

# Graph Traversals I

Instructor: Meng-Fen Chiang

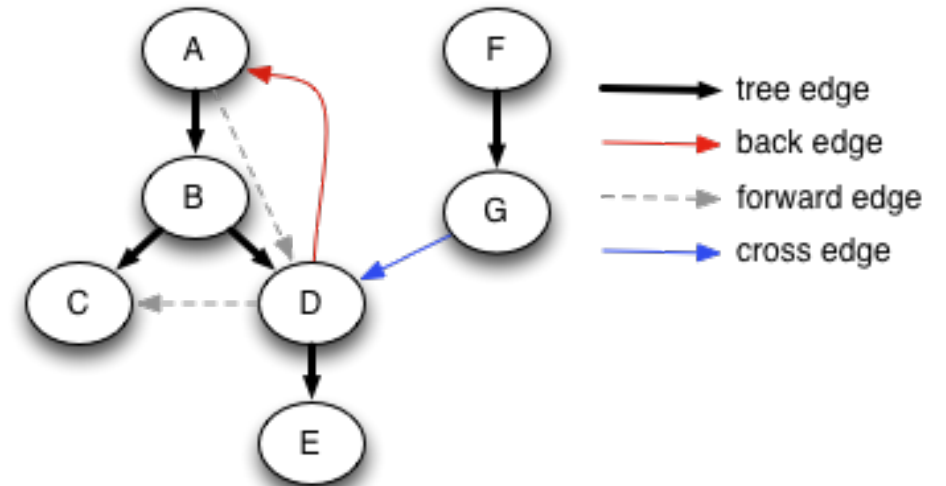
COMPCSI220: WEEK 10



Slides adapted from Mark Wilson, Georgy Gimel'farb, Simone Linz and Tanya Gvozdeva

# OUTLINE

- Graph Traversal Algorithm
- Facts about Traversal Trees
- Complexity Analysis
- Illustrative Example

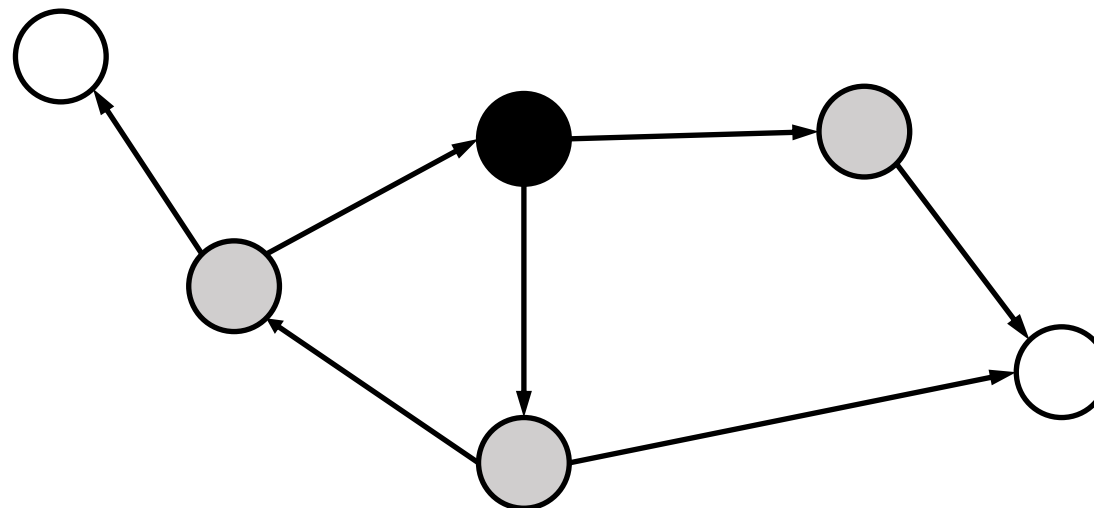


# Motivation: Graph Traversals

- Want to visit each node of a digraph in a systematic and efficient way (e.g. to search a graph).
- We can walk only on arcs following their direction

# General Graph Traversal: Colour Scheme

- All graph traversal algorithms follow the same structure which is called the **The general graph traversal algorithm**. This algorithm uses three types of nodes:
  - **White nodes**: have not yet been visited.
  - **Grey (frontier) nodes**: have been visited but may have adjacent nodes that are white.
  - **Black nodes**: have been visited and all their (out-)neighbors have been visited as well.



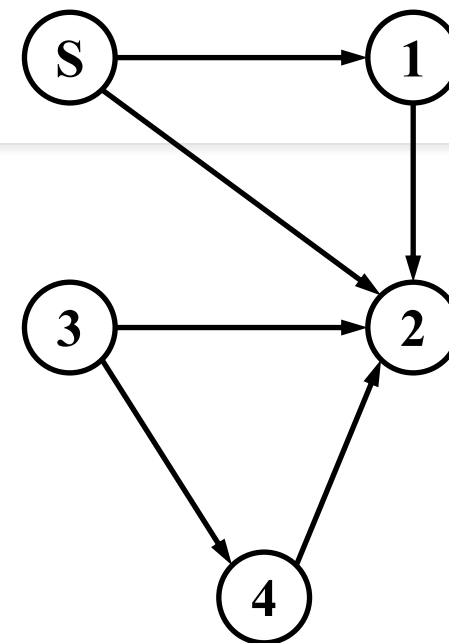
# Graph Traversal Algorithm

- All nodes are **white** to begin with.
- A starting white node is chosen and turned grey.
- A **grey** node is chosen and its out-neighbours explored.
- If any out-neighbour is white, it is visited and turned **grey**. If no out-neighbours are white, the grey node is turned **black**.
- The process of choosing grey nodes and exploring neighbours is continued until all nodes reachable from the initial node are black.
- If any white nodes remain in the digraph, a new starting node is chosen and the process continues until all nodes are **black**.

# General Graph Traversal: Visit(s)

1.  $s$  is coloured grey and  $pred[s]=null$ .
2. choose a grey node  $u$ .
3. if  $u$  has a white (out)-neighbour  $v$  then colour  $v$  grey and  $pred[v]=u$  else colour  $u$  black.
4. if we have grey nodes go to 2).

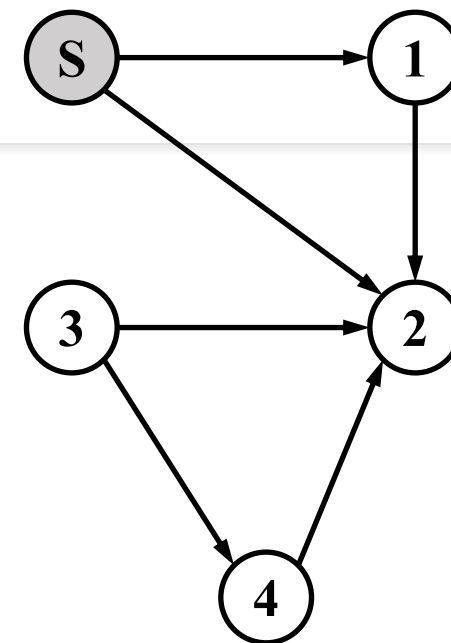
\*  $pred$  - predecessor



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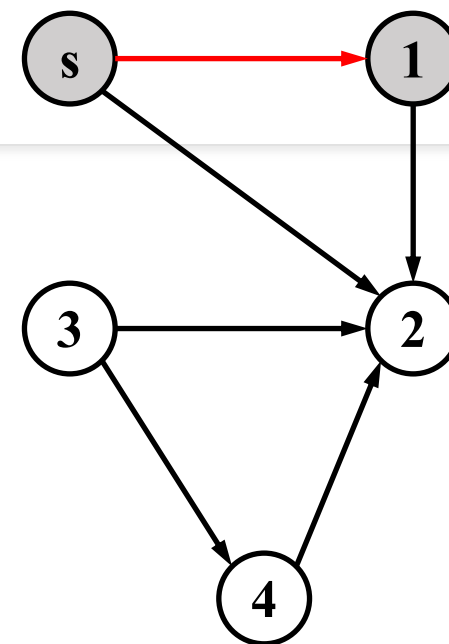


$Pred[s] = null$

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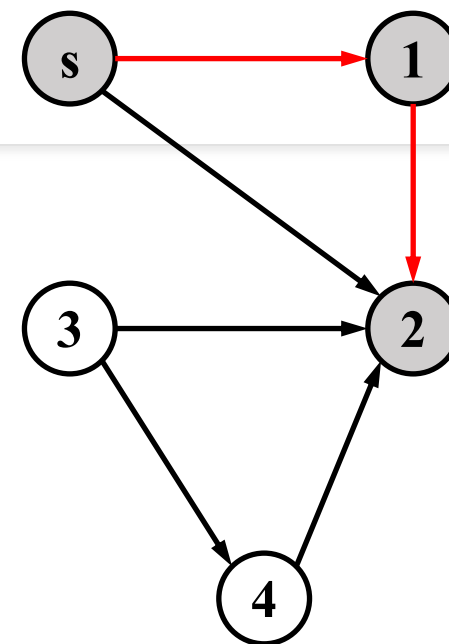
$Pred[1] = s$



