

Graph Theory

Graph Traversal Algorithms

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Breadth-First Search

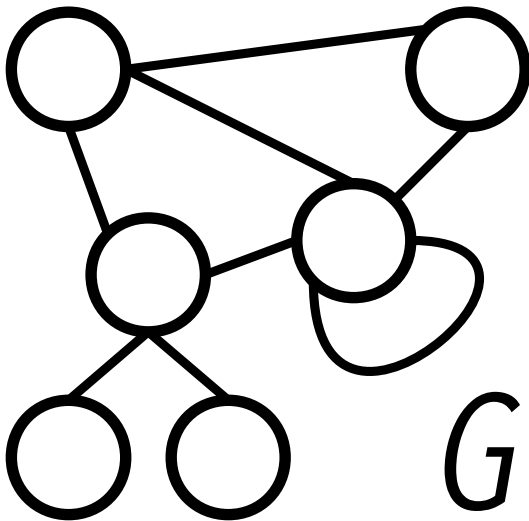
Breadth-First Search

- Algorithm to **traverse/search** in **graphs**.
- **Starts** at some **arbitrary node** s .
- **Visit all neighboring** nodes at the **present depth**.
- **Move** to nodes from the **next depth level**.

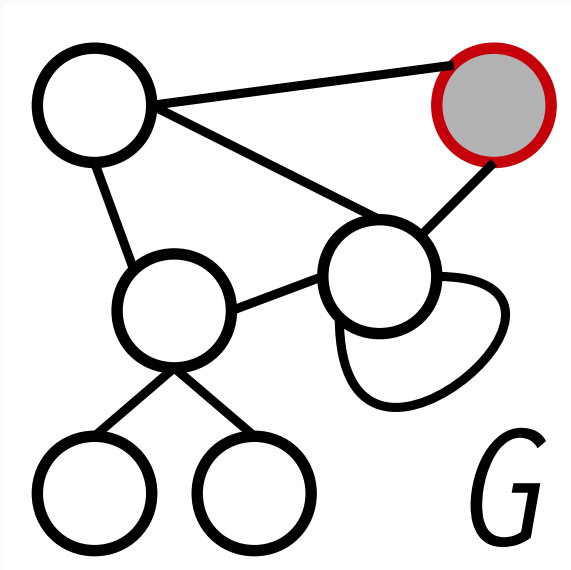
Pseudocode

```
function BFS( $G = \langle V, E \rangle, s \in V$ )
  for all  $v \in V$  do
     $state[v] \leftarrow undiscovered, \text{ parent}[v] \leftarrow \emptyset$ 
  end for
   $state[s] \leftarrow discovered, \text{ parent}[s] \leftarrow root$ 
   $Q \leftarrow [s]$  // Queue containing  $s$ 
  while  $Size(Q) > 0$  do
     $u \leftarrow Q[0]$ 
    for all  $v \in Neighbors(u)$  do
      if  $state[v] = undiscovered$  then
         $state[v] \leftarrow discovered, \text{ parent}[v] \leftarrow u$ 
         $Q \leftarrow Q + [v]$  // Append new node
      end if
    end for
     $Q \leftarrow Q[1 : Size(Q)]$  // Remove 1st node (FIFO)
  end while
  Return  $parent$ 
end function
```

