



# Graphs and Complexity

## 3) Graph search

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- ▶ Generalities
- ▶ Breadth-first search (BFS)
- ▶ Depth-first search (DFS)

# Graph Search

Digraph  $G=(S,A)$  (works similarly for undirected)

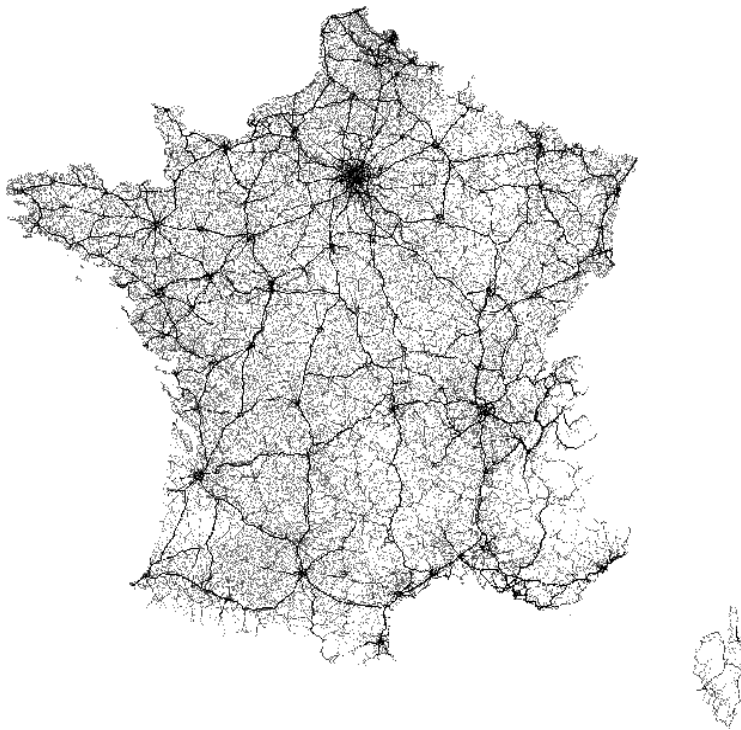
$|S|=n$ ,  $|A|=m$

## Graph search intuitively:

- ▶ Start with an unvisited vertex
- ▶ Use one or several of its edges to visit other vertices (**not yet visited**)
- ▶ Do the same with the recently visited vertices
- ▶ And so on, as long as possible
- ▶ If there are unvisited vertices, start again using one of them.



# Why?



- ▶ Allows to look for paths and cycles in the graph, possibly focusing on special vertices or edges/arcs
- ▶ Allows to find particular vertices (hubs ...)
- ▶ Allows to access the data stored in the vertices, with supplementary information about the order of the vertices
- ▶ Allows to test structural properties of the graph (connectivity, bipartition etc.)

# An example: the 15-puzzle

- ▶ Start with a 4x4 board with 15 tiles numbered from 1 to 15, and an open position.
- ▶ Tiles neighboring (top, down, left, right) the open position can be slid towards the open position (the former place of the tile is the new open position).
- ▶ Goal: make moves so that to obtain the ordered board.

Start (Scrambled)

2	6	3	15
11	9	4	5
1	8	12	
13	14	10	7

Goal (Ordered)