# General Graph Traversal: Visit(s)

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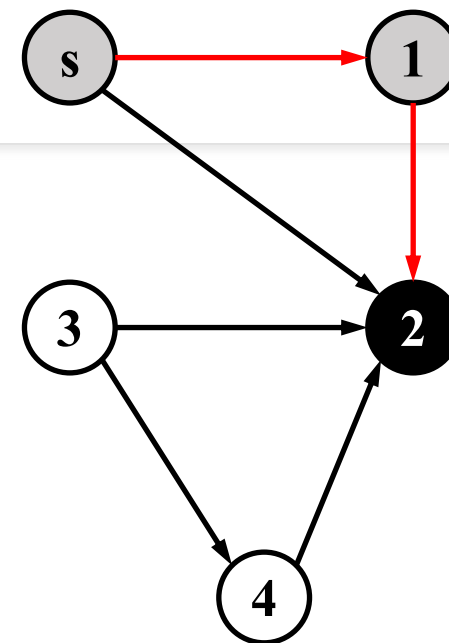


$Pred[2] = 1$

# General Graph Traversal: Visit(s)

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2. choose a grey node  $u$ .
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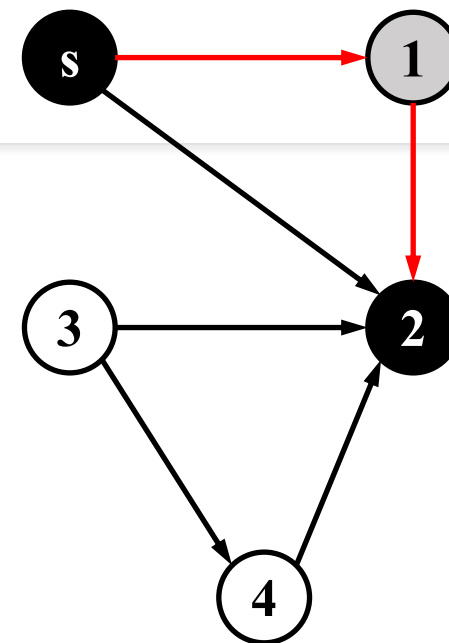
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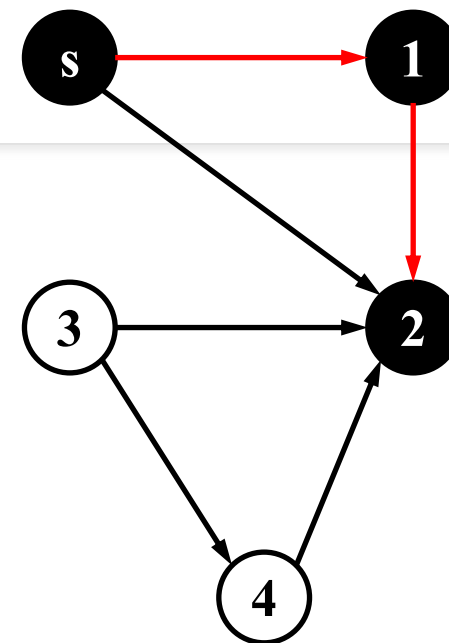


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- $Visit(s)$  visits all nodes reachable from  $s$ .
- After the run of  $visit(s)$  all reachable nodes are coloured black.



# General Graph Traversal: Visit(s)

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**Algorithm 1** Visit.

