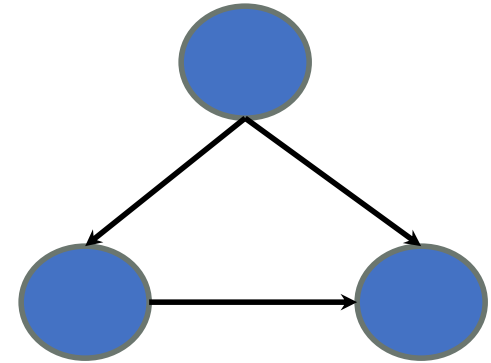
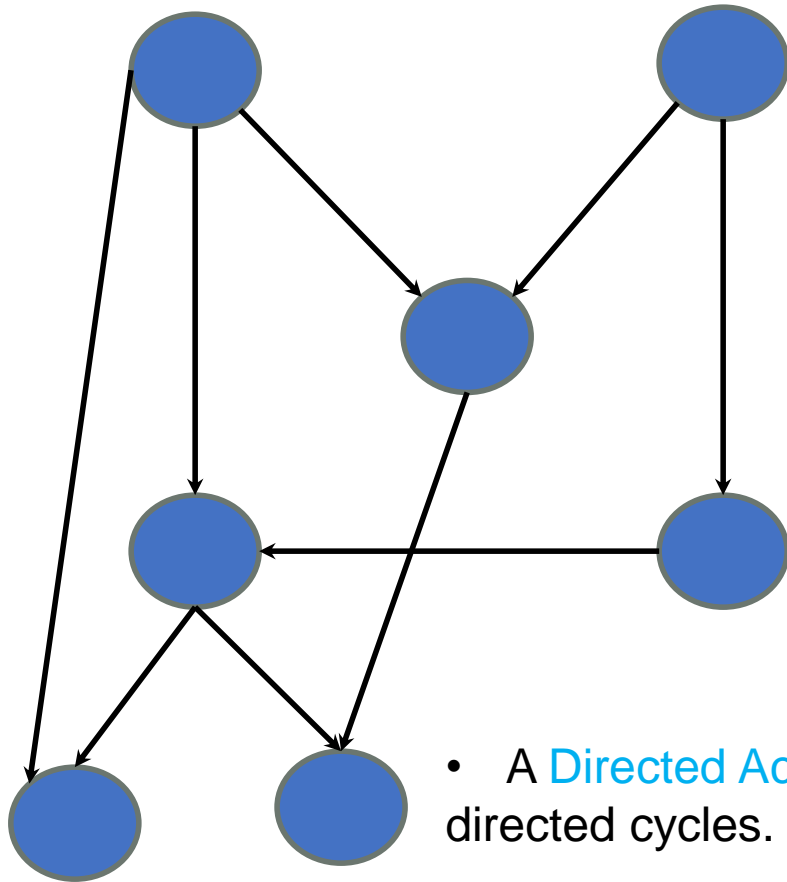


CSE 215: Data Structures and Algorithms II

Topological Sorting
Strongly Connected Components

Directed Acyclic Graph



- A **Directed Acyclic Graph** or **DAG** is a directed graph with no directed cycles.

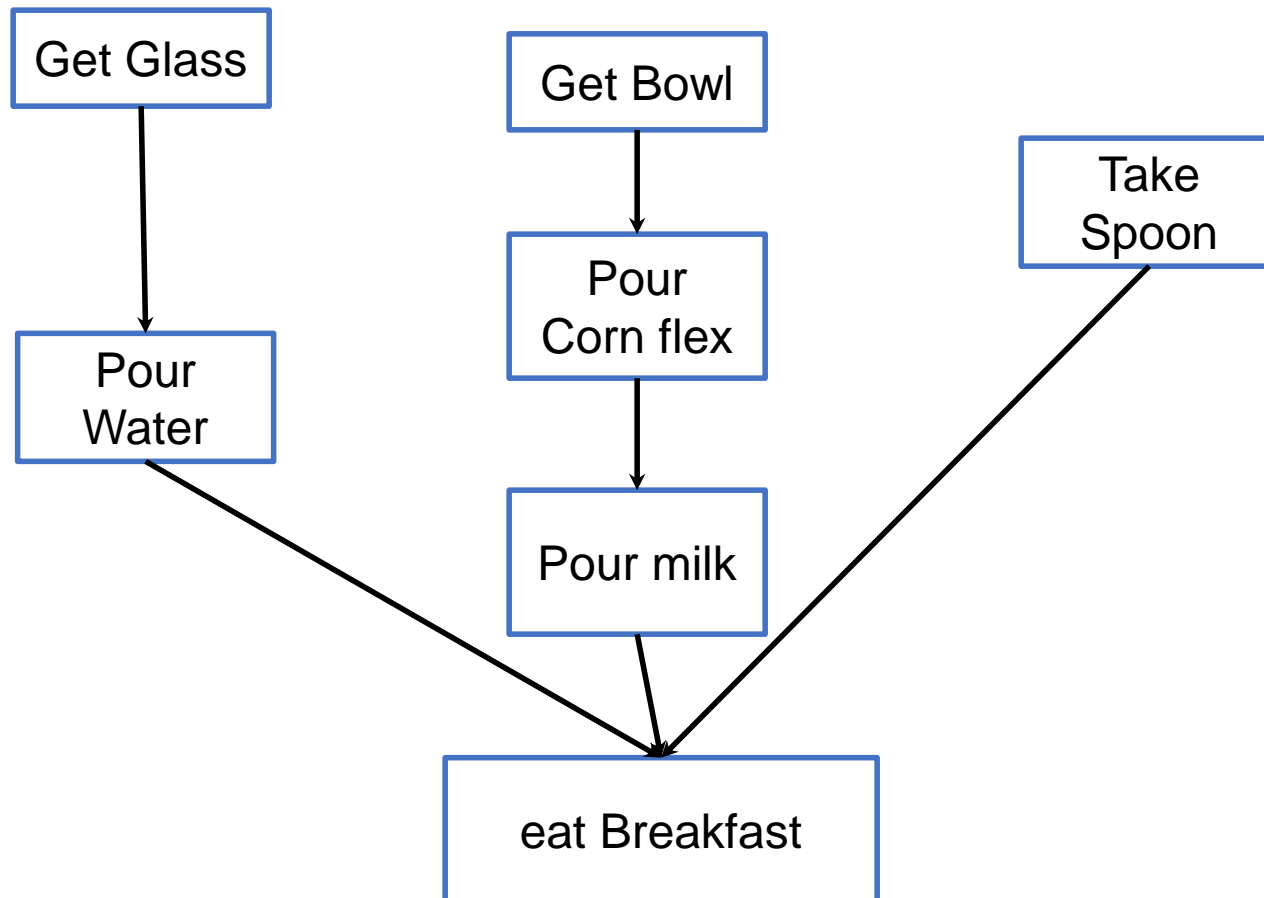
Topological Sort

- A *topological sort* of a **DAG** is
 - a linear ordering of all vertices of the graph G such that vertex u comes before vertex v if (u, v) is an edge in G .
- DAG indicates precedence among events:
 - events are graph vertices, edge from u to v means event u has precedence over event v
- Real-world example:
 - getting dressed
 - course registration
 - tasks for eating meal