1	2	3	4
5	6	7	8
9	10	11	12
13	14	15	

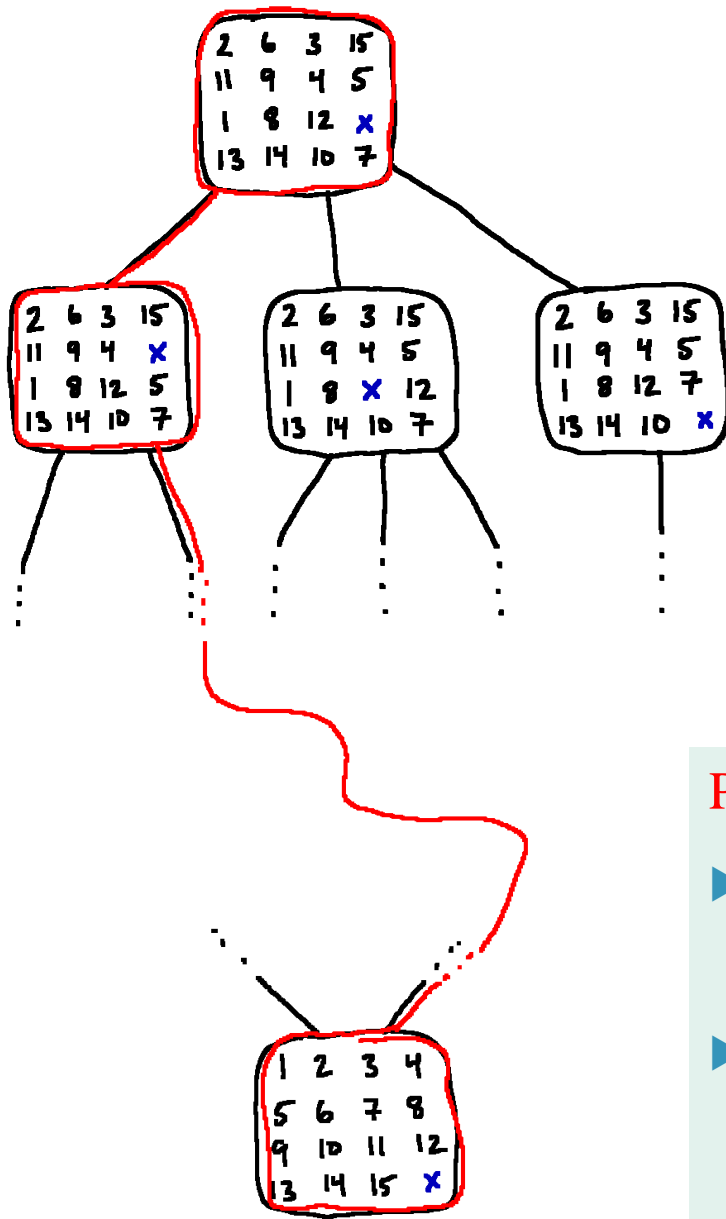
© [https://py.mit.edu/spring23/readings/graph\\_search](https://py.mit.edu/spring23/readings/graph_search)

# An approach

- ▶ Graph search
- ▶ Potentially a very large graph
- ▶ Total number of possible boards ?  
 $16 ! (=20.922.789.888.000)$
- ▶ Solution with 41 moves for this example

## Problems:

- ▶ Given a starting board, is there a solution ?  
**Belongs to P:** polynomial algorithms exist
- ▶ Find the solution with minimum number of moves (that is, the shortest path in the graph).  
**NP-complete:** probably no polynomial algorithm exists.



# Search trees

## Graph search intuitively:

- ▶ Start with an unvisited vertex
- ▶ Use one or several of its edges to visit other vertices (**not yet visited**)
- ▶ Do the same with the recently visited vertices
- ▶ And so on, as long as possible
- ▶ If there are unvisited vertices, start again using one of them.

## Builds **one** or **several vertex-disjoint search trees**:

- ▶ One tree  $T(s)$  for each starting vertex  $s$
- ▶  $s$  is the root of  $T(s)$
- ▶  $T(s)$  contains the vertices  $v$  such that  $s$  is **the first starting vertex** for which a path exists in  $G$  from  $s$  to  $v$
- ▶ For each  $v$ , there is a unique path from  $s$  to  $v$  in  $T(s)$ : the first path found during the search.

# Main graph searches

- ▶ Two main types of graph searches:
  - ▶ **Breadth-first search** (or BFS)
  - ▶ **Depth-first search** (or DFS)
- ▶ They may be modified, enriched etc. as needed for any precise application.
- ▶ One may define other searches: using DFS-like or BFS-like progression according to a specific need.