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```
1: function VISIT(node  $s$  of digraph  $G$ )
2:    $color[s] \leftarrow \text{Grey}$ 
3:    $pred[s] \leftarrow \text{Null}$ 
4:   while there is a Grey node do
5:     choose a Grey node  $u$ 
6:     if  $u$  has a WHITE (out-)neighbour then
7:       choose such a white (out-)neighbour  $v$ 
8:        $color[v] \leftarrow \text{Grey}$ 
9:        $pred[v] \leftarrow u$ 
10:    else
11:       $color[u] \leftarrow \text{Black}$ 
```

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# General Graph Traversal Algorithm: Main

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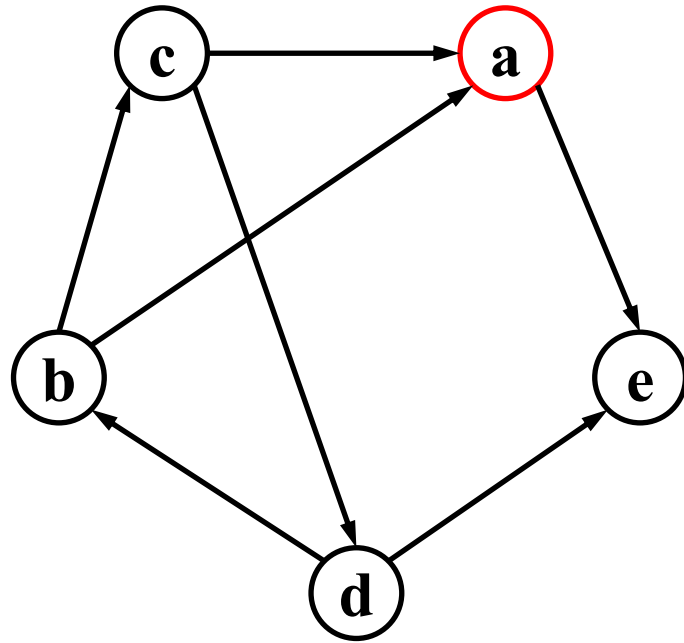
**Algorithm 2** Traverse.

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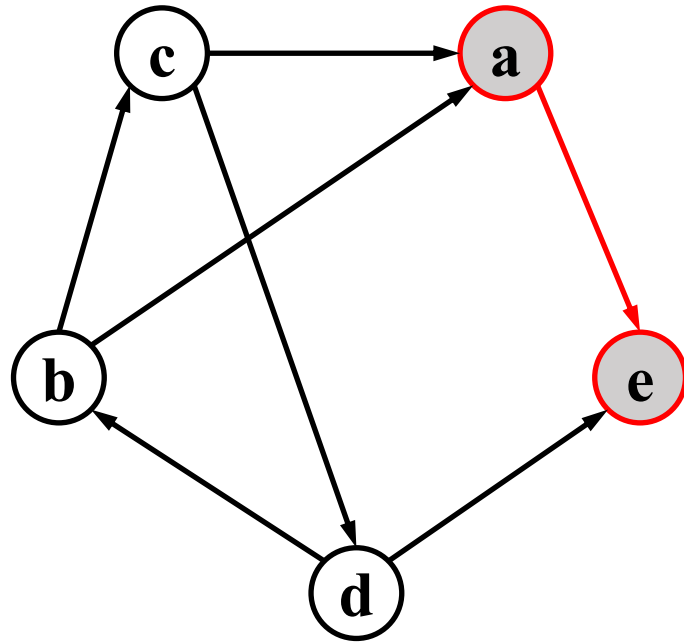
```
1: function TRAVERSE(digraph  $G$ )
2:   array  $color[0..n-1]$ 
3:   array  $pred[0..n-1]$ 
4:   for  $u \in V(G)$  do
5:      $color[u] \leftarrow \text{WHITE}$ 
6:   end for
7:   for  $s \in V(G)$  do
8:     if  $color[s] = \text{WHITE}$  then
9:       VISIT( $s$ )
10:  return  $pred$ 
```

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# Illustrating the general traversal algorithm



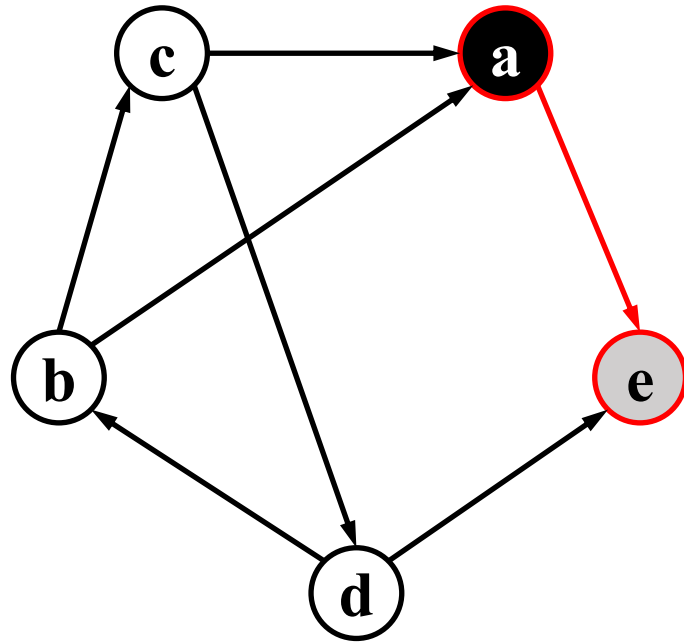
# Illustrating the general traversal algorithm



- VISIT(a)  
e is the white neighbour of a

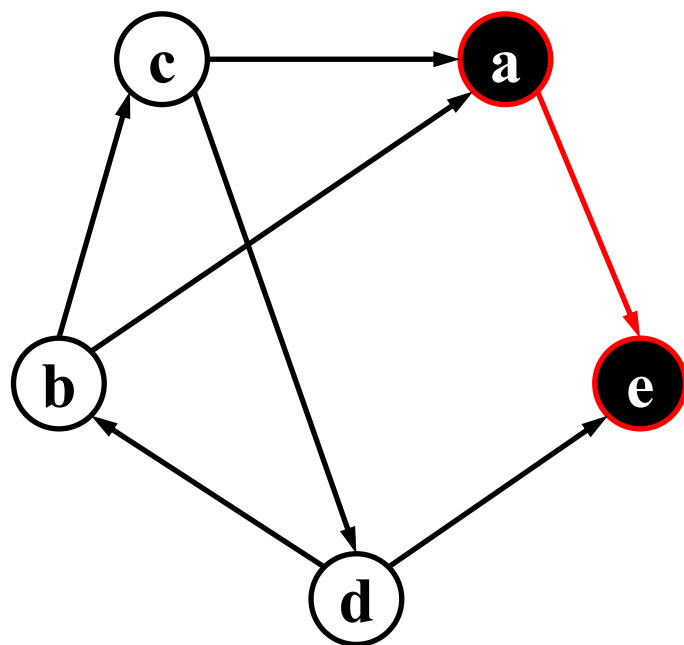


# Illustrating the general traversal algorithm



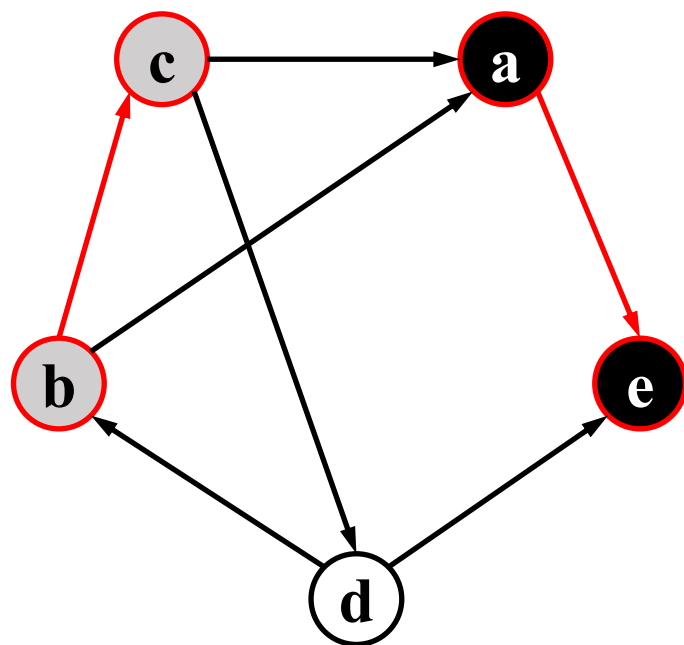
- VISIT(a)  
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choose grey a; no white neighbour; colour black

# Illustrating the general traversal algorithm



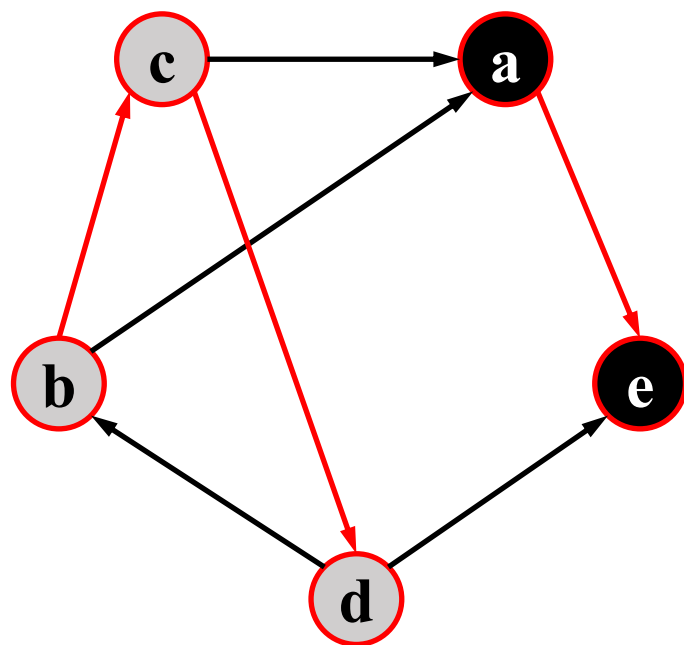
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# Illustrating the general traversal algorithm



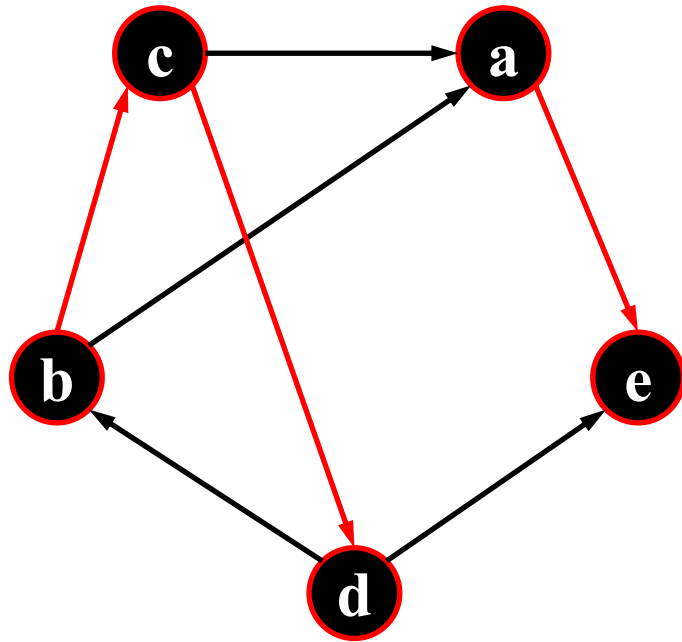
- VISIT(a)
  - e is the white neighbour of a
  - choose grey a; no white neighbour; colour black
  - choose grey e; no white neighbour; colour black
- VISIT(b)
  - c is the white neighbour of b

# Illustrating the general traversal algorithm



- VISIT(a)  
e is the white neighbour of a  
choose grey a; no white neighbour; colour black  
choose grey e; no white neighbour; colour black
- VISIT(b)  
c is the white neighbour of b  
choose grey c; d is white neighbour

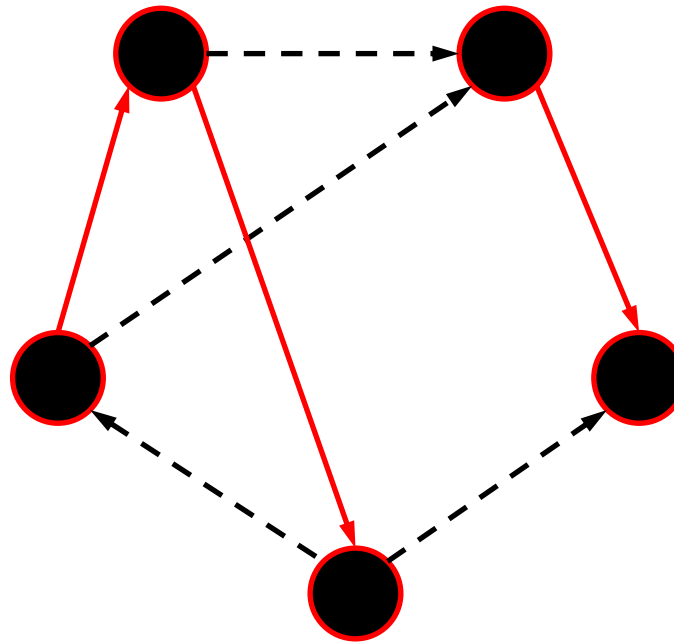
# Illustrating the general traversal algorithm



- VISIT(a)
  - e is the white neighbour of a
  - choose grey a; no white neighbour; colour black
  - choose grey e; no white neighbour; colour black
- VISIT(b)
  - c is the white neighbour of b
  - choose grey c; d is white neighbour
  - no more white nodes; all nodes turn black

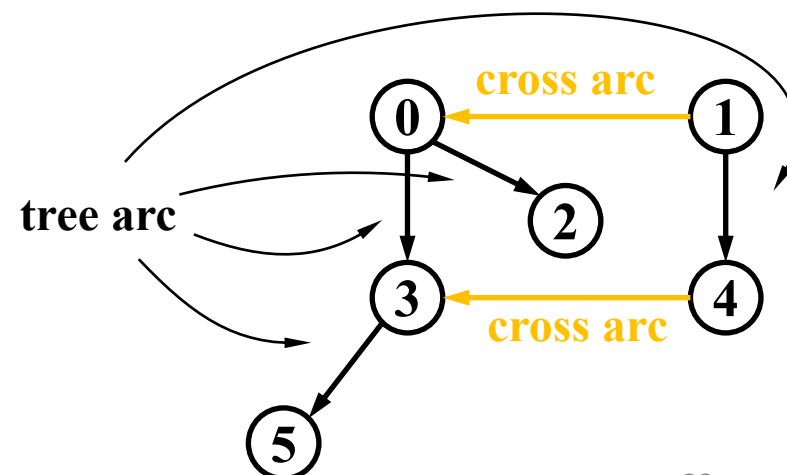
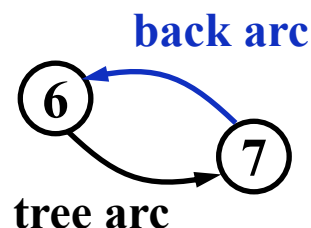
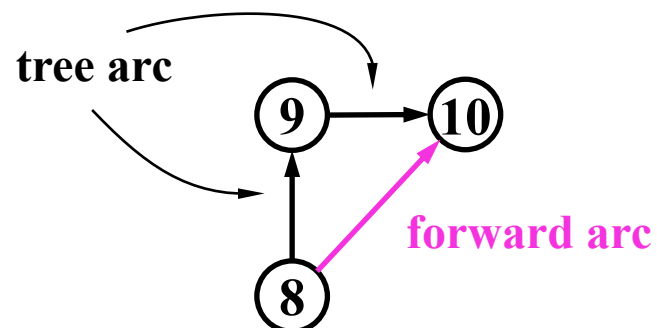
# A search forest

A search forest is a collection of node-disjoint trees that span the digraph and contain, for each node  $u$  with  $\text{pred}[u] \neq \text{NULL}$ , the arc  $(\text{pred}[u], u)$ .