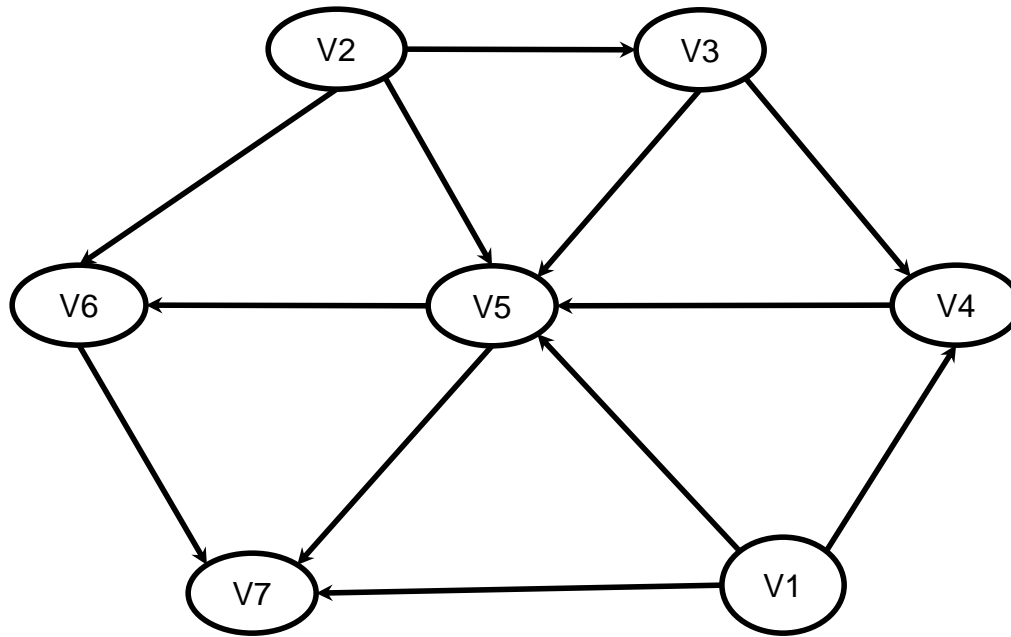
Precedence Example

- Tasks that have to be done to eat breakfast:
 - get glass, pour juice, get bowl, pour cereal, pour milk, get spoon, eat.
- Certain events must happen in a certain order (ex: get bowl before pouring milk)
- For other events, it doesn't matter (ex: get bowl and get spoon)

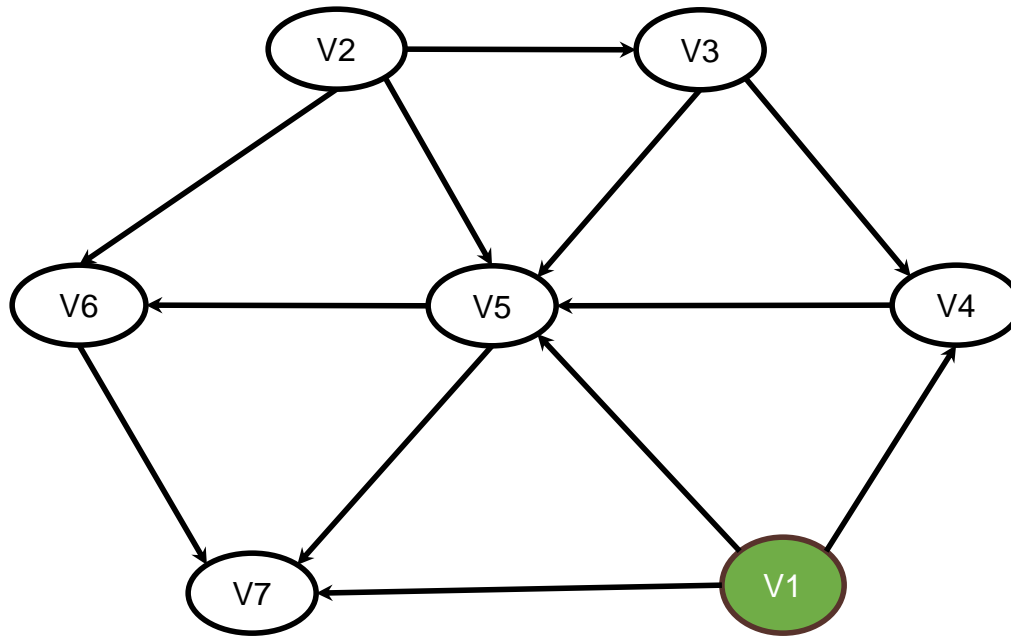
Precedence Example



Topological Sort: Using in-degree

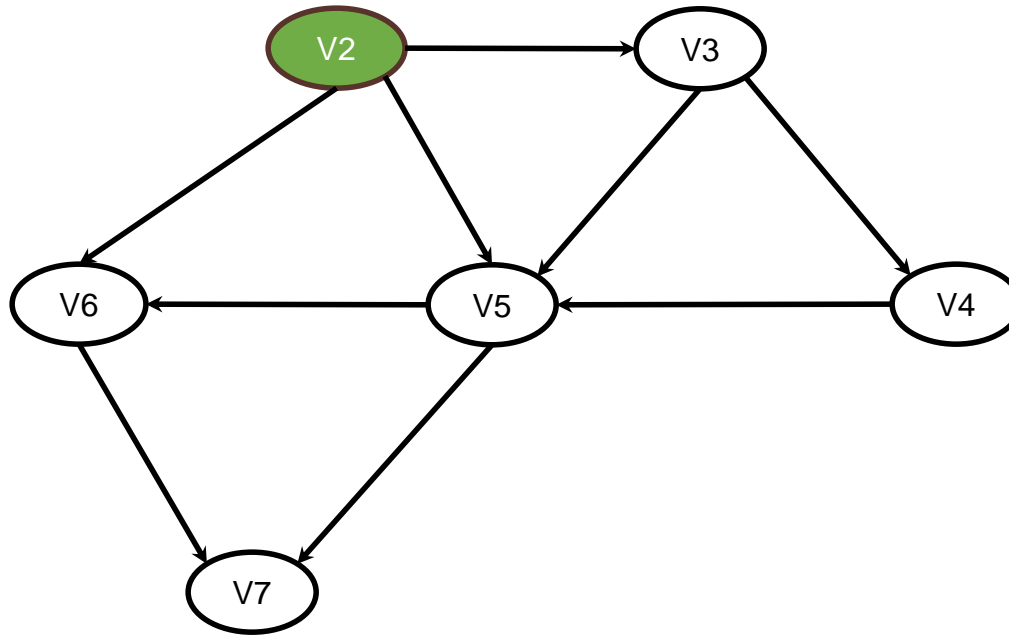


Topological Sort: Using in-degree



Delete the vertex whose in-degree 0. (v1 or v2)

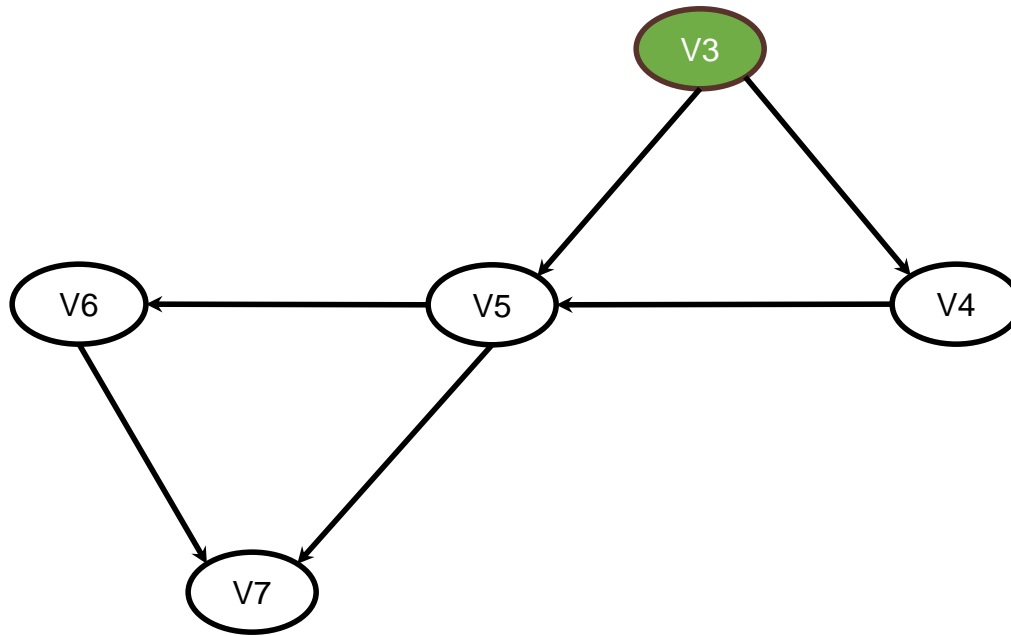
Topological Sort: Using in-degree



T: v1

Delete the vertex whose in-degree 0. (v2)