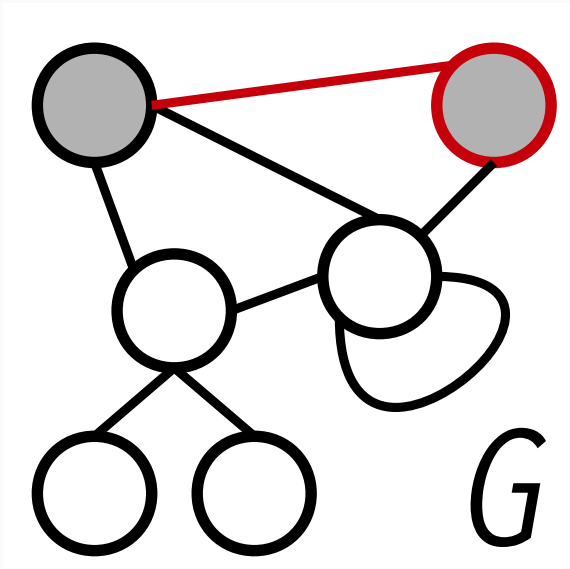
Example



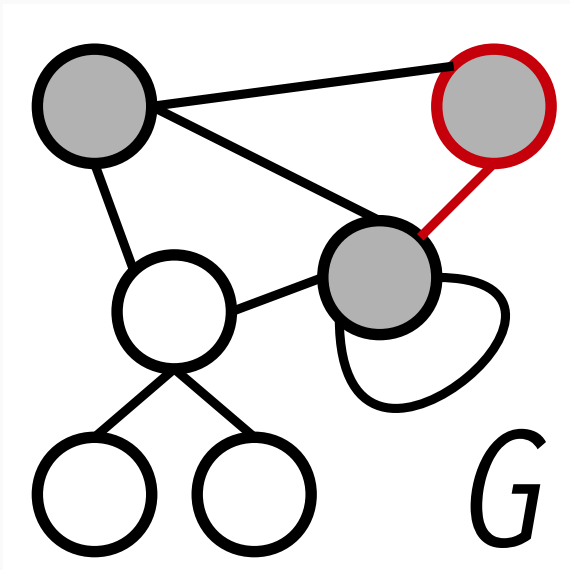
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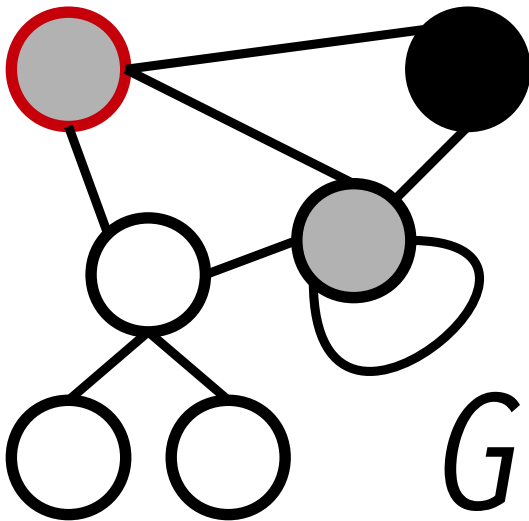
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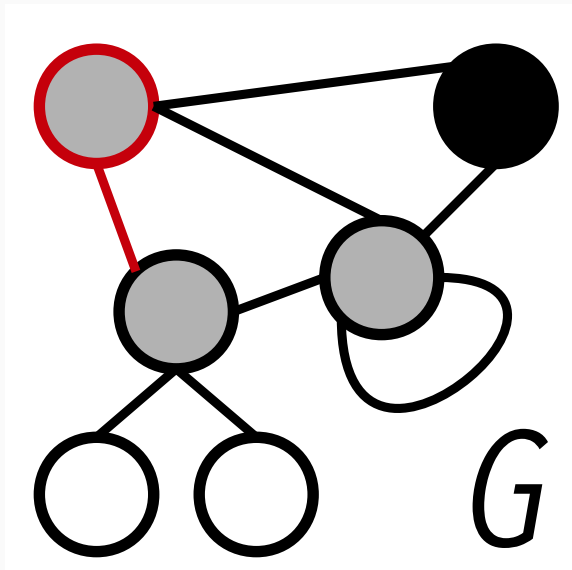
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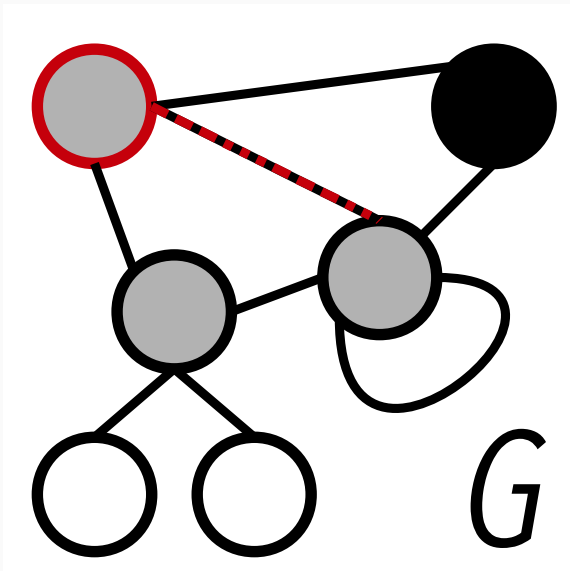
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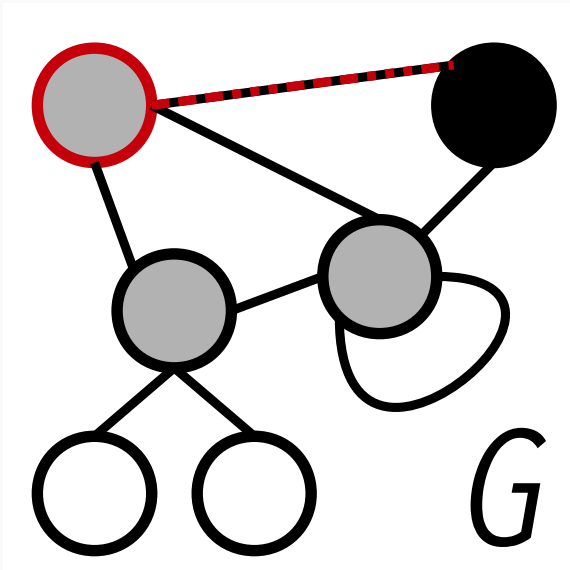
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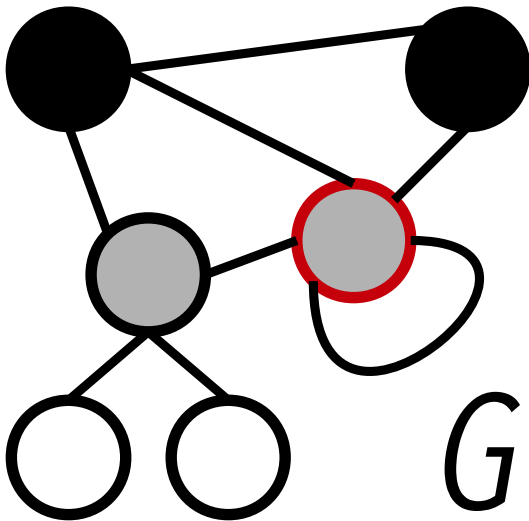
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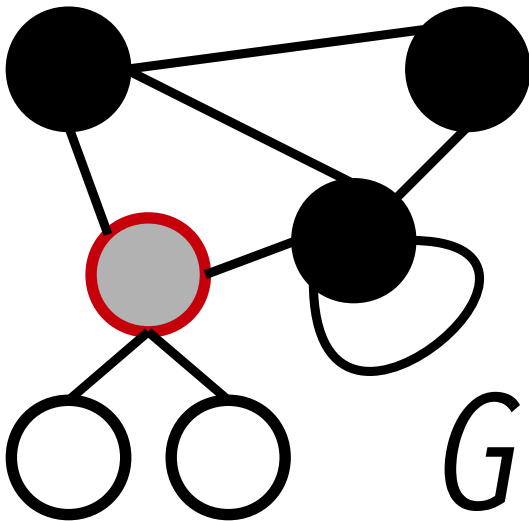
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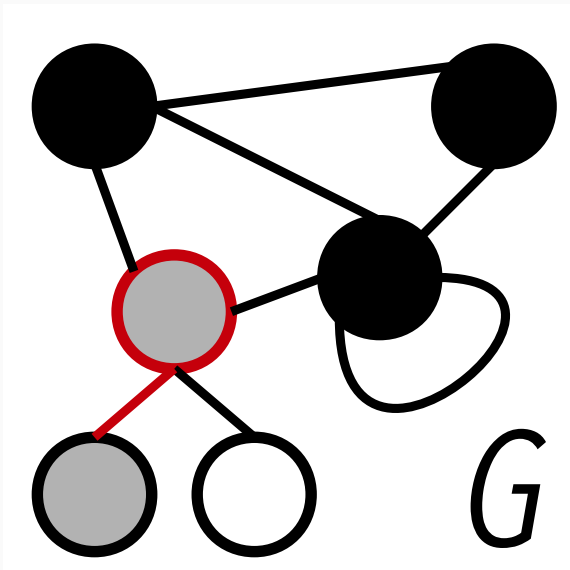
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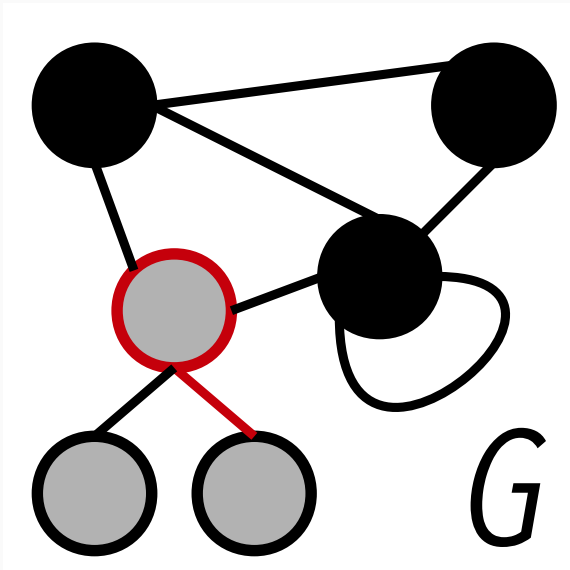
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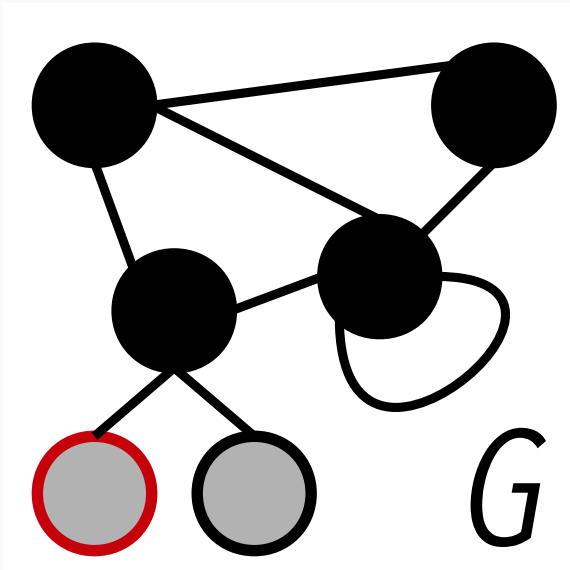
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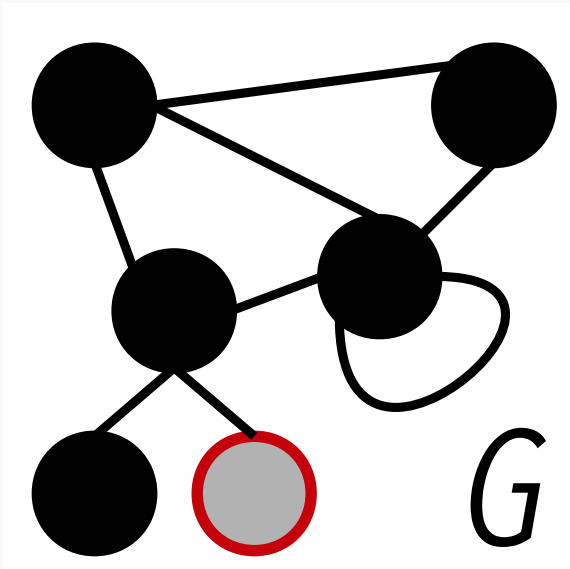
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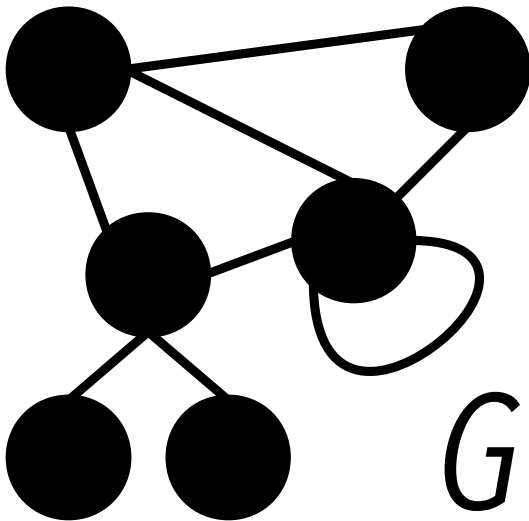
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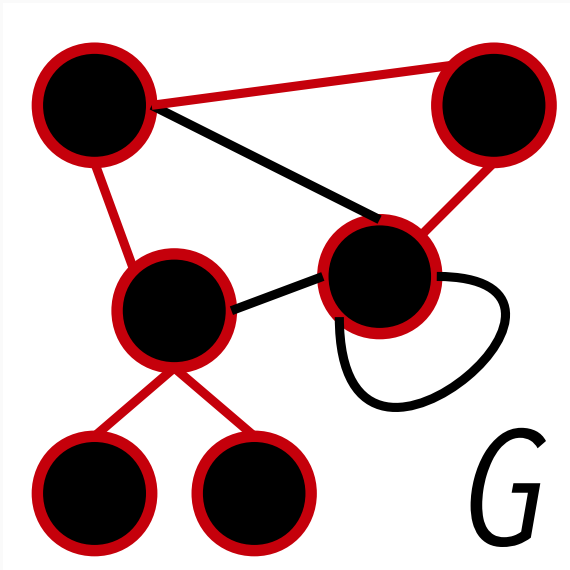
Example