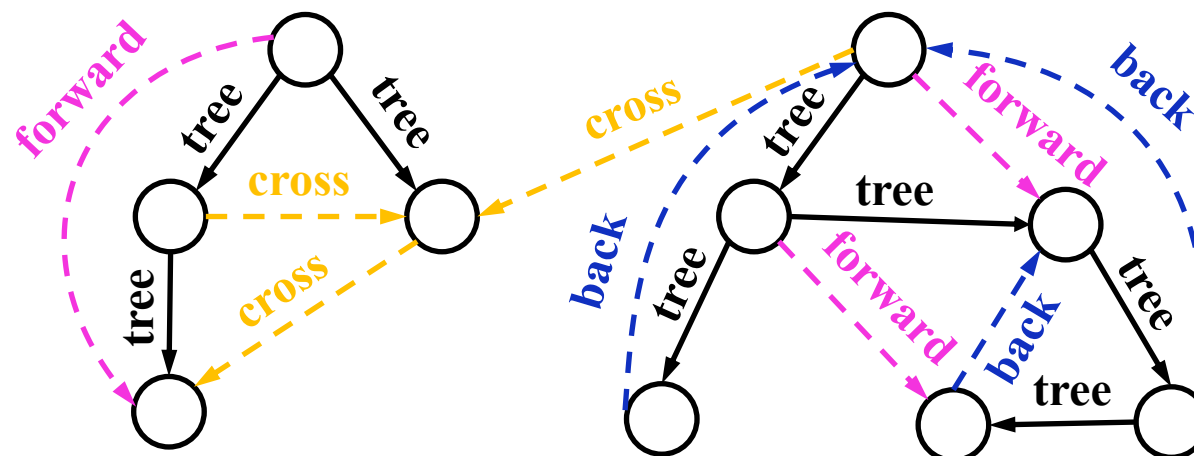
# Traversal Arc Classifications

- Suppose we have performed a traversal of a digraph  $G$ , resulting in a search forest  $F$ . Let  $(u, v) \in E(G)$  be an arc.
- The arc is called a **tree arc** if it belongs to one of the trees of  $F$ . If the arc is not a tree arc, there are three possibilities:
  - a **forward arc** if  $u$  is an ancestor of  $v$  in  $F$ ,
  - a **back arc** if  $u$  is a descendant of  $v$  in  $F$ , and
  - a **cross arc** if neither  $u$  nor  $v$  is an ancestor of the other in  $F$ .



# Traversal Arc Classifications

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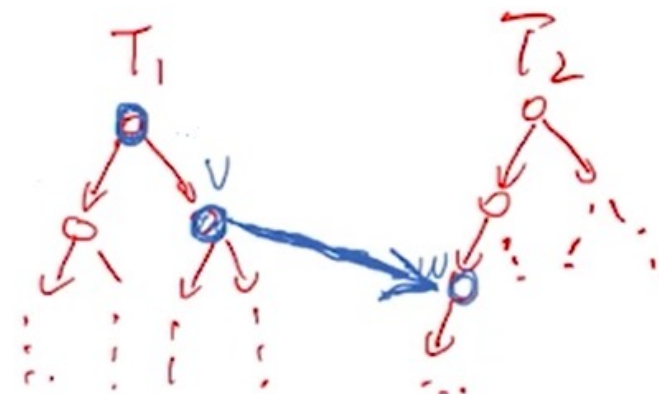
# Facts about Traversal Trees

- **Theorem:** Suppose we run algorithm `traverse` on  $G$ , resulting in a search forest  $F$ . Let  $v, w \in V(G)$ .

Let  $T_1$  and  $T_2$  be different trees in  $F$  and suppose that  $T_1$  was explored before  $T_2$ . Then there are no arcs from  $T_1$  to  $T_2$ .

- **Proof:**

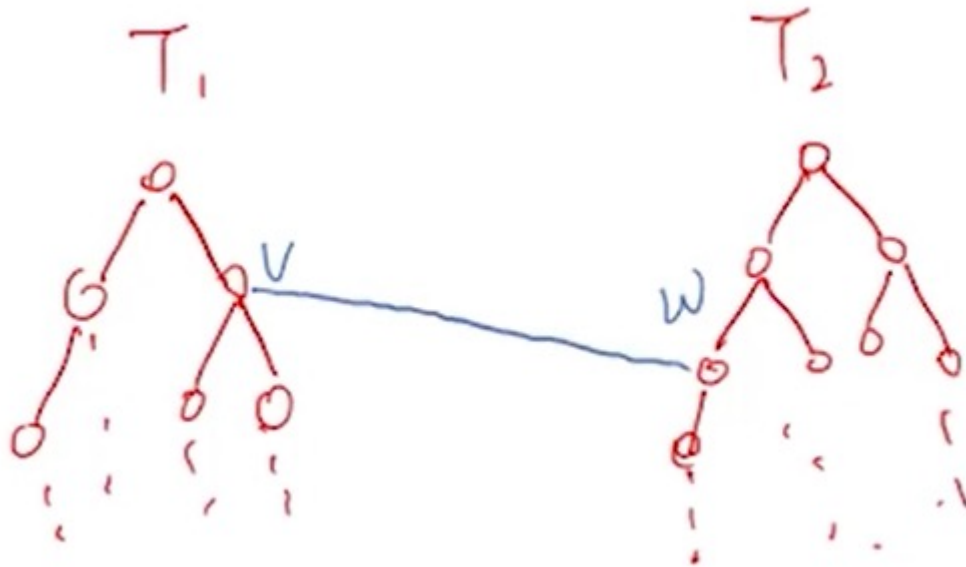
- Assume  $(v, w) \in E(G)$ ,  $v \in T_1, w \in T_2$
- $\text{VISIT}(s) \left\{ \begin{array}{l} 1. \text{ A single run of VISIT generates a tree} \\ 2. \text{ All nodes reachable from } s \text{ will be visited} \end{array} \right.$
- With 1 and 2, we have  $w \in T_1 \Rightarrow \text{contradiction}$



# Facts about Traversal Trees (Contd.)

- **Theorem:** Suppose we run algorithm `traverse` on  $G$ , resulting in a search forest  $F$ . Let  $v, w \in V(G)$ .

Then there can be no edges joining different trees of  $F$ .



# Facts about Traversal Trees (Contd.)

- **Theorem:** Suppose we run algorithm `traverse` on  $G$ , resulting in a search forest  $F$ . Let  $v, w \in V(G)$ .

Suppose that  $v$  is visited before  $w$  and  $w$  is reachable from  $v$  in  $G$ . Then  $v$  and  $w$  belong to the same tree of  $F$ .

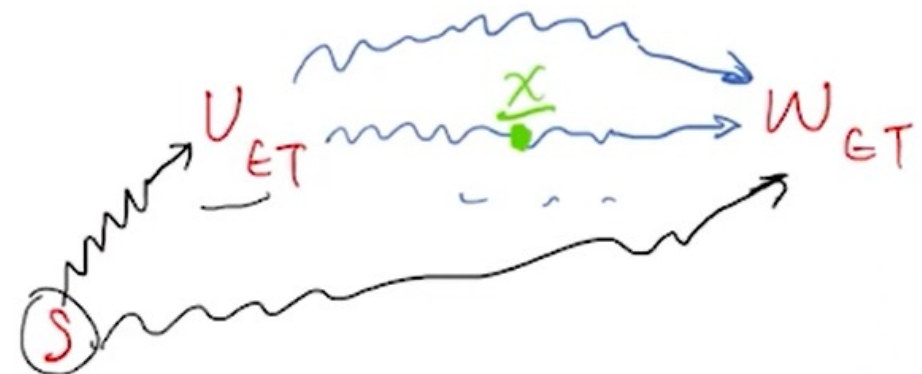
- **Proof.**
  - Let  $v \in T$  and  $s$  be the root of  $T$ .
  - Because  $w$  is reachable from  $v$ ,  $v$  is reachable from  $s$ , then  $w$  is reachable from  $s$ .
  - Then,  $w$  should be in the same tree as  $v$ .

# Facts about Traversal Trees (Contd.)

- **Theorem:** Suppose we run algorithm `traverse` on  $G$ , resulting in a search forest  $F$ . Let  $v, w \in V(G)$ .

Suppose that  $v$  and  $w$  belong to the same tree  $T$  in  $F$ . Then any path from  $v$  to  $w$  in  $G$  must have all nodes in  $T$ .

- **Proof.** For any node  $x$  in any path from  $v$  to  $w$ 
  1.  $v, w \in T$
  2.  $v$  is reachable from  $s$  the root of  $T$ , then  $x$  is reachable from  $s$
  3. By 2,  $x \in T$



# Complexity Analysis: General Graph Traversal

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**Algorithm 2** Traverse.

---

