

IE170: Algorithms in Systems Engineering: Lecture 17

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Taking Stock

Last Time

- Depth-First Search

This Time: Uses of DFS

- Topological Sort
- Strongly Connected Components

Depth-First Search

DFS

- **Input:** Graph $G = (V, E)$
 - No source vertex here. Works for undirected and directed graphs.
 - We focus on directed graphs today...
- **Output:** Two timestamps for each node $d(v)$, $f(v)$,
- **Output:** $\pi(v)$, predecessor of v
 - **not** on shortest path necessarily



DFS (Initialize and Go)

```

DFS( $V, E$ )
1  for each  $u$  in  $V$ 
2  do  $color(u) \leftarrow$  GREEN
3      $\pi(u) \leftarrow$  NIL
4   $time \leftarrow 0$ 
5  for each  $u$  in  $V$ 
6  do if  $color[u] =$  GREEN
7     then DFS-VISIT( $u$ )
  
```

DFS (Visit Node—Recursive)

```

DFS-VISIT(u)
1  color(u) ← YELLOW
2  d[u] ← time++
3  for each v in Adj[u]
4  do if color[v] = GREEN
5     then π[v] ← u
6         DFS-VISIT(v)
7
8  color(u) ← RED
9  f[u] = time++

```



Analysis of DFS

- Loop on lines 1-3 $O(|V|)$
- DFS-VISIT is called **exactly** once for each vertex v (**Why?**)
 - Because the first thing you do is paint the node **YELLOW**
- The Loop on lines 3-6 in calls DFS-VISIT $|Adj[v]|$ times for vertex v .
- Since DFS visit is called exactly once per vertex, the total running time to do loop on lines 3-6 is

$$\sum_{v \in V} |Adj[v]| = \Theta(|E|).$$

- Therefore: running time of DFS on $G = (V, E)$ is $\Theta(|V| + |E|)$: **Linear** in the (adjacency list) size of the graph



Parenthesis Theorem

- Let's look at the intervals: $[d[v], f[v]]$ for each vertex $v \in V$. (Surely, $d[v] < f[v]$)
- These tell us about the predecessor relationship in G_π

- 1 If I finish exploring u before first exploring v , ($d[u] < f[v]$) then v is not a descendant of u . (Or versa vice)
- 2 If $[d[u], f[u]] \subset [d[v], f[v]]$ then u is a descendent of v in the DFS tree
- 3 If $[d[v], f[v]] \subset [d[u], f[u]]$ then v is a descendent of u in the DFS tree



Graph Review...

Think back to your thorough reading of Appendix B.4 and B.5...

- A **path** in G is a sequence of vertices such that each vertex is adjacent to the vertex preceding it in the sequence. Simple paths **do not** repeat nodes.
- A (simple) **cycle** is a (simple) path except that the first and last vertices are the same.
- Paths and cycles can either be **directed** or **undirected**
- If I say "cycle" or "path," I will often mean simple, **undirected** cycle or path



I Can't See the Forest Through the...

- The DFS graph: $G_\pi = (V, E_\pi)$ forms a **forest** of **subtrees**

New Definitions: Tree

- A **tree** $T = (V, E)$ is a connected graph that does not contain a cycle
- All pairs of vertices in V are connected by a simple (undirected) path
- $|E| = |V| - 1$
- Adding any edge to E forms a cycle in T



More Definitions

- A (Undirected) acyclic graph is usually called a **forest**
- A **DAG** is a **D**irected, **A**cylic **G**raph
 - A directed forest
- A **subtree** is simply a subgraph that is a tree



Classifying Edges in the DFS Tree

Given a DFS Tree G_π , there are four type of edges (u, v)

- 1 **Tree Edges:** Edges in E_π . These are found by exploring (u, v) in the DFS procedure
- 2 **Back Edges:** Connect u to an ancestor v in a DFS tree
- 3 **Forward Edges:** Connect u to a descendent v in a DFS tree
- 4 **Cross Edges:** All other edges. They *can* be edges in the same DFS tree, or can cross trees in teh DFS forest G_π



Modifying DFS to Classify Edges

- DFS can be modified to classify edges as it encounters them...
 - Classify $e = (u, v)$ based on the **color** of v when e is first explored...
-
- **GREEN:** Indicates Tree Edge
 - **YELLOW:** Indicates Back Edge
 - **RED:** Indicates Forward or Cross Edge



DFS Undirected Graphs

- In an undirected graph, there may be some ambiguity, as (u, v) and (v, u) are the same edge. The following theorem will help clear things up

Thm

In a DFS of an undirected graph $G = (V, E)$, every edge is a tree edge or a back edge.