Example



Example



Analysis

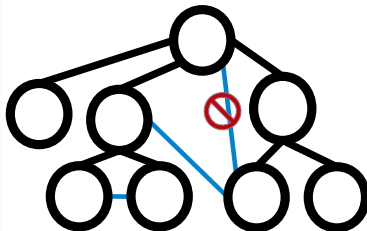
Remark: Memorize the nodes' levels using a counter.

Time Complexity: $\mathcal{O}(|E| + |V|)$ (Why?)

Property 1: BFS \rightarrow spanning tree $T = \langle V, E' \rangle$ (pseudocode?).

Property 2: BFS \rightarrow shortest path from s to $v \in V$ (Proof?).

Property 3: e : edge s.t. $e \in E$ and $e \notin E'$; e connects 2 nodes that are at most 1 level apart (Proof?).



Exercise

Modify the BFS Algorithm to check if G is a bipartite.

Depth-First Search

Depth-First Search

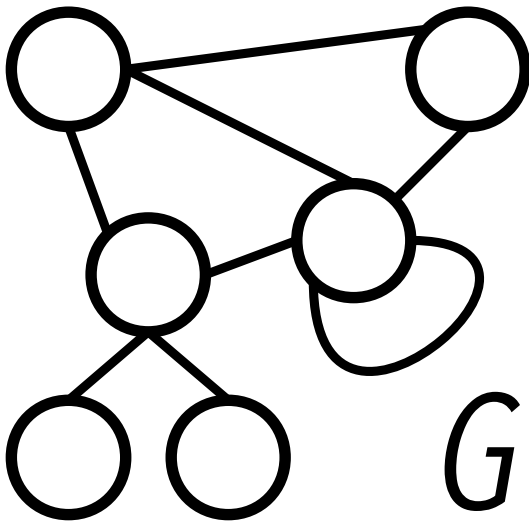
- Algorithm to **traverse/search** in **graphs**.
- **Starts** at some **arbitrary node** s .
- Explore **each branch** as **deep** as possible before **backtracking**.

Pseudocode

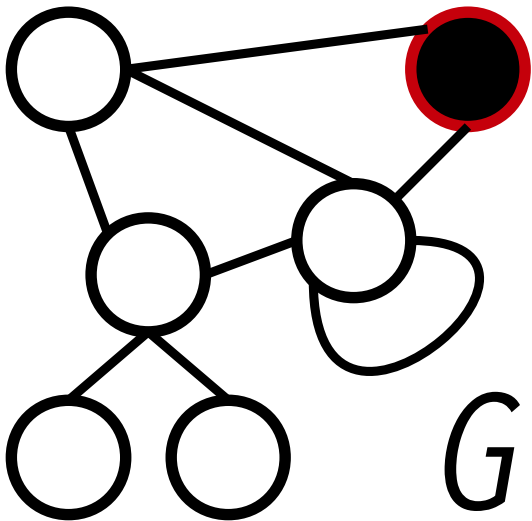
```
function DFS( $G = \langle V, E \rangle, s \in V$ )
  for all  $v \in V$  do
     $state[v] \leftarrow undiscovered, \quad parent[v] \leftarrow \emptyset$ 
  end for
   $state[s] \leftarrow root$ 
  DFS_visit( $G, s, parent, state$ )
  Return  $parent$ 
end function

function DFS_VISIT( $G = \langle V, E \rangle, u \in V, parent, state$ )
   $state[u] \leftarrow discovered$ 
  for all  $v \in Neighbors(u)$  do
    if  $state[v] = undiscovered$  then
       $parent[v] \leftarrow u$ 
      DFS_visit( $G, v, parent, state$ )
    end if
  end for
end function
```