```
1: function TRAVERSE(digraph  $G$ )
2:   array  $color[0..n - 1]$ 
3:   array  $pred[0..n - 1]$ 
4:   for  $u \in V(G)$  do
5:      $color[u] \leftarrow \text{WHITE}$ 
6:   end for
7:   for  $s \in V(G)$  do
8:     if  $color[s] = \text{WHITE}$  then
9:       VISIT( $s$ )
10:  return  $pred$ 
```

---

# Complexity Analysis: Visit(s)

---

**Algorithm 1** Visit.

---

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1: function VISIT(node  $s$  of digraph  $G$ )
2:    $color[s] \leftarrow \text{Grey}$ 
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4:   while there is a Grey node do
5:     choose a Grey node  $u$ 
6:     if  $u$  has a WHITE (out-)neighbour then
7:       choose such a white (out-)neighbour  $v$ 
8:        $color[v] \leftarrow \text{Grey}$ 
9:        $pred[v] \leftarrow u$ 
10:    else
11:       $color[u] \leftarrow \text{Black}$ 
```

---

# Runtime Analysis of Traverse

- The initialization of the array *colour* takes time  $\Theta(n)$  so *traverse* is in  $\Theta(n + t)$ , where  $t$  is the total time taken by all the calls to *visit*.
- We execute the while-loop of *visit* in total  $\Theta(n)$  times since every node must eventually move from white through grey to black. In each loop:
  - The time taken in choosing grey nodes is  $\Theta(1)$  each time.
  - The time taken to find a white neighbour involves examining each neighbour of  $u$  and checking whether it is white, then applying a selection rule.
    - If **adjacency matrix** is used, we need to scan the whole row, which takes  $\Theta(n)$
    - If **adjacency lists** are used, we only need  $\Theta(|L_i|)$  for finding white nodes in the adjacency list of node  $i$ .
- So the running time of *traverse* is  $\Theta(n + (n + \sum_i |L_i|)) = \Theta(n + m)$  if adjacency lists are used, and  $\Theta(n + n^2) = \Theta(n^2)$  if the adjacency matrix format is used.

# Runtime Analysis of Traverse (Contd.)

- So, for simple selection rules and assuming a sparse input digraph, the adjacency list format seems preferable.
- If more complex selection rules are used, for example, rules that choose a single grey node  $\Theta(n)$  time by scanning the whole list of grey nodes, then the running time is asymptotically  $\Theta(n^2)$  regardless of the data structure.



# Graph Traversal

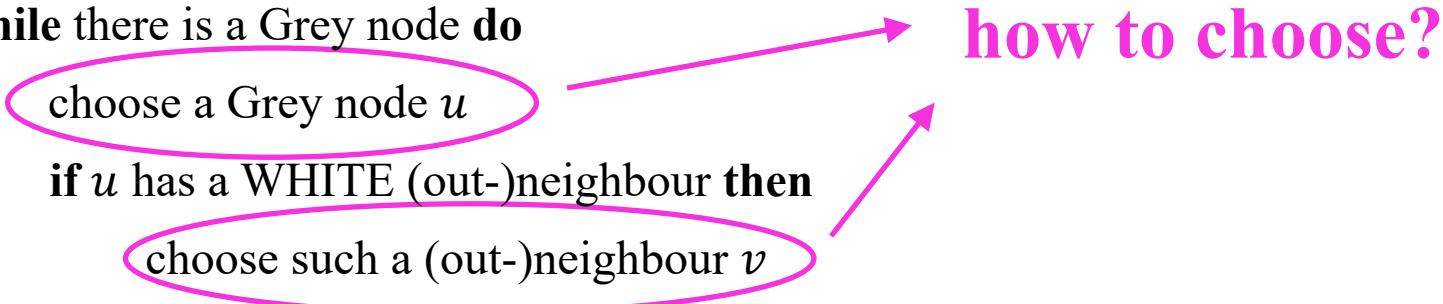
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**Algorithm 1** Visit.

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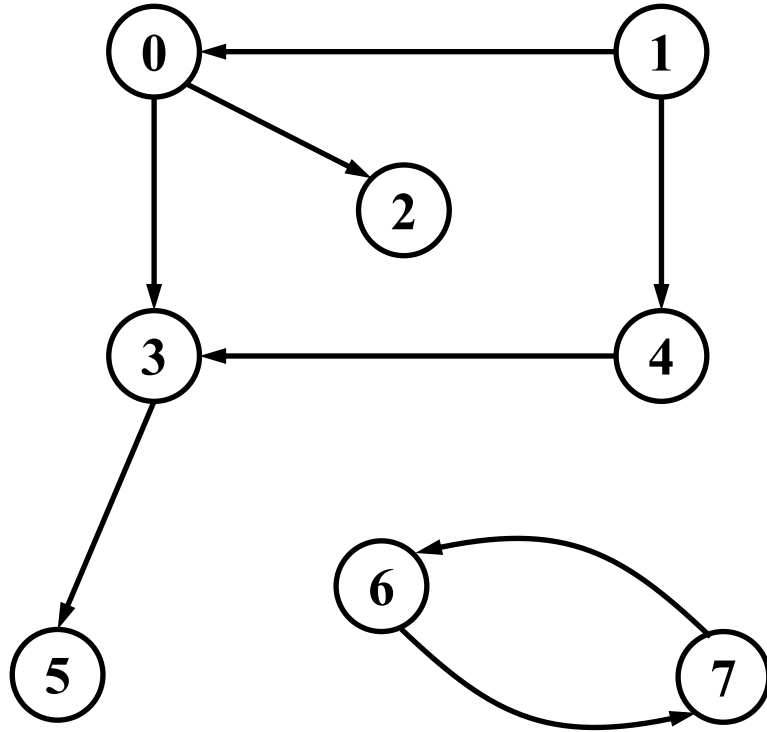
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```

how to choose?



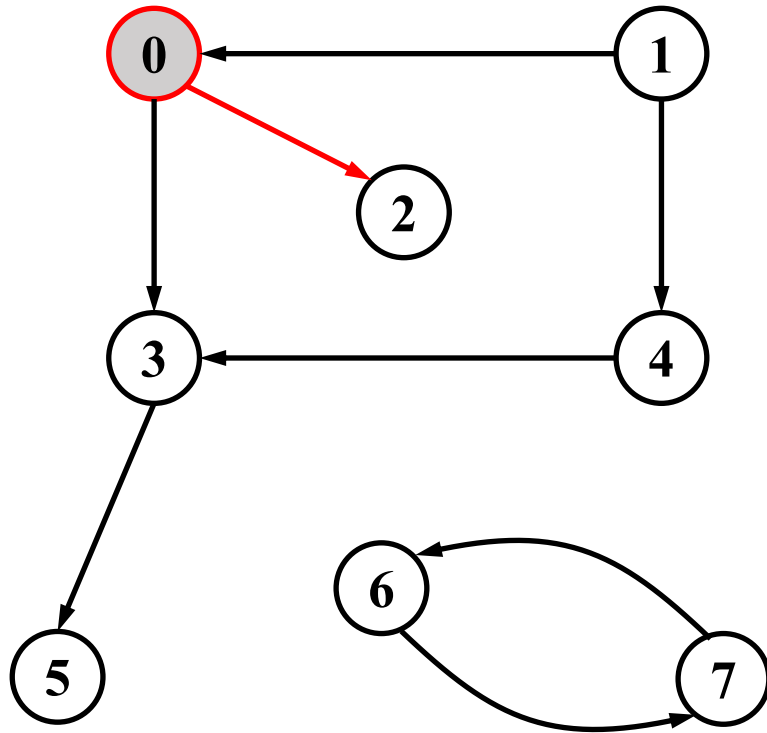
# General graph traversal: example

- Emmmm.....



