

# CSE 250: Depth- and Breadth-First Search

## Lecture 20

Oct 16, 2024

# Reminders

- PA2 released
  - Implement Graph Traversal.
  - Due **Tuesday**, Oct 22
- Midterm Report out Today
  - Extrapolated from PA1, WA1, Midterm1
  - If you don't like your grade, have a chat (Fridays @ 10 AM)
- Midterm Grades
  - Out soon... (waiting on makeups)

# Edge List Summary

- `addEdge`, `addVertex`:  $O(1)$
- `removeEdge`:  $O(1)$
- `removeVertex`:  $O(M)$
- `incidentEdges`:  $O(M)$
- `hasEdgeTo`:  $O(M)$

**Space Used:**  $O(N + M)$   
(constant space per vertex, edge)

# Adjacency List Summary

## Starting with an edge list:

- Store a linked list of in/out edges with each vertex
- Store the linked list node for the in/out lists with each edge

# Edge List Summary

- `addEdge`, `addVertex`:  $O(1)$
- `removeEdge`:  $O(1)$
- `removeVertex`:  $O(\text{deg}(v))$
- `incidentEdges`:  $O(1) + O(1)$  per `next()`
- `hasEdgeTo`:  $O(\text{deg}(v))$

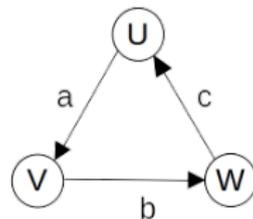
**Space Used:**  $O(N + M)$   
(constant space per vertex, edge)

# hasEdgeTo

Can we cut `hasEdgeTo` down to  $O(1)$ ?

# The Adjacency Matrix Data Structure

		<u>Destination</u>		
		U	V	W
<u>Origin</u>	U	-	a	-
	V	-	-	b
	W	c	-	-



# Edge List Summary

- `addEdge`, `removeEdge`:
- `addVertex`, `removeVertex`:
- `incidentEdges`:
- `hasEdgeTo`:

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:
- `incidentEdges`:
- `hasEdgeTo`:

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:  $O(N^2)$
- `incidentEdges`:
- `hasEdgeTo`:

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:  $O(N^2)$
- `incidentEdges`:  $O(N)$
- `hasEdgeTo`:

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:  $O(N^2)$
- `incidentEdges`:  $O(N)$
- `hasEdgeTo`:  $O(1)$

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:  $O(N^2)$
- `incidentEdges`:  $O(N)$
- `hasEdgeTo`:  $O(1)$

**Space Used:**

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:  $O(N^2)$
- `incidentEdges`:  $O(N)$
- `hasEdgeTo`:  $O(1)$

**Space Used:**

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:  $O(N^2)$
- `incidentEdges`:  $O(N)$
- `hasEdgeTo`:  $O(1)$

**Space Used:**

# Edge List Summary

- `addEdge`, `removeEdge`:  $O(1)$
- `addVertex`, `removeVertex`:  $O(N^2)$
- `incidentEdges`:  $O(N)$
- `hasEdgeTo`:  $O(1)$

**Space Used:**  $O(N^2)$

# A few more definitions

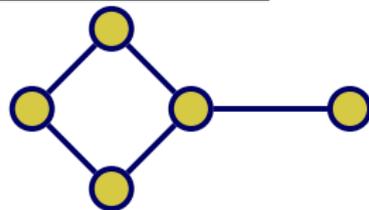
A graph is **connected** if...

- ... there is a path between every pair of vertices.

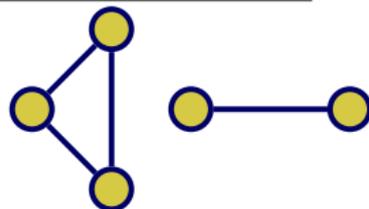
A **connected component** of  $G$  is a maximal, connected subgraph of  $G$

- “maximal” means that adding any other vertices from  $G$  would break the connected property.
- Any subset of  $G$ 's edges that makes the subgraph connected is fine.

## Connected Graph



## Disconnected Graph



# A few more definitions

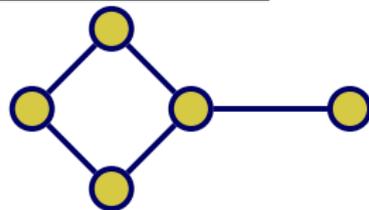
A graph is **connected** if...

- ... there is a path between every pair of vertices.

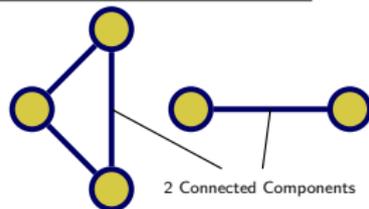
A **connected component** of  $G$  is a maximal, connected subgraph of  $G$

- “maximal” means that adding any other vertices from  $G$  would break the connected property.
- Any subset of  $G$ 's edges that makes the subgraph connected is fine.

## Connected Graph



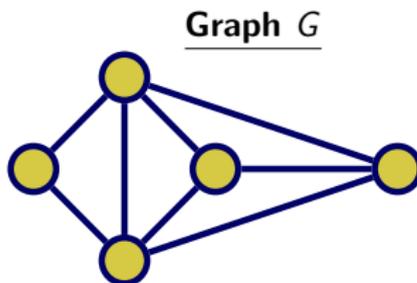
## Disconnected Graph



## A few more definitions...

A **spanning tree** of a connected graph  $G$  is:

