

## DFS with Timing

### The Algorithm

The DFS-with-timing is a variant of DFS that records the time of starting and finishing the explore of each vertex. It uses the following data structures (we assume  $n = |V|$ ). These data structures are global variables, so that the explore function can get access to and edit them.

1. variable *clock* serves as a timer that stores the current time;
2. binary array *visited*[1..*n*], where *visited*[*i*] indicates if  $v[i]$  has been explored/visited,  $1 \leq i \leq n$ ;
3. array *pre*[1..*n*], where *pre*[*i*] records the time of starting exploring  $v_i$ ,  $1 \leq i \leq n$ ;
4. array *post*[1..*n*], where *post*[*i*] records the time of finishing exploring  $v_i$ ,  $1 \leq i \leq n$ ;
5. array *postlist*, stores the vertices in decreasing order of *post*[·].

The pseudo-code of DFS with timing is given below.

```
function DFS-with-timing ( $G = (V, E)$ )
    clock = 1;
    postlist =  $\emptyset$ ;
    pre[i] = post[i] = -1, for  $1 \leq i \leq n$ ;
    for  $i = 1 \rightarrow |V|$ 
        if (visited[i] = 0): explore ( $G, v_i$ );
    end for;
end algorithm;
```

```
function explore ( $G = (V, E), v_i \in V$ )
    visited[i] = 1;
    pre[i] = clock;
    clock = clock + 1;
    for any edge  $(v_i, v_j) \in E$ 
        if (visited[j] = 0): explore ( $G, v_j$ );
    end for;
    post[i] = clock;
    clock = clock + 1;
    add  $v_i$  to the front of postlist;
end algorithm;
```

An example of running DFS with timing is given below. Notice that this algorithm partitions all edges into two categories: solid edges  $(u, v)$  implies that  $v$  is visited for the first time (and therefore explore  $v$  will start right now, and after exploring  $v$  the program will return to explore  $u$ ), while dashed edges  $(u, v)$  implies that at that time  $v$  has been visited already (and therefore  $v$  will be skipped and the next out-edge of  $u$  will be examined in the for-loop).

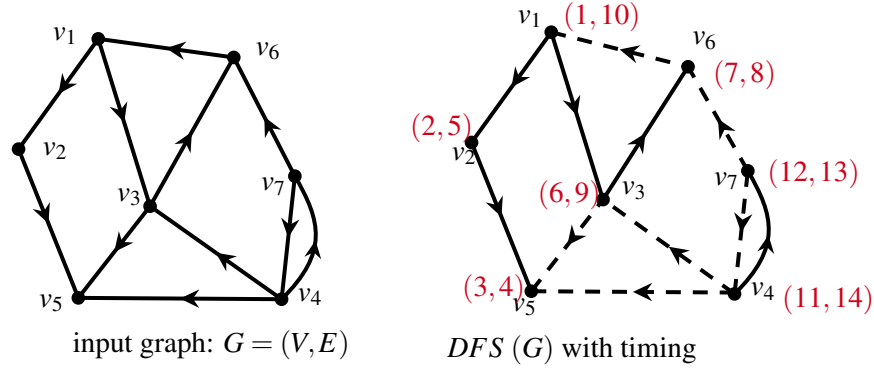


Figure 1: Example of running DFS (with timing) on a directed graph. The  $[pre, post]$  interval for each vertex is marked next to each vertex. The *postlist* for this run is  $postlist = (v_4, v_7, v_1, v_3, v_6, v_2, v_5)$ .

In explore  $v_i$ , the adjacent vertices  $\{v_j \mid (v_i, v_j) \in E\}$  can be examined in any arbitrary order, i.e., all conclusions/properties we show hold regardless the order that  $\{v_j\}$  gets examined. In practice though, we might follow a specific order; in Figure 1, we examine  $\{v_j\}$  in increasing order of their indexes.

The above DFS-with-timing algorithm runs in  $\Theta(|V| + |E|)$  time, since each vertex and each edge will be examined a constant number of times (once for directed graph, twice for undirected graph).

