

# Graph Traversals: Applications

# Topics

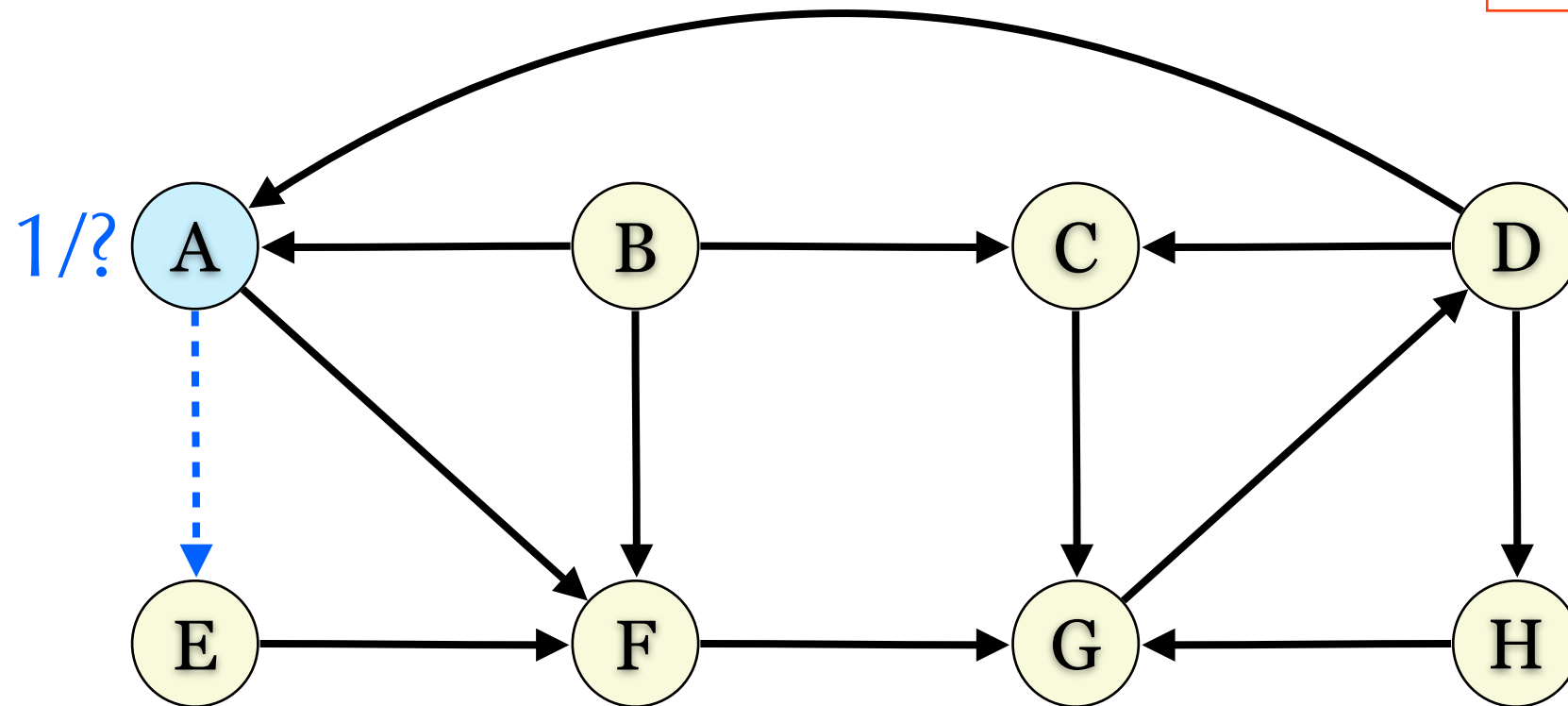
- ▶ Cycle detection
- ▶ Topological sort
- ▶ Shortest paths in DAG
- ▶ Shortest paths in unweighted graph
- ▶ Bipartite graph check
- ▶ Tree diameter
- ▶ Connected components
- ▶ Finding articulation points and bridges

# Cycle Detection

- ▶ A cycle  $c = \langle v_0, v_1, \dots, v_k = v_0 \rangle$  is in  $G = (V, E)$  if  $(v_{i-1}, v_i) \in E$  for  $i \in \{1, \dots, k\}$ .
- ▶ How to detect a cycle in  $G$ ?
- ▶ A DFS-based algorithm: check if there is a back edge  $(u, v)$ 
  - ▶ While visiting  $u$ , we check  $(u, v)$  and we find  $v$  is discovered but not visited.

# DFS-Based

Starting at A

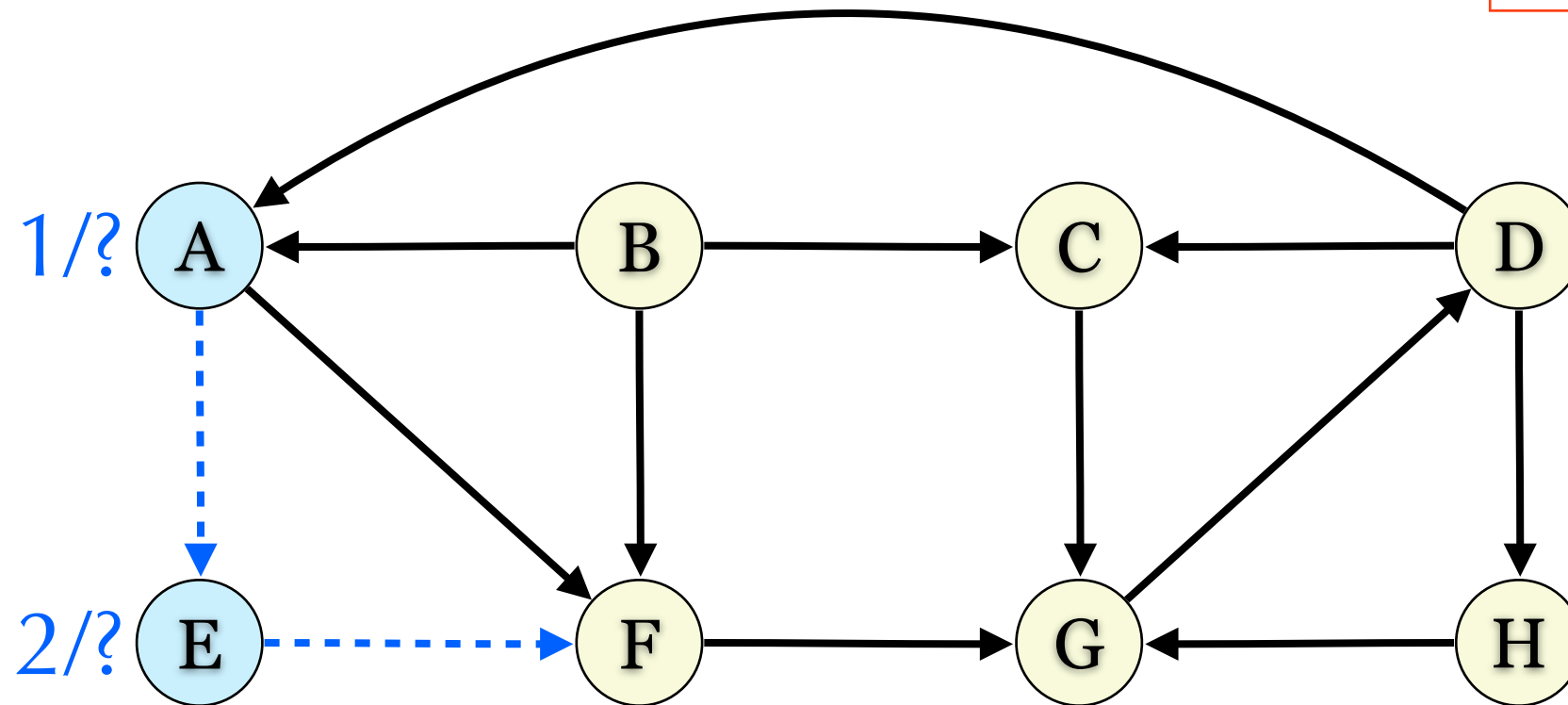


Stack

A/o							
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# DFS-Based

Starting at A

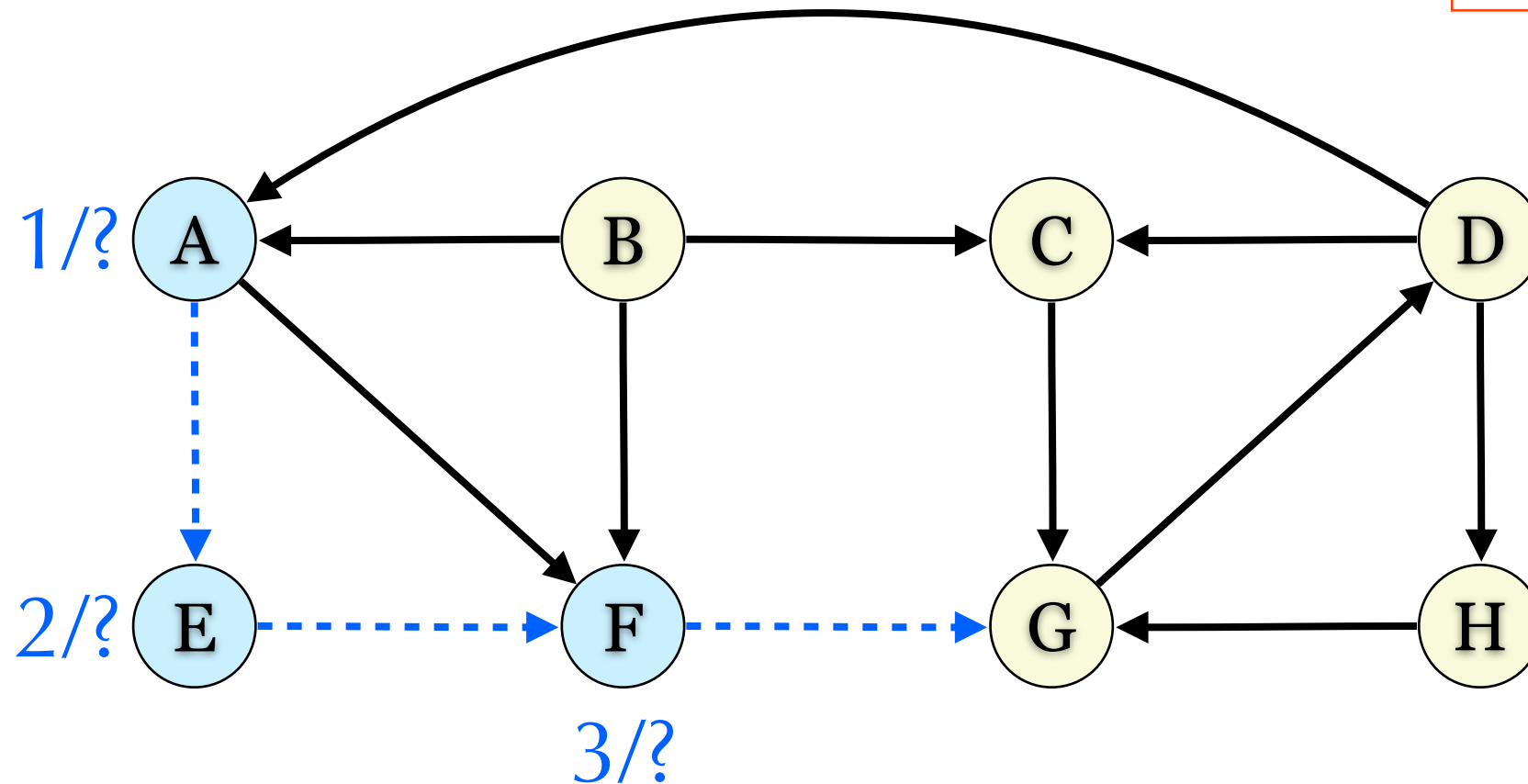


Stack

A/o	E/o						
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# DFS-Based

Starting at A

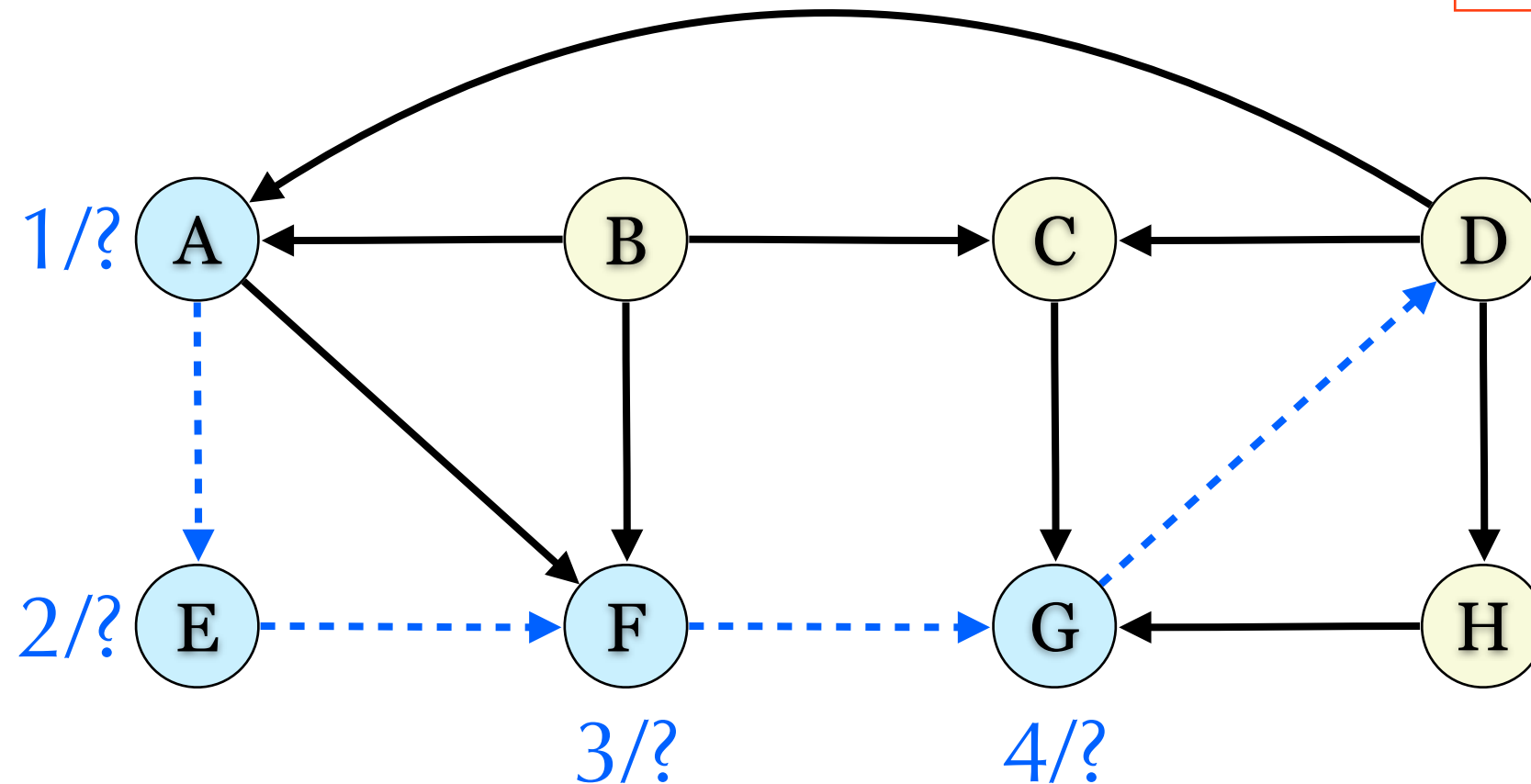


Stack

A/o	E/o	F/o					
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# DFS-Based

Starting at A



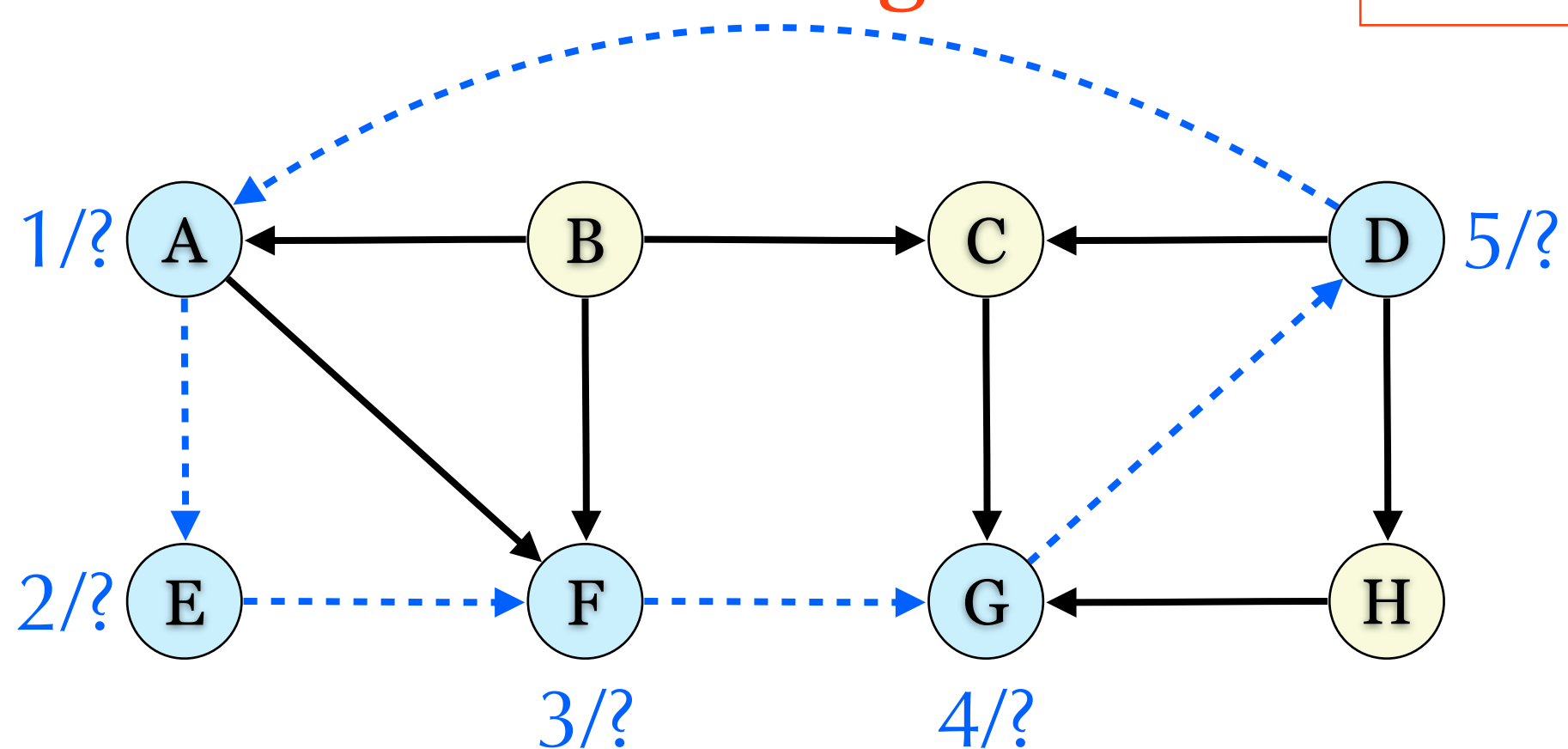
Stack

A/o	E/o	F/o	G/o				
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# DFS-Based

Back edge!

Starting at A

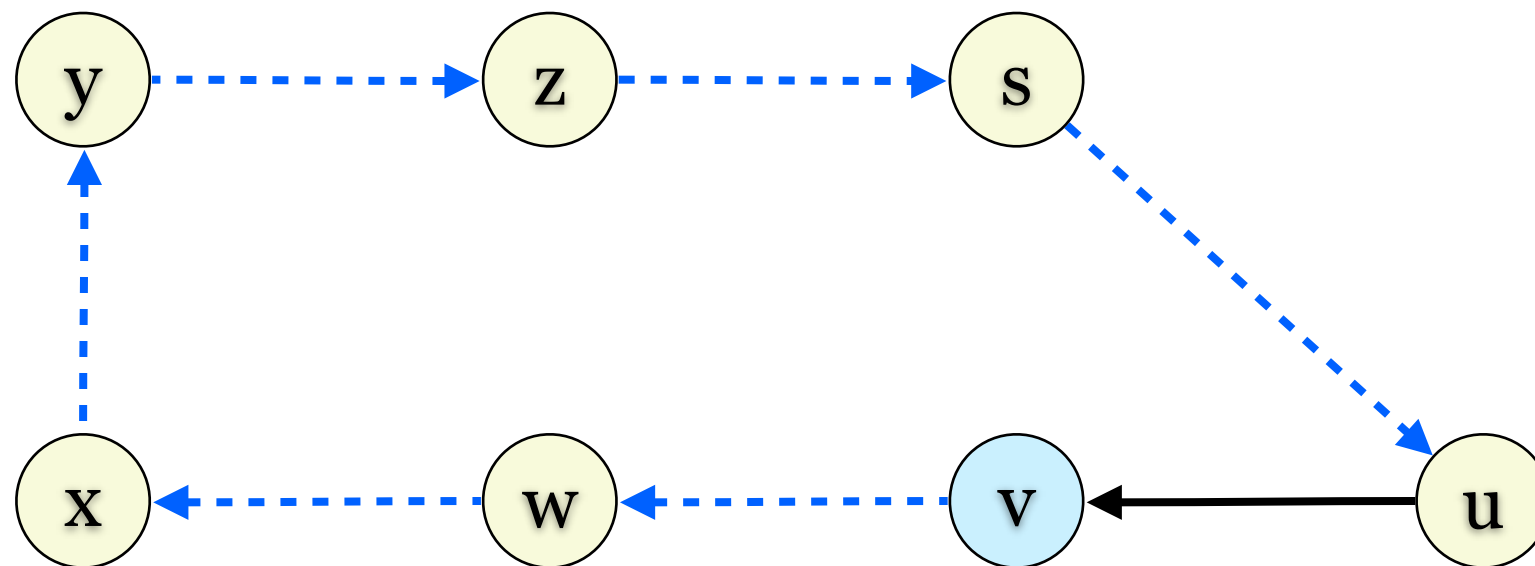


Stack

A/o	E/o	F/o	G/o	D/o			
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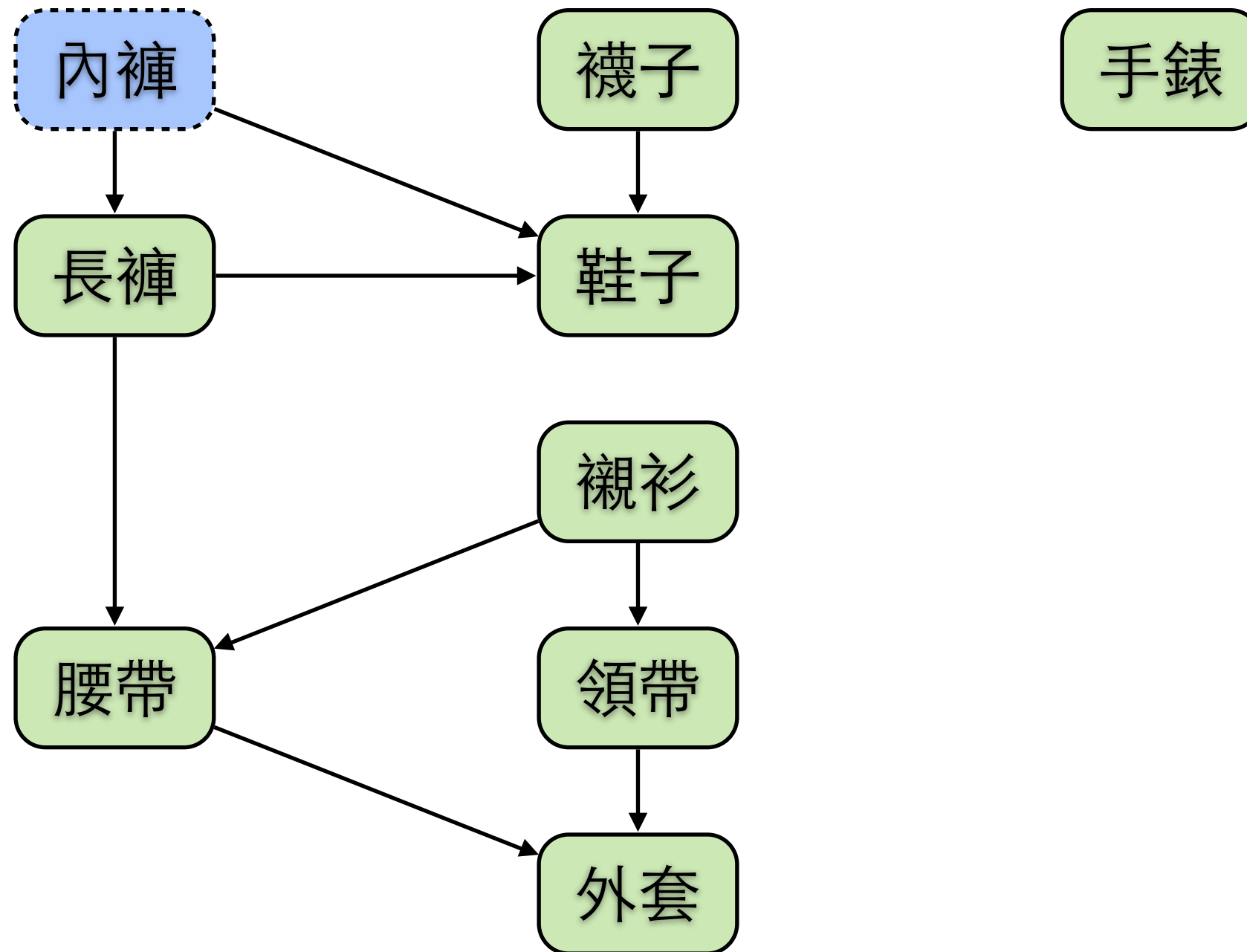
# DFS-Based

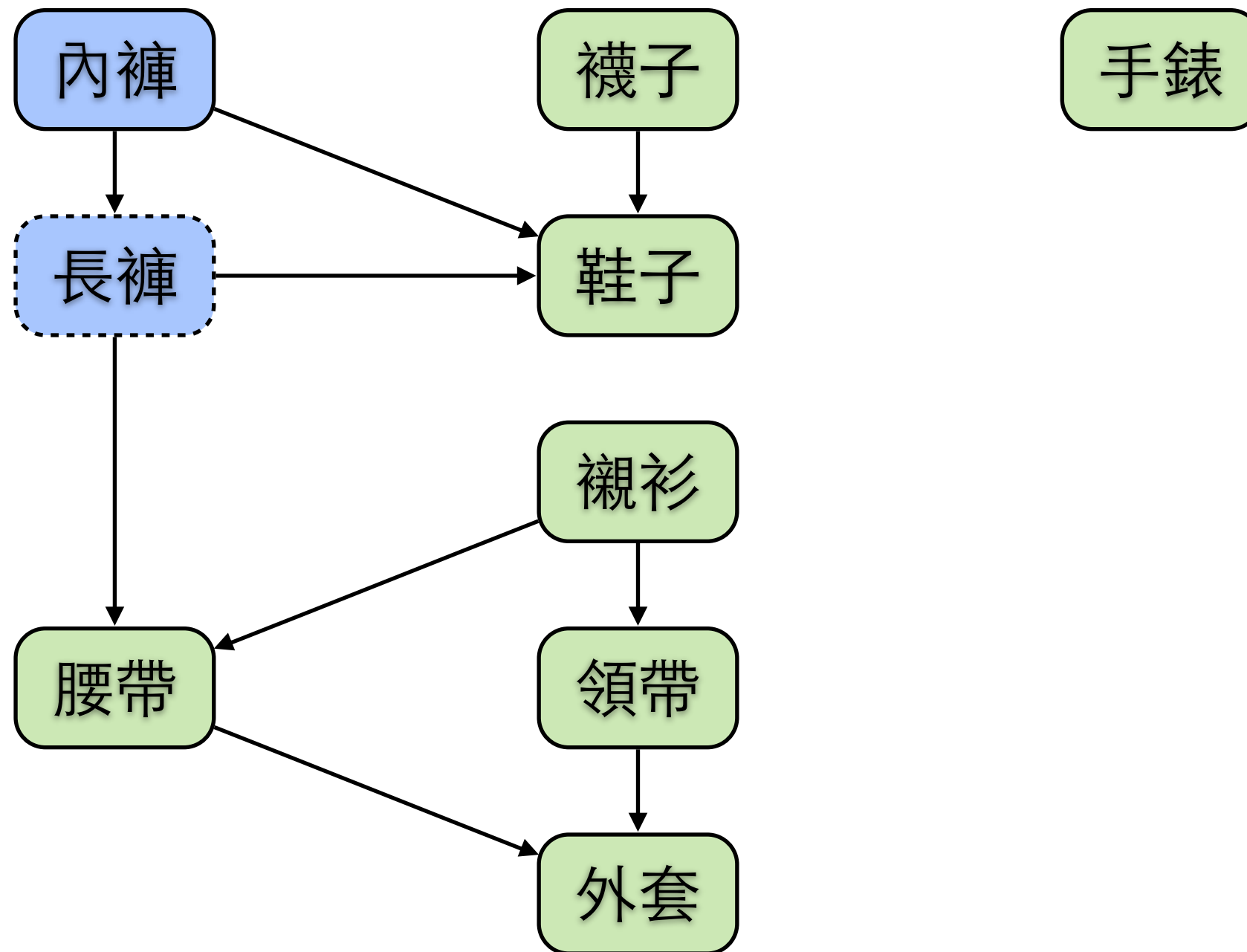


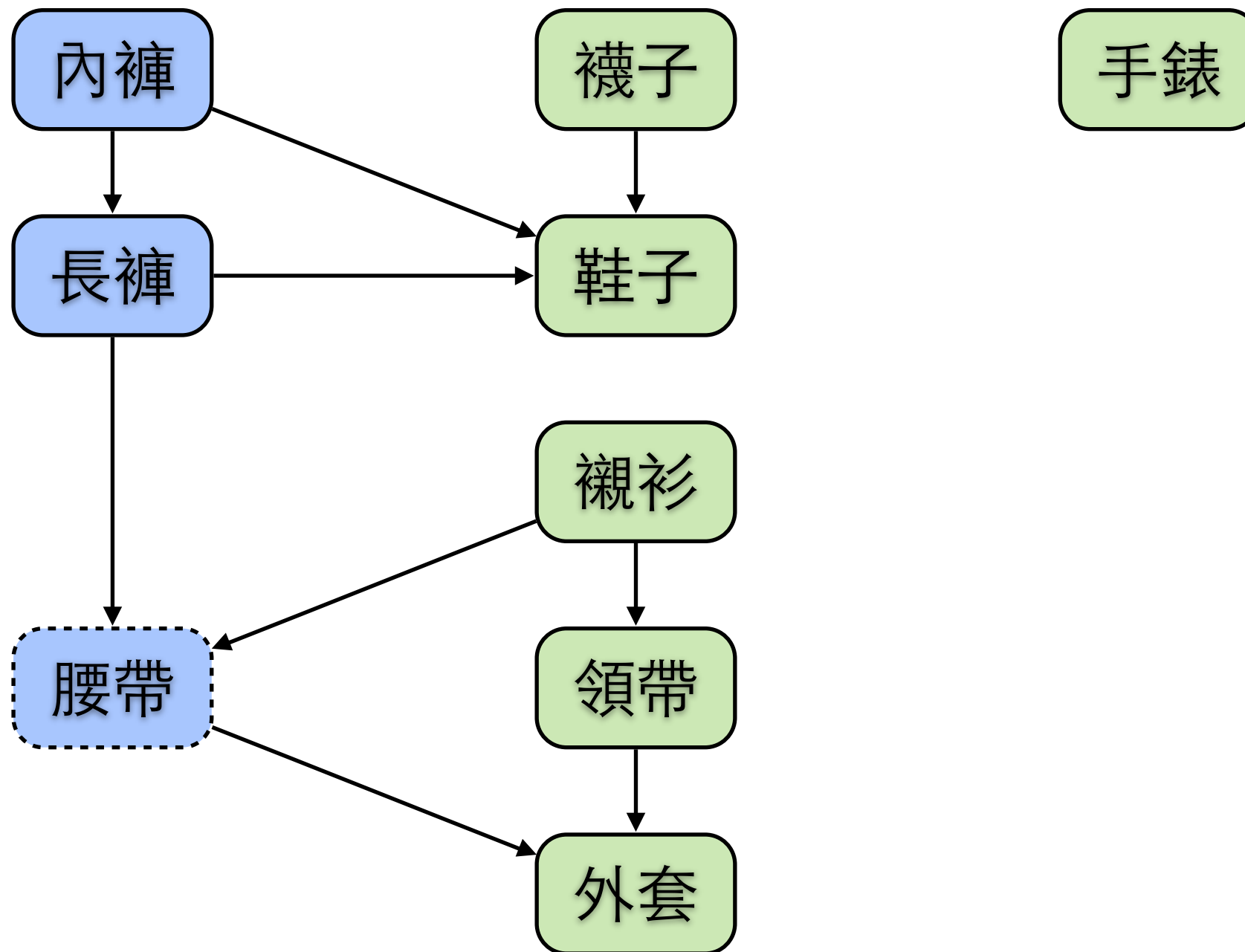
If there is a cycle, and the first discovered vertex is  $u$ , then  $(u,v)$  must be a back edge.

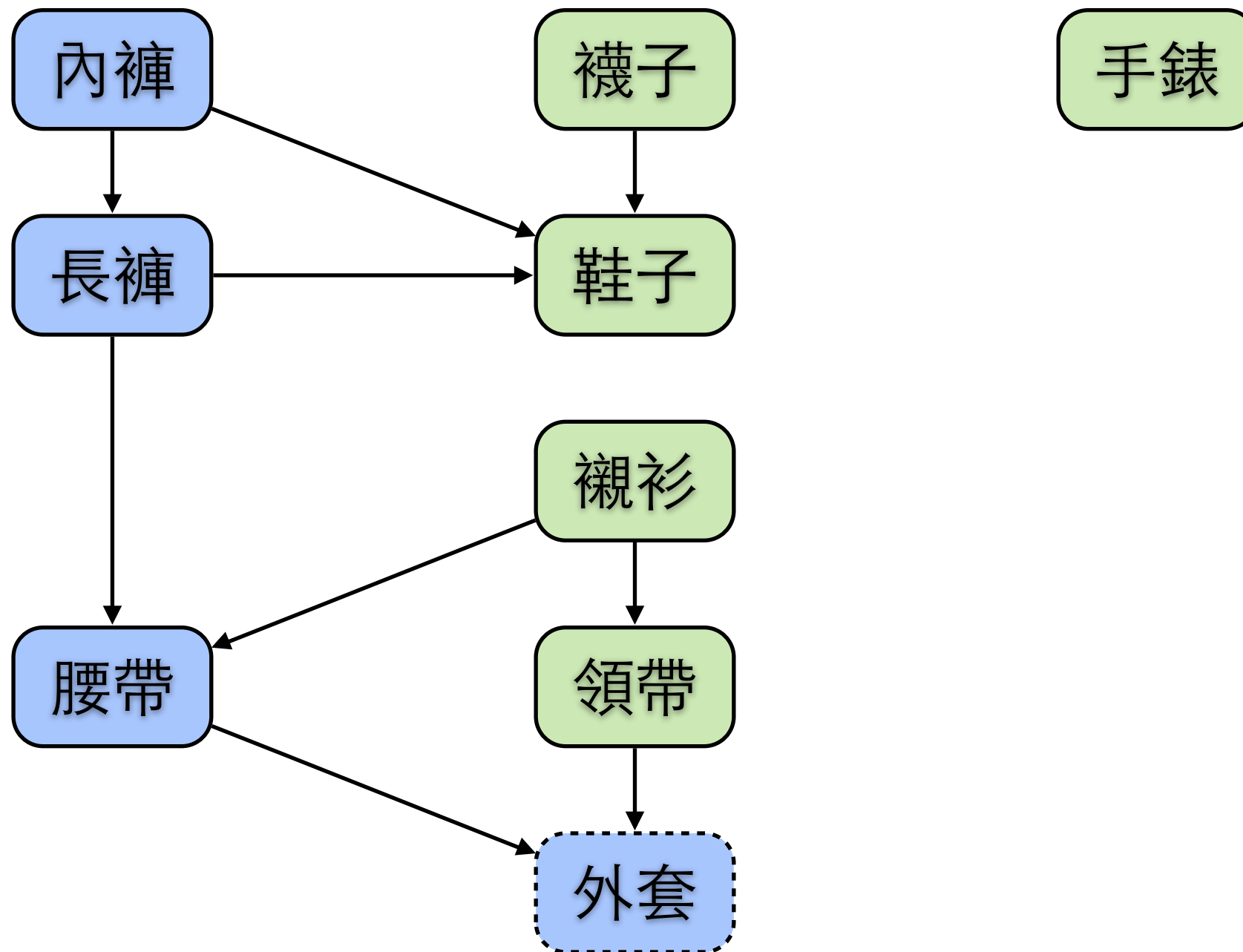
# Topological Sort

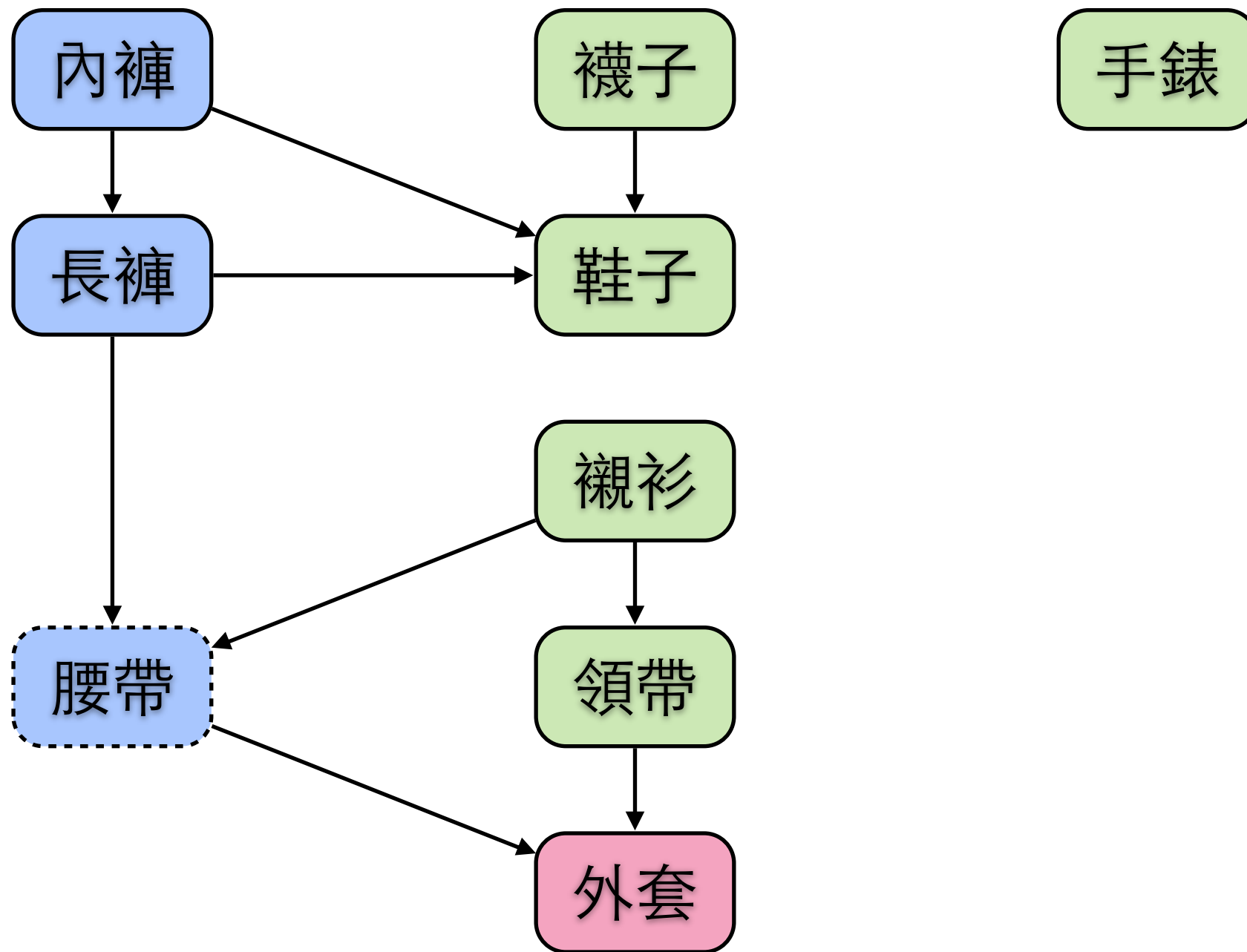
- ▶ A topological sort of a **directed acyclic graph** (DAG)  $G=(V,E)$  is a linear ordering of  $V$  such that if  $G$  contains an edge  $(u,v)$ , then  $u$  appears before  $v$  in the ordering.
- ▶ Algorithm:  **$O(|V|+|E|)$** 
  - ▶ Run DFS on  $G$ . **abort if any back edge exists**
    - ▶ Once a vertex  $v$  is visited, prepend it to a linked list.