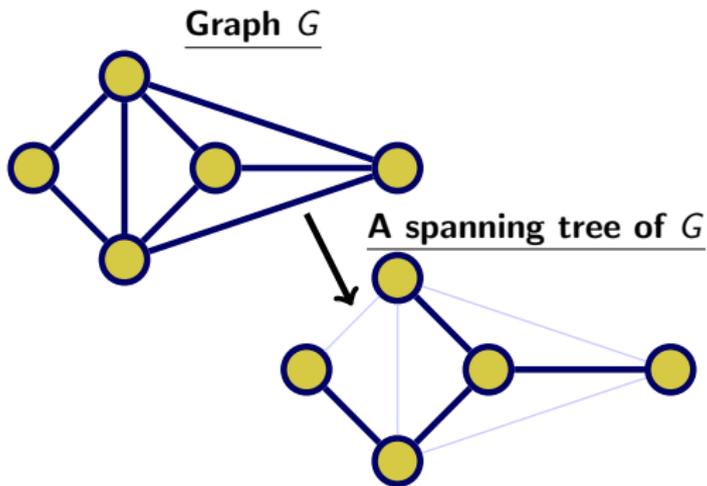
- A spanning subgraph of  $G$
- A tree



# A few more definitions...

A **spanning tree** of a connected graph  $G$  is:

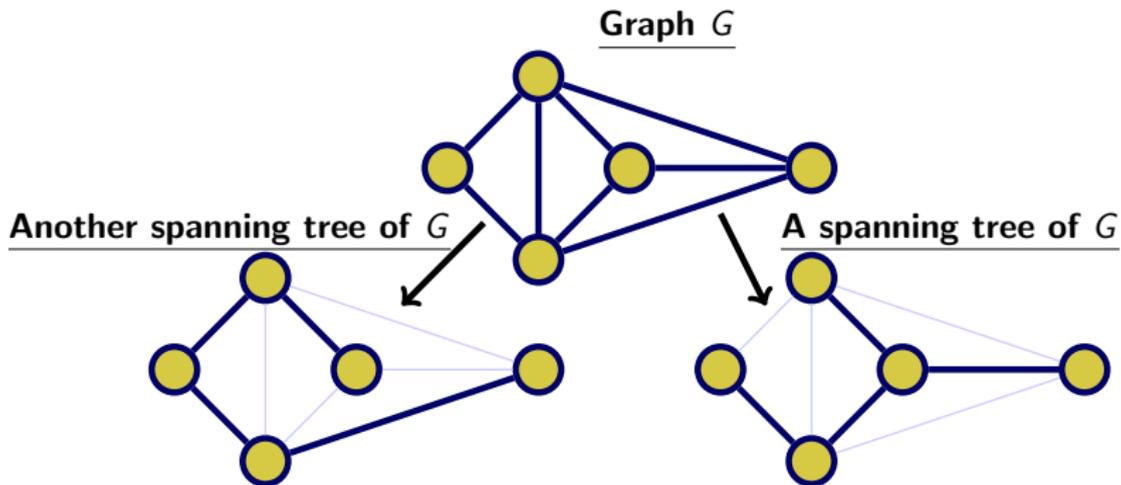
- A spanning subgraph of  $G$
- A tree



# A few more definitions...

A **spanning tree** of a connected graph  $G$  is:

- A spanning subgraph of  $G$
- A tree

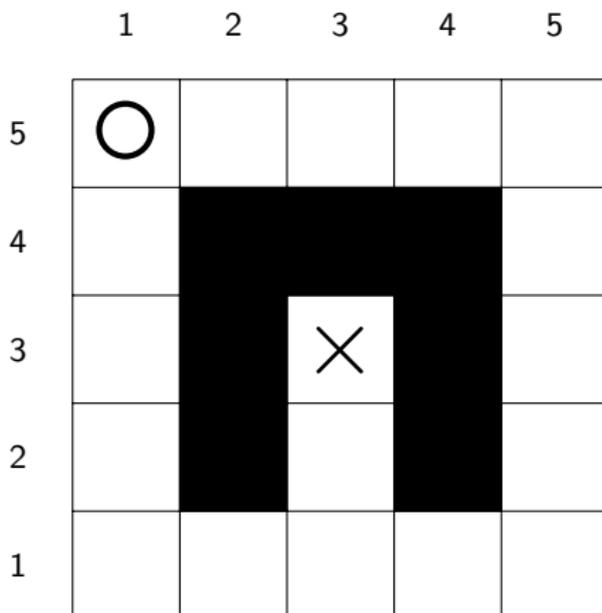


**Note:** A graph has multiple spanning trees (unless it is already a tree).

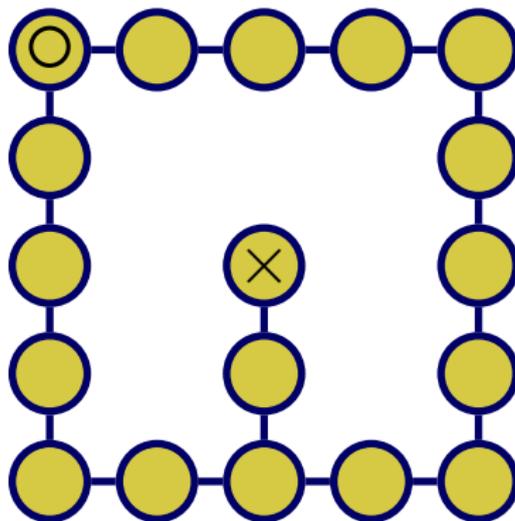
# Back to connectivity...

So how about connectivity?

... or mazes?



... or mazes?



# Recall Mazes

- Start at a vertex
- If this is the target vertex, done!
- Push the next adjacent vertex (not filled, or already on the stack) onto the stack
- Explore from that vertex
- When that vertex is explored, pop it and move to the next adjacent vertex
- When everything is explored, return.

# Recall Mazes

- Start at a vertex
- If this is the target vertex, done!
- Push the next adjacent vertex (not filled, or already on the stack) onto the stack
- Explore from that vertex
- When that vertex is explored, pop it and move to the next adjacent vertex
- When everything is explored, return.

**This is called Depth-First Search**

# Recall Mazes

- Start at a vertex
- If this is the target vertex, done!
- Push the next adjacent vertex (not filled, or already on the stack) onto the stack
- Explore from that vertex
- When that vertex is explored, pop it and move to the next adjacent vertex
- When everything is explored, return.

