

Graphs 1: Strongly Connected Components

Graph Algorithms

1. Outline
 - Review
 - Directed Graphs: SCC's
 - Application: 2-SAT
 - MST
 - PageRank

Outline

1. Connected components via DFS-based algorithms
 - Depth-first search
 - Undirected graphs
 - Directed graphs
 - DAG: Directed acyclic graph
 - * Topological sorting
 - SCC: Strongly connected components
 - * Find with 2 DFS's

Undirected Graphs

1. How do we get connected components in undirected G?
 - Run DFS and keep track of component number

```
DFS(G):
input: G(V,E) in adjacency list representation
output: Vertices labeled by connected components
cc = 0
for all v in V:
    visited(v) = false
for all v in V:
    if not visited(v):
        cc++
        Explore(v)
```

Exploring Undirected Graphs

1. How to explore a graph:
2. Running time: $O(n+m)$
 - $n = |V|$, $m = |E|$

```
Explore(z):
ccnum(z) = cc
visited(z) = true
for all (z,w) in E:
    if not visited(w):
        Explore(e)
```

DFS: Paths

1. DFS: connected components
 - How to find a path between connected vertices?

```

DFS(G):
input: G(V,E) in adjacency list representation
output: Vertices labeled by connected components
cc = 0
for all v in V:
    visited(v) = false
    prev(v) = null
for all v in V:
    if not visited(v):
        cc++
        Explore(v)

Explore(z):
ccnum(z) = cc
visited(z) = true
for all (z,w) in E:
    if not visited(w):
        Explore(w)
    prev(w) = z

```

DFS on Directed Graphs

1. How do we get connectivity info for directed G?
 - Use DFS: add pre/postorder numbers

```

DFS(G):
input: G(V,E) in adjacency list representation
output: Vertices labeled by connected components
clock = 1
for all v in V:
    visited(v) = false
    prev(v) = null
for all v in V:
    if not visited(v):
        Explore(v)

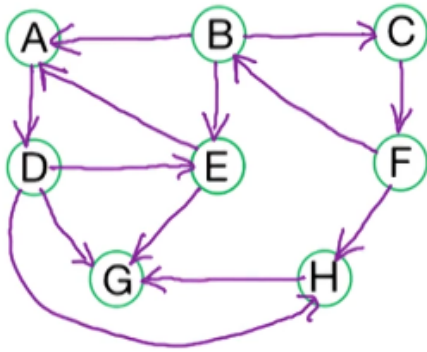
Explore(z):
pre(z) = clock; clock++;
visited(z) = true
for all (z,w) in E:
    if not visited(w):
        Explore(w)
    prev(w) = z
post(z) = clock; clock++;

```

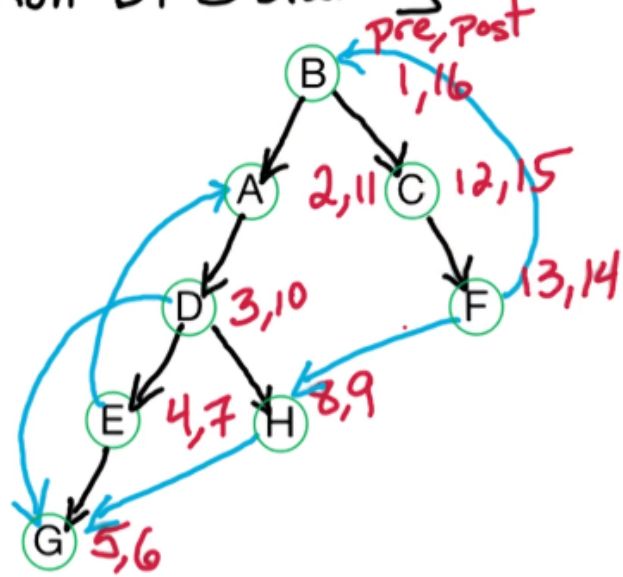
Directed DFS: Example

1. Run DFS starting at B
 - Assume linked lists are stored in alphabetical order

Example of directed DFS



Run DFS starting at B



DFS Example

Types of Edges

1. Edge $z \rightarrow w$:
 - Tree edge:
 - $B \rightarrow A, A \rightarrow D, \dots$
 - $\text{post}(z) > \text{post}(w)$
 - Back:
 - $E \rightarrow A, F \rightarrow B$
 - $\text{post}(z) < \text{post}(w)$
 - Forward:
 - $D \rightarrow G, B \rightarrow E$
 - $\text{post}(z) > \text{post}(w)$
 - Cross:
 - $F \rightarrow H, H \rightarrow G$
 - $\text{post}(z) > \text{post}(w)$