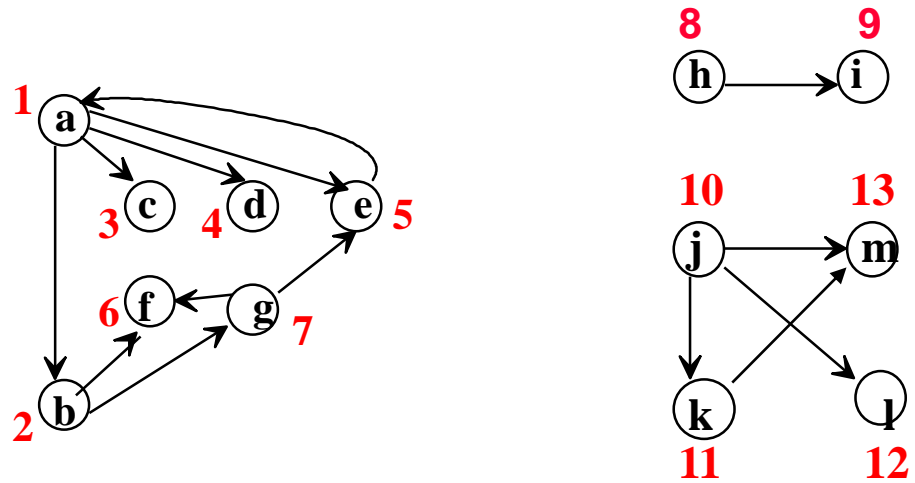
- ▶ Generalities
- ▶ Breadth-first search (BFS)
- ▶ Depth-first search (DFS)

# Breadth first search (BFS)

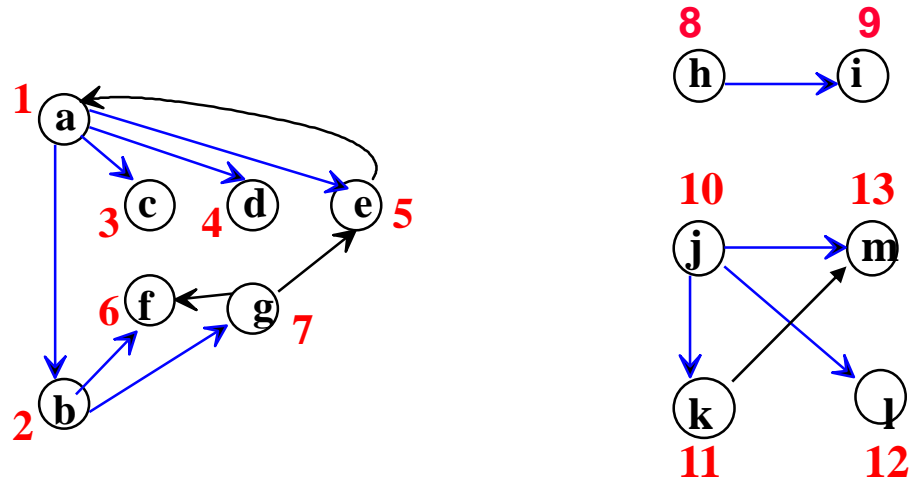
$G=(S,A)$  a graph (directed or not),  $s$  a vertex of  $G$

## BFS ( $s$ ):

- Considers all the arcs/edges of  $G$  and progressively visits all the vertices which are reachable from  $s$
- Builds a search tree (or BFS-tree)  $T(s)$
- For each vertex  $v$  that is reachable by a path from  $s$ , the path from  $s$  to  $v$  in  $T(s)$  is a shortest path from  $s$  to  $v$ .
- Visits all the vertices at distance  $k$  from  $s$ , before visiting the vertices at distance  $k+1$  from  $s$ .



Ordre du parcours : a b c d e f g h i j k l m



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**Function BFS** ( $s$  vertex of  $G$ ) : void

begin

$Q \leftarrow \text{Enqueue}(\text{Empty-Queue}, s)$  ;

while not IsEmpty ( $Q$ ) do

$s' \leftarrow \text{First}(Q)$  ;  $Q \leftarrow \text{Dequeue}(Q, s')$  ;

if not visited [ $s'$ ] then

visited [ $s'$ ]  $\leftarrow$  true ;

for each successor  $t$  of  $s'$  do

if not visited [ $t$ ] then

$Q \leftarrow \text{Enqueue}(Q, t)$

endif

endfor

endif

endwhile

end

# BFS Algorithm

## Visiting the whole graph $G$

for each vertex  $s$  of  $G$  do

visited[ $s$ ]  $\leftarrow$  false

endfor

for each vertex  $s$  of  $G$  do

if not visited [ $s$ ] then

**BFS** ( $s$ )

endif

endfor



- 1) Generic instructions (« for each vertex ») may be used in an algorithm only when the data structure is not specified.
- 2) Enqueue, Dequeue, IsEmpty, First are classic operations on queues, not Java (or other language) functions.