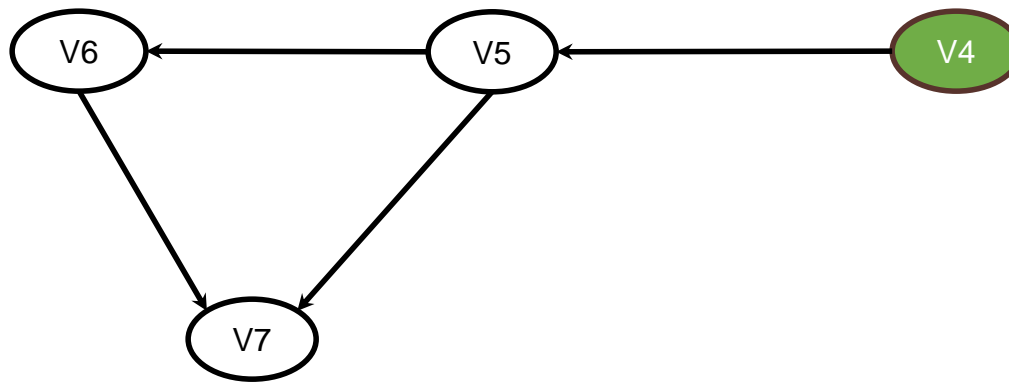
Topological Sort: Using in-degree



T: V1 V2

Delete the vertex whose in-degree 0. (v3)

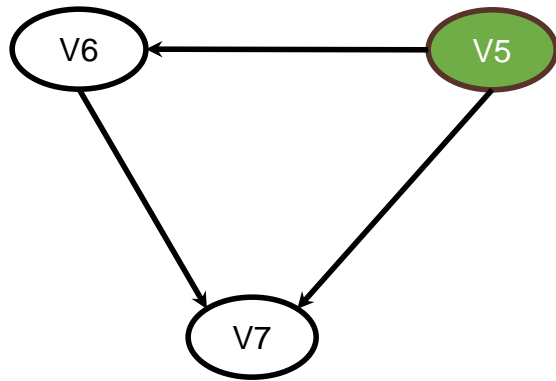
Topological Sort: Using in-degree



T: v1 v2 v3

Delete the vertex whose in-degree 0. (v4)

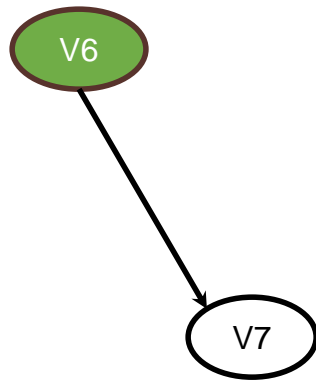
Topological Sort: Using in-degree



T: v1 v2 v3 v4

Delete the vertex whose in-degree 0. (v5)

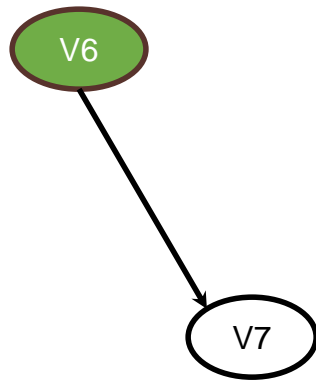
Topological Sort: Using in-degree



T: v1 v2 v3 v4 v5

Delete the vertex whose in-degree 0. (v6)

Topological Sort: Using in-degree



T: v1 v2 v3 v4 v5 v6

Delete the vertex whose in-degree 0. (v6)

Topological Sort: Using in-degree



T: v1 v2 v3 v4 v5 v6

Delete the vertex whose in-degree 0. (v7)

Topological Sort: Using in-degree

T: v1 v2 v3 v4 v5 v6 v7

Delete the vertex whose in-degree 0.

Topological Sort: Using in-degree

Steps for finding the topological ordering of a DAG:

Step-1: Compute in-degree for each of the vertices present in the DAG and initialize the count of visited nodes as 0;

Step-2: Add all **vertices with in-degree equals 0** into a queue

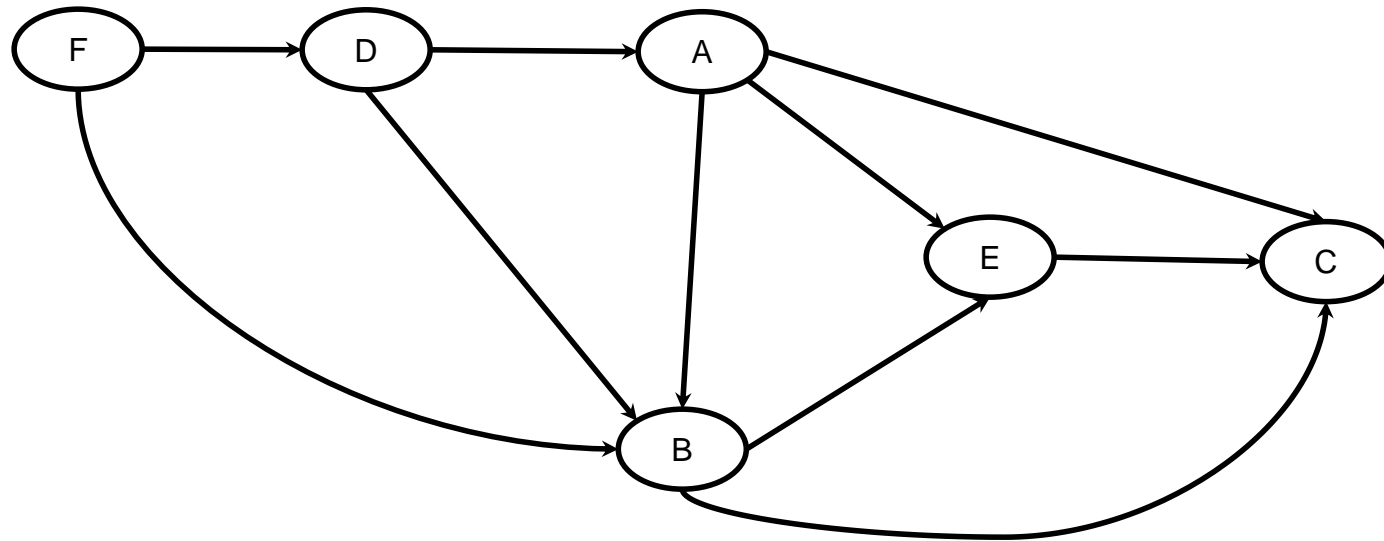
Step-3: Remove a vertex from the queue and then

- Increment count of visited nodes by 1;
- Decrease in-degree by 1 for all its neighboring nodes;
- If in-degree of a neighboring node is reduced to zero, then add it to the queue;

