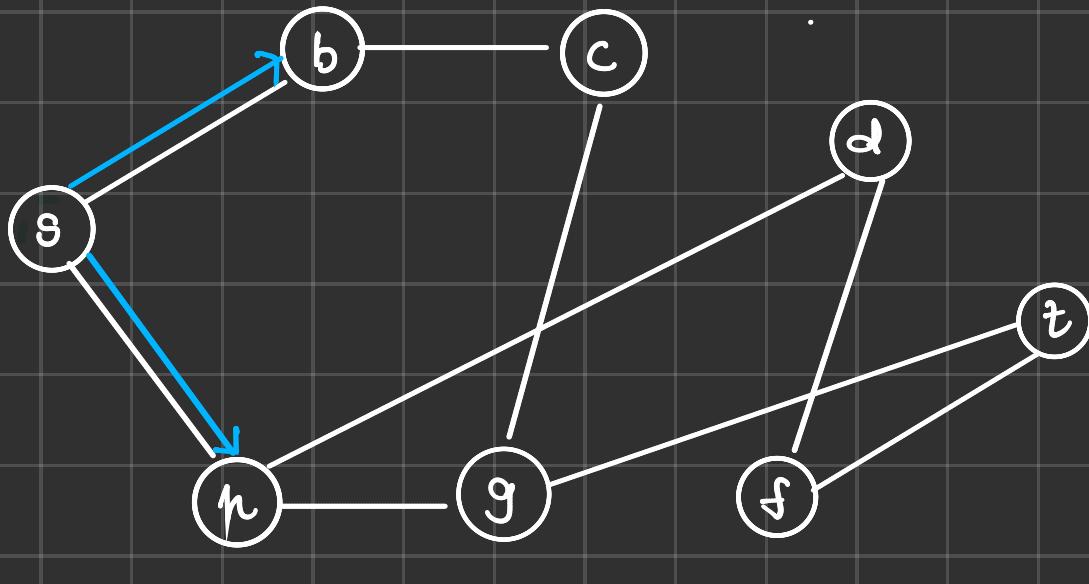
Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .



..... L_0

..... L_1

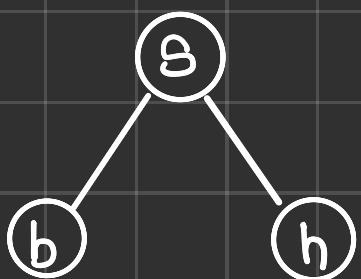
Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .



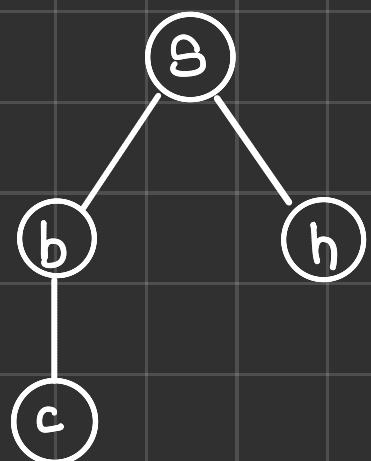
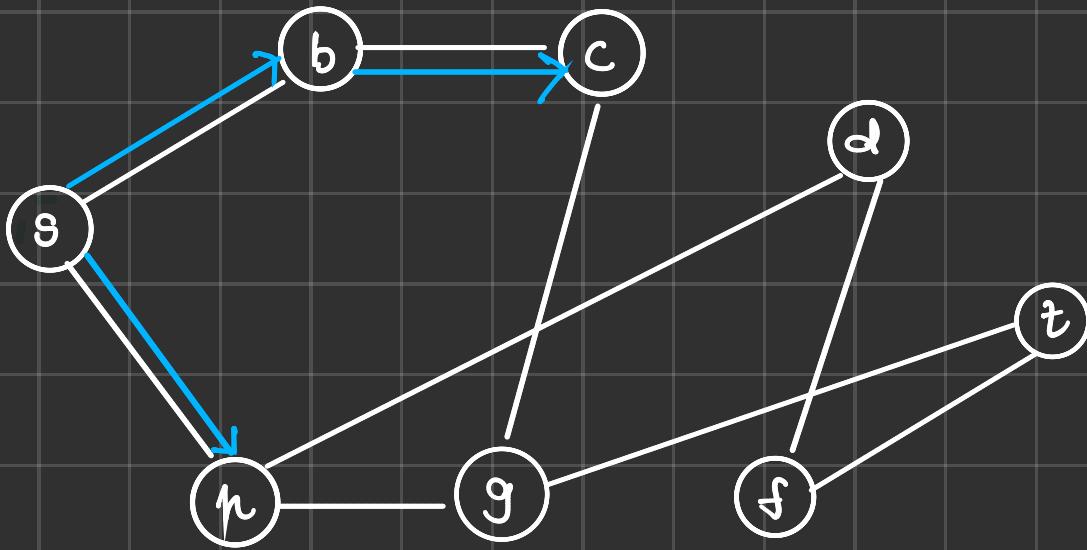
..... L_0

..... L_1

- 1) consider nodes in order
- 2) discover new vertices



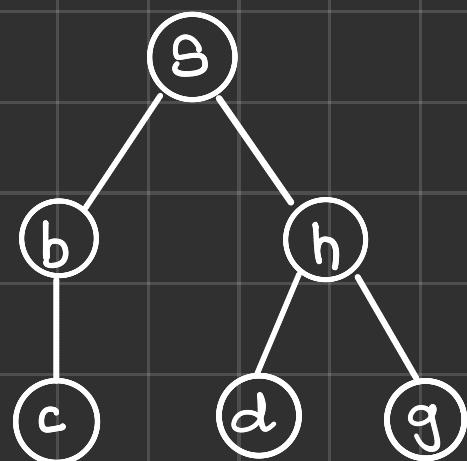
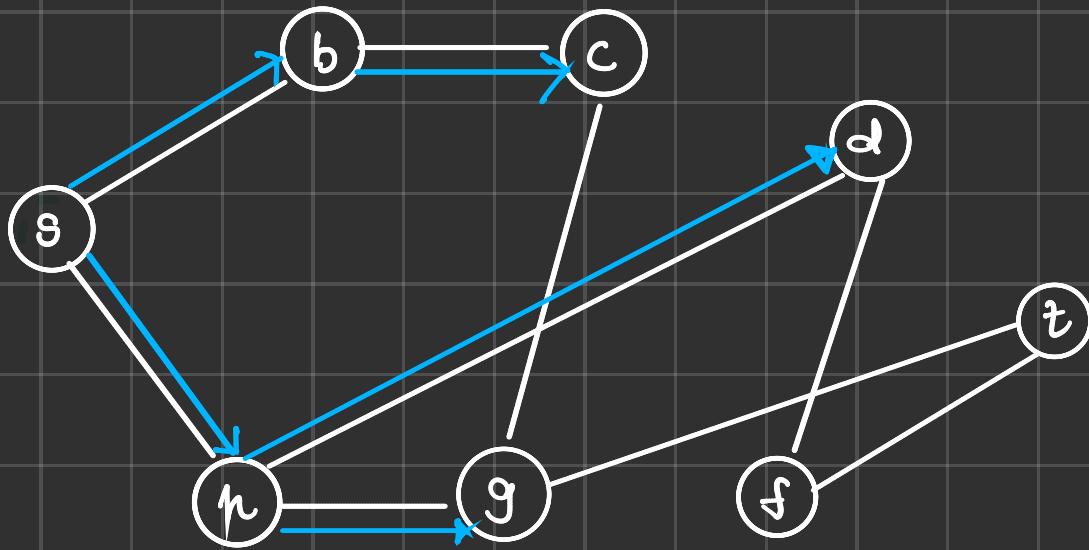
Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .



..... L_0

..... L_1

Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .

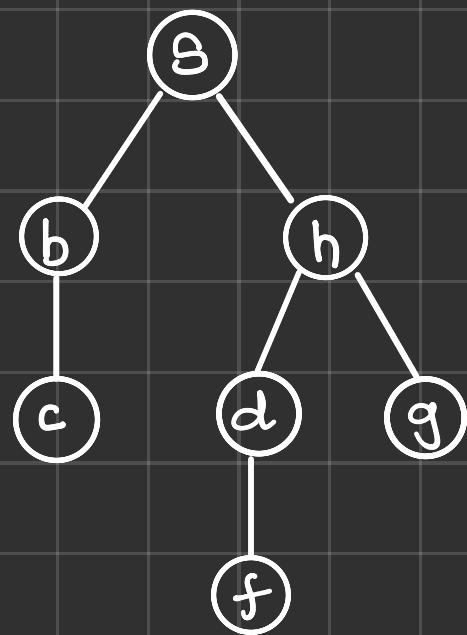
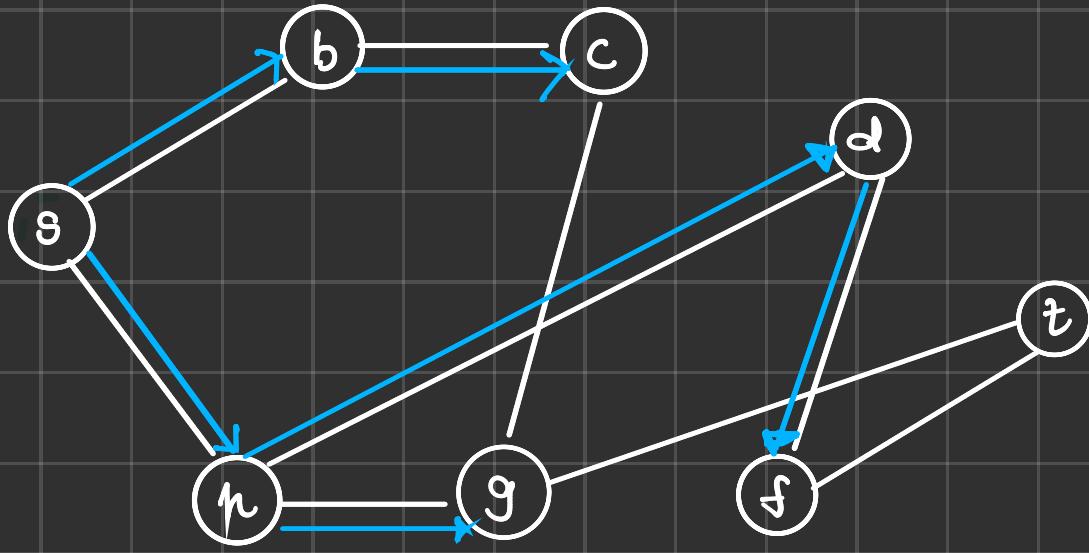


..... L_0

..... h_1

..... h_2

Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .

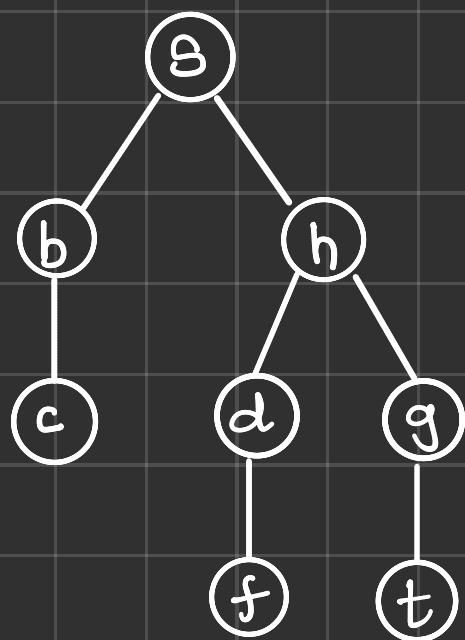
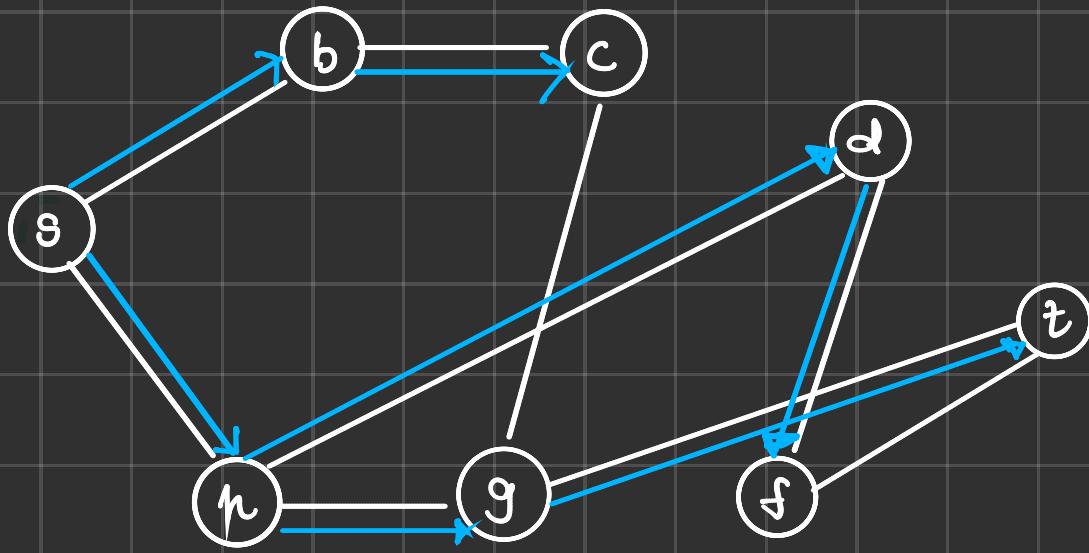


..... L_0

..... h_1

..... h_2

Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .



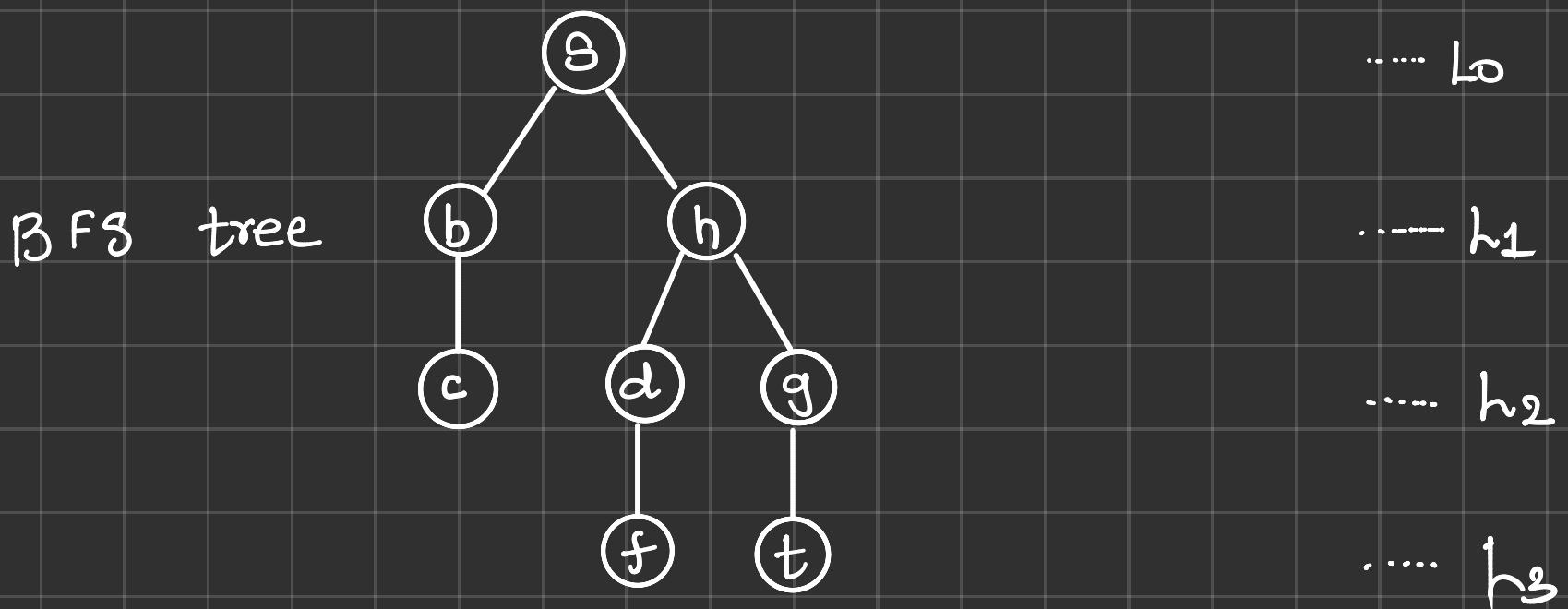
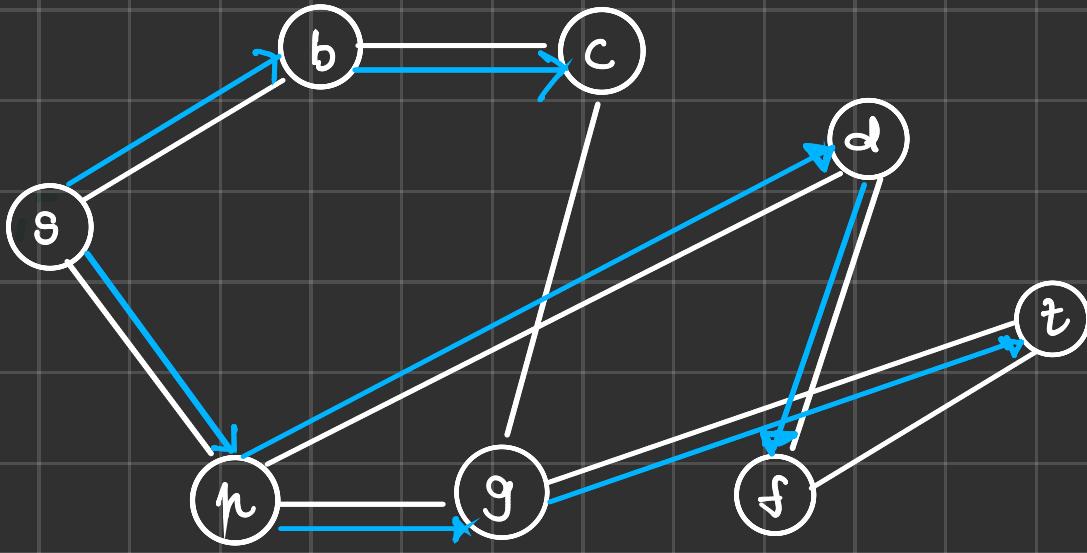
..... L_0

..... h_1

..... h_2

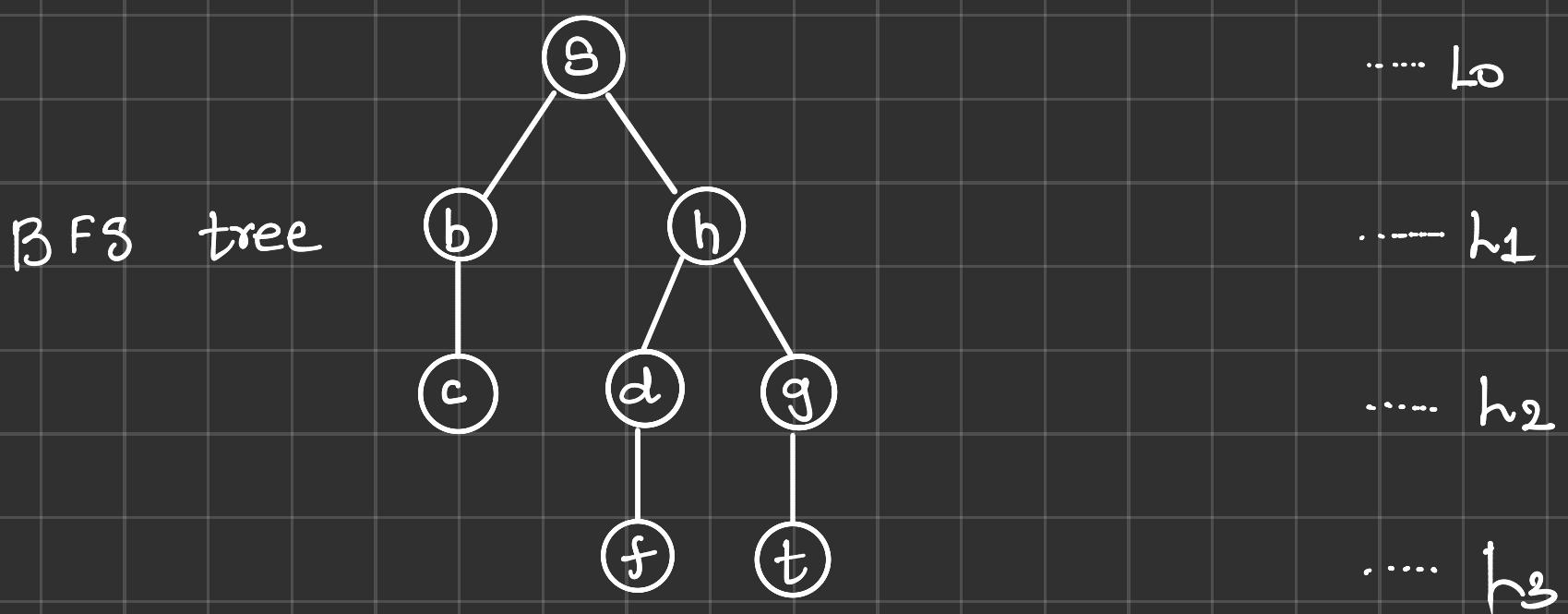
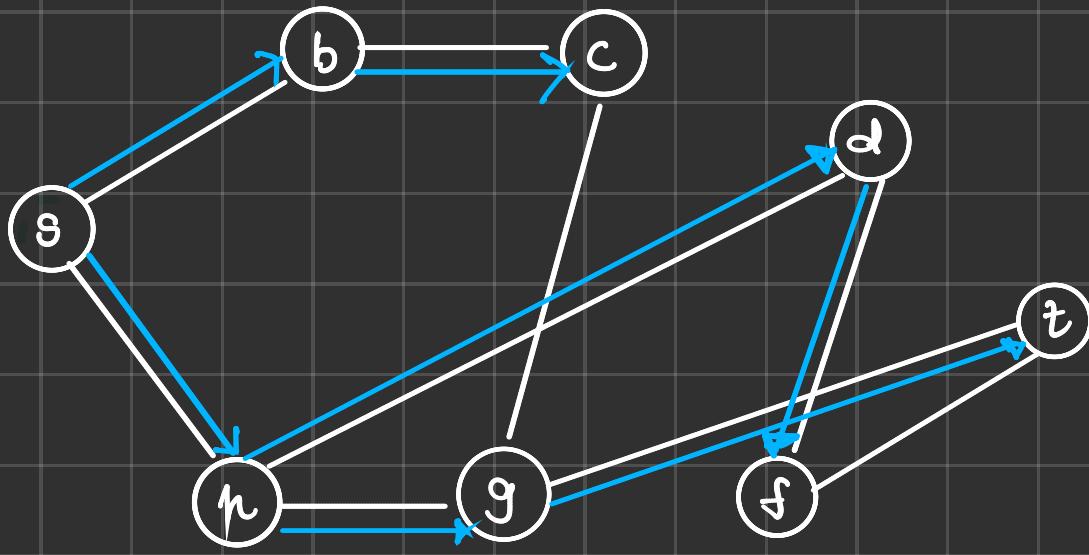
..... h_3

Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .



Tree Edges : all the edges in BFS tree
(or all blue edges).

Q: Given a graph G and two vertices s & t ,
find if t is reachable from s .



Tree Edges : all the edges in BFS tree
(or all blue edges).

Non-tree edges : edges not present in the BFS tree
 $\{ (c,g), (f,t) \}$

Observation: If distance from s to x , $d_G(s, x) = l$,
then x will be part of layer :

Observation: If distance from s to x , $d_G(s,x) = l$,
then x will be part of layer : L_l

\Rightarrow If s & t are connected, then $d(s,t) = c$

\Rightarrow t will lie in the BFS-tree

Observation: If distance from s to x , $d_G(s, x) = l$, then x will be part of layer : L_l

\Rightarrow If s & t are connected, then $d(s, t) = c$

\Rightarrow t will lie in the BFS-tree

Some more properties of Breadth First Search.

Lemma: Let xy be an edge in the graph. Let x lie in layer L_i & y lie in layer L_j then $|i - j| \leq 1$.

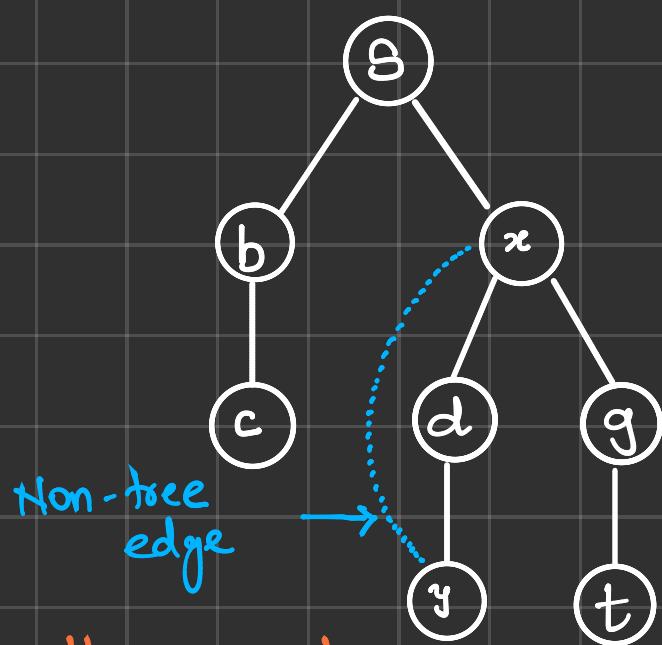
Observation: If distance from s to x , $d_G(s, x) = l$, then x will be part of layer : L_l

\Rightarrow If s & t are connected, then $d(s, t) = c$

\Rightarrow t will lie in the BFS-tree

Some more properties of Breadth First Search.

Lemma: Let xy be an edge in the graph. Let x lie in layer L_i & y lie in layer L_j then $|i - j| \leq 1$.



Why can this not happen?

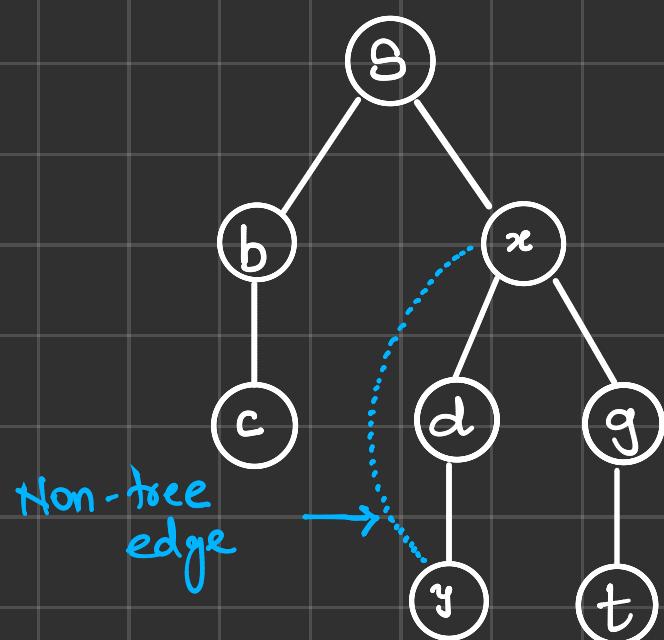
Observation: If distance from s to x , $d_G(s, x) = l$, then x will be part of layer : L_l

\Rightarrow If s & t are connected, then $d(s, t) = c$

\Rightarrow t will lie in the BFS-tree

Some more properties of Breadth First Search.

Lemma: Let xy be an edge in the graph. Let x lie in layer L_i & y lie in layer L_j then $|i - j| \leq 1$.



When x is processed, it should have found y .
So y should be the child of x .

Implementing BFS

BFS(s)

```
{   for each v ∈ V
    {   discovered[v] ← false;
        discovered[s] ← true;
        Q.enqueue(s)
        while (Q is not empty)
        {   v ← Q.dequeue();
            for each neighbor w of v
            {   if (discovered[w] = false)
                {
                    discovered[w] ← true;
                    Q.enqueue(w);
                }
            }
        }
    }
}
```

Implementing BFS

BFS(s)

{ for each $v \in V$

{ discovered[v] \leftarrow false;

} discovered[s] \leftarrow true;

Q.enqueue(s)

while (Q is not empty)

{ $v \leftarrow Q.dequeue()$;

for each neighbor w of v

{ if (discovered[w] = false)

{ discovered[w] = true; Q.enqueue(w);

} add (v, w) to the BFS tree;

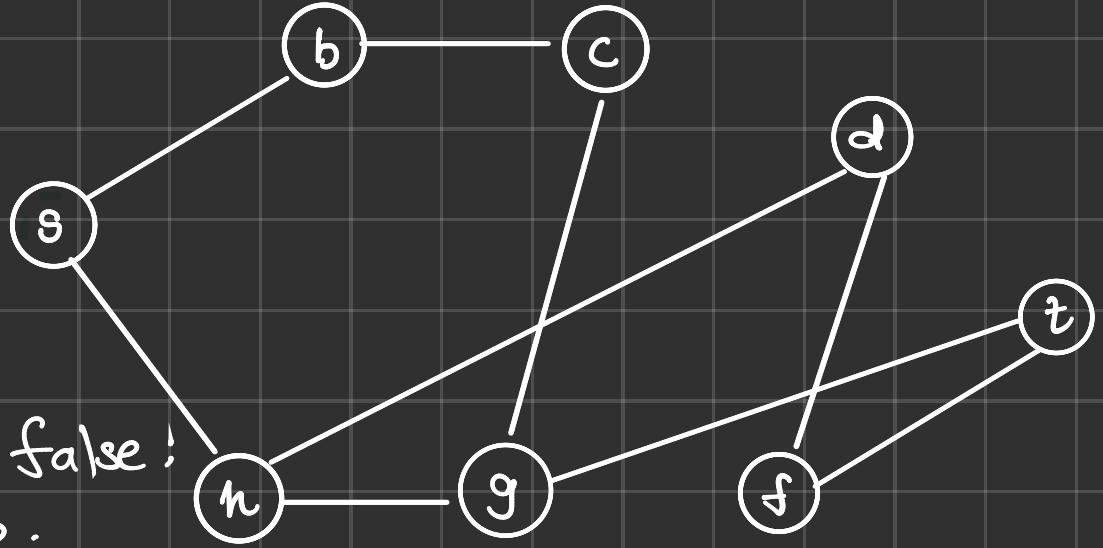
}

}

Implementing BFS

BFS(s)

```
{   for each v ∈ V  
{     discovered[v] ← false;  
     discovered[s] ← true;  
  
Q.enqueue(s)  
while ( Q is not empty)  
{   v ← Q.dequeue();  
   for each neighbor w of v  
   { if ( discovered[w] = false)  
     { discovered[w] = true ; Q.enqueue(w);  
       add (v,w) to the BFS tree;  
     }  
   }  
 }  
 }
```



Implementing BFS

BFS(s)

```
{ → for each  $v \in V$ 
  → {   discovered [ $v$ ] ← false ;
  → }   discovered [ $s$ ] ← true ;
```