# Running time

c (« for each vertex ») =  $O(|S|)$

c (« while not IsEmpty (**Q**) do ») is significant only when the inner **for** is executed

## Adjacency matrix

c (« for each successor  $t$  of  $s'$  ») =

c (« for each vertex  $t$   
such that  $M[s, t] = 1$  ») =  $\Theta(|S|)$

⇒ Running time in  $\Theta(|S|^2)$

## Adjacency List(s)

c (« for each successor  $t$  of  $s'$  ») =  $\Theta(|A(s)|)$

⇒ Running time of  $\Theta(|S| + |A|)$

- ▶ Generalities
- ▶ Breadth-first search (BFS)
- ▶ Depth-first search (DFS)

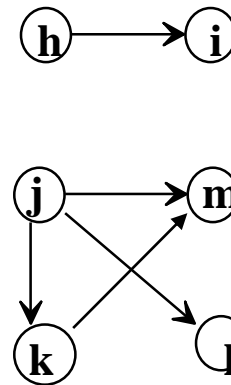
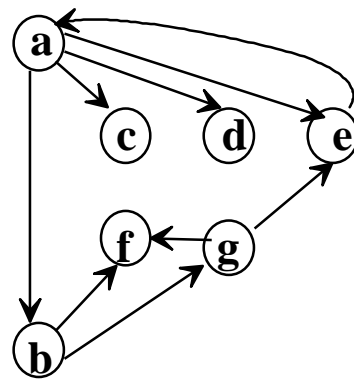
# Depth-first search (DFS)

$G=(S,A)$  a graph (directed or not),  $s$  a vertex

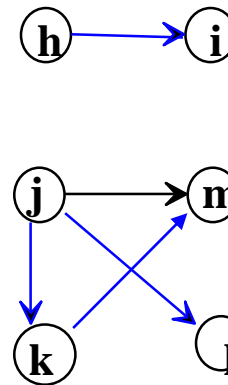
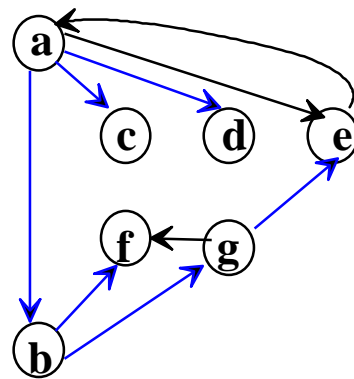
**DFS( $s$ ) :**

- Considers all the arcs/edges of  $G$  and progressively visits all the vertices which are reachable from  $s$
- Builds a search tree (or DFS-tree)  $T(s)$
- Visits first the non-visited successors of the deepest visited vertex





Ordre du parcours : a b f g e c d h i j k m l



Ordre du parcours : a b f g e c d h i j k m l

# DFS Algorithm

**Function DFS** ( $s$  vertex of  $G$ ) : void

begin

    visited [ $s$ ]  $\leftarrow$  true ;

    for each successor  $t$  of  $s$  do

        if not visited [  $t$  ] then

**DFS**( $t$ )

        endif

    endfor

end

**Visiting the whole graph  $G$**

    for each vertex  $s$  of  $G$  do

        visited[ $s$ ]  $\leftarrow$  false

    endfor

    for each vertex  $s$  of  $G$  do

        if not visited [ $s$ ] then

**DFS** ( $s$ )

        endif

    endfor

# Running time

$c(\text{« for each vertex »}) = O(|S|)$

## Adjacency matrix

$c(\text{« for each successor } t \text{ of } s \text{ »}) =$

$c(\text{« for each vertex } t$

such that  $M[s, t] = 1 \text{ »}) = \Theta(|S|)$

$\Rightarrow$  Running time of  $\Theta(|S|^2)$

## Adjacency List(s)

$c(\text{« for each successor } t \text{ of } s \text{ »}) = \Theta(|A(s)|)$

$\Rightarrow$  Running time of  $\Theta(|S| + |A|)$

# Iterative DFS

**DFS** ( $s$  vertex of  $G$ ) : void //iterative

begin

$T \leftarrow \text{Push}(\text{Empty-Stack}, s)$  ;

while not IsEmpty ( $T$ ) do

$s' \leftarrow \text{Top}(T)$  ;  $T \leftarrow \text{Pop}(T, s')$  ;

if not visited [ $s'$ ] then

visited [ $s'$ ]  $\leftarrow$  true ;