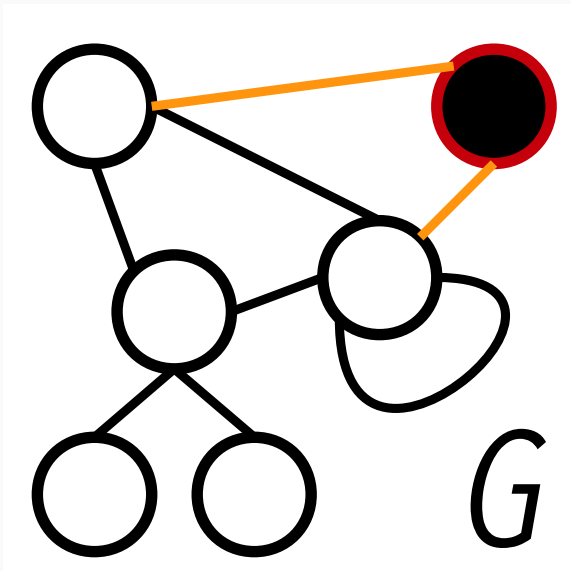
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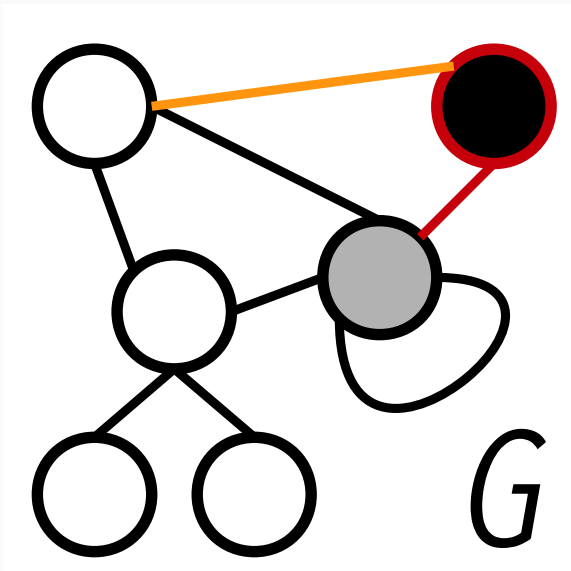
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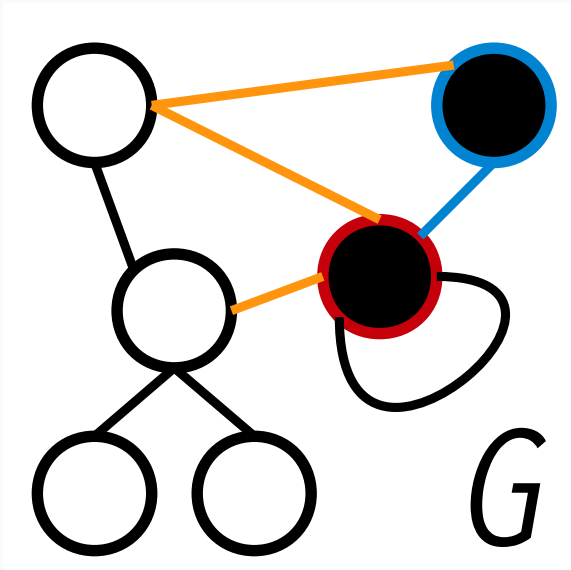
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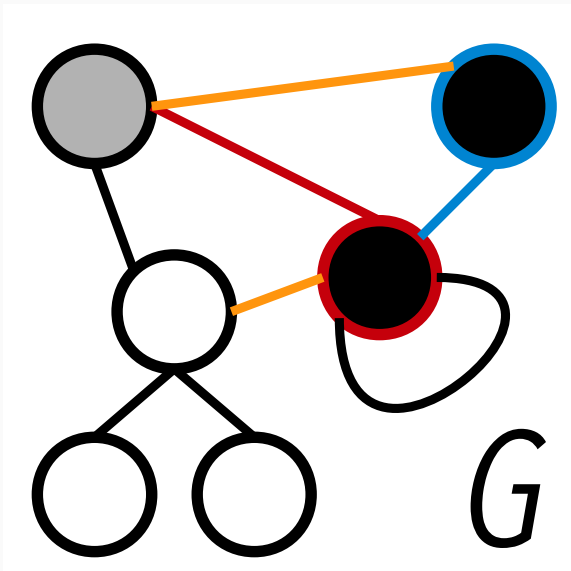
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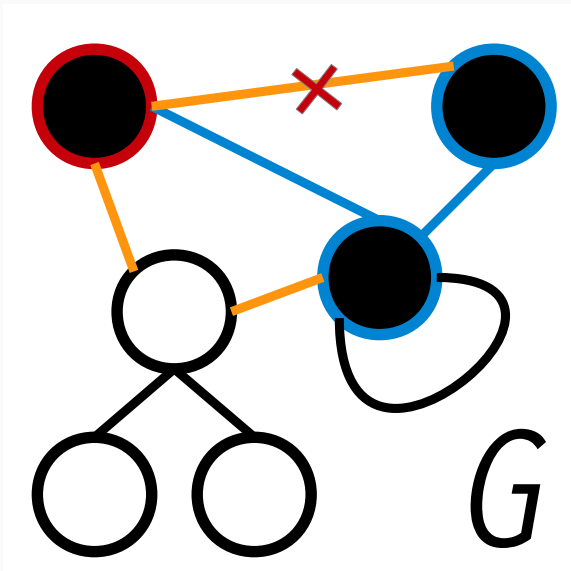
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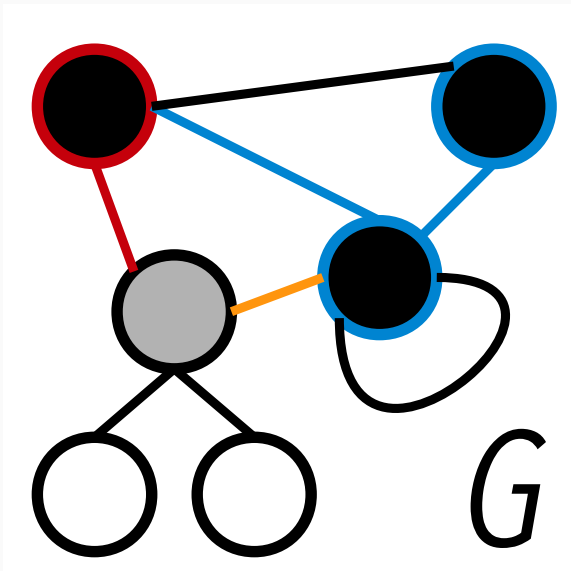
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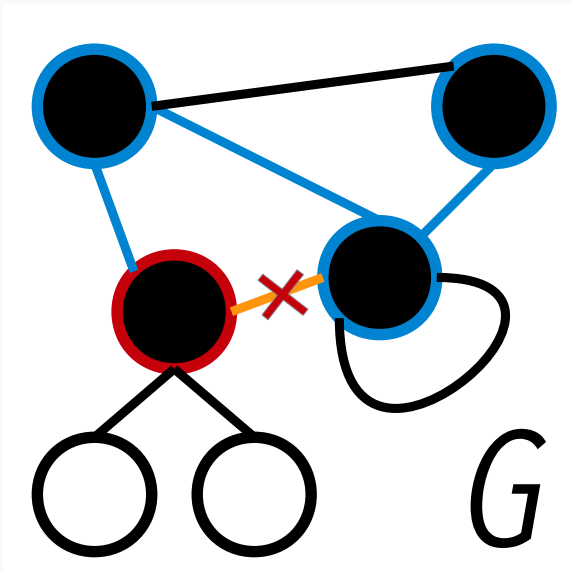
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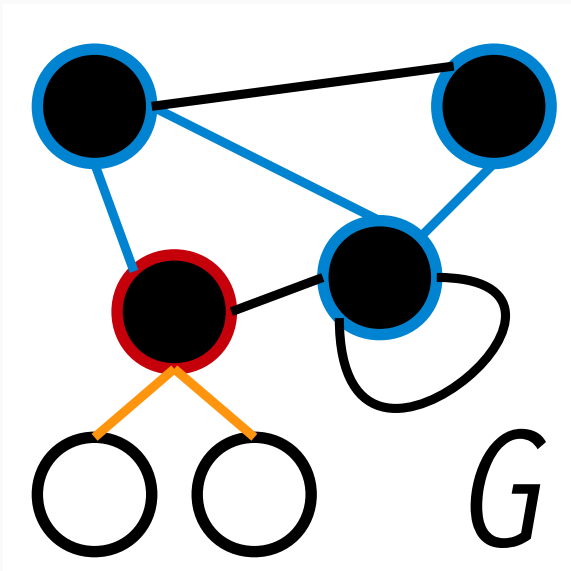
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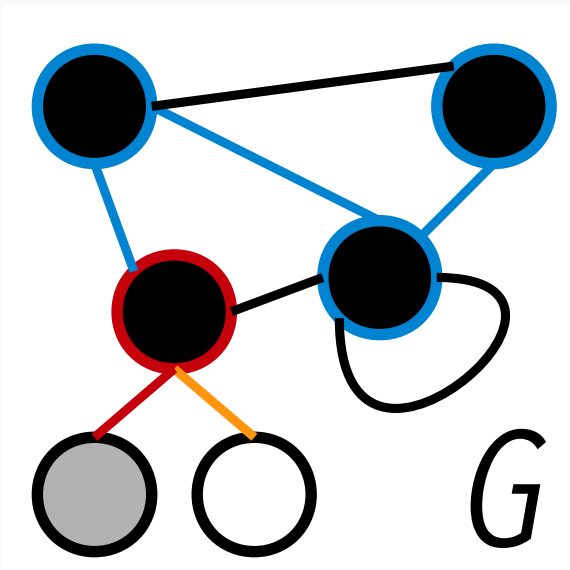
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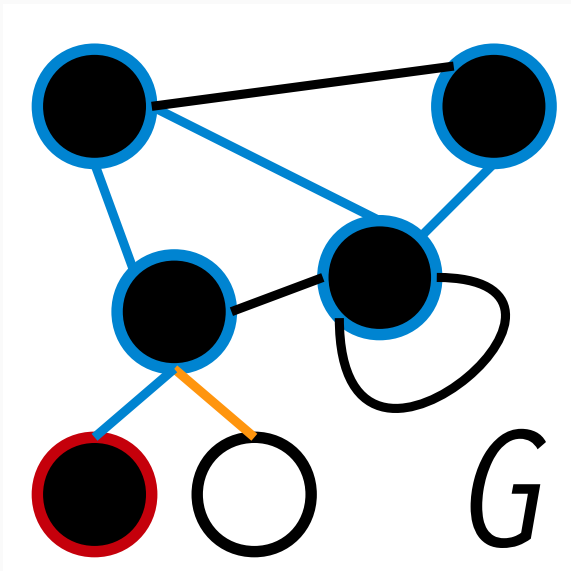
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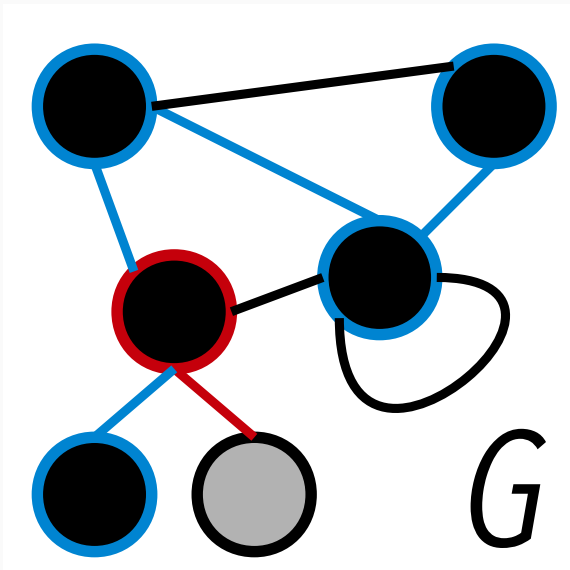
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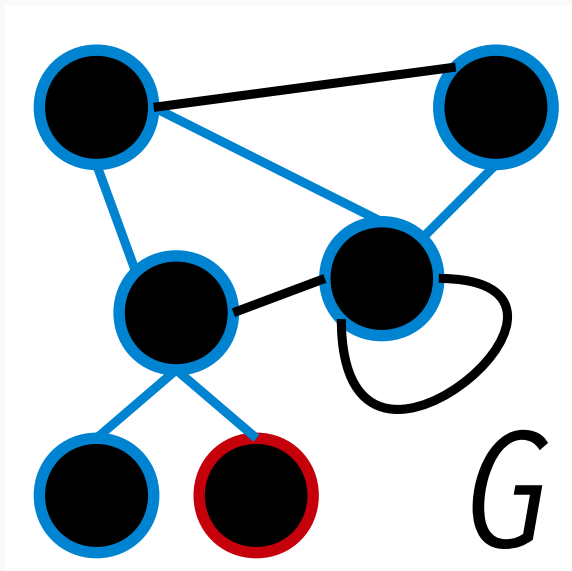
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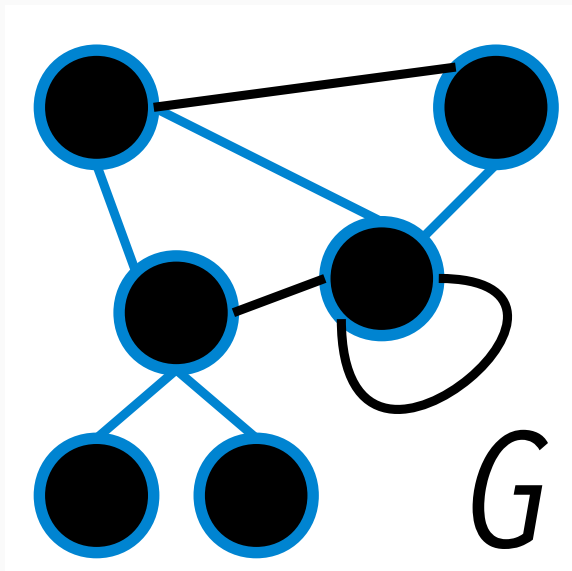
Example



