

# Chapter 3 Decomposition of graphs

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September 11, 2019

*The notes are based on Chapter 3 of Dasgupta, Papadimitriou and Vazirani. Algorithms. 2008. McGraw-Hill. New York.*

## 1 Introduction

Some graph problems can be very challenging.

The graph coloring problem:

Color a map with the minimum number of colors so that adjacent countries do not share the same color.

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Scheduling exams so that the exams any student must take will not overlap in time.

A planar graph only needs 4 colors—it takes ~100 years to get a correct proof!

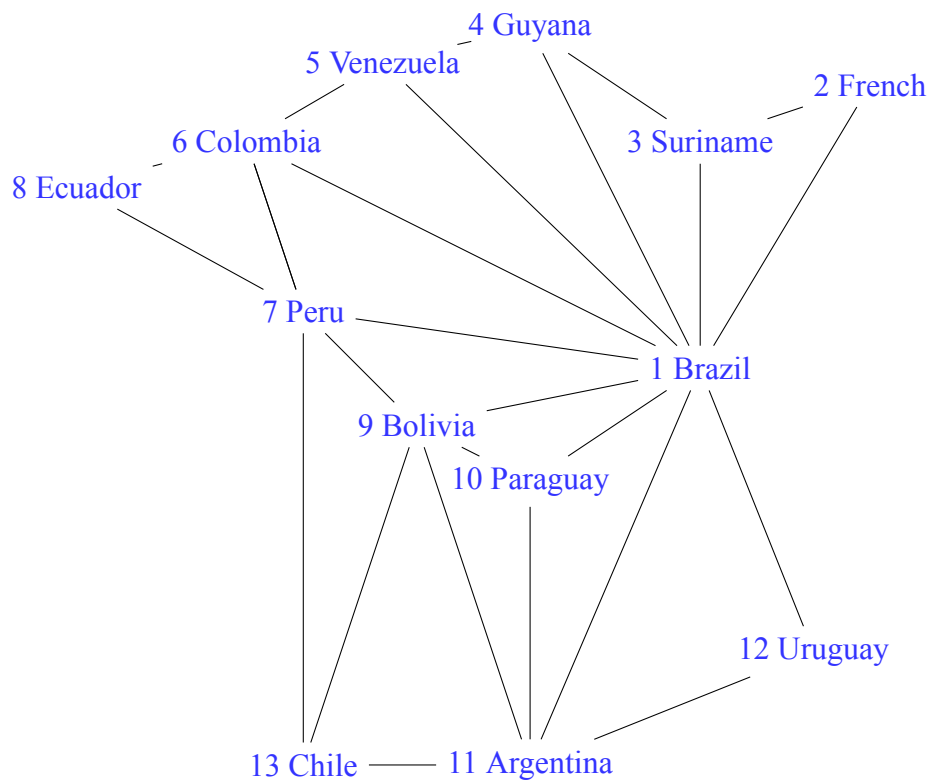
**1879** Alfred Kempe published a paper saying 4 colors are maximum needed for planar graphs.

Fellow of the Royal Society

President of the London Mathematical Society

**1890** Heawood said Kempe's proof is wrong! Instead he proved no more than 5 colors are needed!

**1976** No more than 4 colors is finally proved by Kenneth Appel and Wolfgang Haken.



We will focus on graph problems that are efficiently solvable.

Definition of a *graph*  $G$ :

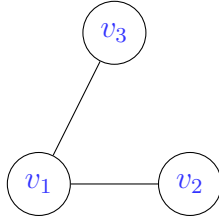
- a set of vertices (nodes)  $V$
- a set of edges  $E$ . Each edge connects a pair of vertices.

Example of the above graph:  $V = \{1, 2, \dots, 13\}$ ,  $E = \{(1, 2), (9, 11), \dots\}$ .

*Directed edge*  $(x, y)$  is directional from node  $x$  to  $y$ .  $(y, x)$  is from  $y$  to  $x$ .