Q . enqueue (s)

while (Q is not empty)

```
{    $v \leftarrow Q$ .dequeue();
```

for each neighbor w of v

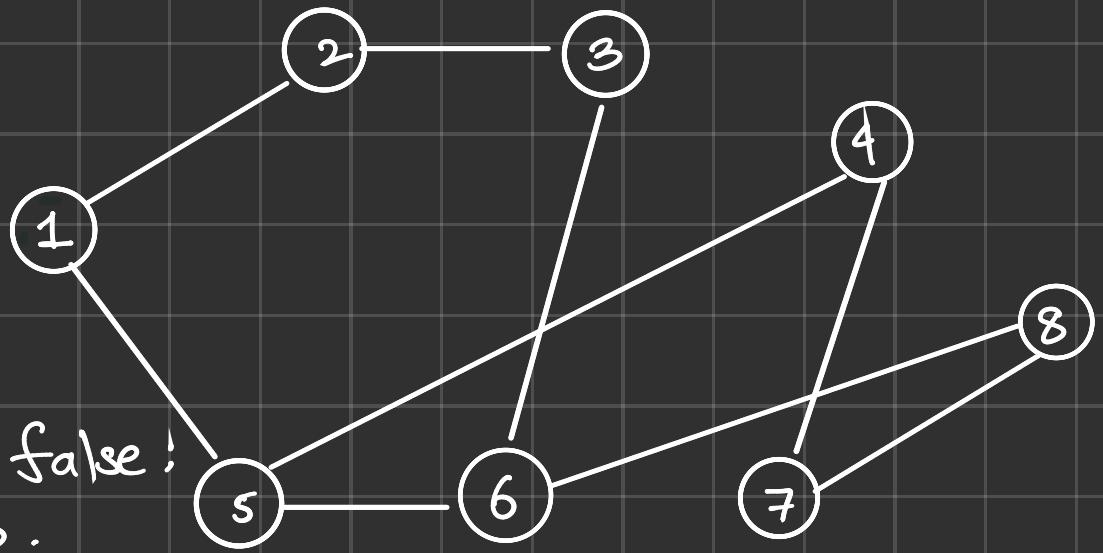
```
{   if (discovered [ $w$ ] = false)
```

```
    discovered [ $w$ ] = true ;  $Q$ .enqueue ( $w$ );
```

add (v, w) to the BFS tree;

}

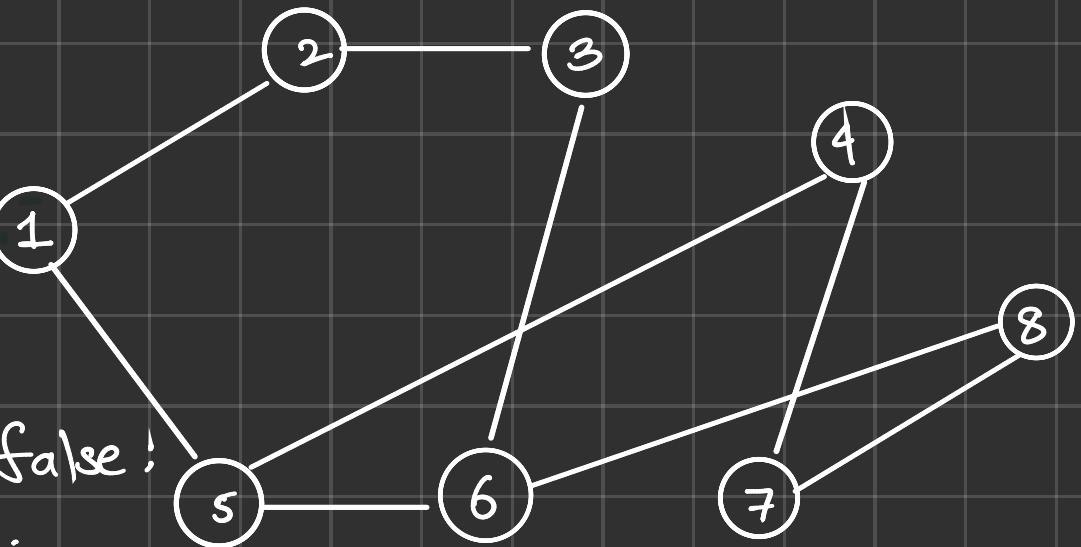
}



Implementing BFS

BFS(s)

```
{
    → for each  $v \in V$ 
    → {
        → discovered[v] ← false;
        → discovered[s] ← true;
```



Q . enqueue(s)

while (Q is not empty)

```
{
    v ← Q.dequeue();
```

for each neighbor w of v

```
{
    if (discovered[w] = false)
```

```
    discovered[w] = true; Q.enqueue(w);
```

add (v, w) to the BFS tree;

}

}

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

discovered

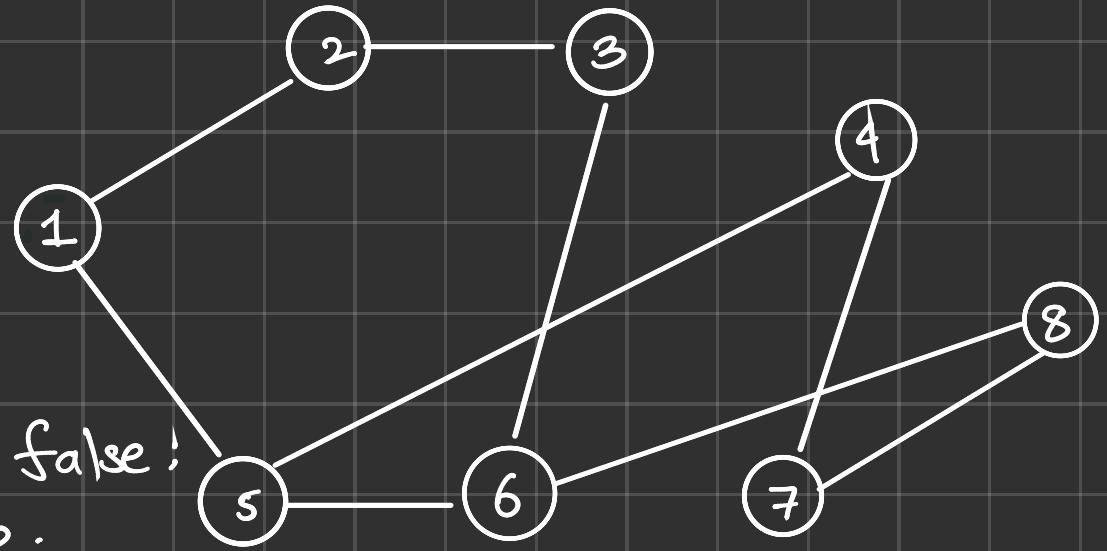
Implementing BFS

BFS(s)

```
{
    for each  $v \in V$ 
    {
        discovered[v]  $\leftarrow$  false;
    }
     $\rightarrow$  discovered[s]  $\leftarrow$  true;
    Q.enqueue(s)
    while (Q is not empty)
    {
         $v \leftarrow$  Q.dequeue();
        for each neighbor  $w$  of  $v$ 
        {
            if (discovered[w] = false)
            {
                discovered[w] = true;
                Q.enqueue(w);
                add ( $v, w$ ) to the BFS tree;
            }
        }
    }
}
```

1	2	3	4	5	6	7	8
t	f	f	f	f	f	f	f

discovered



Implementing BFS

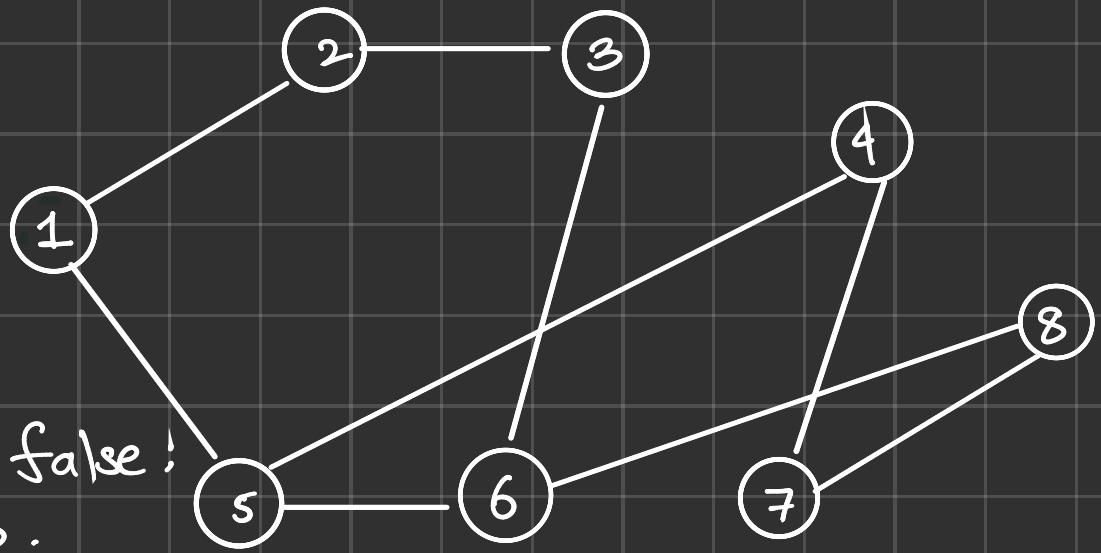
BFS(s)

```

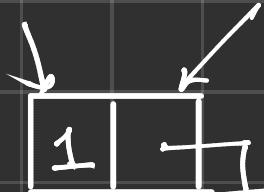
{   for each  $v \in V$ 
{     discovered[v]  $\leftarrow$  false;
    discovered[s]  $\leftarrow$  true;
     $\rightarrow Q.\text{enqueue}(s)$ 
    while ( $Q$  is not empty)
    {    $v \leftarrow Q.\text{dequeue}();$ 
        for each neighbor  $w$  of  $v$ 
        {   if ( $\text{discovered}[w] = \text{false}$ )
            {
                discovered[w]  $=$  true;
                 $Q.\text{enqueue}(w);$ 
                add  $(v, w)$  to the BFS tree;
            }
        }
    }
}
  
```

1	2	3	4	5	6	7	8
t	f	f	f	f	f	f	f

discovered



front rear.



$Q.$

Implementing BFS

BFS(s)

```

{   for each  $v \in V$ 
{     discovered[v]  $\leftarrow$  false;
    discovered[s]  $\leftarrow$  true;
    Q.enqueue(s)
    while (Q is not empty)
       $\rightarrow$  {   v  $\leftarrow$  Q.dequeue();
        for each neighbor w of v
        {   if (discovered[w] = false)
            discovered[w] = true; Q.enqueue(w);
            add (v,w) to the BFS tree;
          }
        }
      }
    }
  
```

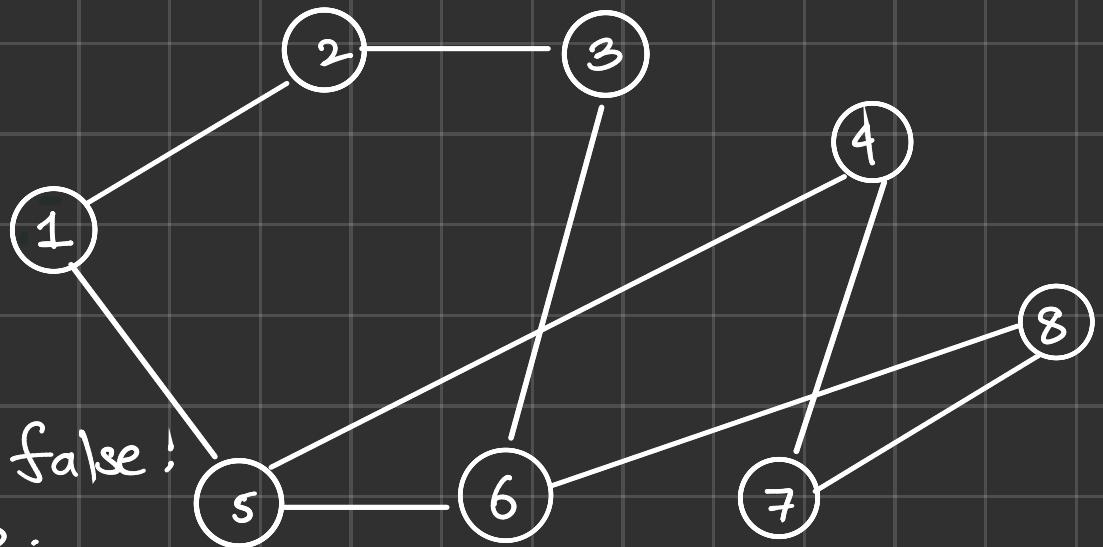
1	2	3	4	5	6	7	8
t	f	f	f	f	f	f	f

discovered

null

Q.

$v \leftarrow 1$



Implementing BFS

BFS(s)

```

{   for each  $v \in V$ 
{     discovered[v]  $\leftarrow$  false;
    discovered[s]  $\leftarrow$  true;
    Q.enqueue(s)
    while (Q is not empty)
    {   v  $\leftarrow$  Q.dequeue();
        for each neighbor w of v
        -> { if (discovered[w] = false)
            discovered[w] = true ; Q.enqueue(w);
            add (v,w) to the BFS tree;
        }
    }
}
  
```

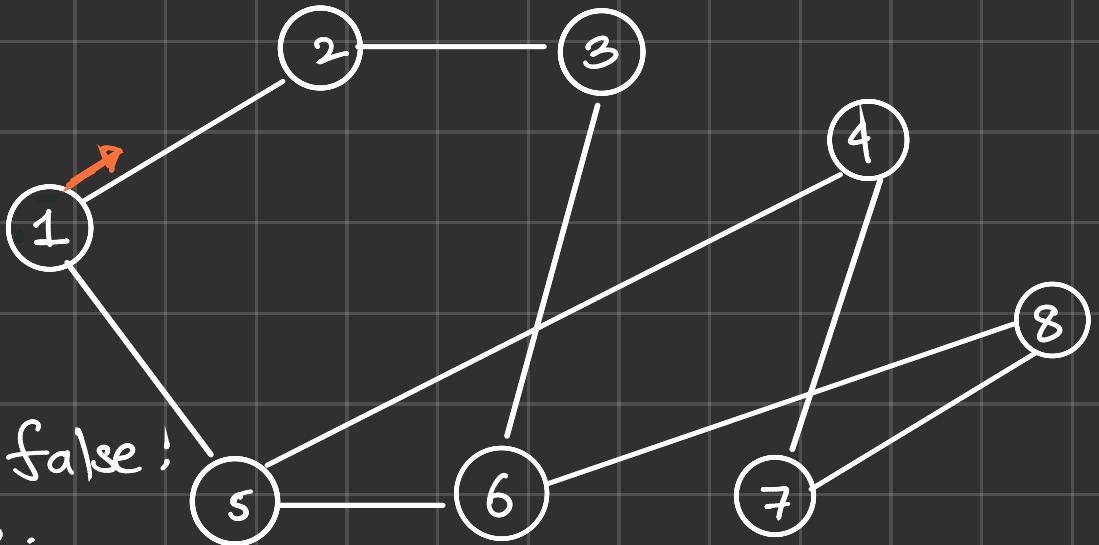
1	2	3	4	5	6	7	8
t	f	f	f	f	f	f	f

discovered

null.

Q.