The above DFS-with-timing algorithm gives an interval  $[pre, post]$  for each vertex. For two vertices  $v_i, v_j \in V$ , their corresponding intervals can either be *disjoint*, i.e., the two intervals do not overlap, or *nested*, i.e., one interval is within the other. See Figure 2. But two intervals cannot be *partially overlapping*. Why? This is because the explore function is recursive. There are only two possibilities that  $pre[i] < pre[j]$ . The first one is that explore  $v_j$  is *within* explore  $v_i$ ; in this case the recursive behaviour of explore leads to that  $post[j] < post[i]$ , as explore  $v_j$  must terminate first and return to explore  $v_i$ . This case corresponds to that the two intervals are nested. The second one is that explore  $v_j$  starts after explore  $v_i$  finishes; this case corresponds to that the two intervals are disjoint.

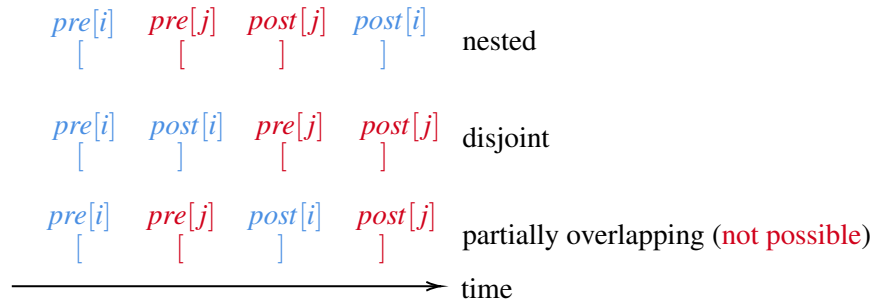


Figure 2: Relations between two  $[pre, post]$  intervals.

**Claim 1.** If the  $[pre[j], post[j]]$  is nested within  $[pre[i], post[i]]$ , then  $v_j$  is reachable from  $v_i$ .

*Proof.* Consider when an explore will be called within another explore: only if there is an edge  $(v_i, v_j) \in E$  (and  $visited[j] = 0$ ), explore  $v_j$  will be called within explore  $v_i$ . Consequently, the time interval for  $v_j$  will be within the interval for  $v_i$ . Note that explore  $v_j$  might call explore other vertices, such as explore  $v_k$ . When this happens, the time interval for  $v_k$  will be within the interval for  $v_j$ , and therefore within the interval for  $v_i$ . But again this happens only if there exists edge  $(v_j, v_k)$ , and hence a path  $v_i \rightarrow v_j \rightarrow v_k$ . This argument can be extended to longer paths, proving the conclusion above.  $\square$

## Determine of Existence of Cycles

Let's see the first application of DFS-with-timing—to decide if a given (directed) graph contains cycles or not. We can simply modify the explore function, given below, and use the same DFS-with-timing function. Specifically, when the algorithm examines an edge  $(v_i, v_j)$ : if  $v_j$  has been explored *and* its post-number has not been set yet, then the algorithm reports that  $G$  contains cycle.

```
function explore ( $G = (V, E), v_i \in V$ )
     $visited[i] = 1$ ;
     $pre[i] = clock$ ;
     $clock = clock + 1$ ;
    for any edge  $(v_i, v_j) \in E$ 
        if ( $visited[j] = 0$ ): explore ( $G, v_j$ );
        else if ( $post[j] = -1$ ): report “ $G$  contains cycle”;
    end for;
     $post[i] = clock$ ;
     $clock = clock + 1$ ;
    add  $v_i$  to the front of  $postlist$ ;
end algorithm;
```

Now let's prove this algorithm is correct. We first prove that if  $G$  contains cycle then the algorithm will always report at some time. Let  $C$  be the cycle. Let  $v_j \in C$  be the first vertex that is explored in  $C$ . Let  $(v_i, v_j) \in E$  be an edge in  $C$ . As  $v_j$  can reach  $v_i$  (reason: both in cycle  $C$ ), within exploring  $v_j$  there will be a time that  $v_i$  gets explored. In explore  $v_i$ , consider the time of examining edge  $(v_i, v_j)$ : at this time  $visited[j]$  has been set as 1, but its post-number has not been set, as now the algorithm is still within exploring  $v_j$ . Therefore, the algorithm will report that  $G$  contains cycle.

We then prove that if the algorithm reports, then  $G$  must contain cycles. Consider that the algorithm is exploring  $v_i$ , examining edge  $(v_i, v_j)$  and finds  $visited[j] = 1$  and  $post[j] = -1$ . The fact that  $post[j]$  has not been set implies that the algorithm is within exploring  $v_j$ . Therefore the interval for  $v_i$  must be nested within the interval for  $v_j$ . Following Claim 1, we know that  $v_j$  can reach  $v_i$ . In addition, there exists edge  $(v_i, v_j)$ . Combined,  $G$  contains cycle.

