## Graph Decomposition\*

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#### X033533-Algorithm: Analysis and Theory

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Exploring Graphs

## Outline

#### Depth-First Search in Undirected Graphs

- Exploring Graphs
- Connectivity in Undirected Graphs
- Previsit and Postvisit Orderings

- Types of Edges
- Strongly Connected Components

Correctness and Efficiency

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#### Depth-First Search in Undirected Graphs

Depth-First Search in Directed Graphs Breadth-First Search

#### Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

# **Exploring Graphs**

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# **Exploring Graphs**

Algorithm 2: 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

- 1 VISITED(v) = true;
- **2** PREVIST(v);
- 3 for each edge  $(v, u) \in E$  do
- 4 **if** *not* VISITED(u) **then**
- 5  $\lfloor \text{ EXPLORE}(G, u);$
- **6** POSTVISIT(v);

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**Algorithm 3:** EXPLORE(G, v)

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1 VISITED
$$(v) = true;$$

- **2** PREVIST(v);
- **3 for** each edge  $(v, u) \in E$  do
- if *not* VISITED(*u*) then 4 5
  - EXPLORE(G, u);
- **6** POSTVISIT(v):

Note: PREVISIT and POSTVISIT procedures are optional. They work on a vertex when it is first discovered and left for the last time.

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

#### **Correctness Proof**

**Theorem**: EXPLORE(G, v) is correct, i.e., it visits exactly all nodes that are reachable from v.

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

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**Proof**: Every node which it visits must be reachable from *v*:

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Image: A matrix and a matrix

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So *z* was visited but *w* was not. This is a contradiction:

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#### Depth-First Search in Undirected Graphs

Depth-First Search in Directed Graphs Breadth-First Search

#### Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

#### **Depth-First Search**

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Exploring Graphs

# **Depth-First Search**

Algorithm 5: DFS(G, v)

**Input**: G = (V, E) is a graph;  $v \in V$ **Output**: VISITED(*v*) is set to *true* for all nodes  $v \in V$ 

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- 4 foreach  $v \in V$  do
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#### Depth-First Search in Undirected Graphs

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Exploring Graphs

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In step 2, over the course of the entire DFS, each edge  $\{x, y\} \in E$  is examined exactly *twice*, once during EXPLORE(G, x) and once during EXPLORE(G, y). The overall time for step 2 is therefore O(|E|).

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Thus the depth-first search has a running time of O(|V| + |E|).

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

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- Previsit and Postvisit Orderings

#### 2 Depth-First Search in Directed Graphs

- Types of Edges
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#### 3 Breadth-First Search

• Correctness and Efficiency

Depth-First Search in Undirected Graphs

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### Connectivity in undirected graphs

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#### Connectivity in undirected graphs

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

## Connectivity in undirected graphs

**Definition**: An undirected graph is **connected**, if there is a path between any pair of vertices.

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

Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

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

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Each time the DFS outer loop calls EXPLORE, a new connected component is picked out.

Depth-First Search in Undirected Graphs

Depth-First Search in Directed Graphs Breadth-First Search Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

#### Connectivity in undirected graphs (cont'd)

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

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All it takes is

 $\frac{\text{PREVISIT}(v)}{\text{CCNUM}[v] = cc}$ 

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More generally, to assign each node v an integer CCNUM[v] identifying the connected component to which it belongs.

All it takes is

 $\frac{\text{PREVISIT}(v)}{\text{CCNUM}[v] = cc}$ 

where *cc* needs to be initialized to zero and to be incremented each time the DFS procedure calls EXPLORE.

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

#### Previsit and postvisit orderings

For each node, we will note down the times of two important events:

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Previsit and Postvisit Orderings

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

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Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

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 $\frac{PREVISIT}{v}$  PRE[v] = clock clock = clock + 1

Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

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```
\frac{PREVISIT}{V}(v)
PRE[v] = clock
clock = clock + 1
\frac{POSTVISIT}{V}(v)
POST[v] = clock
clock = clock + 1
```

## Previsit and postvisit orderings

For each node, we will note down the times of two important events:

- the moment of first discovery (corresponding to PREVISIT);
- and the moment of final departure (POSTVISIT).

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\frac{PREVISIT}{(v)}
PRE[v] = clock
clock = clock + 1
POSTVISIT(v)
```

```
POST[v] = clock
clock = clock + 1
```

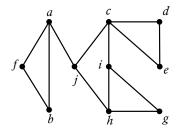
**Lemma**: For any nodes u and v, the two intervals [PRE(u), POST(u)] and [PRE(u), POST(u)] are either disjoint or one is contained within the other.