$v \leftarrow 1$



Implementing BFS

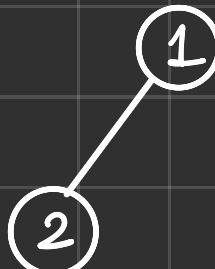
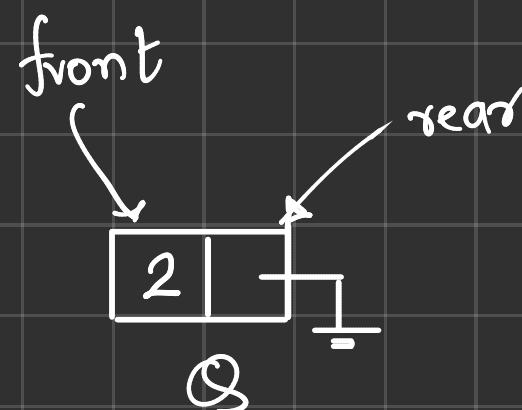
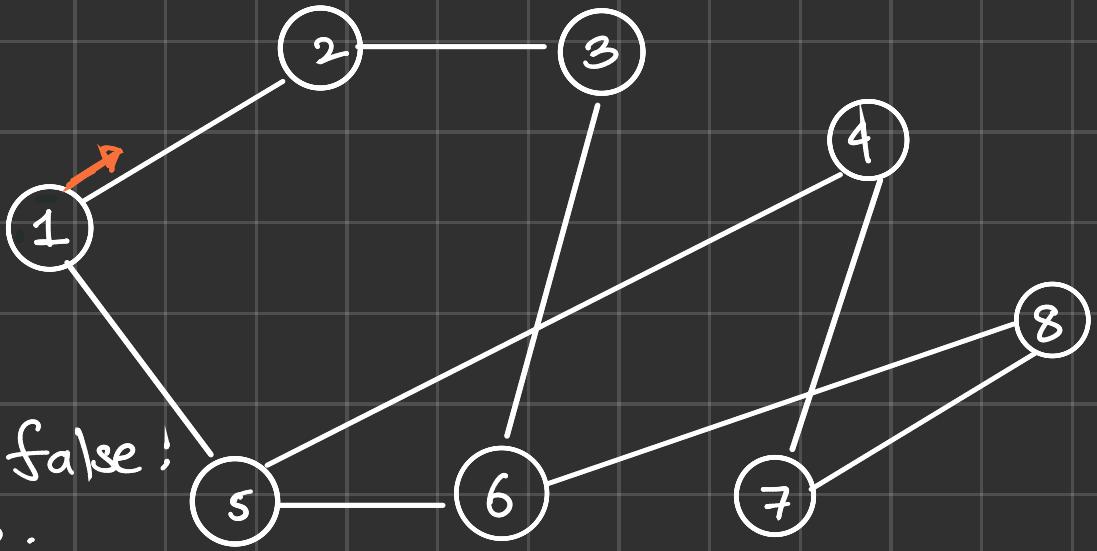
BFS(s)

```
{
  for each  $v \in V$ 
  {
    discovered[v]  $\leftarrow$  false;
    discovered[s]  $\leftarrow$  true;
    Q.enqueue(s);
    while (Q is not empty)
    {
       $v \leftarrow$  Q.dequeue();
      for each neighbor  $w$  of  $v$ 
      {
        if (discovered[w] = false)
        {
          discovered[w] = true;
          Q.enqueue(w);
          add ( $v, w$ ) to the BFS tree;
        }
      }
    }
  }
}
```

1	2	3	4	5	6	7	8
t	t	f	f	f	f	f	f

discovered

$v \leftarrow 1$



Implementing BFS

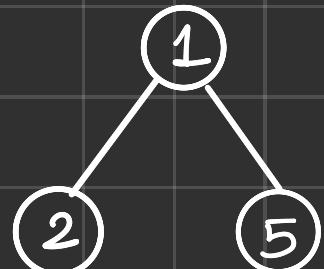
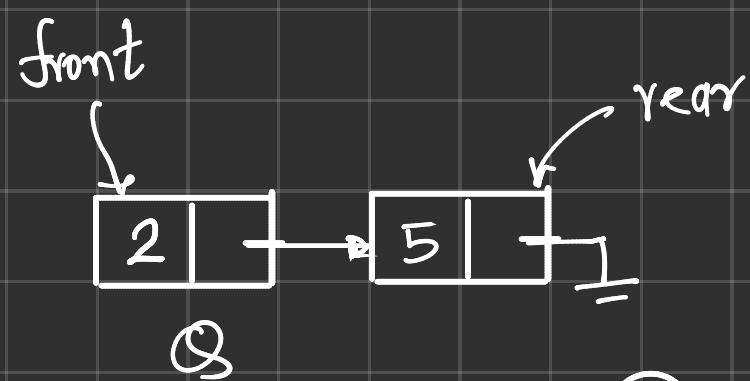
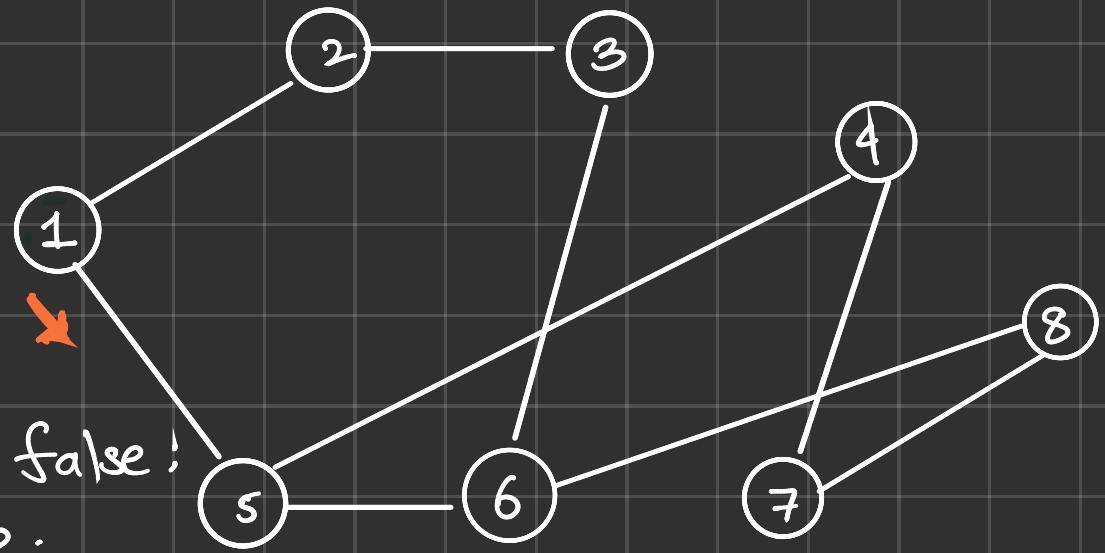
BFS(s)

```
{
  for each  $v \in V$ 
  {
    discovered[v]  $\leftarrow$  false;
    discovered[s]  $\leftarrow$  true;
  }
  Q.enqueue(s)
  while (Q is not empty)
  {
     $v \leftarrow Q.dequeue();$ 
    for each neighbor  $w$  of  $v$ 
    {
      if (discovered[w] = false)
      {
        discovered[w] = true;  $Q.enqueue(w);$ 
        add ( $v, w$ ) to the BFS tree;
      }
    }
  }
}
```

1	2	3	4	5	6	7	8
t	t	f	f	t	f	f	f

discovered

$v \leftarrow 1$



Implementing BFS

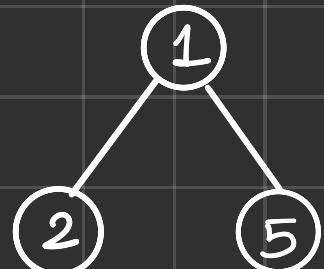
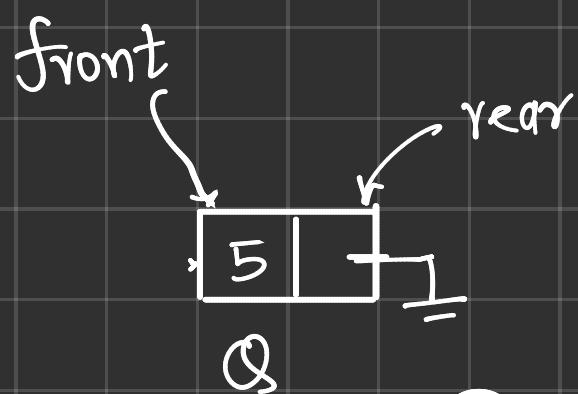
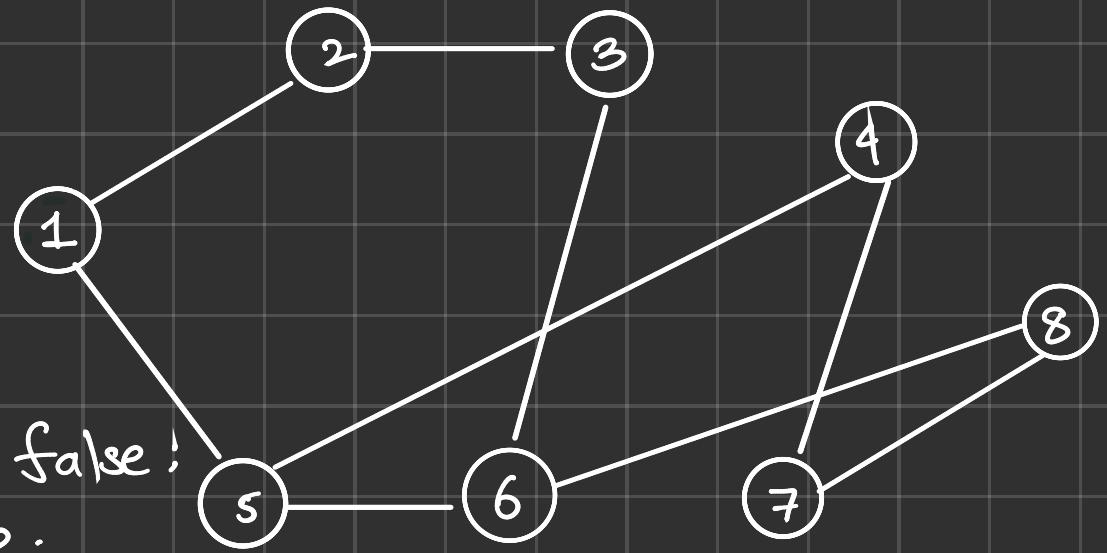
BFS(s)

```
{
    for each  $v \in V$ 
    {
        discovered[v] ← false;
        discovered[s] ← true;
    }
    Q.enqueue(s)
    while (Q is not empty)
    → {
         $v \leftarrow Q.dequeue();$ 
        for each neighbor  $w$  of  $v$ 
        {
            if (discovered[w] = false)
            {
                discovered[w] = true;
                Q.enqueue(w);
                add ( $v, w$ ) to the BFS tree;
            }
        }
    }
}
```

1	2	3	4	5	6	7	8
t	t	f	f	t	f	f	f

discovered

$v \leftarrow 2$



Implementing BFS

BFS(s)

```
{
  for each  $v \in V$ 
  {
    discovered[v]  $\leftarrow$  false;
    discovered[s]  $\leftarrow$  true;
```

Q . enqueue(s)

while (Q is not empty)

```
{
   $v \leftarrow Q$ .dequeue();
```

for each neighbor w of v

```

  if (discovered[w] = false)
```

```

    discovered[w] = true;  $Q$ .enqueue(w);
```

add (v, w) to the BFS tree;

}

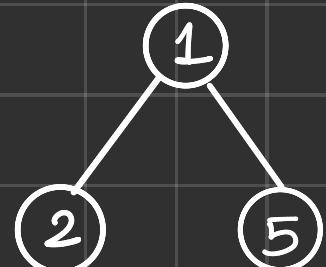
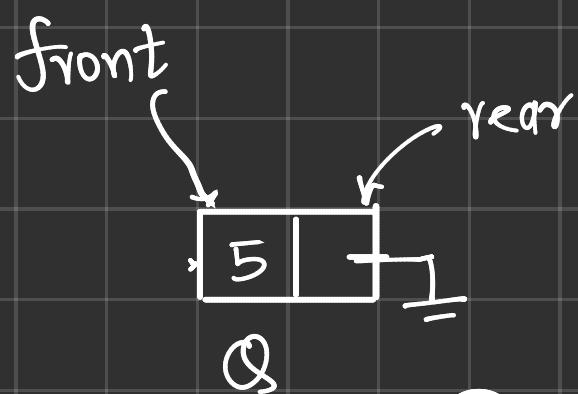
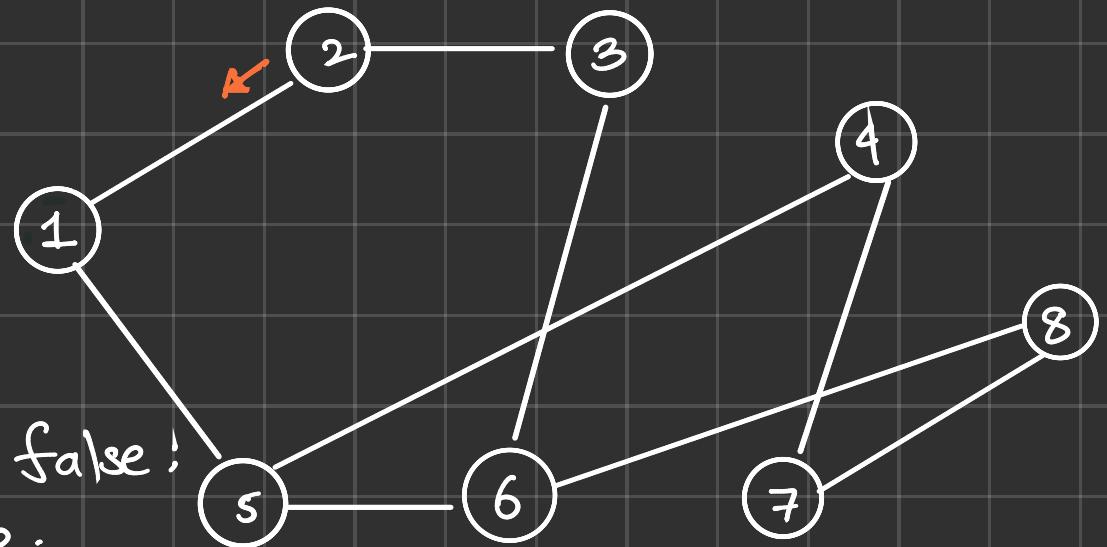
}

}

1	2	3	4	5	6	7	8
t	t	f	f	t	f	f	f

discovered

$v \leftarrow 2$



Implementing BFS

BFS(s)

```
{
    for each  $v \in V$ 
    {
        discovered[v]  $\leftarrow$  false;
        discovered[s]  $\leftarrow$  true;
    }
}
```

