



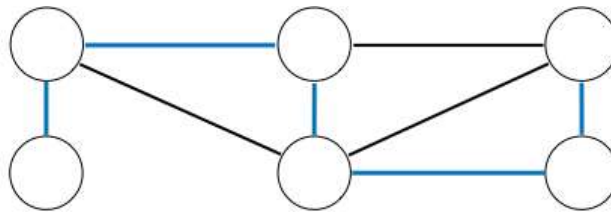
Advanced graph algorithms

By *Afshine Amidi* and *Shervine Amidi*

Spanning trees

Definition

A spanning tree of an undirected graph $G = (V, E)$ is defined as a subgraph that has the minimum number of edges $E' \subseteq E$ required for all vertices V to be connected.

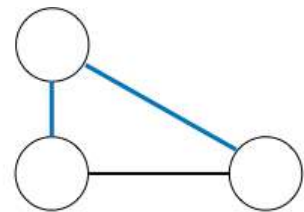
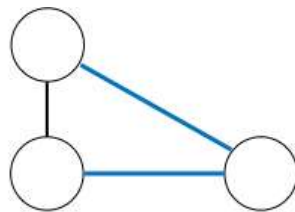
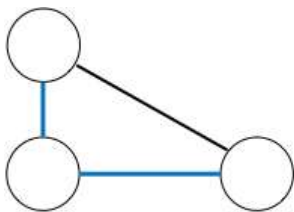


REMARK

In general, a connected graph can have more than one spanning tree.

Cayley's formula

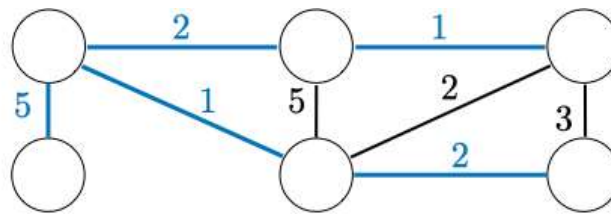
A complete undirected graph with N vertices has N^{N-2} different spanning trees.



For instance, when $N = 3$, there are $3^{3-2} = 3$ different spanning trees:

Minimum spanning tree

A minimum spanning tree (MST) of a weighted connected undirected graph is a spanning tree that minimizes the total edge weight.



For example, the MST shown above has a total edge weight of 11.

! REMARK

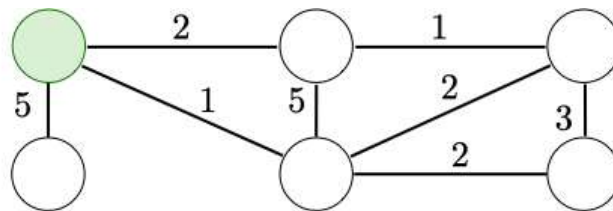
A graph can have more than one MST.

Prim's algorithm

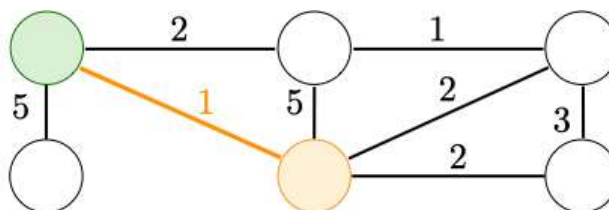
Prim's algorithm aims at finding an MST of a weighted connected undirected graph.

A solution is found in $\mathcal{O}(|E| \log(|V|))$ time and $\mathcal{O}(|V| + |E|)$ space with an implementation that uses a min-heap:

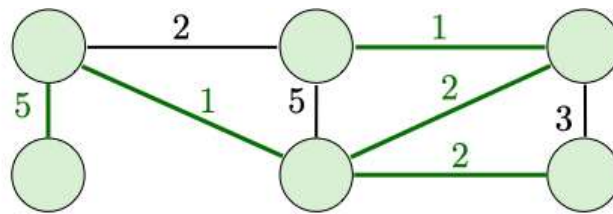
- *Initialization:* Pick an arbitrary node in the graph and visit it.



- *Compute step:* Repeat the following procedure until all nodes are visited:
 - Pick an unvisited node that connects one of the visited nodes with the smallest edge weight.
 - Visit it.



- *Final step:* The resulting MST is composed of the edges that were selected by the algorithm.