Depth-First Search in Undirected Graphs Depth-First Search in Directed Graphs Exploring Graphs Connectivity in Undirected Graphs Previsit and Postvisit Orderings

#### An executing example

Assume we use alphabetical order to explore G:

Breadth-First Search

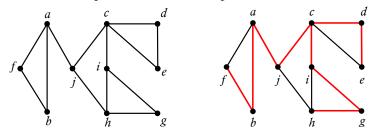


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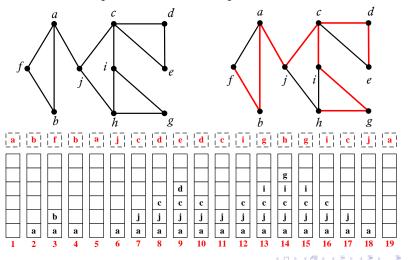


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#### 2 Depth-First Search in Directed Graphs

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#### 3 Breadth-First Search

• Correctness and Efficiency

DFS yields a search tree/forests.

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DFS yields a search tree/forests.

- root.
- descendant and ancestor.
- parent and child.

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# Types of edges

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- Forward edges lead from a node to a nonchild descendant in the DFS tree.
- Backedges lead to an ancestor in the DFS tree.
- **Cross edges** lead to neither descendant nor ancestor; they therefore lead to a node that has already been completely explored (that is, already postvisited).

Types of Edges Directed Acyclic Graphs Strongly Connected Components

## Types of edges (cont'd)

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Types of Edges Directed Acyclic Graphs Strongly Connected Components

## Types of edges (cont'd)

PRE/POST ordering for $(u, v)$				) Edge type
[ <i>u</i>	[v	$]_{v}$	$]_u$	Tree/forward
[v	[ <i>u</i>	] <i>u</i>	$]_{v}$	Back
[v	$]_{v}$	[ <i>u</i>	]u	Cross

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Types of Edges Directed Acyclic Graphs Strongly Connected Components

### Directed acyclic graphs (DAG)

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Types of Edges Directed Acyclic Graphs Strongly Connected Components

#### Directed acyclic graphs (DAG)

**Definition**: A *cycle* in a directed graph is a circular path  $v_0 \rightarrow v_1 \rightarrow v_2 \rightarrow \cdots \rightarrow v_k \rightarrow v_0$ .

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All the other  $v_j$  on the cycle are reachable from it and will therefore be its descendants in the search tree.

In particular, the edge  $v_{i-1} \rightarrow v_i$  (or  $v_k \rightarrow v_0$  if i = 0) is a back edge.

Types of Edges Directed Acyclic Graphs Strongly Connected Components

### Directed acyclic graphs (cont'd)

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**Linearization/Topologically Sort**: Order the vertices such that every edge goes from a small vertex to a large one.

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## Directed acyclic graphs (cont'd)

**Linearization/Topologically Sort**: Order the vertices such that every edge goes from a small vertex to a large one.

**Lemma**: In a dag, every edge leads to a vertex with a lower POST number.

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# Directed acyclic graphs (cont'd)

**Linearization/Topologically Sort**: Order the vertices such that every edge goes from a small vertex to a large one.

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- Find a source, output it, and delete it from the graph.
- Repeat until the graph is empty.

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## Outline

#### Depth-First Search in Undirected Graphs

- Exploring Graphs
- Connectivity in Undirected Graphs
- Previsit and Postvisit Orderings

#### 2 Depth-First Search in Directed Graphs

- Types of Edges
- Directed Acyclic Graphs
- Strongly Connected Components

#### 3 Breadth-First Search

• Correctness and Efficiency

Types of Edges Directed Acyclic Graphs Strongly Connected Components

#### Defining connectivity for directed graphs

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### Defining connectivity for directed graphs

# **Definition**: Two nodes *u* and *v* of a directed graph are **connected** if there is a path from *u* to *v* and a path from *v* to *u*.

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**Lemma**: Every directed graph is a dag of its strongly connected components.