Note that this algorithm is essentially determining if there exists edge  $(v_i, v_j) \in E$  such that the interval  $[pre[i], post[i]]$  is within interval  $[pre[j], post[j]]$ . (Such edges are called *back edges* in textbook [DPV], page 95.)

## Key Property

Before seeing more applications, we prove an important property that relates the post values and meta-graph.

**Claim 2.** Let  $C_i$  and  $C_j$  be two connected components of directed graph  $G = (V, E)$ , i.e.,  $C_i$  and  $C_j$  are two vertices in its corresponding meta-graph  $G_M = (V_M, E_M)$ . If we have  $(C_i, C_j) \in E_M$  then we must have that  $\max_{u \in C_i} post[u] > \max_{v \in C_j} post[v]$ .

Intuitively, following an edge in the meta-graph, the largest post value decreases. Before seeing a formal proof, please see an example in Figure 3: the largest post values for  $C_1, C_2, C_3$ , and  $C_4$  are 9, 6, 10, and 14,

and you may verify that following any edge in the meta-graph, the largest post value always decreases.

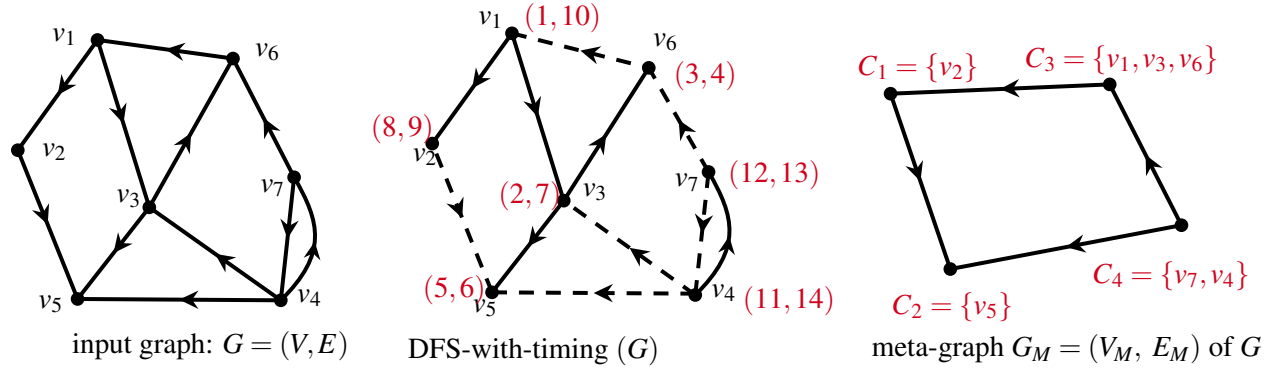


Figure 3: Example of running DFS (with timing) on a directed graph. The  $[pre, post]$  interval for each vertex is marked next to each vertex.

*Proof.* Let  $u^* := \arg \min_{u \in C_i \cup C_j} pre[u]$ , i.e.,  $u^*$  is the first explored vertex in  $C_i \cup C_j$ . Consider the two cases.

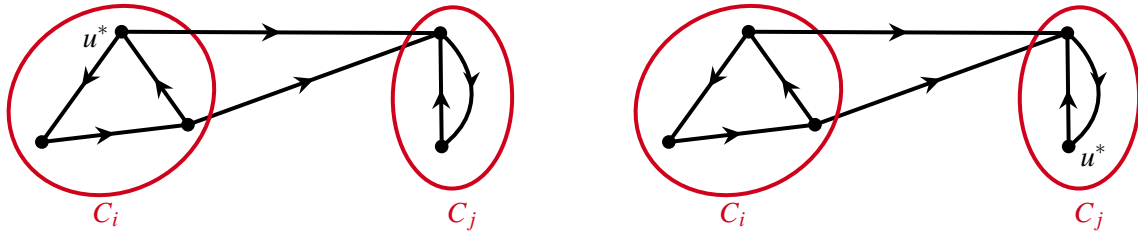


Figure 4: Two cases in proving above claim.