**This is called Depth-First Search** Contrast with Breadth-First Search

# Depth First Search (DFS)

## Primary Goals

- Visit every vertex in graph  $G = (V, E)$ .
- Construct a spanning tree for every connected component.

# Depth First Search (DFS)

## Primary Goals

- Visit every vertex in graph  $G = (V, E)$ .
- Construct a spanning tree for every connected component.
  - **Side Effect:** Compute connected components.

# Depth First Search (DFS)

## Primary Goals

- Visit every vertex in graph  $G = (V, E)$ .
- Construct a spanning tree for every connected component.
  - **Side Effect:** Compute connected components.
  - **Side Effect:** Compute a path between all connected vertices.

# Depth First Search (DFS)

## Primary Goals

- Visit every vertex in graph  $G = (V, E)$ .
- Construct a spanning tree for every connected component.
  - **Side Effect:** Compute connected components.
  - **Side Effect:** Compute a path between all connected vertices.
  - **Side Effect:** Determine if the graph is connected.

# Depth First Search (DFS)

## Primary Goals

- Visit every vertex in graph  $G = (V, E)$ .
- Construct a spanning tree for every connected component.
  - **Side Effect:** Compute connected components.
  - **Side Effect:** Compute a path between all connected vertices.
  - **Side Effect:** Determine if the graph is connected.
  - **Side Effect:** Identify any cycles (if they exist).

# Depth First Search (DFS)

## Primary Goals

- Visit every vertex in graph  $G = (V, E)$ .
- Construct a spanning tree for every connected component.
  - **Side Effect:** Compute connected components.
  - **Side Effect:** Compute a path between all connected vertices.
  - **Side Effect:** Determine if the graph is connected.
  - **Side Effect:** Identify any cycles (if they exist).
- Complete in time  $O(N + M)$ .

# Depth First Search (DFS)

DFS( $G$ )

## Input

- Graph  $G = (V, E)$

## Output

- Label every edge as a:
  - Spanning Edge: Part of the spanning tree
  - Back Edge: Part of a cycle

# Depth First Search (DFS)

$\text{DFSOne}(G, v)$

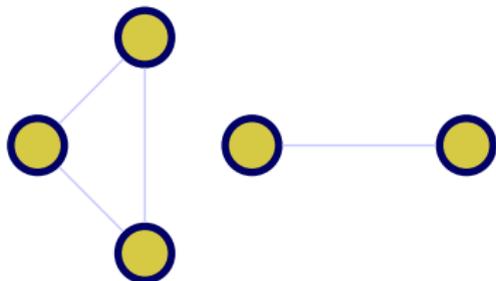
## Input

- Graph  $G = (V, E)$
- Start vertex  $v \in V$

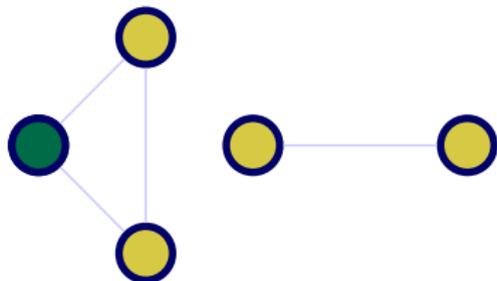
## Output

- Label every edge in  $v$ 's connected component as a:
  - Spanning Edge: Part of the spanning tree
  - Back Edge: Part of a cycle