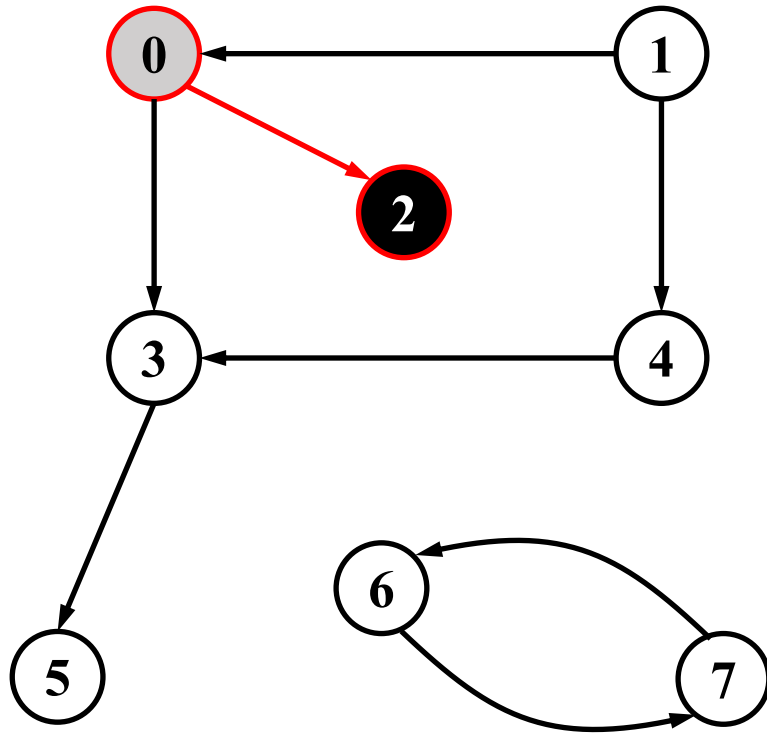
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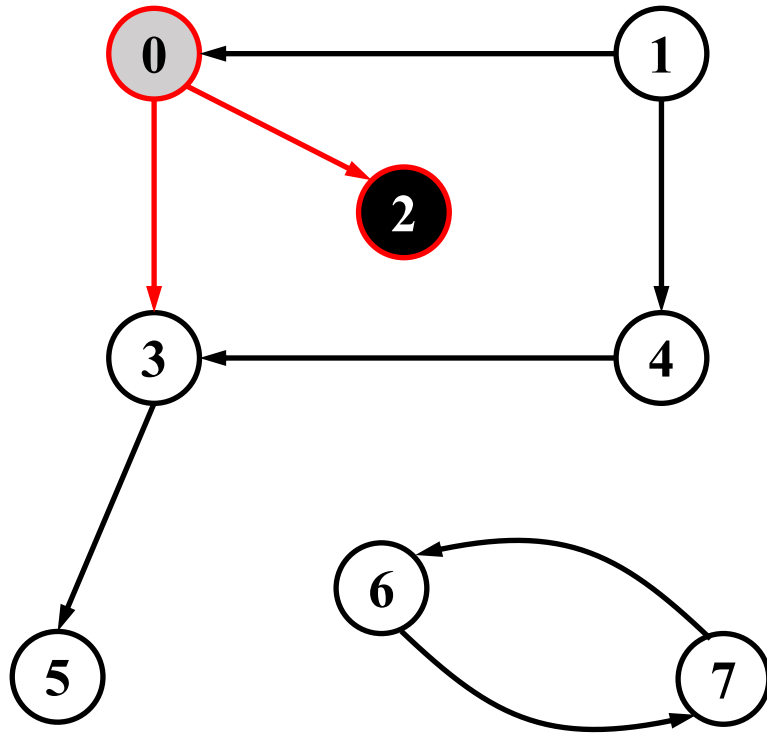
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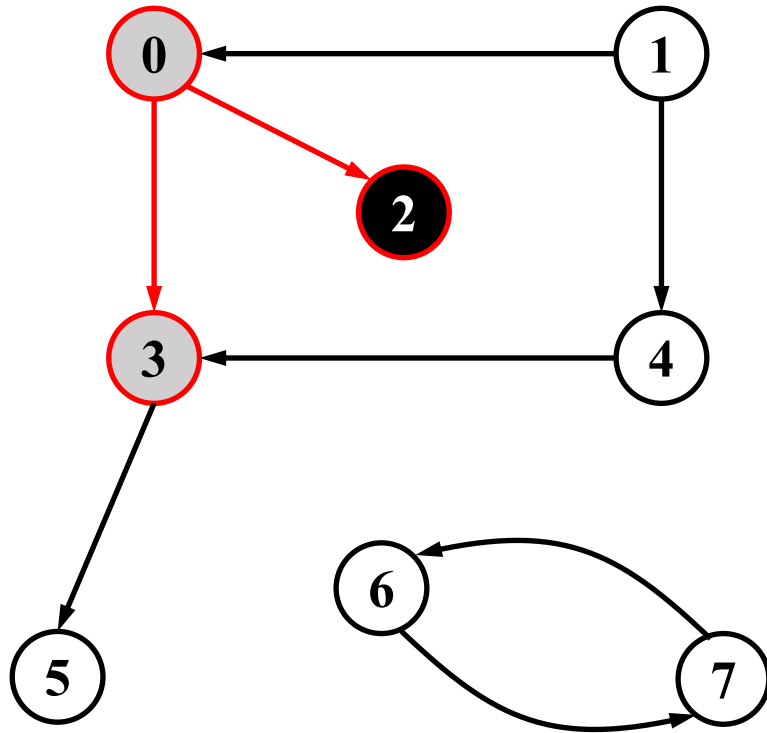
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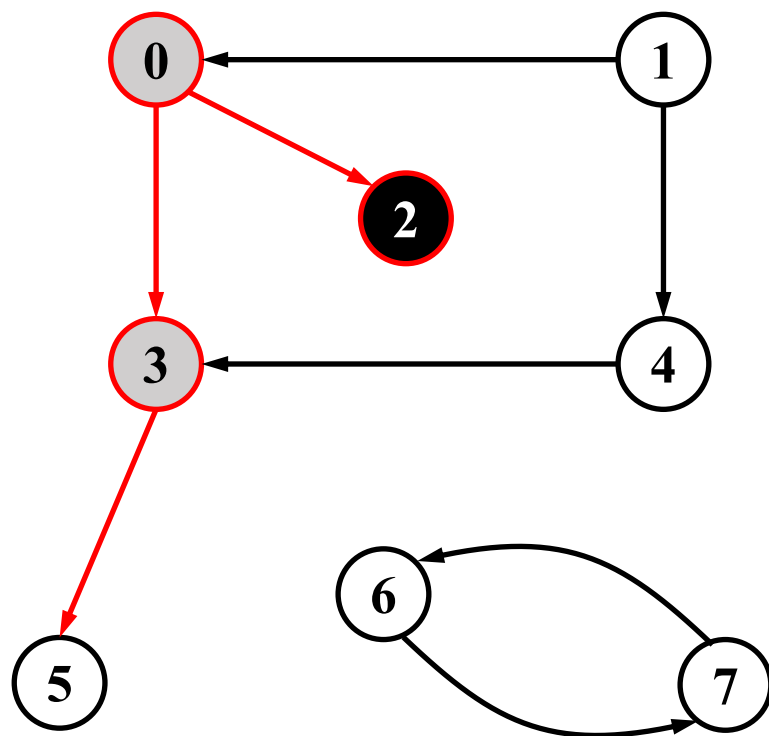
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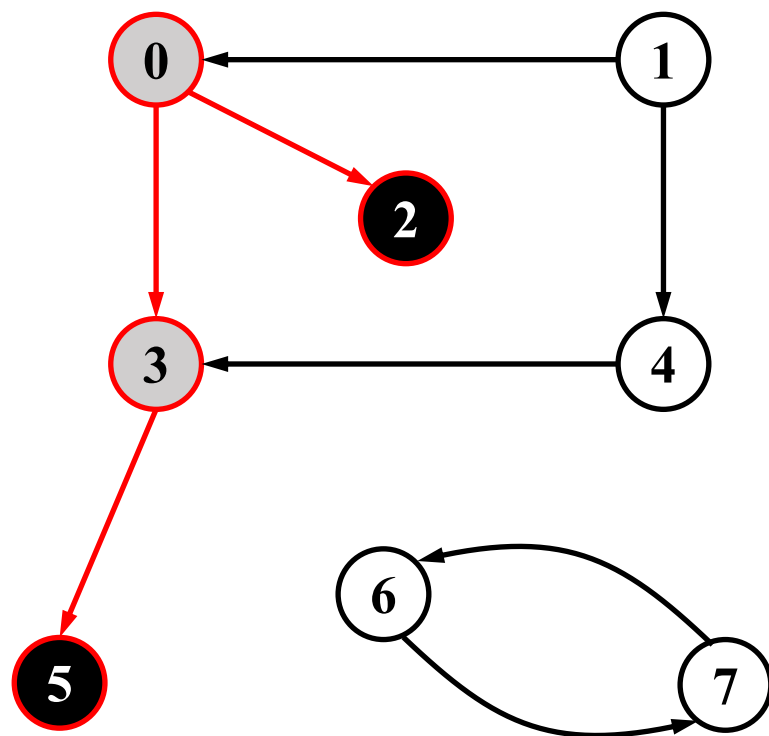
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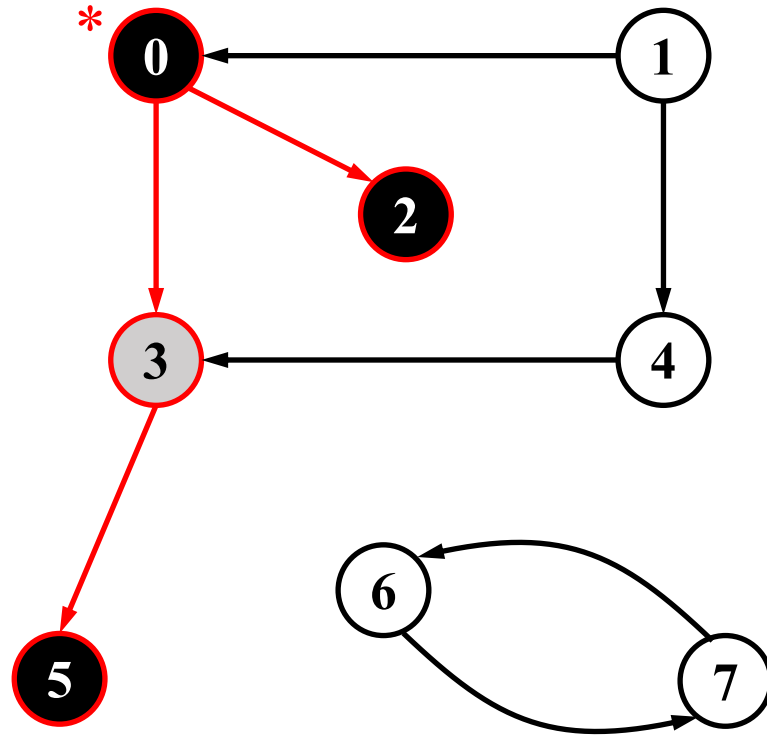
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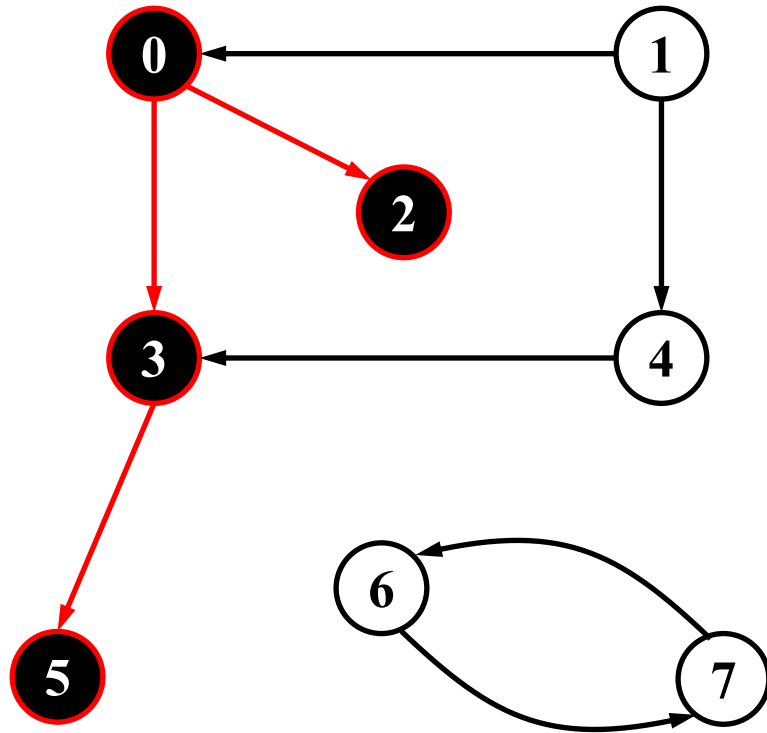