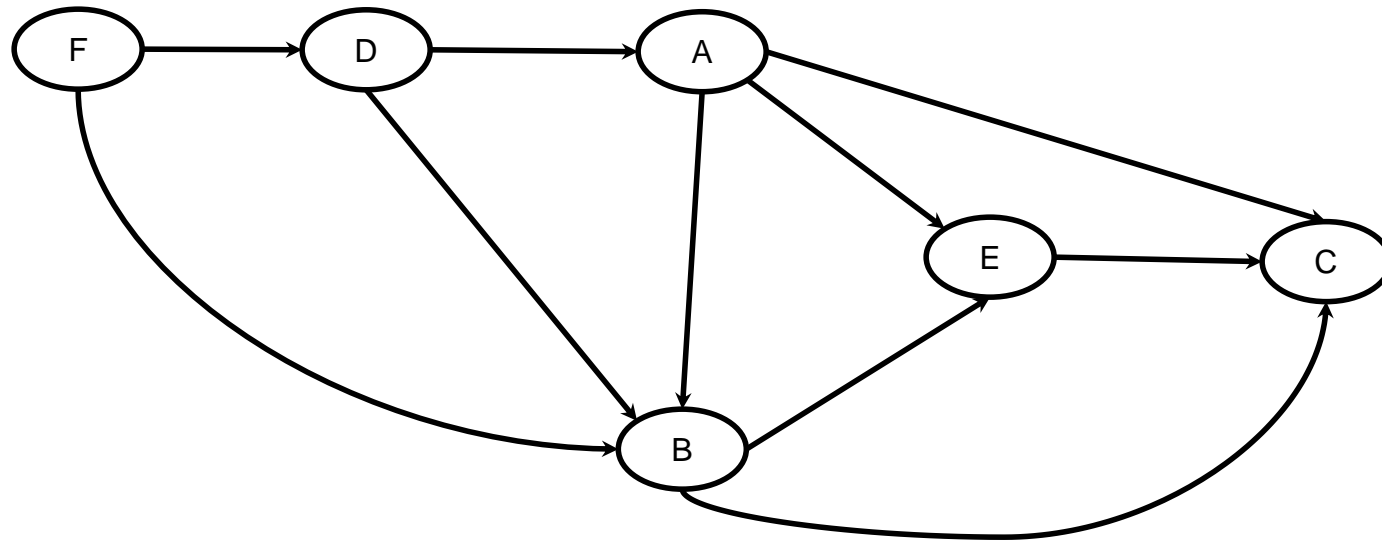
Step 4: Repeat Step 3 until **the queue is empty**;

Step 5: If count of visited nodes is **not** equal to the number of nodes in the graph then the topological sort is not possible for the given graph

