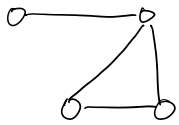


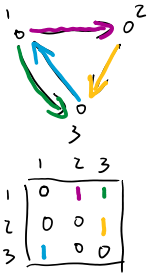
A Graph is a collection of vertices and edges  
nodes arcs



$$G = (V, E)$$

On computer we typically use

- "adjacency lists"  
every vertex has a list of neighbors  
adjacency[v] array that contains lists  
- uses  $O(|E|)$  space

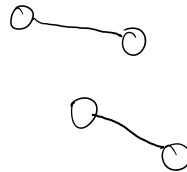


- "adjacency matrix"  
table that for every pair of vertices says if there is an edge connecting them or not  
- uses  $O(|V|^2)$  space

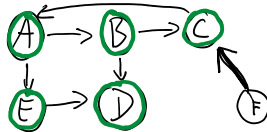
"simple graph" graph without duplicate edges

$$\frac{|V|}{2} \leq |E| \leq |V|^2$$

otherwise we have vertices that do not connect to anything  
"isolated vertices"



DFS Depth First Search



```
DFS(v)
  visited[v] = true
  for (v,u) in E
    if not visited[u]
      DFS(u)
```

```
DFS(A)
  L DFS(B)
    L DFS(C)
      L DFS(D)
        L DFS(E)
```

```
for v in V
  if not visited[v]
    DFS(v)
```

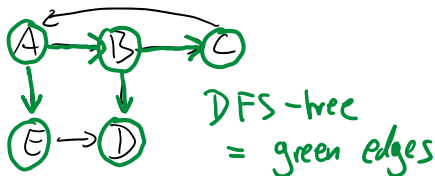
after calling DFS(v) then visited contains all vertices that can be reached from v.

time complexity:  $O(|E|)$  because every vertex and edge is visited at most once.

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

DFS-tree ← set of edges used to visit each vertex for the first time

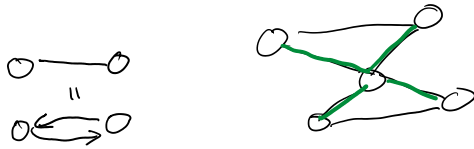
```
T = {}
DFS(v)
  visited[v] = true
  for (v,u) in E
    if not visited[u]
      T = T ∪ {(v,u)}
```



DFS-tree = green edges

for  $(v, u) \in E$   
 if not visited  $[u]$   
 $T = T \cup \{(v, u)\}$   
 DFS  $(u)$

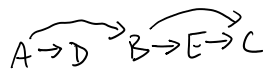
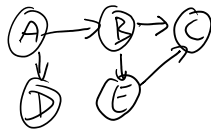
Def: For undirected graph  
 a spanning tree is  
 - a tree (no cycles)  
 - connects entire graph



Q: Find cycles  
 Q: Topological order

Def: Topological Order of graph  $G$   
 Ordering of the vertices  
 such that all edges go left to right

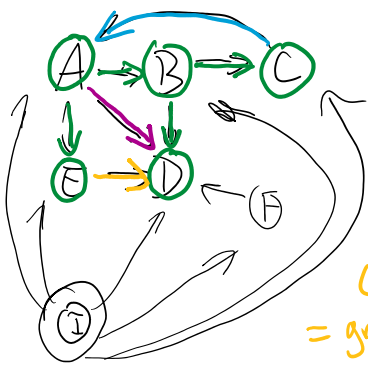
post counter = 0  
 pre counter = 0  
 DFS  $(v)$   
 visited  $[v] = true$   
 pre counter += 1  
 pre order  $[v] = pre counter$   
 for  $(v, u) \in E$   
 if not visited  $[u]$   
 DFS  $(u)$   
 post counter += 1  
 post order  $[v] = post counter$



$\exists$  cycle  $\Rightarrow \nexists$  order  
 $\nexists$  cycle  $\Rightarrow \exists$  order

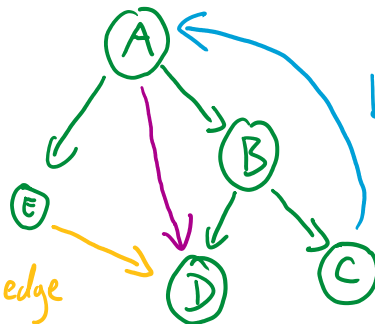
Preorder = order in which DFS visits vertices  
 Postorder = order in which DFS is "done" with vertices

Post order = reverse of topological order



Crossing edge  
 = green path goes up and down

= postorder  $(E) >$  postorder  $(D)$   
 preorder  $(E) >$  preorder  $(D)$



back edge

= green path goes up

= preorder  $(A) <$  preorder  $(C)$   
 and postorder  $(C) <$  postorder of  $(A)$

forward edge

= green path goes down

= postorder  $(D) <$  postorder  $(A)$   
 preorder  $(D) >$  preorder  $(A)$

$$\begin{aligned}
 & \text{preorder}(E) > \text{preorder}(D) = \text{postorder}(D) < \text{postorder}(E) \\
 & \text{preorder}(D) > \text{preorder}(A)
 \end{aligned}$$

$$(u, v) \begin{cases} \text{forward} : \text{pre } u < \text{pre } v & \text{post } u > \text{post } v \\ \text{back} : \text{pre } u > \text{pre } v & \text{post } u < \text{post } v \\ \text{crossing} : \text{pre } u > \text{pre } v & \text{post } u > \text{post } v \end{cases}$$

DFS (v)

queue.add(w)

while queue not empty

v = queue.pop()

if visited[v]

continue

visited[v] = true

for (v, u) ∈ E

queue.add(u)

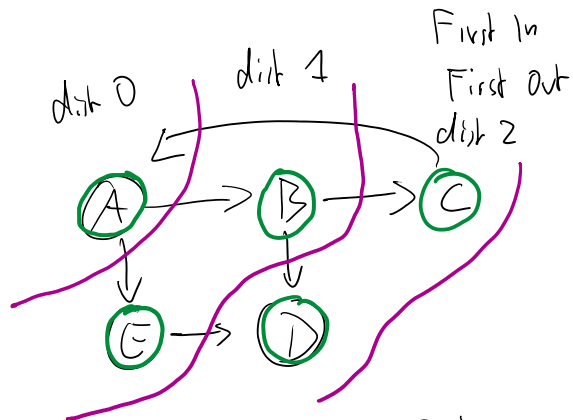
queue is FILO (stack)

First In Last Out

DFS

If we use a FIFO then this is

BFS



Queue: ~~A~~ ~~B~~ ~~E~~ ~~C~~ ~~D~~

BFS visits in order of distance

DFS BFS  $O(|E|)$