for each successor  $t$  of  $s'$  do

if not visited [ $t$ ] then

$T \leftarrow \text{Push}(T, t)$  endif

endfor

endif

endwhile

end

## Visiting the whole graph $G$

for each vertex  $s$  of  $G$  do

visited[ $s$ ]  $\leftarrow$  false

endfor

for each vertex  $s$  of  $G$  do

if not visited [ $s$ ] then

**DFS** ( $s$ )

endif

endfor

# Numbering

**Function DFSNum** ( $s$  vertex of  $G$ ):void

begin

$nb \leftarrow nb + 1 ; d[s] \leftarrow nb ;$

for each successor  $t$  of  $s$  do

if  $d[t] = 0$  then

**DFSNum** ( $t$ ) ;

endif

endfor

$nb \leftarrow nb + 1 ; f[s] \leftarrow nb$

end

**Visiting the whole graph  $G$**

for each vertex  $s$  of  $G$  do

$d[s] \leftarrow 0 ; f[s] \leftarrow 0 ;$

endfor

$nb \leftarrow 0 ;$

for each vertex  $s$  of  $G$  do

if  $d[s] = 0$  then

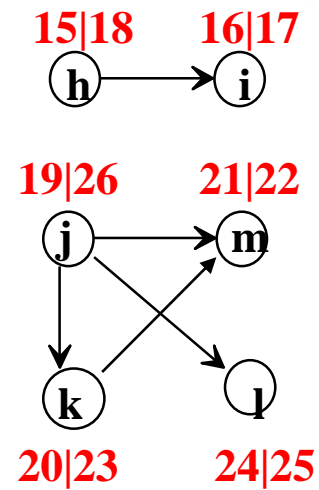
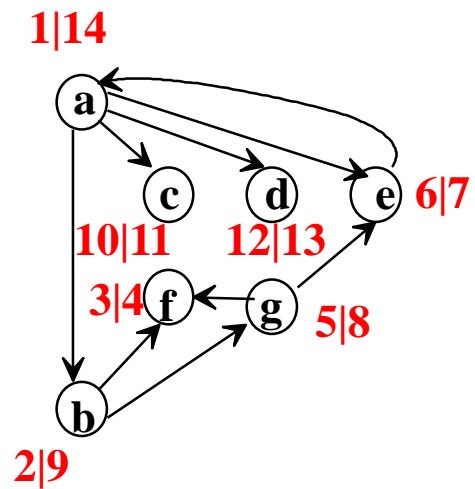
**DFSNum** ( $s$ )

endif

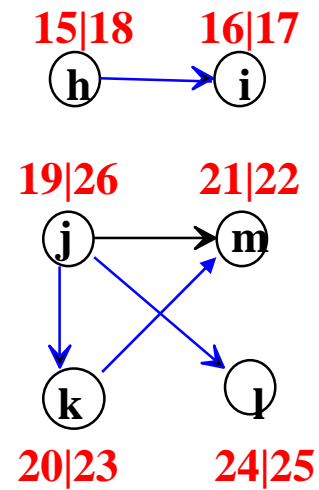
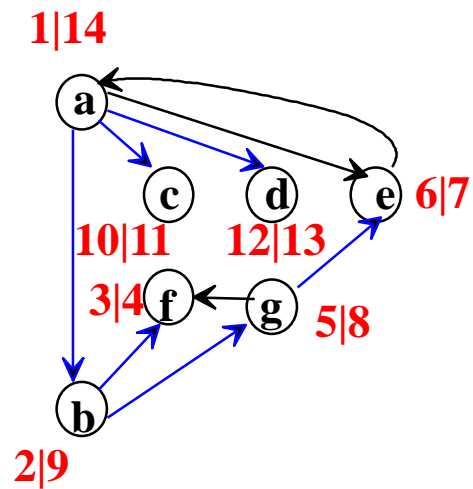
endfor

