### Introduction to Algorithms and Data Structures

### Lecture 15: DFS and graph structure

Mary Cryan

School of Informatics University of Edinburgh

# Recursive DFS (no explicit Stack)

### **Algorithm** dfs(G)

- 1. Initialise Boolean array *visited*, setting all to FALSE
- 2. for all  $v \in V$  do
- 3. **if** visited[v] = FALSE **then**
- 4. dfsFromVertex(G, v)

### **Algorithm** dfsFromVertex(G, v)

- 1.  $visited[v] \leftarrow TRUE$
- 2. **for all** w adjacent to v **do**
- 3. **if** visited[w] = FALSE **then**
- 4. dfsFromVertex(G, w)
- The recursive set-up eliminates the need for an explicit stack;
- $\triangleright$  We will have reversed prioritisation of the vertices adjacent to  $\nu$ .

### Analysis of DFS

#### Lemma

During dfs(G), dfsFromVertex(G, v) is invoked exactly once for each vertex v.

#### Proof.

At least once:

- ightharpoonup visited[v] can only become TRUE when dfsFromVertex(G, v) is executed.
- ▶ If visited[v] remains FALSE, dfsFromVertex(G, v) will eventually be called by line 4 of dfs(G).

#### At most once:

- ▶ First call of dfsFromVertex(G, v) sets visited[v] to TRUE.
- ▶ After visited[v] is TRUE, dfsFromVertex(G, v) is never called again.

("At most once" is also true for Stack dfs, but "at least once" is not. dfsFromVertex" is more to "start a component" in the Stack version)

IADS - Lecture 15 - slide 3

## Analysis of DFS (cont'd)

#### Lemma

For a directed graph,  $\sum_{v \in V}$  out-degree(v) = m. For an undirected graph,  $\sum_{v \in V} deg(v) = 2m$ .

#### Proof.

Every edge is counted exactly once on both sides of the equation (for directed).

For the undirected case, every edge is counted twice on the lhs.

### Analysis of recursive DFS

G = (V, E) graph with n vertices and m edges

### **Algorithm** dfs(G)

- 1. Initialise Boolean array *visited*, setting all to FALSE
- 2. for all  $v \in V$  do
- 3. **if** visited[v] = FALSE **then**
- 4. dfsFromVertex(G, v)
- dfs(G): Ignoring calls to dfsFromVertex, total time  $\Theta(n)$
- ▶ dfsFromVertex(v) is called at most once for every vertex v, and does  $\Theta(\text{out-degree}(v))$  work, excluding recursive calls.

#### Overall time:

$$T(n,m) = \Theta(n) + \sum_{v \in V} \Theta(\text{out-degree}(v))$$

$$= \Theta\left(n + \sum_{v \in V} \text{out-degree}(v)\right)$$

$$= \Theta(n+m)$$

## Adjacency List or Adjacency Matrix?

We said each call to dfsFromVertex(v) takes  $\Theta(\text{out-degree}(v))$  time (excluding recursive calls).

### **Algorithm** dfsFromVertex(G, v)

- 1.  $visited[v] \leftarrow TRUE$
- 2. **for all** w adjacent to v **do**
- 3. **if** visited[w] = FALSE **then**
- 4. dfsFromVertex(G, w)

If we are iterating over "all w adjacent to v" in  $\Theta(\text{out-degree}(v))$  time, then we must be using an Adjacency list structure.

### Analysis of original DFS

Compare the two dfsFromVertex(G, v) methods:

**Algorithm** dfsFromVertex(G, v)

```
1. visited[v] \leftarrow \text{TRUE} 1. S.\text{push}(v)

2. for all w adjacent to v do 2. while not S.\text{isEmpty}() do 3. if visited[w] = \text{FALSE} then 3. u \leftarrow S.\text{pop}() 4. if visited[u] = \text{FALSE} then 5. visited[u] = \text{TRUE} 6. for all w adjacent to u 7. S.\text{push}(w)
```

```
visited[v] \leftarrow \text{TRUE} \mid \leftrightarrow \mid S.pop(); \ visited[v] \leftarrow \text{TRUE}
dfsFromVertex(v) \leftrightarrow \mid for all w adjacent to v; S.push(w); while
```

Recursive: marks v as "visited", then calls dfsFromVertex for unvisited adjacent vertices

Iterative: marks v as "visited" after "popping" it, then "pushes" all adjacent vertices. However, the number of Stack operations for v is bounded in terms of the number of edges into  $v \Rightarrow$  the overall runtime for our original dfs is still  $\Theta(n+m)$ .

**Algorithm** dfsFromVertex(G, v)

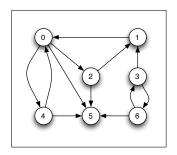
### **DFS** Forests

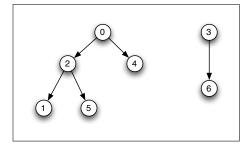
A DFS traversing a graph builds up a forest whose vertices are all vertices of the graph and whose edges are all vertices traversed during the DFS.

#### Definition

A vertex w is a *child* of a vertex v in the DFS forest if dfsFromVertex(G, w) is called from dfsFromVertex(G, v).

### DFS Forests Example





Recall Q2 of tutorial sheet 5 on how the connected components can vary depending on the order in which we consider vertices at the top-level of dfs.

### **Topological Sorting**

#### Example:

10 tasks to be carried out. Some of them depend on others.