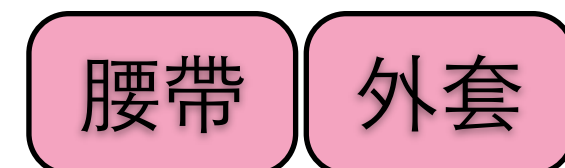
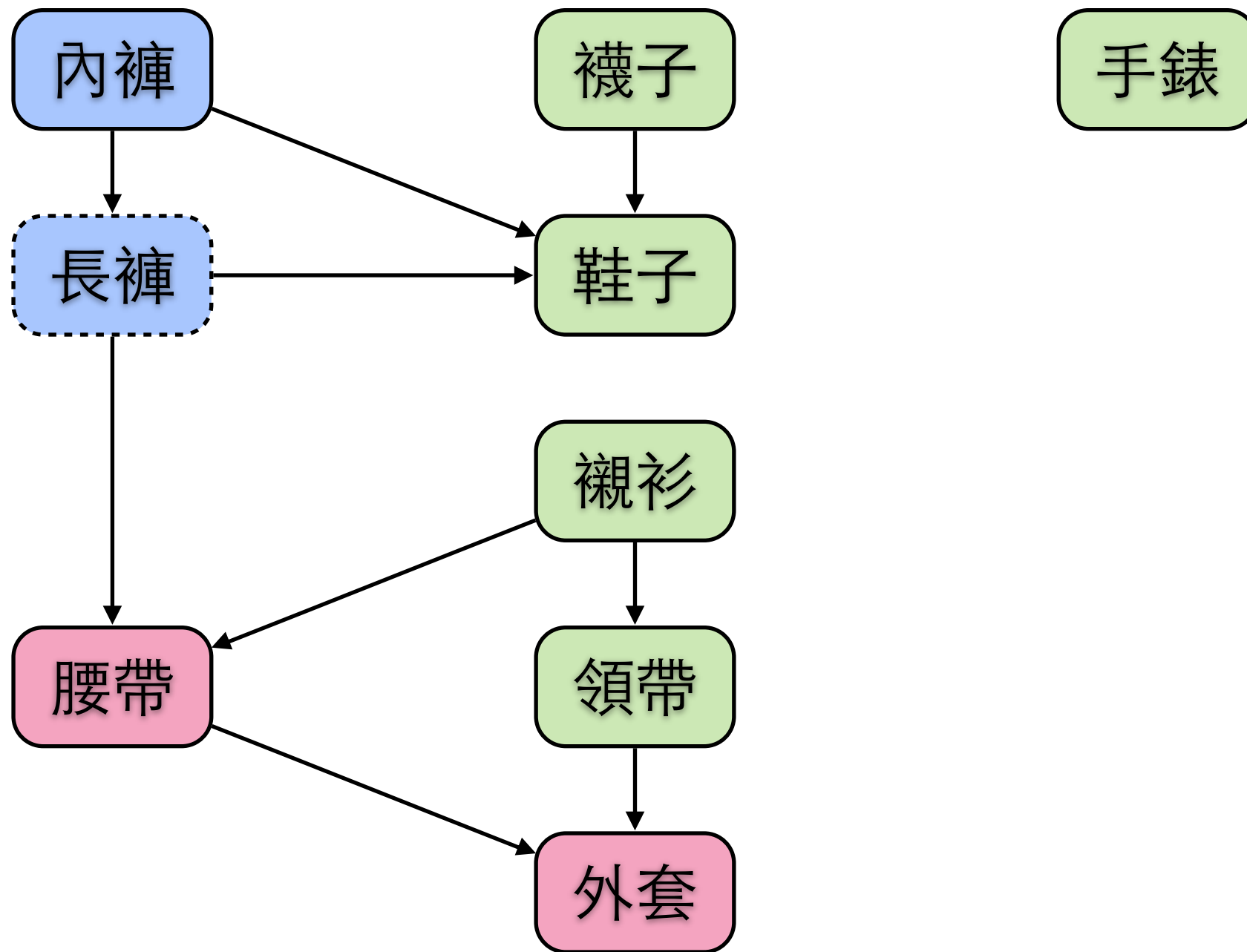




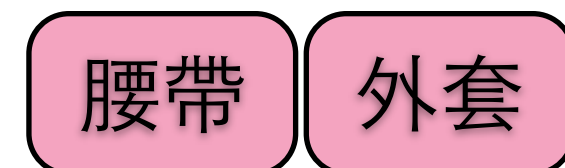
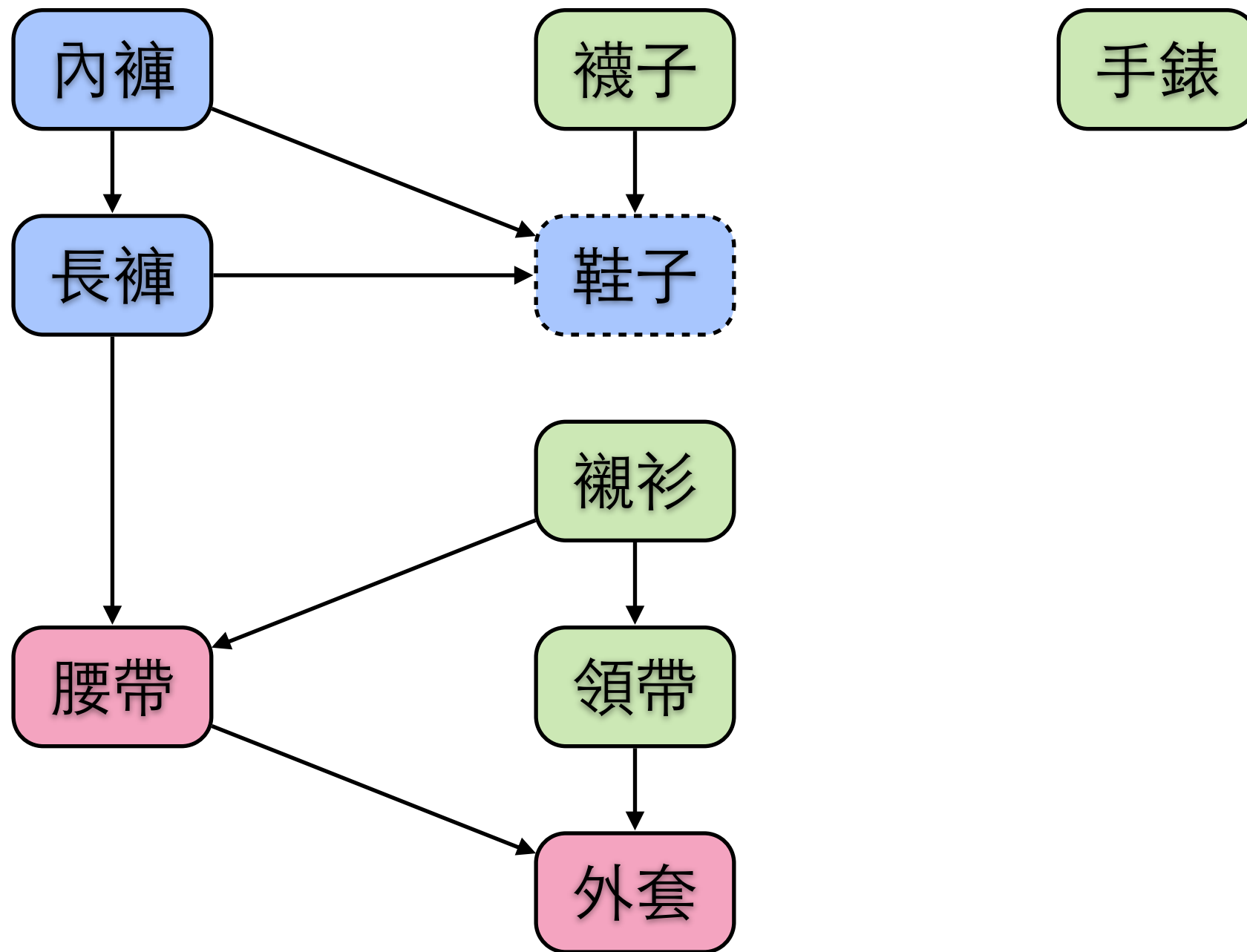


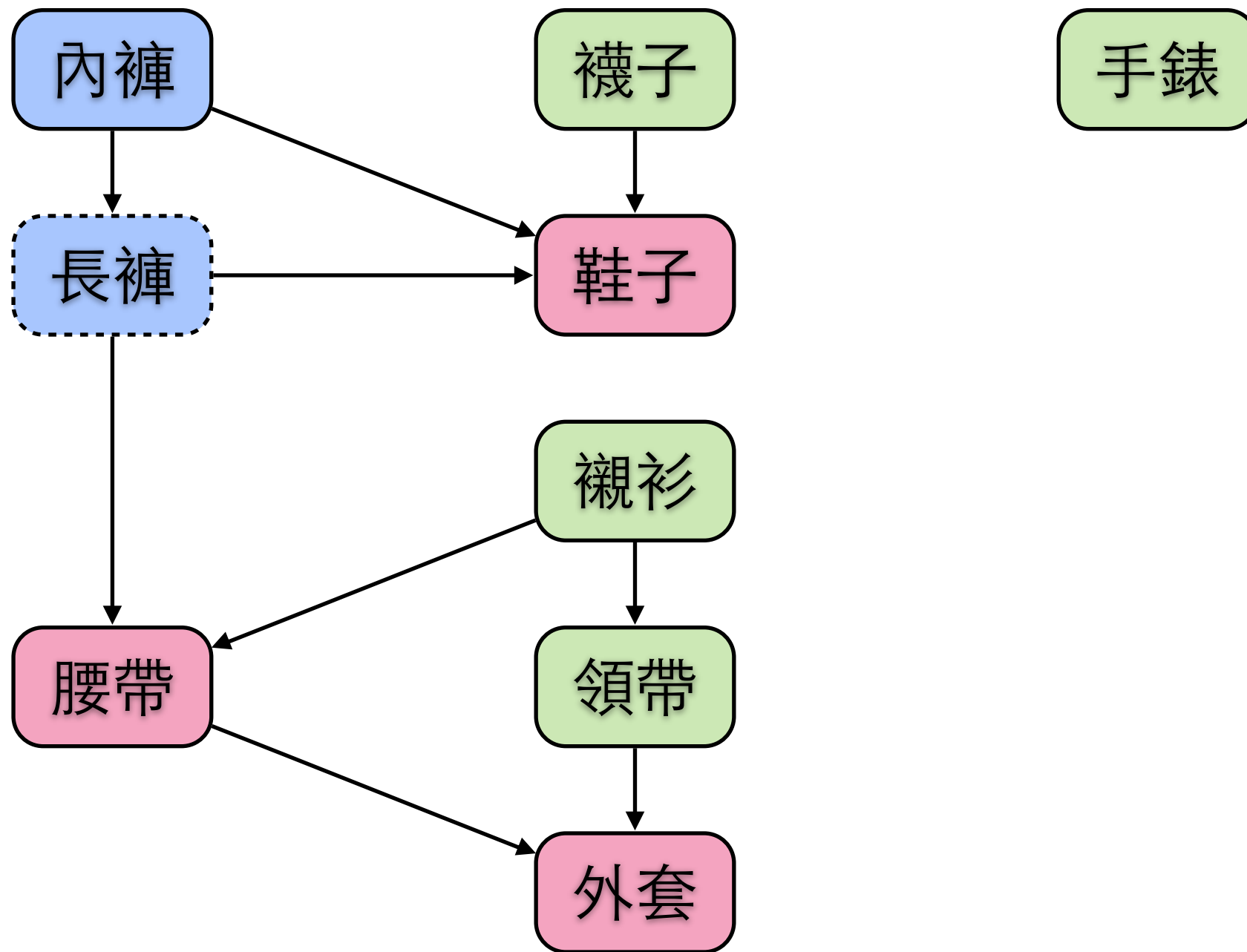


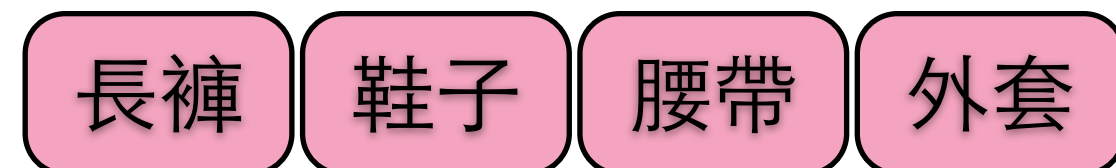
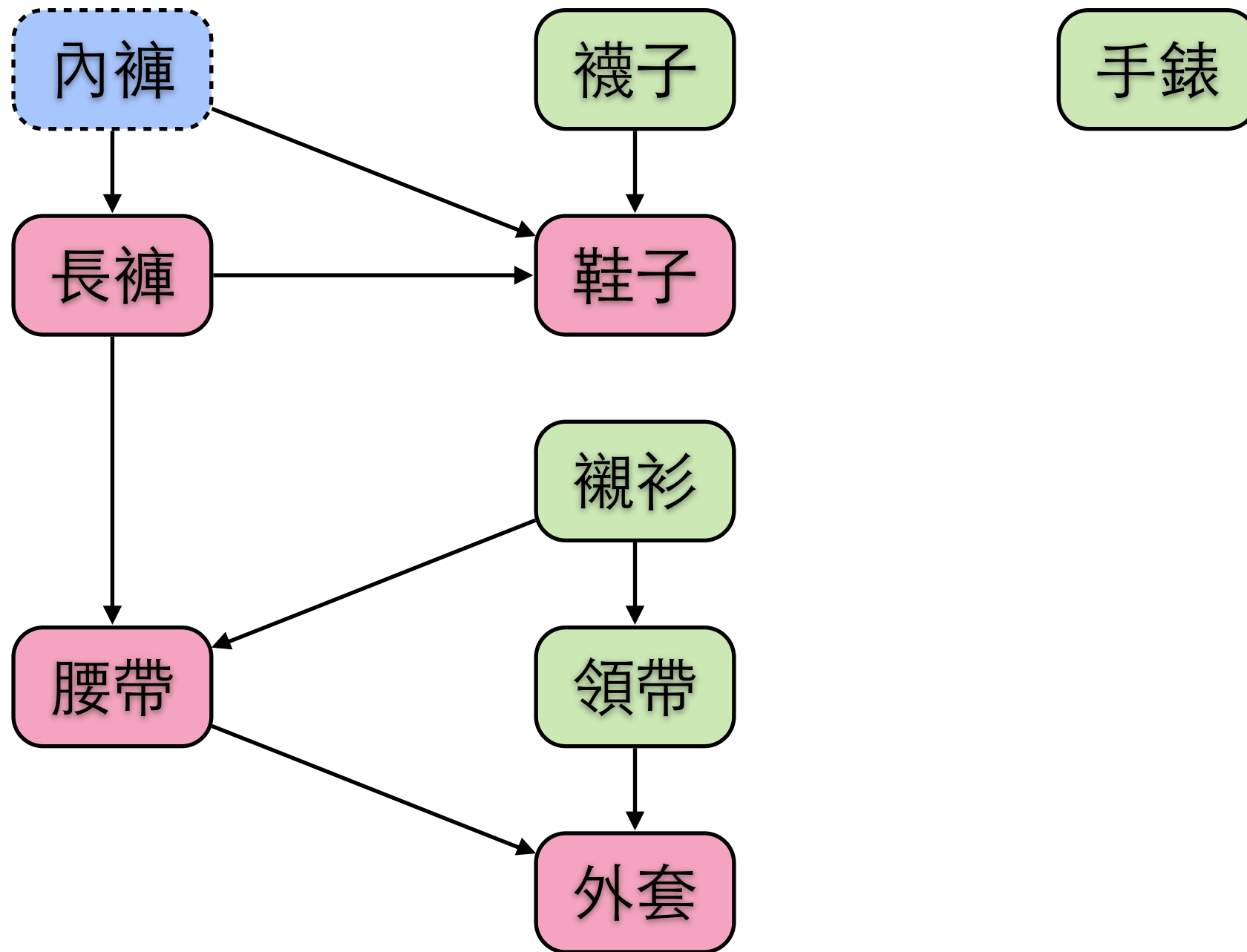


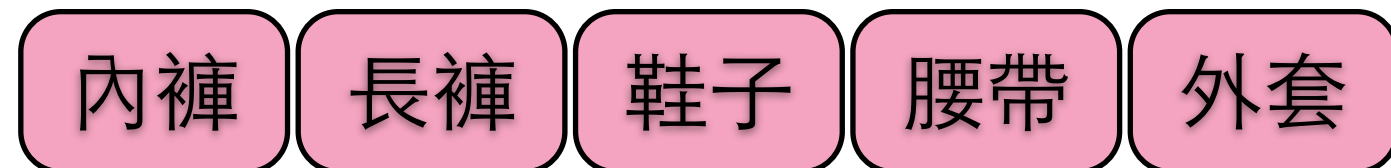
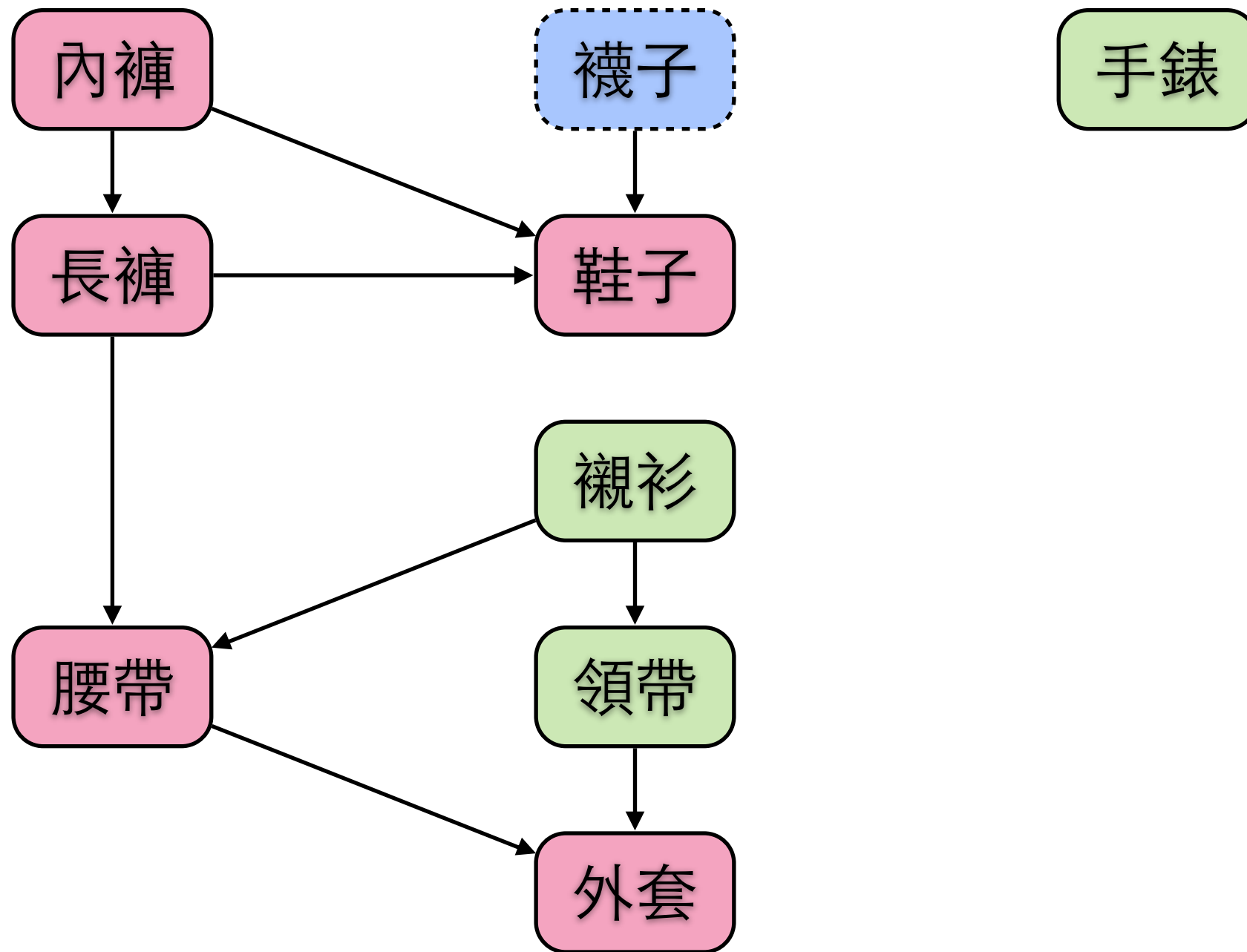


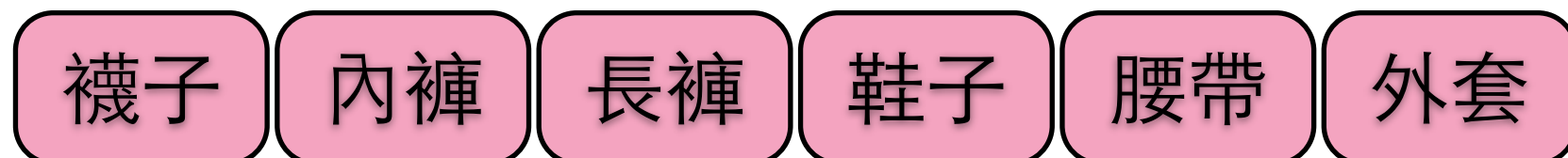
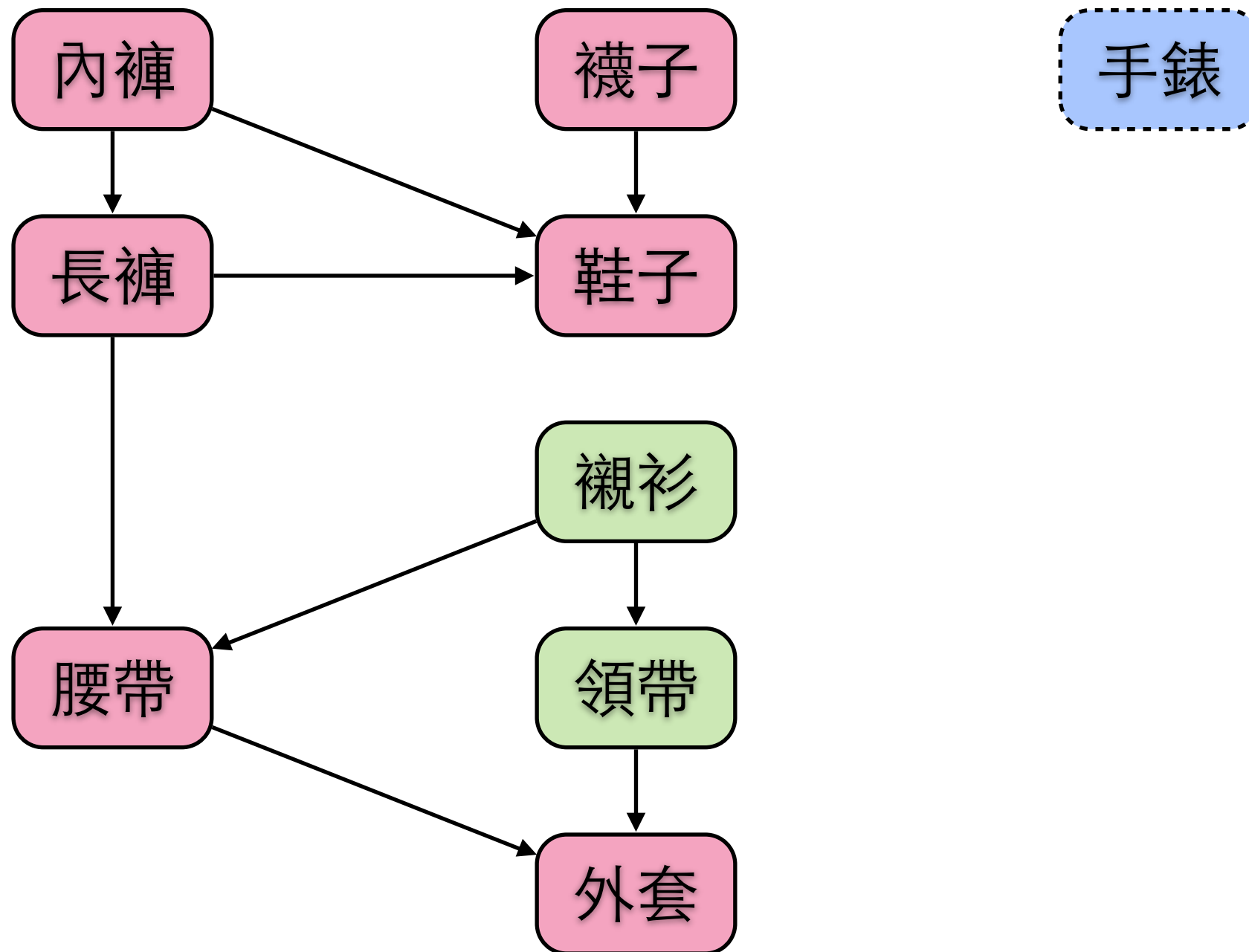


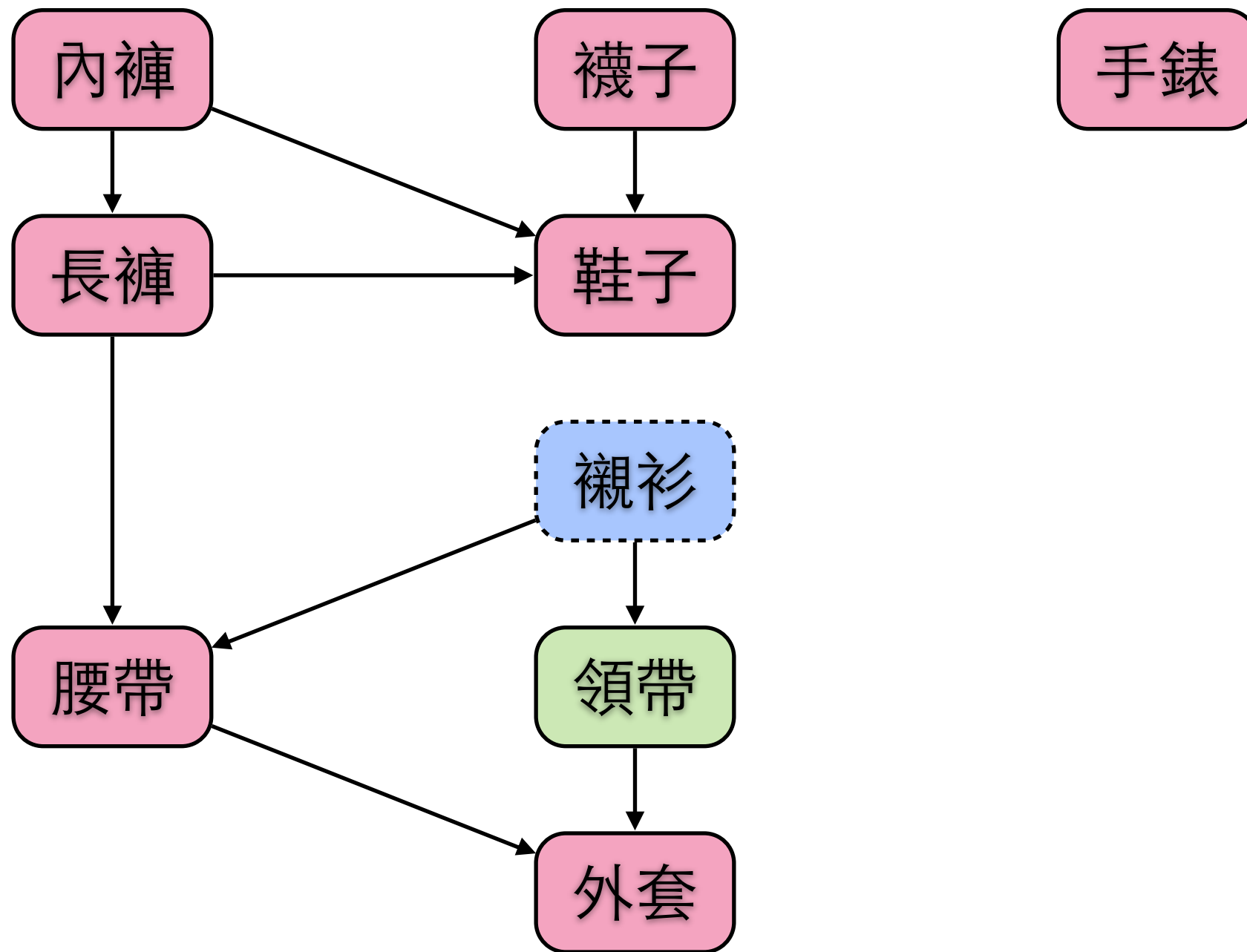


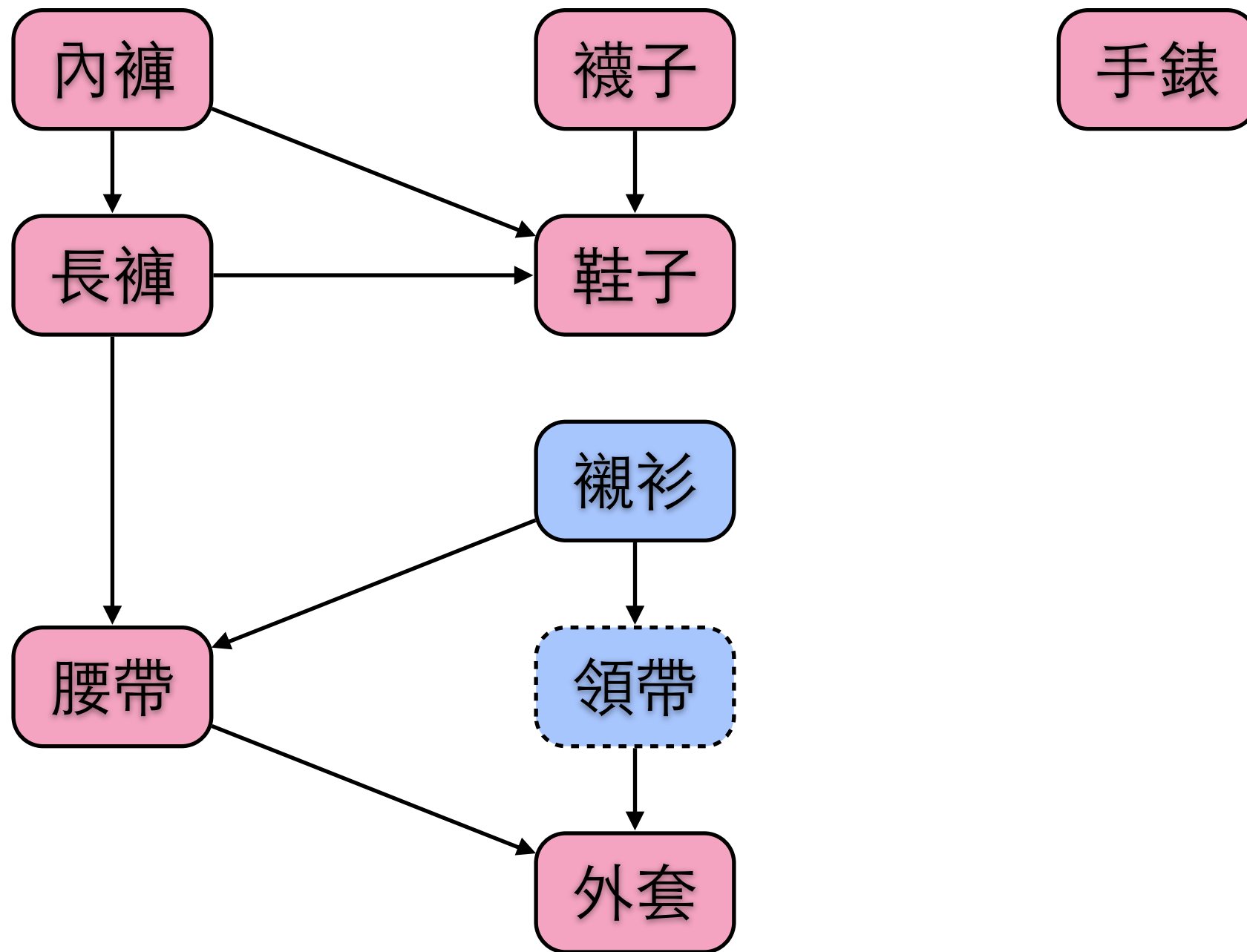


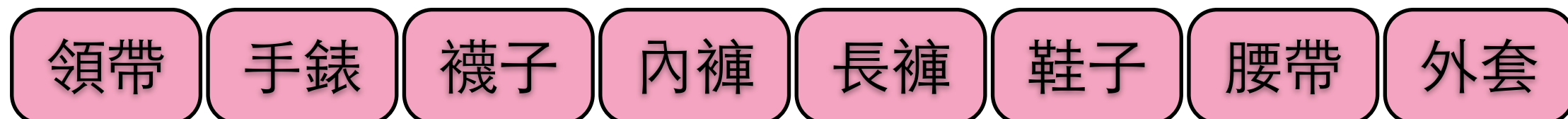
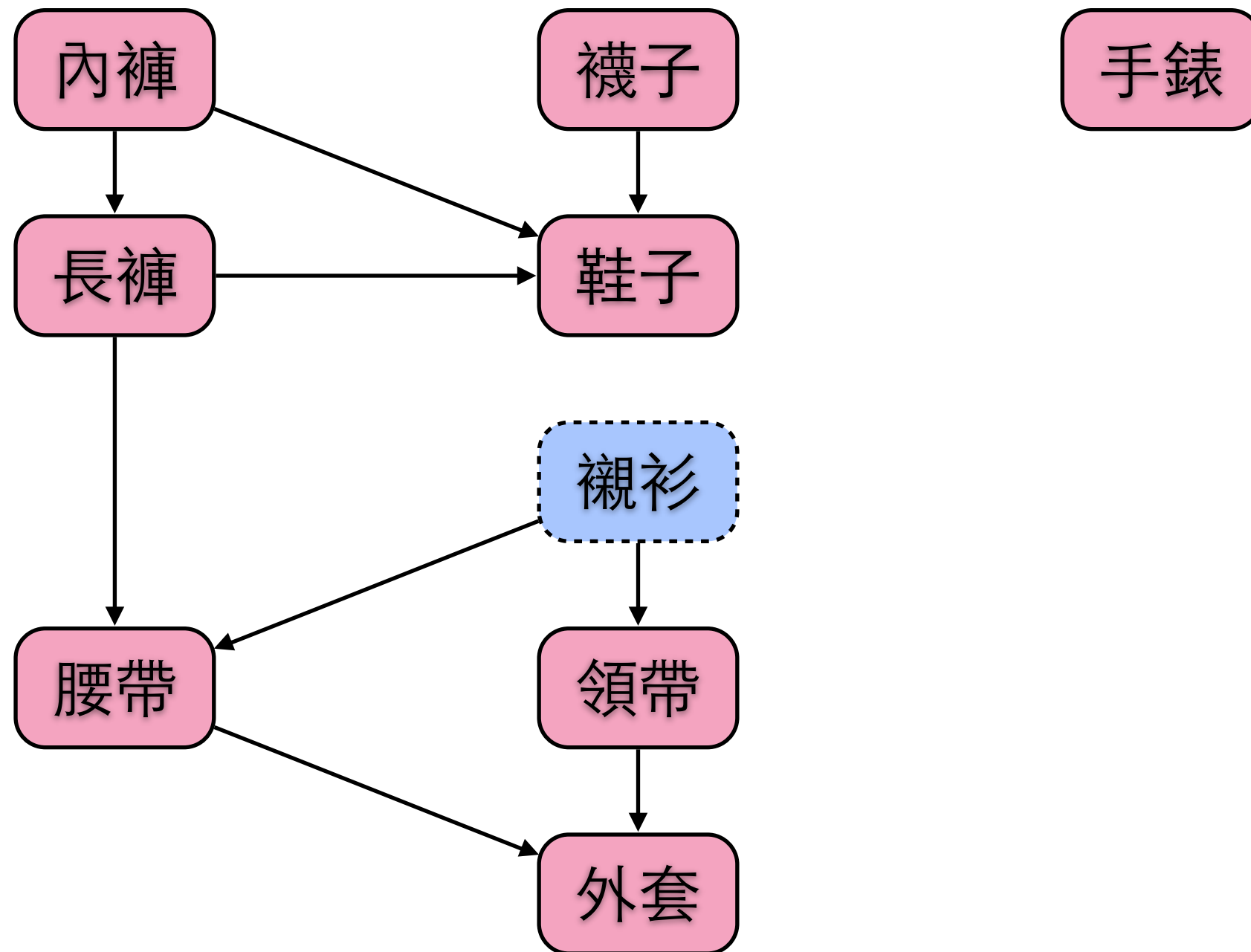




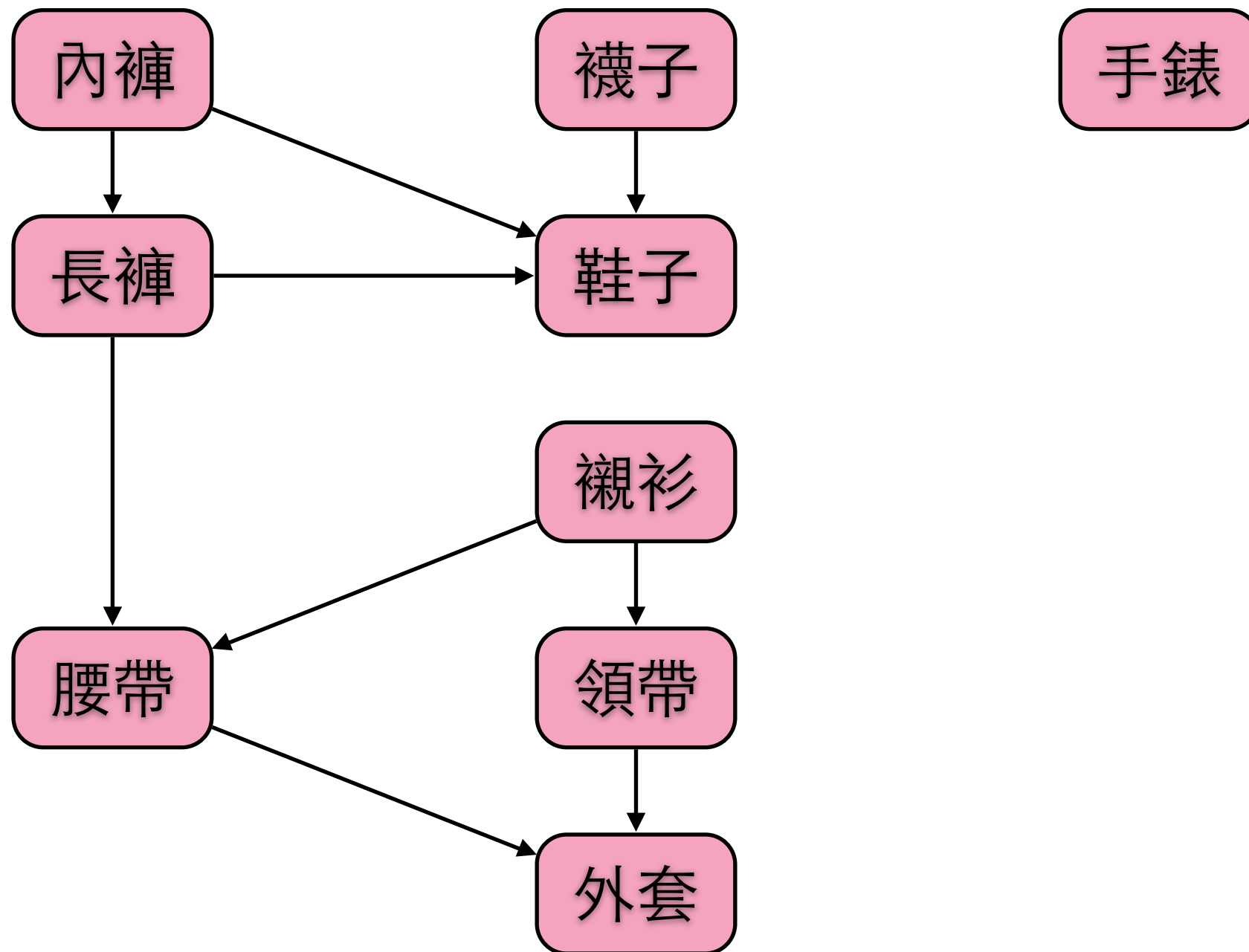








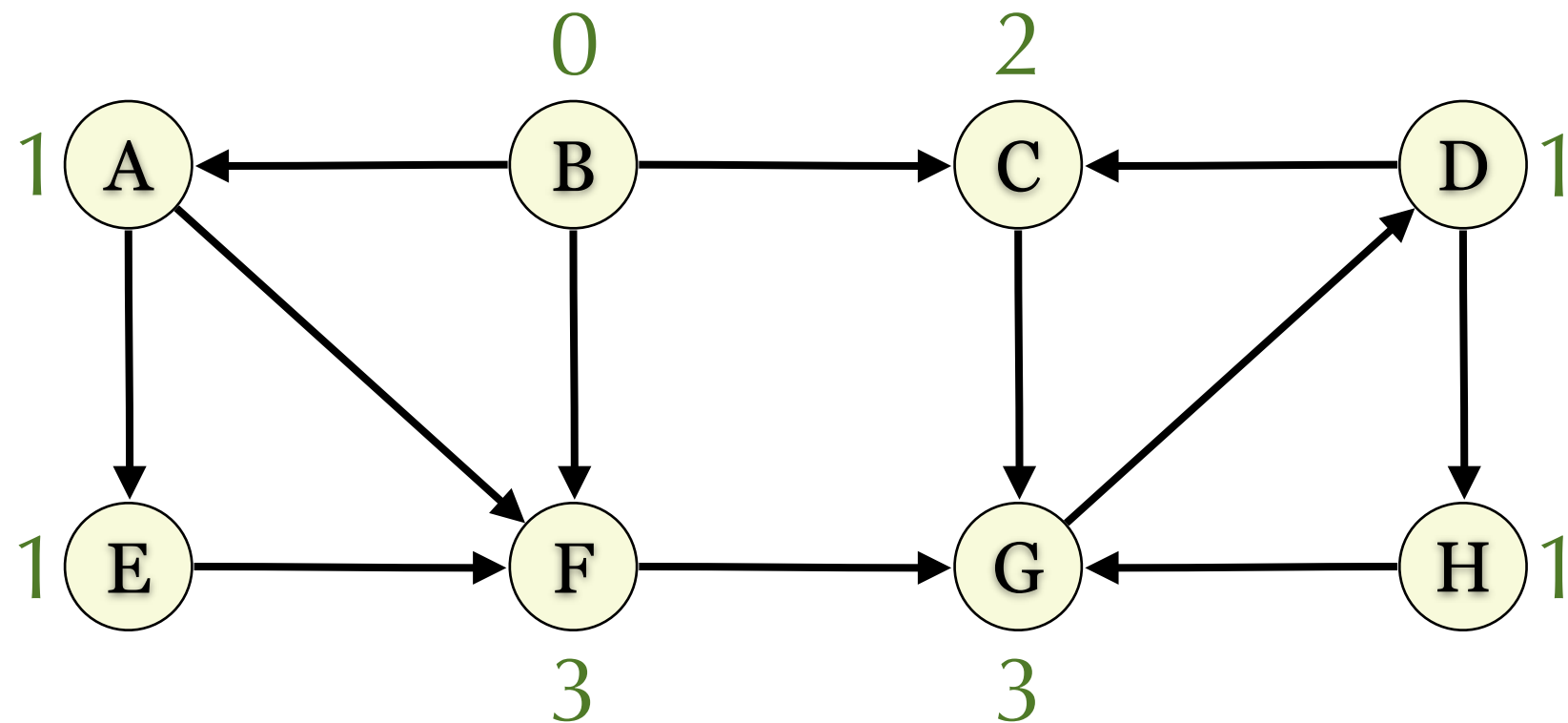




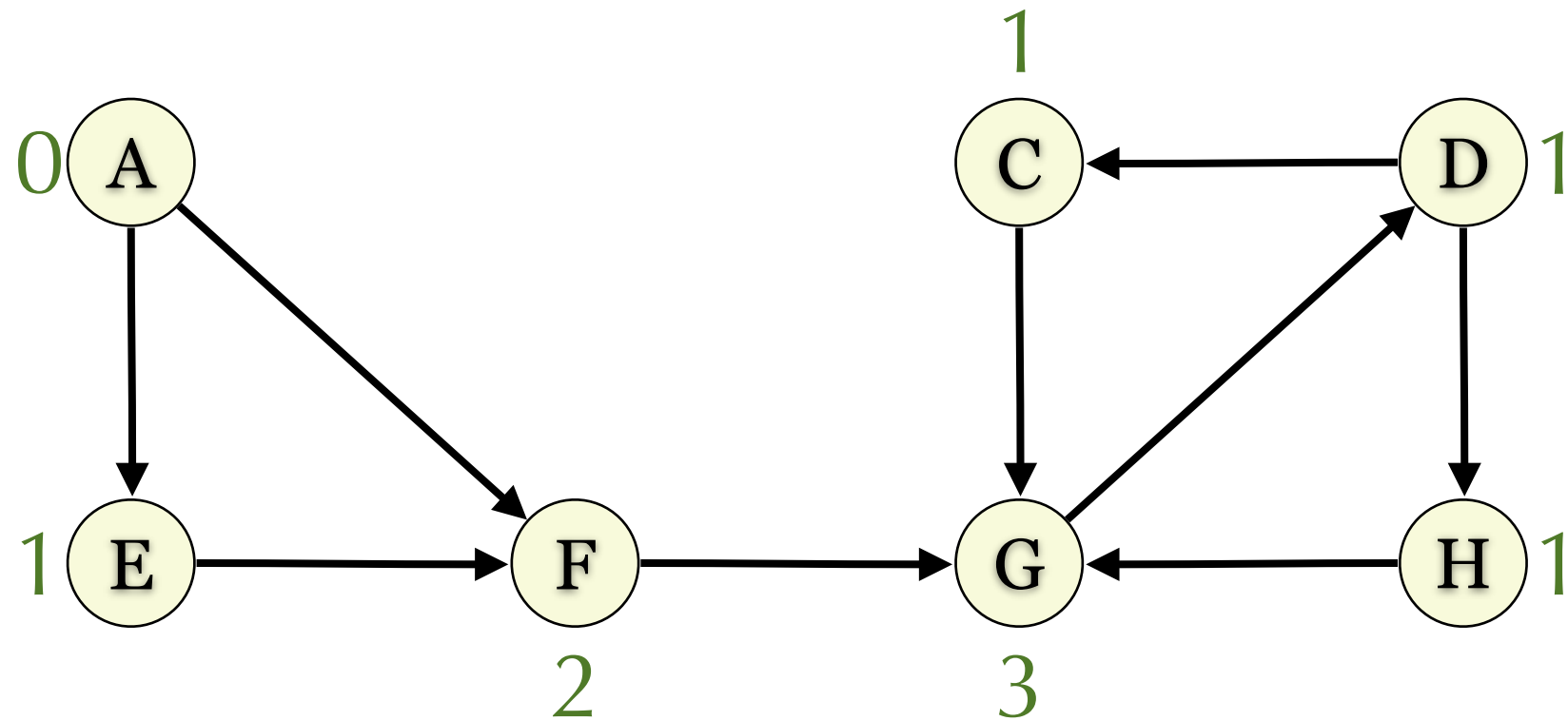
# Alternative Solution

- ▶ Degree of  $v$ : #edge incident to  $v$
- ▶ In-degree of  $v$ :  $|\{(u,v):u \in V\}|$
- ▶ Out-degree of  $v$ :  $|\{(v,u):u \in V\}|$
- ▶ Idea: Repeat to remove a vertex whose in-degree is 0.
- ▶ If there are no vertices left, then it is a DAG, and we removed the vertices in topological order.