First, assume that  $u^* \in C_i$ . Then  $u^*$  can reach all vertices in  $C_i \cup C_j \setminus \{u^*\}$ . Hence, all vertices in  $C_i \cup C_j \setminus \{u^*\}$  will be explored *within* exploring  $u^*$ . In other words, for any vertex  $v \in C_i \cup C_j \setminus \{u^*\}$ , the interval  $[pre[v], post[v]]$  is a subset of  $[pre[u^*], post[u^*]]$ . This results in two facts:  $\max_{u \in C_i} post[u] = post[u^*]$  and  $\max_{v \in C_j} post[v] < post[u^*]$ . Combined, we have that  $\max_{u \in C_i} post[u] > \max_{v \in C_j} post[v]$ .

Second, assume that  $u^* \in C_j$ . Then  $u^*$  can *not* reach any vertex in  $C_i$ ; otherwise  $C_i \cup C_j$  form a single connected component, conflicting to the fact that any connected component must be maximal. Hence, all vertices in  $C_i$  will remain unexplored after exploring  $u^*$ . In other words, for any vertex  $v \in C_i$ , the interval  $[pre[v], post[v]]$  locates after (and disjoint with)  $[pre[u^*], post[u^*]]$ . This gives that  $\max_{u \in C_i} post[u] > post[u^*]$ . Besides, we also have  $\max_{v \in C_j} post[v] = post[u^*]$  as all vertices in  $C_j \setminus \{u^*\}$  will be examined within exploring  $u^*$ . Combined, we have that  $\max_{u \in C_i} post[u] > \max_{v \in C_j} post[v]$ .  $\square$

## Finding a Linearization of a DAG

The above key property holds for all directed graphs. We now consider DAGs. Note that each connected component of a DAG  $G$  contains exactly one vertex, i.e., each vertex in a DAG  $G$  forms the connected component of its own. (Can you spot this using Figure 5?) This is because, if a connected component contains at least two vertices  $u$  and  $v$  then  $u$  can reach  $v$  and  $v$  can reach  $u$  so a cycle must exist. Consequently, the meta-graph  $G_M$  of any DAG  $G$  is also itself, i.e.,  $G = G_M$ .

Now let's interpret above key conclusion in the context of DAGs. For a DAG  $G = (V, E)$ , components

$C_i$  and  $C_j$  will degenerate into two vertices, say  $v_i$  and  $v_j$ , edge  $(C_i, C_j) \in E_M$  becomes  $(v_i, v_j) \in E$ , and  $\max_{u \in C_i} \text{post}[u] = \text{post}[i]$ , and  $\max_{v \in C_j} \text{post}[v] = \text{post}[j]$ . We have

**Corollary 1.** Let  $G = (V, E)$  be a DAG. If  $(v_i, v_j) \in E$ , then  $\text{post}[i] > \text{post}[j]$ .

Now recall the definition of linearization:  $X$  is a linearization if and only if for every edge  $(v_i, v_j) \in E$ ,  $v_i$  is before  $v_j$  in  $X$ . Since it is guaranteed above that, for every edge  $(v_i, v_j) \in E$ ,  $\text{post}[i] > \text{post}[j]$ , we can immediately conclude that vertices sorted in decreasing order of post-values is a linearization! This order is nothing else but the postlist.

**Corollary 2.** Let  $G = (V, E)$  be a DAG. The postlist generated in the DFS-with-timing algorithm is a linearization of  $G$ .

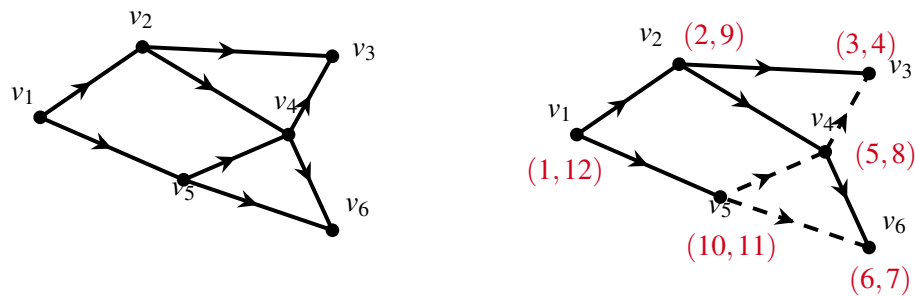


Figure 5: Example of running DFS (with timing) on a DAG  $G$ . The  $[pre, post]$  interval for each vertex is marked next to each vertex. The *postlist* for this run is  $(v_1, v_5, v_2, v_4, v_6, v_3)$ , which is a linearization of  $G$ .