$[d(s)..f(s)]$  **exploration** of  $s$

**Running time:** the same as for DFS



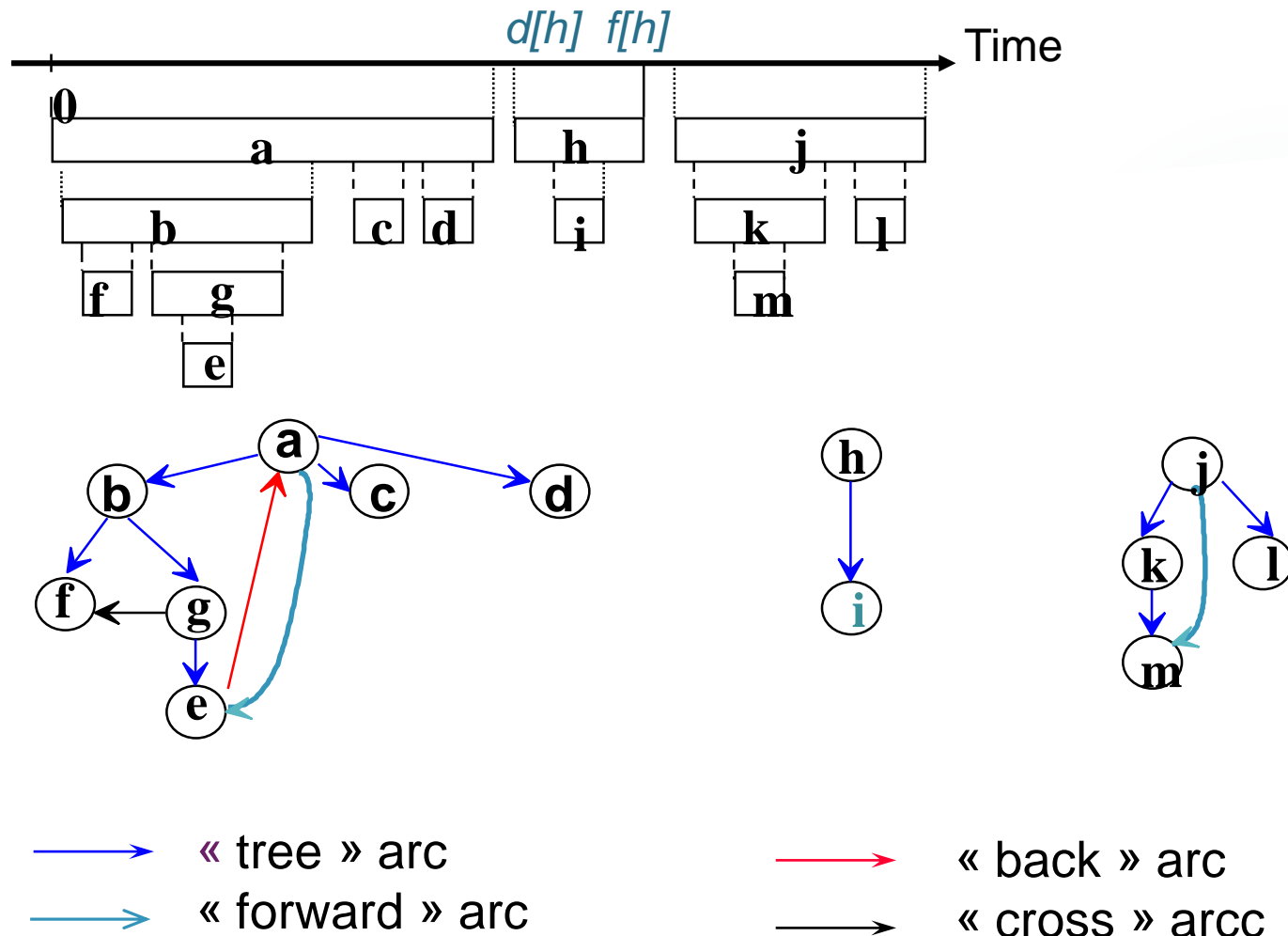
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# Embedded or disjoint explorations



# Recognize and use these arcs

$(s, t)$  arc of  $G$  is a(n):

- **tree or forward arc**                      iff  $d[s] < d[t] < f[t] < f[s]$
- **back arc**                                      iff  $d[t] < d[s] < f[s] < f[t]$
- **cross arc**                                    iff  $f[t] < d[s]$

## Applications:

- ▶ Finding paths (arcs of the tree) or cycles (back arcs)
- ▶ Looking for properties involving them (connectivity, bipartition, existence of vertex orderings ... see the next course)
- ▶ Usually, we make use of these arcs to understand the effects of an algorithm and to prove it ... but the algorithms use them only implicitly.