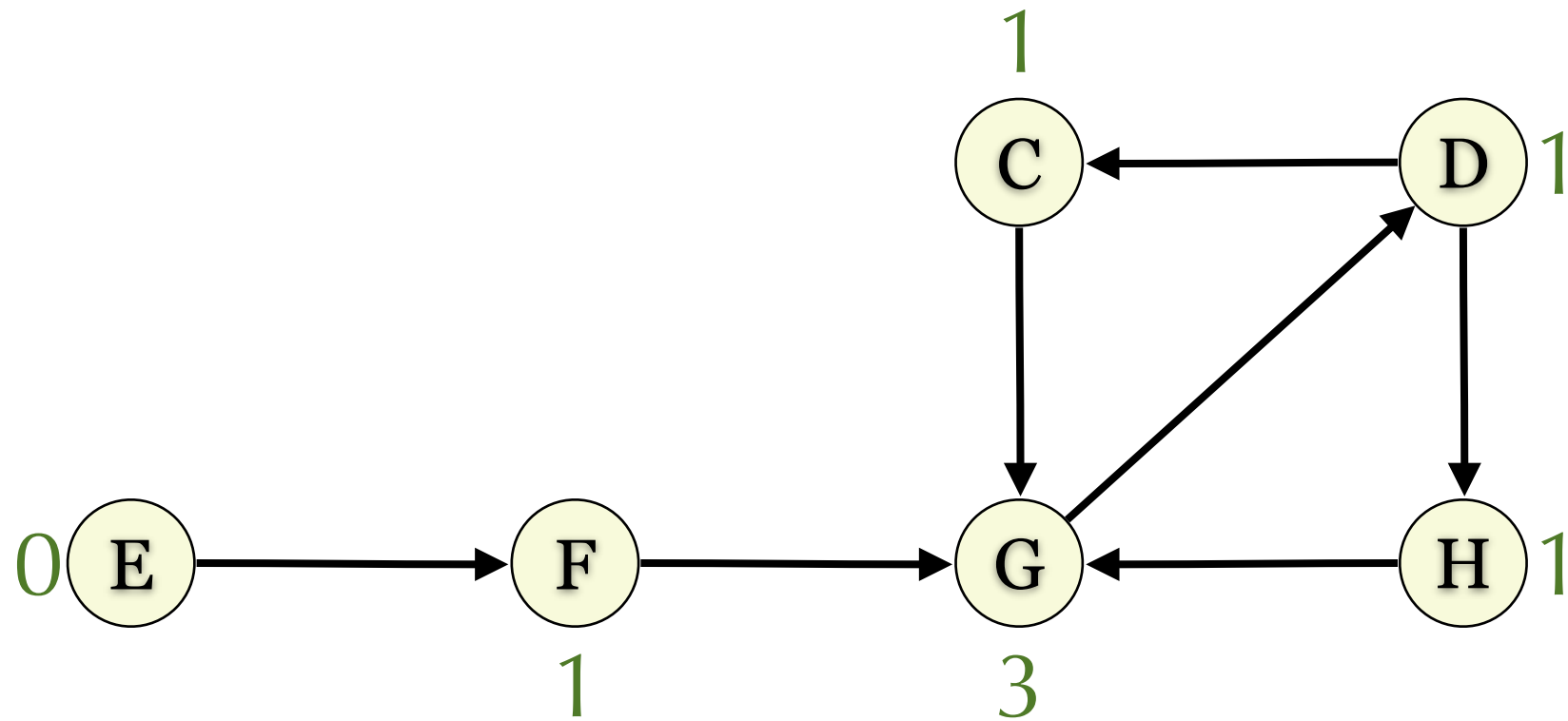
# Cycle Detection



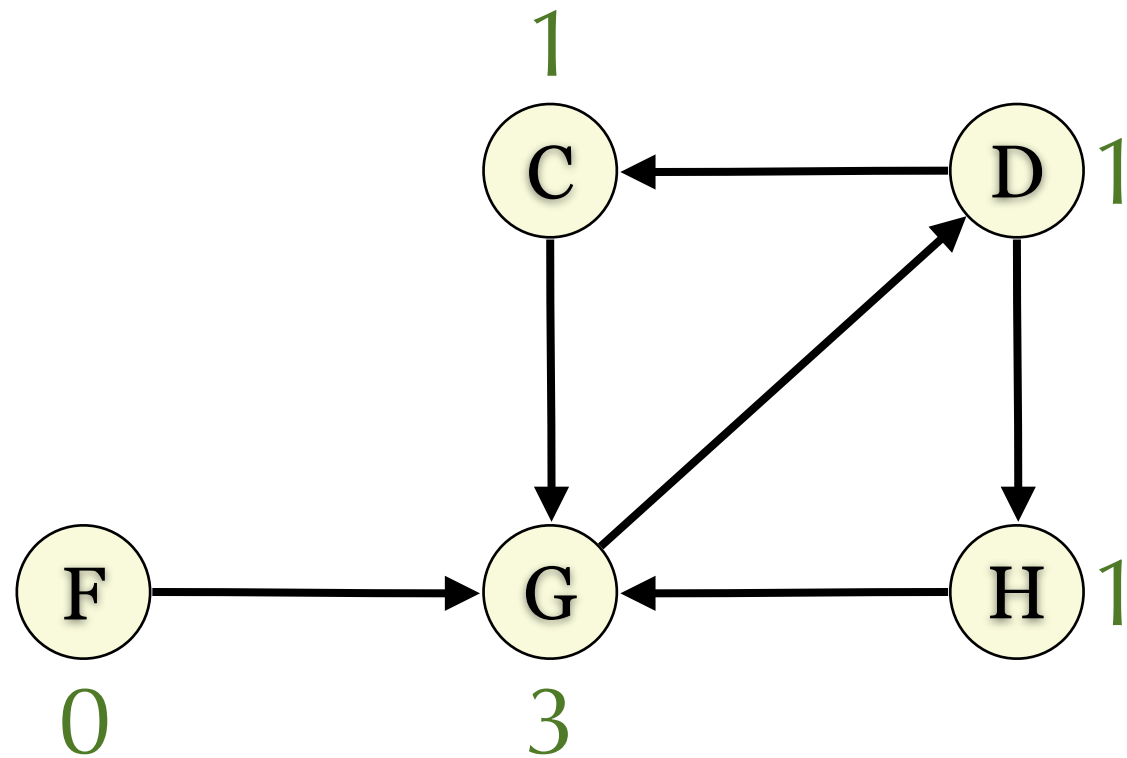
# Cycle Detection



# Cycle Detection

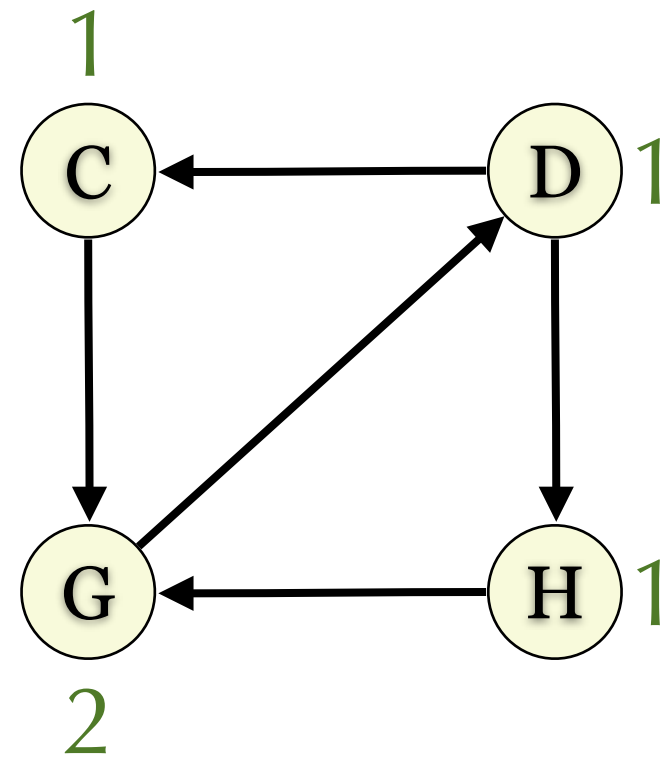


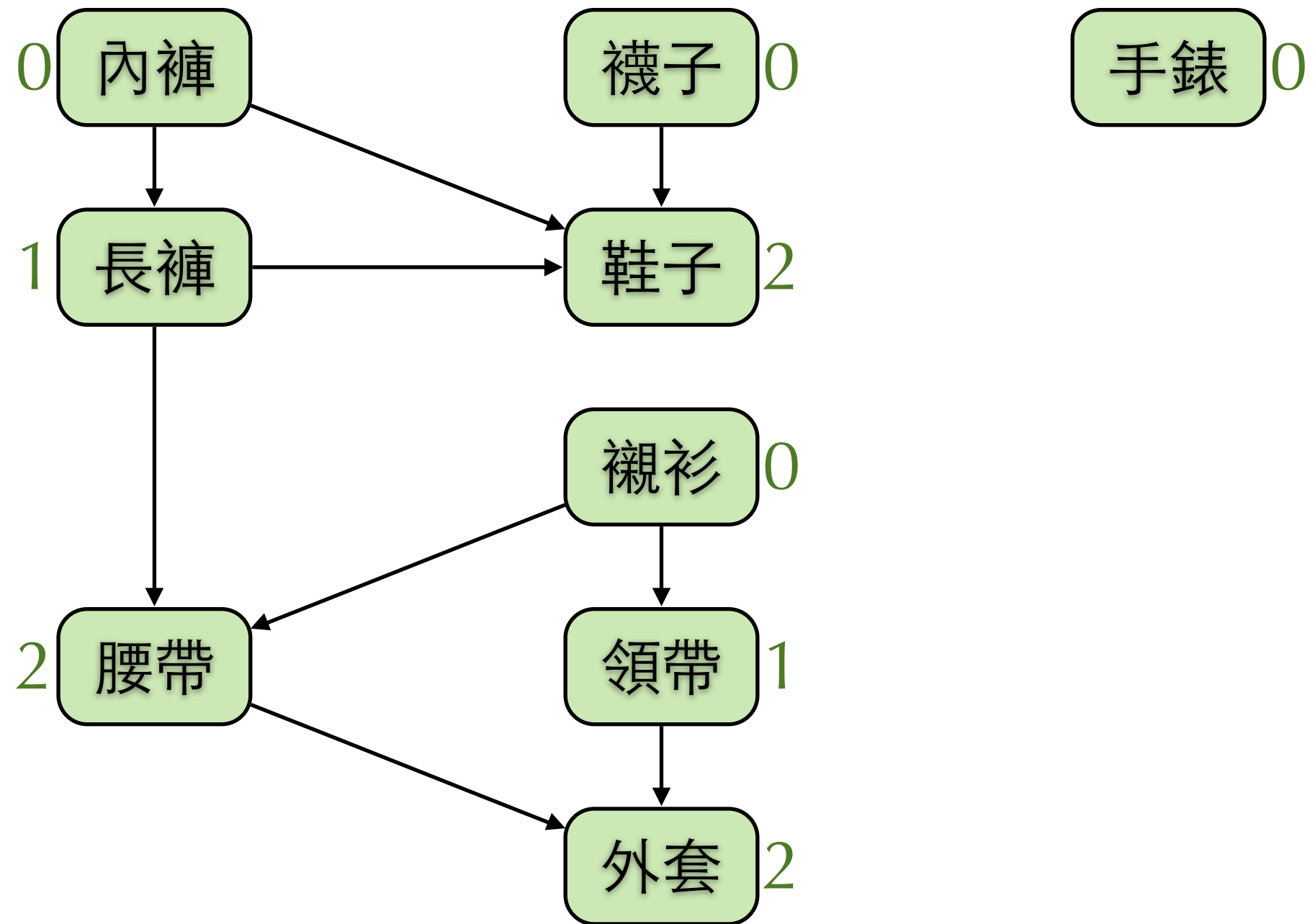
# Cycle Detection



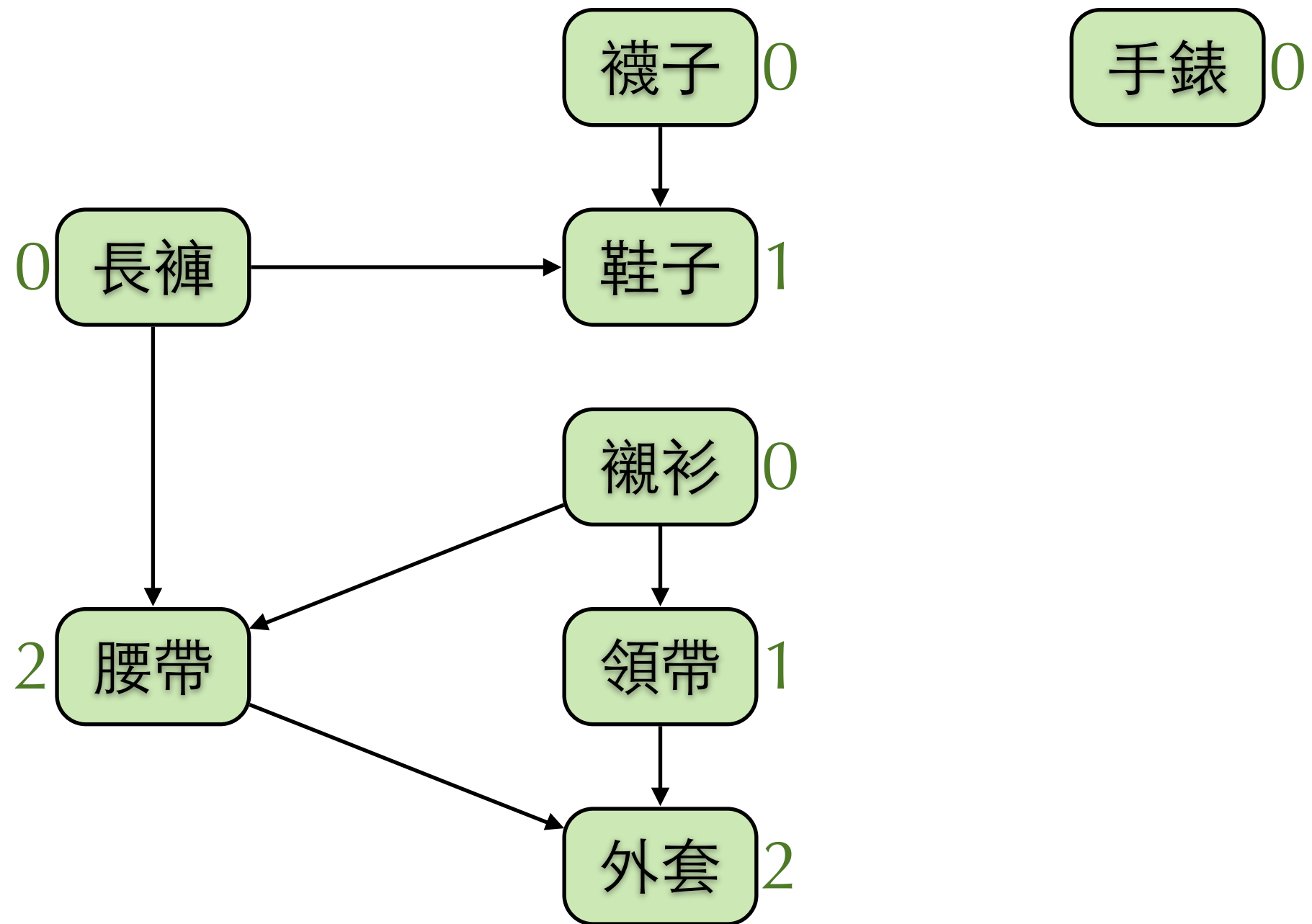
# Cycle Detection

Cycle detected!



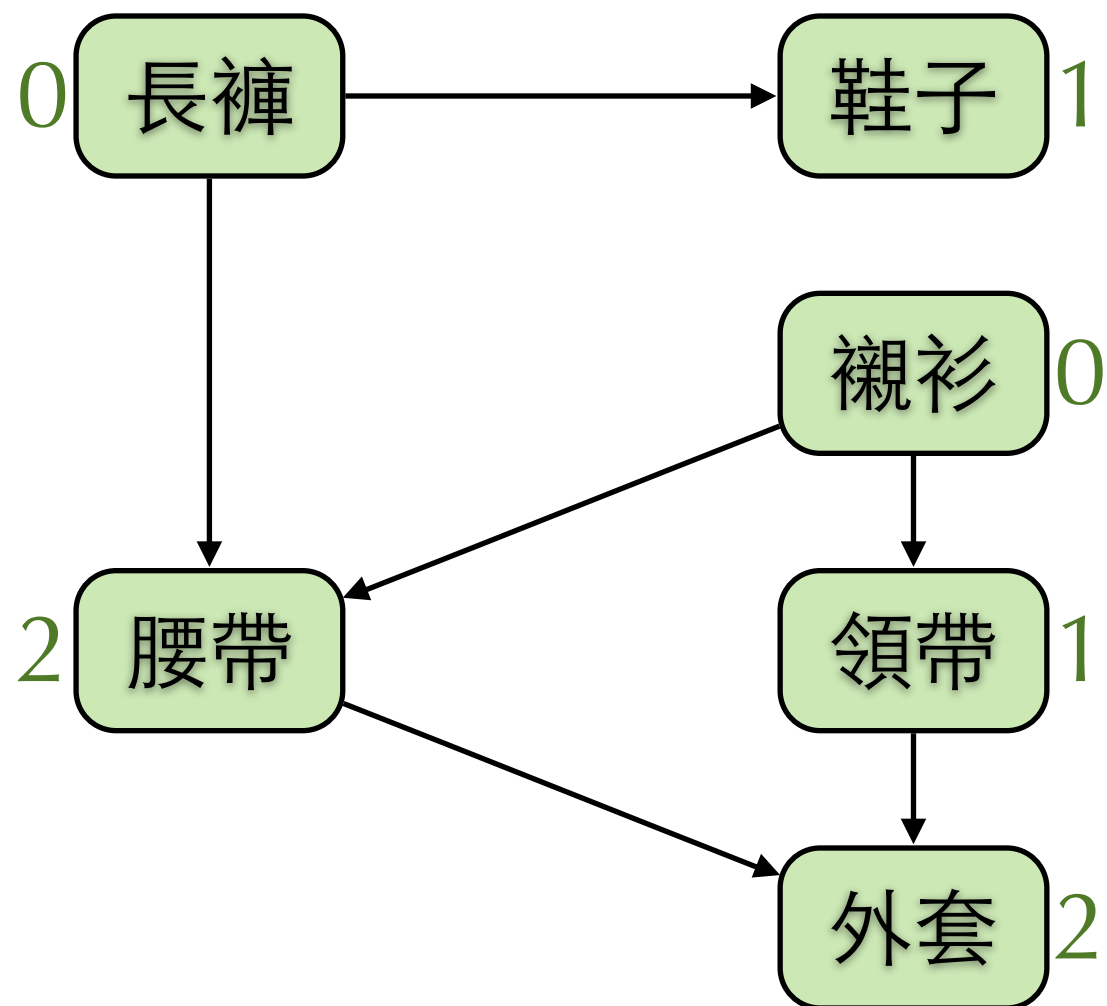




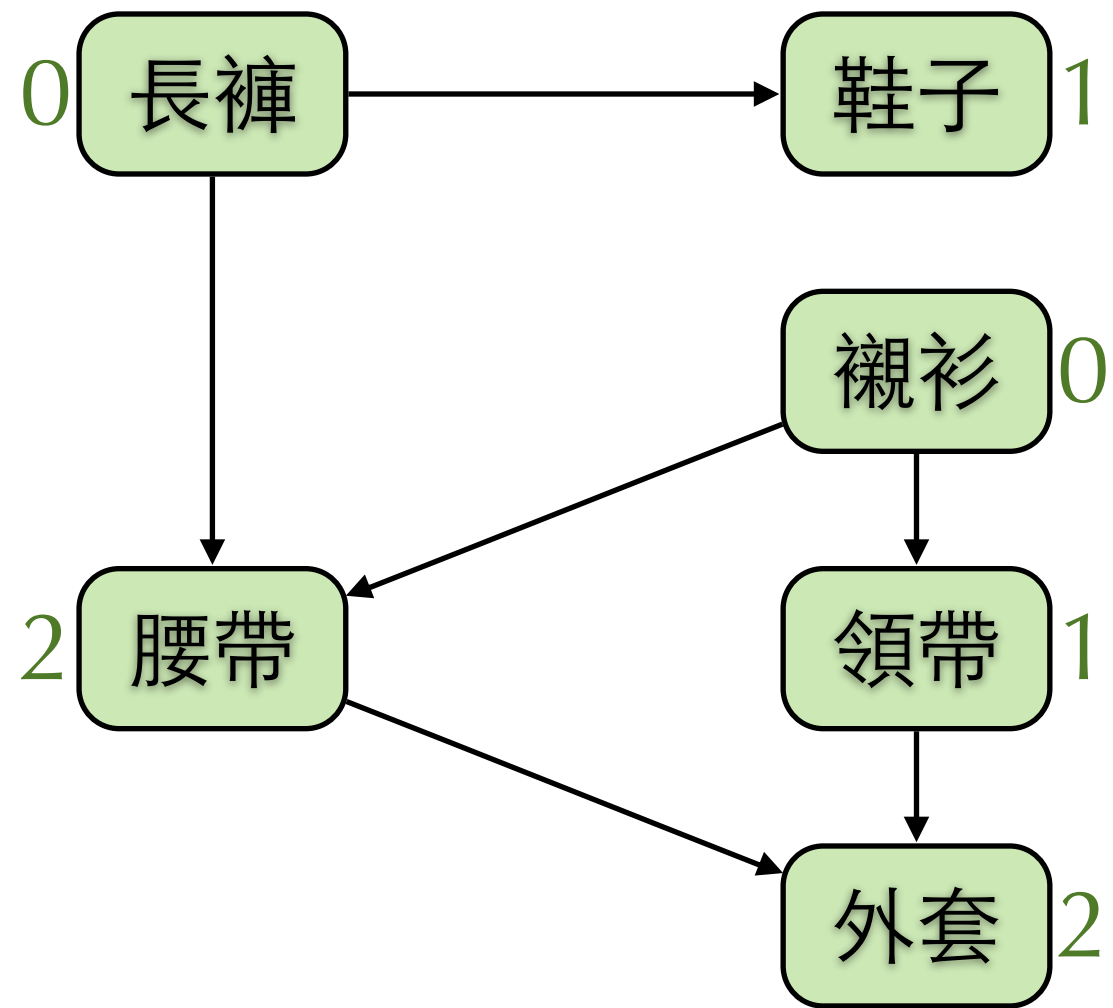


內褲

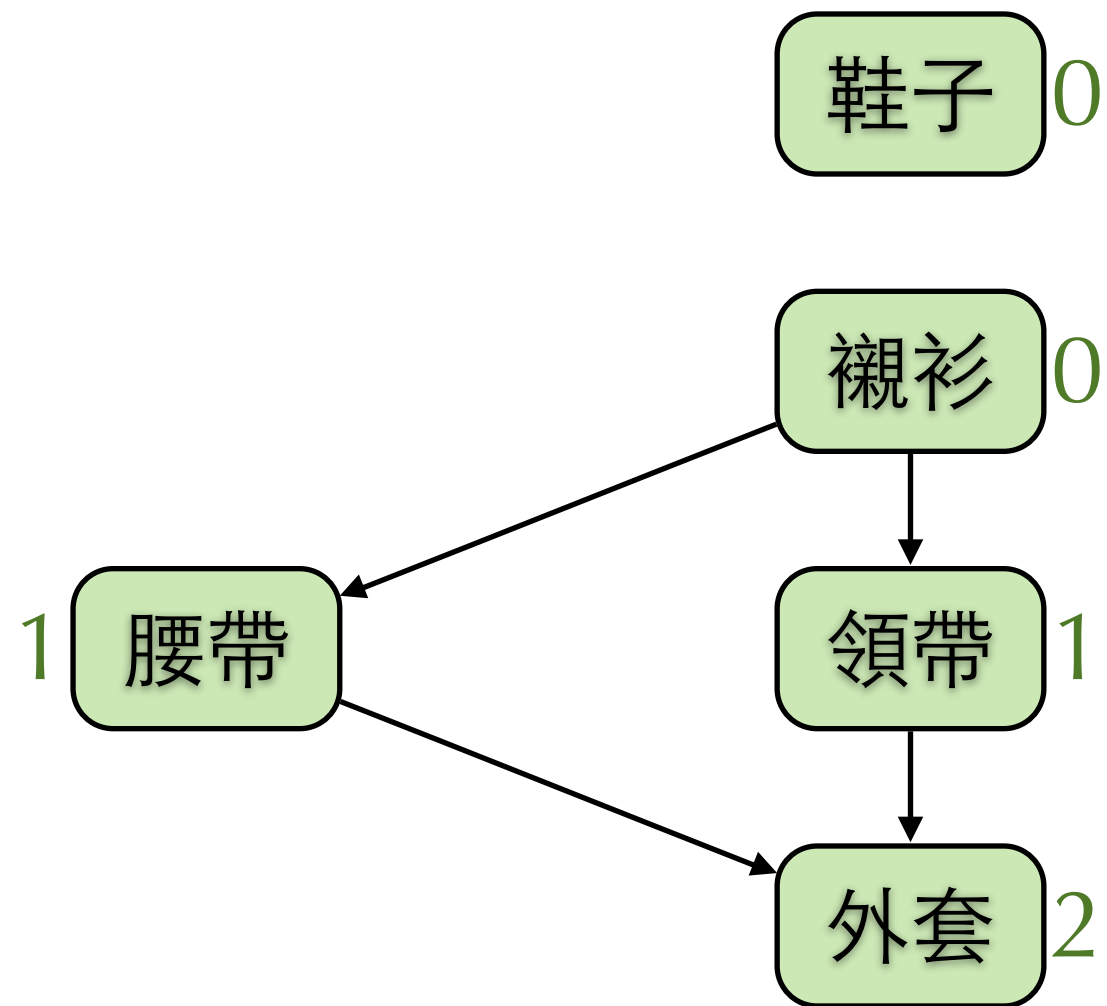
手錶 0



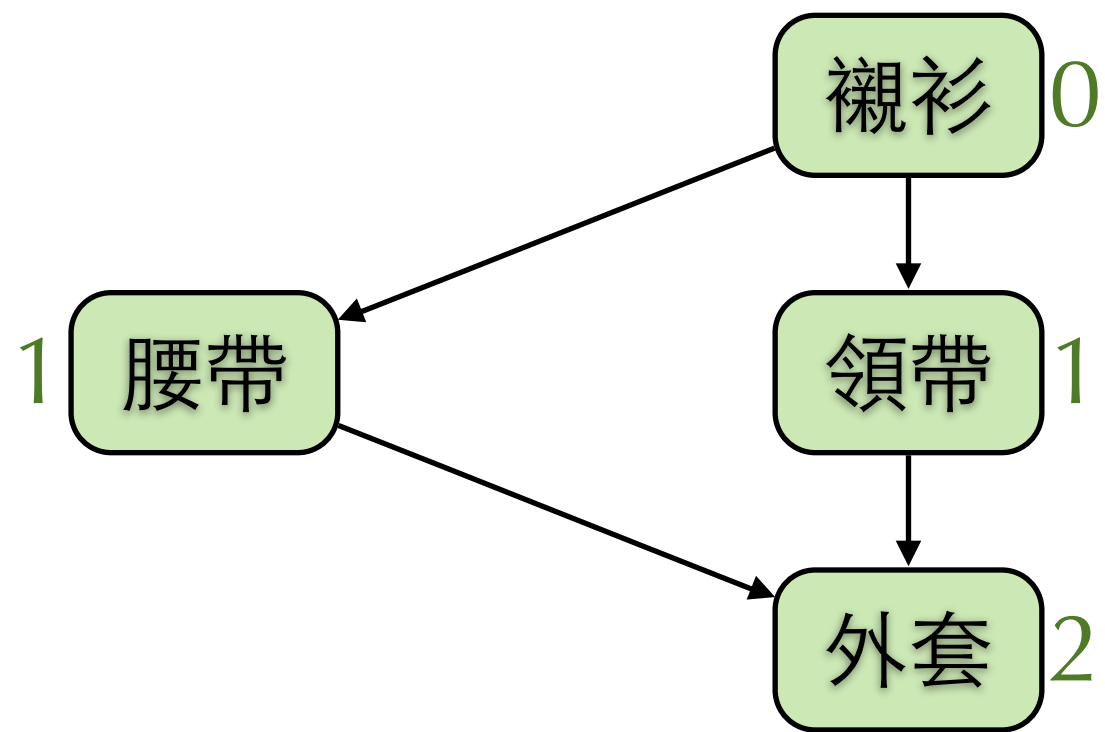
內褲 襪子

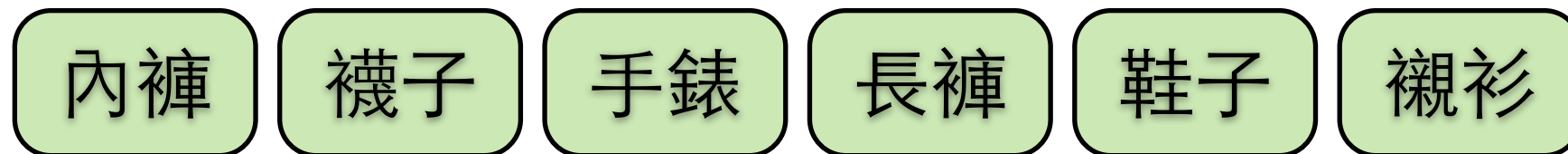
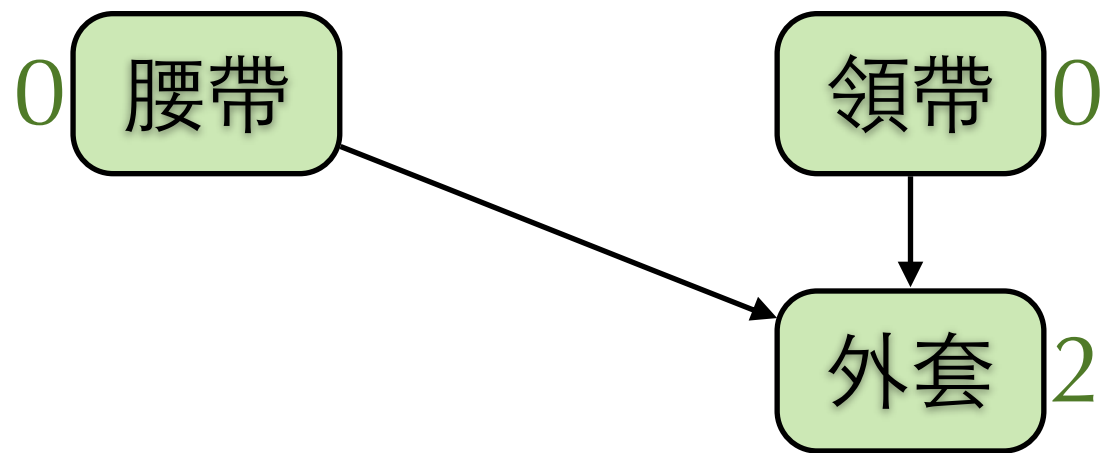


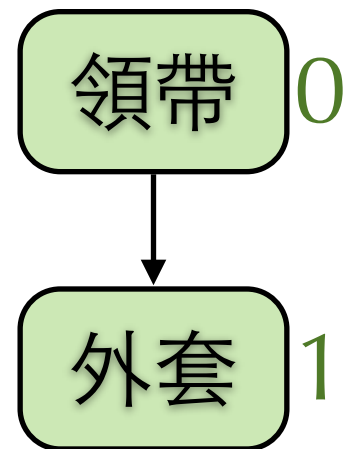
內褲 襪子 手錶



內褲 襪子 手錶 長褲







外套 0

內褲

襪子

手錶

長褲

鞋子

襯衫

腰帶

領帶



內褲

襪子

手錶

長褲

鞋子

襯衫

腰帶

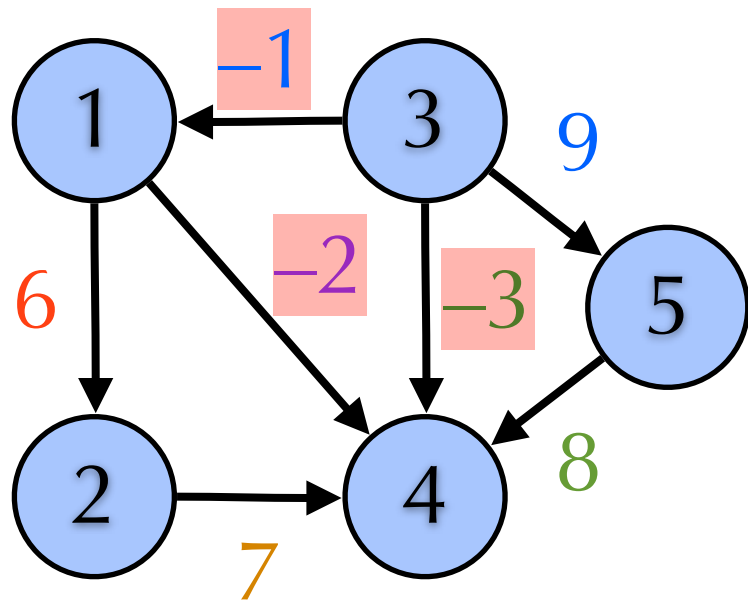
領帶

外套

# Shortest Paths

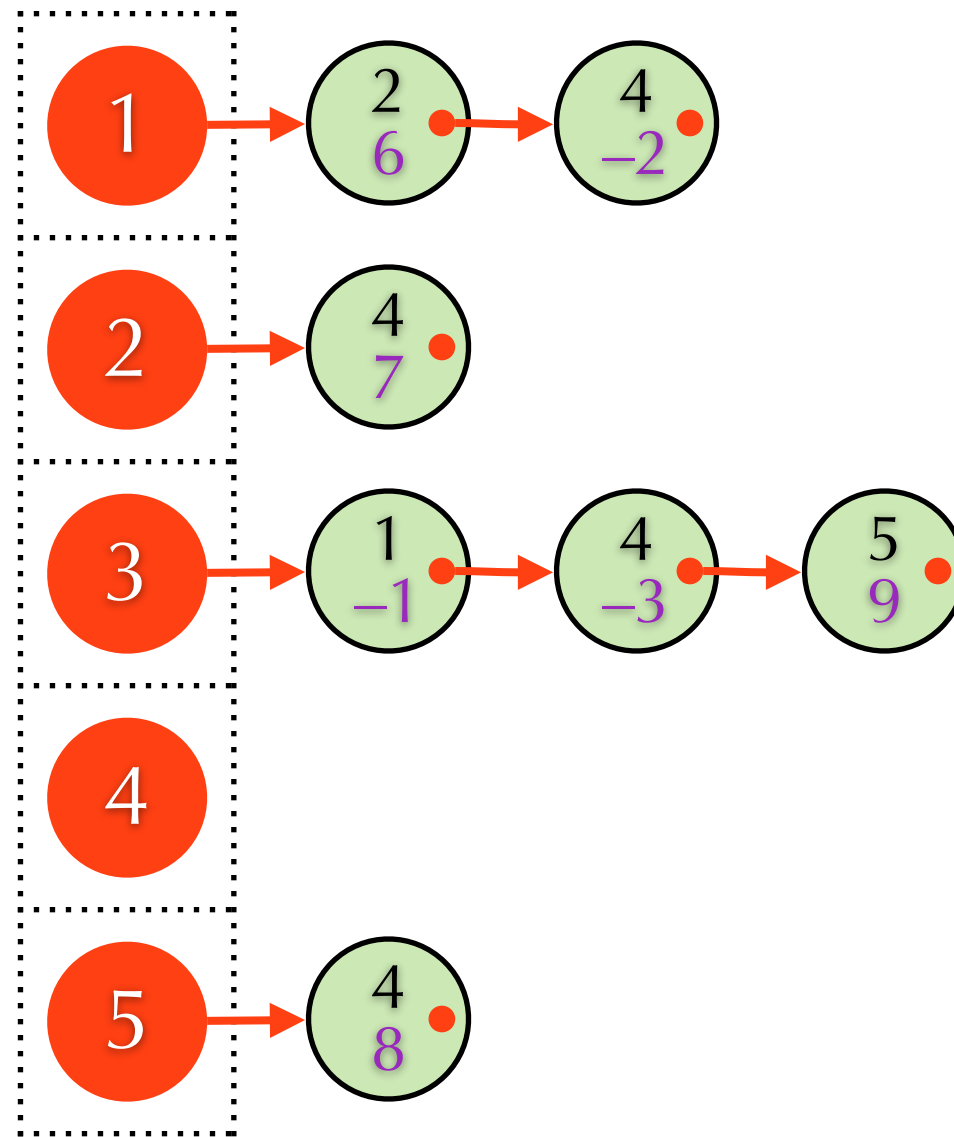
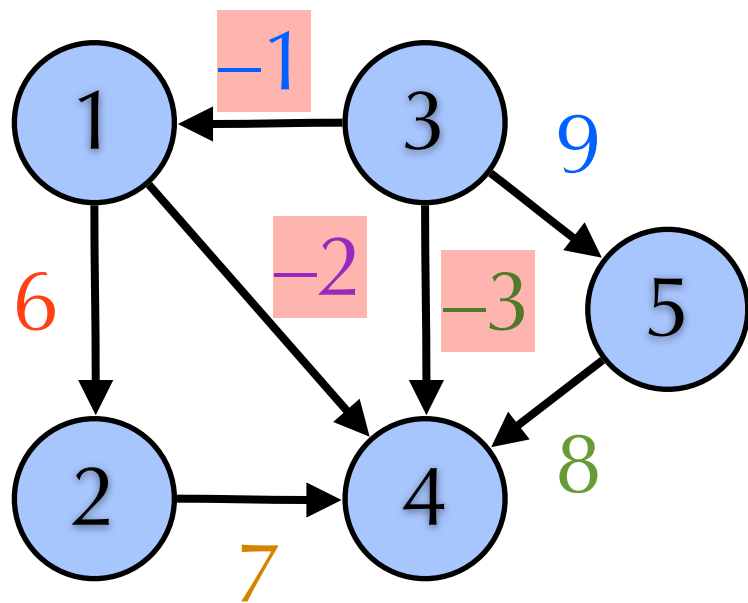
- ▶ Weighted graph  $G=(V,E)$  with weight  $w$ 
  - ▶  $V$ : set of vertices
  - ▶  $E$ : set of edges **directed**
  - ▶  $w: E \rightarrow \mathbb{R}$  **can be generalized to paths**
    - ▶ Weight of path  $p=\langle v_0, v_1, \dots, v_k \rangle$ :  
 $w(p) = \sum_{1 \leq i \leq k} w(v_{i-1}, v_i)$
- ▶  $\delta(u, v) = \min_{p: u \rightsquigarrow v} w(p)$  **no path:  $\delta(u, v) = \infty$**
- ▶ Goal: Compute  $\delta(u, v)$

# Weighted Adjacency Matrix



	1	2	3	4	5
1	0	6	$\infty$	-2	$\infty$
2	$\infty$	0	$\infty$	7	$\infty$
3	-1	$\infty$	0	-3	9
4	$\infty$	$\infty$	$\infty$	0	$\infty$
5	$\infty$	$\infty$	$\infty$	8	0

# Weighted Adjacency List



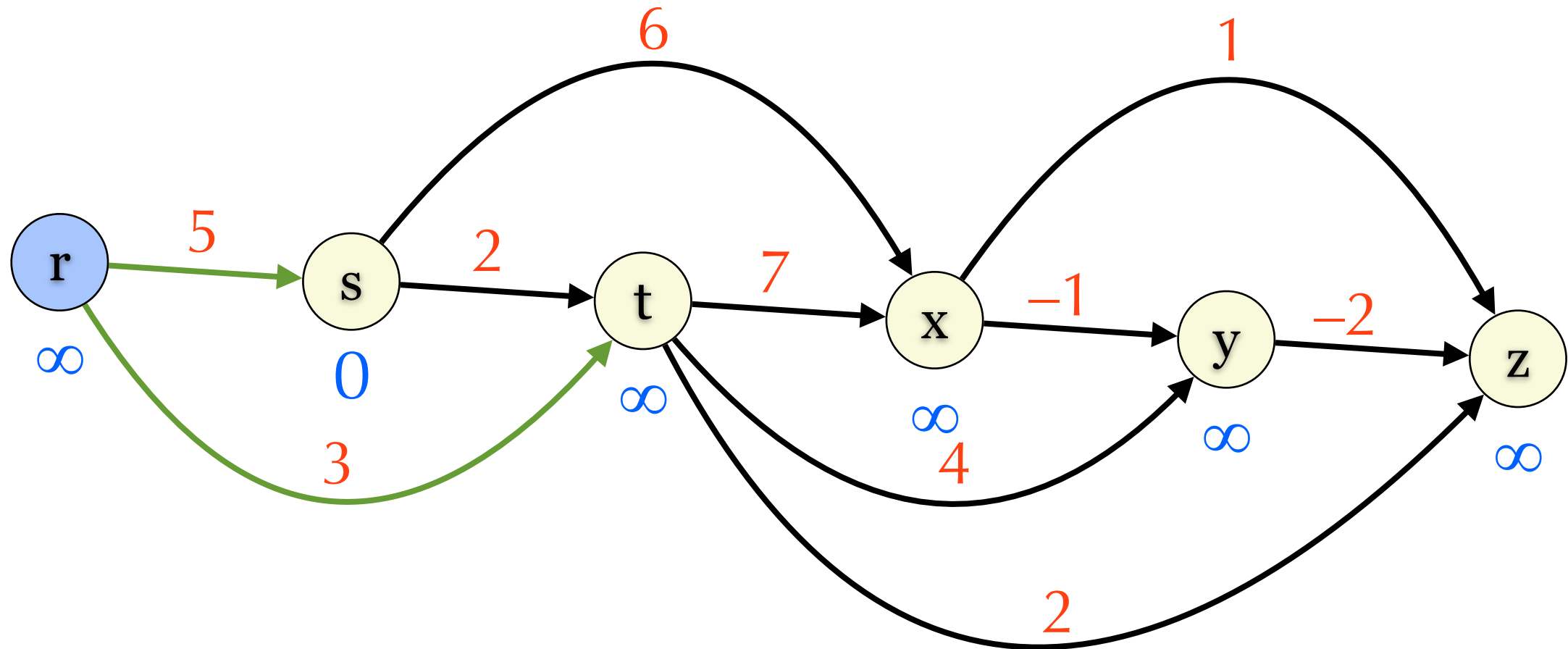
# Shortest Path: Directed Acyclic Graph

- ▶ source:  $s$
- ▶  $d[v]$ : the minimum distance from  $s$  to  $v$
- ▶  $\langle v_1, \dots, v_{|V|} \rangle = \text{Topological-Sort}(G)$ 
  - for  $i = 1$  to  $|V|$  do
    - $d[v_i] = \infty$
  - $d[s] = 0$
  - for  $i = 1$  to  $|V| - 1$  do
    - for each edge  $(v_i, v) \in E$  do
      - if  $d[v] > d[v_i] + w(v_i, v)$ 
        - $d[v] = d[v_i] + w(v_i, v)$