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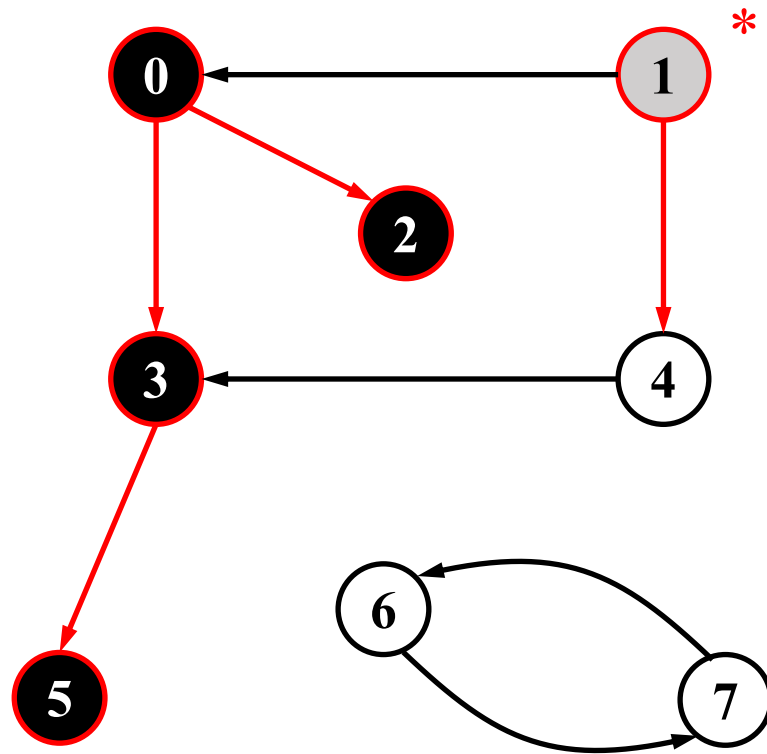
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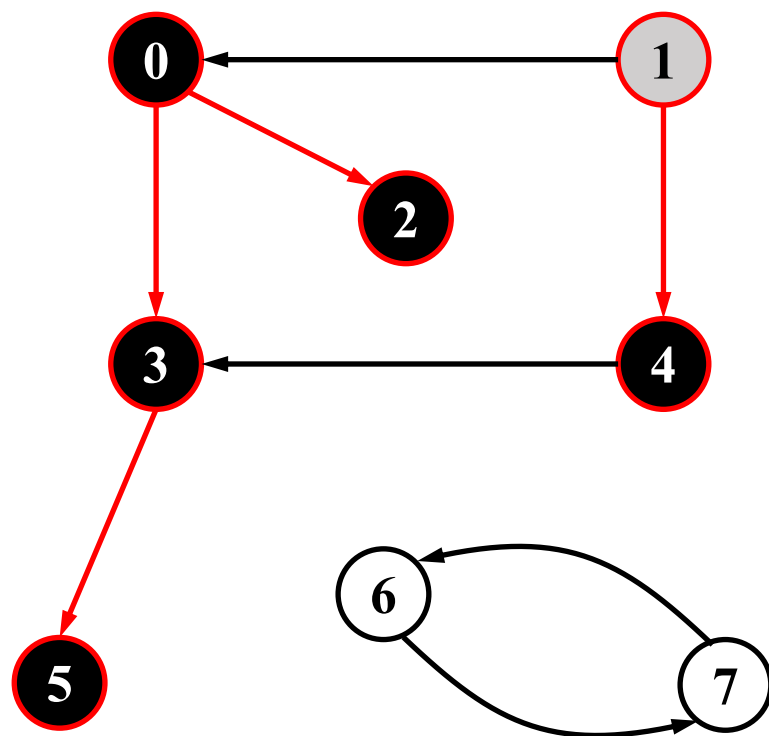
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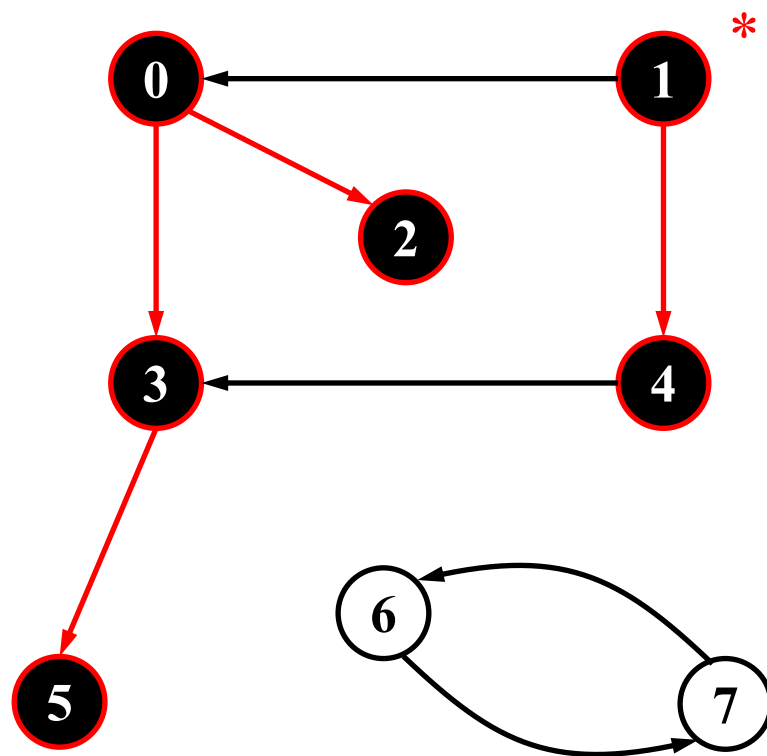
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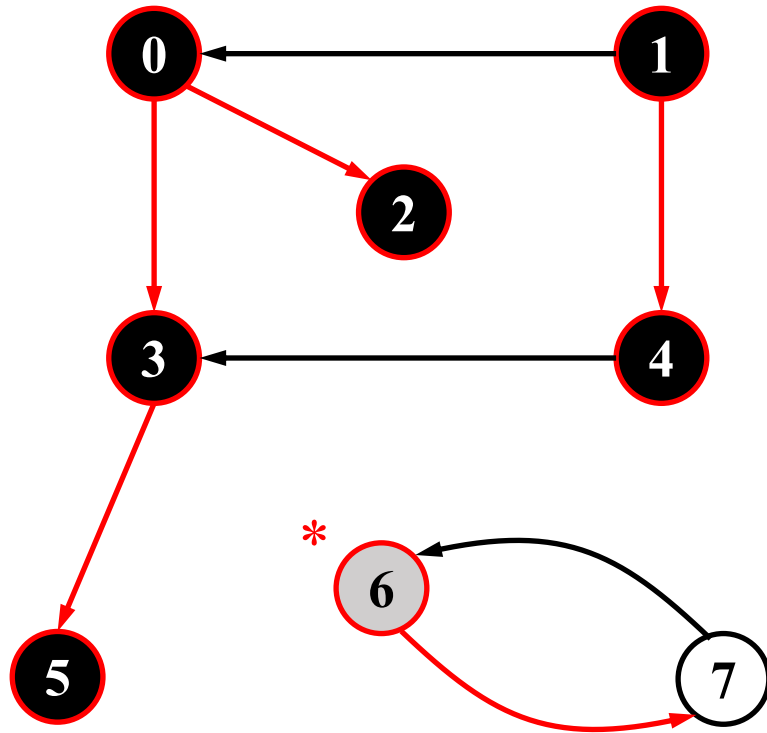
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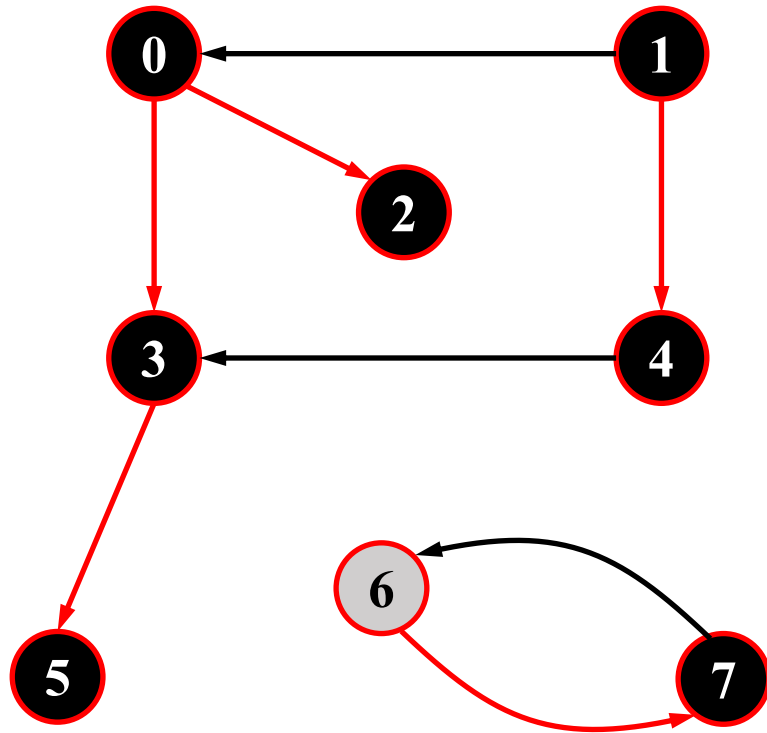
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- Emmm.....