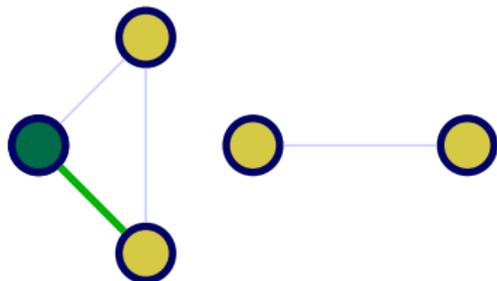
# DFS Example



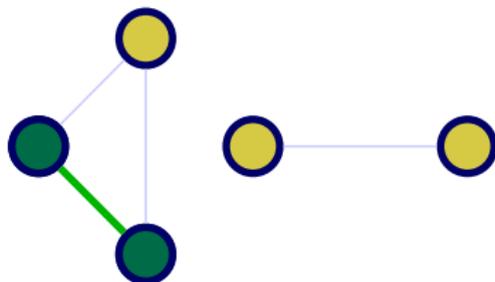
# DFS Example



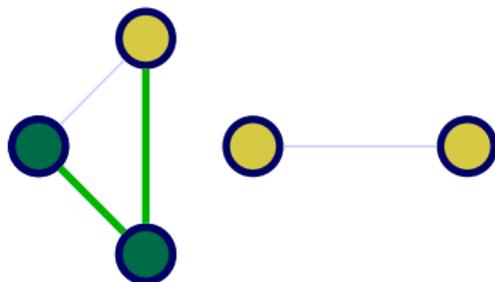
# DFS Example



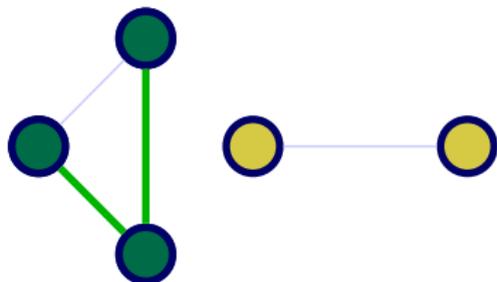
# DFS Example



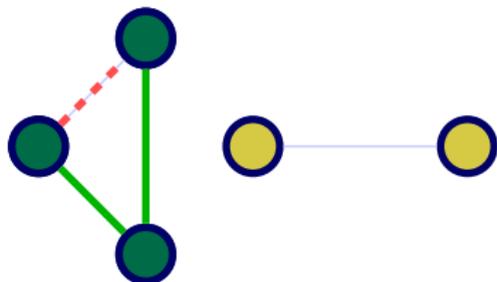
# DFS Example



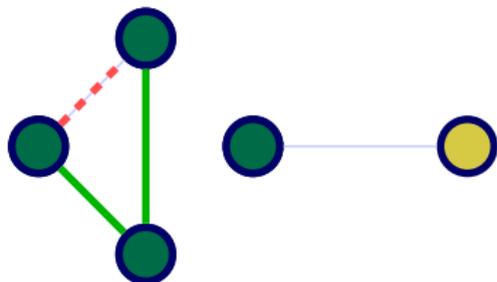
# DFS Example



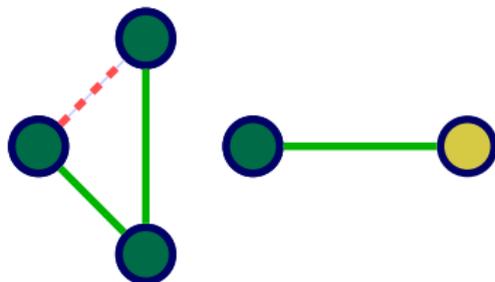
# DFS Example



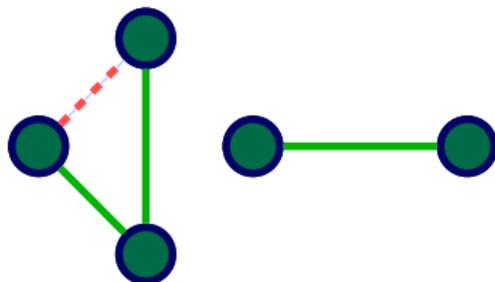
# DFS Example



# DFS Example



# DFS Example



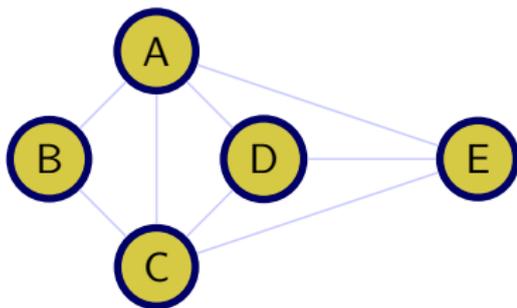
# Depth First Search (DFS)

```
1  public enum VertexLabel { UNEXPLORED, VISITED }
2  public enum EdgeLabel { UNEXPLORED, SPANNING, BACK }
3
4  public void DFS(Graph<VertexLabel,EdgeLabel> graph)
5  {
6      for(Vertex v : graph.vertices)
7          { v.setLabel(VertexLabel.UNEXPLORED); }
8      for(Edge e : graph.edges)
9          { e.setLabel(EdgeLabel.UNEXPLORED); }
10     for(Vertex v : graph.vertices)
11     {
12         if(v.getLabel() == VertexLabel.UNEXPLORED)
13         {
14             DFSOne(graph, v)
15         }
16     }
17 }
```

# DFSOne

```
1  public void DFSOne(Graph<...> graph, Vertex start)
2  {
3      start.setLabel(VertexLabel.VISITED)
4
5      for( edge : start.getIncident() ) {
6          if(edge.getLabel == EdgeLabel.UNEXPLORED){
7              Vertex otherVertex = edge.getOppositeVertex(start);
8
9              if(otherVertex.getLabel == VertexLabel.UNEXPLORED){
10                 edge.setLabel(EdgeLabel.SPANNING);
11                 DFSOne(graph, otherVertex);
12             } else {
13                 edge.setLabel(EdgeLabel.BACK);
14             }
15         }
16     }
17 }
```

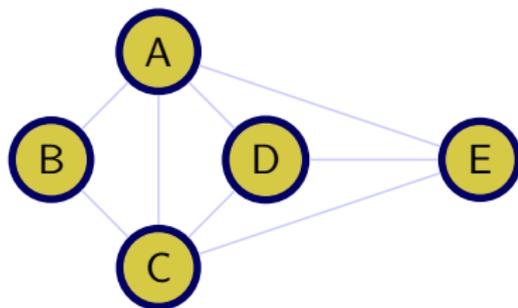
# Depth First Search (DFS)



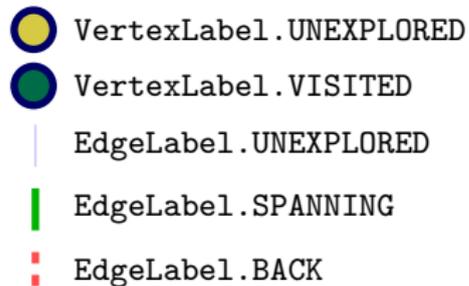
Call Stack

-  VertexLabel.UNEXPLORED
-  VertexLabel.VISITED
-  EdgeLabel.UNEXPLORED
-  EdgeLabel.SPANNING
-  EdgeLabel.BACK

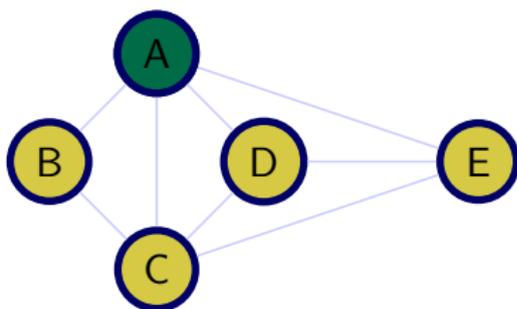
# Depth First Search (DFS)



Call Stack  
DFS(G)



# Depth First Search (DFS)



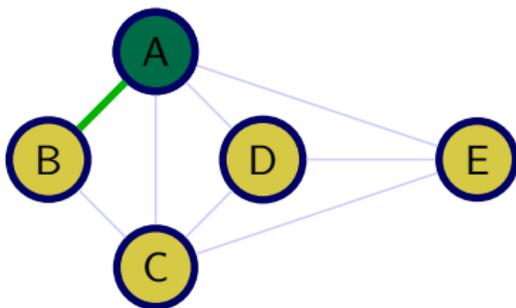
-  VertexLabel.UNEXPLORED
-  VertexLabel.VISITED
-  EdgeLabel.UNEXPLORED
-  EdgeLabel.SPANNING
-  EdgeLabel.BACK