Q . enqueue(s)

while (Q is not empty)

```
{
     $v \leftarrow Q$ .dequeue();
```

for each neighbor w of v

```

    if (discovered[w] = false)
    {

```

```
        discovered[w] = true;  $Q$ .enqueue(w);
```

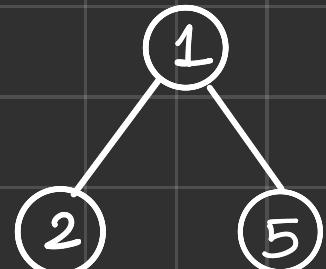
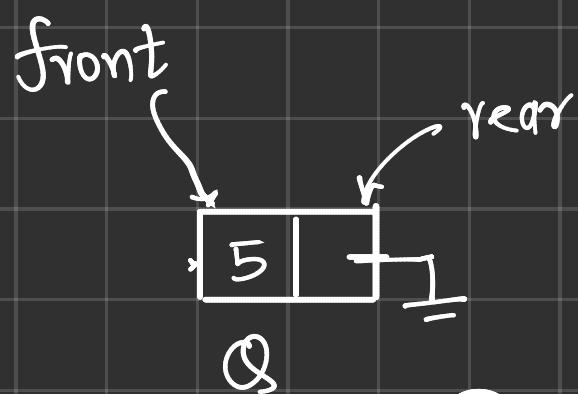
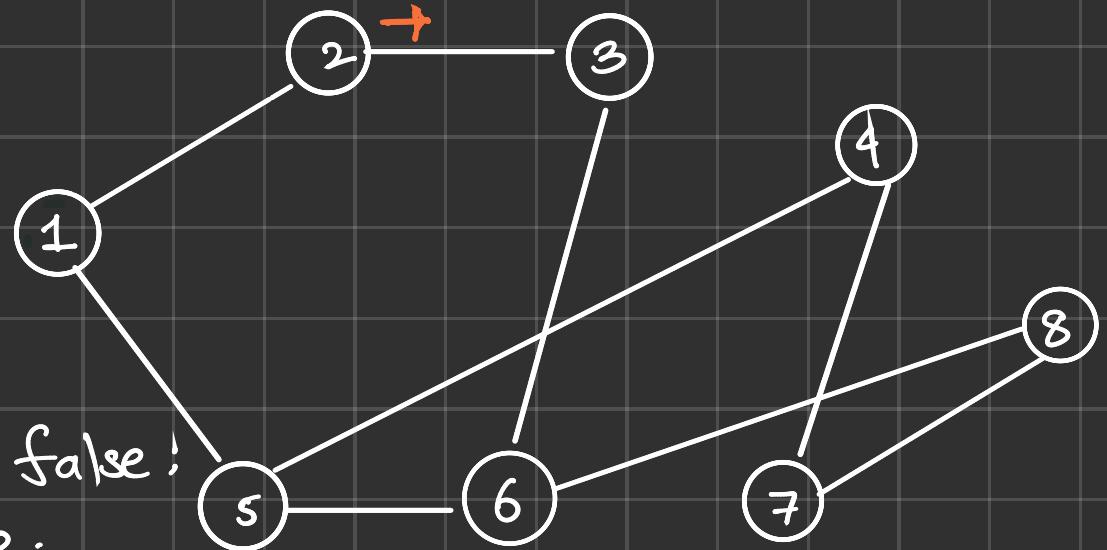
add (v, w) to the BFS tree;

}

1	2	3	4	5	6	7	8
t	t	f	f	t	f	f	f

discovered

$v \leftarrow 2$



Implementing BFS

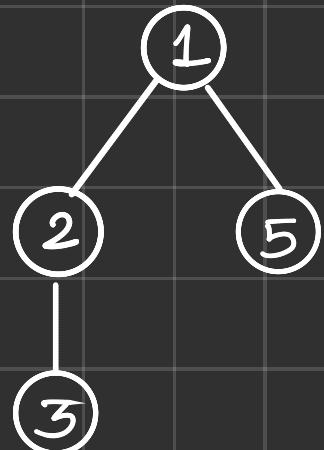
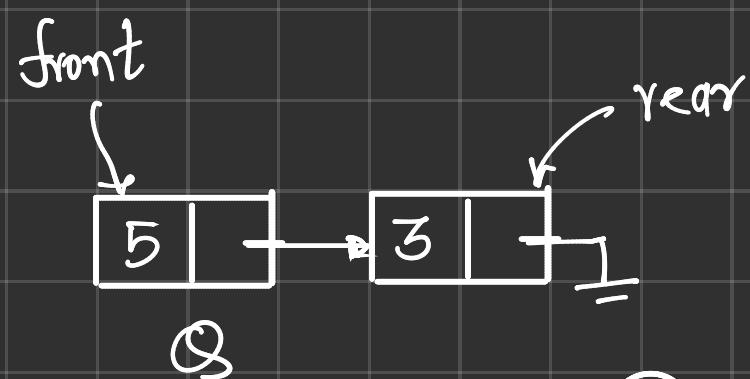
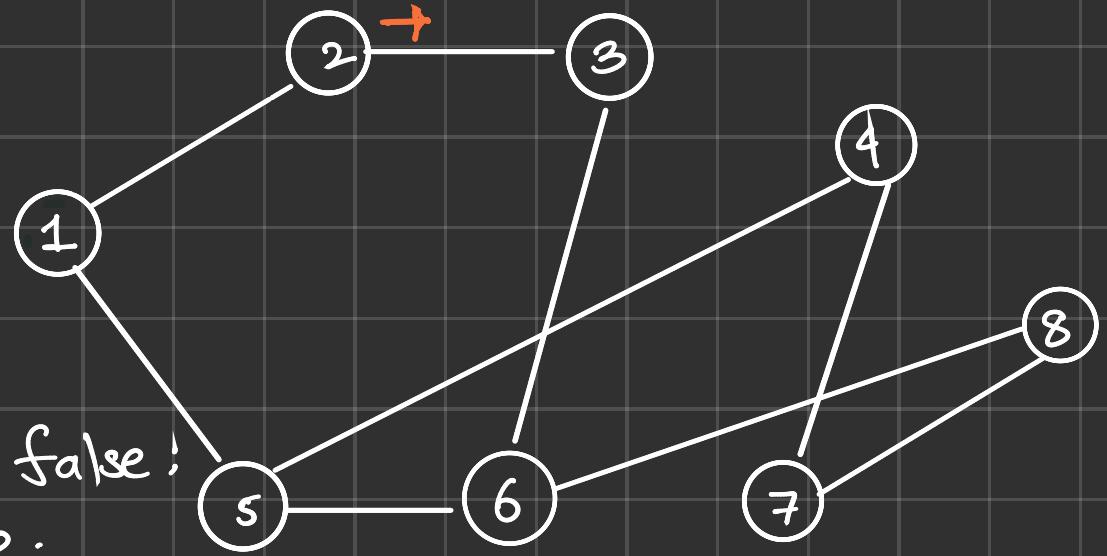
BFS(s)

```
{
  for each  $v \in V$ 
  {
    discovered[v]  $\leftarrow$  false;
    discovered[s]  $\leftarrow$  true;
  }
  Q.enqueue(s)
  while (Q is not empty)
  {
     $v \leftarrow Q.dequeue();$ 
    for each neighbor  $w$  of  $v$ 
    {
      if (discovered[w] = false)
      {
        discovered[w] = true;
        Q.enqueue(w);
        add ( $v, w$ ) to the BFS tree;
      }
    }
  }
}
```

1	2	3	4	5	6	7	8
t	t	t	f	t	f	f	f

discovered

$v \leftarrow 2$



Implementing BFS

BFS(s)

{ for each $v \in V$

{ discovered[v] \leftarrow false;

; discovered[s] \leftarrow true;

Q.enqueue(s)

while (Q is not empty)

{ $v \leftarrow Q.dequeue();$

for each neighbor w of v

{ if (discovered[w] = false)

{ discovered[w] = true; Q.enqueue(w);

; add (v,w) to the BFS tree;

; }

}

Running time :

Implementing BFS

BFS(s)

```
{   for each v ∈ V
    {   discovered[v] ← false;
        } discovered[s] ← true;
    Q.enqueue(s)
    while (Q is not empty)
    {   v ← Q.dequeue();
        for each neighbor w of v
        {   if (discovered[w] = false)
            {   discovered[w] = true; Q.enqueue(w);
                add (v,w) to the BFS tree;
            }
        }
    }
```

Running time :

Implementing BFS

BFS(s)

```
{   for each  $v \in V$ 
    {   discovered[v]  $\leftarrow$  false;
        discovered[s]  $\leftarrow$  true;
        Q.enqueue(s)
        while (Q is not empty)
        {   v  $\leftarrow$  Q.dequeue();
            for each neighbor w of v
            {   if (discovered[w] = false)
                discovered[w] = true;
                    Q.enqueue(w);
                    add (v,w) to the BFS tree;
            }
        }
    }
}
```

$O(n)$

$O(1)$

$O(1)$

$O(d(v))$

Running time :

Implementing BFS

BFS(s)

```
{   for each  $v \in V$ 
    {   discovered[v]  $\leftarrow$  false;
        discovered[s]  $\leftarrow$  true;
        Q.enqueue(s)
        while (Q is not empty)
        {   v  $\leftarrow$  Q.dequeue();
            for each neighbor w of v
            {   if (discovered[w] = false)
                discovered[w] = true;
                    Q.enqueue(w);
                    add (v,w) to the BFS tree;
            }
        }
    }
}
```

$O(n)$ $O(1)$ $O(1)$ $O(d(v))$

Running time :

Main Observation : Each vertex is discovered only once
 \Rightarrow Each vertex enters the queue only once.

Implementing BFS

BFS(s)

```
{   for each  $v \in V$ 
    {   discovered[v]  $\leftarrow$  false;
        discovered[s]  $\leftarrow$  true;
        Q.enqueue(s)
        while (Q is not empty)
        {   v  $\leftarrow$  Q.dequeue();
            for each neighbor w of v
            {   if (discovered[w] = false)
                discovered[w] = true;
                    Q.enqueue(w);
                    add (v,w) to the BFS tree;
            }
        }
    }
}
```

$O(n)$ $O(1)$ $O(1)$ $O(d(v))$

Running time : $O(n) + O(1) + \sum_{v \in V} O(1 + d(v))$

Main Observation : Each vertex is discovered only once
 \Rightarrow Each vertex enters the queue only once.

Implementing BFS

BFS(s)

```

{   for each  $v \in V$ 
    {   discovered[v]  $\leftarrow$  false;
        discovered[s]  $\leftarrow$  true;
    }
    Q.enqueue(s)
    while (Q is not empty)
    {   v  $\leftarrow$  Q.dequeue();
        for each neighbor w of v
        {   if (discovered[w] = false)
            discovered[w] = true;
                Q.enqueue(w);
            add (v,w) to the BFS tree;
        }
    }
}
  
```

$O(n)$

$O(1)$

$O(1)$

$O(d(v))$

$$\begin{aligned}
 \text{Running time : } & O(n) + O(1) + \sum_{v \in V} O(1 + d(v)) \\
 &= O(n) + O(1) + O(n+m) \\
 &= O(n+m)
 \end{aligned}$$

Implementing BFS

BFS(s)

```

{   for each  $v \in V$ 
    {   discovered[v]  $\leftarrow$  false;
        discovered[s]  $\leftarrow$  true;
        Q.enqueue(s)
        while (Q is not empty)
            {   v  $\leftarrow$  Q.dequeue();
                for each neighbor w of v
                    {   if (discovered[w] = false)
                        discovered[w] = true;
                            Q.enqueue(w);
                            add (v,w) to the BFS tree;
                    }
            }
    }
}
  
```

$O(n)$

$O(1)$

$O(1)$

$O(d(v))$

$$\begin{aligned}
 \text{Running time : } & C_1n + C_2 + \sum_{v \in V} C_3 + C_4 d(v) \\
 &= C_1n + C_2 + C_3 \cdot n + C_4 \cdot 2m \\
 &= O(n+m)
 \end{aligned}$$

Our problem : Find if t is reachable from s .

Reachable(s, t)

{

Our problem : Find if t is reachable from s .

Reachable(s, t)

{

BFS(s);

if ($\text{discovered}[t] = \text{true}$)

t is reachable from s

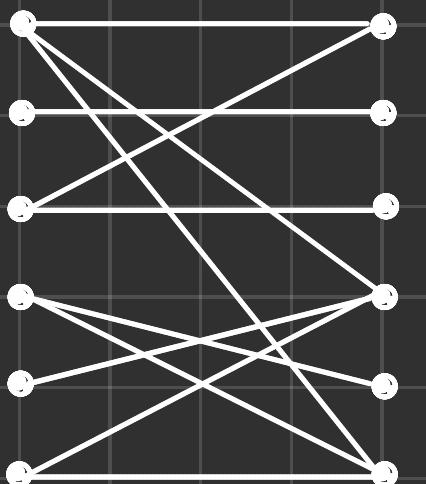
else

t is not reachable from s

}

Problem : Given a connected graph G , find if it is a bipartite graph ?

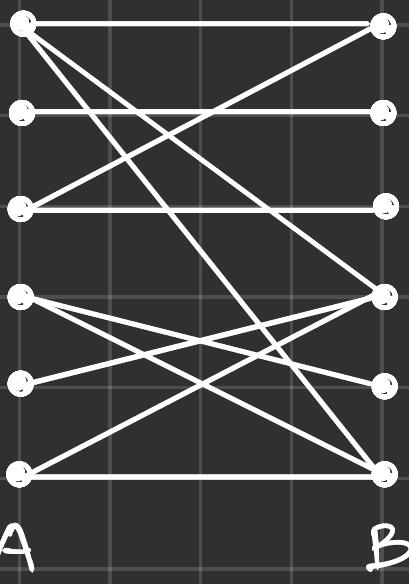
Problem : Given a connected graph G , find if it is a bipartite graph?



A B

For each edge (x,y) in a bipartite graph,
 $(x \in A \text{ and } y \in B)$ or $(x \in B \text{ and } y \in A)$

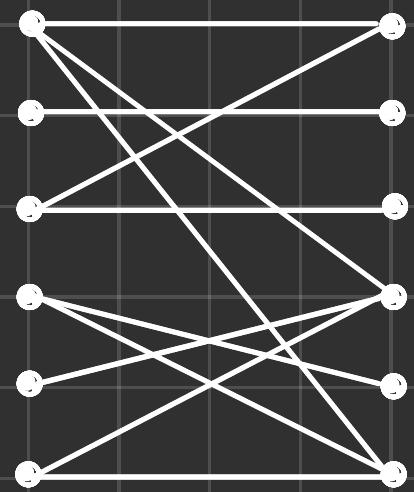
Problem : Given a connected graph G , find if it is a bipartite graph?



For each edge (x,y) in a bipartite graph,
 $(x \in A \text{ and } y \in B) \text{ or } (x \in B \text{ and } y \in A)$

Property : If graph G is bipartite, it cannot contain odd cycle

Problem : Given a connected graph G , find if it is a bipartite graph?

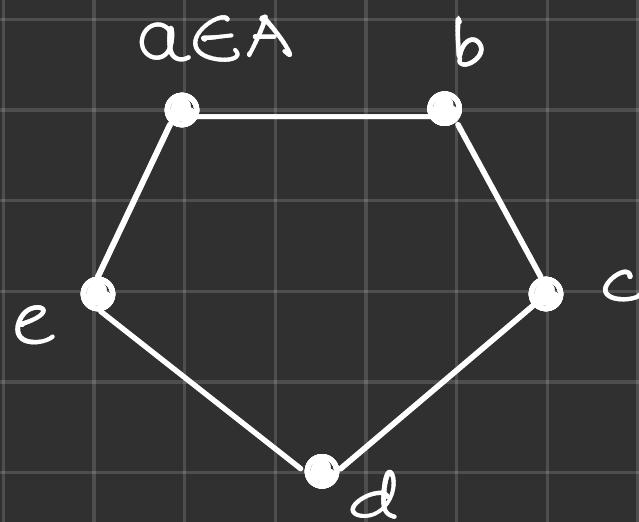


A B

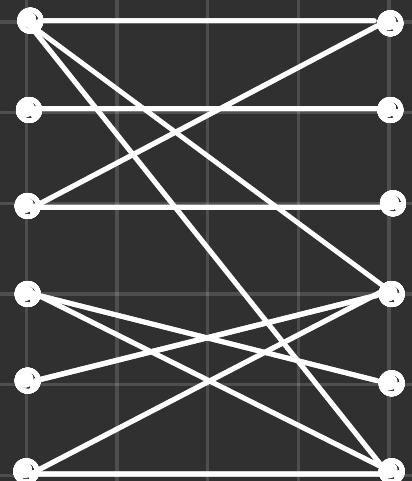
For each edge (x,y) in a bipartite graph,
 $(x \in A \text{ and } y \in B)$ or $(x \in B \text{ and } y \in A)$

Property : If graph G is bipartite, it cannot contain odd cycle

Proof : By contradiction



Problem : Given a connected graph G , find if it is a bipartite graph?