## 1.1 Representation

Undirected graph :



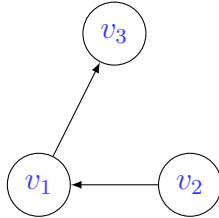
→ **Adjacency MATRIX**

	$v_1$	$v_2$	$v_3$
$v_1$	0	1	1
$v_2$	1	0	0
$v_3$	1	0	0

**Adjacency LIST**

$v_1 : (v_3 \rightarrow v_2)$   
 $v_2 : (v_1)$   
 $v_3 : (v_1)$

Directed graph :



→ **Adjacency MATRIX**

	$v_1$	$v_2$	$v_3$
$v_1$	0	0	1
$v_2$	1	0	0
$v_3$	0	0	0

**Adjacency LIST**

$v_1 : (v_3)$   
 $v_2 : (v_1)$   
 $v_3 : ()$

### Adjacency matrix:

$A = \{a_{ij}\}$  for  $V = \{v_1, \dots, v_n\}$ .

$$a_{ij} = \begin{cases} 1 & \text{if there is an edge from } v_i \text{ to } v_j \\ 0 & \text{otherwise} \end{cases}$$

Properties:

- Space complexity  $O(|V|^2) = O(n^2)$ —expensive!
- Checking the existence of edge  $(u, v)$  takes *constant* time  $O(1)$ —fast!

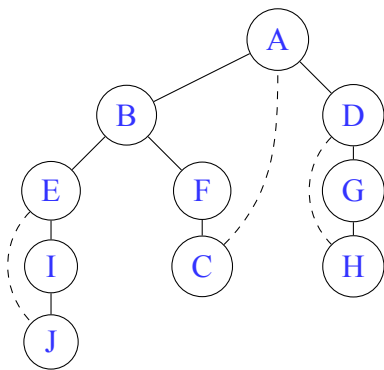
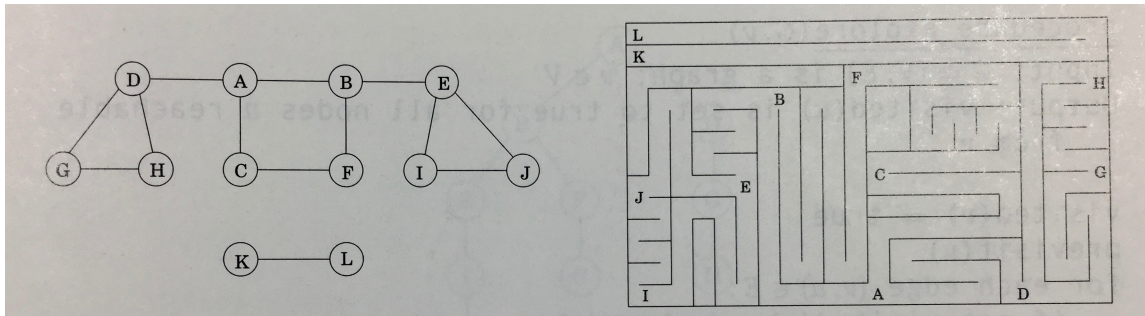
### Adjacency list:

- Consists of  $|V|$  linked lists, one for each node
- The list for vertex  $u$  holds names of vertices that  $u$  has an outgoing edge.

Properties:

- undirected edges will be represented twice
- Space complexity  $O(|V| + |E|)$
- Checking the existence of edge  $(u, v)$  can take  $O(|E|)$  time

## 2 Depth-first search in undirected graphs



Exploring all reachable nodes from a single given node:

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**procedure** `explore`( $G, v$ )

**Input:**  $G = (V, E)$  is a graph;  $v \in V$

**Output:** `visited`( $u$ ) is set to true for all nodes  $u$  reachable from  $v$

`visited`( $v$ ) = true

`previsit`( $v$ )    (optional)

**for each edge**  $(v, u) \in E$ :

**if not** `visited`( $u$ ): `explore`( $G, u$ )

`postvisit`( $v$ )    (optional)

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### Correctness:

Assume there is a path from  $v$  to  $u$  that is unexplored, shown as below.