Cycles

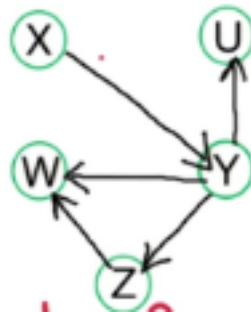
1. G has a cycle iff its DFS tree has a back edge
2. Proof:
 - cycle $a \rightarrow b \rightarrow c \rightarrow \dots \rightarrow j \rightarrow a$
 - Suppose our graph has a cycle, prove that the DFS tree has a back edge
 - One of these is first explored, say i
 - * Back edge: $i-1 \rightarrow i$ (from descendant to ancestor)
 - Suppose our DFS tree has a back edge, prove the tree contains a cycle
 - Back edge $a \rightarrow b$

Topological Sorting

1. DAG: Directed acyclic graph
 - No cycles = No back edges
2. Topologically sorting a DAG
 - Order vertices so that all edges go lower \rightarrow higher
3. Run DFS on DAG G
 - for all $z \rightarrow w$, we know $\text{post}(z) > \text{post}(w)$
 - Order vertices by decreasing post-order number
 - Post-order numbers range from 1 to $2n$
 - Linear time sorting because we can just place them at their index in an array
 - Overall runtime: $O(n+m)$

Topological Ordering Quiz

1. Give all topological orderings:
 - XYUZW
 - XYZWU
 - XYZUW
 - Z must come before W
2. How many topological orderings are there?



Topological Ordering Quiz

DAG Structure

1. Source vertex = no incoming edges = highest post-order number
2. Sink vertex = no outgoing edges = lowest post-order number
3. DAG guarantees at least one source and one sink
4. Alternative topological sorting algorithm:
 - Use for general directed graphs
 - 1) Find a sink, output it and delete it
 - 2) Repeat (1) until the graph is empty

Outline Review

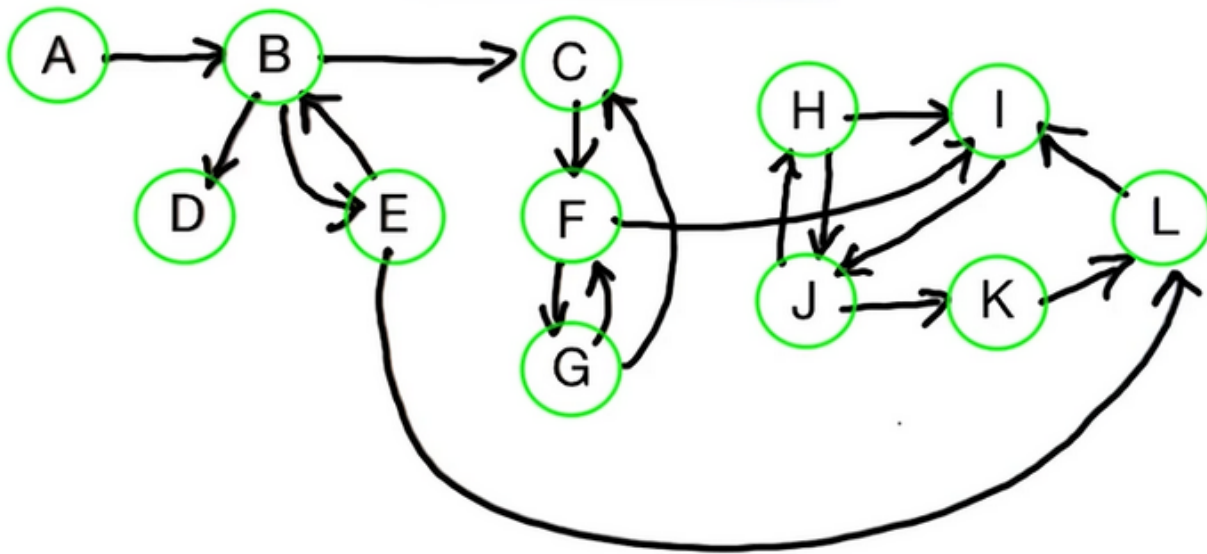
1. Connected components via DFS-based algorithms
 - Undirected graphs
 - Directed graphs
 - DAG = directed acyclic graph
 - * Topological sorting
 - SCC = strongly connected components
 - * Find with 2 DFS's