DAG Gum it!

- DAGs are good at modeling processes and structures that have a **partial order** (\prec)
 - $A \prec B$ and $B \prec C \Rightarrow A \prec C$
 - May have neither $A \prec B$ nor $B \prec C$
- Think of a partial order as “the way in which you must do tasks” to ensure successful completion
- Sometimes it doesn't matter if you do A first or B first...



Spring Break on My Mind!

- Put ice in shaker (A)
- Pour gin^a in shaker (B)
- Pour vermouth^b in shaker (C)
- Stir^c (D)
- Strain (E)
- Put ice in glass (F)
- Remove ice from glass (G)
- Pour in glass (H)
- Add olive to glass (I)
- Enjoy! (J)

^aPreferably Boodles

^bVery Little

^cNever shake

Task Relations

- $A \prec B$
- $A \prec C$
- $B \prec D$
- $C \prec D$
- $D \prec E$
- $F \prec G$
- $G \prec H$
- $G \prec I$
- $E \prec H$
- $H \prec J$
- $I \prec J$



Topological Sort



- We would like to produce a valid order for making a martini
- A **topological sort** of a directed acyclic graph (DAG) is a linear ordering of its nodes which is compatible with the partial order \prec induced on the nodes.
- $u \prec v$ if there's a directed path from u to v in the DAG.
- An equivalent definition is that each node comes before all nodes to which it has edges.
- i.e. u must be done before v
- Every DAG has at least one topological sort, and may have many.



Topological Sort

Topological Sort: The Whole Algorithm

- 1 DFS search the graph
- 2 List vertices in order of **decreasing** finishing time

Why Does This Work?

- Show that $(u, v) \in E \Rightarrow f[v] < f[u]$
- When we explore (u, v) , u is **YELLOW**



Why Does This Work? (cont.)

What color is v ?

- Is v **YELLOW**?
 - **No**, since then DAG would have a cycle
 - Is v **GREEN**?
 - Then it becomes descendant of u and (by $()$ theorem), $d[u] < d[v] < f[v] < f[u]$
 - Is v **RED**?
 - If so, then we're finished and $f[v] < f[u]$ since we're still exploring u
- Therefore if $(u, v) \in E, f[v] < f[u]$

QUITE ENOUGH DONE



Strongly Connected Components

- Given a directed graph $G = (V, E)$, a **strongly connected component** of G is a maximal set of vertices $C \subseteq V$ such that $\forall u, v, \in C$ there exists a directed path both from u to v and from v to u
- The algorithm uses the **transpose** of a directed graph $G = (V, E)$, where the orientations are flipped:

$$G^T = (V, E^T), \text{ where } E^T = \{(v, u) \mid (u, v) \in E\}$$

- What is running time to create G^T ?
- Note: G and G^T have the **same** Strongly Connected Components
 - u and v are both reachable from each other in G if and only if they are both reachable with the orientations flipped (G^T).



Finding Strongly Connected Components

- 1 Call $\text{DFS}(G)$ to topologically sort G
- 2 Compute G^T
- 3 Call $\text{DFS}(G^T)$ but consider vertices in topologically sorted order (from G)
- 4 Vertices in each tree of depth-first forest for SCC



Component Graph

- $G^{\text{SCC}}(G) = (V^{\text{SCC}}, E^{\text{SCC}})$
- V^{SCC} has one vertex for each strongly connected component of G
- $e \in E^{\text{SCC}}$ if there is an edge between corresponding SCC's in G

Lemma

G^{SCC} is a DAG

- For $C \subseteq V$, $f(C) \stackrel{\text{def}}{=} \max_{v \in C} \{f[v]\}$



More Lemma

Lemma

Let C and C' be distinct SCC in G ,

- if $(u, v) \in E$ and $u \in C, v \in C'$, then $f(C) > f(C')$
- if $(u, v) \in E^T$ and $u \in C, v \in C'$, then $f(C) < f(C')$
- If $f(C) > f(C')$, there is no edge from C to C' in G^T



Why SCC Works. (Intuition)

- DFS on G^T starts with SCC C such that $f(C)$ is maximum. Since $f(C) > f(C')$, there are no edges from C to C' in G^T
- This means that the DFS will visit only vertices in C
- The next root has the largest $f(C')$ for all $C' \neq C$. DFS visits all vertices in C' , and any other edges **must** go to C , which we have already visited..



Next Time

- Spanning Trees