$v$  (source) —  $z$  (visited) - -  $w$  (unexplored) - - - -  $u$  (unexplored)

We can find the last visited node  $z$  on the path (we can always find such one), anything after  $z$  is unvisited, where the first unvisited one is  $w$  with an edge with  $z$ . However, this leads to a contradiction as when  $z$  is explored, it would have noticed  $w$  and explored it. Therefore, we have a contradiction. Thus, we must all all nodes reachable from  $v$  visited after running the explore procedure.

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procedure dfs( $G$ )

for all  $v \in V$ :

    visited( $v$ ) = false

for all  $v \in V$ :

    if not visited( $v$ ): explore( $G, v$ )

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### Running time:

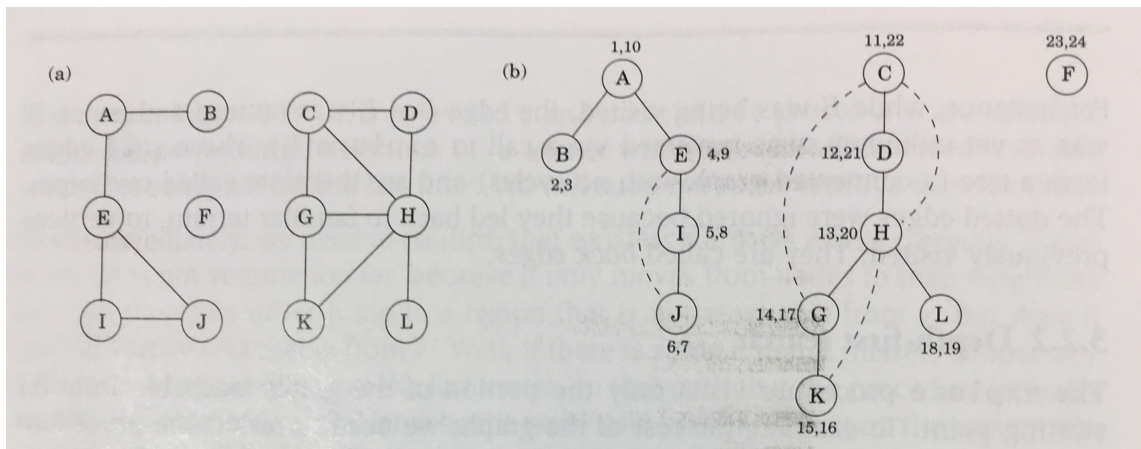
For each node, a constant amount of work is done

For each edge  $(x, y)$ , it is visited twice: once in explore( $x$ ) and once in explore( $y$ ).

So the total running time is

$$O(|V| + |E|)$$

### Connectivity:



An undirected graph is *connected* if there is a path between every pair of nodes.

A *connected component* is a subgraph that is internally connected but has no edges to the remaining nodes.

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```
procedure previsit( $v$ )  
ccnum[ $v$ ] = cc
```

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- cc is the label of the current connected component, which is initialized to zero and increased every time the explore() procedure is called from dfs().
- ccnum[ $v$ ] is the connected component number of node  $v$ .

**Previsit/Postvisit ordering:**

pre[ $v$ ] is the time first discovery of node  $v$ .

post[ $v$ ] is the time of final departure of node  $v$ .

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```
procedure previsit( $v$ )  
pre[ $v$ ] = clock  
clock = clock + 1
```