$O(|V| + |E|)$

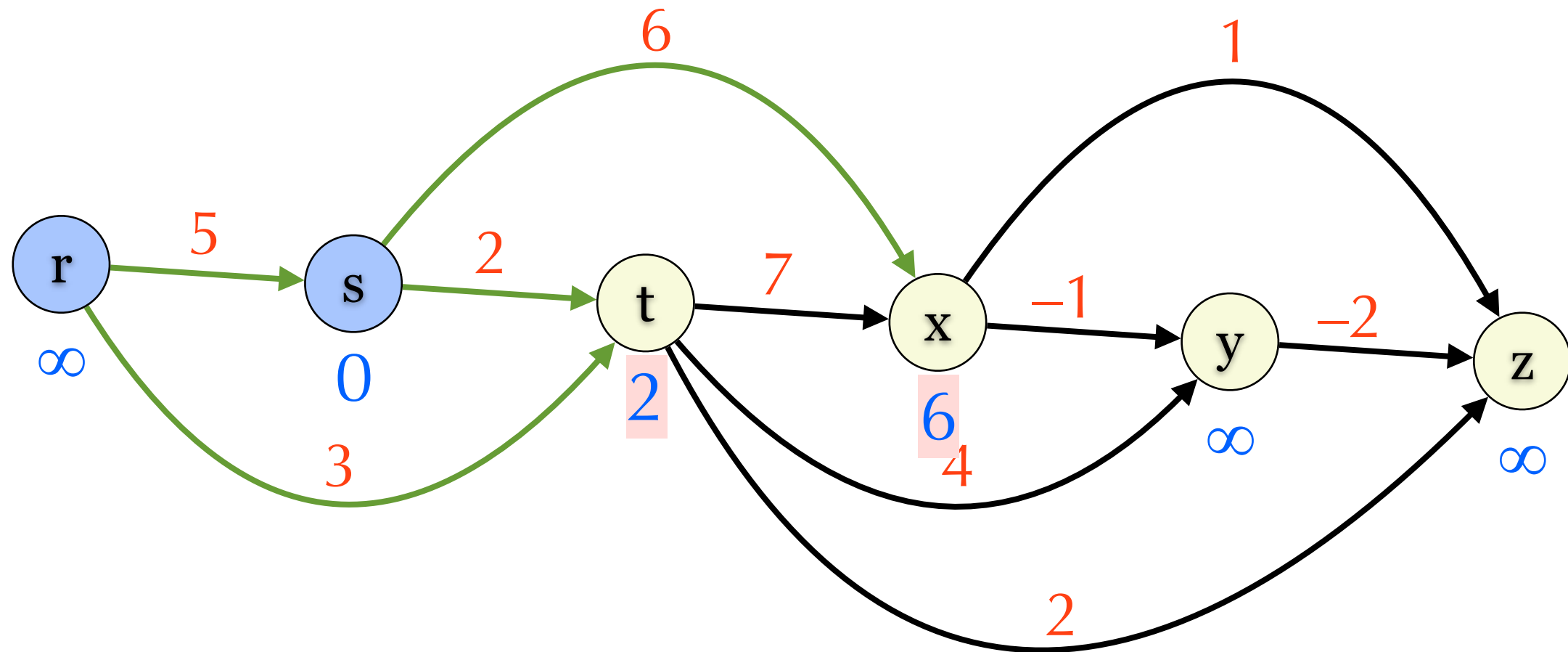
# Example

Starting at s



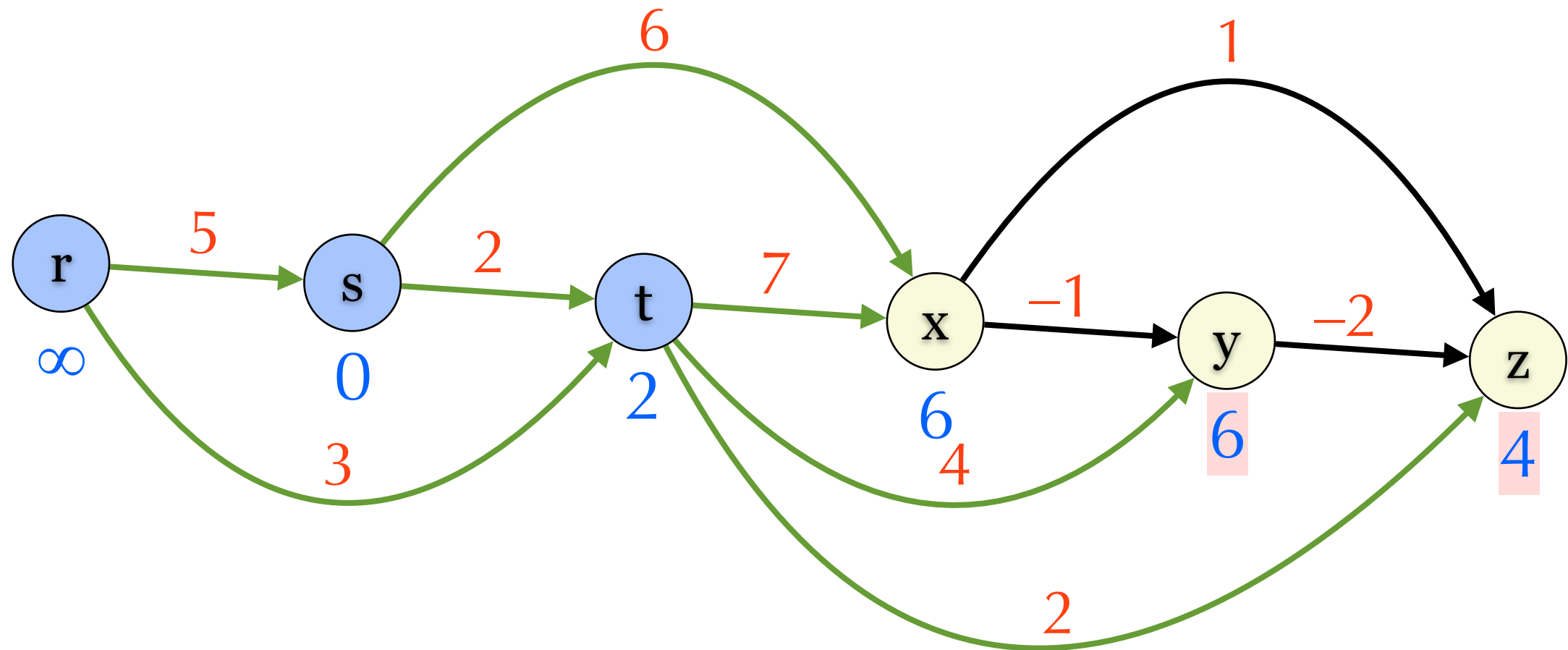
# Example

Starting at s



# Example

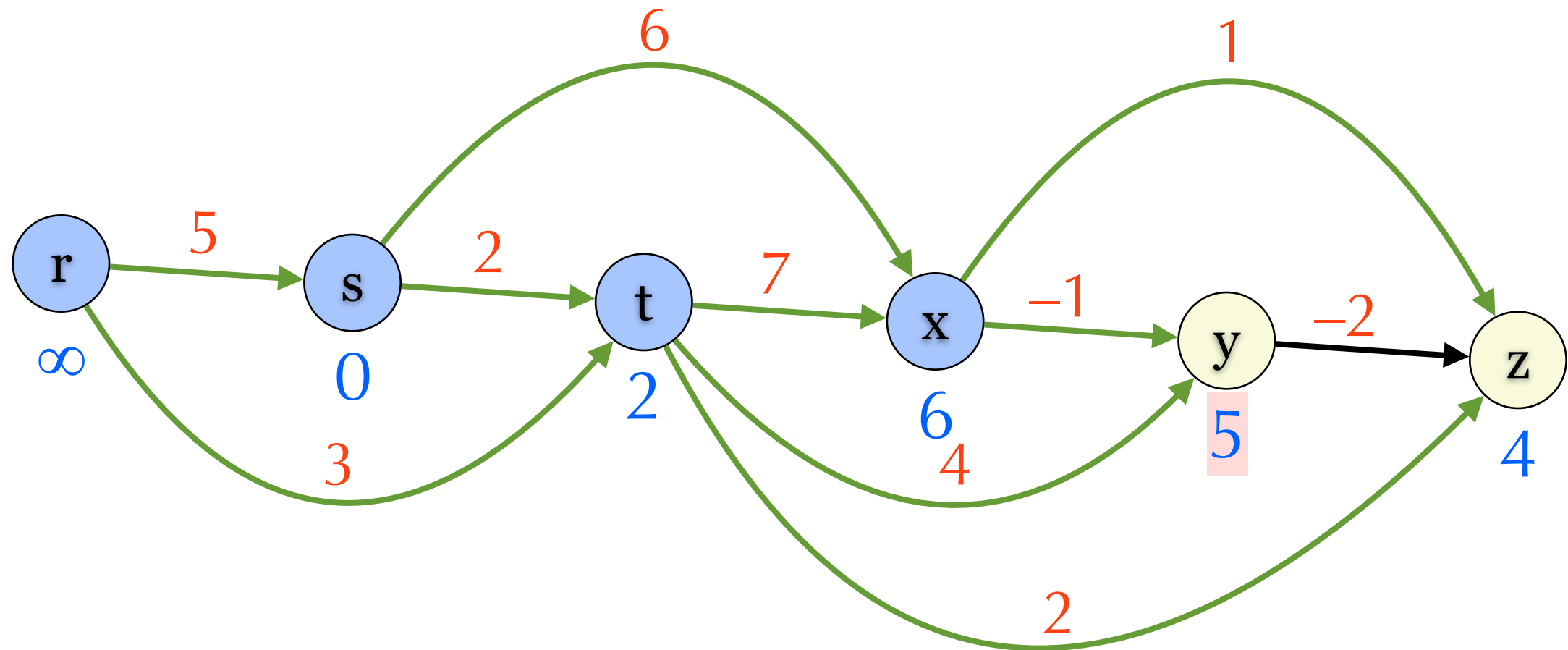
Starting at s





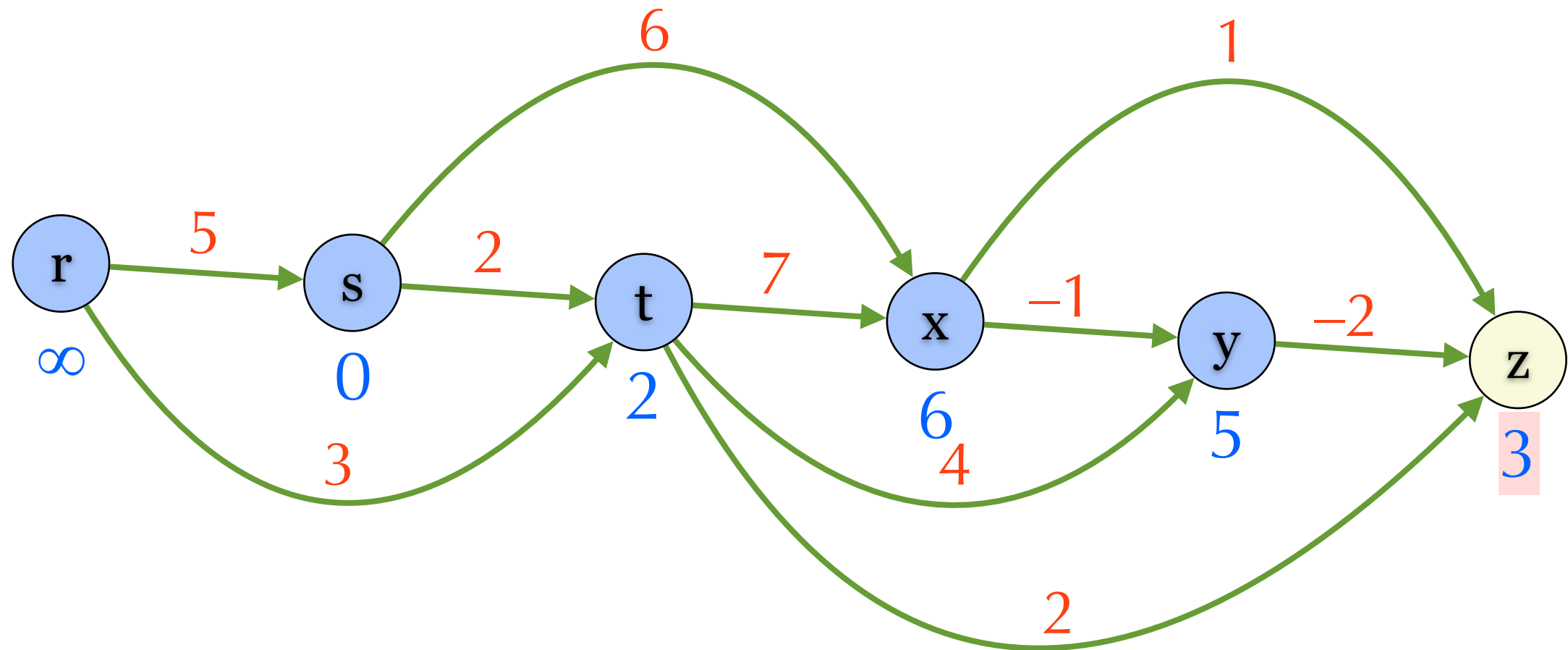
# Example

Starting at s



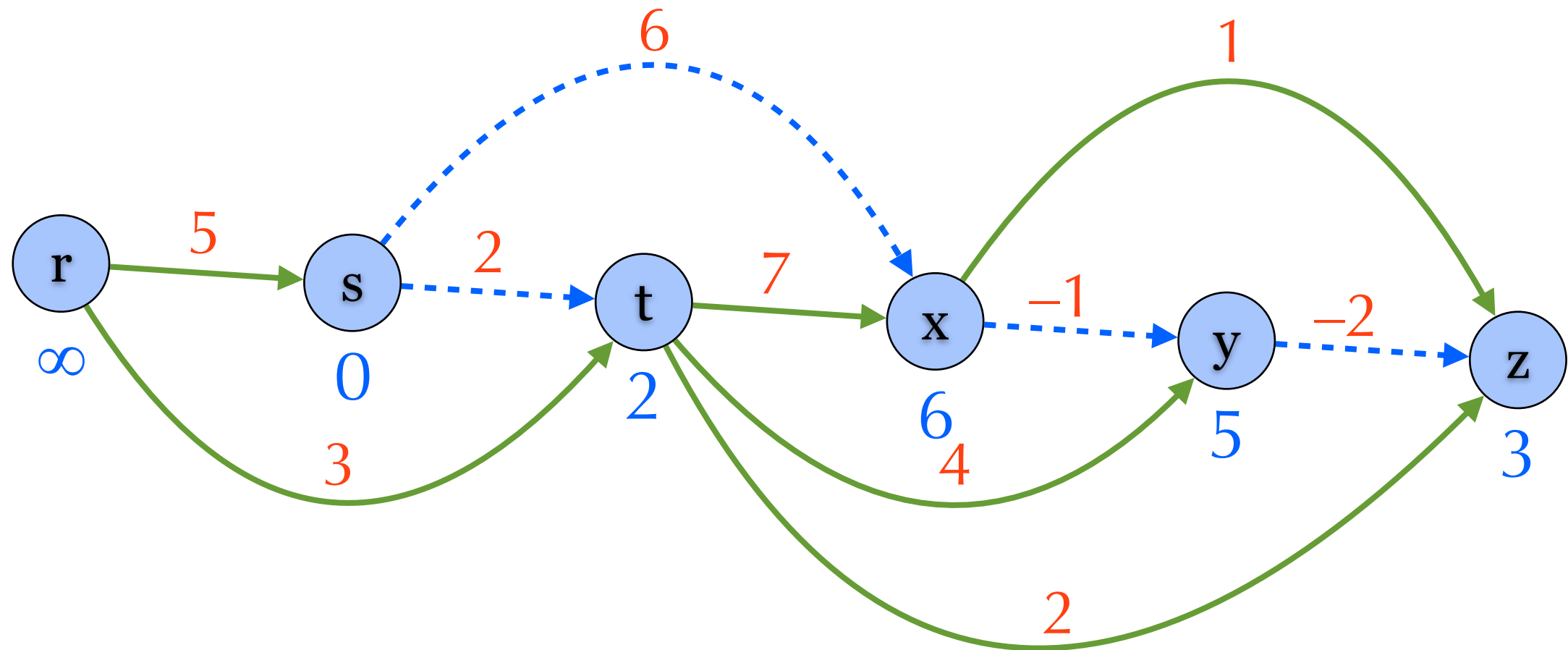
# Example

Starting at s



# Done

Starting at s

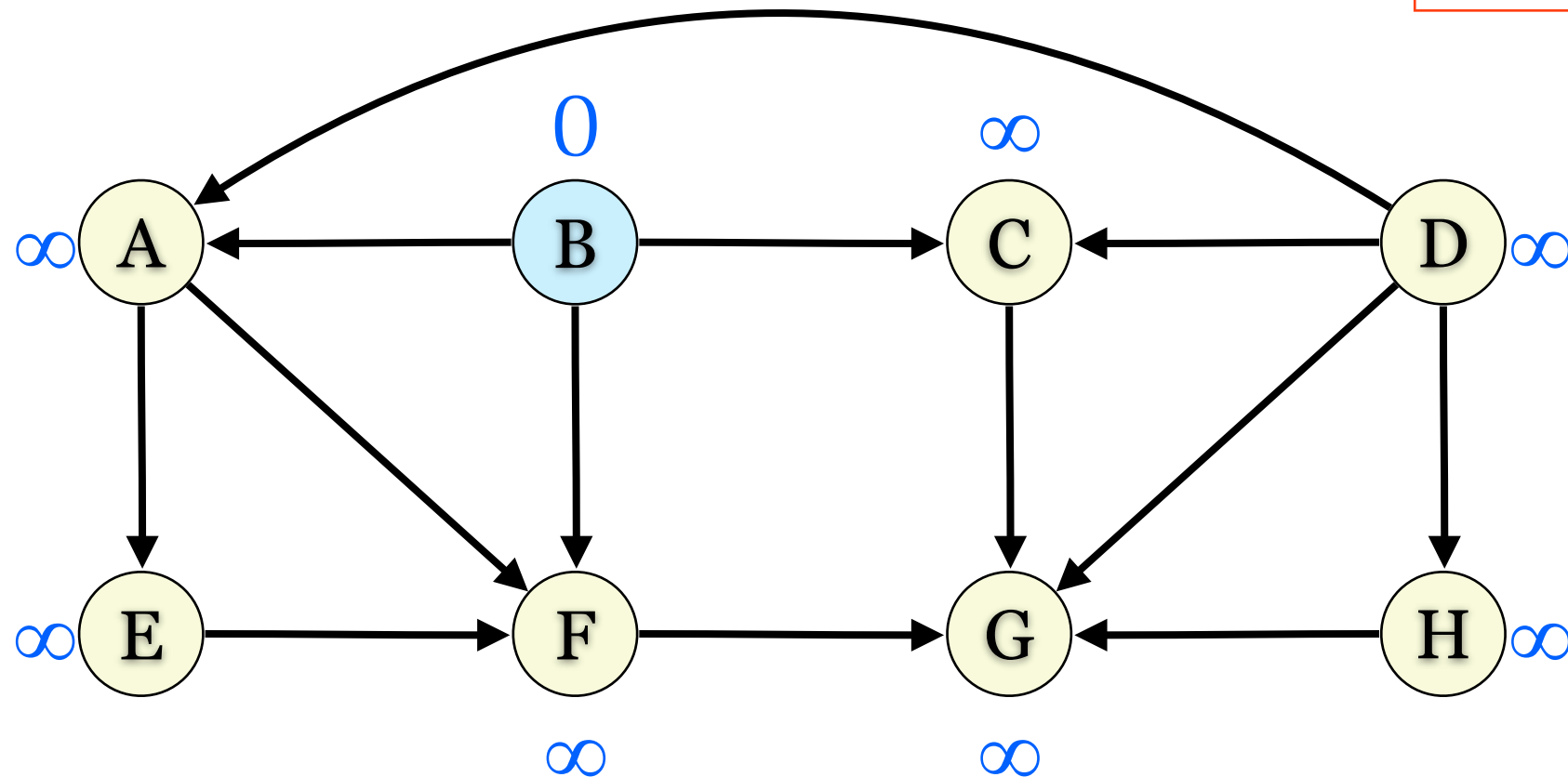


# Shortest Paths: Unweighted Graph

- ▶ This can be solved by modified BFS
  - ▶ Or standard version in CLRS
- ▶ Initialization:
  - ▶ for each  $v \in V$ :  $\text{enqueued}[v] = \text{visited}[v] = \text{false}$ ,  $d[v] = \infty$
  - ▶  $\text{enqueued}[s] = \text{true}$ ,  $d[s] = 0$ ,  $Q.\text{enqueue}(s)$
- ▶ Main loop:  $\text{while}(Q \neq \emptyset)$ 
  - ▶  $u = Q.\text{dequeue}()$   
for each  $v$  s.t.  $(u, v) \in E$   
if  $\text{enqueued}[v] == \text{false}$   
     $\text{enqueued}[v] = \text{true}$ ,  $d[v] = d[u] + 1$ ,  $Q.\text{enqueue}(v)$   
 $\text{visited}[u] = \text{true}$

# Example

Starting at B

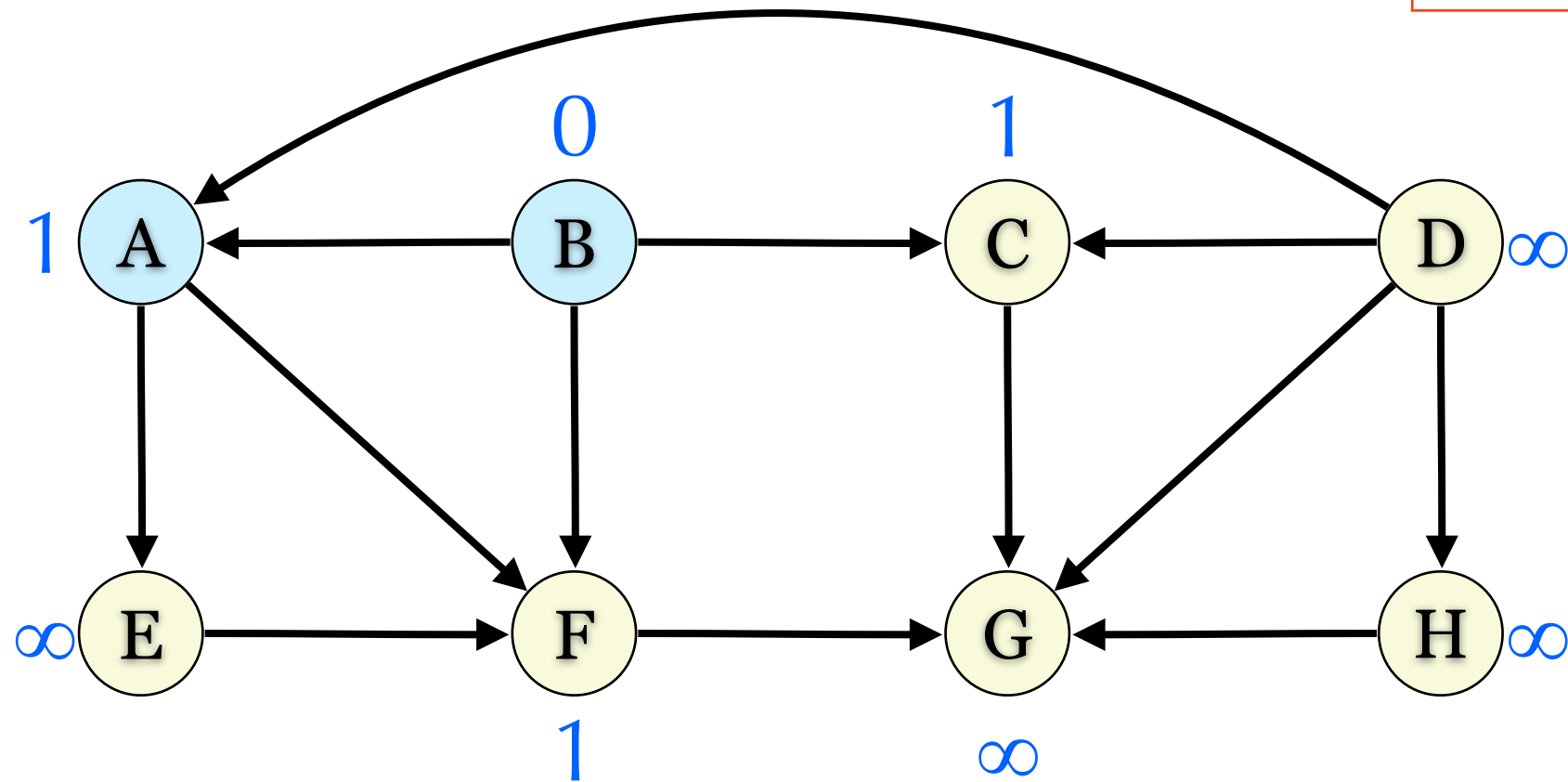


Queue

B							
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# Example

Starting at B

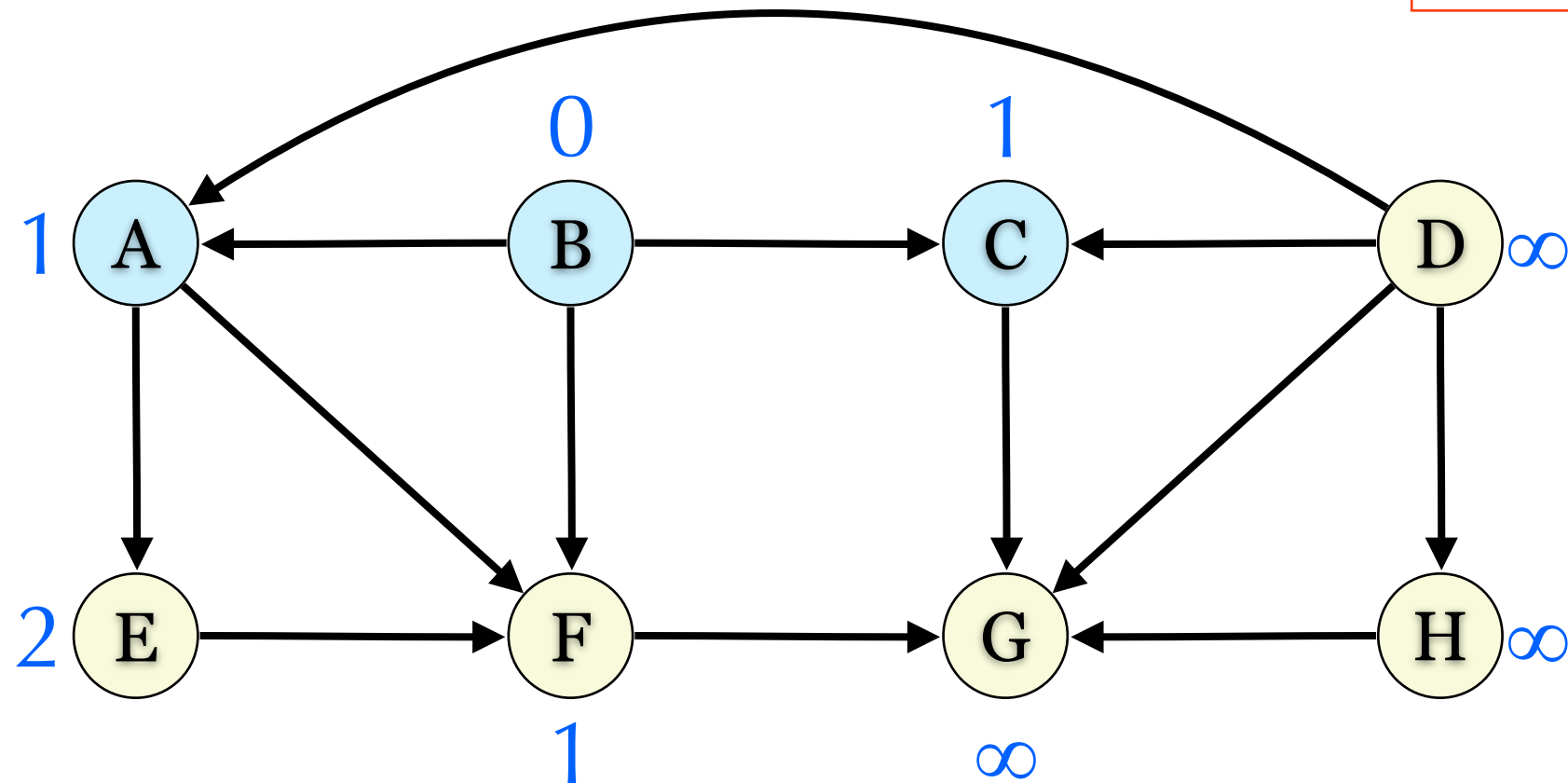


Queue

A	C	F					
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# Example

Starting at B

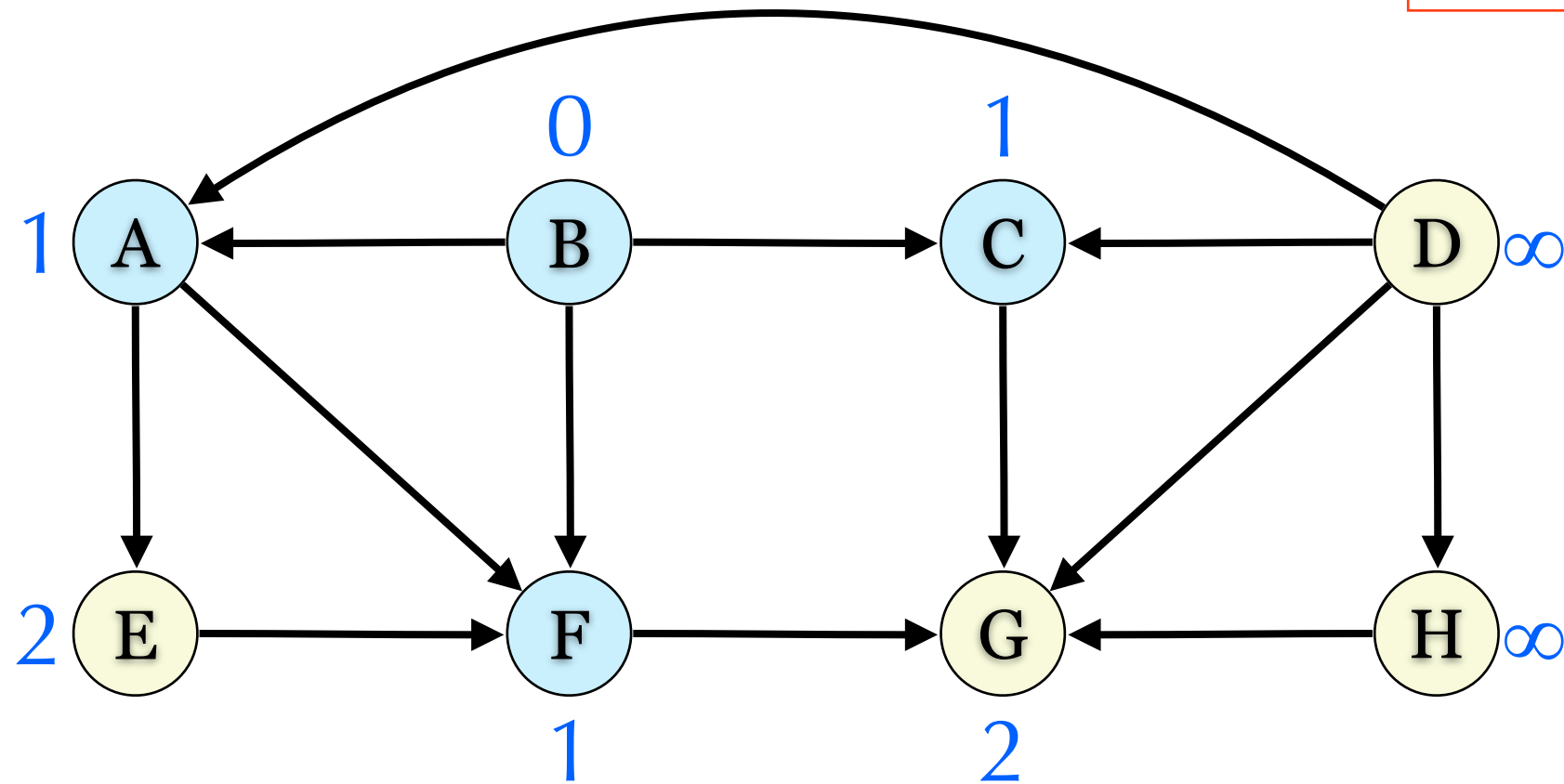


Queue

C	F	E					
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# Example

Starting at B



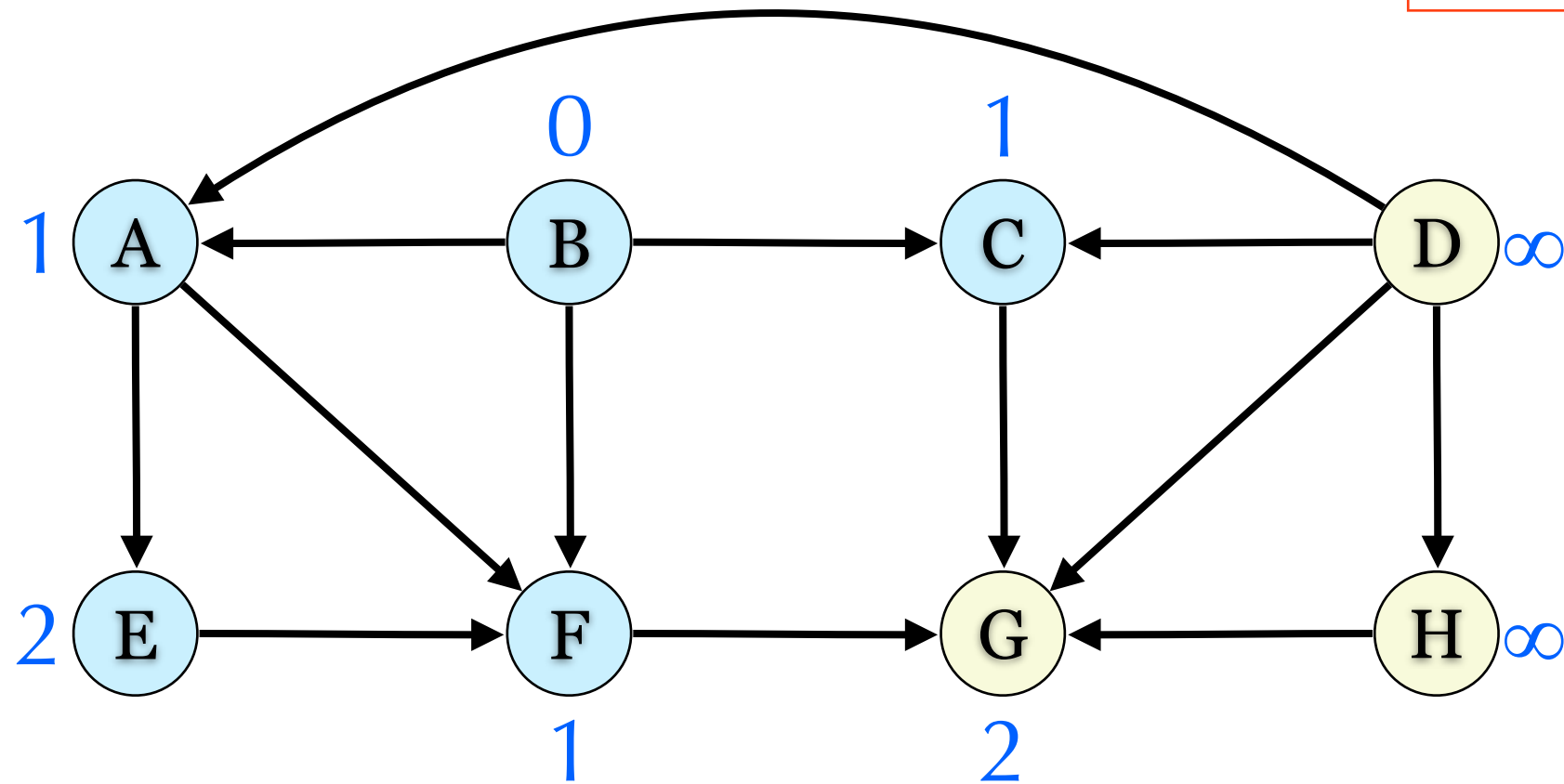
Queue

F	E	G					
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# Example

Starting at B

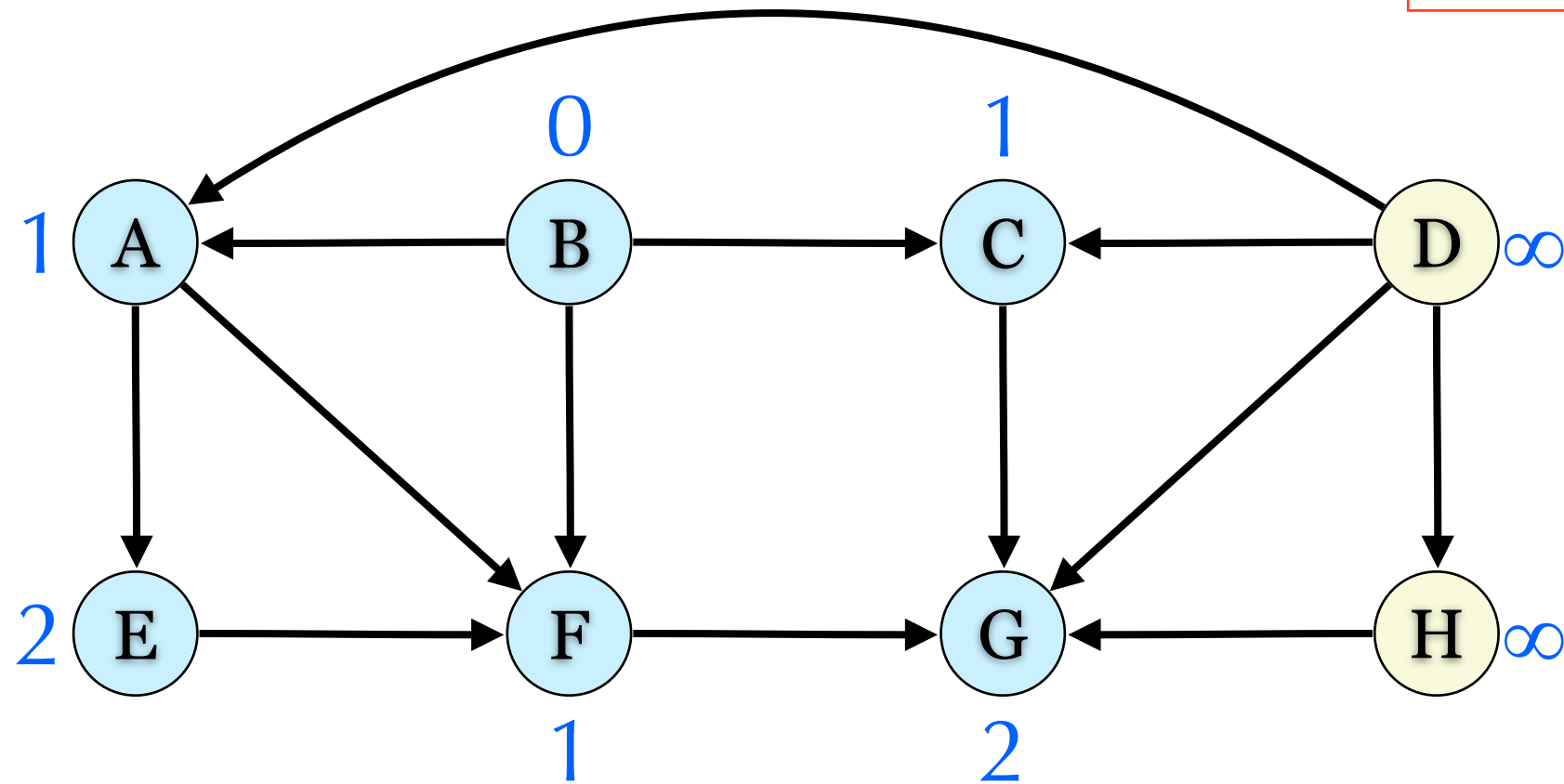


Queue

E	G						
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# Example

Starting at B

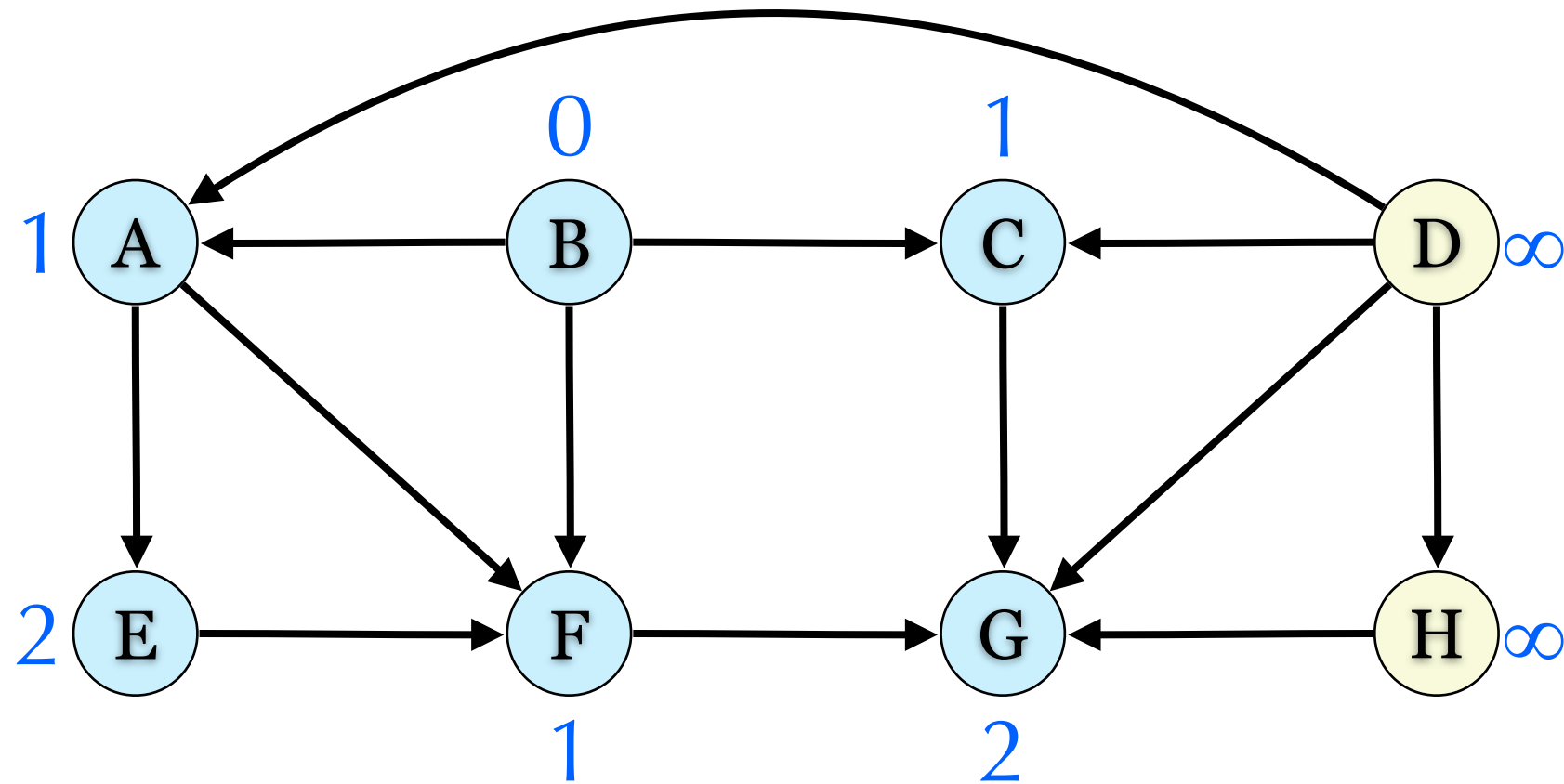


Queue

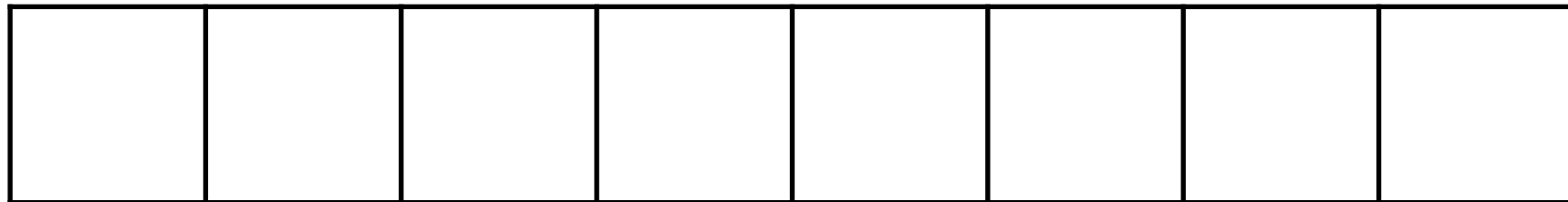
G							
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# Example