Example



Example



Analysis

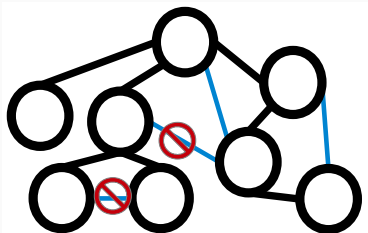
Property 1: DFS \rightarrow spanning tree $T = \langle V, E' \rangle$ (pseudocode).

Time Complexity: $\mathcal{O}(|E| + |V|)$ (Why?)

Property 1: DFS \rightarrow Nodes ordering

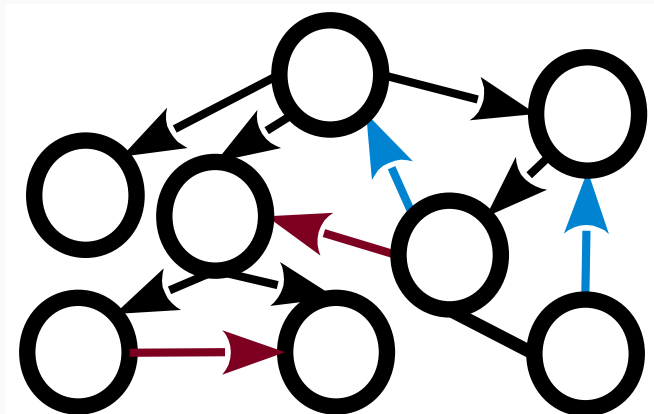
Property 2: DFS \rightarrow biconnectivity, bridges, cut nodes.

Property 3: (Undirected graphs) edge e s.t. $e \in E$ and $e \notin E'$; e links a node with an ancestor in T ; $e \neq$ cross-edge (Proof?).



Backward-edges, Forward-edges, Cross-edges

- Forward-edges : black
- Backward-edges : blue
- Cross-edges : red

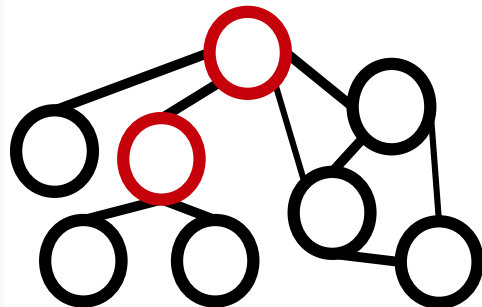


Biconnectivity using DFS

Biconnectivity

Definition 1: Graph $G = \langle V, E \rangle$ is **biconnected** if it has **no cut/articulation node**, i.e., 2 nodes or more should be removed to disconnect G .

Definition 2: A **cut/articulation node** is a node $v \in V$ s.t. removing v disconnects G .



Easy solution: Remove each node and test with BFS or DFS if G remains connected (Complexity?).

Analysis:

- **Root:** Cut node if its nb. of children ≥ 2
- **Leaves:** Never
- **Internal node u :** cut node if \exists subtree rooted at a child of u **without** back-edges to an ancestor of u .

Articulation node detection

Methodology:

- Keep track of **back-edges going higher**; using **DFS Discovery times** ($discT$).
- $l(v)$: **Highest node reached** from **subtree rooted** at v

$$l(v) = \min\{discT[w] : u \in \text{Descendent}(v) \text{ and } \langle u, w \rangle: \text{back-edge}\}$$

u is an **articulation point** if $\exists v \in \text{Children}(u)$ s.t.:

$$l(v) \geq discT[u]$$

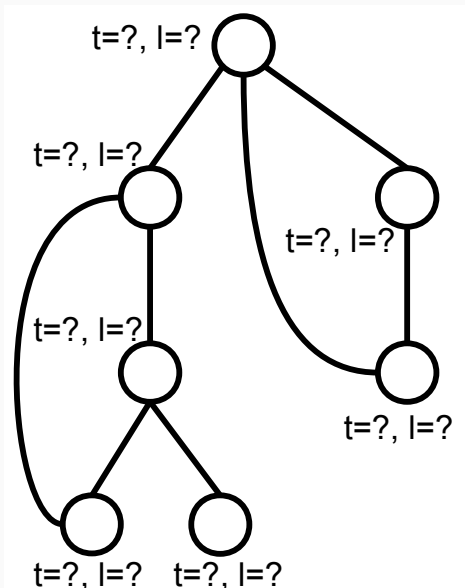
Pseudocode | Compute $l(u)$, $\forall u \in V$

```
function DFS_l(G, u, parent, state, l, t, discT)
  state[u] ← discovered
  discT[u] ← time;  l[u] ← time
  t ← t + 1
  for all v ∈ Neighbors(u, G) do
    if state[v] = undiscovered then
      parent[v] ← u
      DFS_l(G, v, parent, state, t)
      // After DFS_l l(v) is stored in l[v]
      l[u] ← min(l[u], l[v])
    else
      if v ≠ parent[u] then
        // Then ⟨u, v⟩ is a back-edge
        l[u] ← min(l[u], discT[v])
      end if
    end if
  end for
end function
```

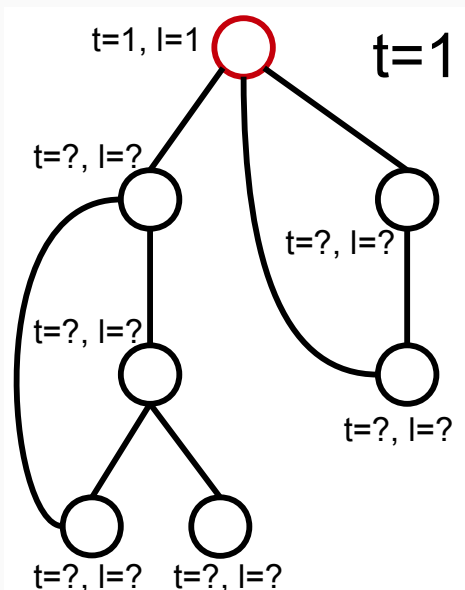
Pseudocode | Retrieve Articulation Points

```
function ARTICULATION_POINTS( $G, parents, T, l, discT$ )
  for all  $v \in V$  do
    if  $parent[v] = root$  then //  $v$  is the root
      if  $|Neighbors(v, T)| > 1$  then
         $articulation[v] \leftarrow true$ 
      end if
    else
      for all  $u \in V$  s.t.  $parents[u] = v$  do
        if  $l[u] \geq discT[v]$  then
           $articulation[v] \leftarrow true$ 
        end if
      end for
    end if
  end for
end function
```