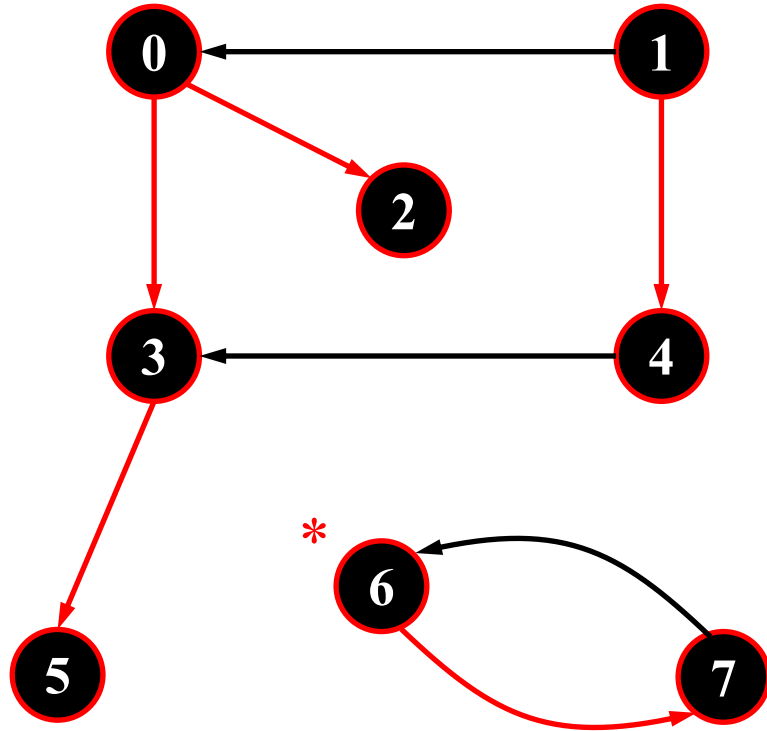
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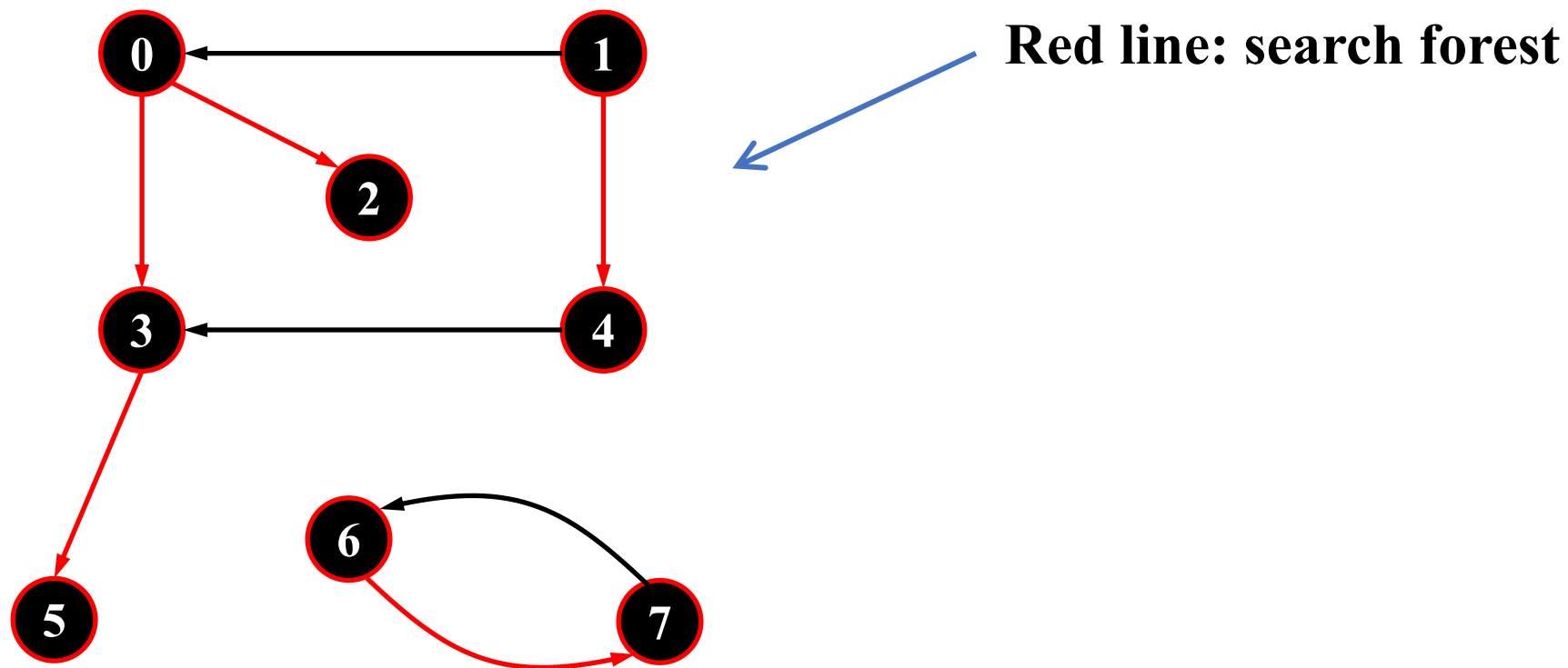
# General graph traversal: example

- Emmmm.....





# General graph traversal: example



# SUMMARY

- Graph Traversal Algorithm
- Facts about Traversal Trees
- Complexity Analysis
- Illustrative Example