## Call Stack

DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

# Depth First Search (DFS)



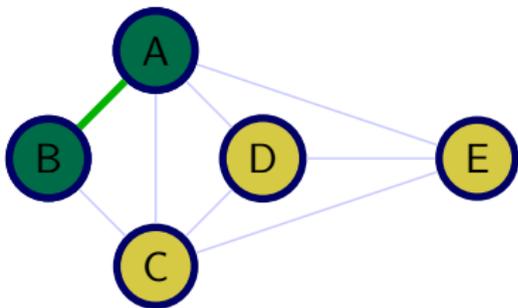
-  VertexLabel.UNEXPLORED
-  VertexLabel.VISITED
-  EdgeLabel.UNEXPLORED
-  EdgeLabel.SPANNING
-  EdgeLabel.BACK

## Call Stack

DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

# Depth First Search (DFS)



- VertexLabel.UNEXPLORED
- VertexLabel.VISITED
- EdgeLabel.UNEXPLORED
- EdgeLabel.SPANNING
- EdgeLabel.BACK

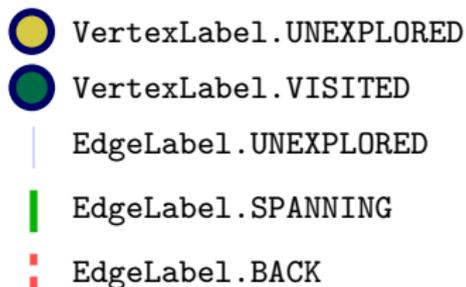
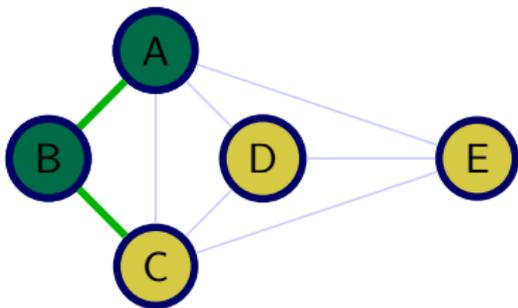
## Call Stack

DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

DFSone(G, B) ( $\rightarrow$  A, C)

# Depth First Search (DFS)



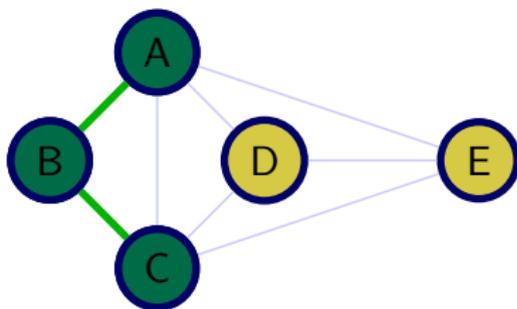
## Call Stack

DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

DFSone(G, B) ( $\rightarrow$  A, C)

# Depth First Search (DFS)



-  VertexLabel.UNEXPLORED
-  VertexLabel.VISITED
-  EdgeLabel.UNEXPLORED
-  EdgeLabel.SPANNING
-  EdgeLabel.BACK

## Call Stack

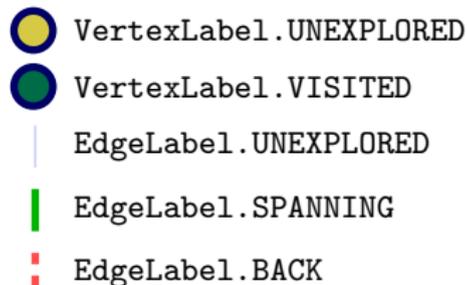
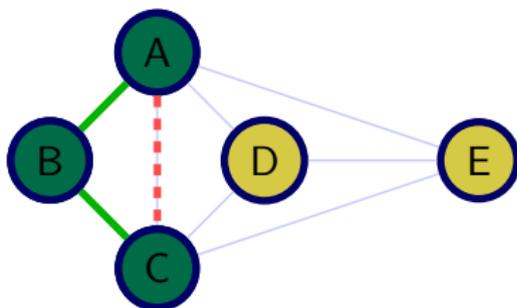
DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

    DFSone(G, B) ( $\rightarrow$  A, C)

        DFSone(G, C) ( $\rightarrow$  A, B, D, E)

# Depth First Search (DFS)



## Call Stack

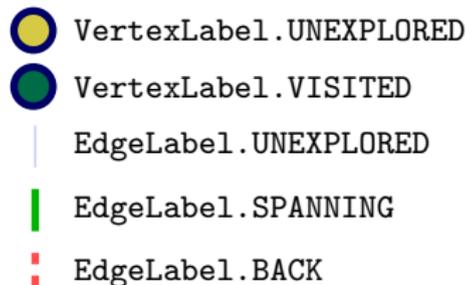
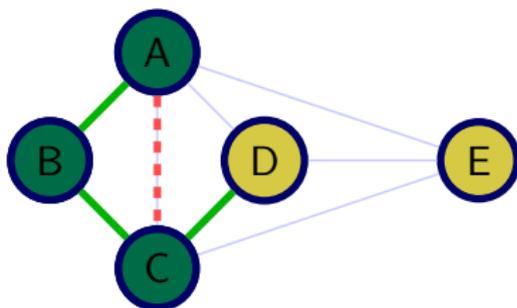
DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

    DFSone(G, B) ( $\rightarrow$  A, C)

        DFSone(G, C) ( $\rightarrow$  A, B, D, E)

# Depth First Search (DFS)



## Call Stack

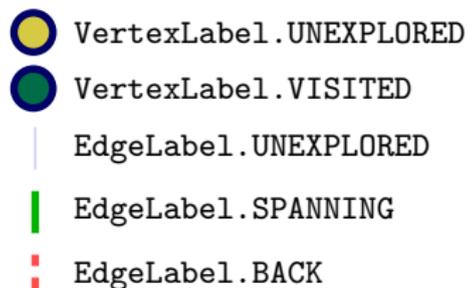
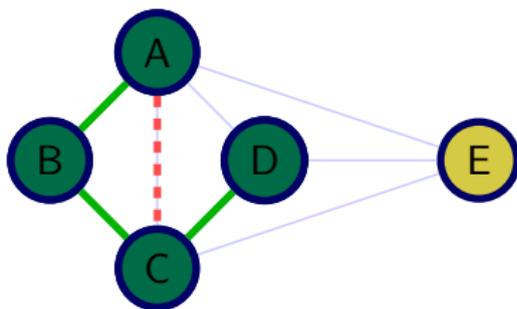
DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

