

Algorithms on Graphs

Study Notes by Ruijie Fang

1 DFS

Depth-first-search (DFS) generates a depth-first traversal of a graph $G = (V, E)$, an array $P[\cdot]$ that records the previsit order of the vertices in V , and an array $O[\cdot]$ that records the postvisit order. It runs in $O(V + E)$ -time.

Algorithm 1 (Depth-first search). $DFS(G, u)$:

```
 $VIS[u] := 1;$   
 $previsit(v);$   
for  $(u, v) \in E:$   
    if  $\neg VIS[v]: DFS(G, v);$   
 $postvisit(v);$ 
```

The subroutines *postvisit* and *previsit* perform constant-time maintenance work; as shown below, we can augment these procedures to perform different tasks.

2 Finding connected components

We can call DFS in a loop through $v \in E$ to count the number of connected components:

Algorithm 2 (Counting connected components in G). $CountCC(G)$:

```
 $t := 0;$   
 $VIS[0..|V|] := 0;$   
for  $v \in V:$ 
```

```

if  $\neg VIS[v]$  :
    dfs(v); t := t + 1;

```

The overall time complexity is still $O(|V| + |E|)$ since we only visit each vertex once.

3 Bipartite testing

Theorem 3. G is bipartite $\leftrightarrow G$ is bicolourable.

We can augment the DFS procedure for bipartite testing. We use an extra array $C[\cdot]$ to denote the color of each vertex $v \in V$. From theorem 3, we denote Black as 1 and White as 0, and a bipartite graph must be correctly colored using 0's and 1's.

Algorithm 4 (Bipartite testing). **Precondition:** Initialize $C[\cdot]$ to -1 and set $C[0] := 0$. Call $isBipartite(G, 0)$.

Postcondition: Returns 1 if the graph is bipartite; otherwise returns 0.

$isBipartite(G, u)$:

```

nc :=  $\neg C[u]$ ;
for  $v \in V$ :
    if  $\neg(C[v] = -1) \wedge \neg(C[v] = nc)$ : return 0;
    elif  $C[v] = -1$ :
         $C[v] := nc$ ;
    return  $isBipartite(G, v)$ ;

```

The overall runtime is still $O(|V| + |E|)$.

4 Articulation points

Definition 5 (Articulation points of a graph). An articulation point of G is a vertex $p \in V$ such that the deletion of p from G increases the number of connected components in G .

Lemma 6. The root of a DFS spanning tree of G is an articulation point if and only if it has more than one children in the spanning tree.

Lemma 7. *A node v in the DFS spanning tree of G is an articulation point if and only if there exists no back edge from a tree descendant of v to a tree parent of v .*

Lemmas 6 & 7 results in a DFS-based linear-time algorithm for finding articulation points. Let $pre[\cdot]$ denote the order in which DFS traverses the vertices. Let $low[u] = \min\{pre[v] | v \text{ is an ancestor of } u \text{ in the DFS spanning tree}\}$. In other words, let $low[u]$ denote the neighbor of u that is nearest to the root of the DFS spanning tree. Then the set of articulation points are $\{v \in V | low[v] \geq pre[v]\}$ (the complement set contains all points whose descendants have back edges) and, if the root node in the DFS spanning tree has more than 1 children, the root node.

Algorithm 8 (Finding articulation points in a graph). **Precondition:** v stands for the parent of u in the DFS spanning tree. Call with $ArticulationPoint(G, 0, -1)$.

$p := 1; pre[0 \dots |V|] := 0;$

$ArticulationPoints(G, u, v) :$

```

     $pre[u] := p;$ 
     $low[u] := pre[u];$ 
     $p := p + 1;$ 
     $ch := 0; // \text{children count}$ 
    for  $(u, w) \in E:$ 
        if  $\neg pre[v]:$ 
             $ch := ch + 1;$ 
             $low[u] := \min\{low[u], dfs(G, w, u)\};$ 
            if  $low[w] \geq pre[u]:$ 
                report  $u$  as articulation point;
            elif  $pre[w] < pre[u] \wedge w \neq v :$ 
                 $low[u] := \min\{low[u], pre[w]\};$ 
    if  $v < 0 \wedge ch = 1:$ 
        report  $u$  as NOT an articulation point;
    return  $low[u];$ 

```

5 Bridges

Definition 9 (Bridges/cut edges of a graph). A bridge of G is an edge $(u, v) \in E$ such that the deletion of (u, v) from G increases the number of connected components in G .

Continuing our discussion from section 4, we find that if $low[v] > pre[u]$, then edge (u, v) is a bridge. It follows that this characterization suffices for finding bridges, and we only have to modify *ArticulationPoints*(\cdot) slightly for this case.

Algorithm 10 (Finding bridges in a graph). **Precondition:** v stands for the parent of u in the DFS spanning tree. Call with *Bridges*($G, 0, -1$).