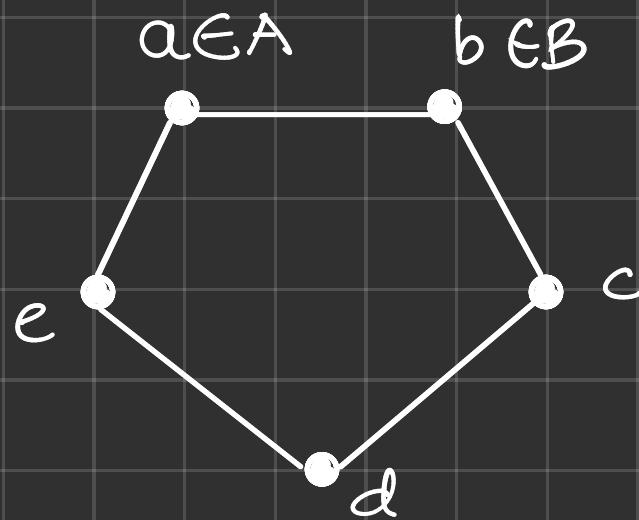


A B

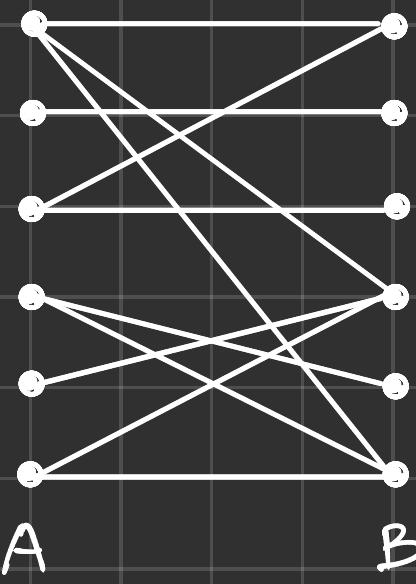
For each edge (x,y) in a bipartite graph,
 $(x \in A \text{ and } y \in B)$ or $(x \in B \text{ and } y \in A)$

Property : If graph G is bipartite, it cannot contain odd cycle

Proof : By contradiction



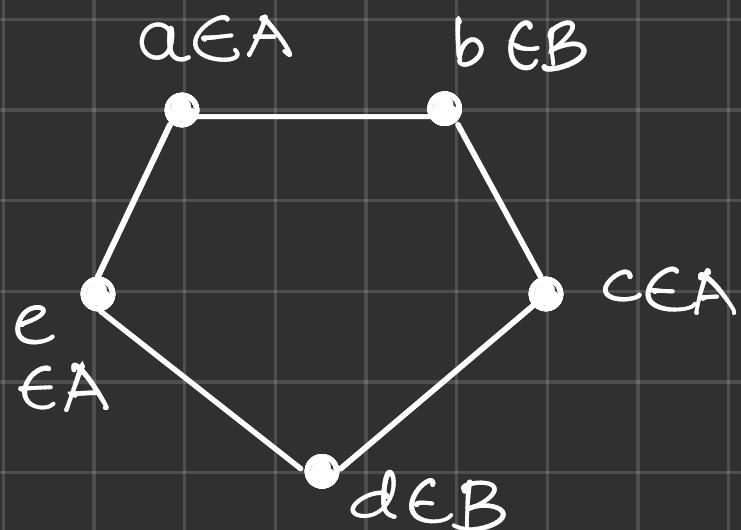
Problem : Given a connected graph G , find if it is a bipartite graph?



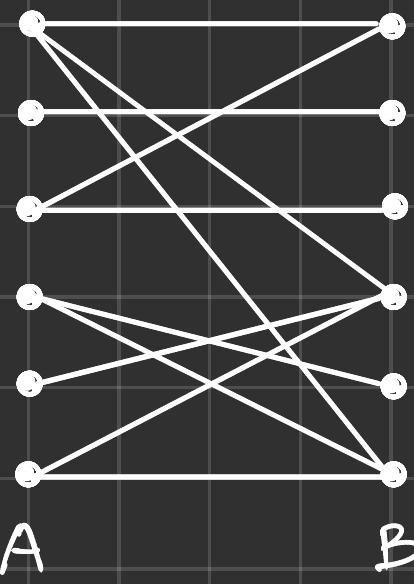
For each edge (x,y) in a bipartite graph,
 $(x \in A \text{ and } y \in B) \text{ or } (x \in B \text{ and } y \in A)$

Property : If graph G is bipartite, it cannot contain odd cycle

Proof : By contradiction



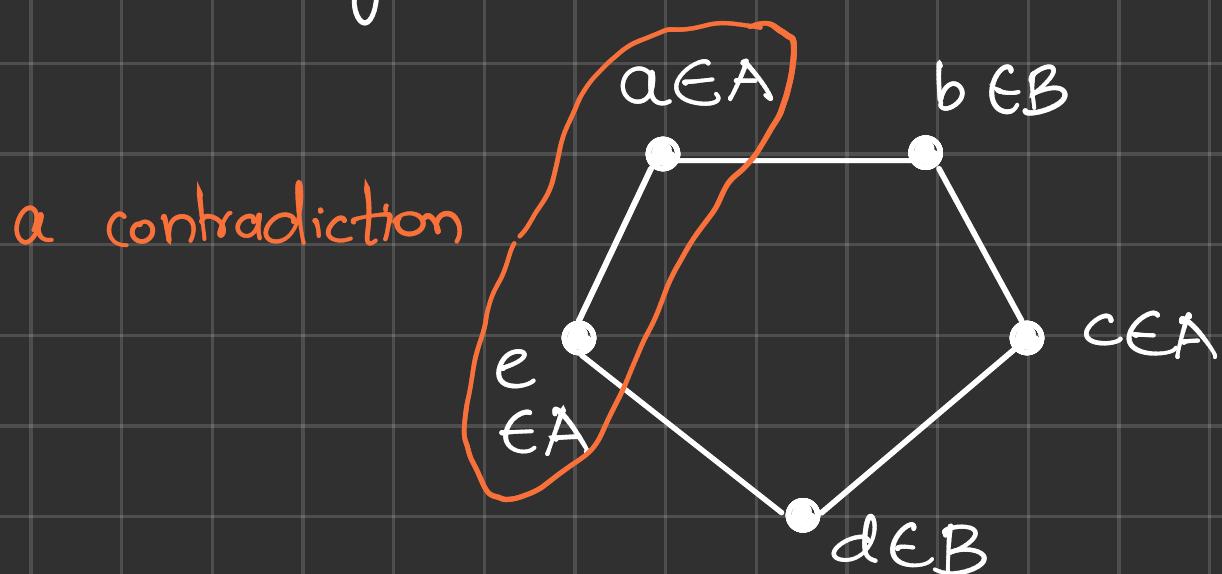
Problem : Given a connected graph G , find if it is a bipartite graph?



For each edge (x,y) in a bipartite graph,
 $(x \in A \text{ and } y \in B)$ or $(x \in B \text{ and } y \in A)$

Property : If graph G is bipartite, it cannot contain odd cycle

Proof : By contradiction



Property : If graph G is bipartite , it cannot contain odd cycle

Is this property is true ?

If a graph has no odd cycle , then it is bipartite.

Property : If graph G is bipartite , it cannot contain odd cycle

Is this property is true ?

If a graph has no odd cycle , then it is bipartite.

To show the above property , given G you should partition the vertex set into A & B s.t each edge has one endpoint in A and other endpoint in B .

Property : If graph G is bipartite , it cannot contain odd cycle

Is this property is true ?

If a graph has no odd cycle , then it is bipartite.

To show the above property , given G you should partition the vertex set into A & B s.t each edge has one endpoint in A and other endpoint in B .

We will use an algorithm to find this partition

An algorithm is used as the proof.

Property : If graph G is bipartite , it cannot contain odd cycle

Is this property is true ?

If a graph has no odd cycle , then it is bipartite.

To show the above property , given G you should partition the vertex set into A & B s.t each edge has one endpoint in A and other endpoint in B .

We will use an algorithm to find this partition

An algorithm is used as the proof.

BFS algorithm

Algo

Pick an arbitrary vertex v ;

BFS(v) :

If there exists an edge xy s.t x & y are
at same level in the BFS tree

{ We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Algo

Pick an arbitrary vertex v ;

BFS(v) :

If there exists an edge xy s.t x & y are at same level in the BFS tree

{ We have found an odd cycle

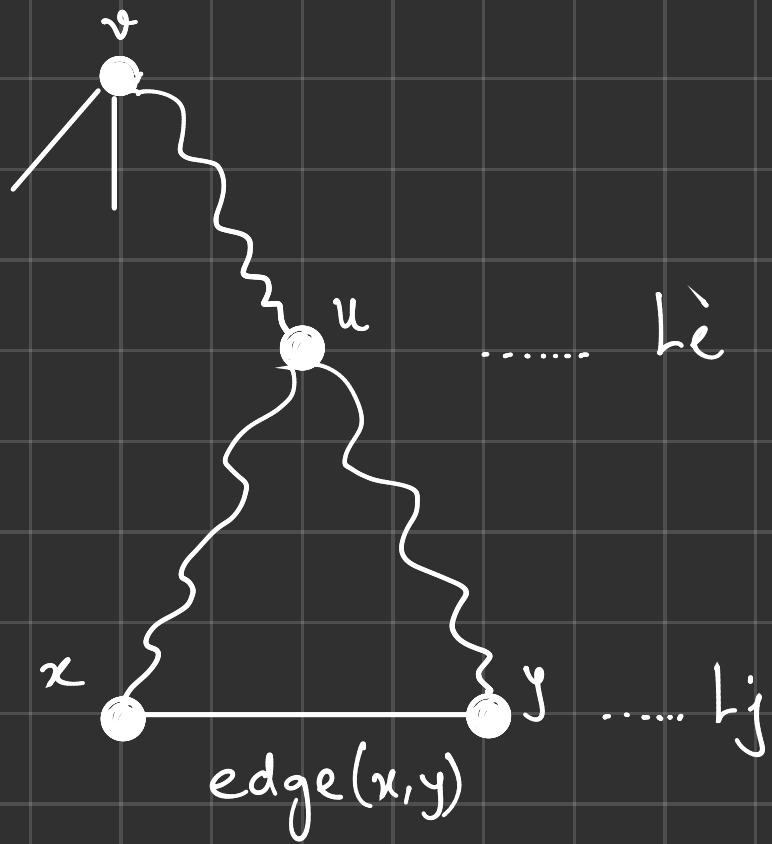
} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices



Algo

Pick an arbitrary vertex v ;

BFS(v) :

If there exists an edge xy s.t x & y are at same level in the BFS tree

{ We have found an odd cycle

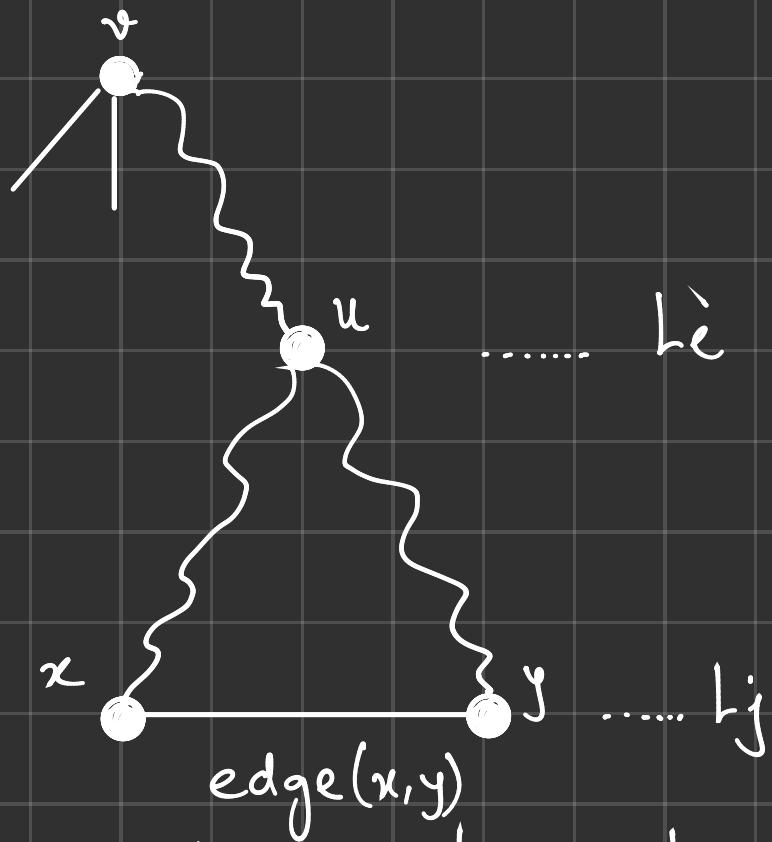
} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices



Length of the cycle = $|u \rightarrow y| + 1 + |x \rightarrow u|$

Algo

Pick an arbitrary vertex v ;

BFS(v) :

If there exists an edge xy s.t x & y are at same level in the BFS tree

{ We have found an odd cycle

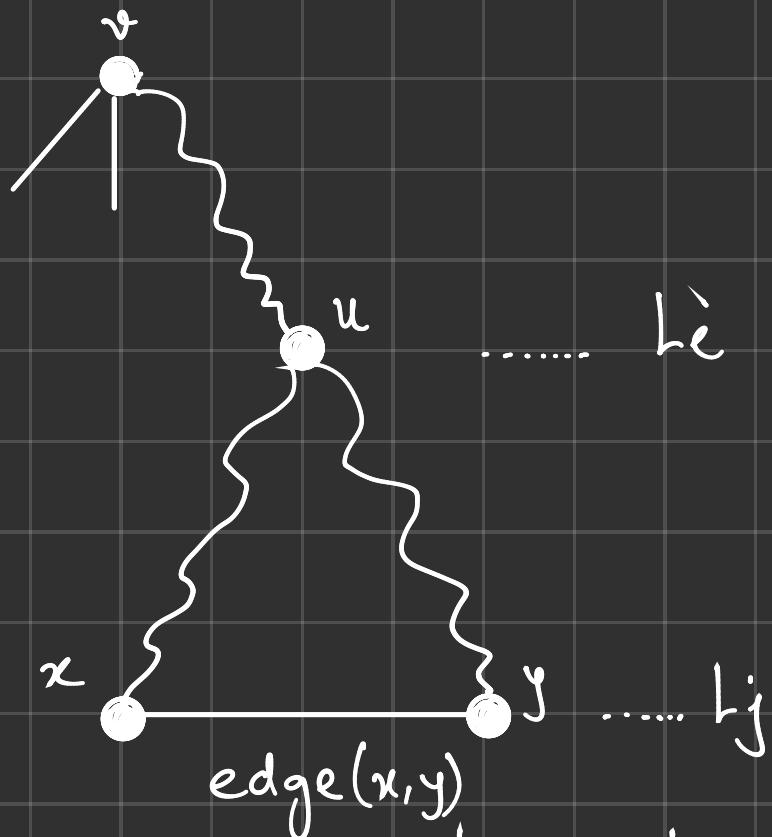
} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices



$$\begin{aligned}\text{Length of the cycle} &= |u \rightarrow y| + 1 + |x \rightarrow u| \\ &= (j-i) + 1 + (j-i) \\ &= 2(j-i) + 1\end{aligned}$$

Algo

Pick an arbitrary vertex v ;

BFS(v) :