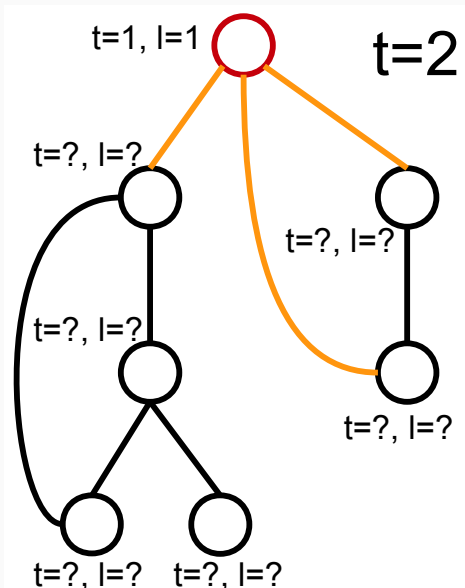
Example



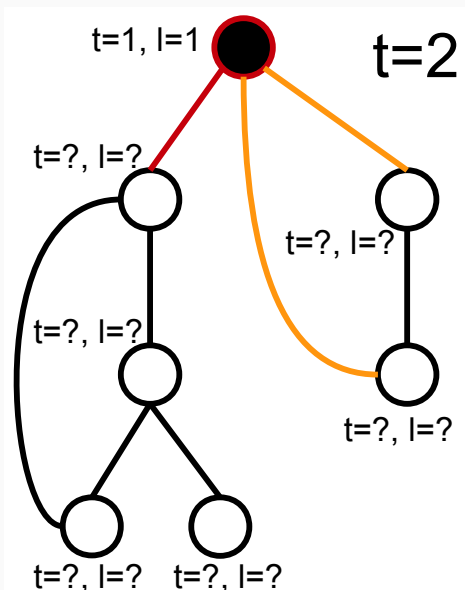
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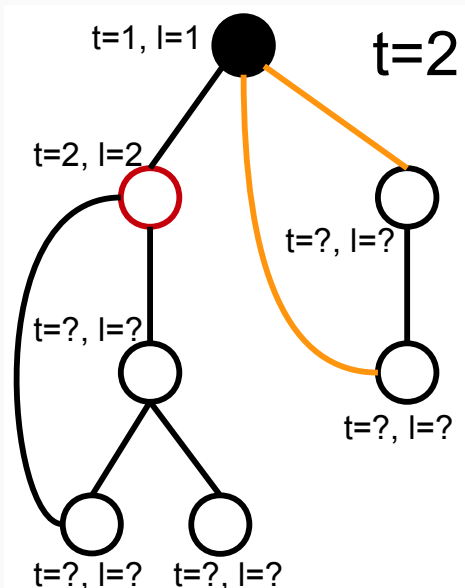
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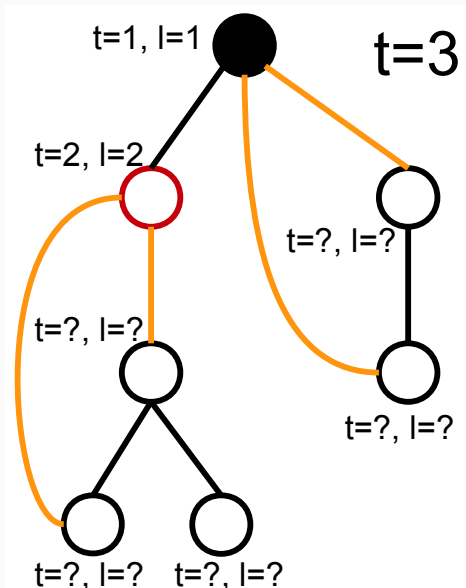
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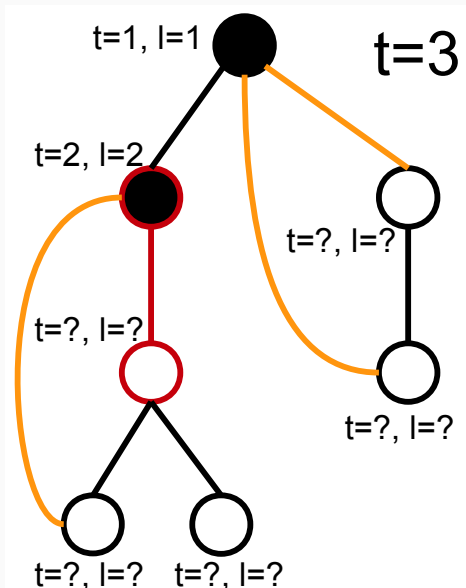
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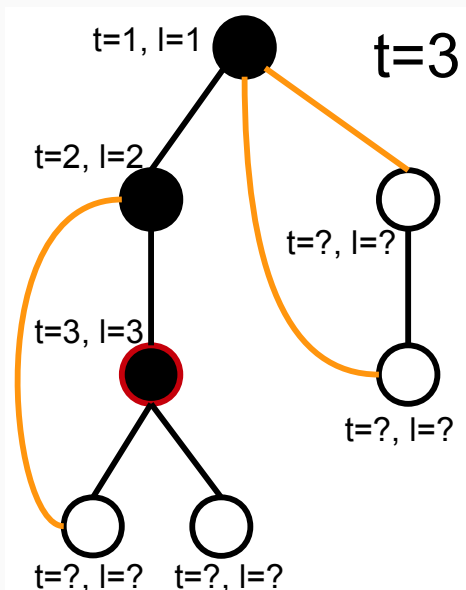
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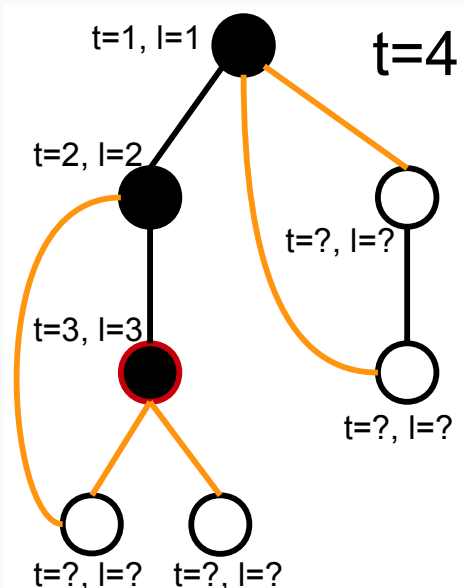
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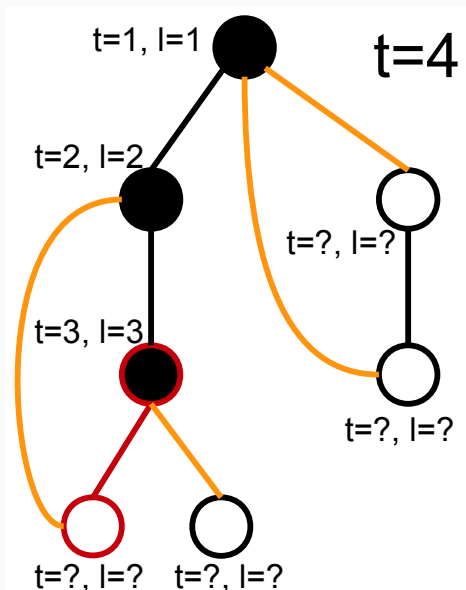
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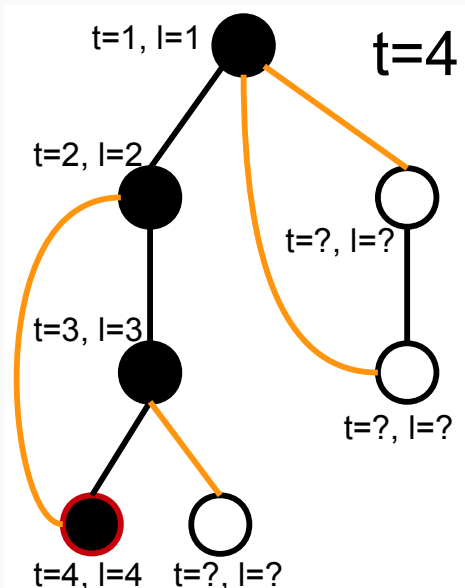
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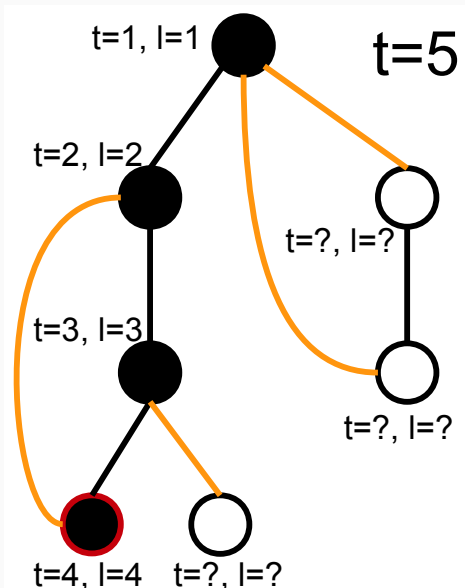
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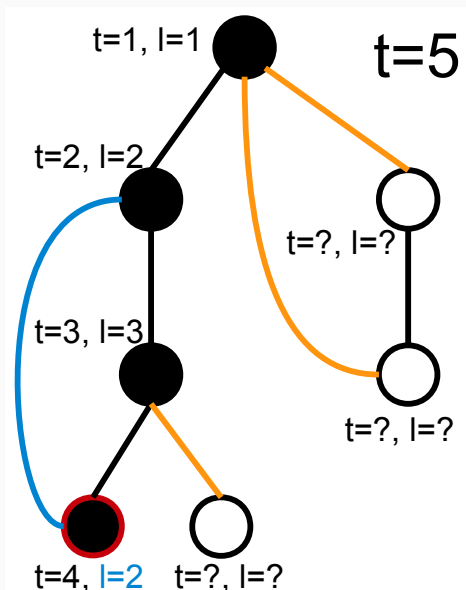
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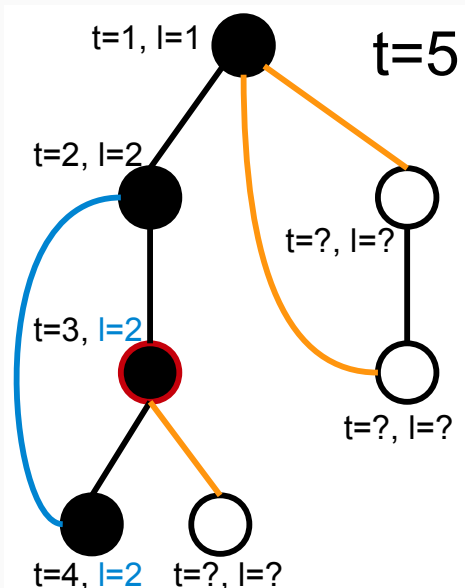