$p := 1; pre[0...|V|] := 0;$

Bridges(G, u, v) :

$pre[u] := p;$

$low[u] := pre[u];$

$p := p + 1;$

$ch := 0; // children count$

for $(u, w) \in E$:

if $\neg pre[v]$:

$ch := ch + 1;$

$low[u] := \min\{low[u], dfs(G, w, u)\};$

if $low[w] > pre[u]$:

report (u, v) as bridge;

elif $pre[w] < pre[u] \wedge w \neq v$:

$low[u] := \min\{low[u], pre[w]\};$

return $low[u];$

6 Biconnected components

We deal with undirected graphs in this section.

Definition 11. A graph G is biconnected if and only if for all $u, v \in V$, there exists at least two vertex-disjoint paths from u to v .

\leftrightarrow for all $u, v \in V$, u and v are in a simple cycle (there exists no articulation points).

Definition 12. A graph G is edge-biconnected if and only if for all $u, v \in V$, there exists at least two edge-disjoint paths from u to v .

\leftrightarrow for all $e \in E$, e is inside at least a single simple cycle (all edges are not bridges).

Definition 13 (Biconnected component of a graph). A subgraph $G' \subseteq G$ is called a biconnected component of G is a maximum biconnected subgraph of G .

Definition 14 (Edge-biconnected component of a graph). Analogous to Def. 13, but the maximum subgraph is edge-biconnected.

By definition, we can find all edge-biconnected components by a graph by finding and deleting all the bridges inside the graph. The resulting connected components are all edge-biconnected.

By definition, each edge belongs to precisely one biconnected subgraph, but a vertex might belong to two biconnected components.

Algorithm 15 (Finding a biconnected component). **Preconditions:** $pre[1..|V|] := 0$; $isArticulationPoint[1..|V|] := 0$; $bccno[1..|V|] := 0$; $bcc[1..|V|] := \{\}$; $p := 1$; $bccCnt := 0$;

Initialize $S := Stack()$;

$FindBCC(u, p) :$ // p is the parent of u , initially -1.

$low[u] := pre[u] := p$;

$p := p + 1$;

$ch := 0$;

for $(u, v) \in E$:

if $pre[v] = 0$:

$S.push(u, v)$;

$ch := ch + 1$;

$dfs(v, u)$;

```

low[u] := min{low[u], low[v]};
if low[v] ≥ pre[u]: // u is an articulation point
    isArticulationPoint[u] := 1;
    bccCnt := bccCnt + 1;
    while ¬S.empty():
        (u', v') := S.top(); S.pop();
        if (bccno[u'] ≠ bccCnt):
            add u' to bcc[bccCnt];
            bccno[u'] := bccCnt;
        if (bcc[v'] ≠ bccCnt):
            add v' to bcc[bccCnt];
            bccno[v'] := bccCnt;
        if u' = u ∧ v' = v:
            break;
    elif pre[v] < pre[u] ∧ v ≠ p:
        S.push(u, v);
        low[u] := min{low[u], pre[v]};
if p < 0 ∧ ch > 1) isArticulationPoint[u] := 1;

```

For finding edge-biconnected components, we can just remove all the bridges and count the number of connected components.

7 Strongly connected components of directed graphs

All vertices within the same SCC (Strongly Connected Component) of a directed graph G can reach each other. However, due to the nature of the directed graph, finding SCCs is not as simple as finding connected components.

Tarjan's Algorithm. Tarjan's idea is still DFS-based, but it uses extra information to separate the different SCCs within the same DFS traversal. The resulting algorithm has the same time bound as DFS. For a single SCC $C \subseteq G$, the first vertex encountered during the DFS traversal is the ancestor of all other vertices in C within the DFS spanning

tree. If we output C immediately after we visited its first vertex, we can separate different SCCs efficiently. The key to the problem, therefore, is to record the first vertex in C encountered during the DFS traversal of G . This makes this problem highly similar to finding articulation points: if a vertex u is the first vertex encountered, then there must not be a back edge to u 's ancestor in the descendants of u .

Algorithm 16 (Tarjan's SCC Algorithm). **Preconditions:** Initialize $pre[1..|V|] := 0$, $lowlink[1..|V|] := 0$, $sccno[1..|V|] := 0$, $p := 1$, $sccCnt := 0$;

Initialize $S := Stack()$;

$TarjanSCC(u)$:

$pre[u] := lowlink[u] := p$;

$p := p + 1$;

$S.push(u)$;

for $(u, v) \in E$:

if $pre[v] = 0$:

$dfs(v)$;

$lowlink[u] := \min\{lowlink[u], lowlink[v]\}$;

elif $sccno[v] = 0$:

$lowlink[u] := \min\{lowlink[u], pre[v]\}$;

if $lowlink[u] = pre[u]$:

$sccCnt := sccCnt + 1$;

while $\neg S.empty()$:

$v := S.top(); S.pop()$;

$sccno[v] := sccCnt$;

if $v = u$:

break;

8 2SAT

Some day.