Done



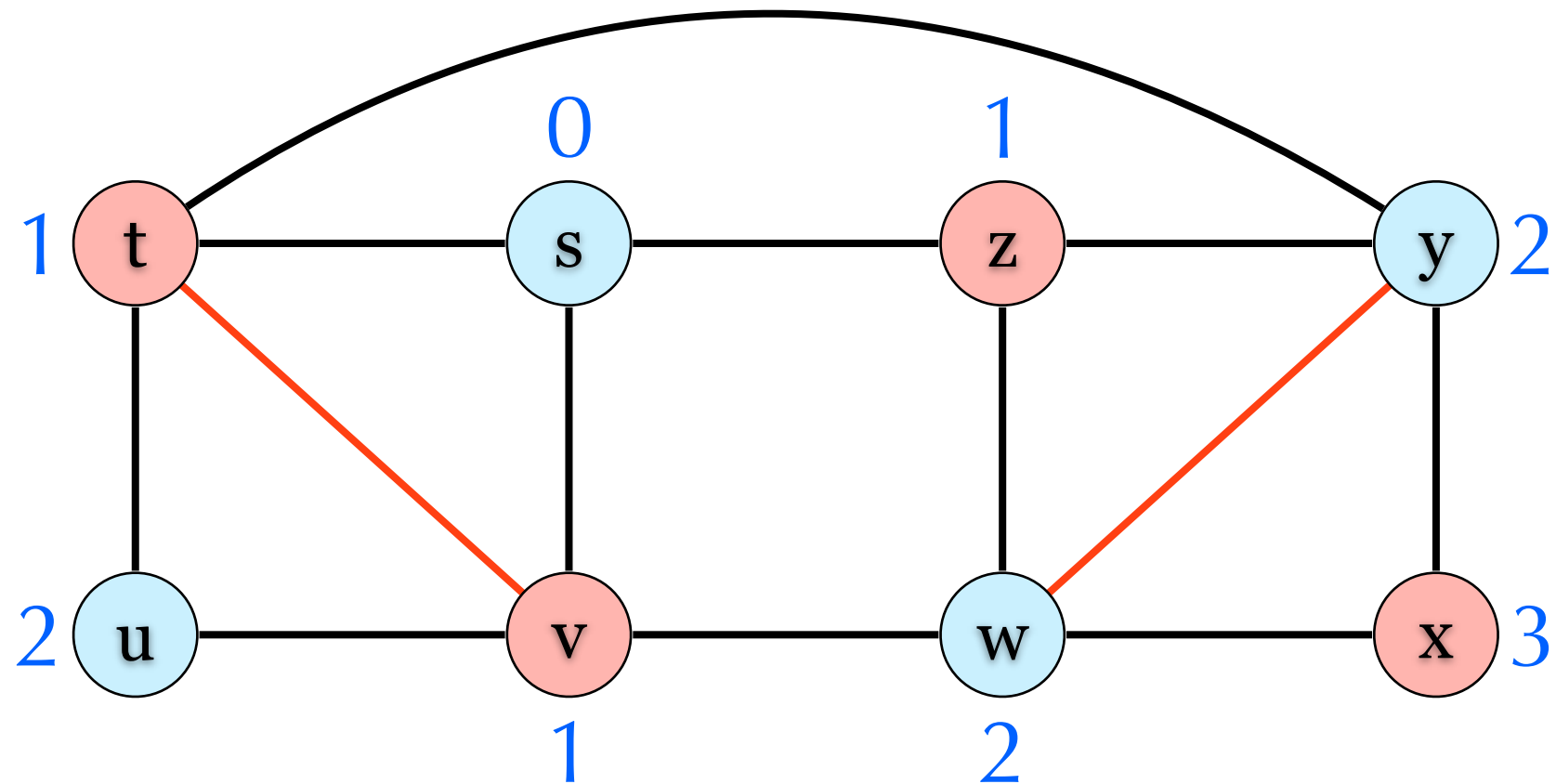
Queue



# Bipartite Graph Check

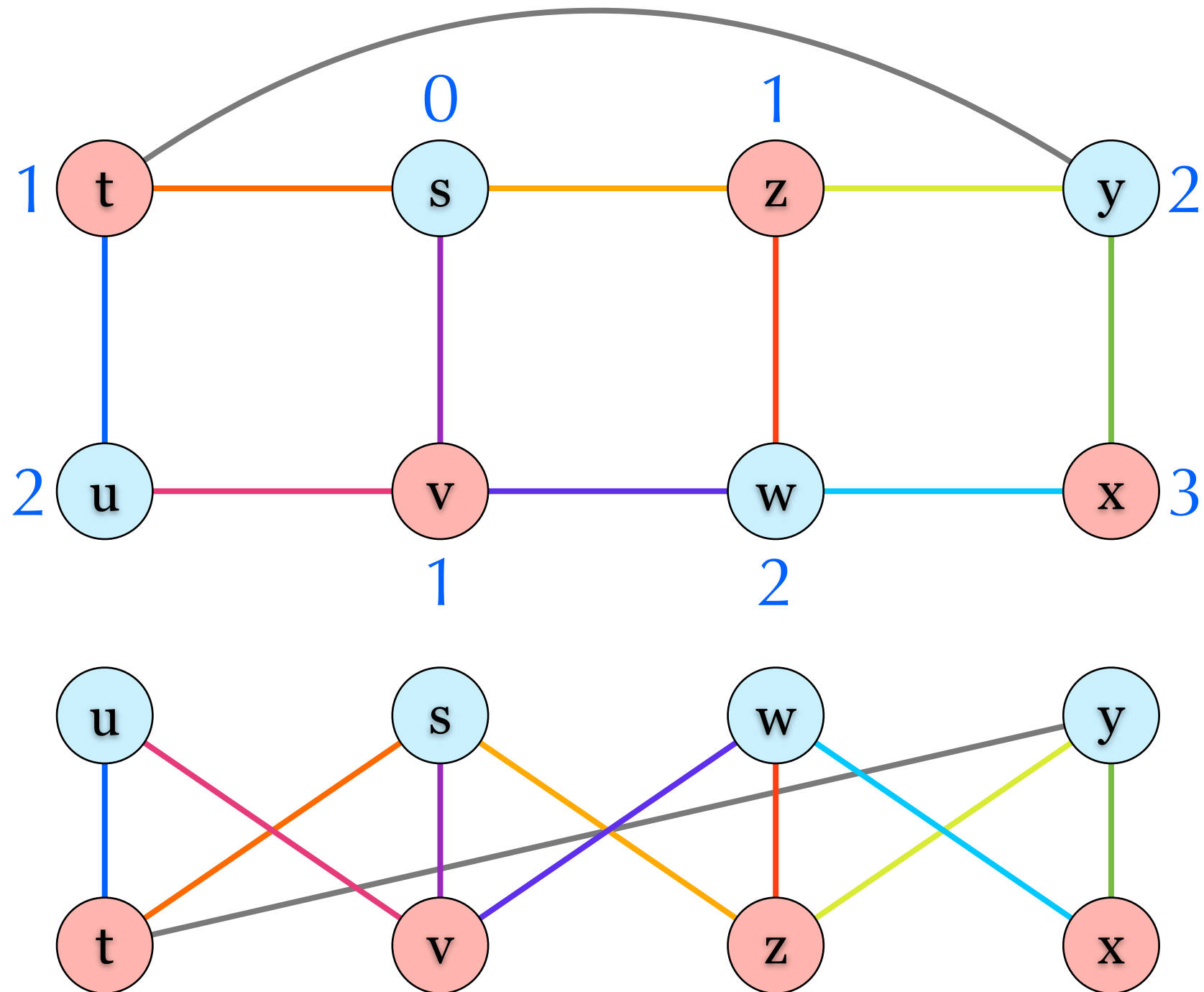
- ▶ Bipartite graph  $G=(V,E)$  **undirected**
  - ▶  $V$  can be partitioned into  $A$  and  $B$ 
    - ▶  $A \cup B = V$  and  $A \cap B = \emptyset$
    - ▶ If  $\{u,v\} \in E$ , then  $u \in A \Leftrightarrow v \in B$ .
- ▶ How to check whether a graph is bipartite?
  - ▶ Repeat until  $d[v] < \infty$  for every  $v \in V$
  - ▶ Pick  $u$  s.t.  $d[u] = \infty$
  - ▶ Run BFS from  $u$  to compute  $\delta(u,v)$
  - ▶ If there is an edge  $\{u,v\}$  s.t.  $2 \nmid (d[u] + d[v])$  then the graph is non-bipartite.

# Example



Non-bipartite

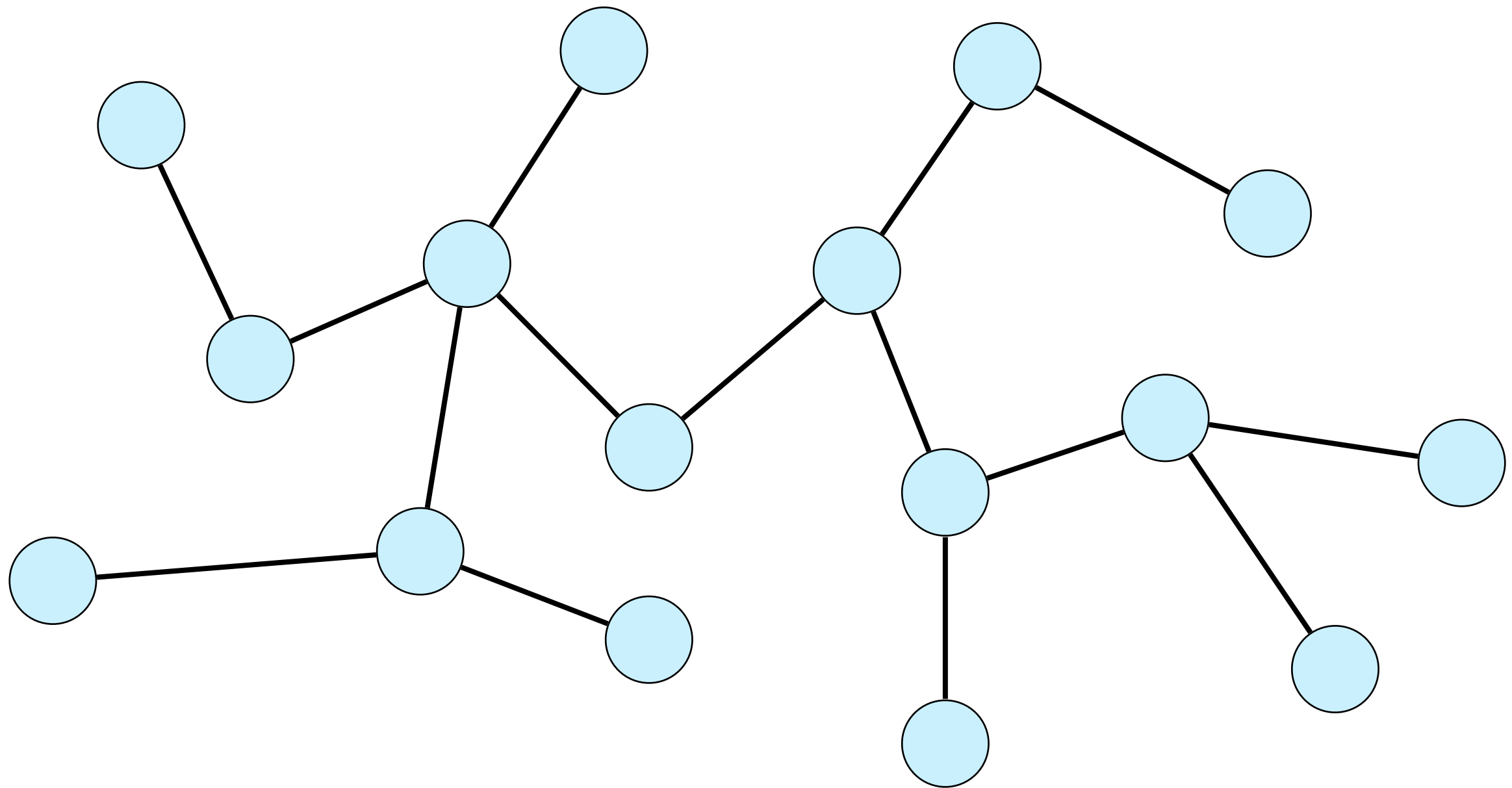
# Example



# Tree Diameter

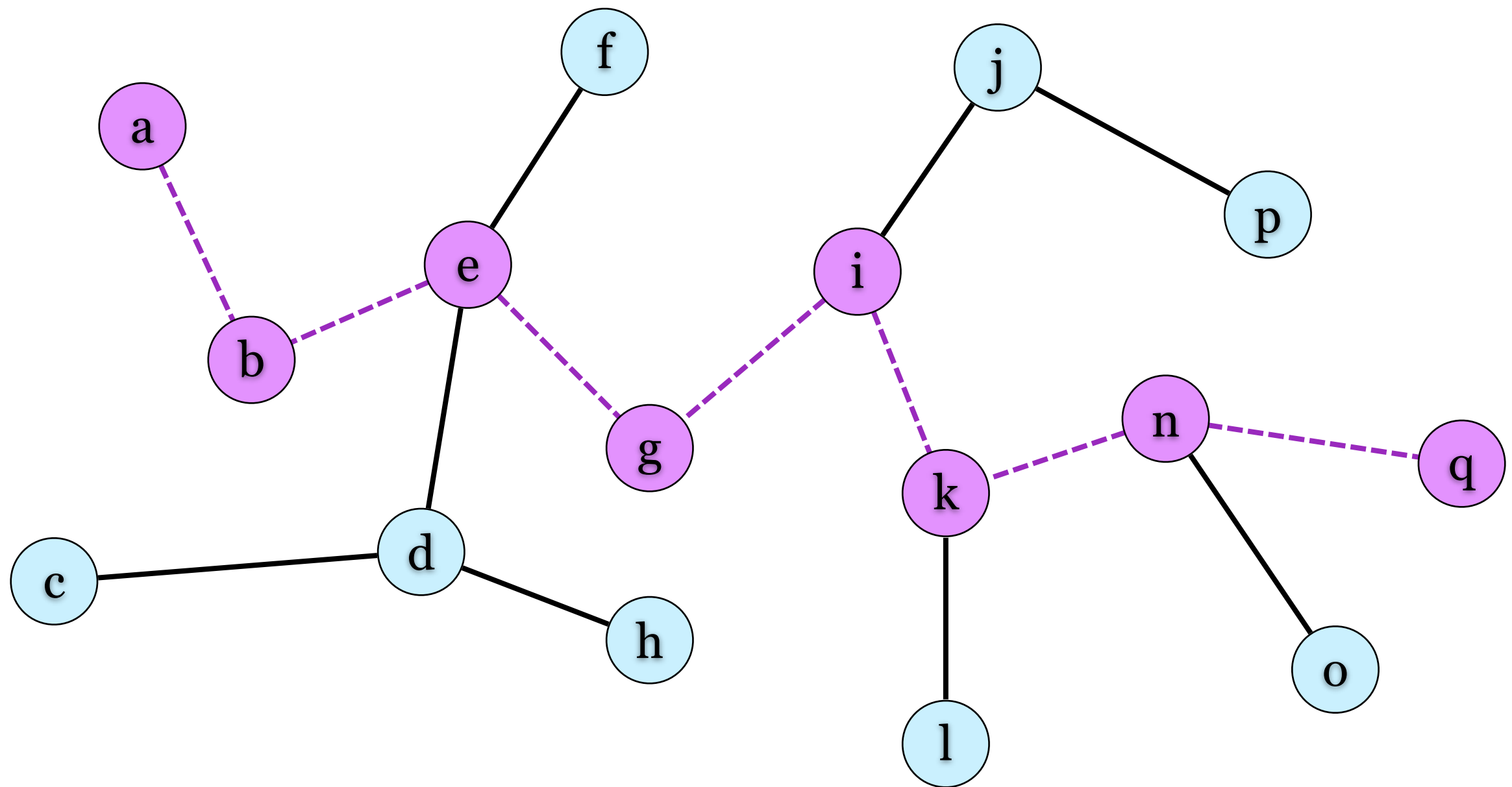
- ▶ Graph diameter of  $G$ : the length of the longest shortest path in  $G$ .
- ▶ Tree diameter:  $G=(V,E)$  is a tree
  - ▶  $G$  is undirected      unweighted/weighted
  - ▶  $|E|=|V|-1$
  - ▶ For every pair  $u,v \in V$ , there exists a path from  $u$  to  $v$ .

# Example



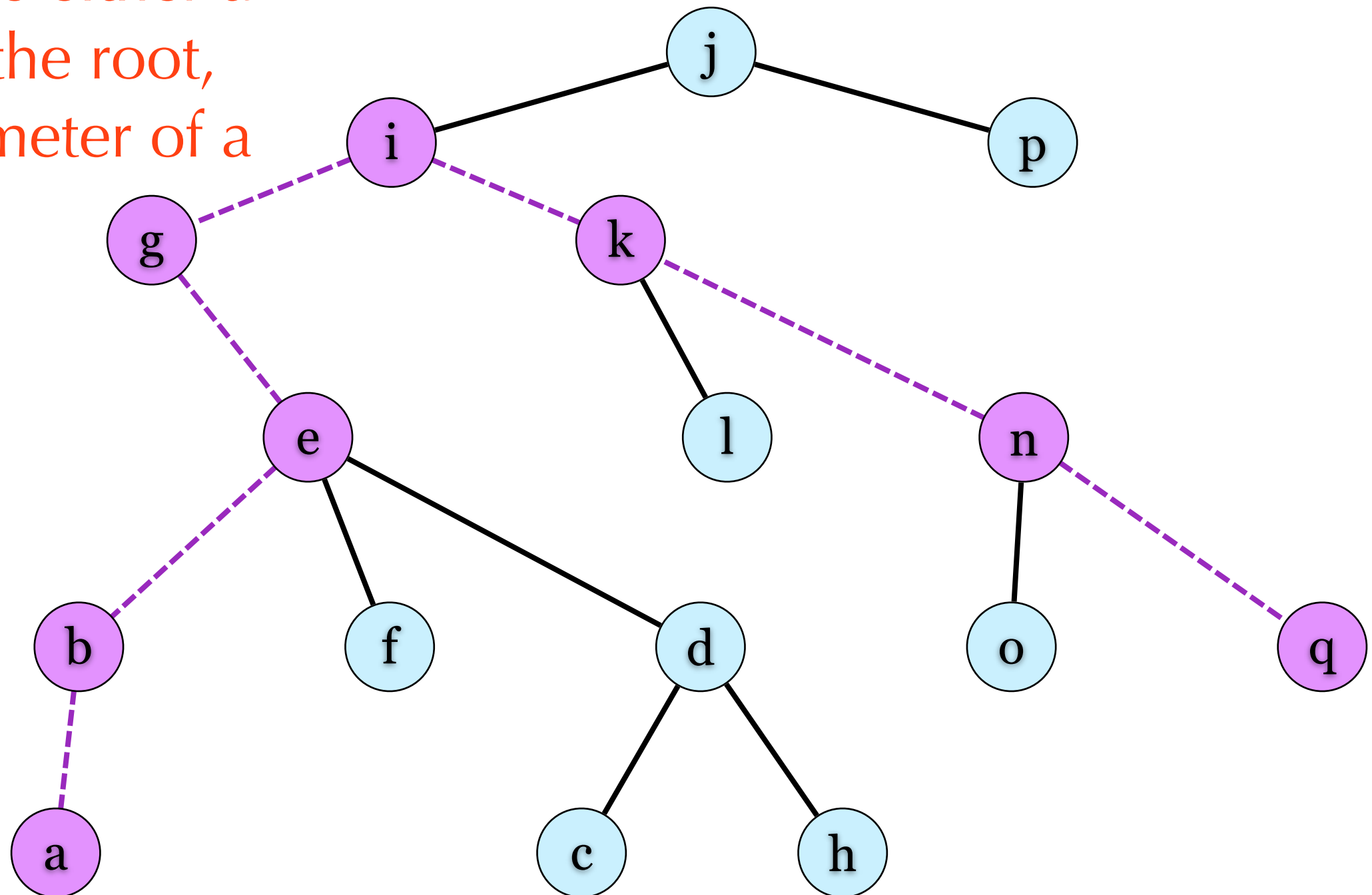


# Example



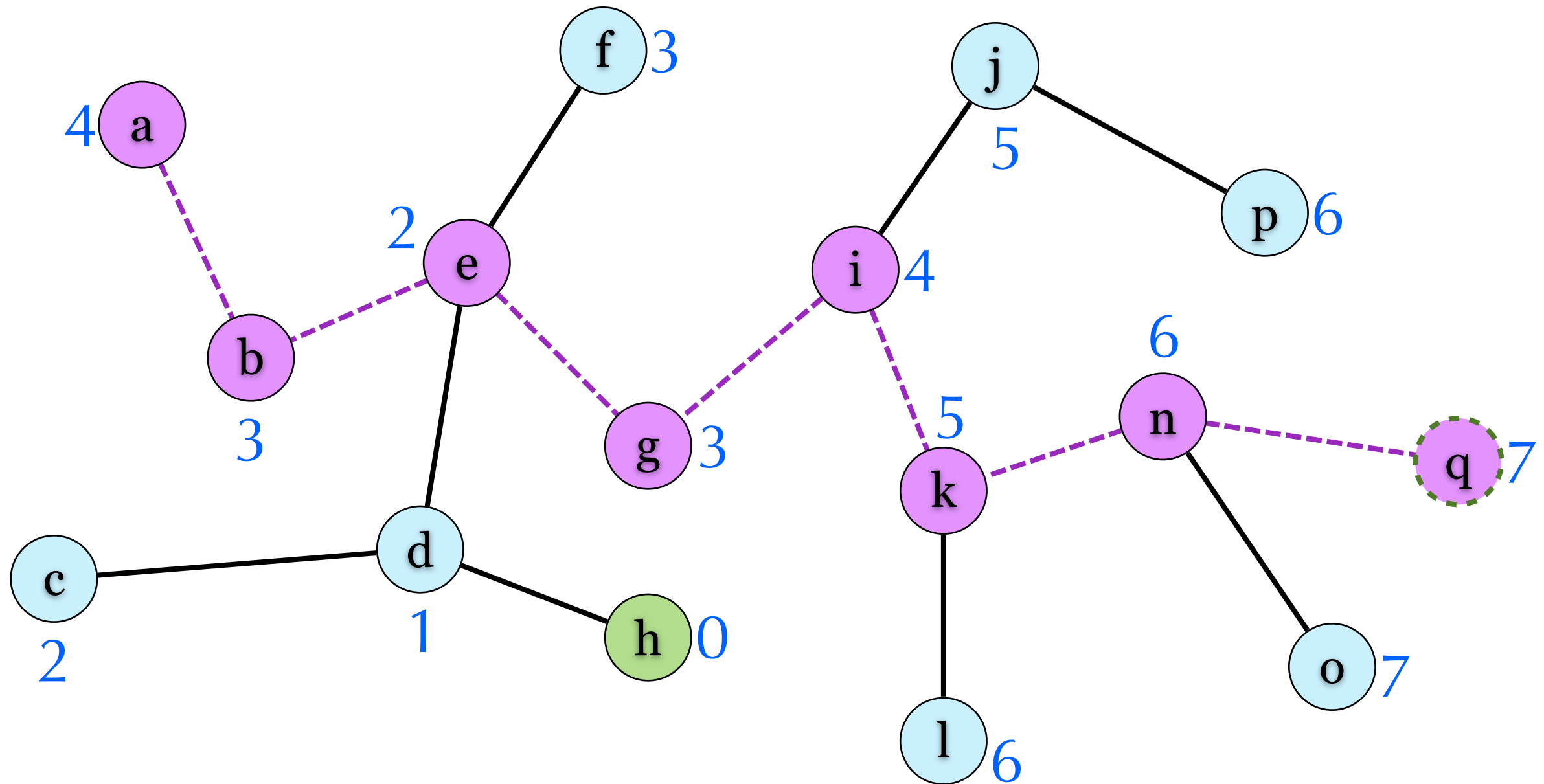
# Solution 1: DP

Diameter is either a path pass the root, or the diameter of a subtree.



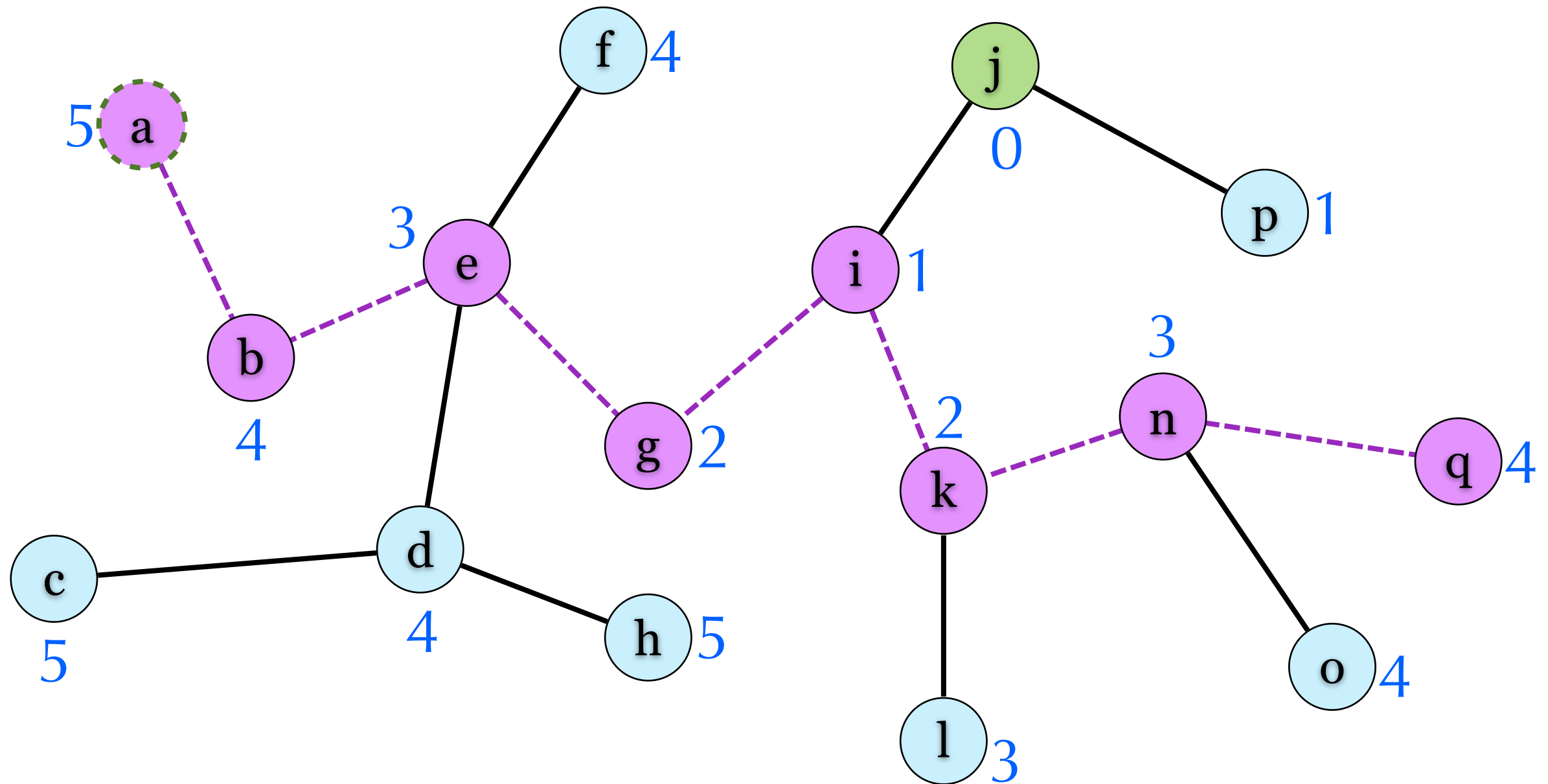
# Solution 2: Greedy

The farthest vertex of any  $v \in V$  is an end of the diameter.



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The farthest vertex of any  $v \in V$  is an end of the diameter.



# Connected Components

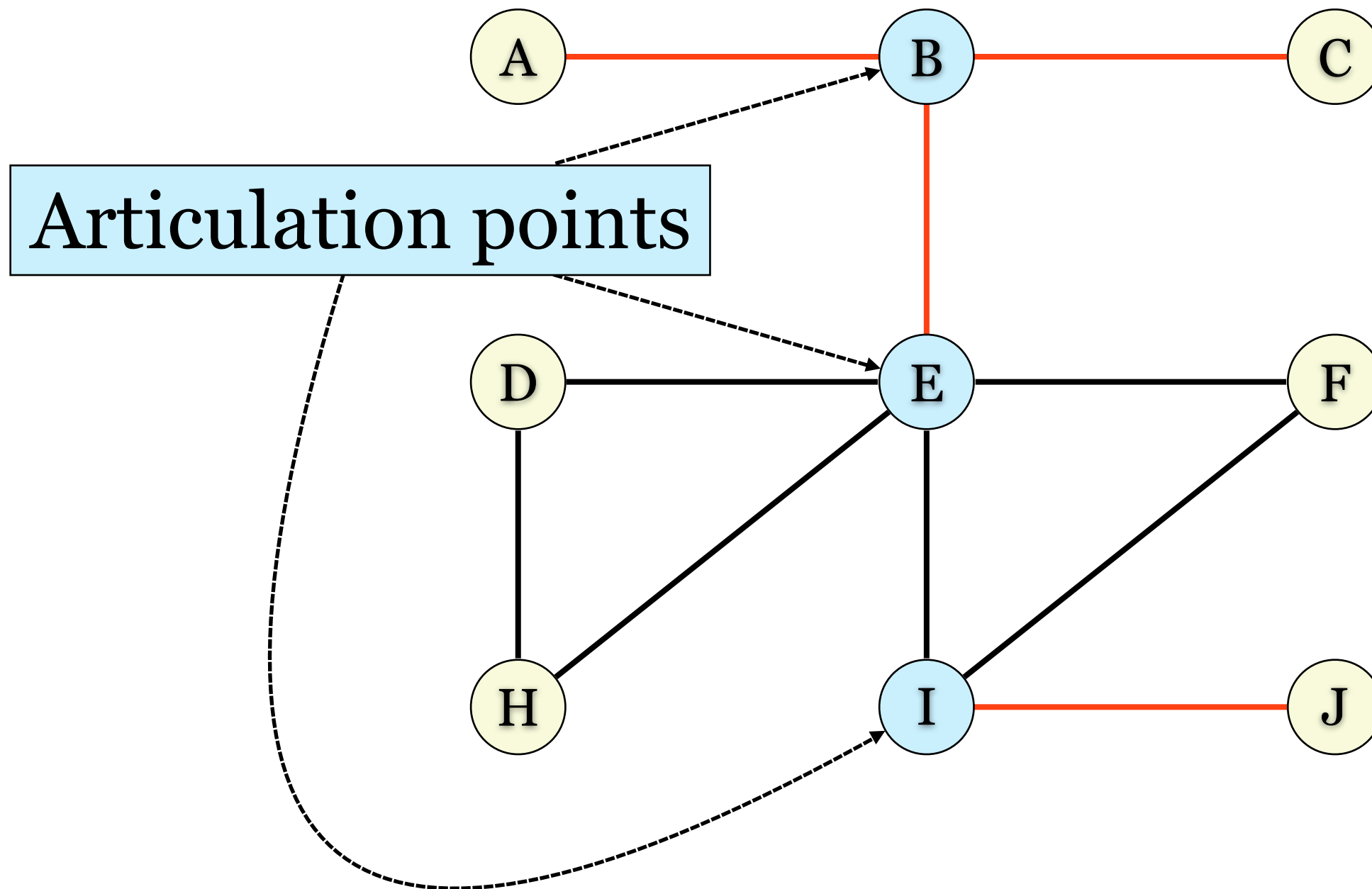
- ▶ In an undirected graph  $G$ , a connected component  $C=(V_C, E_C)$  is a subgraph of  $G$ :
  - ▶ For  $u, v \in V_C$ , there is a path from  $u$  to  $v$ .
  - ▶ For  $u \in V_C$  and  $v \in V \setminus V_C$ , there is no path from  $u$  to  $v$ .
- ▶ Use DFS or BFS to compute connected components.
  - ▶ Which is better? It depends.

# Articulation Points and Bridges

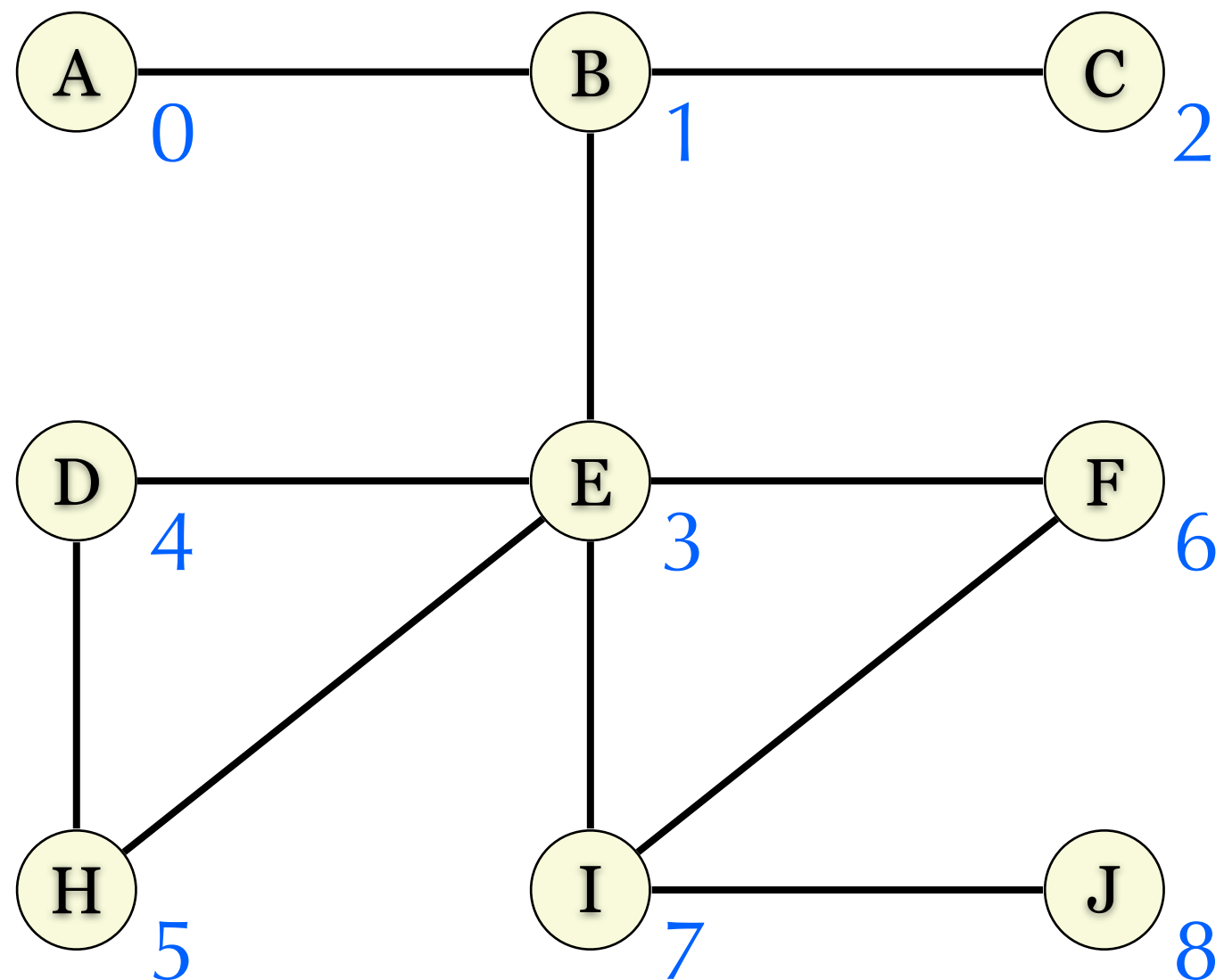
- ▶ In undirected graphs,
  - ▶ A vertex  $v$  is an **articulation points** if removing  $v$  will disconnect the graph.
  - ▶ An edge  $e$  is a **bridge** if removing  $e$  will disconnect the graph.
- ▶ All articulation points and bridges can be find by a DFS based algorithm.