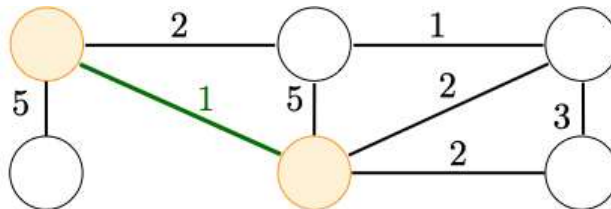


Kruskal's algorithm

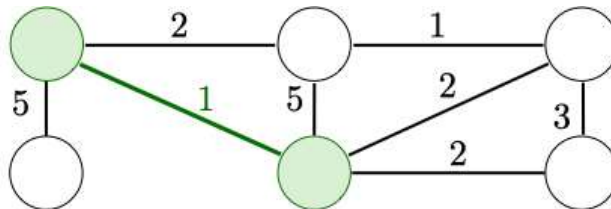
The goal of Kruskal's algorithm is to find an MST of a weighted connected undirected graph.

A solution is found in $\mathcal{O}(|E| \log(|E|))$ time and $\mathcal{O}(|V| + |E|)$ space:

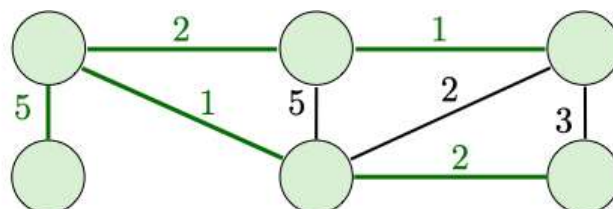
- *Compute step:* Repeat the following procedure until all nodes are visited:
 - Pick an edge that has the smallest weight such that it does not connect two already-visited nodes.



- Visit the nodes at the extremities of the edge.



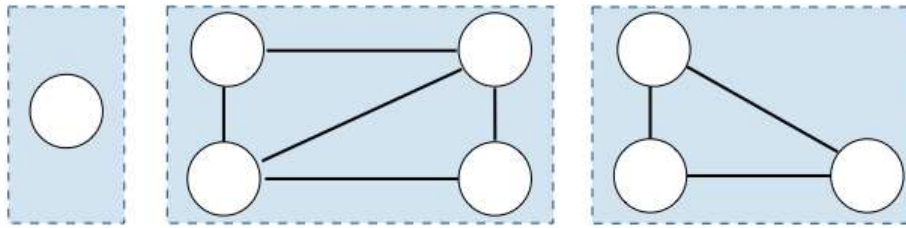
- *Final step:* The resulting MST is composed of the edges that were selected by the algorithm.



Components

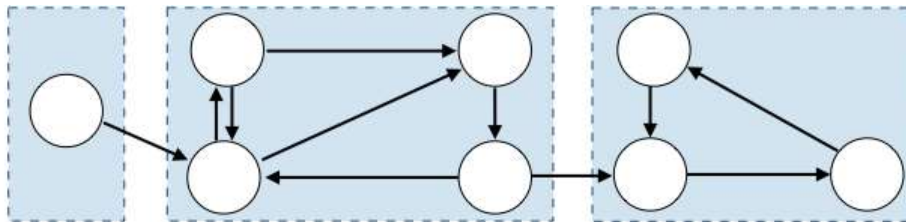
Connected components

In a given undirected graph, a connected component is a maximal connected subgraph.



Strongly connected components

In a given directed graph, a strongly connected component is a maximal subgraph for which a path exists between each pair of vertices.



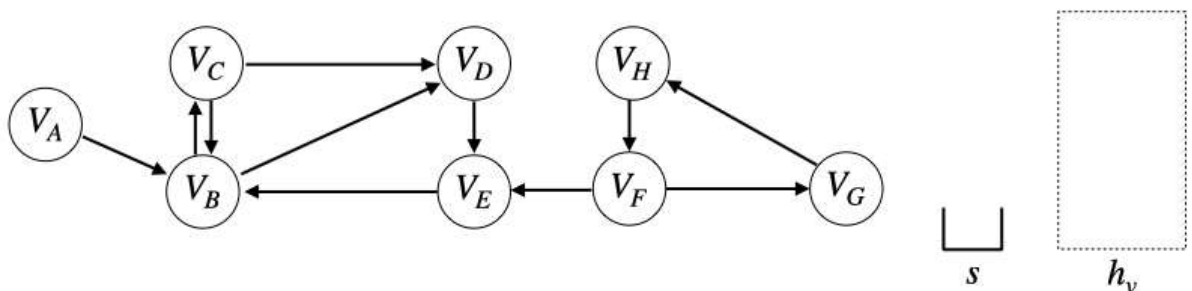
Kosaraju's algorithm

Kosaraju's algorithm aims at finding the strongly connected components of a directed graph.