Topological Sort



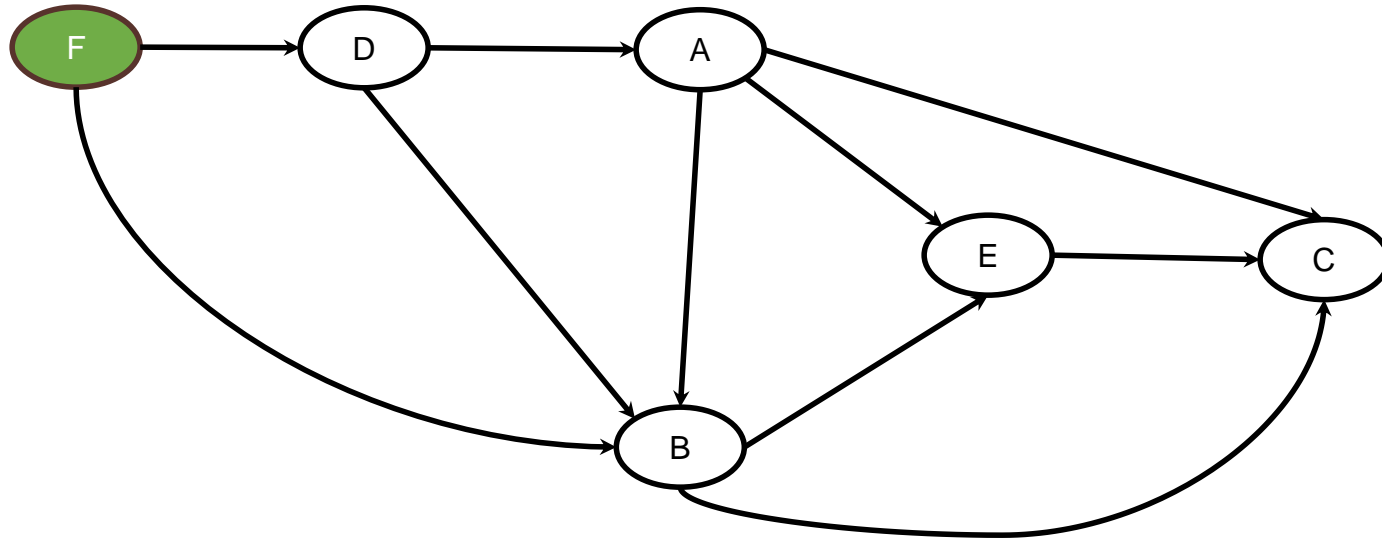
Topological Sort



In-degree

1	3	3	1	2	0
A	B	C	D	E	F

Topological Sort

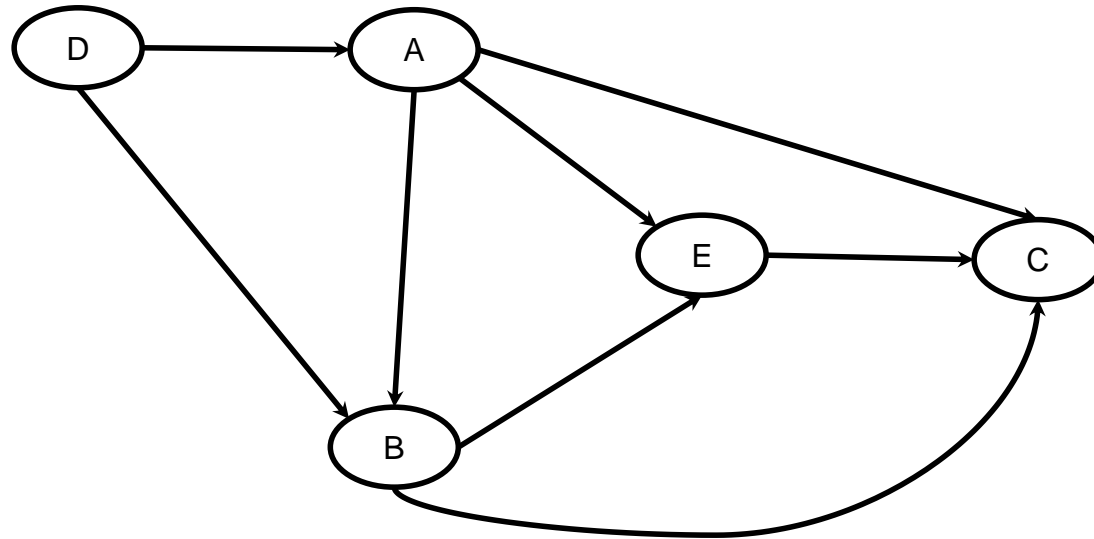


In-degree

1	3	3	1	2	0
A	B	C	D	E	F

Q: F

Topological Sort

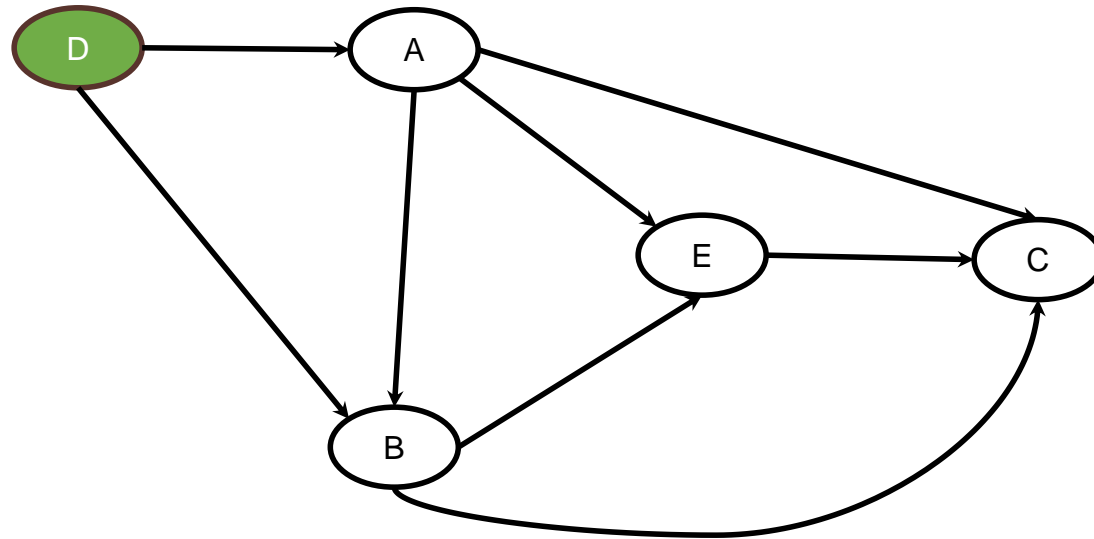


In-degree

1	2	3	0	2	0
A	B	C	D	E	F

Q: F

Topological Sort

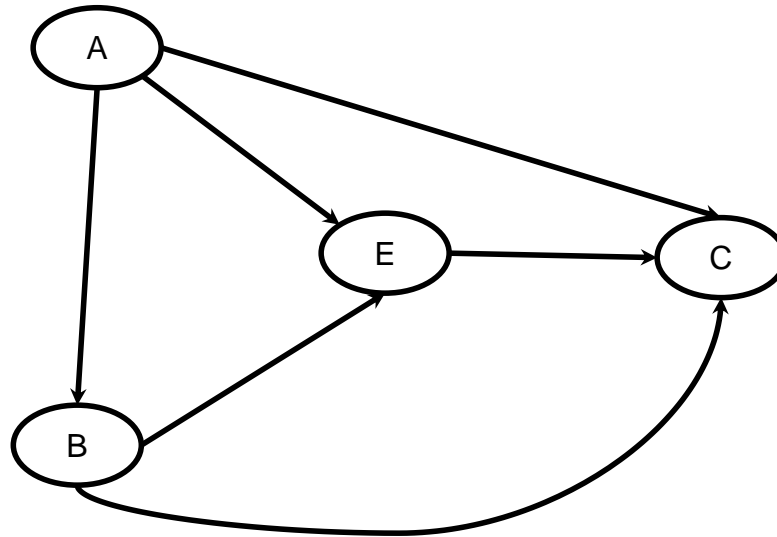


In-degree

1	2	3	0	2	0
A	B	C	D	E	F

Q: F D

Topological Sort

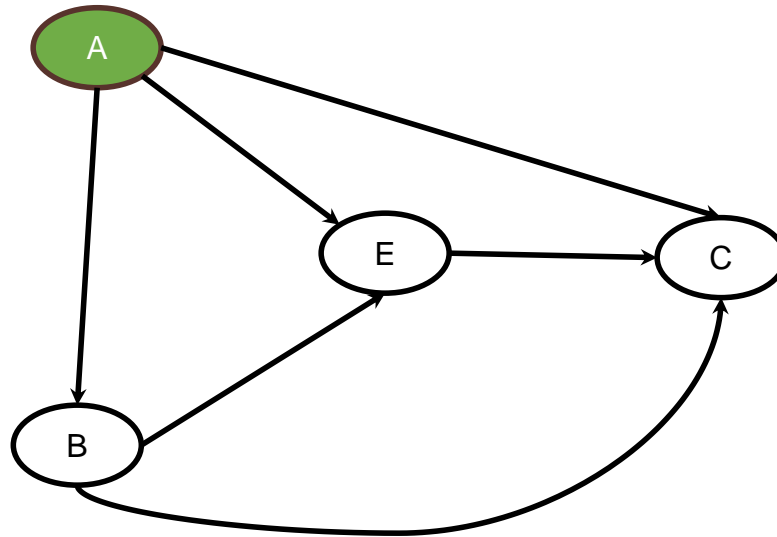


In-degree

0	1	3	0	2	0
A	B	C	D	E	F

Q: F D

Topological Sort

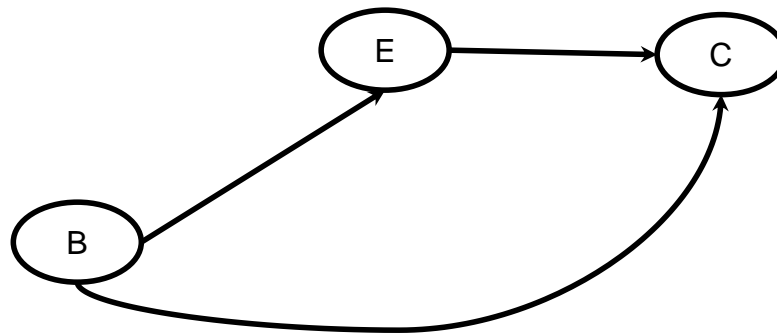


In-degree

0	1	3	0	2	0
A	B	C	D	E	F

Q: F D A

Topological Sort

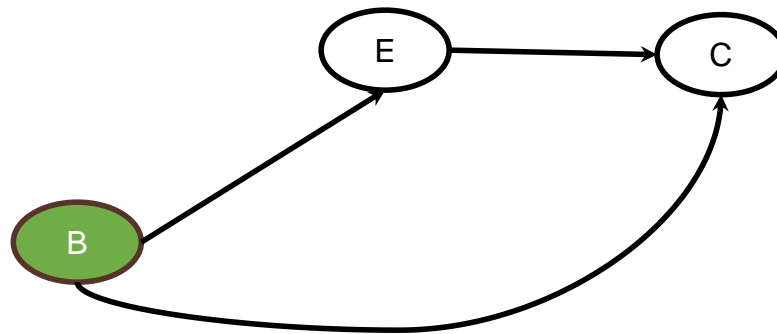


In-degree

0	0	2	0	1	0
A	B	C	D	E	F

Q: F D A

Topological Sort

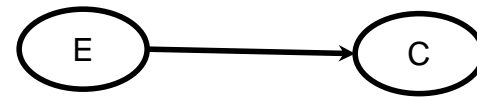


In-degree

0	0	2	0	1	0
A	B	C	D	E	F

Q: F D A B

Topological Sort

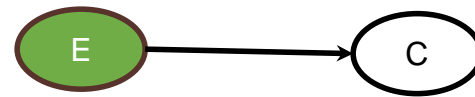


In-degree

0	0	1	0	0	0
A	B	C	D	E	F

Q: F D A B

Topological Sort

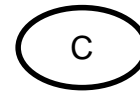


In-degree

0	0	1	0	0	0
A	B	C	D	E	F

Q: F D A B E

Topological Sort

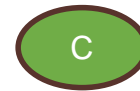


In-degree

0	0	0	0	0	0
A	B	C	D	E	F

Q: F D A B E

Topological Sort



In-degree

0	0	0	0	0	0
A	B	C	D	E	F

Q: F D A B E C

Topological Sort

In-degree

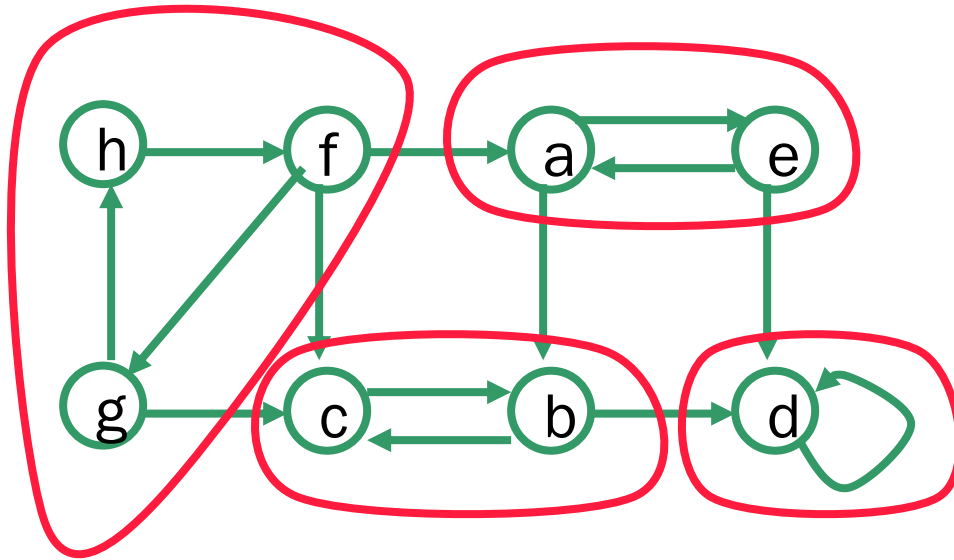
0	0	0	0	0	0
A	B	C	D	E	F

Q: F D A B E C

DFS Application: Strongly Connected Components

- Consider a **directed** graph G .
- A **strongly connected component (SCC)** of the graph G is a maximal set of vertices with a (directed) path between every pair of vertices
- Problem: Find all the SCCs of the graph.