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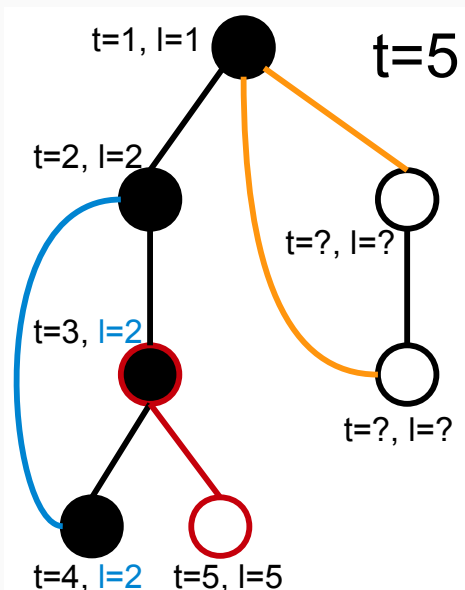
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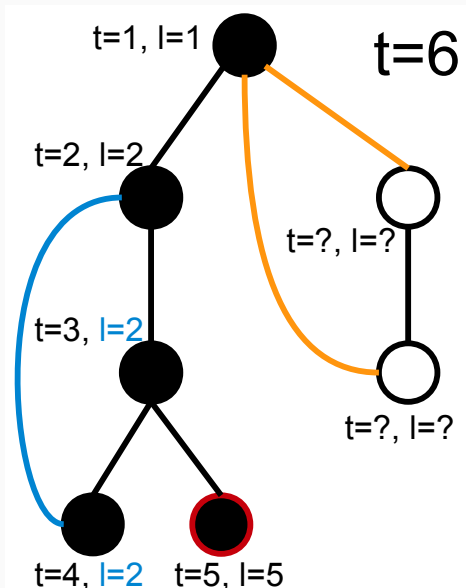
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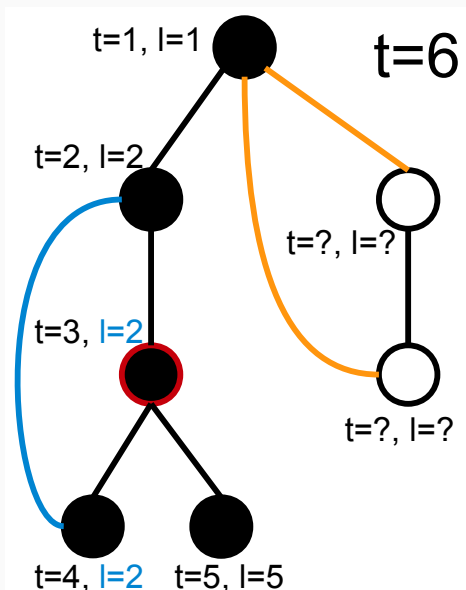
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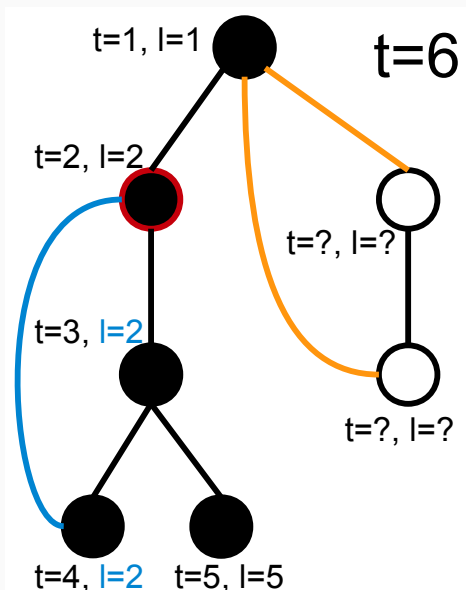
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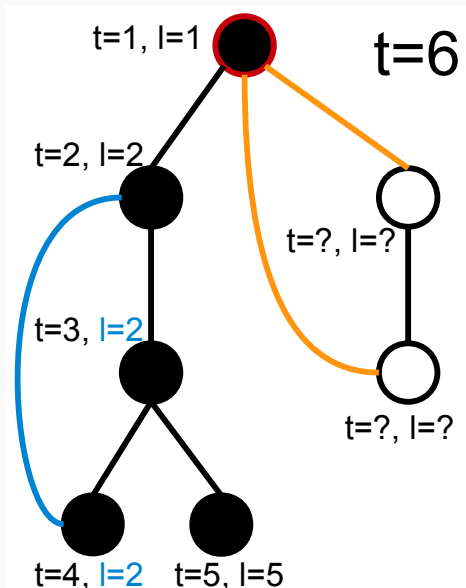
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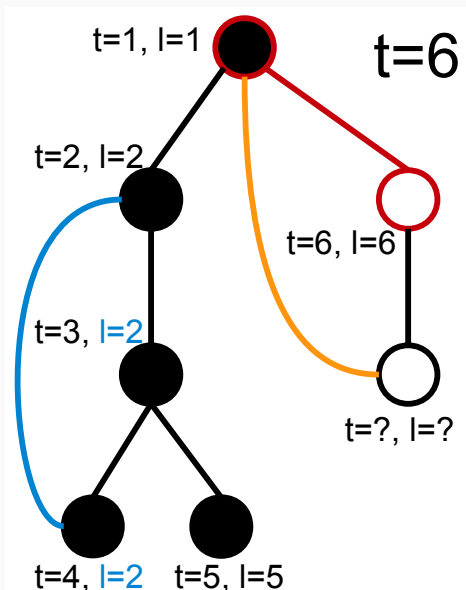
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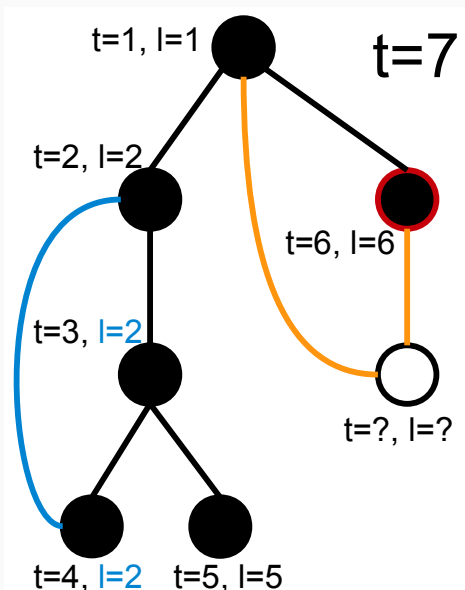
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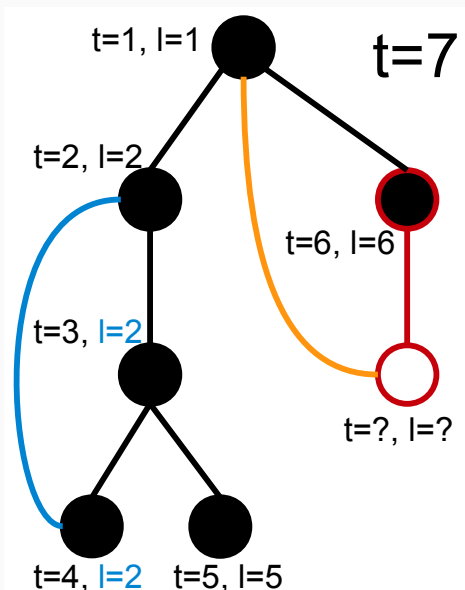
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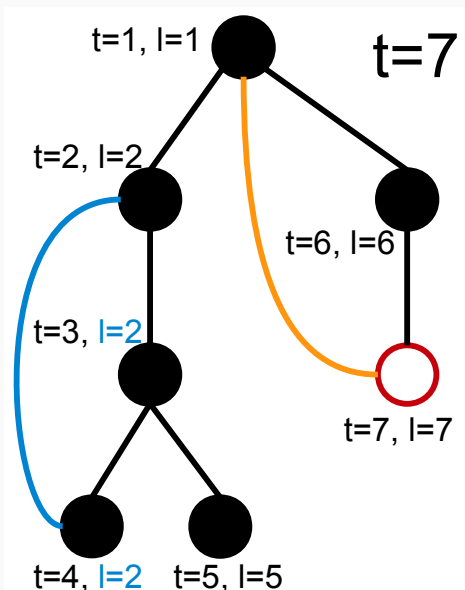
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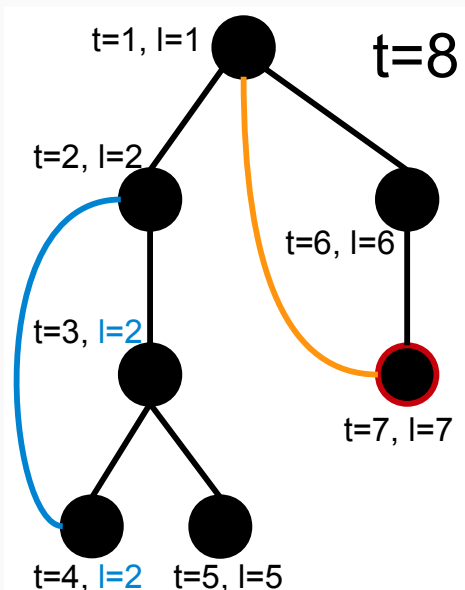
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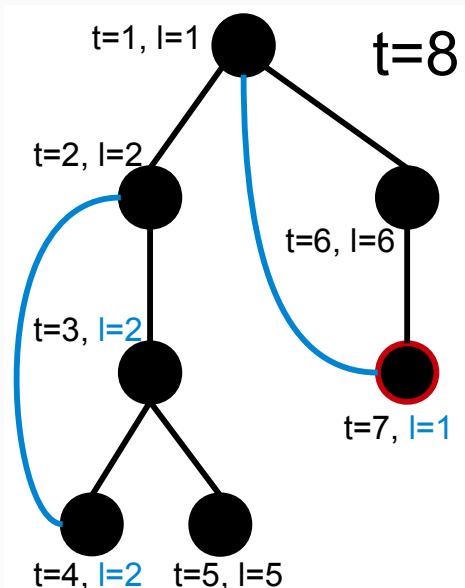