Types of Edges Directed Acyclic Graphs Strongly Connected Components

## An efficient algorithm

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Strongly Connected Components

## An efficient algorithm

**Lemma**: If the EXPLORE subroutine is started at node *u*, then it will terminate precisely when all nodes reachable from *u* have been visited.

Image: A matrix and a matrix

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Therefore, if we call explore on a node that lies somewhere in a sink strongly connected component (a strongly connected component that is a sink in the meta-graph), then we will retrieve exactly that component.

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We have two problems:

- (A) How do we find a node that we know for sure lies in a sink strongly connected component?
- (B) How do we continue once this first component has been discovered?

Types of Edges Directed Acyclic Graphs Strongly Connected Components

### An efficient algorithm (cont'd)

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Types of Edges Directed Acyclic Graphs Strongly Connected Components

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Hence the strongly connected components can be linearized by arranging them in decreasing order of their highest POST numbers.

Types of Edges Directed Acyclic Graphs Strongly Connected Components

### Solving problem A

# Consider the **reverse graph** $G^R$ , the same as G but with all edges reversed.

Image: A matrix and a matrix

Types of Edges Directed Acyclic Graphs Strongly Connected Components

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 $G^R$  has exactly the same strongly connected components as G.

So, if we do a depth-first search of  $G^R$ , the node with the highest POST number will come from a source strongly connected component in  $G^R$ , which is to say a sink strongly connected component in G.

Types of Edges Directed Acyclic Graphs Strongly Connected Components

## Solving problem B

Once we have found the first strongly connected component and deleted it from the graph, the node with the highest post number among those remaining will belong to a sink strongly connected component of whatever remains of G.

Types of Edges Directed Acyclic Graphs Strongly Connected Components

# Solving problem B

Once we have found the first strongly connected component and deleted it from the graph, the node with the highest post number among those remaining will belong to a sink strongly connected component of whatever remains of G.

Therefore we can keep using the post numbering from our initial depth-first search on  $G^R$  to successively output the second strongly connected component, the third strongly connected component, and so on.

Types of Edges Directed Acyclic Graphs Strongly Connected Components

#### The linear-time algorithm

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Types of Edges Directed Acyclic Graphs Strongly Connected Components

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#### The linear-time algorithm

#### • Run depth-first search on $G^R$ .

Types of Edges Directed Acyclic Graphs Strongly Connected Components

### The linear-time algorithm

- Run depth-first search on  $G^R$ .
- Run the undirected connected components algorithm on G, and during the depth-first search, process the vertices in decreasing order of their POST numbers from step 1.

## Outline

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#### 3 Breadth-First Search

• Correctness and Efficiency

The algorithm

Correctness and Efficiency

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## The algorithm

Algorithm 7: BFS(G, s)

**Input**: Graph G = (V, E), directed or undirected; vertex  $s \in V$ **Output**: For all vertices *u* reachable from *s*, DIST(*u*) is set to the distance from *s* to *u* 

1 foreach  $u \in V$  do

2 
$$\[ DIST(u) = \infty; \]$$
  
3  $DIST(s) = 0; Q = [s]$  (queue containing just s);  
4 while Q is not empty do  
5  $\[ u = EJECT(Q); \]$   
6  $\[ foreach edge (u, v) \in E \text{ do} \]$   
7  $\[ if DIST(v) = \infty \text{ then} \]$   
8  $\[ \[ INJECT(Q, v); DIST(v) = DIST(u) + 1; \]$ 

Correctness and Efficiency

#### Correctness and efficiency

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Correctness and Efficiency

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**Lemma**: For each d = 0, 1, 2, ..., there is a moment at which (1) all nodes at distance  $\leq d$  from s have their distances correctly set; (2) all other nodes have their distances set to  $\infty$ ; and (3) the queue contains exactly the nodes at distance d.

Correctness and Efficiency

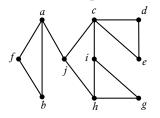
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**Lemma**: BFS has a running time of O(|V| + |E|).

#### An executing example

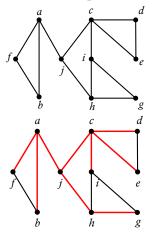
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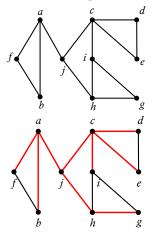
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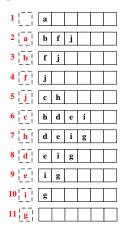


Correctness and Efficiency

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