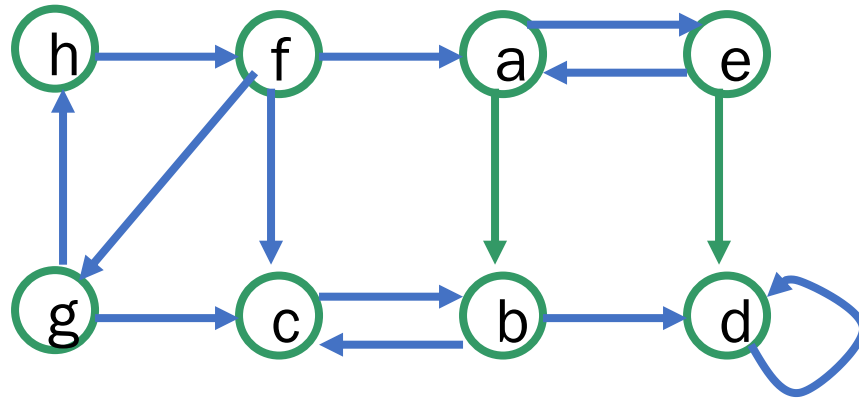
SCC Example



four SCCs

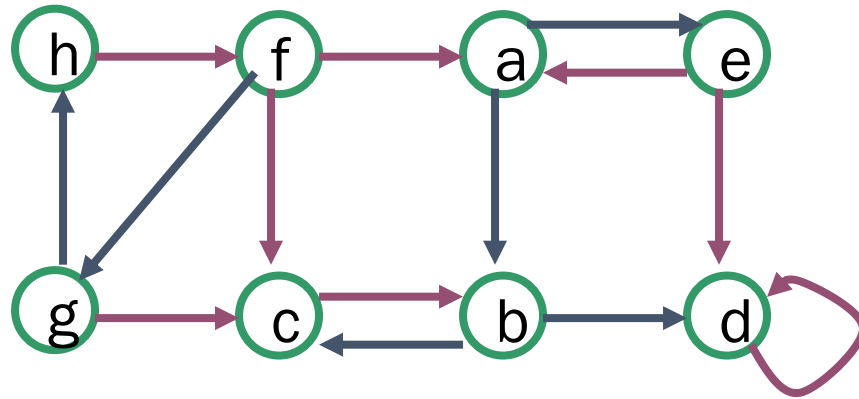
How Can DFS Help?

- Suppose we run DFS on the directed graph.
- All vertices in the same SCC are in the same DFS tree.
- But there might be several different SCCs in the same DFS tree.
 - Example: start DFS from the vertex *a* in the following graph



How Can DFS Help?

- Suppose we run DFS on the directed graph.
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- But there might be several different SCCs in the same DFS tree.
 - Example: start DFS from the vertex *a* in the following graph



Main Idea of SCC Algorithm

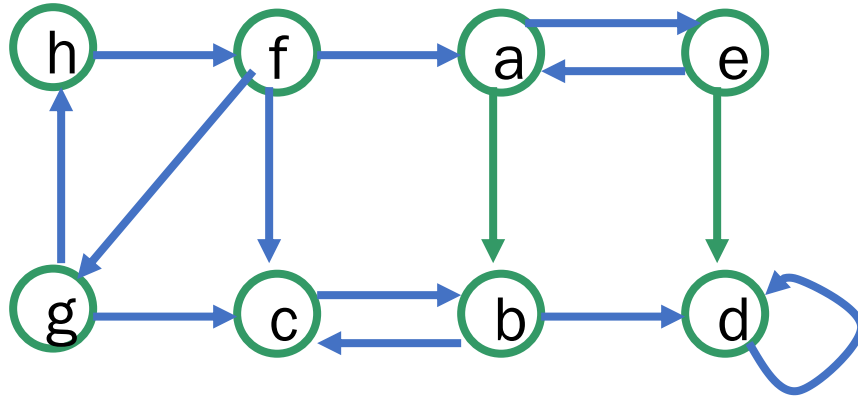
- DFS tells us which vertices are reachable from the roots of the individual trees
- Also need information in the "other direction": is the root reachable from its descendants?
- Run DFS again on the "transpose" graph (reverse the directions of the edges)

SCC Algorithm

input: directed graph $G = (V, E)$

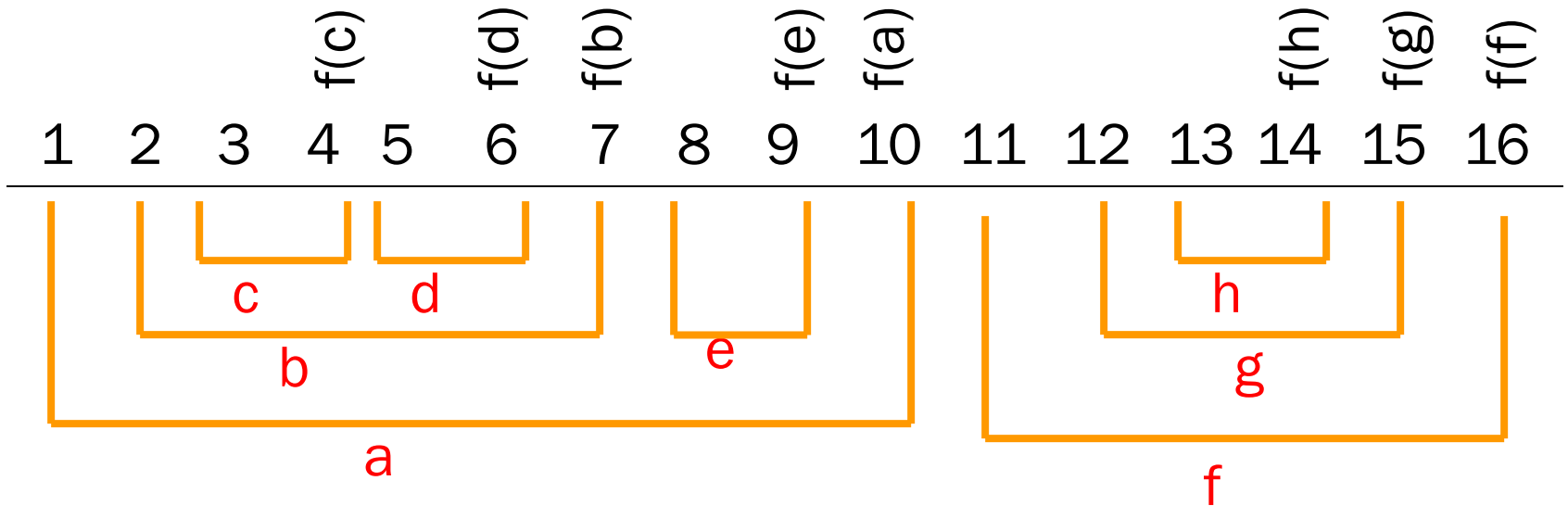
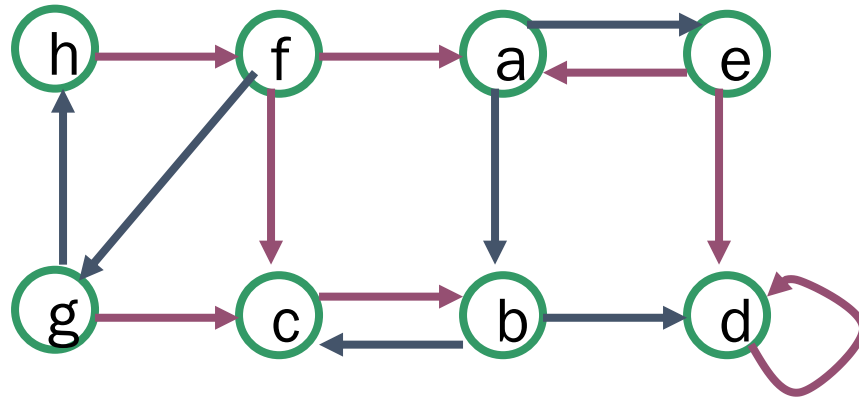
1. call DFS(G) to compute finishing times
2. compute G^T // transpose graph
3. call DFS(G^T), considering vertices in decreasing order of finishing times
4. each tree from Step 3 is a separate SCC of G