If there exists an edge xy s.t x & y are at same level in the BFS tree

{ We have found an odd cycle

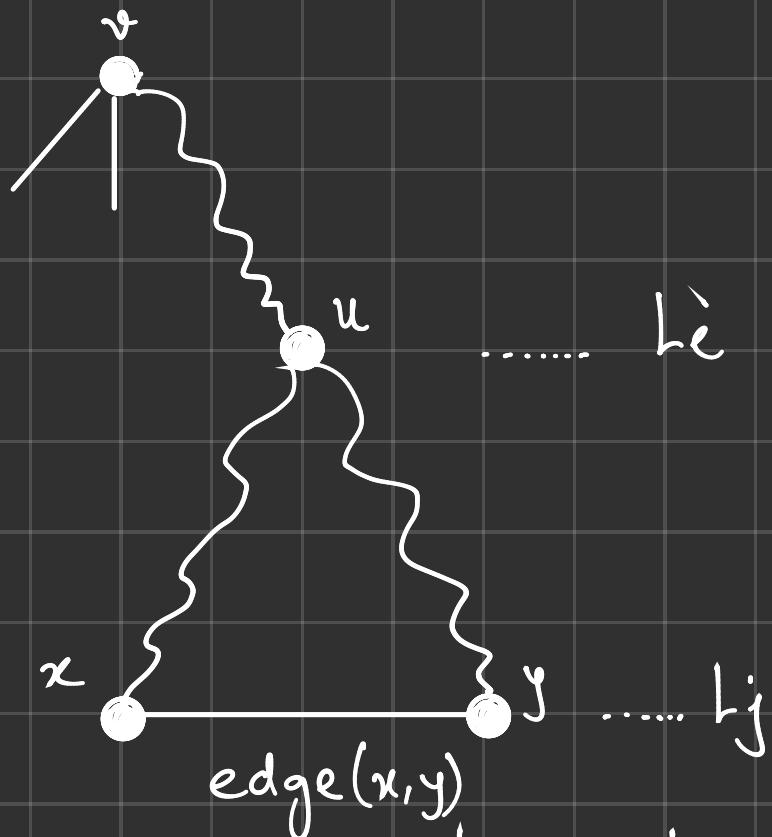
} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices



$$\begin{aligned}\text{Length of the cycle} &= |u \rightarrow y| + 1 + |x \rightarrow u| \\ &= (j-i) + 1 + (j-i) \\ &= 2(j-i) + 1 \\ &\text{odd}\end{aligned}$$

Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t x & y are
at same level in the BFS tree

{ We have found an odd cycle

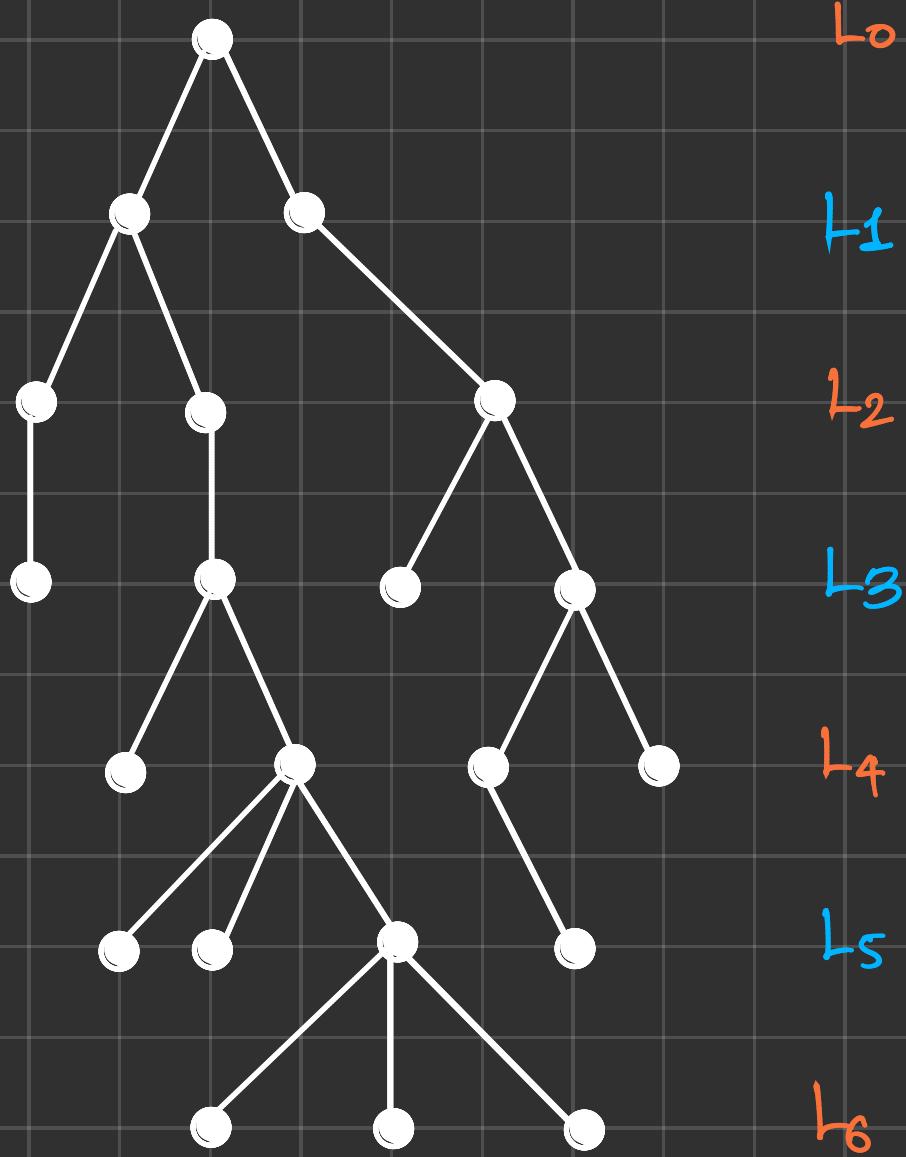
} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices



Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t $x \neq y$ are
{ at same level in the BFS tree

We have found an odd cycle

} $\Rightarrow G$ is not bipartite

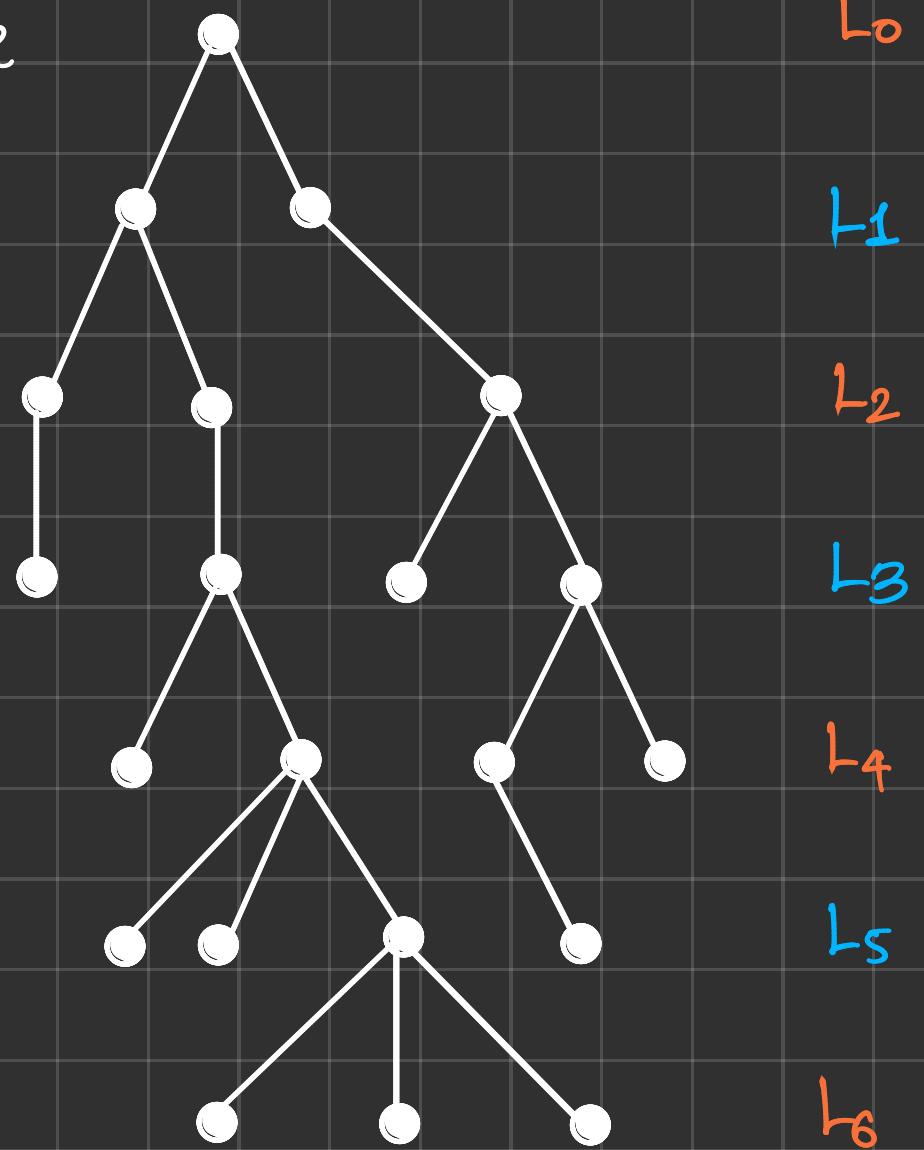
else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge
 (x,y) $x \in A$ & $y \in B$ or
 $x \in B$ & $y \in A$



Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t $x \neq y$ are
{ at same level in the BFS tree

We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

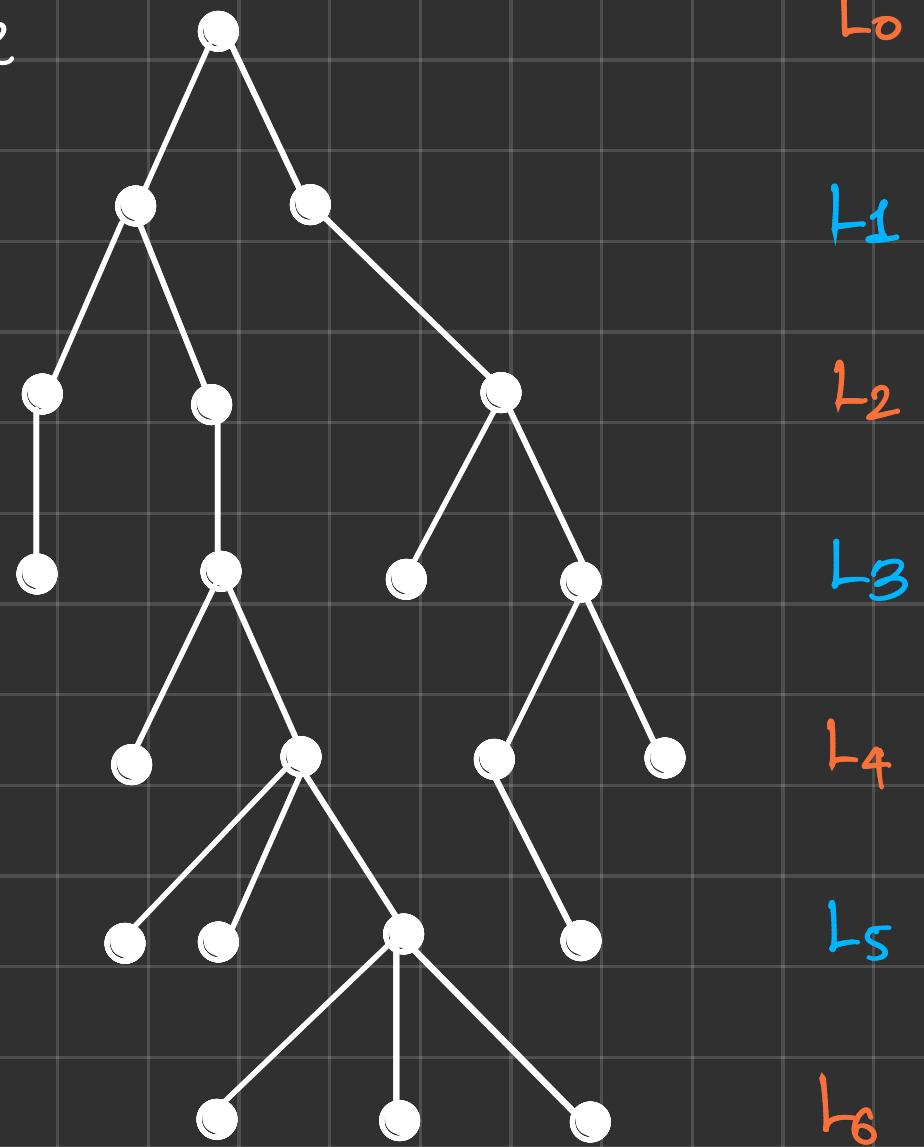
$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge

(x,y) $x \in A$ & $y \in B$ or

$x \in B$ & $y \in A$

(1) If (x,y) is a tree edge



Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t $x \& y$ are
at same level in the BFS tree

{ We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge

(x,y) $x \in A \& y \in B$ or

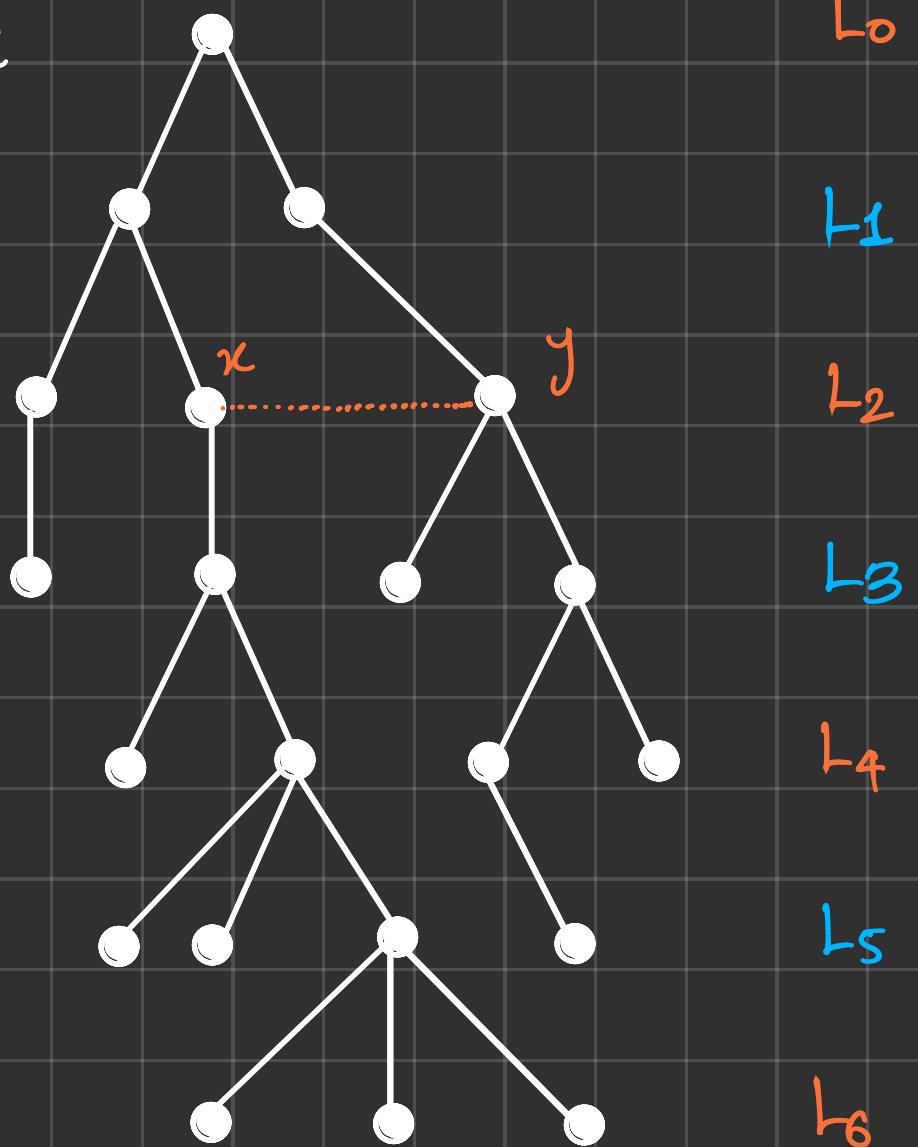
$x \in B \& y \in A$

(1) If (x,y) is a tree edge

trivially true

(2) If (x,y) is a non-tree edge

(a) edge at same level



Algo

Pick an arbitrary vertex v ;