    DFSone(G, B) ( $\rightarrow$  A, C)

        DFSone(G, C) ( $\rightarrow$  A, B, D, E)

# Depth First Search (DFS)



## Call Stack

DFS(G)

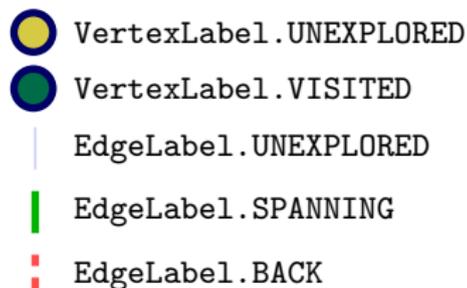
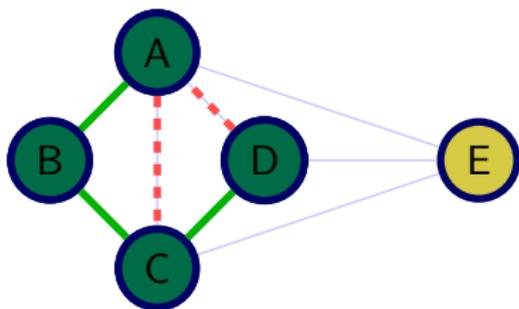
DFSOne(G, A) ( $\rightarrow$  B, C, D, E)

    DFSOne(G, B) ( $\rightarrow$  A, C)

    DFSOne(G, C) ( $\rightarrow$  A, B, D, E)

        DFSOne(G, D) ( $\rightarrow$  A, C, E)

# Depth First Search (DFS)



## Call Stack

DFS(G)

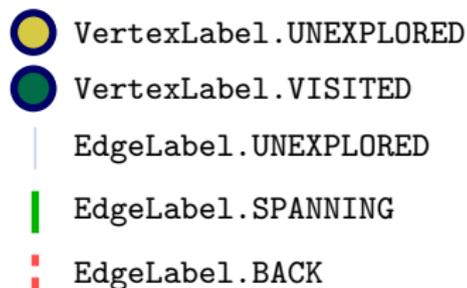
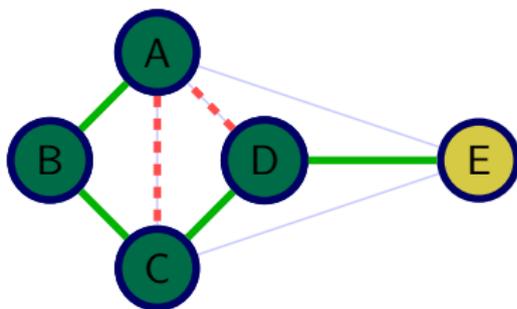
DFSOne(G, A) ( $\rightarrow$  B, C, D, E)

    DFSOne(G, B) ( $\rightarrow$  A, C)

    DFSOne(G, C) ( $\rightarrow$  A, B, D, E)

        DFSOne(G, D) ( $\rightarrow$  A, C, E)

# Depth First Search (DFS)



## Call Stack

DFS(G)

DFSOne(G, A) ( $\rightarrow$  B, C, D, E)

    DFSOne(G, B) ( $\rightarrow$  A, C)

    DFSOne(G, C) ( $\rightarrow$  A, B, D, E)

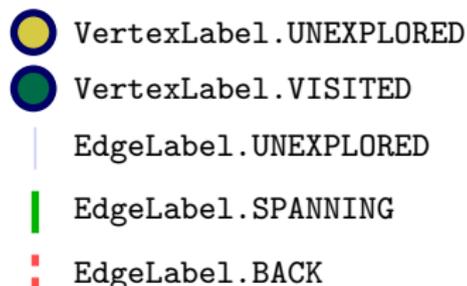
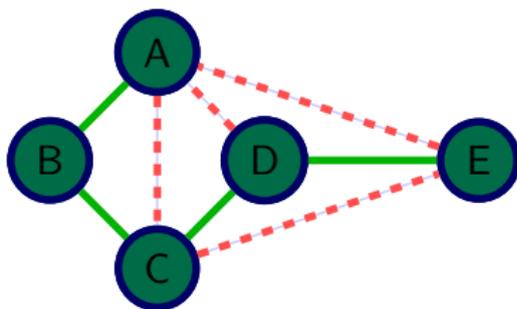
        DFSOne(G, D) ( $\rightarrow$  A, C, E)







# Depth First Search (DFS)



## Call Stack

DFS(G)

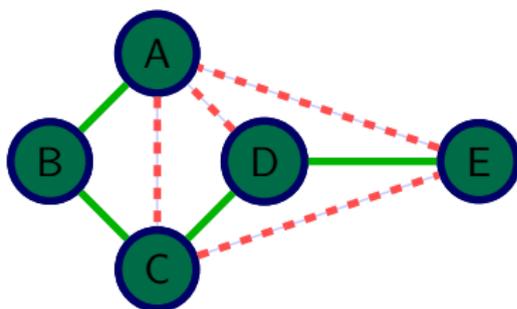
DFSOne(G, A) ( $\rightarrow$  B, C, D, E)

    DFSOne(G, B) ( $\rightarrow$  A, C)

    DFSOne(G, C) ( $\rightarrow$  A, B, D, E)

        DFSOne(G, D) ( $\rightarrow$  A, C, E)

# Depth First Search (DFS)



-  VertexLabel.UNEXPLORED
-  VertexLabel.VISITED
-  EdgeLabel.UNEXPLORED
-  EdgeLabel.SPANNING
-  EdgeLabel.BACK