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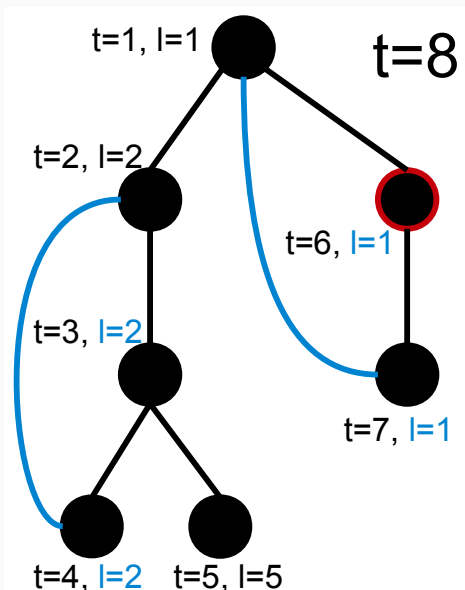
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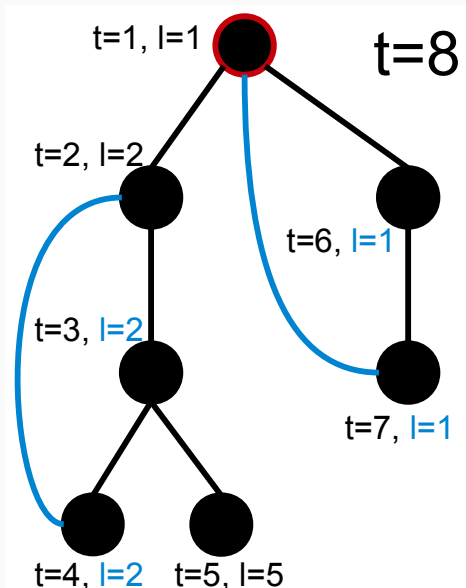
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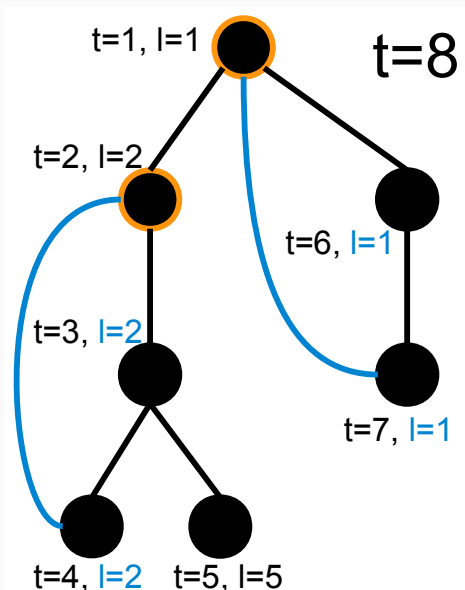
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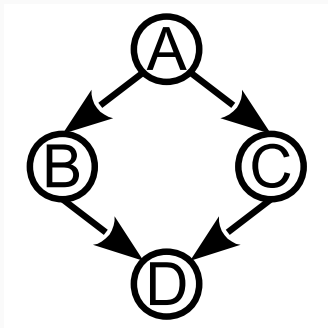
Ordering nodes

Types of Node Orderings

DFS \rightarrow order **linearly** nodes in G .

- **Preordering:** Order of the 1st visit.
- **Postordering:** Order of the last visit.
- **Reverse Postordering:**
Opposite order of the last visit \rightarrow **topological sorting**
- **Topological sorting:**
 $\forall \langle u, v \rangle \in E, u$ comes before v in the ordering.

Example



DFS Traversal (A, B, D, B, A, C, A) or (A, C, D, C, A, B, A) .

- Preordering: (A, B, D, C) or (A, C, D, B)
- Postordering: (D, B, C, A) or (D, C, B, A)
- Reverse Postordering: (A, C, B, D) or (A, B, C, D)