BFS(v) :

If there exists an edge xy s.t x & y are at same level in the BFS tree

{ We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge

(x,y) $x \in A$ & $y \in B$ or

$x \in B$ & $y \in A$

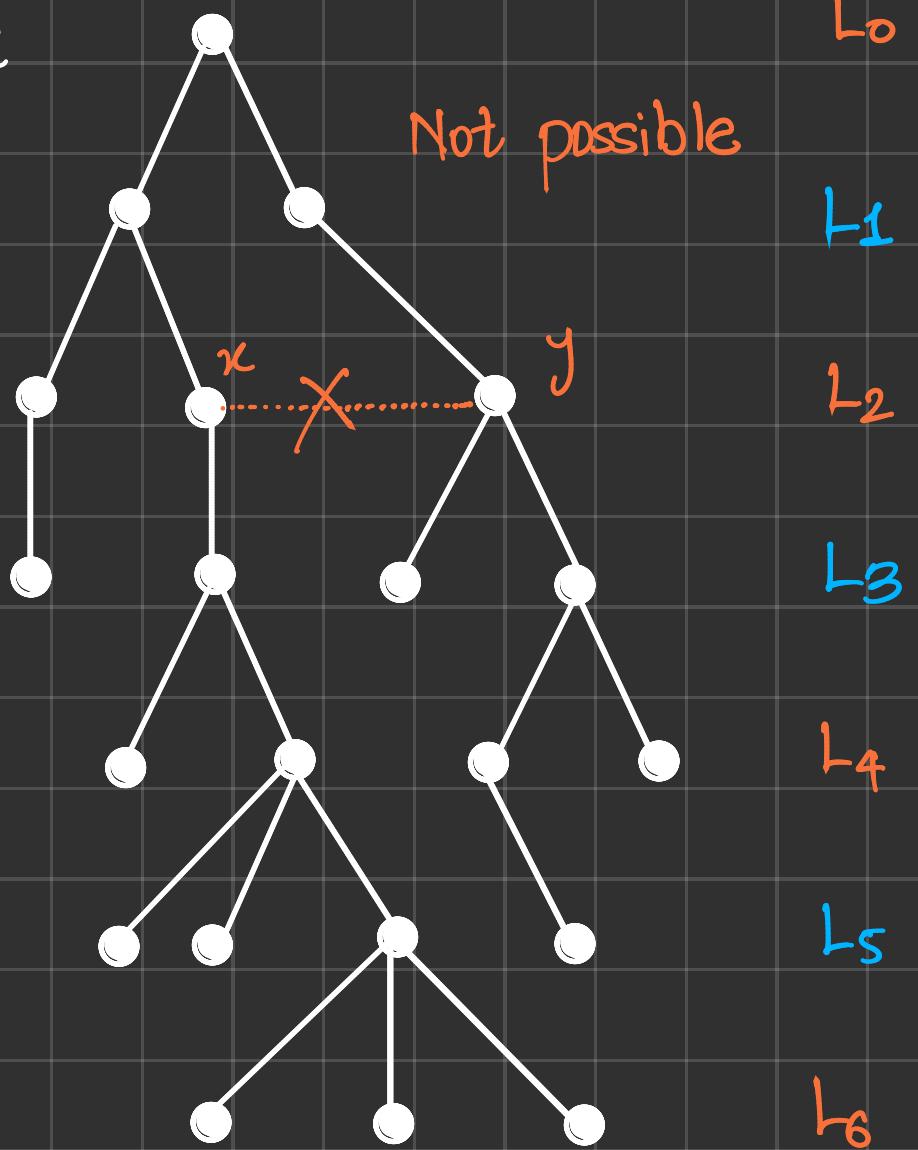
Not possible

(1) If (x,y) is a tree edge

trivially true

(2) If (x,y) is a non-tree edge

(a) edge at same level



Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t $x \& y$ are
at same level in the BFS tree

{ We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge

(x,y) $x \in A \& y \in B$ or

$x \in B \& y \in A$

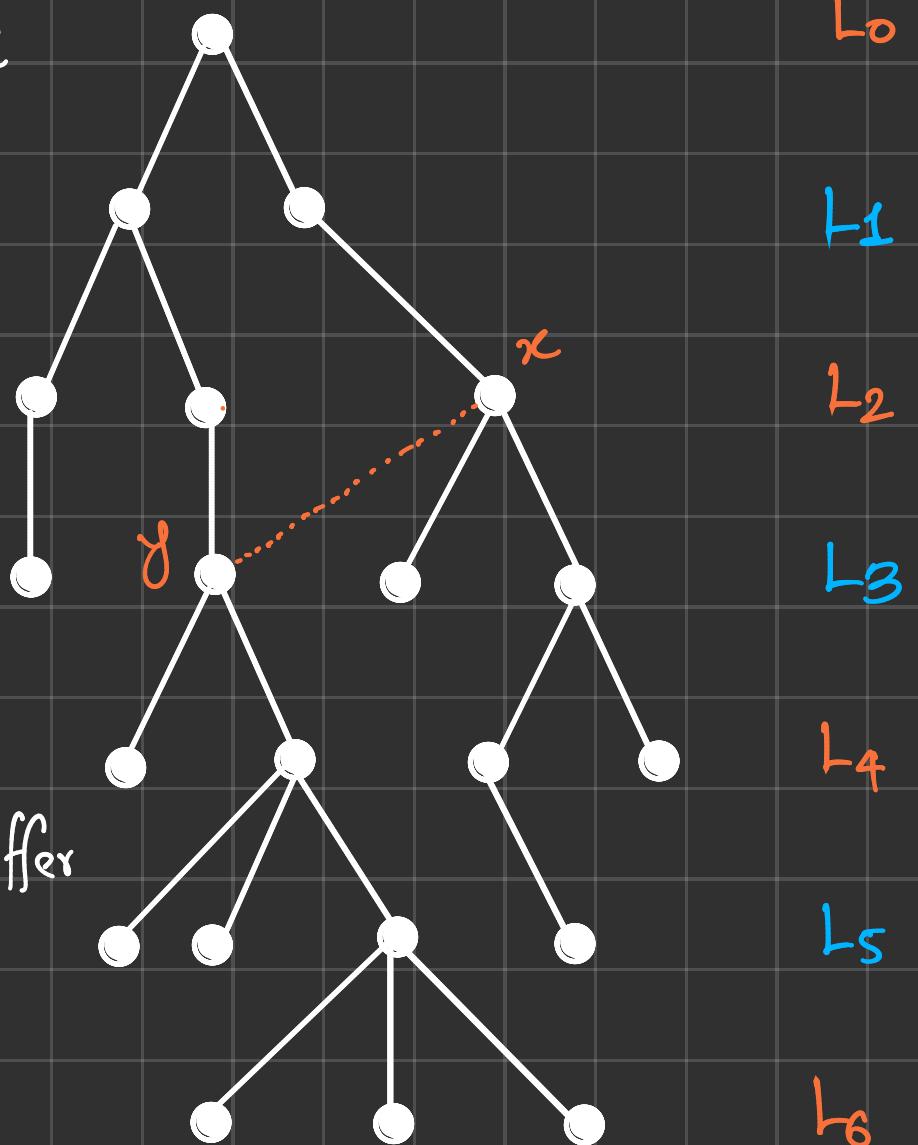
(1) If (x,y) is a tree edge

trivially true

(2) If (x,y) is a non-tree edge

(a) ~~edge at same level~~

(b) edge whose endpoint differ
by 1 level



Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t $x \neq y$ are
at same level in the BFS tree

{ We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge

(x,y) $x \in A$ & $y \in B$ or

$x \in B$ & $y \in A$

Ok for us

L_0

L_1

(1) If (x,y) is a tree edge

trivially true

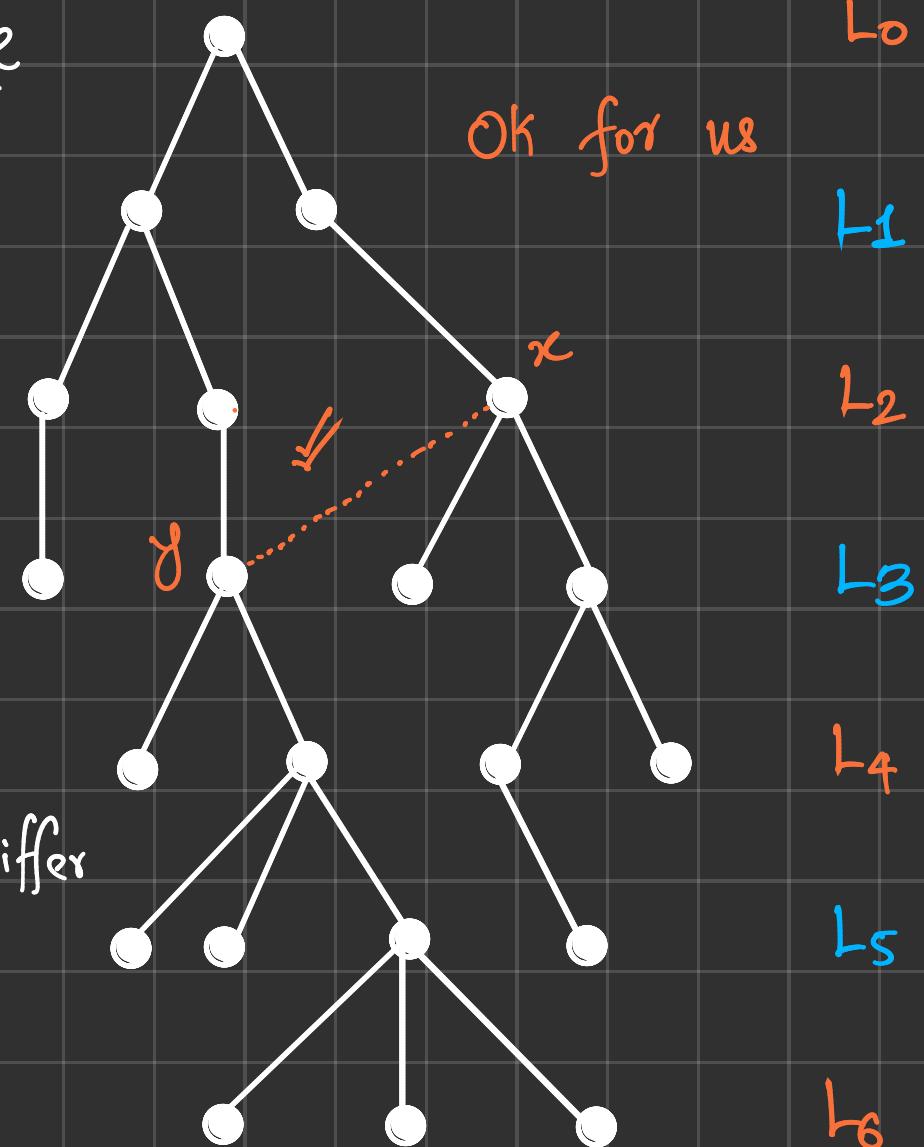
(2) If (x,y) is a non-tree edge

L_2

L_3

(a) edge at same level

(b) edge whose endpoint differ
by 1 level



Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t $x \& y$ are
at same level in the BFS tree

{ We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge

(x,y) $x \in A \& y \in B$ or

$x \in B \& y \in A$

(1) If (x,y) is a tree edge

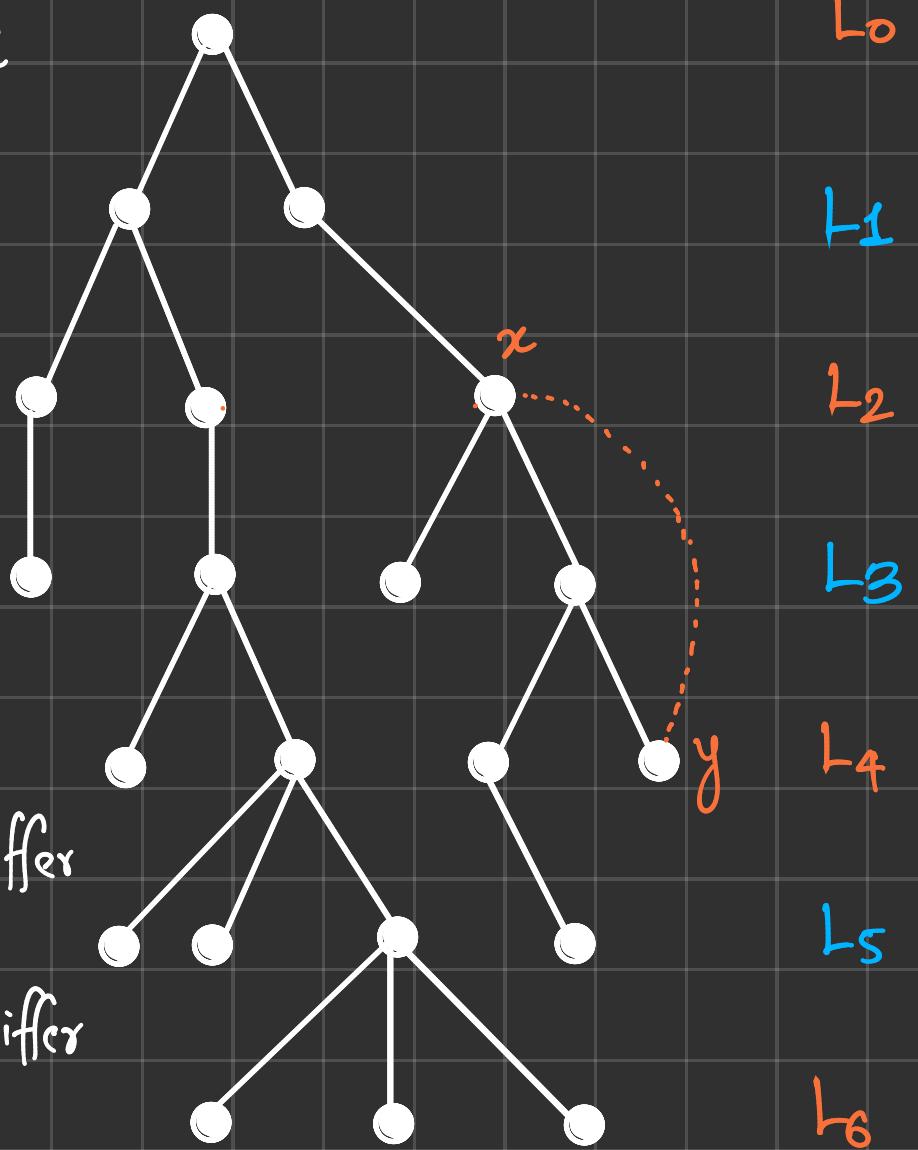
trivially true

(2) If (x,y) is a non-tree edge

(a) ~~edge at same level~~

(b) edge whose endpoint differ
by 1 level

(c) edge whose endpoint differ
by >1 level



Algo

Pick an arbitrary vertex v ;

BFS(v) ;

If there exists an edge xy s.t $x \& y$ are at same level in the BFS tree

{ We have found an odd cycle

} $\Rightarrow G$ is not bipartite

else

{ We have found a bipartite graph

$A = \{L_0, L_2, L_4, \dots\}$ even layer vertices

$B = \{L_1, L_3, L_5, \dots\}$ odd layer vertices

Show that for each edge

(x,y) $x \in A \& y \in B$ or

$x \in B \& y \in A$

Not possible L_0

using property
of BFS tree L_1

(1) If (x,y) is a tree edge

trivially true

(2) If (x,y) is a non-tree edge

(a) ~~edge at same level~~

(b) ~~edge whose endpoint differ
by 1 level~~

(c) ~~edge whose endpoint differ
by > 1 level~~