SCC Algorithm Example



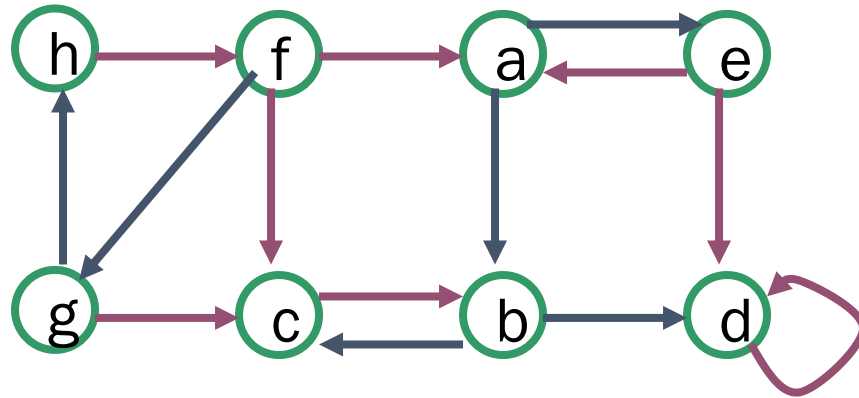
input graph - run DFS

SCC Algorithm Example: After Step 1

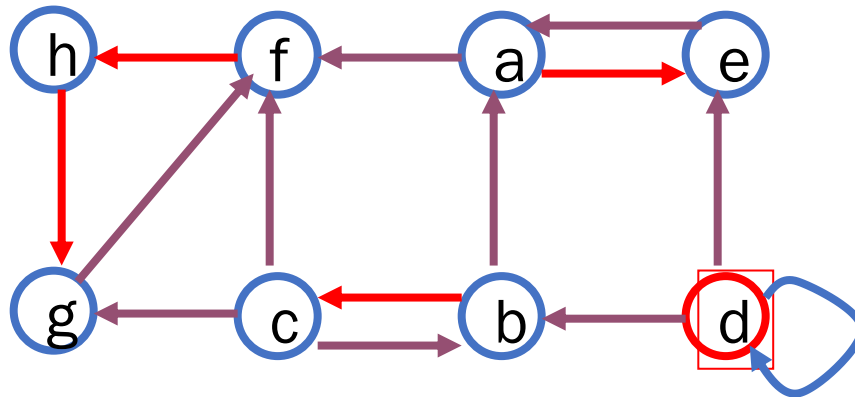


Order of vertices for Step 3: f, g, h, a, e, b, d, c

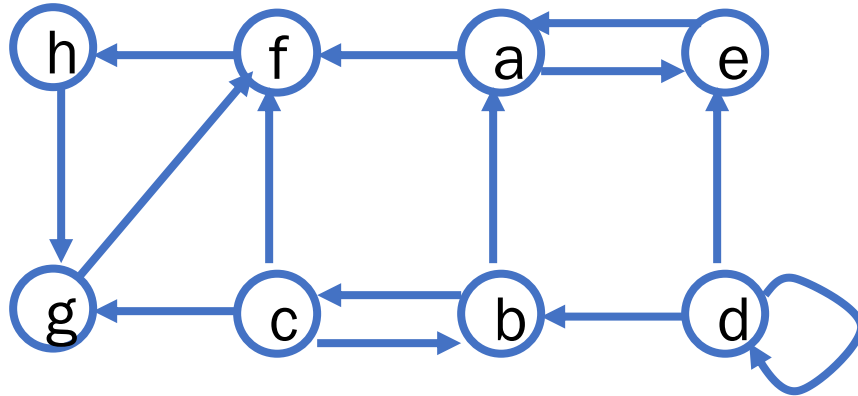
SCC Algorithm Example: After Step 1



Order of vertices for Step 3: f, g, h, a, e, b, d, c



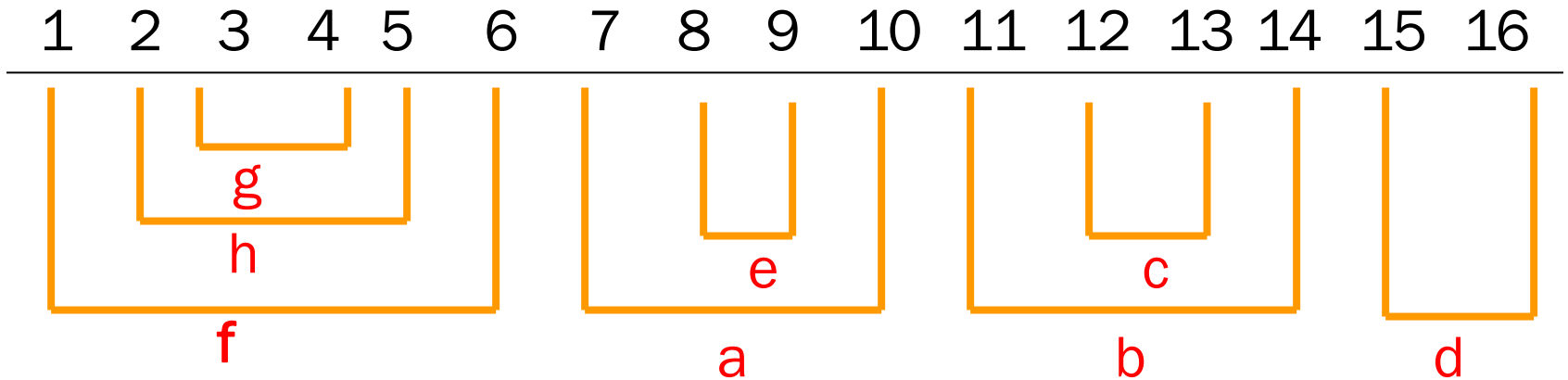
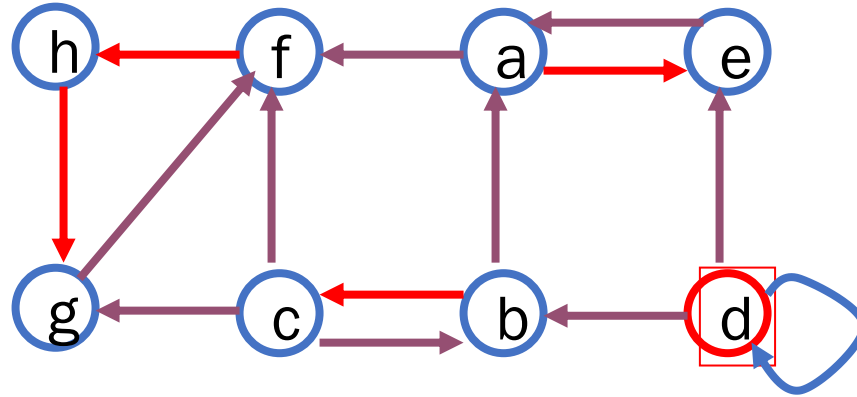
SCC Algorithm Example: After Step 2