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```
procedure postvisit( $v$ )  
post[ $v$ ] = clock  
clock = clock + 1
```

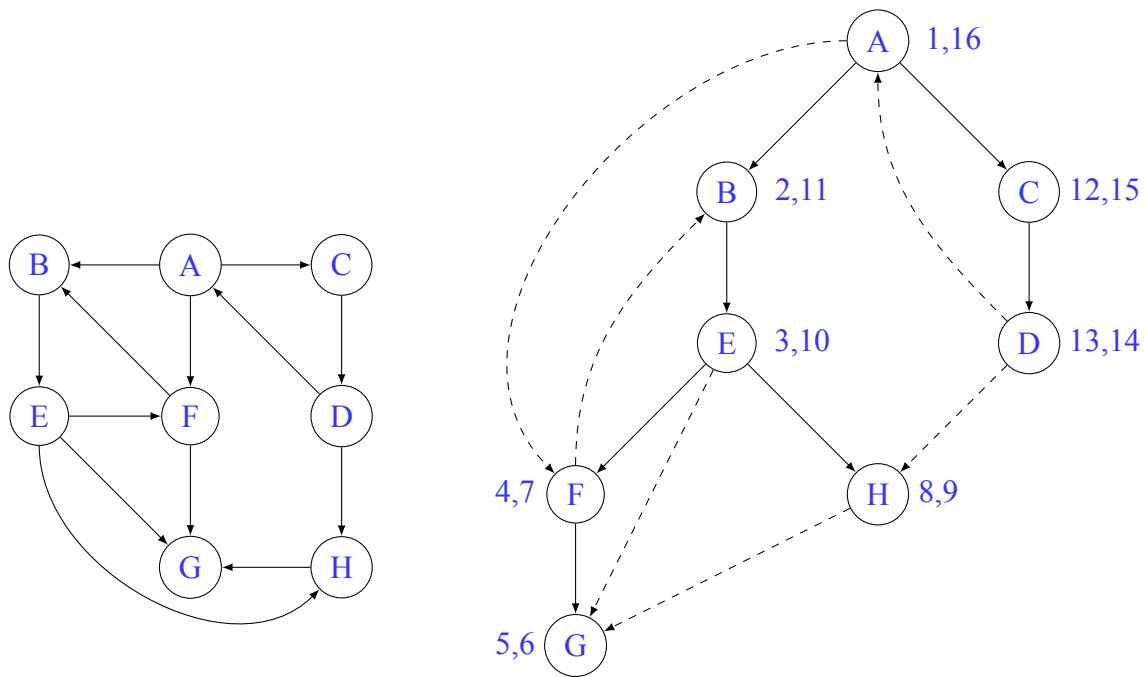
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Property: For any nodes  $u$  and  $v$ , the two intervals [pre( $u$ ), post( $u$ )] and [pre( $v$ ), post( $v$ )] are either disjoint or one is contained within the other.

This is due to the last-in-first-out (stack) nature of the explore() procedure for node traversal.

### 3 Depth-first search in directed graphs

DFS is the same as in the undirected graph except that an edge can only be traversed along its direction.



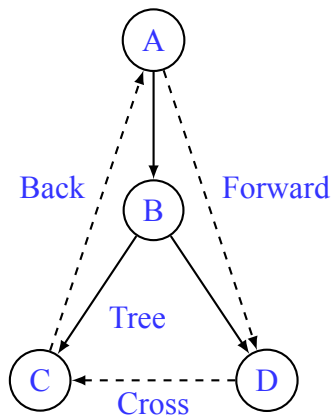
**root:** The starting node A

**descendant:** Everything else is descendant of A

**ancestor:** E is an ancestor of F, G, H

**parent:** C is the parent of D

**child:** D is the child of C



**Tree edges:** an edge of the DFS forest

**Forward edges:** a non-DFS-forest edge from a node to a non-child descendant in the DFS tree

**Back edges:** a non-DFS-forest edge from a node to an ancestor in the DFS tree

**Cross edges:** a non-DFS-forest edge leading to neither descendant nor ancestor – i.e., a node already been completely explored (i.e., postvisited)

The type of edge ( $u, v$ )	pre/post ordering for ( $u, v$ )
Tree/Forward	$pre[u] < pre[v] < post[v] < post[u]$
Back	$pre[v] < pre[u] < post[u] < post[v]$
Cross	$pre[v] < post[v] < pre[u] < post[u]$

### Directed acyclic graphs (dags)

*cycle*: is a circular path  $v_0 \rightarrow v_1 \rightarrow v_2 \rightarrow \dots \rightarrow v_k \rightarrow v_0$ .

*Directed acyclic graph (dag)*: a directed graph without cycles.

**Property of directed graph:** A directed graph has a cycle if and only if its depth-first search reveals a back edge.

The “IF” part: If there is path from  $A$  to  $D$  and there is a back edge from  $D$  to  $A$ , then combining the path and the back edge would have formed a cycle.