# Example

Bridges



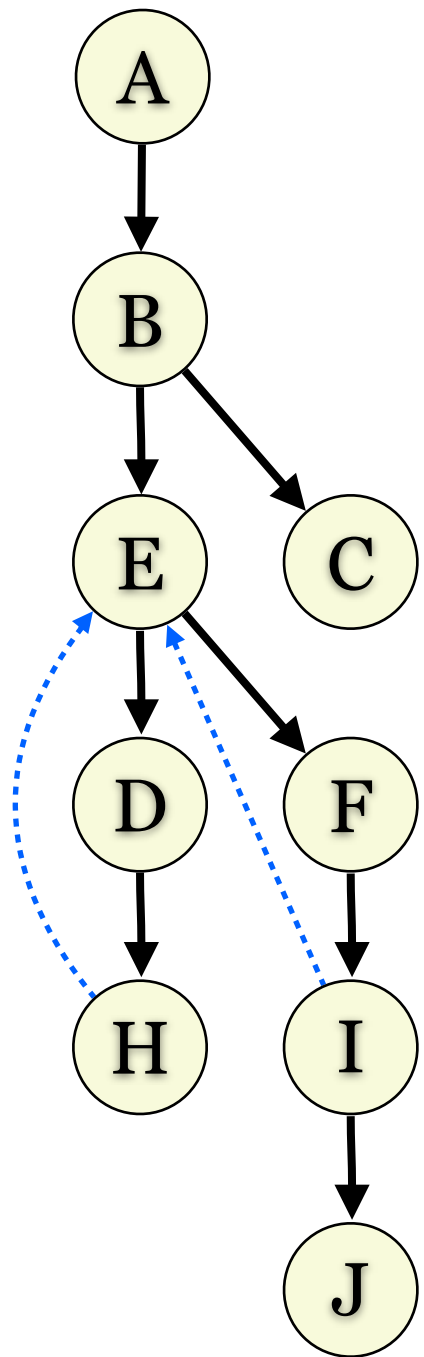
# DFS Based Algorithm



Compute  
DFS order

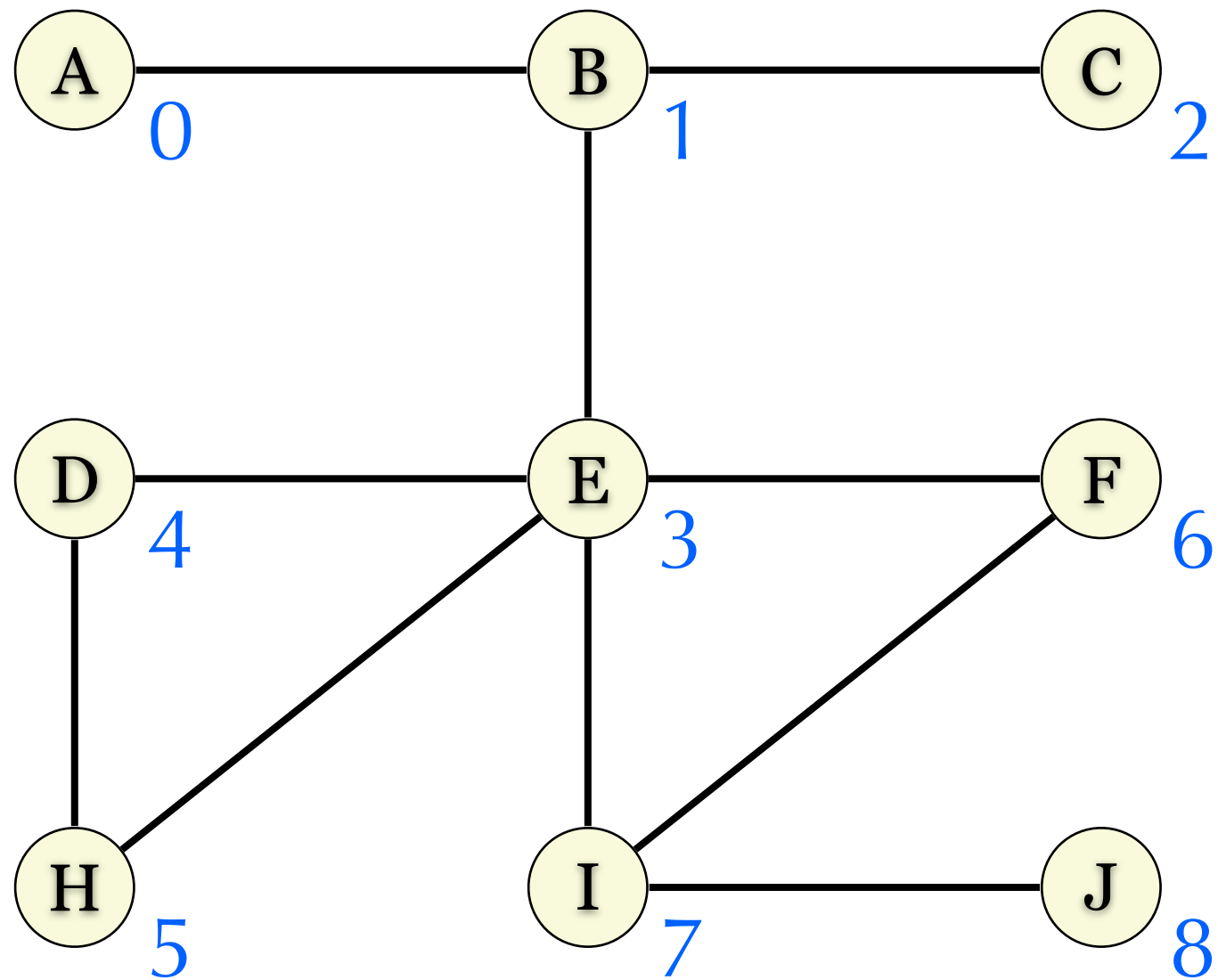


DFS  
tree

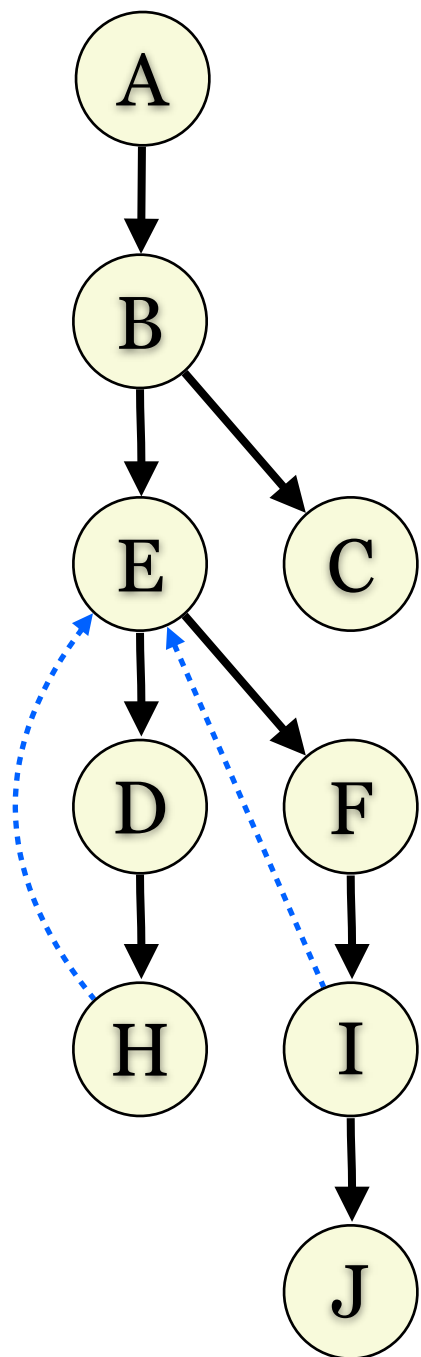


# Order

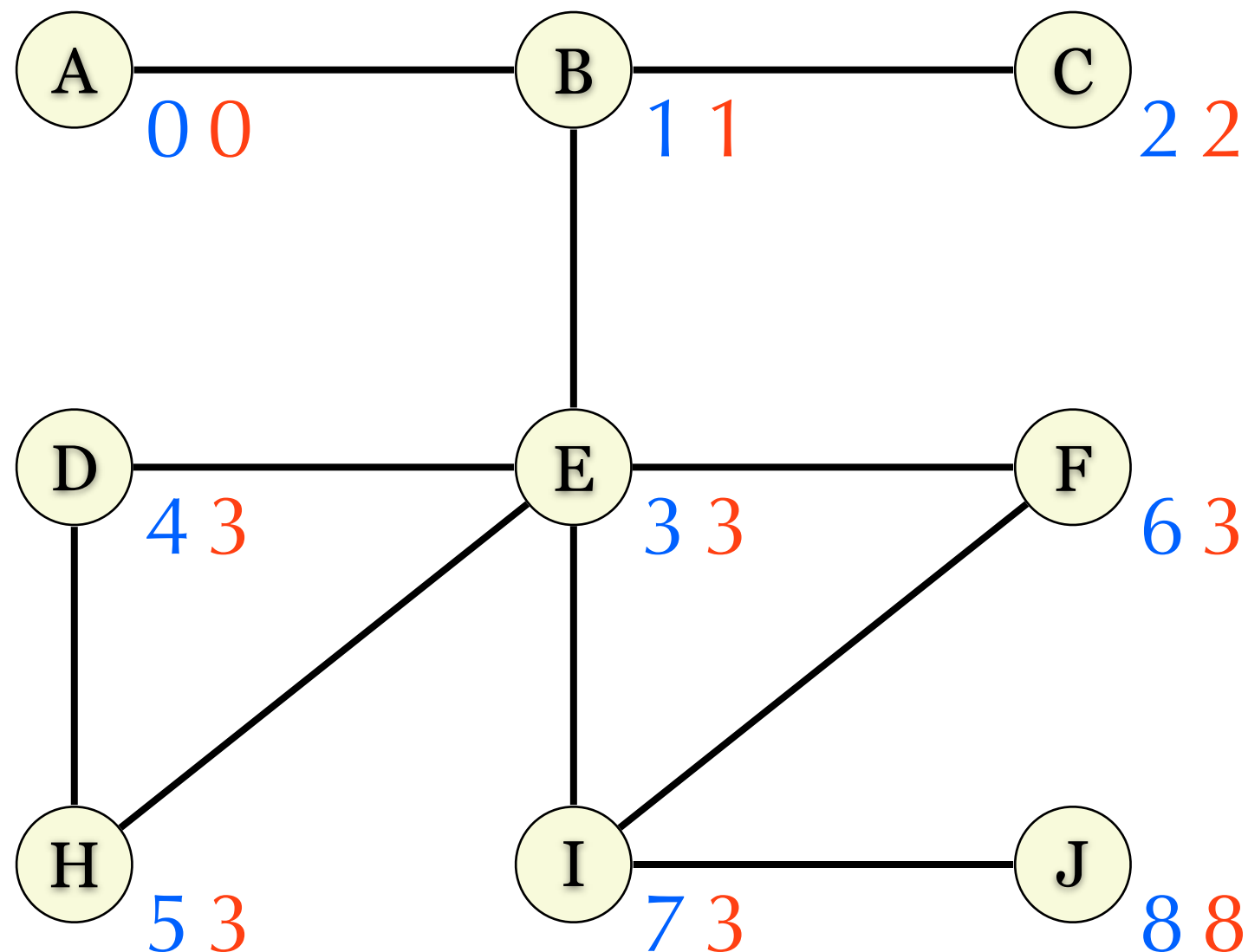
DFS order



## DFS tree



## Low Value

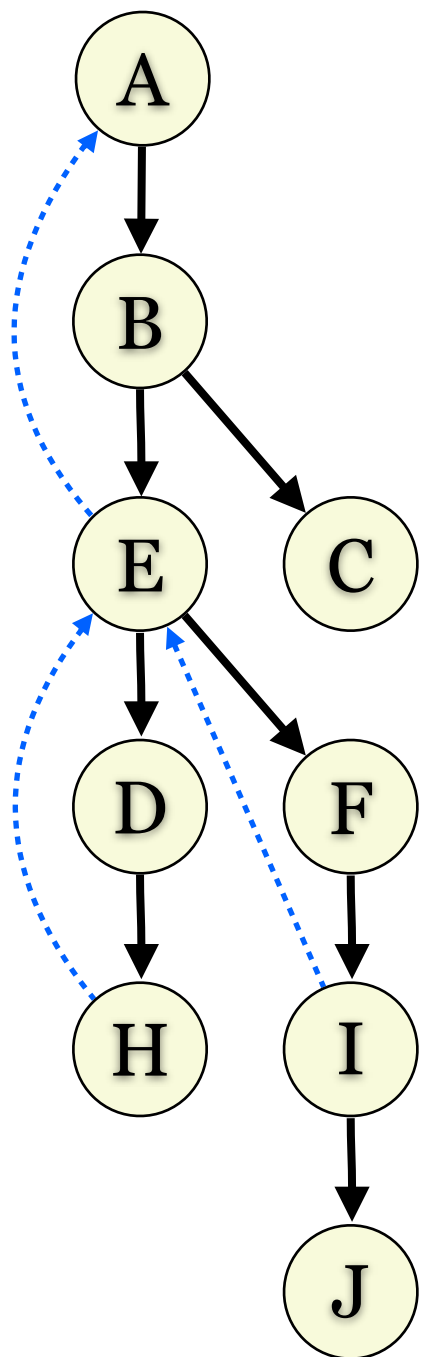


DFS order

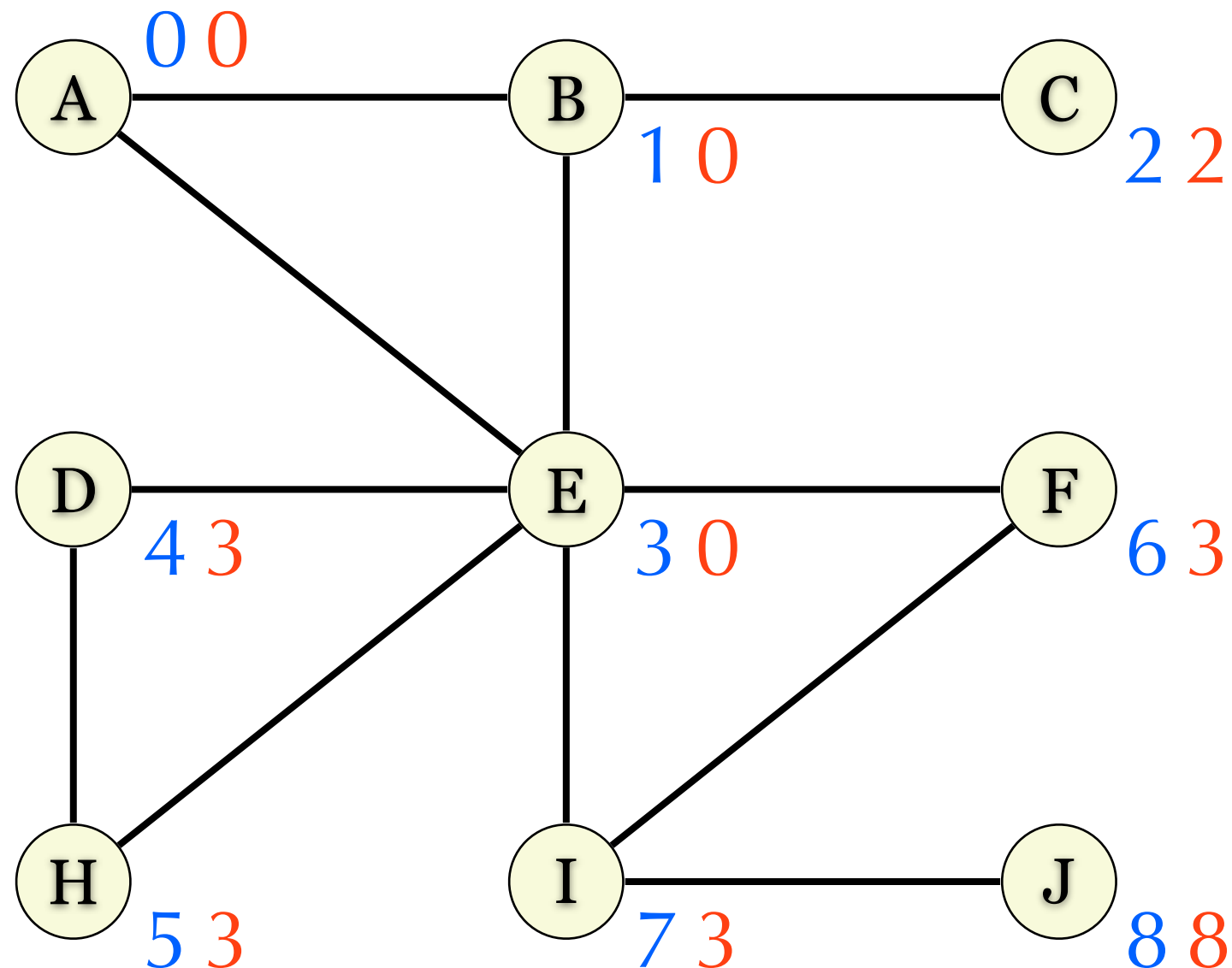
Compute  
Low value

**Low value** of **v**: The lowest **order** of nodes which are read during DFS-visit(**v**).

DFS  
tree



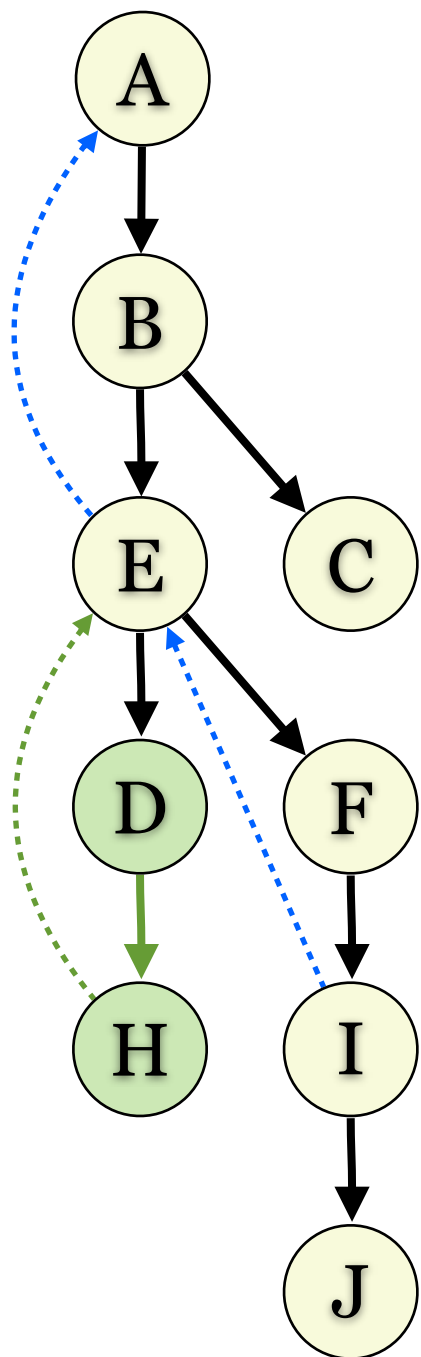
# Another Example



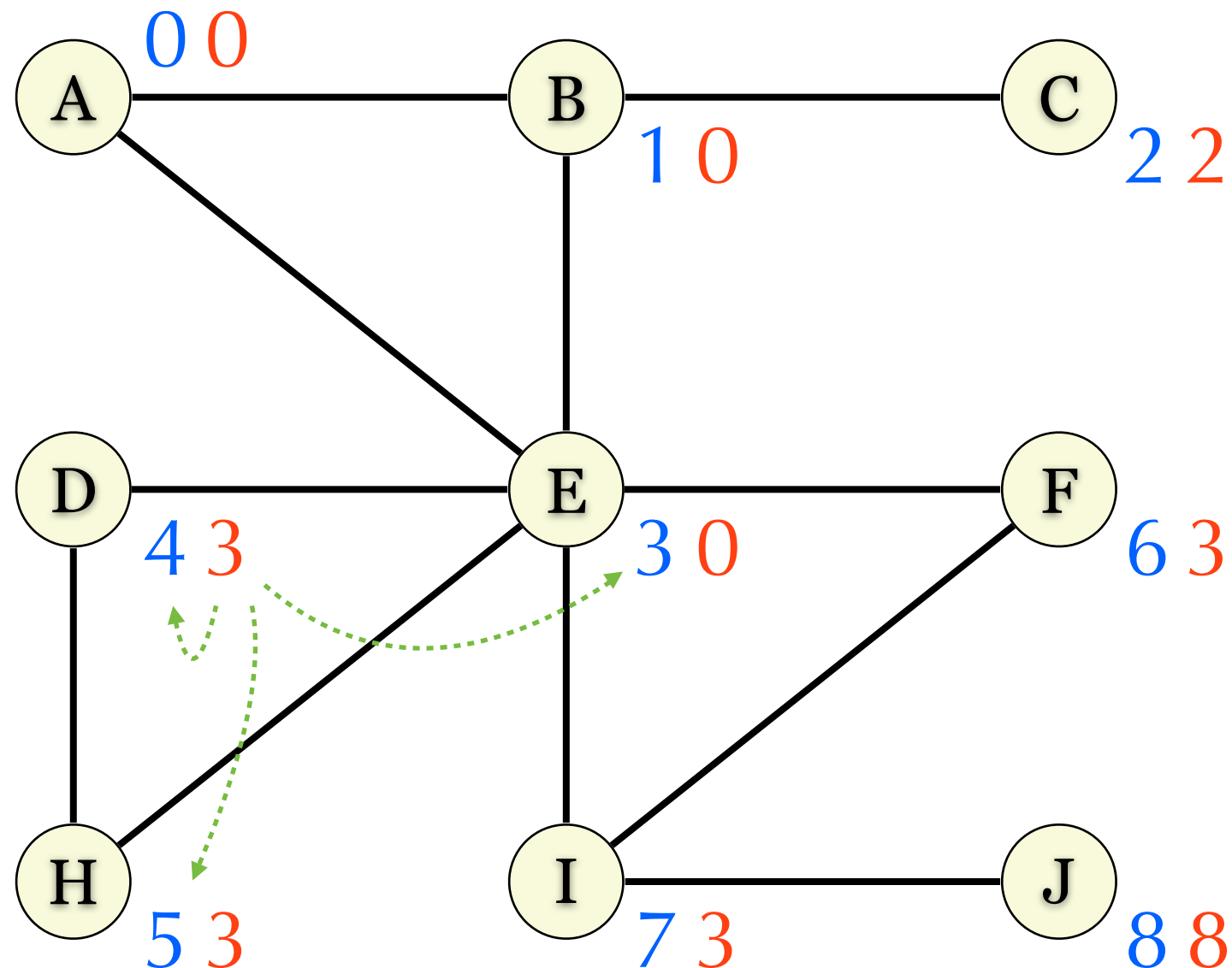
DFS order

Low value

DFS  
tree



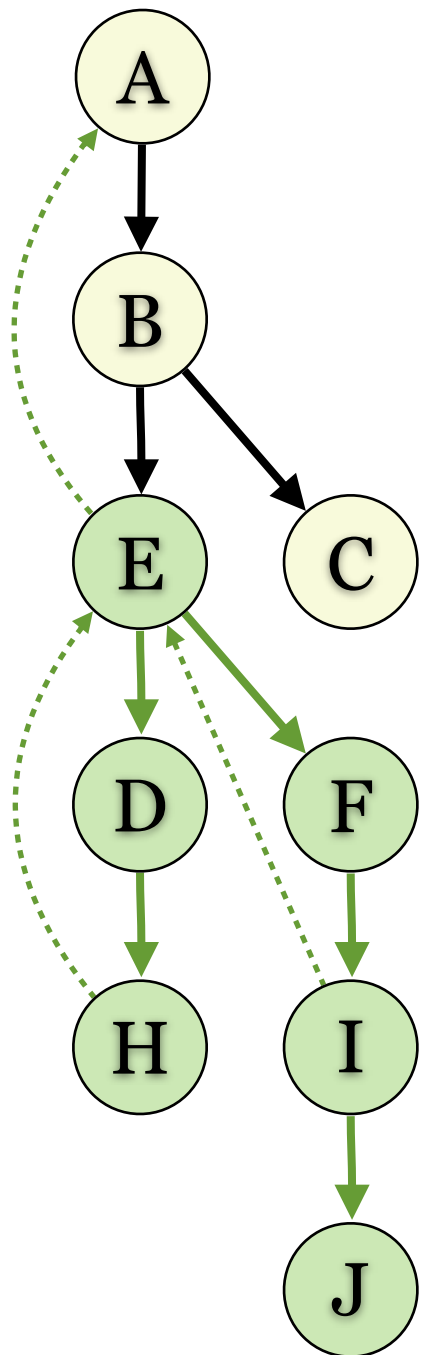
# Another Example



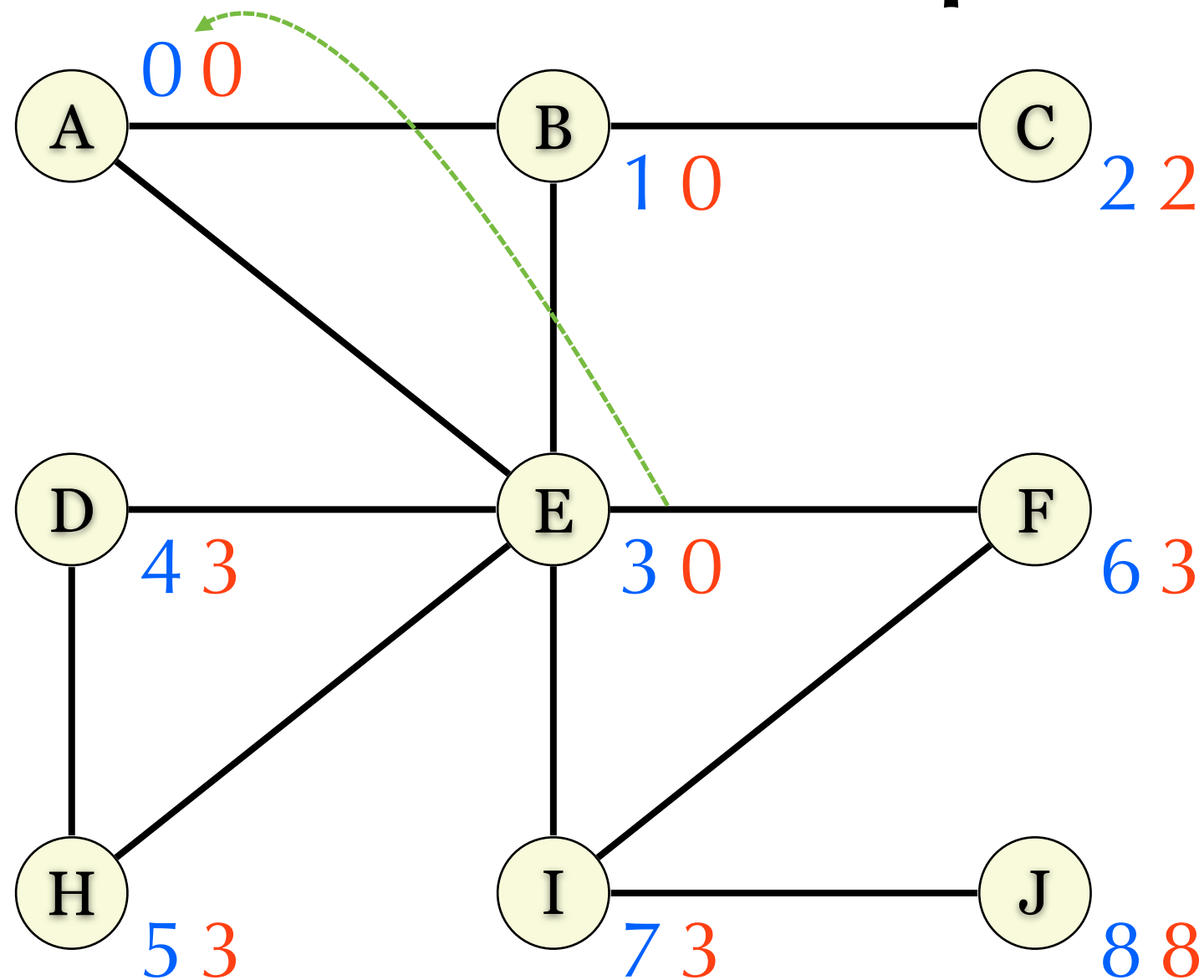
DFS order

Low value

DFS  
tree



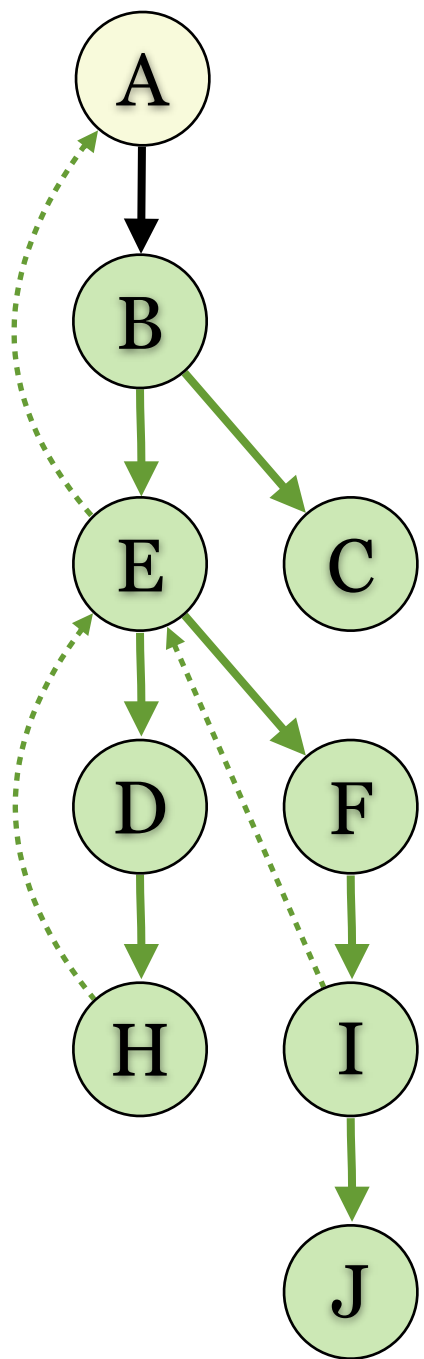
# Another Example



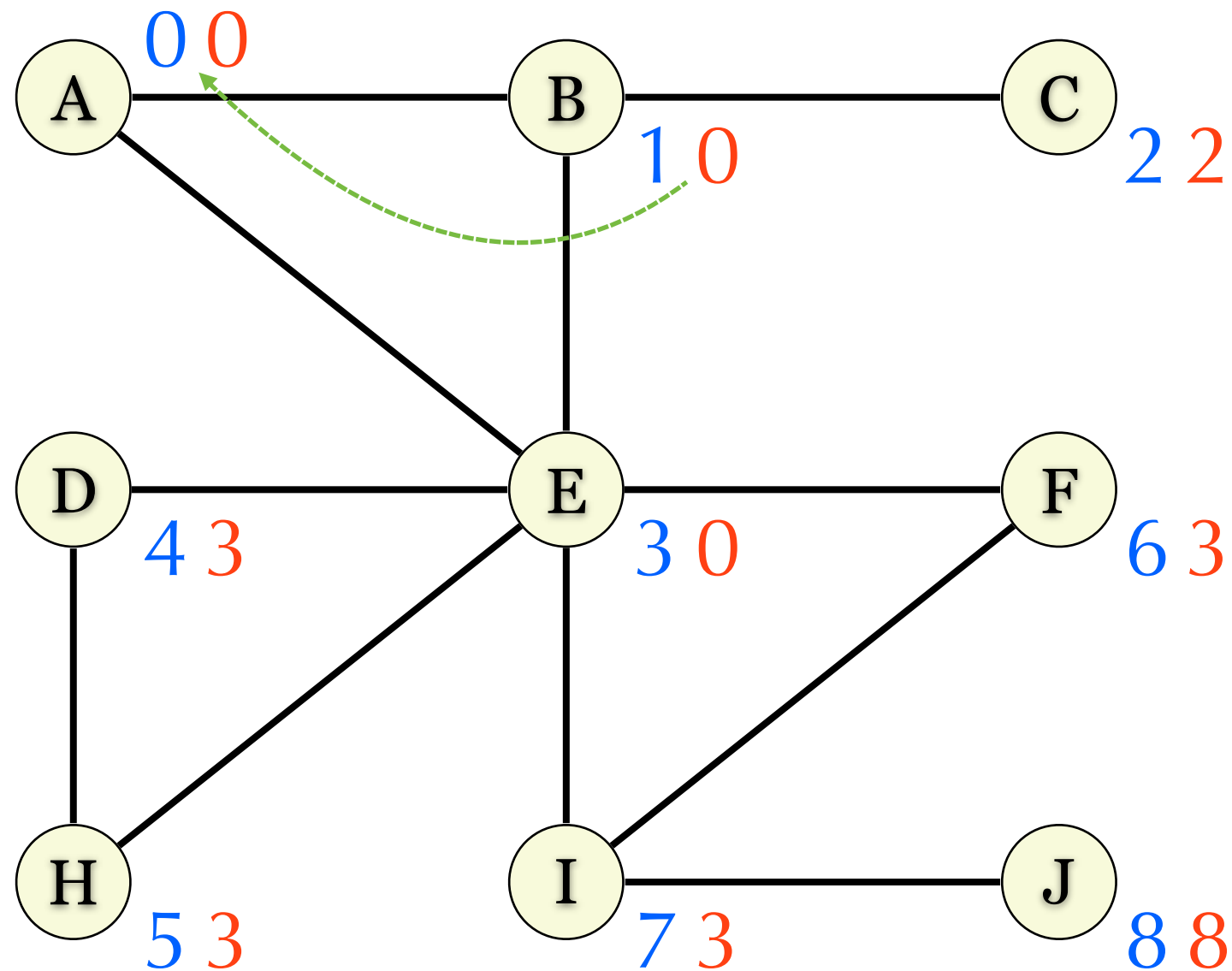
DFS order

Low value

DFS  
tree



# Another Example



DFS order

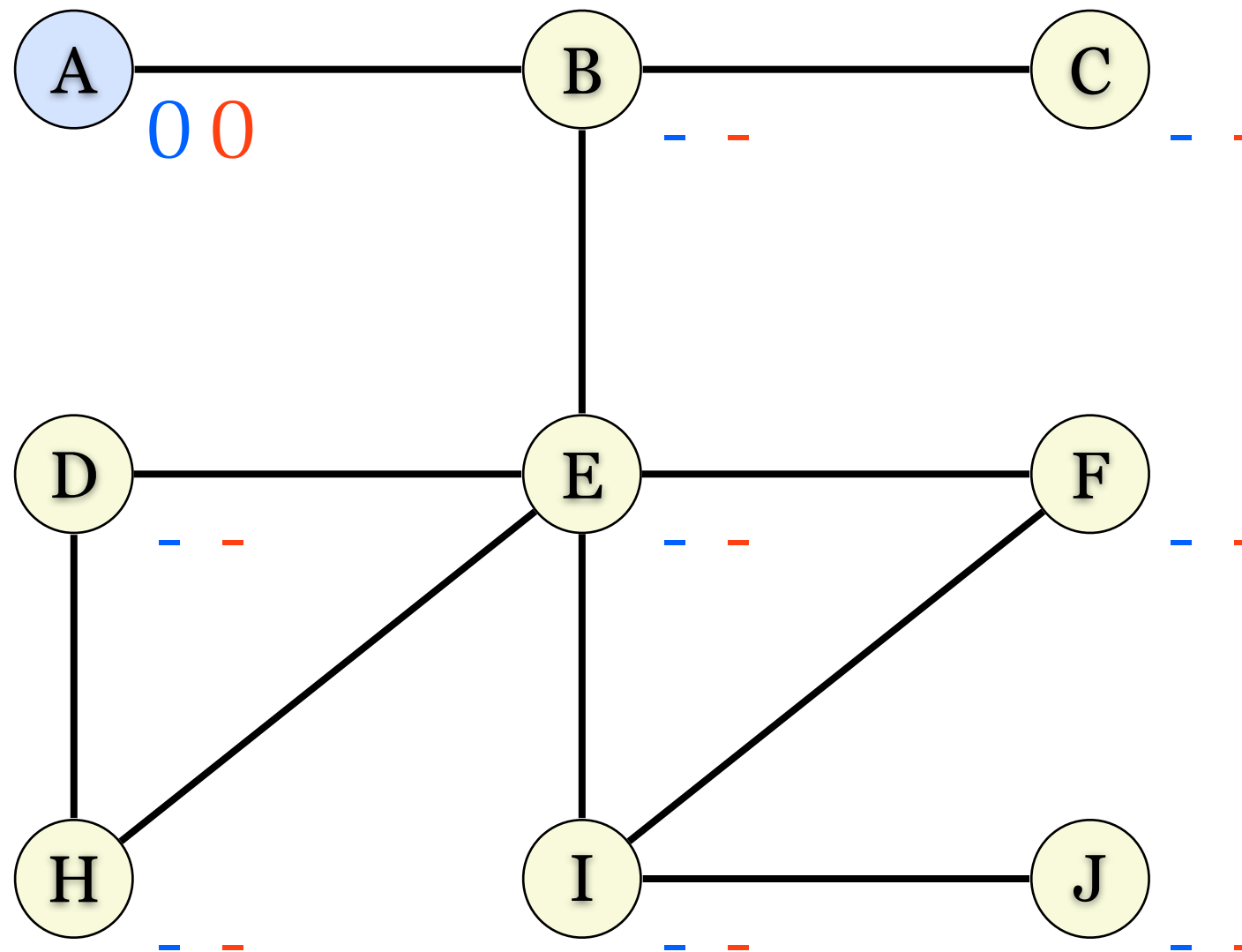
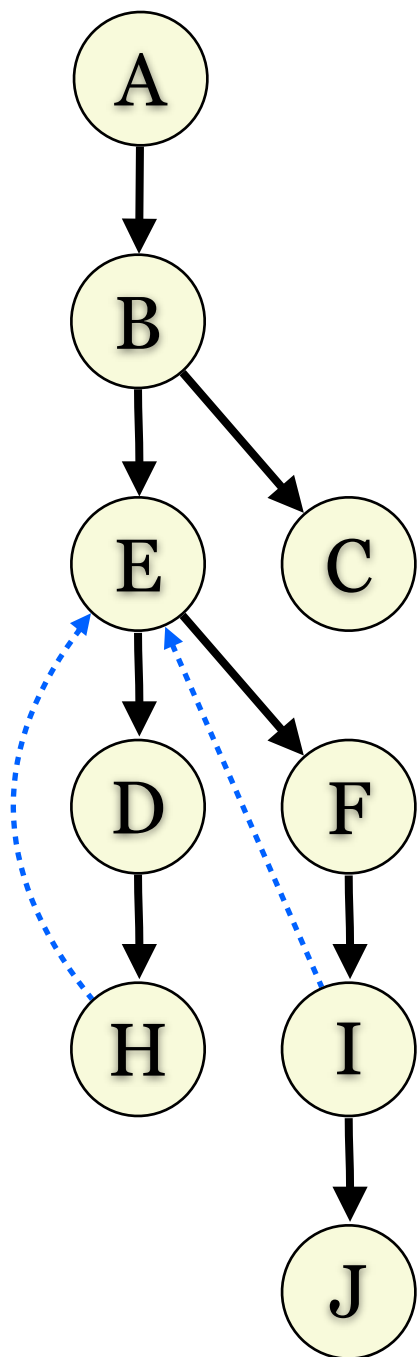
Low value

DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

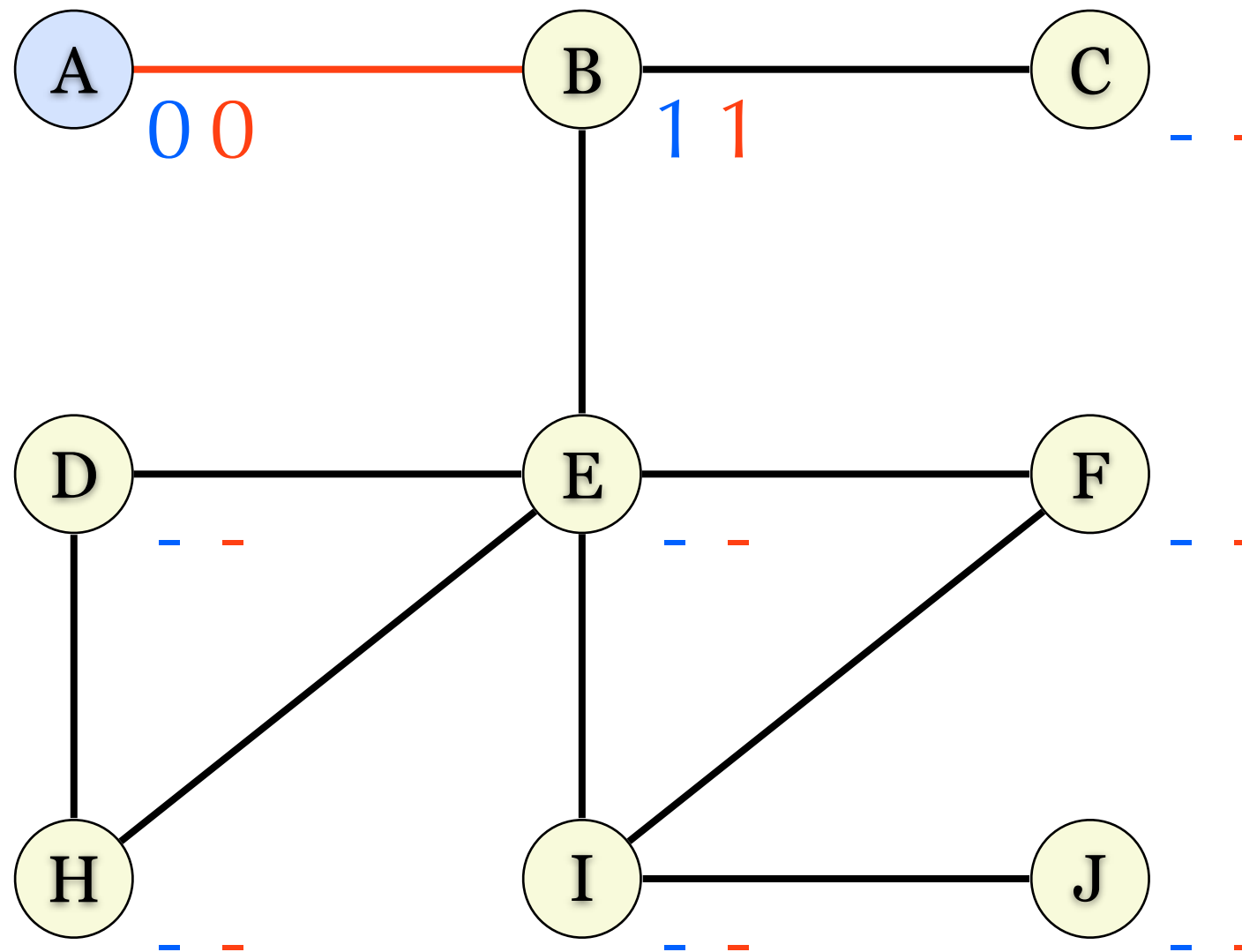
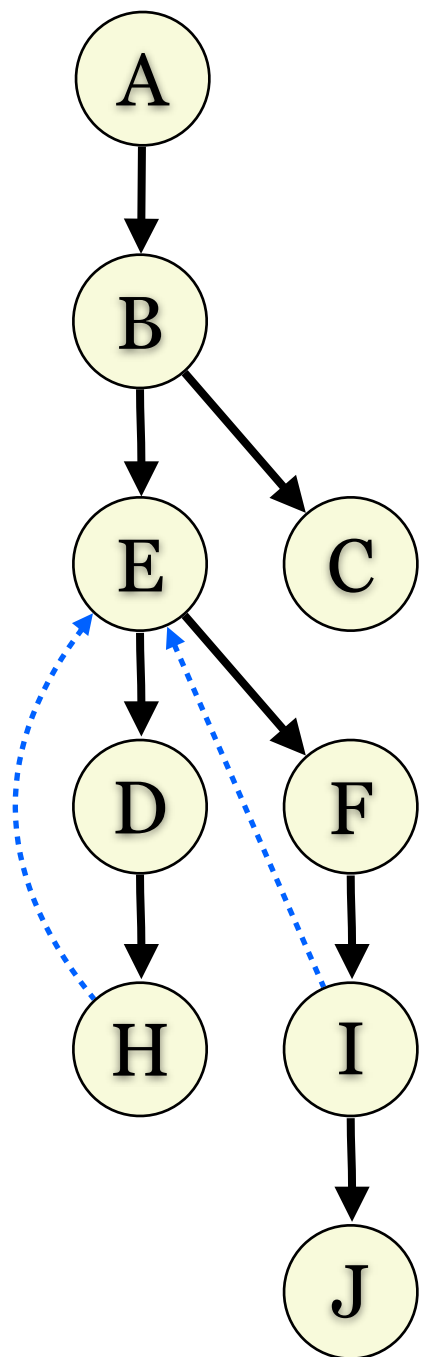


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value



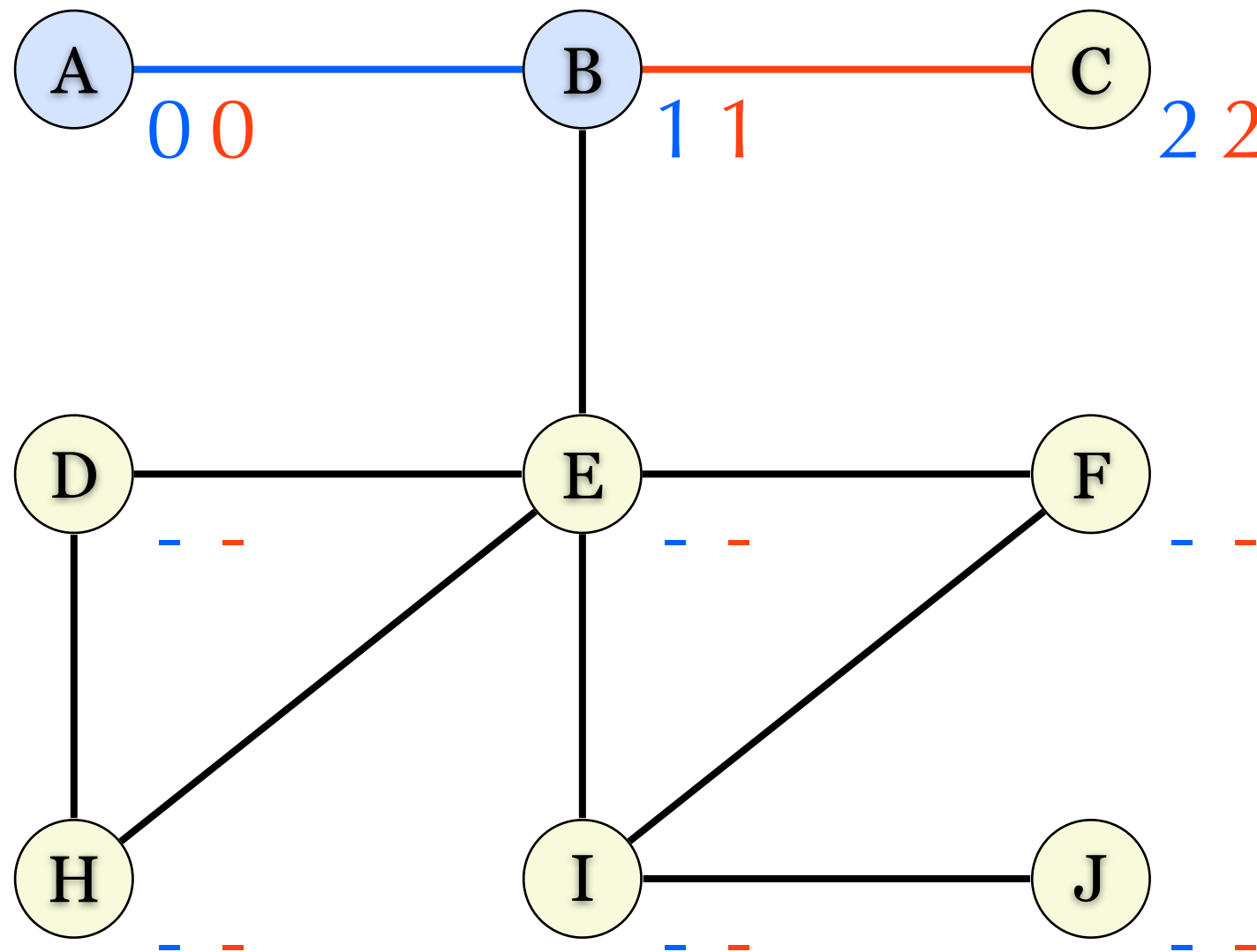
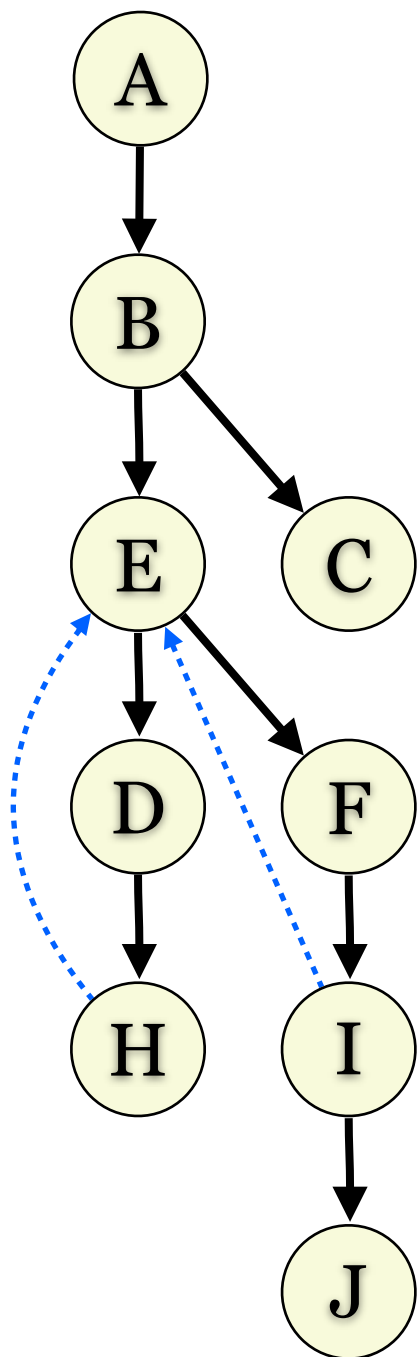