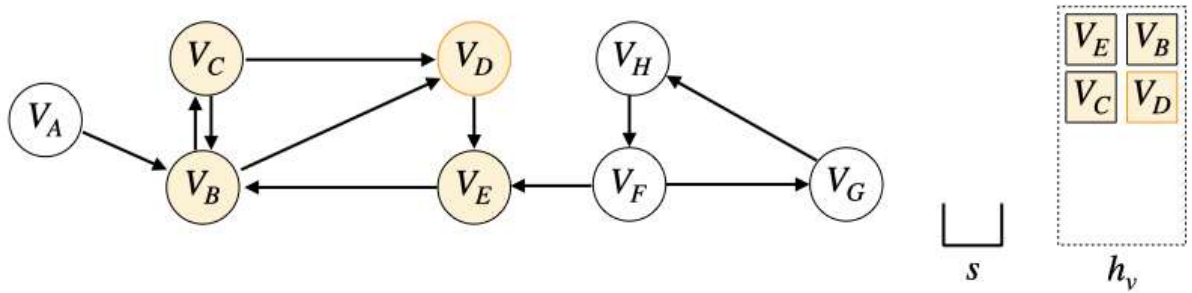
The solution is found in $\mathcal{O}(|V| + |E|)$ time and $\mathcal{O}(|V|)$ space:

First-pass DFS On the original graph, perform a DFS.

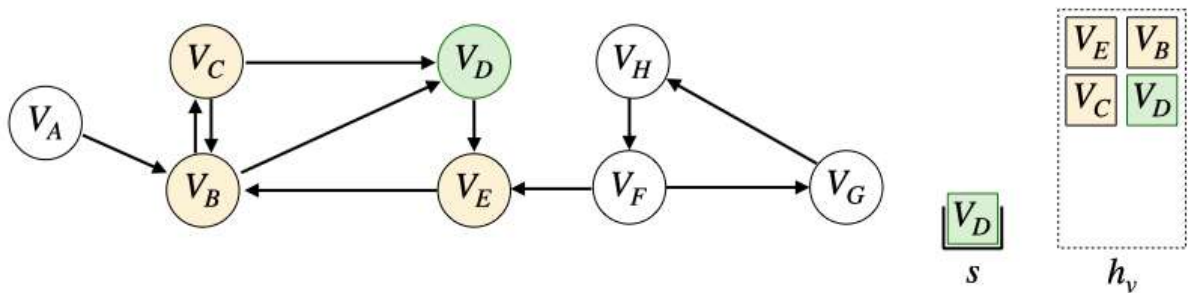
- *Initialization:* The following quantities are used:
 - An initially empty hash set h_v that keeps track of the visited nodes.
 - An initially empty stack s that keeps track of the order at which the nodes have had their neighbors visited.



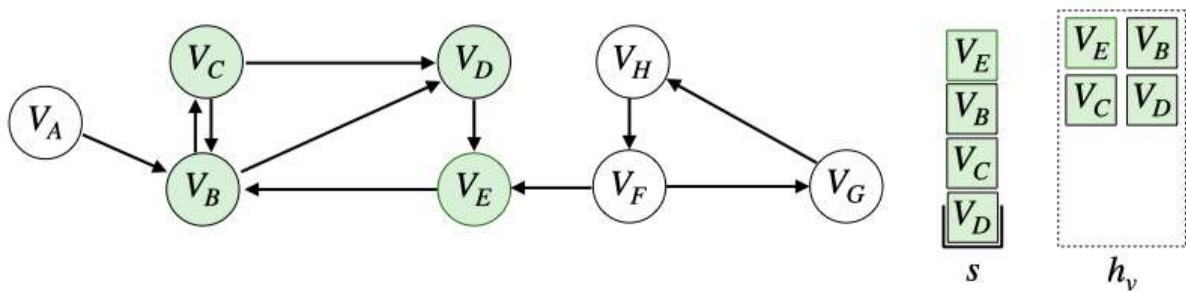
- *Compute step:* Perform the following actions:
 - Pick an arbitrary node and visit it by adding it to h_v . Recursively visit all its neighboring nodes.