Connectivity in Directed Graphs

1. Vertices v and w are strongly connected if:
 - There is a path $v \rightarrow w$ and $w \rightarrow v$
2. SCC = Strongly connected component
 - Maximal set of strongly connected vertices

SCC Quiz

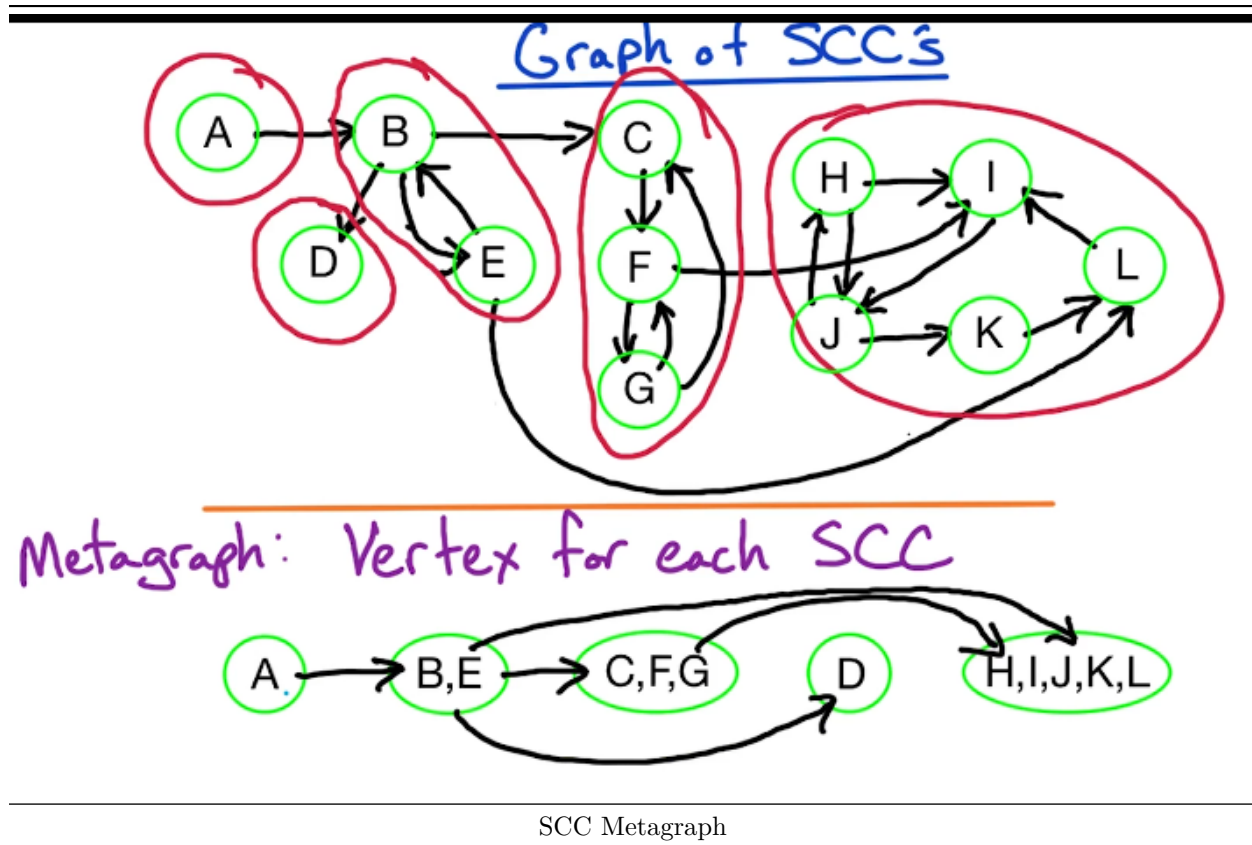
1. How many SCCs in this graph?
 - 5
2. What are they?
 - $\{A\}$
 - $\{B, E\}$
 - $\{C, F, G\}$
 - $\{D\}$
 - $\{H, I, J, K, L\}$