transposed input graph - run DFS with specified order of vertices

SCC Algorithm Example: After Step 3

Order of vertices for Step 3: f, g, h, a, e, b, d, c



SCCs are {f,h,g}, {a,e}, {b,c}, and {d}

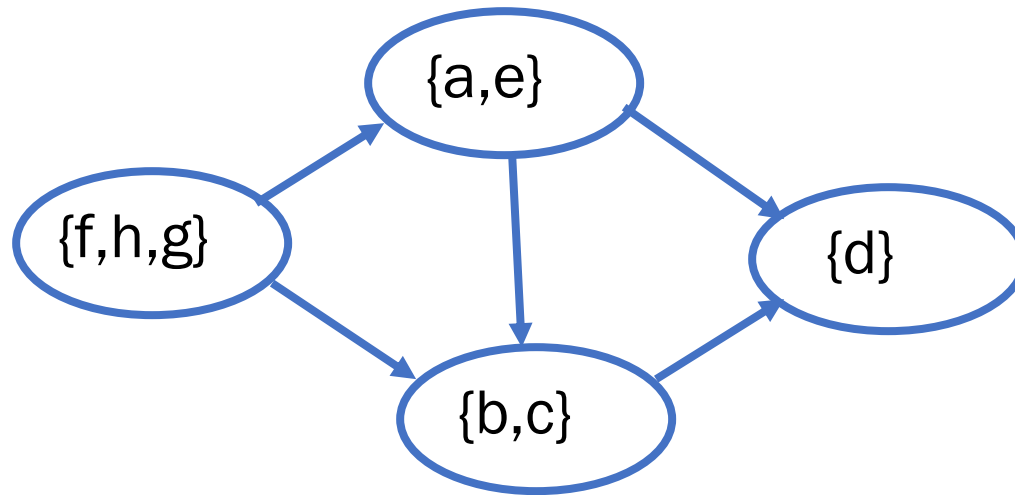
Running Time of SCC Algorithm

- Step 1: $O(V + E)$ to run DFS
- Step 2: $O(V + E)$ to construct transpose graph, assuming adjacency list rep.
- Step 3: $O(V + E)$ to run DFS again
- Step 4: $O(V)$ to output result
- Total: $O(V + E)$

Correctness of SCC Algorithm

- Proof uses concept of **component graph** G^{SCC} , of G .
- Vertices are the SCCs of G ; call them C_1, C_2, \dots, C_k
- Put an edge from C_i to C_j iff G has an edge from a vertex in C_i to a vertex in C_j

Example of Component Graph



based on example graph from before

Facts About Component Graph

- **Claim:** G^{SCC} is a directed acyclic graph.
- Why?
- Suppose there is a cycle in G^{SCC} such that component C_i is reachable from component C_j and vice versa.
- Then C_i and C_j would not be separate SCCs.

Facts About Component Graph

- Consider any component C during Step 1 (running DFS on G)
- Let $d(C)$ be *earliest* discovery time of any vertex in C
- Let $f(C)$ be *latest* finishing time of any vertex in C
- **Lemma:** If there is an edge in G^{SCC} from component C' to component C , then

$$f(C') > f(C).$$

Proof of Lemma



- **Case 1:** $d(C') < d(C)$.
- Suppose x is first vertex discovered in C' .
- By the way DFS works, all vertices in C' and C become descendants of x .
- Then x is last vertex in C' to finish and finishes after all vertices in C .
- Thus $f(C') > f(C)$.

Proof of Lemma



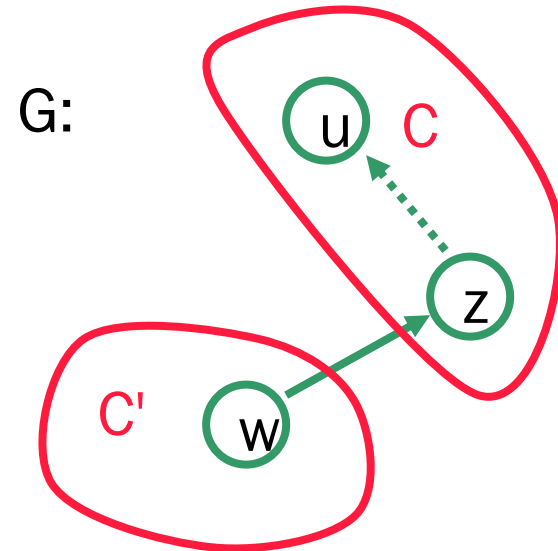
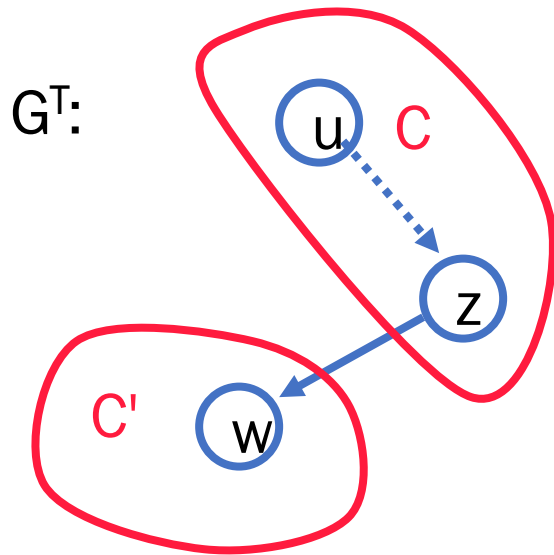
- **Case 2:** $d(C') > d(C)$.
- Suppose y is first vertex discovered in C .
- By the way DFS works, all vertices in C become descendants of y .
- Then y is last vertex in C to finish.
- Since $C' \rightarrow C$, no vertex in C' is reachable from y , so y finishes before any vertex in C' is discovered.
- Thus $f(C') > f(C)$.

SCC Algorithm is Correct

- Prove this theorem by induction on number of trees found in Step 3 (running DFS on G^T).
- Hypothesis is that the first k trees found constitute k SCCs of G .
- **Basis:** $k = 0$. No work to do !
- **Induction:** Assume the first k trees constructed in Step 3 (running DFS on G^T) correspond to k SCCs; consider the $(k+1)$ st tree.
- Let u be the root of the $(k+1)$ st tree.
- u is part of some SCC, call it C .
- By the inductive hypothesis, C is not one of the k SCCs already found and all so vertices in C are unvisited when u is discovered.
 - By the way DFS works, all vertices in C become part of u 's tree

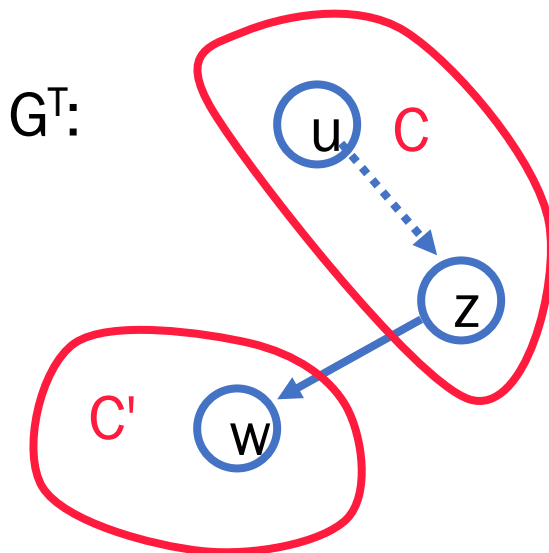
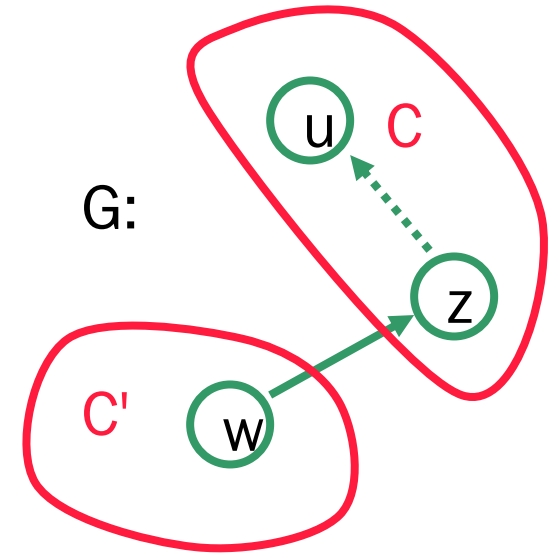
SCC Algorithm is Correct

- Show *only* vertices in C become part of u 's tree.
Consider an outgoing edge from C .



SCC Algorithm is Correct

- By lemma, in Step 1 (running DFS on G) the last vertex in C' finishes after the last vertex in C finishes [$f(C') > f(C)$].
- Thus in Step 3 (running DFS on G^T), some vertex in C' is discovered before any vertex in C is discovered.
- Thus in Step 3, all of C' , including w , is already visited before u 's DFS tree starts



*Thank
you*