- ► Task 0 must be completed before Task 1 can be started.
- ► Task 1 and Task 2 must be done before Task 3 can start.
- ▶ Task 4 must be done before Task 0 or Task 2 can start.
- ▶ Task 5 must be done before Task 0 or Task 4 can start.
- ▶ Task 6 must be done before Task 4, 5 or 7 can start.
- ▶ Task 7 must be done before Task 0 or Task 9 can start.
- Task 8 must be done before Task 7 or Task 9 can start.
- Task 9 must be done before Task 2 or Task 3 can start.

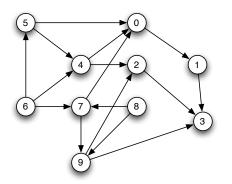
### Topological order

#### Definition

Let G = (V, E) be a directed graph. A *topological order* of G is a total order  $\prec$  of the vertex set V such that for all edges  $(v, w) \in E$  we have  $v \prec w$ .

(in some fields this is called a *linear extension*)

## Tasks as a (directed) graph



Does this graph have a topological order?

Yes. One topological sort is:

$$8 \prec 6 \prec 7 \prec 9 \prec 5 \prec 4 \prec 2 \prec 0 \prec 1 \prec 3$$
.

IADS - Lecture 15 - slide 12

## Topological order (cont'd)

A digraph that has a cycle does not have a topological order.

#### Definition

A DAG (directed acyclic graph) is a digraph without cycles.

#### **Theorem**

A digraph has a topological order if and only if it is a DAG.

## Classification of vertices during recursive DFS

G = (V, E) graph,  $v \in V$ . Consider dfs(G).

 $\triangleright$  v is finished if dfsFromVertex(G, v) has been completed.

Vertices can be in the following states:

- not yet visited (let us call a vertex in this state white),
- visited, but not yet finished (grey).
- ▶ finished (black).

# Classification of vertices during recursive DFS (cont'd)

#### Lemma

Let G be a graph and v a vertex of G. Consider the moment during the execution of dfs(G) when dfsFromVertex(G,v) is started.

Then for all vertices w we have:

- 1. If w is white and reachable from v, then w will be black before v.
- 2. If w is grey, then v is reachable from w.

## Topological sorting

G = (V, E) digraph. Define order on V as follows:

 $v \prec w \iff w$  becomes black before v.

#### Theorem

If G is a DAG then  $\prec$  is a topological order.

#### Proof.

Suppose  $(v, w) \in E$ . Consider dfsFromVertex(G, v).

- ▶ If w is already black, then  $v \prec w$  (and this is what we want).
- If w is white, then by Lemma part 1., w will be black before v. Thus  $v \prec w$ .
- ► If w is grey, then by Lemma part 2. v is reachable from w. So there is a path p from w to v. Path p and edge (v, w) together form a cycle.
  Contradiction! (G is acyclic ...)

## Topological sorting implemented

### **Algorithm** topSort(G)

- 1. Initialise array state by setting all entries to white.
- 2. Initialise linked list L
- 3. for all  $v \in V$  do
- 4. **if** state[v] = white **then**
- 5.  $\operatorname{sortFromVertex}(G, v)$
- 6. print L

## Topological sorting implemented

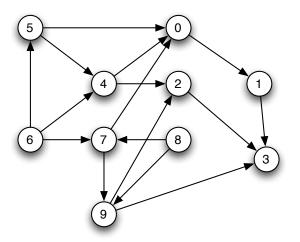
### **Algorithm** sortFromVertex(G, v)

- 1.  $state[v] \leftarrow grey$
- 2. **for all** w adjacent to v **do**
- 3. **if** state[w] = white **then**
- 4.  $\operatorname{sortFromVertex}(G, w)$
- 5. **else if** state[w] = grey **then**
- 6. **print** "G has a cycle"
- 7. halt
- 8.  $state[v] \leftarrow black$
- L.insertFirst(v)

Difference from dfs itself - the order the vertices get added to the list.

Running-time is again  $\Theta(n+m)$ 

## Example



Use the algorithm topSort to compute a topological sort of this graph (video).

## Connected components of an undirected graph

G = (V, E) undirected graph

#### Definition

- A subset C of V is connected if for all  $v, w \in C$  there is a path from v to w (if G is directed, say strongly connected).
- ► A connected component of G is a maximum connected subset C of V. (no connected subset C' of V strictly contains C.
- ► *G* is *connected* if it only has one connected component, that is, if for all vertices *v*, *w* there is a path from *v* to *w*.

## Connected components - undirected (cont'd)

- ► Each vertex of an undirected graph is contained in exactly one connected component.
- ► For each vertex *v* of an undirected graph, the connected component that contains *v* is precisely the set of all vertices that are reachable from *v*.

For an undirected graph G, dfsFromVertex(G, v) visits exactly the vertices in the connected component of v.

And the same is true for bfsFromVertex(G, v) (either will do!)

# Connected components - undirected (cont'd)

### **Algorithm** connComp(*G*)

- Initialise Boolean array visited by setting all entries to FALSE
- 2. for all  $v \in V$  do
- 3. **if** visited[v] = FALSE **then**
- 4. **print** "New Component"
- 5.  $\operatorname{ccFromVertex}(G, v)$

### **Algorithm** ccFromVertex(G, v)

- 1.  $visited[v] \leftarrow \text{TRUE}$
- print v
- 3. **for all** w adjacent to v **do**
- 4. **if** visited[w] = FALSE **then**
- 5.  $\operatorname{ccFromVertex}(G, w)$

## Reading

From [CLRS] as usual:

► Computing topological sort - Section 22.4

Hope you get a break over the holidays!

And "see" you in 2022.