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

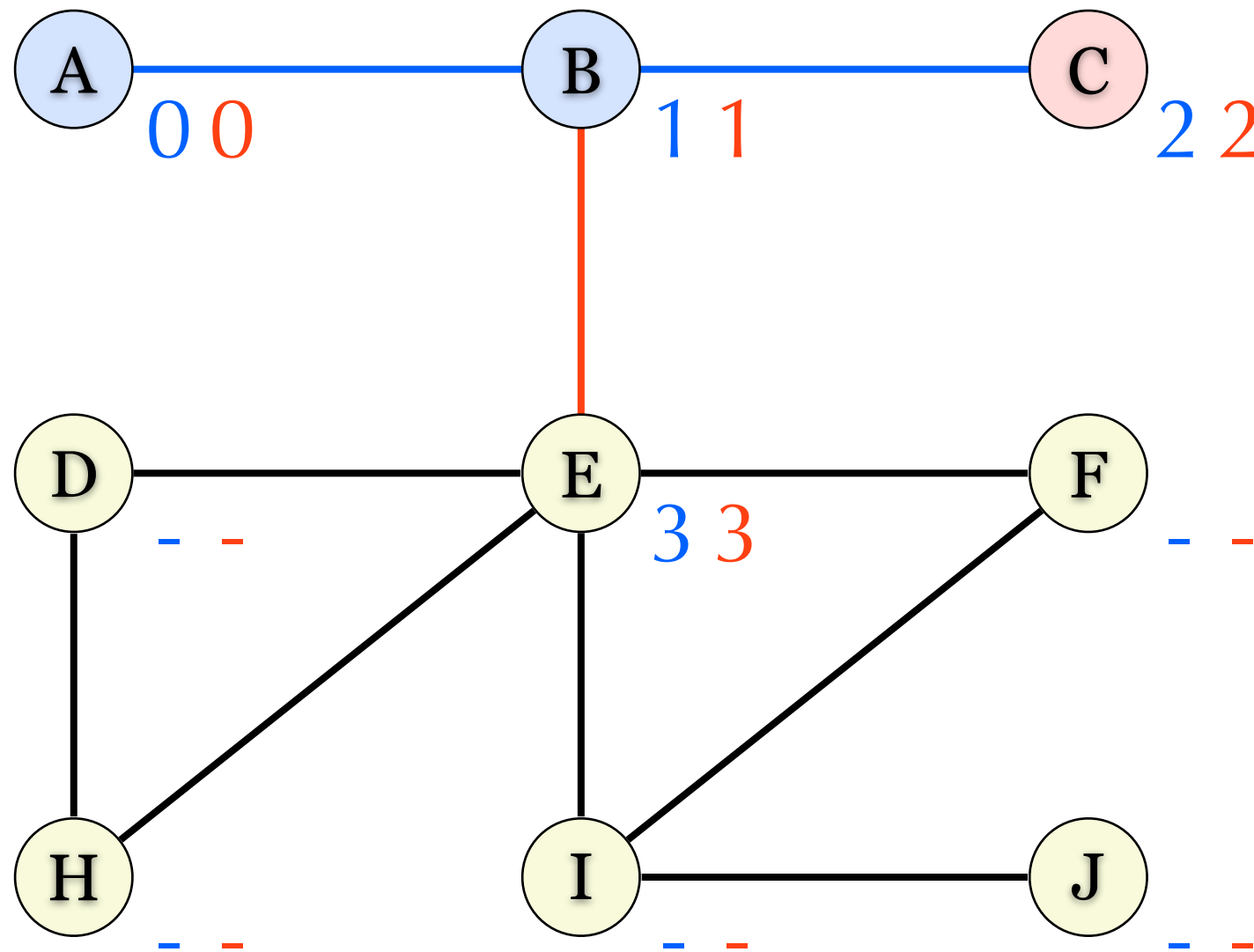
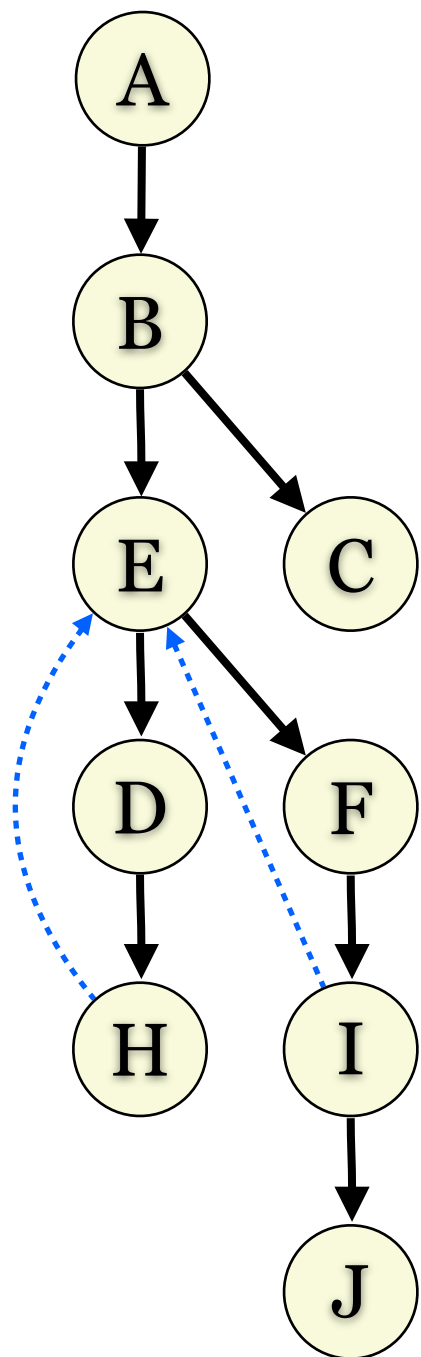


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

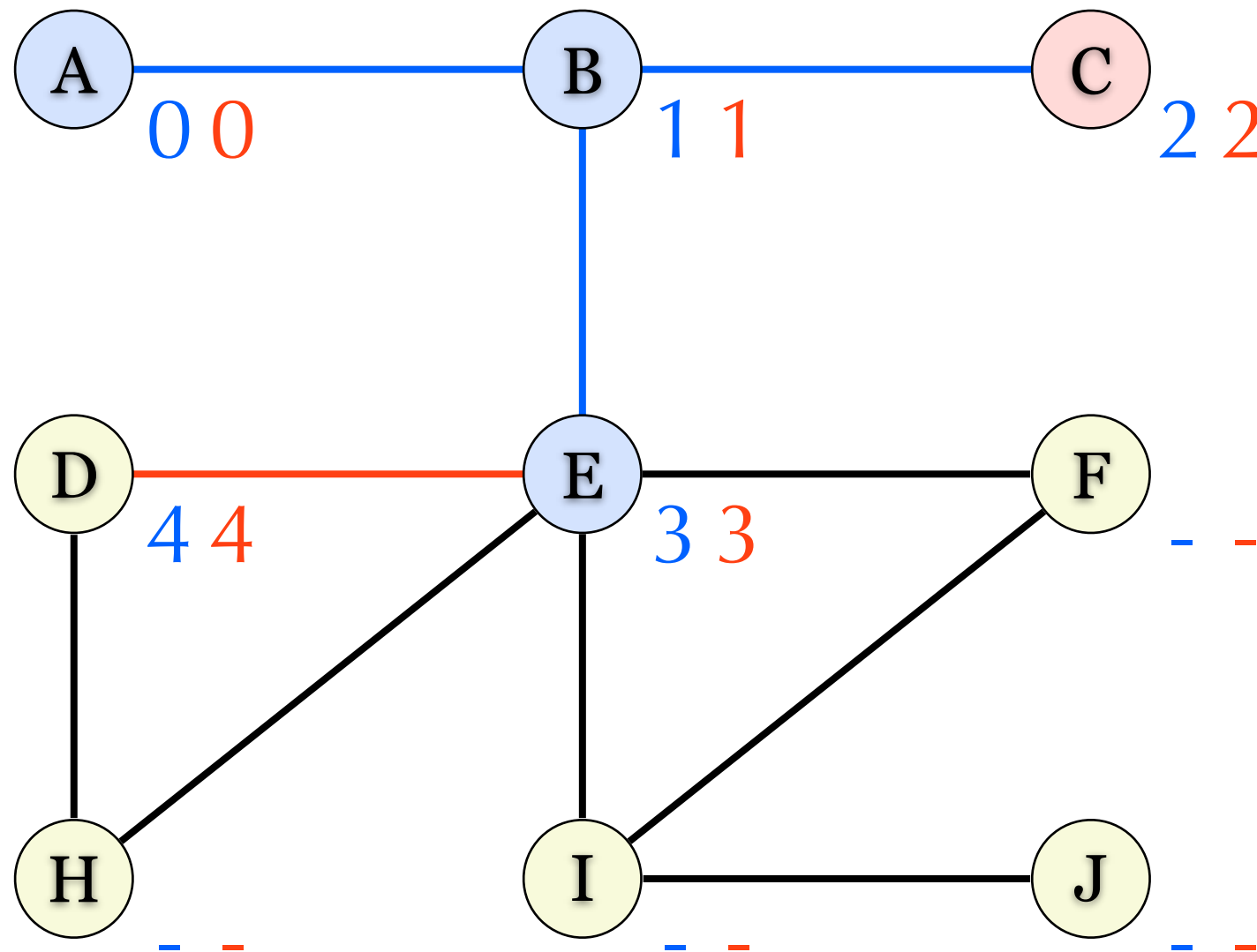
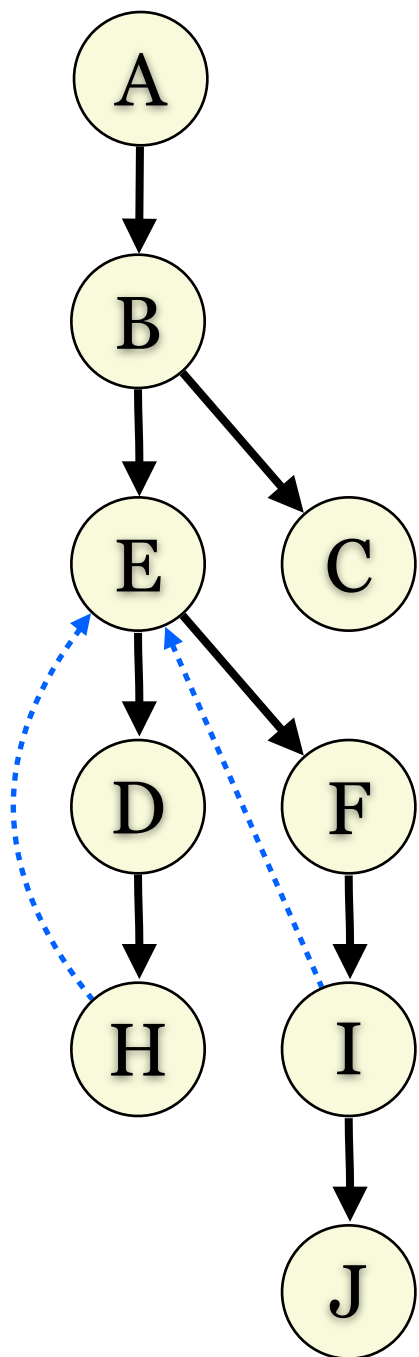


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

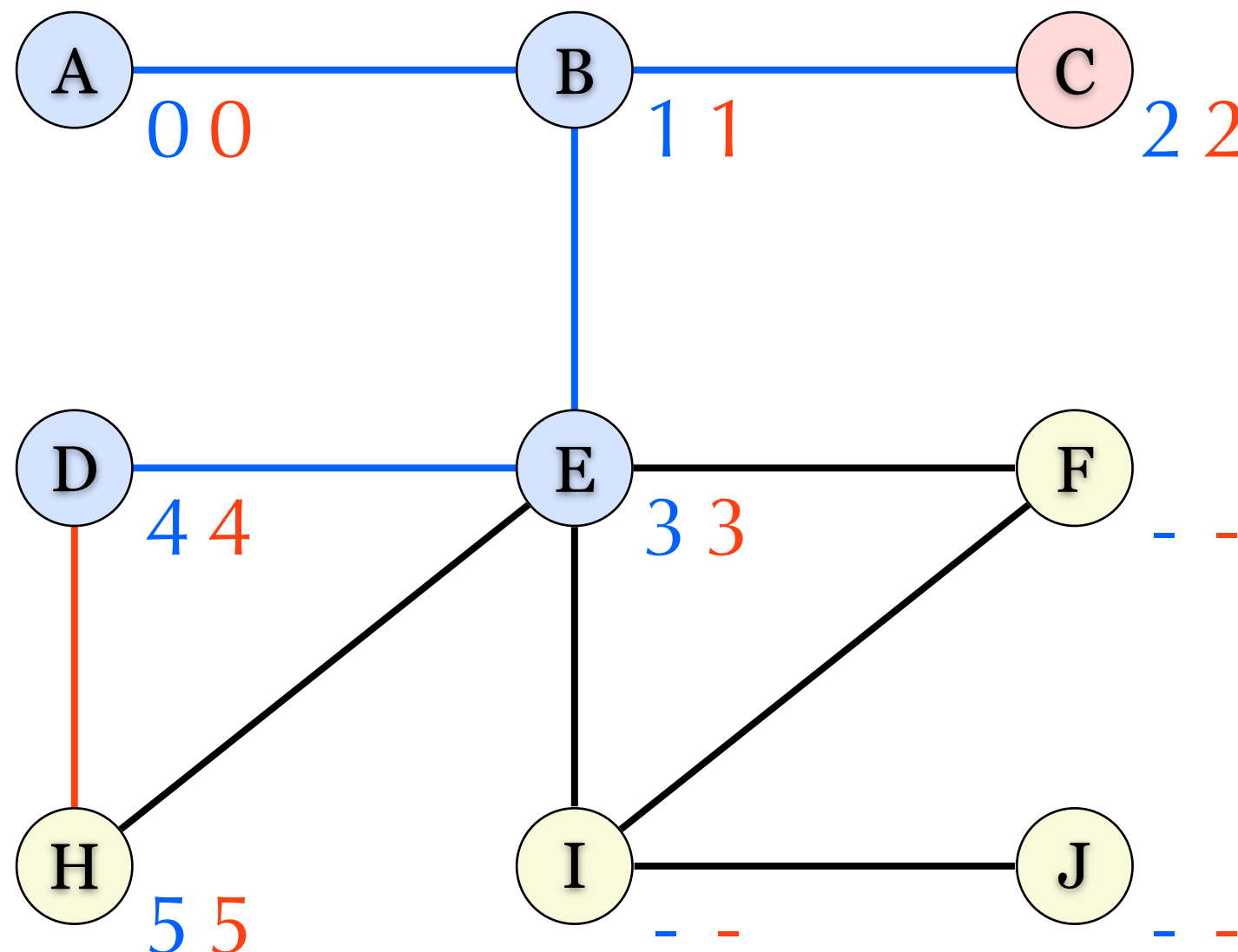
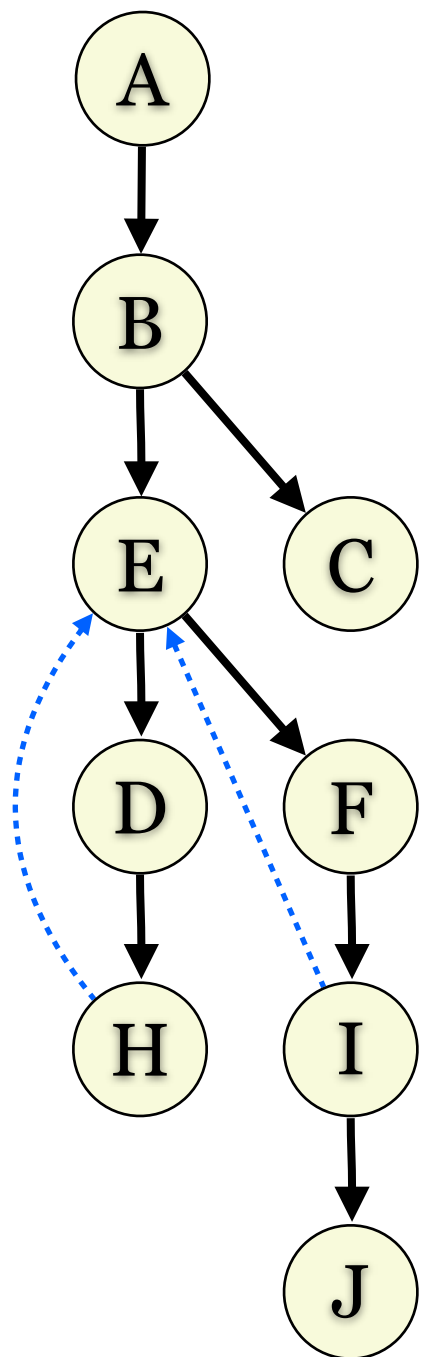


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

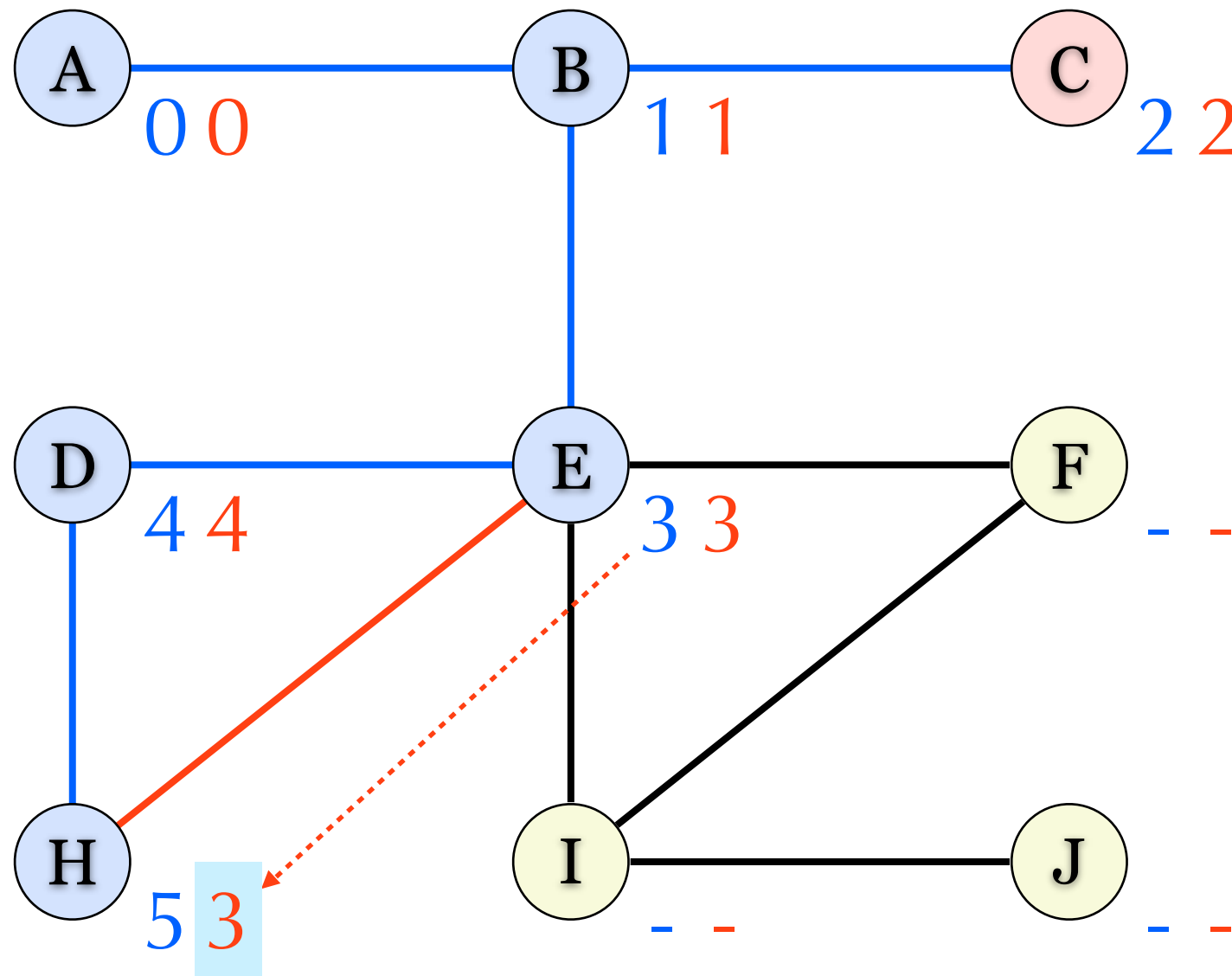
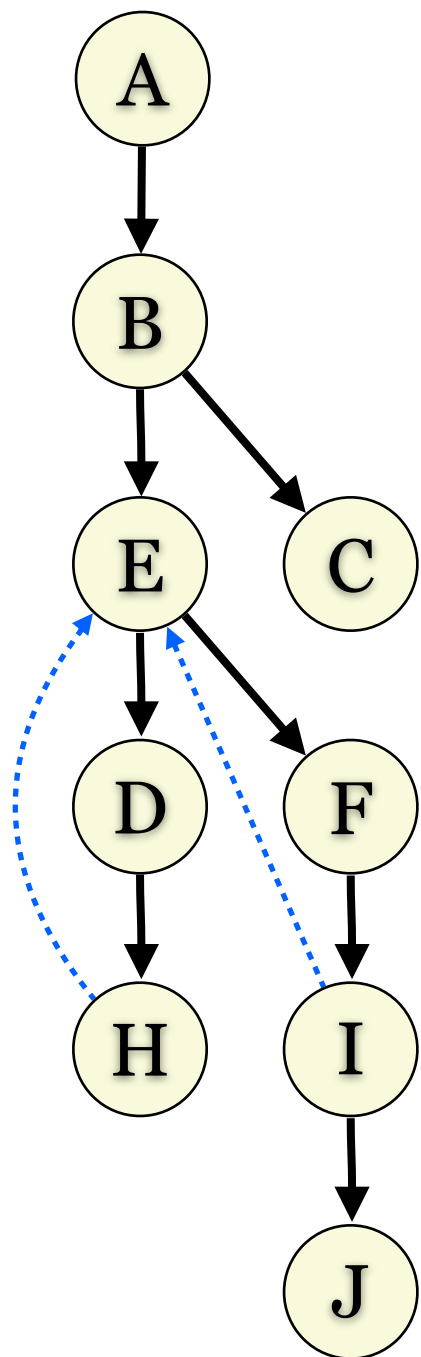


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

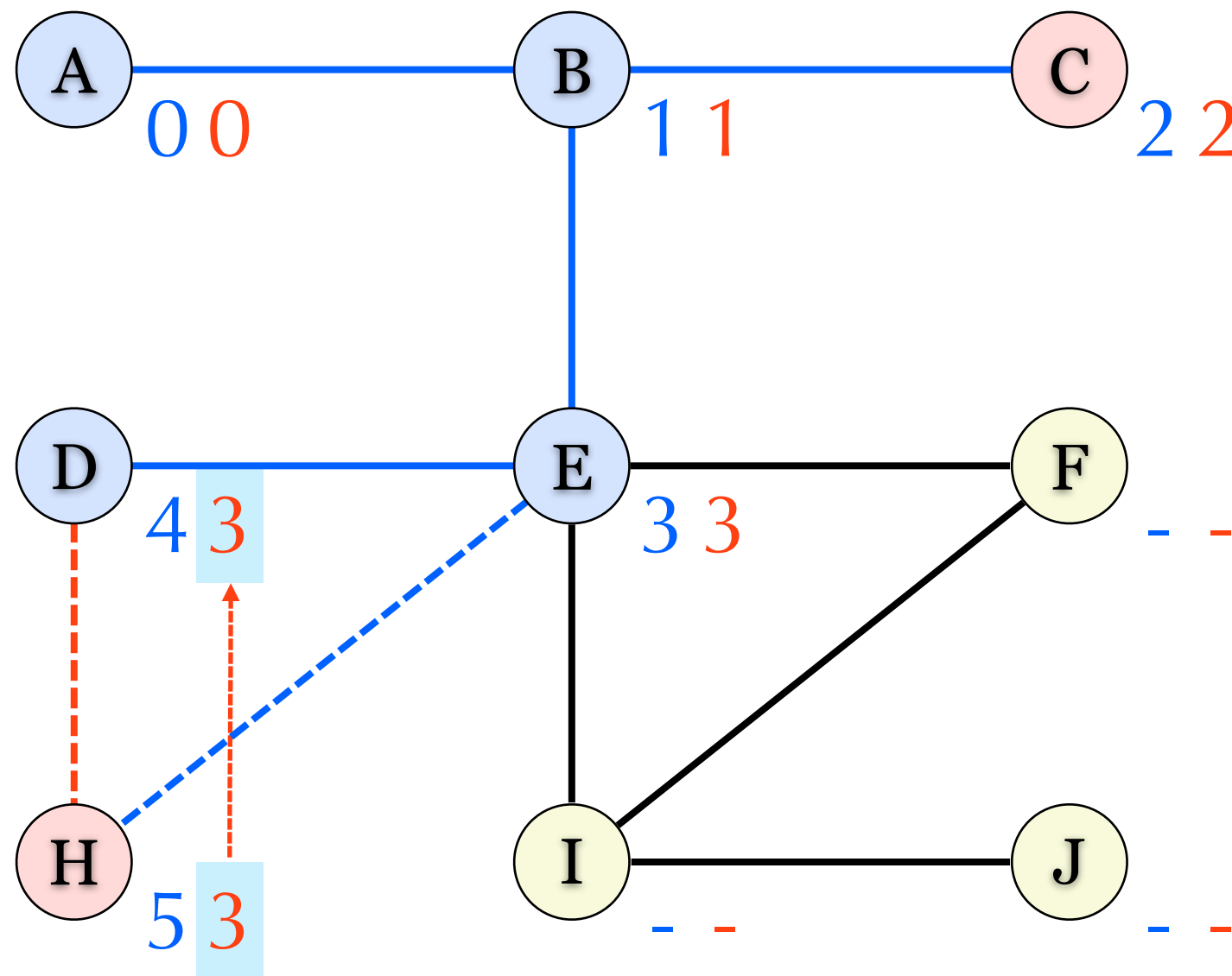
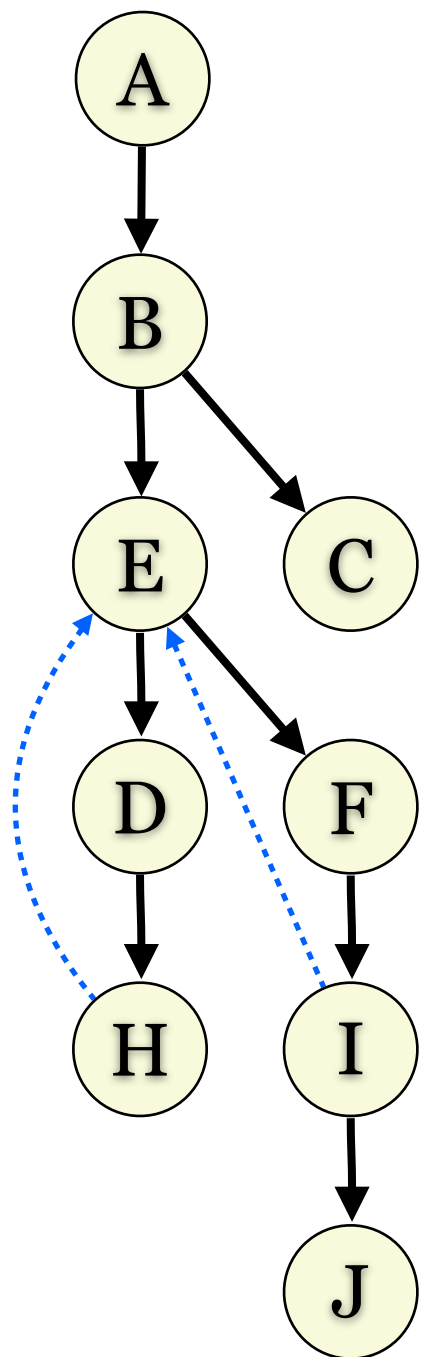


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

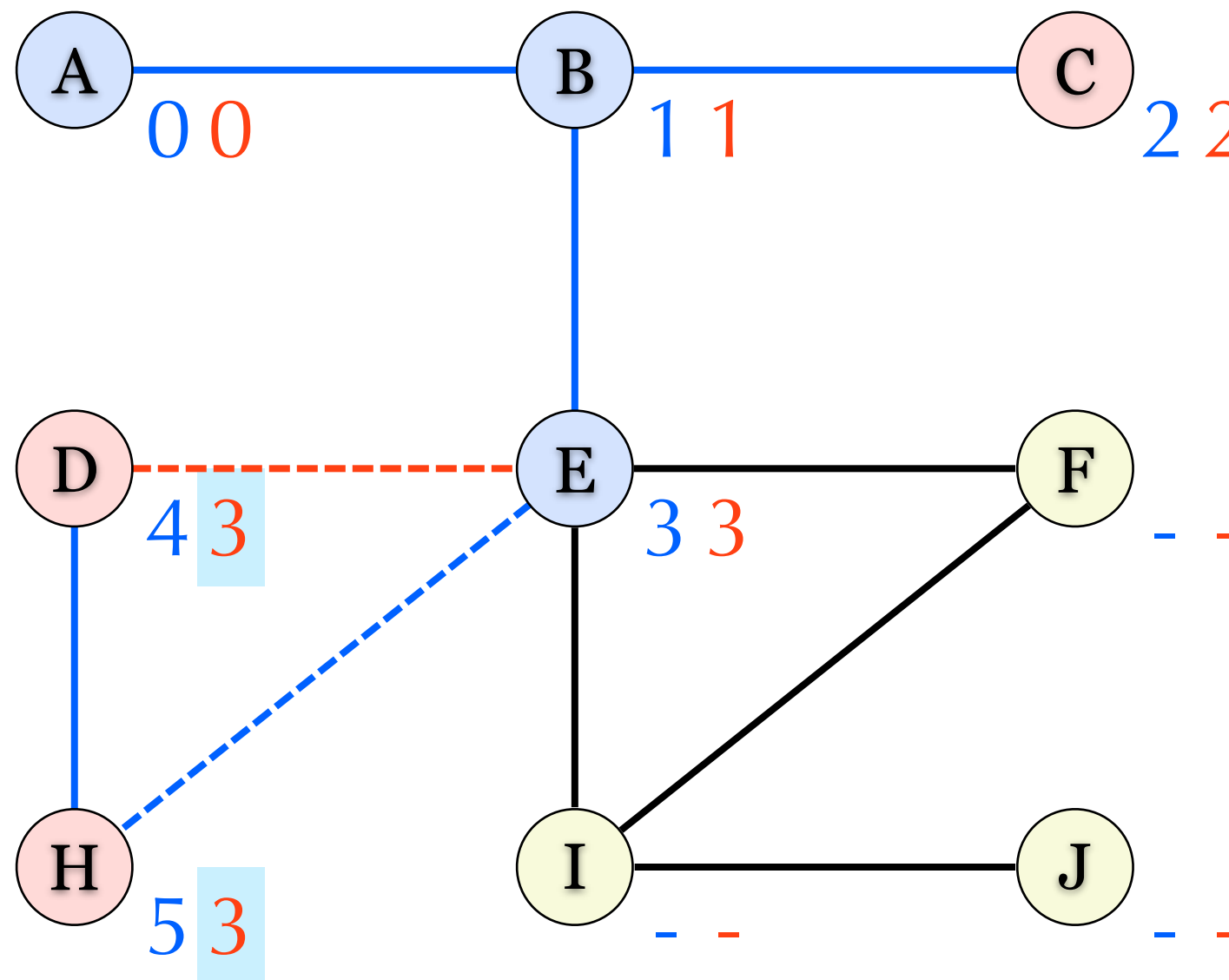
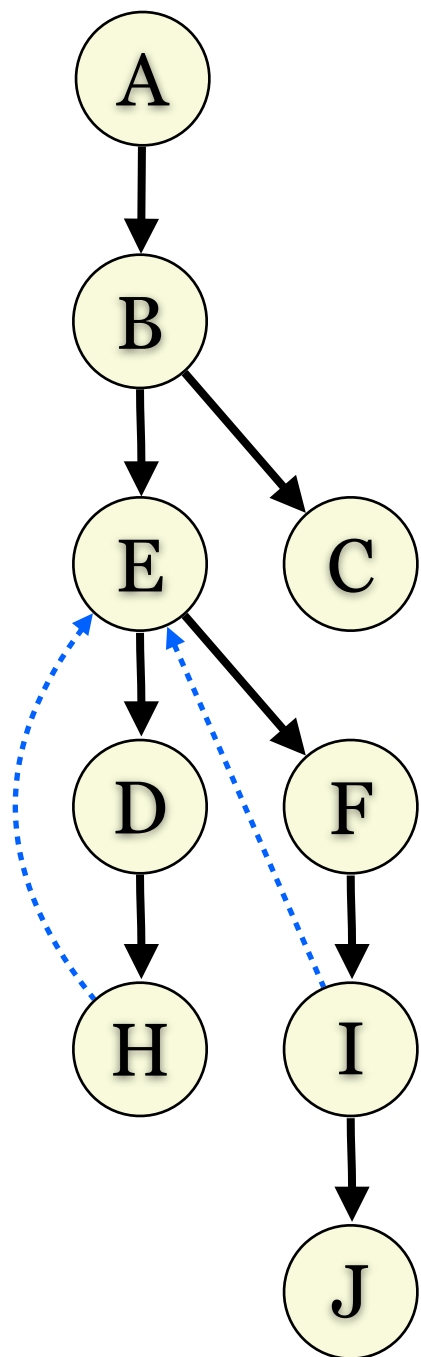


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

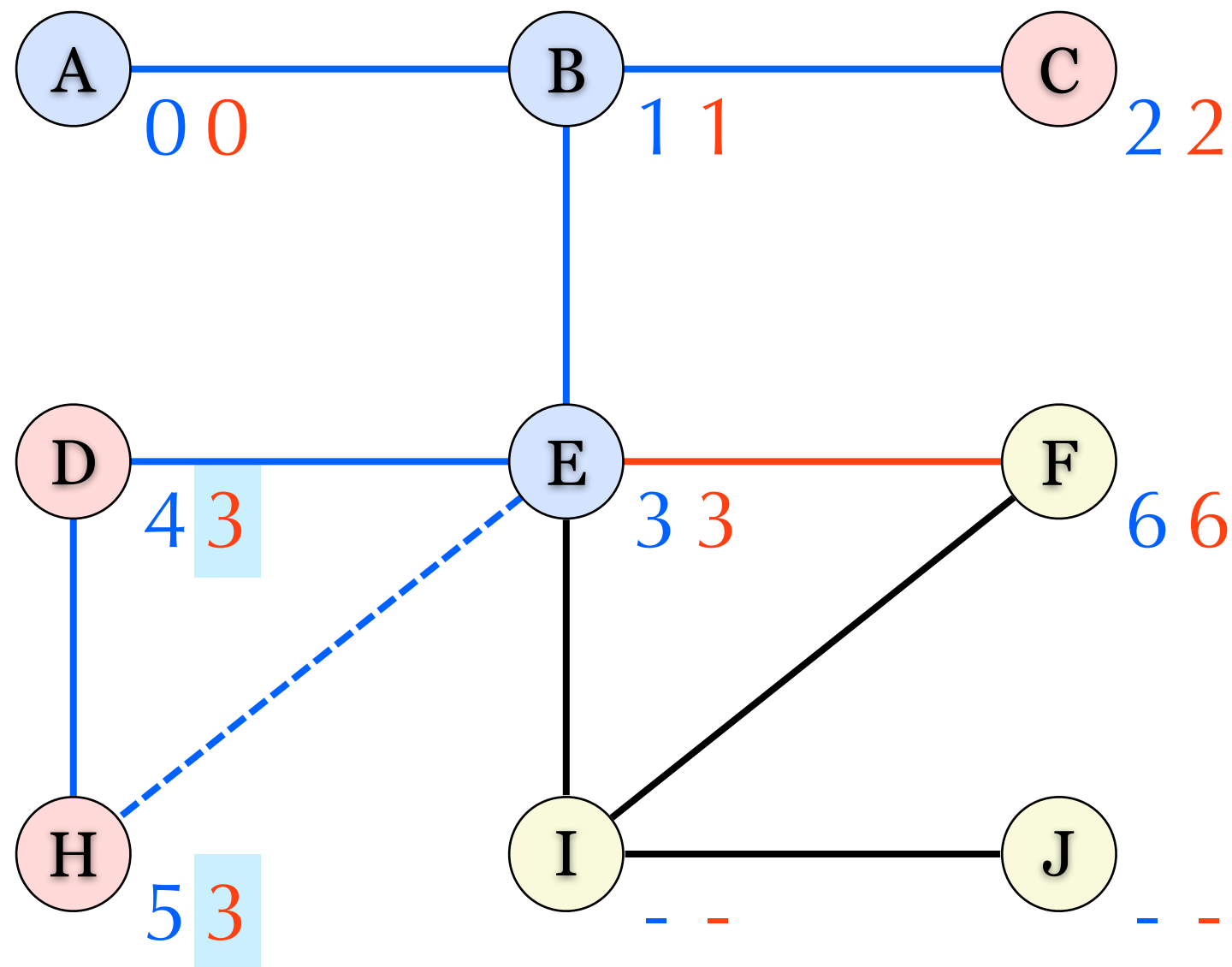
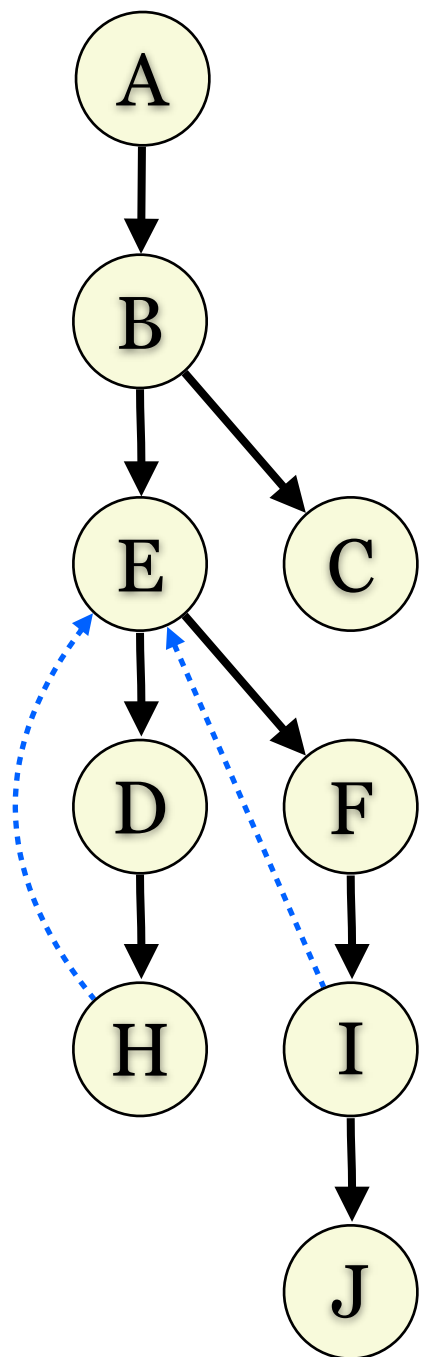


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value



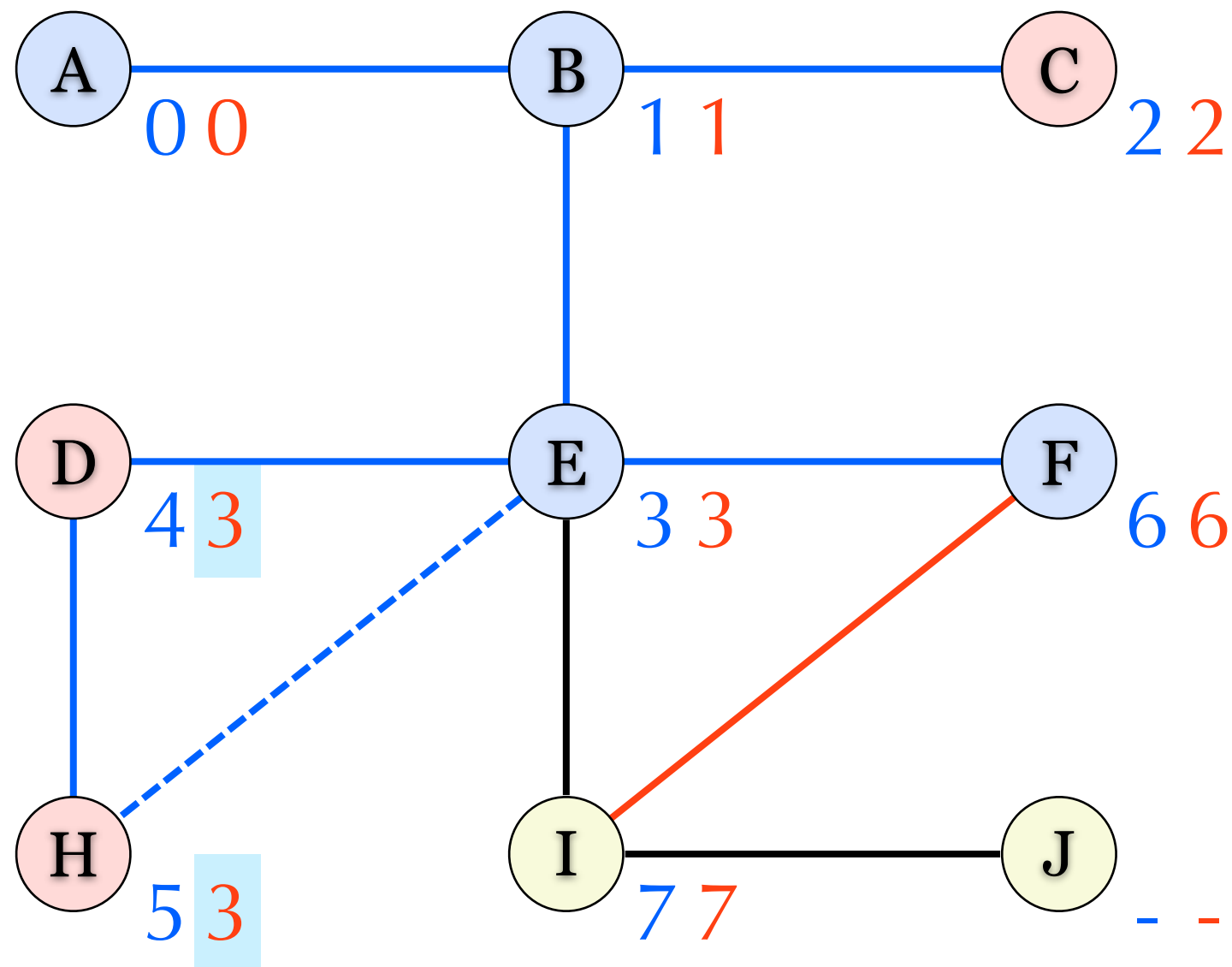
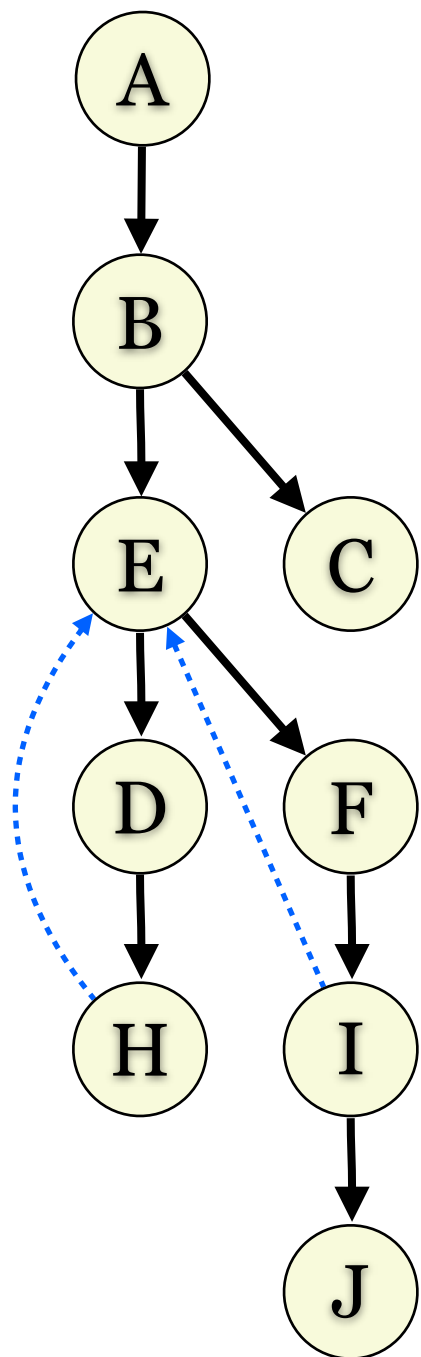