“ONLY IF”: (Proof by contradiction) If there is no back edge, no path can return to a node that is pre-visited earlier and it is impossible to have a cycle.

**Property 1 of dag:** A dag has no back edge on any DFS.

**Property 2 of dag:** In a dag, every edge leads to a vertex with a lower post number.

In a dag, there is no back edge, so the table above indicates that for every edge  $(u, v)$ ,  $post[v] < post[u]$ .

This property suggests that one can *linearize* the nodes in a dag by decreasing post numbers. This is also called *topological sort*.

**Property 3 of dag:** Every dag has at least one source and at least one sink.

source node: a node with no incoming edges.

sink node: a node with no outgoing edges.

Proof by contradiction. If there is no source node, one can backtrack a path and eventually reach another node on the same path, which leads to a cycle.



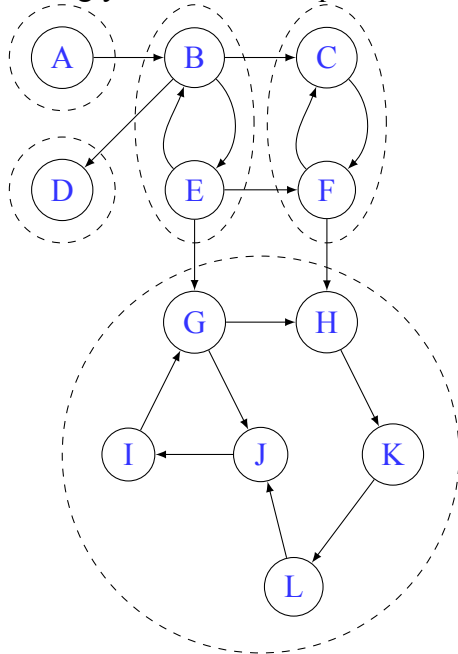
If there is no sink node, one can traverse a path and eventually reach another node already traversed on the same path, which leads to a cycle.

## 4 Strongly connected components

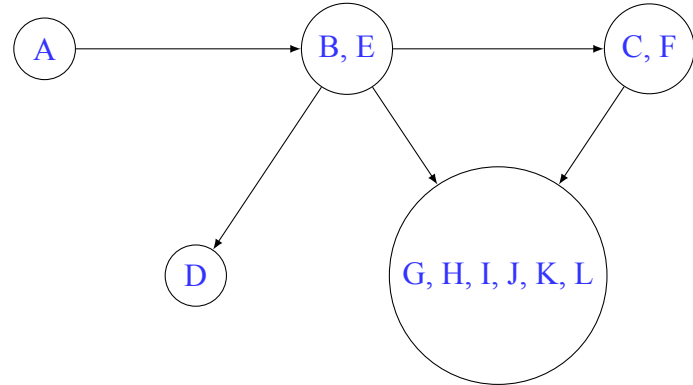
More subtle than the connectedness concept for undirected graphs.

*Connectivity* in a directed graph: Two nodes  $u$  and  $v$  are connected if there is a path from  $u$  to  $v$  and a path from  $v$  to  $u$ .

Strongly connected components in  $G$ :



Meta-graph of  $G$ :



*Strongly connected components*: Disjoint sets of connected nodes in a dag.

*Meta-graph*: Created by shrinking nodes in a strongly connected components to a single meta-node; Draw an edge from one meta-node to another if there is an edge between there respective components.

**Property:** The meta-graph of a directed graph is a dag.

Proof by contradiction. If there is a cycle in the meta-graph, then all strongly connected components on the cycle become one, because the cycle will link all nodes with the components, which is a contradiction that nodes in different components are disconnected.