SCC Quiz

Graph of SCC

1. Metagraph: Vertex for each SCC
 - Metagraph of SCC is always a DAG
 - Two SCCs that have a cycle are, by definition, a single SCC
2. Every directed graph is a DAG of its SCC's
 - Find SCCs and topological ordering with two runs of DFS



SCC Algorithm Idea

1. Steps to the algorithm
 - Find sink SCC S
 - Output it
 - Remove it
 - Repeat
2. Why sink SCC?
 - Take any v in S where S is sink SCC
 - Run Explore(v): visit all of S and nothing else
 - If we start with a source, like we could for a topological sort, we'll find that we can reach many vertices
3. How do we find a sink SCC?

Vertex in sink SCC

1. In a DAG:
 - Vertex with lowest postorder number is a sink
2. In a general directed G:
 - Does v with lowest postorder number always lie in a sink SCC?
 - No
 - $B \leftrightarrow A \rightarrow C$
 - * Start at A
 - * $A = (1,6)$
 - * $B = (2,3)$
 - * $C = (4,5)$

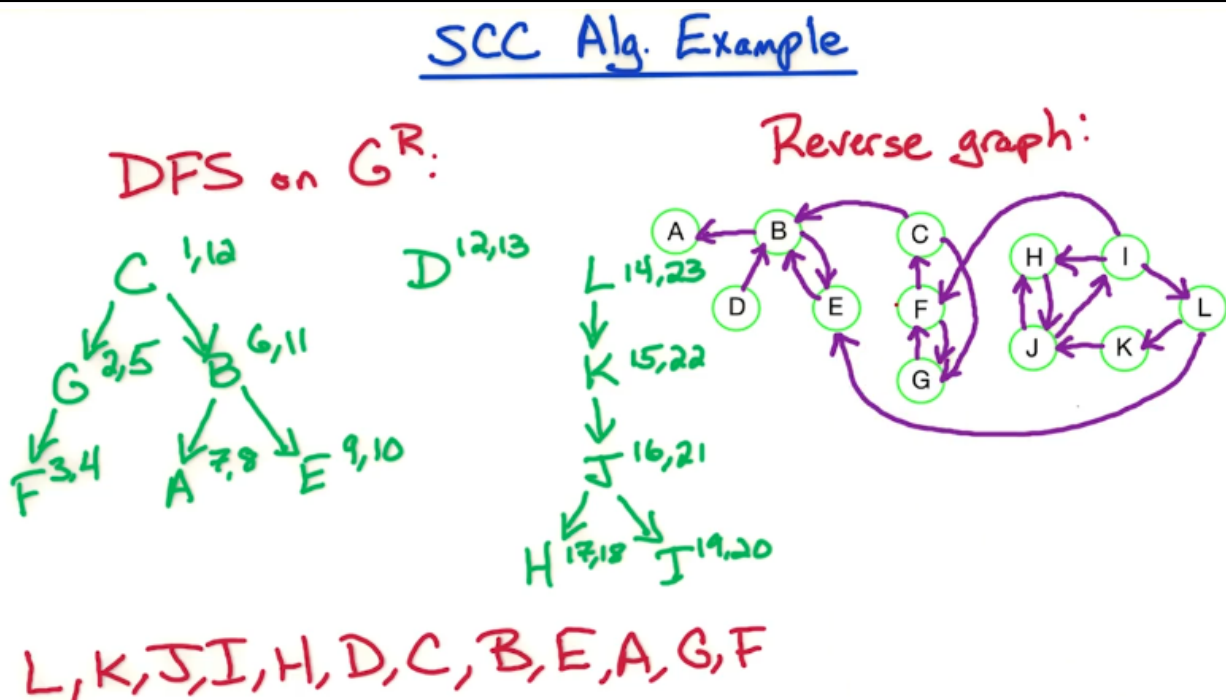
- * B has the lowest postorder number, but is part of a source SCC
- Does v with highest postorder number always lie in a source SCC?
 - Yes