## Call Stack

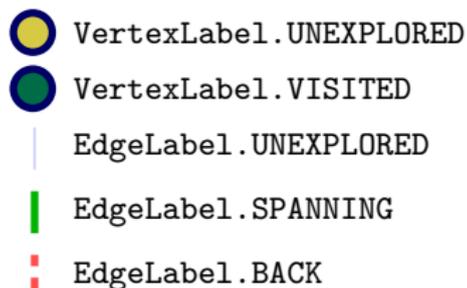
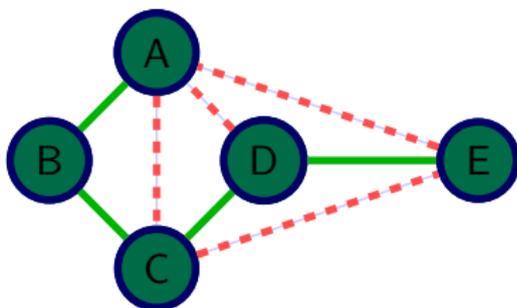
DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

    DFSone(G, B) ( $\rightarrow$  A, C)

        DFSone(G, C) ( $\rightarrow$  A, B, D, E)

# Depth First Search (DFS)



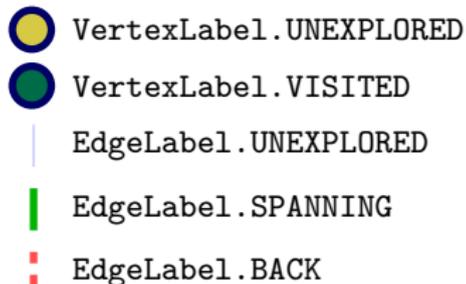
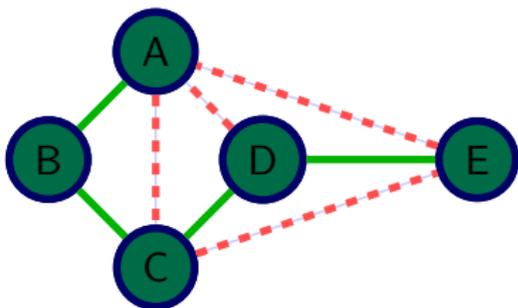
## Call Stack

DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

DFSone(G, B) ( $\rightarrow$  A, C)

# Depth First Search (DFS)

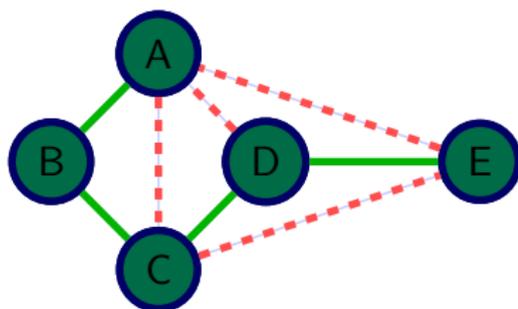


## Call Stack

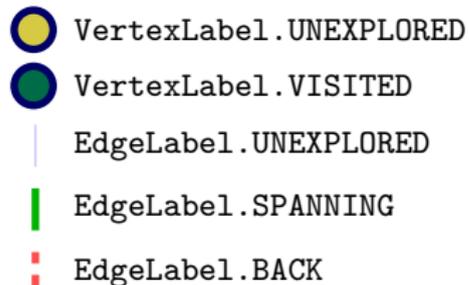
DFS(G)

DFSone(G, A) ( $\rightarrow$  B, C, D, E)

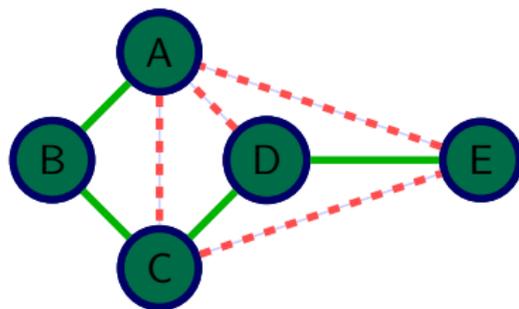
# Depth First Search (DFS)



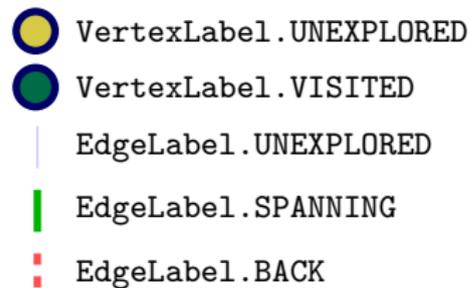
Call Stack  
DFS(G)



# Depth First Search (DFS)



Call Stack



# DFS on Mazes

The DFS algorithm is like our stack-based maze solver

- Mark each grid square with VISITED
- Mark each path with SPANNING
- Only visit each vertex once.

# DFS on Mazes

The DFS algorithm is like our stack-based maze solver

- Mark each grid square with VISITED
- Mark each path with SPANNING
- Only visit each vertex once.

DFS won't necessarily find the shortest paths.

# DFS

What's the complexity?