## 4.1 Decomposition of a directed graph to strongly connected components

Ideas: Find a sink strongly connected component (on the meta-graph) first; Remove it from the graph; Find the sink strongly connected component of the remaining graph.

Considerations:

**Property 1** If the `explore` subroutine is started at node  $u$ , then it will terminate precisely when all nodes reachable from  $u$  have been visited.

This is evident and can be proved by contradiction.

**Property 2** The node that receives the highest `post` number in a depth-first search must lie in a source strongly connected component.

This follows from Property 3.

**Property 3** If  $C$  and  $C'$  are strongly connected components, and there is an edge from a node in  $C$  to a node in  $C'$ , then the highest `post` number in  $C$  is bigger than the biggest `post` number in  $C'$ .

Proof:

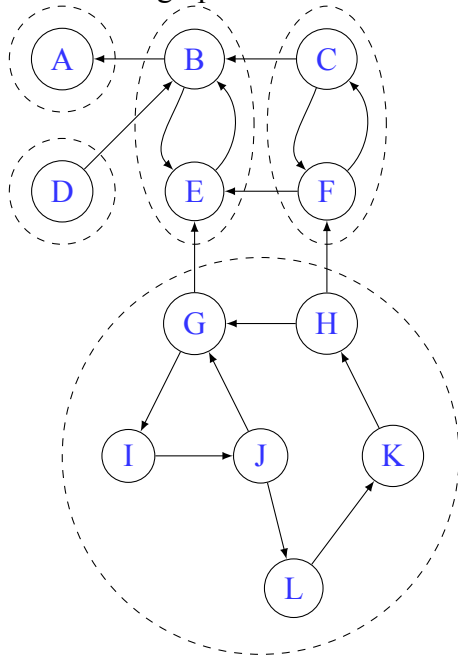
If the depth-first-search starts from a node in  $C$  first, it will traverse all nodes in  $C$  and  $C'$ . The start node obviously has the highest `post` number, which is in  $C$ .

If the depth-first-search starts from a node in  $C'$  first, it will traverse all nodes in  $C'$ . Then it will move on to a new node in  $C$ . The `post` number of any node in  $C$  will be greater than the `post` number in  $C'$ .

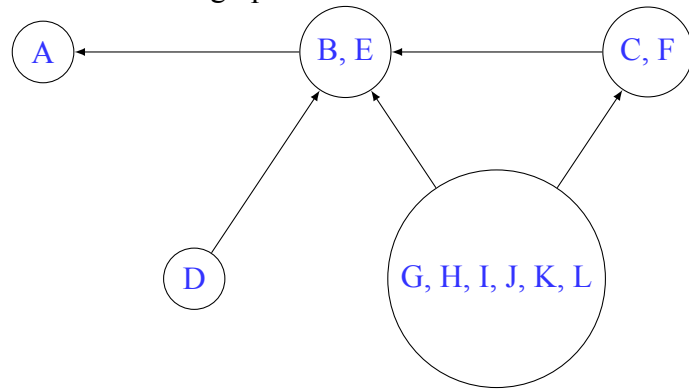
Implication:

If we create a reverse graph  $G^R$  by reversing all the edge directions in  $G$ , the node with the highest `post` number from a source strongly connected component in  $G^R$  is a node in a sink connected component in  $G$ .

Strongly connected components  
in reversed graph  $G^R$ :



Reversed meta-graph:




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procedure Find-Strongly-Connected-Components( $G$ )

Step 1. Run depth-first search on  $G^R$

Step 2. Run the undirected connected components algorithm (but respect edge directions) on  $G$ , and during the depth-first search, process the vertices in decreasing order of their post numbers from Step 1.

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