Finding sink SCC

1. Vertex v with highest postorder number lies in a source SCC
 - How to get w in sink SCC?
 - Reverse the graph and find a source SCC
 - * Sources become sinks, sinks become sources
 - For directed $G = (V, E)$, look at $G^R = (V, E^R) = \text{reverse of } G$
 - $E^R = \{wv : vw \in E\} = \text{reverse of every edge in } E$
 - Source SCC in $G = \text{sink SCC in } G^R$
 - Sink SCC in $G = \text{source SCC in } G^R$

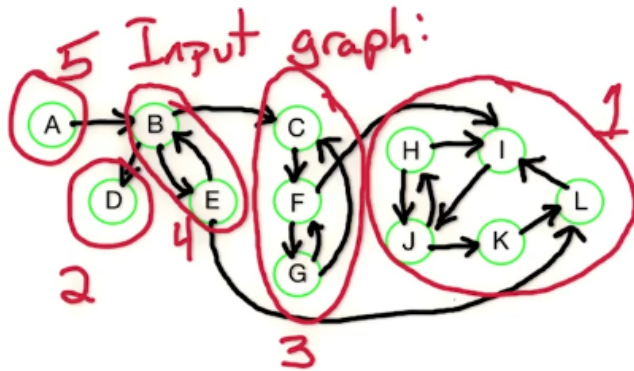
SCC Example

1. Sort the vertices by postorder number on the reverse graph in decreasing order
 - Two runs of DFS provide the strongly connected components and structure them in topological order



SCC Algorithm

SCC Alg. Example



1 1 1 1 1 2 3 4 4 5 3 3
~~1~~, ~~1~~, ~~1~~, ~~1~~, ~~1~~, ~~2~~, ~~3~~, ~~4~~, ~~4~~, ~~5~~, ~~3~~, ~~3~~

SCC Algorithm

SCC Algorithm

1. Runtime: $O(n+m)$

SCC(G):

input: directed $G = (V, E)$ in adjacency list
Construct G_r
Run DFS on G_r
Order V by decreasing postorder number
Run undirected connected components algorithm on G

Proof of Key SCC Fact

1. Vertex with highest postorder number lies in a source SCC
 - Simpler claim:
 - For SCC's S and S'
 - * if v in $S \rightarrow w$ in S'
 - * then max postorder number in $S > \max$ postorder number in S'
 - Topologically sort by max postorder number

Simpler Claim

1. For SCC's S and S'
 - if v in $S \rightarrow w$ in S'
 - then max postorder number in $S > \max$ postorder number in S'
 - No path from $S' \rightarrow S$ because S and S' are both SCCs
2. Run DFS on G
 - Some vertex z in $S \cup S'$ visited first

- if z in S' :
 - * when we Explore(z) we see all of S' and none of S
 - * All postorder numbers in $S' < \text{all min(postorder numbers in } S)$
- if z in S :
 - * when we Explore(z), z has max postorder number in $S \cup S'$
 - * We will traverse the whole tree and finish at z

BFS/Dijkstra's

1. DFS: Connectivity
2. BFS:
 - Input: $G(V,E)$ and start vertex s in V
 - Output: for all v in V , $\text{dist}(v) = \text{min number of edges from } s \text{ to } v$
 - Also, $\text{prev}(v)$
 - Runtime: $O(n+m)$
3. Dijkstra's:
 - Input: $G(V,E)$ and start vertex s in V , $l(e) > 0$ for every e in E
 - Output: for all v in V , $\text{dist}(v) = \text{length of shortest } s \rightarrow v \text{ path}$
 - Also, $\text{prev}(v)$
 - Runtime: $O((n+m)\log n)$
 - Like BFS, but considers weights for each edge
 - Uses a min-heap