# Depth First Search (DFS)

```
1  public enum VertexLabel { UNEXPLORED, VISITED }
2  public enum EdgeLabel { UNEXPLORED, SPANNING, BACK }
3
4  public void DFS(Graph<VertexLabel,EdgeLabel> graph)
5  {
6      for(Vertex v : graph.vertices)
7          { v.setLabel(VertexLabel.UNEXPLORED); }
8      for(Edge e : graph.edges)
9          { e.setLabel(EdgeLabel.UNEXPLORED); }
10     for(Vertex v : graph.vertices)
11     {
12         if(v.getLabel() == VertexLabel.UNEXPLORED)
13         {
14             DFSOne(graph, v)
15         }
16     }
17 }
```

# Depth First Search (DFS)

```
1  public enum VertexLabel { UNEXPLORED, VISITED }
2  public enum EdgeLabel { UNEXPLORED, SPANNING, BACK }
3
4  public void DFS(Graph<VertexLabel,EdgeLabel> graph)
5  {
6       $O(N)$ 
7
8      for(Edge e : graph.edges)
9          { e.setLabel(EdgeLabel.UNEXPLORED); }
10     for(Vertex v : graph.vertices)
11     {
12         if(v.getLabel() == VertexLabel.UNEXPLORED)
13         {
14             DFSOne(graph, v)
15         }
16     }
17 }
```

# Depth First Search (DFS)

```
1  public enum VertexLabel { UNEXPLORED, VISITED }
2  public enum EdgeLabel { UNEXPLORED, SPANNING, BACK }
3
4  public void DFS(Graph<VertexLabel,EdgeLabel> graph)
5  {
6       $O(N)$ 
7
8       $O(M)$ 
9
10     for(Vertex v : graph.vertices)
11     {
12         if(v.getLabel() == VertexLabel.UNEXPLORED)
13         {
14             DFSOne(graph, v)
15         }
16     }
17 }
```

# Depth First Search (DFS)

```
1  public enum VertexLabel { UNEXPLORED, VISITED }
2  public enum EdgeLabel { UNEXPLORED, SPANNING, BACK }
3
4  public void DFS(Graph<VertexLabel,EdgeLabel> graph)
5  {
6       $O(N)$ 
7
8       $O(M)$ 
9
10      $O(N)$  times
11     {
12         if(v.getLabel() == VertexLabel.UNEXPLORED)
13         {
14             DFSOne(graph, v)
15         }
16     }
17 }
```

# Depth First Search (DFS)

```

1  public enum VertexLabel { UNEXPLORED, VISITED }
2  public enum EdgeLabel { UNEXPLORED, SPANNING, BACK }
3
4  public void DFS(Graph<VertexLabel,EdgeLabel> graph)
5  {
6       $O(N)$ 
7
8       $O(M)$ 
9
10      $O(N)$  times
11     {
12          $O(1)$ 
13         {
14             DFSOne(graph, v)
15         } else {
16              $O(1)$ 
17         }
18     }
19 }

```

# Depth First Search (DFS)

**Observation:** DFS<sub>one</sub> is called on each vertex at most once.

- If  $v$ 's label is VISITED, both DFS<sub>one</sub> and DFS skip it

# Depth First Search (DFS)

**Observation:** DFSOne is called on each vertex at most once.

- If  $v$ 's label is VISITED, both DFSOne and DFS skip it

$O(N)$  calls to DFSOne

# Depth First Search (DFS)

**Observation:**  $\text{DFSOne}$  is called on each vertex at most once.

- If  $v$ 's label is VISITED, both  $\text{DFSOne}$  and DFS skip it

$O(N)$  calls to  $\text{DFSOne}$

What's the runtime of  $\text{DFSOne}$  **excluding recursive calls**?

# DFSOne

```
1  public void DFSOne(Graph<...> graph, Vertex start)
2  {
3      start.setLabel(VertexLabel.VISITED)
4
5      for( edge : start.getIncident() ) {
6          if(edge.getLabel == EdgeLabel.UNEXPLORED){
7              Vertex otherVertex = edge.getOppositeVertex(start);
8
9              if(otherVertex.getLabel == VertexLabel.UNEXPLORED){
10                 edge.setLabel(EdgeLabel.SPANNING);
11                 DFSOne(graph, otherVertex);
12             } else {
13                 edge.setLabel(EdgeLabel.BACK);
14             }
15         }
16     }
17 }
```

# DFSOne

```
1  public void DFSOne(Graph<...> graph, Vertex start)
2  {
3      O(1)
4
5      O(deg(start)) times {
6          O(1) {
7              O(1)
8
9              O(1) {
10                 O(1)
11                 DFSOne(graph, otherVertex);
12             } else {
13                 O(1)
14             }
15         }
16     }
17 }
```

# Depth First Search (DFS)

What's the runtime of DFS **excluding recursive calls**?

# Depth First Search (DFS)

What's the runtime of DFS **excluding recursive calls**?

$$O(\text{deg}(\text{start}))$$

# Depth First Search (DFS)

What's the sum over all calls to  $\text{DFS}(n)$

# Depth First Search (DFS)

What's the sum over all calls to DFSOne

$$\sum_{v \in V} O(\deg(v))$$

# Depth First Search (DFS)

What's the sum over all calls to DFS on  $e$

$$\begin{aligned} & \sum_{v \in V} O(\deg(v)) \\ &= O\left(\sum_{v \in V} \deg(v)\right) \end{aligned}$$

# Depth First Search (DFS)

What's the sum over all calls to DFSOne

$$\begin{aligned} & \sum_{v \in V} O(\text{deg}(v)) \\ &= O\left(\sum_{v \in V} \text{deg}(v)\right) \\ &= O(2M) = O(M) \end{aligned}$$

# To summarize...

Mark Vertices UNVISITED

Mark Edges UNVISITED

DFS Vertex Loop

All calls to DFSOne

# To summarize...

Mark Vertices UNVISITED  $O(N)$   
Mark Edges UNVISITED  
DFS Vertex Loop  
All calls to DFSOne

# To summarize...

Mark Vertices UNVISITED  $O(N)$   
Mark Edges UNVISITED  $O(M)$   
DFS Vertex Loop  
All calls to DFSOne

# To summarize...

Mark Vertices UNVISITED	$O(N)$
Mark Edges UNVISITED	$O(M)$
DFS Vertex Loop	$O(N)$
All calls to DFSone	

# To summarize...

Mark Vertices UNVISITED	$O(N)$
Mark Edges UNVISITED	$O(M)$
DFS Vertex Loop	$O(N)$
All calls to DFSone	$O(M)$

# To summarize...

Mark Vertices UNVISITED  $O(N)$

Mark Edges UNVISITED  $O(M)$

DFS Vertex Loop  $O(N)$

All calls to DFSOne  $O(M)$

---

$O(N + M)$