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

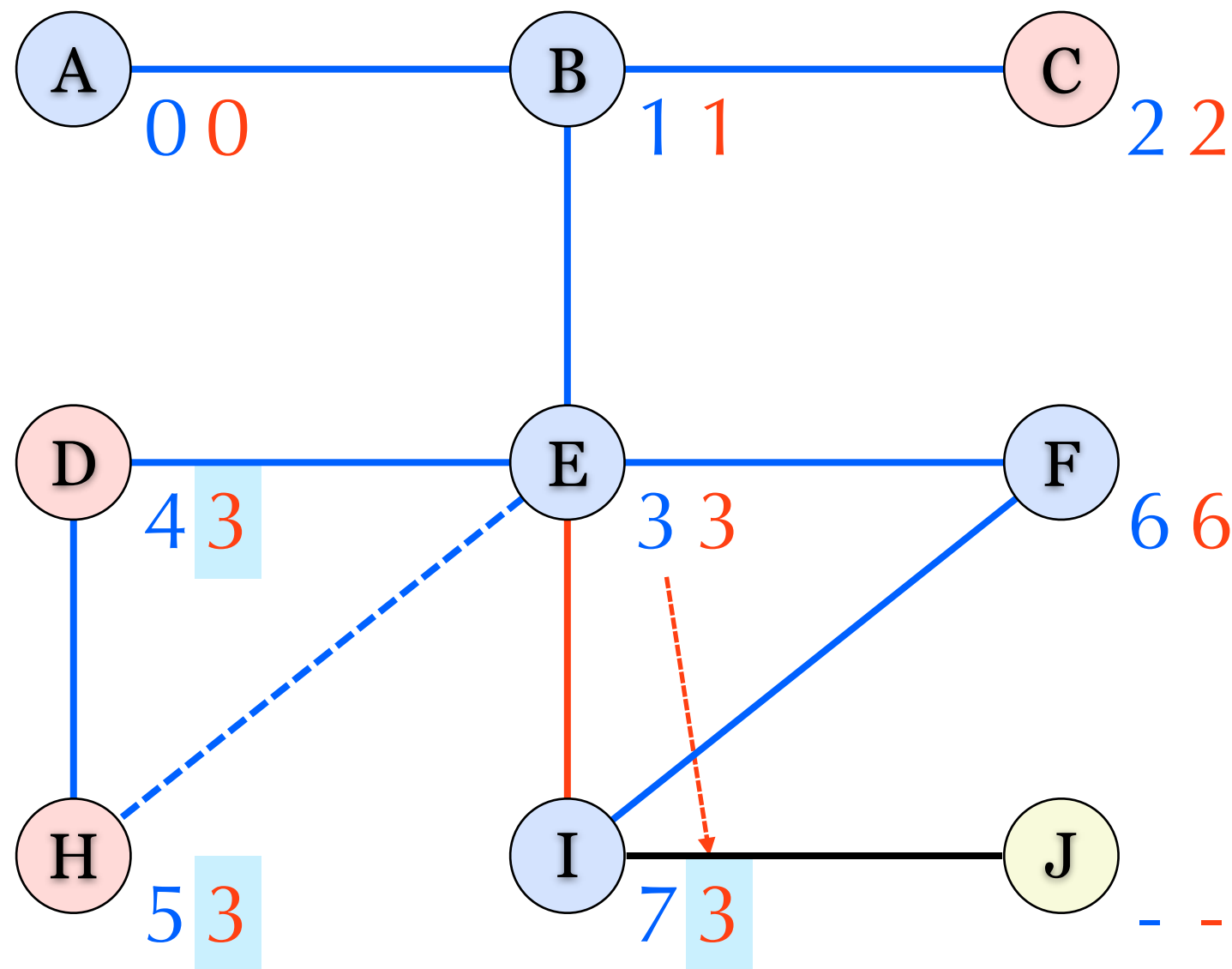
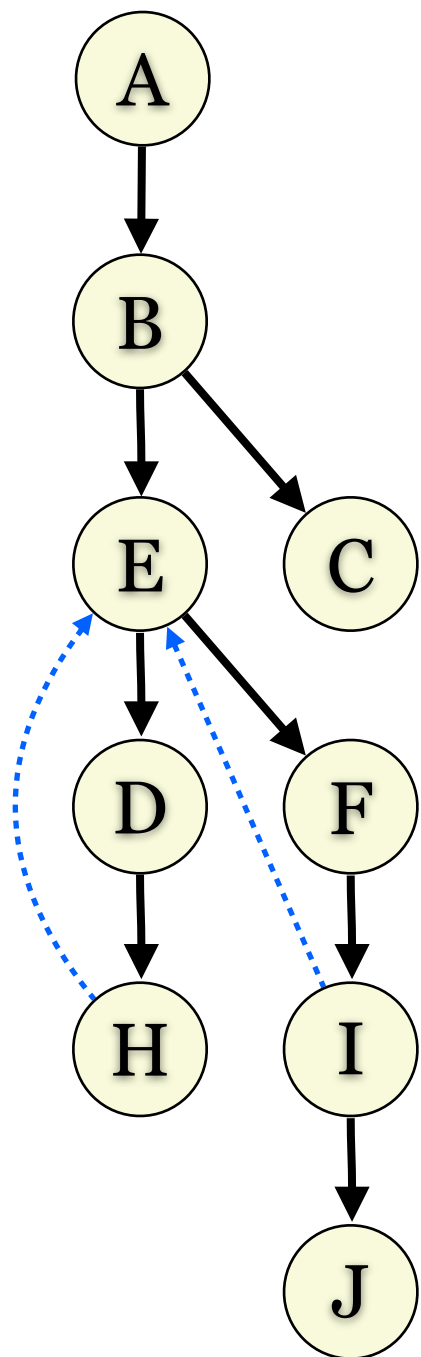


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

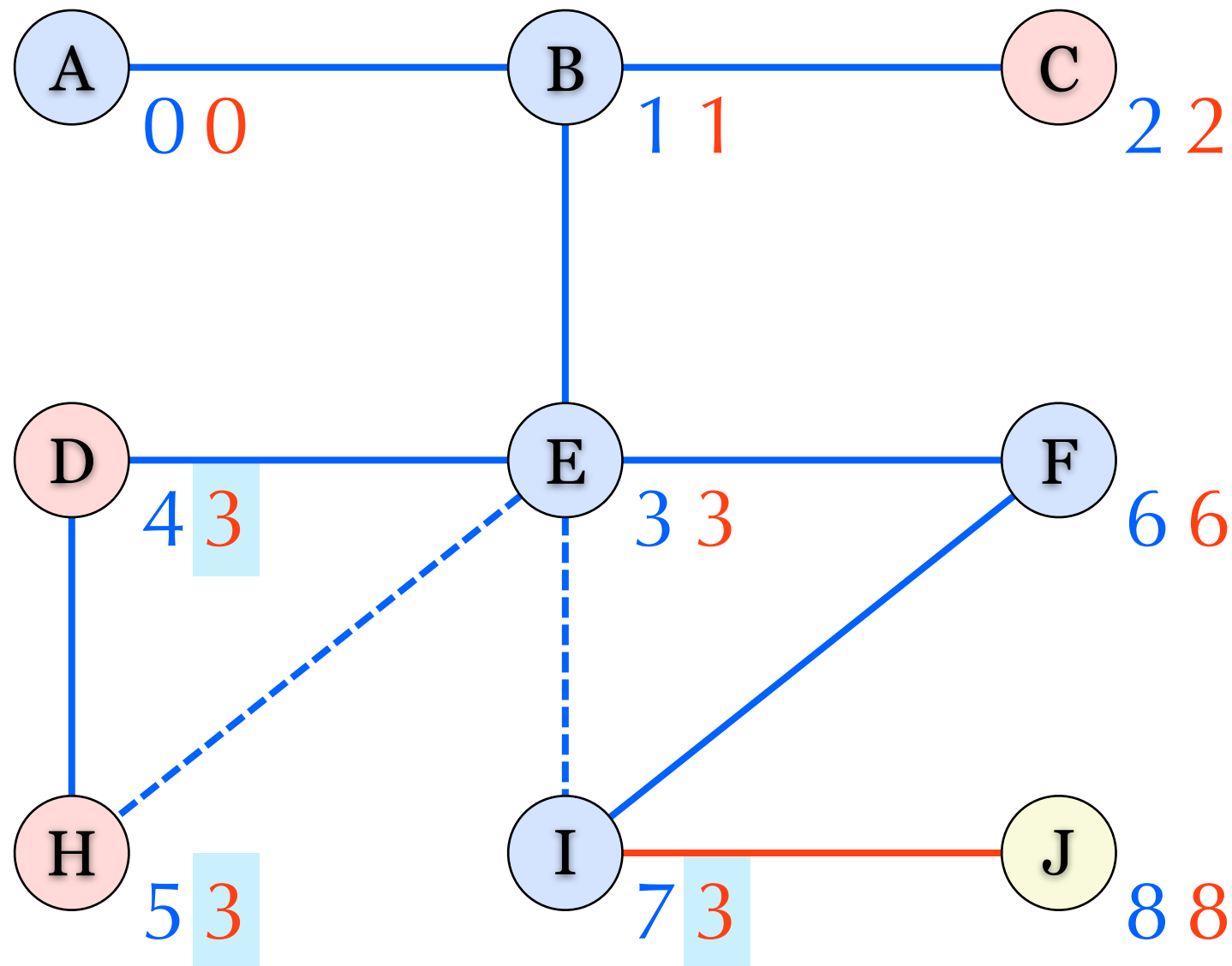
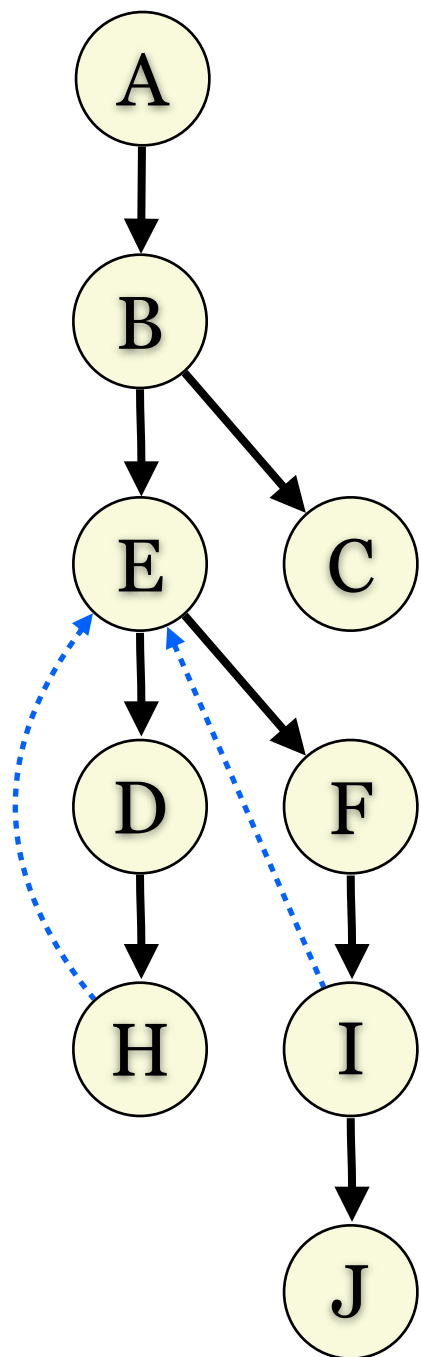


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

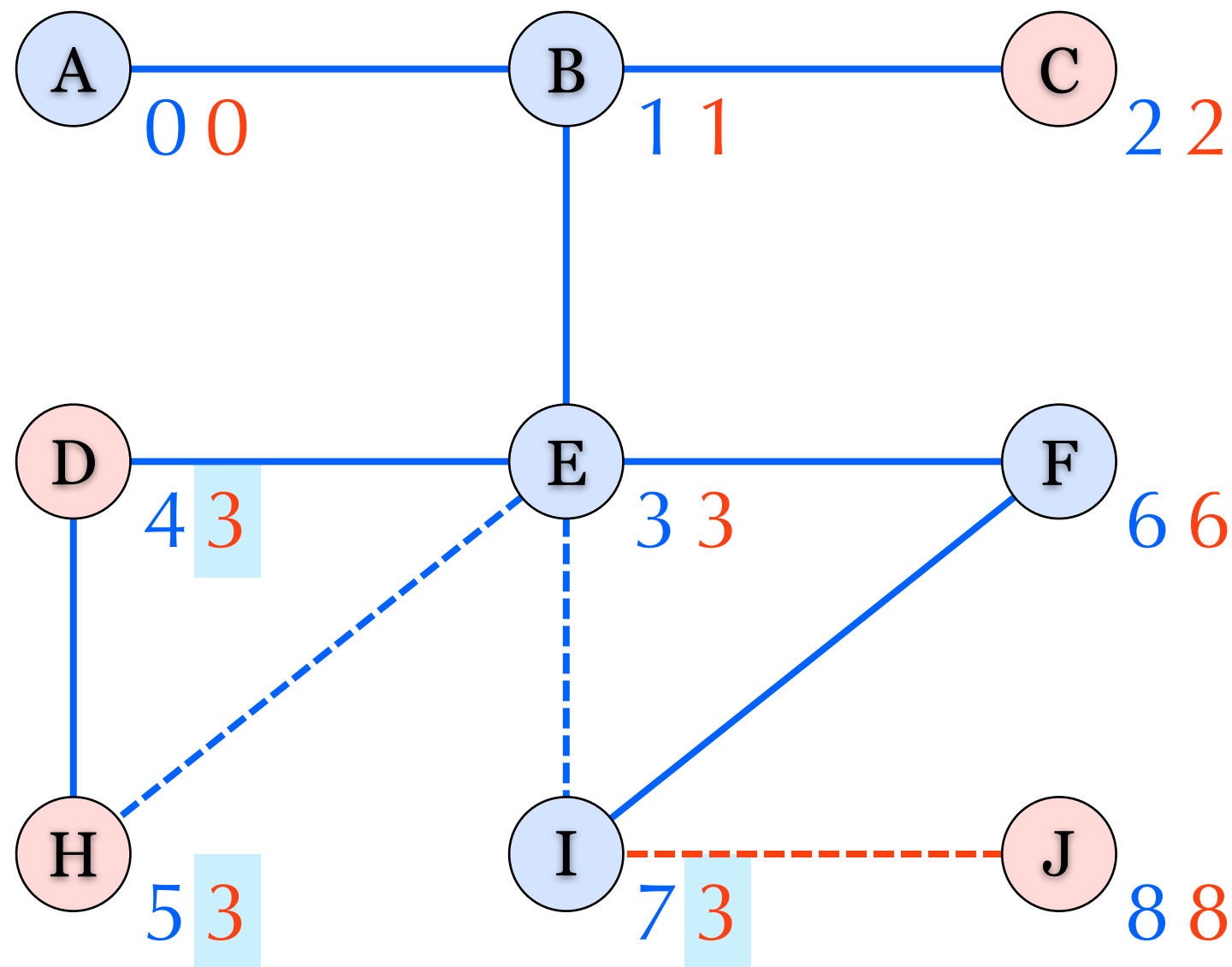
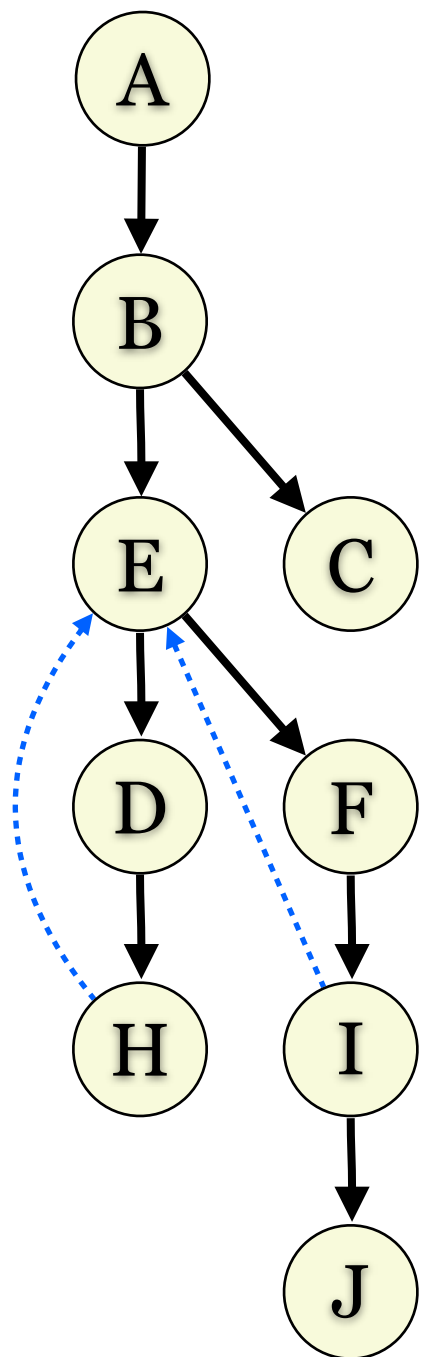


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

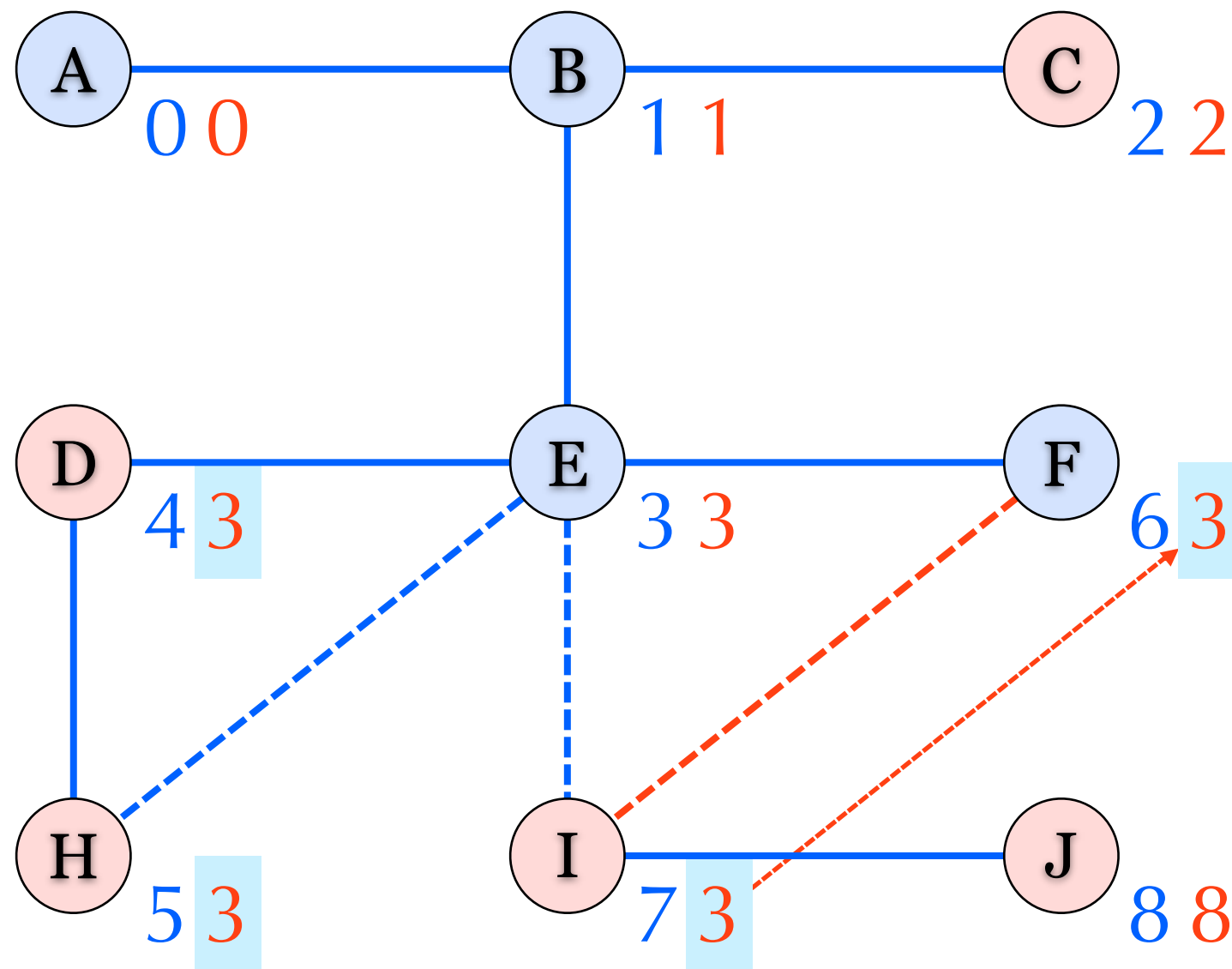
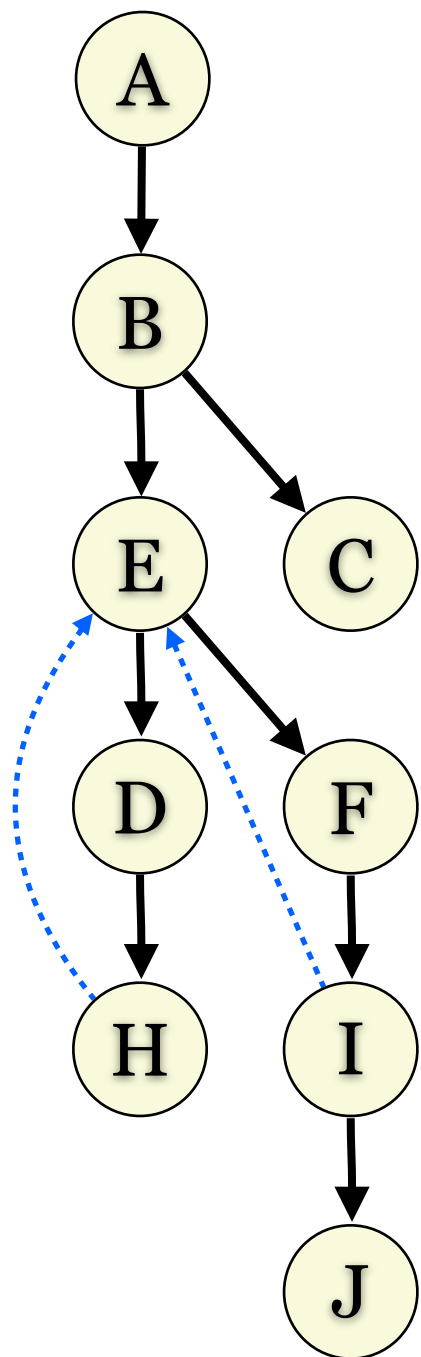


DFS  
tree

# DFS Based Algorithm

DFS order

Compute  
Low value

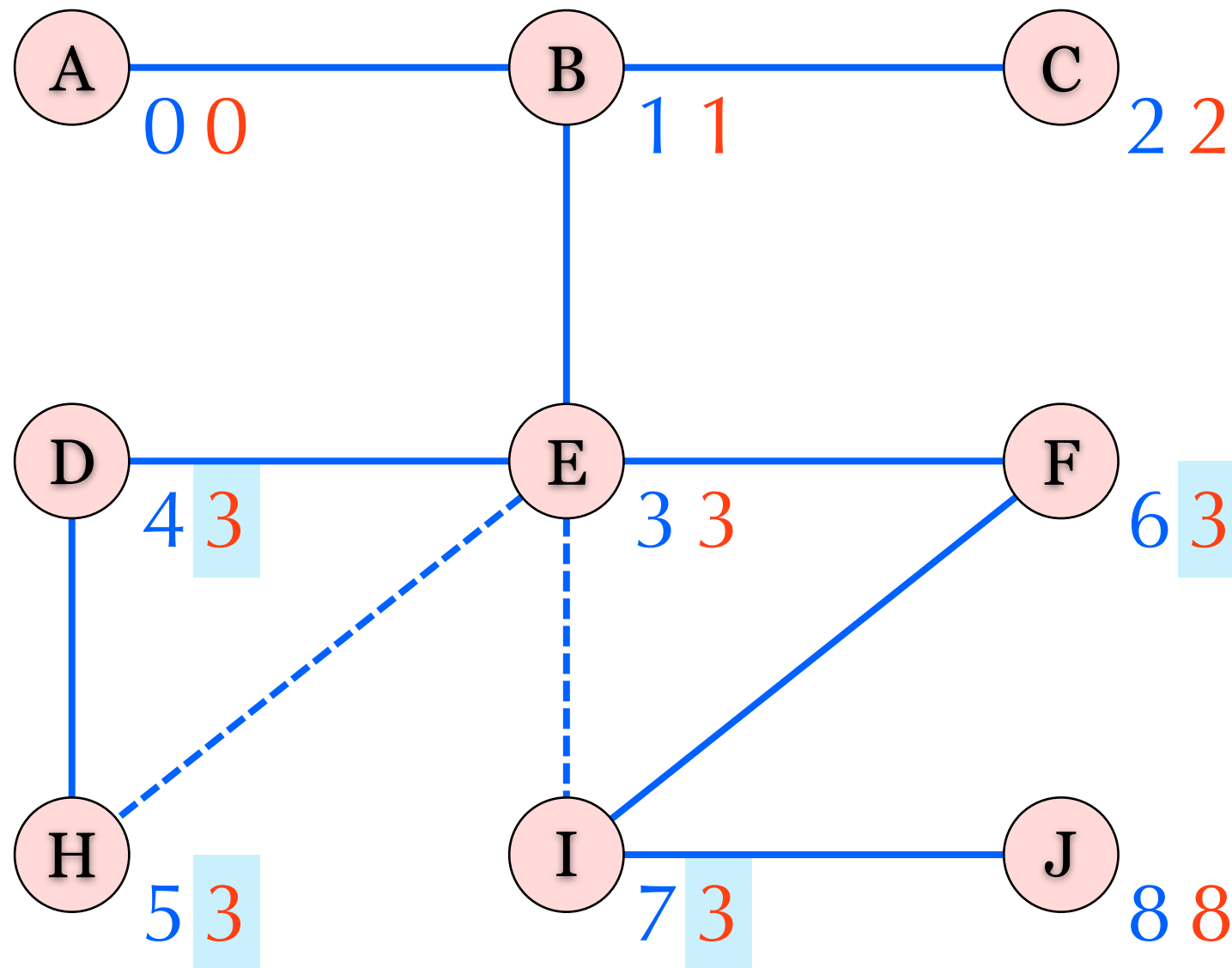
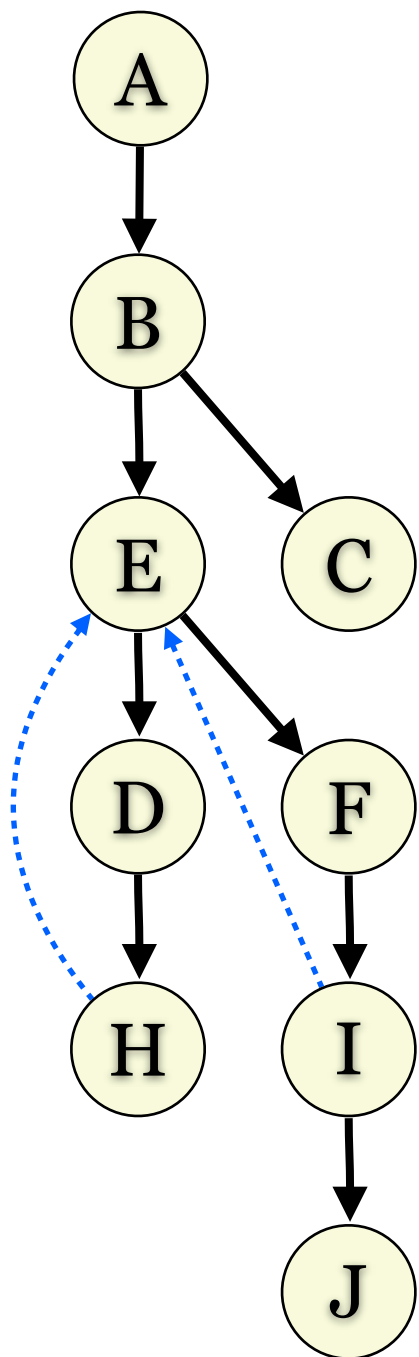


DFS  
tree

# DFS Based Algorithm

DFS order

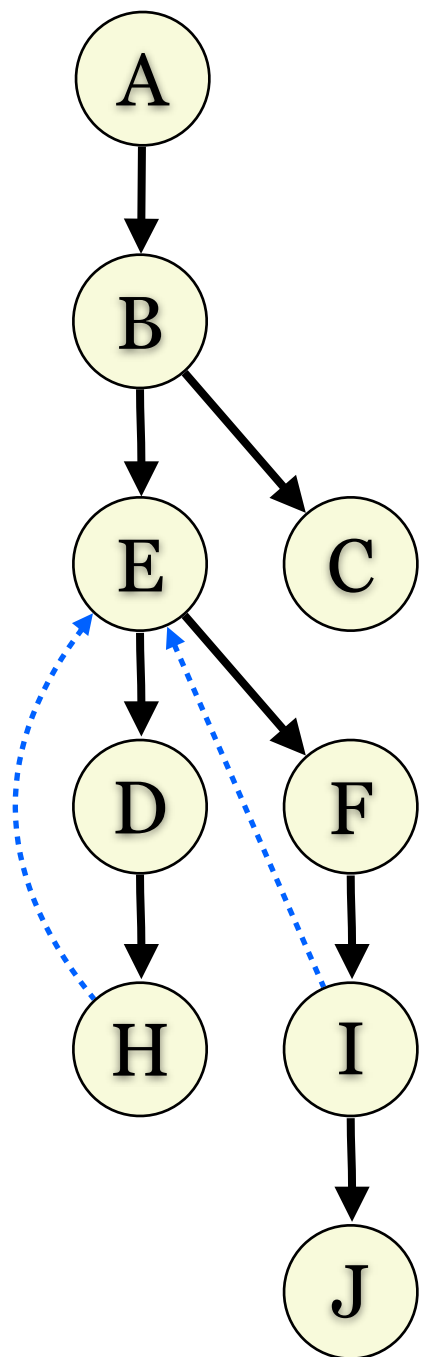
Compute  
Low value



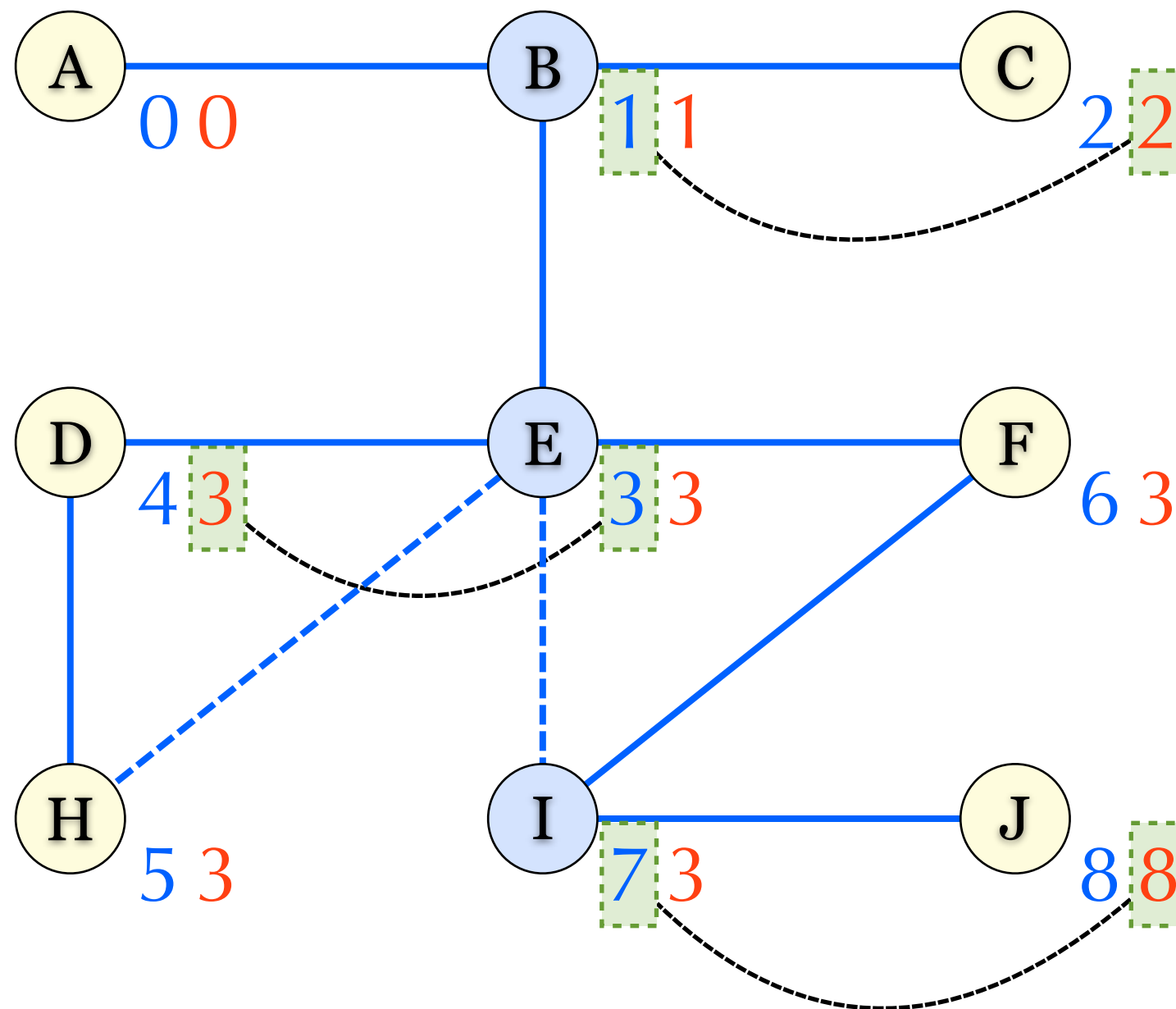
# Determine Articulation Points

- ▶ If  $u$  is root
  - ▶  $u$  is an articulation point if and only if  $u$  has more than **one child** in DFS tree.
- ▶ If  $u$  is not root
  - ▶  $u$  is an articulation point if and only if there exist an edge  $(u, v)$  and the DFS **order** of  $u$  is at most the **low value** of  $v$ .

DFS  
tree



# Articulation Points



DFS order

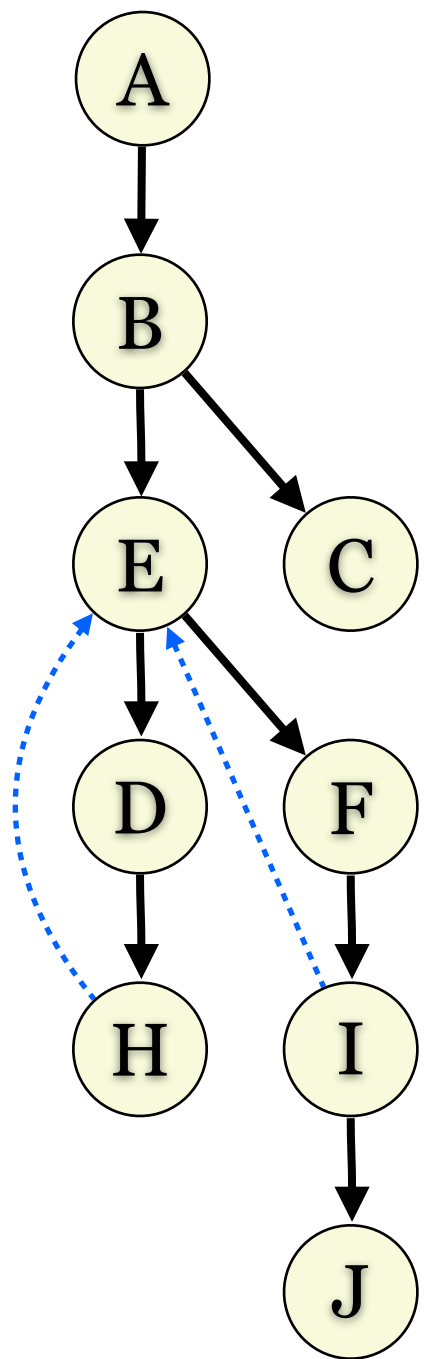
Low value



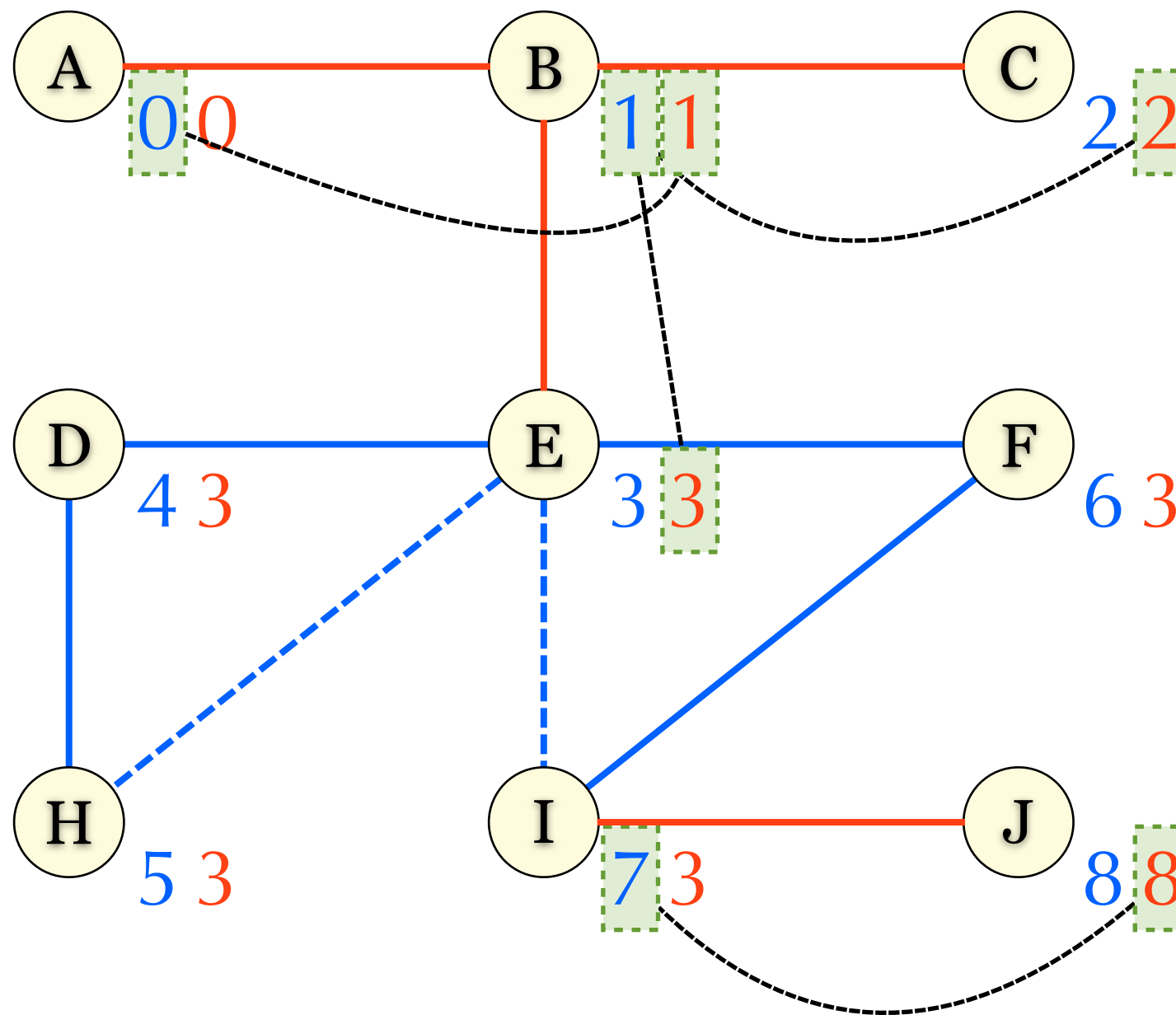
# Determine Bridges

- ▶  $(u, v)$  is a bridge if and only if the DFS order of  $u$  is less than the low value of  $v$ .

DFS  
tree



# Bridges

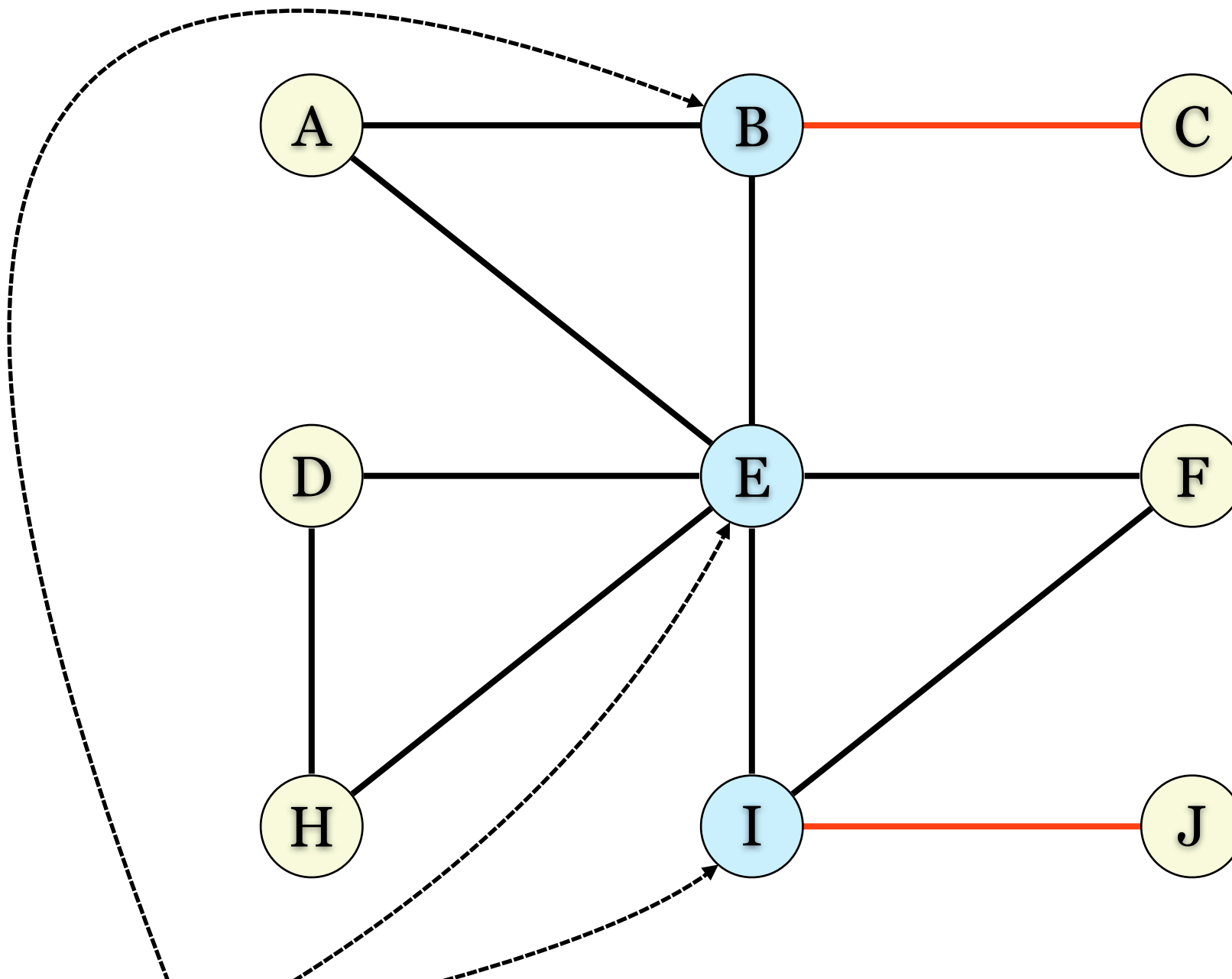


DFS order

Low value

# Example 2

Bridges



Articulation points

DFS  
tree

# DFS Based Algorithm

DFS order

Low value