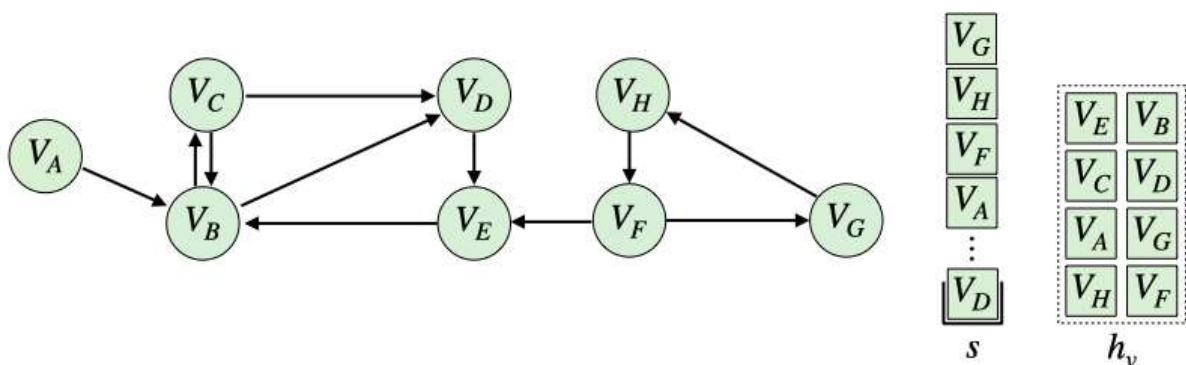
- Once a visited node has all its neighbors visited, push the visited node into the stack s .



The recursive procedure adds the remaining nodes to the stack s .



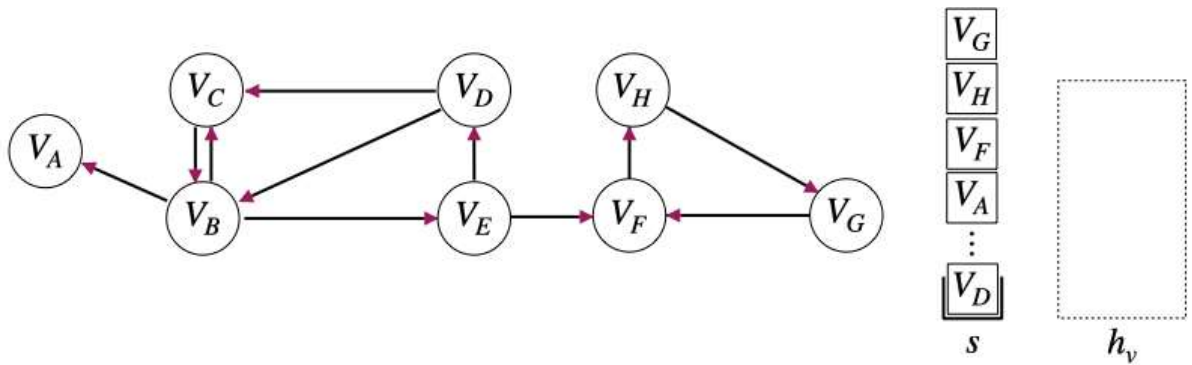
The same process is successively initiated on the remaining unvisited nodes of the graph until all nodes are visited.



Second-pass DFS On the reverted graph, perform a DFS to determine the strongly connected components.

- Initialization:* The following quantities are used:
 - The stack s obtained from the first-pass DFS.

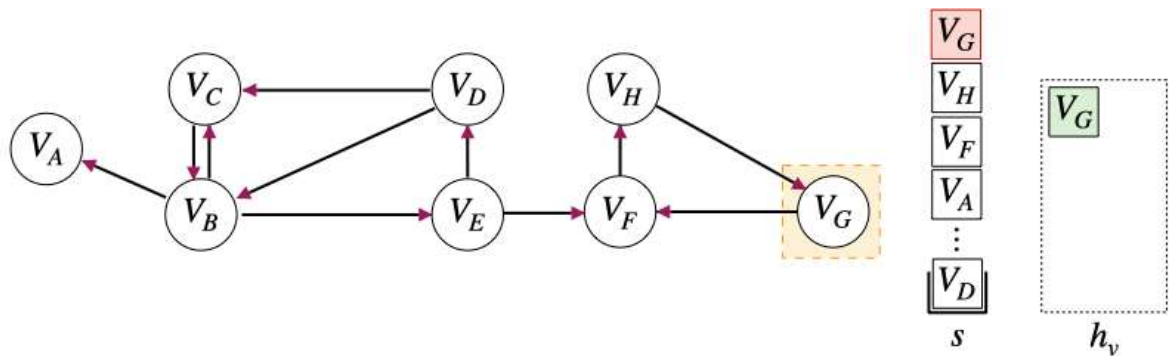
- An initially empty hash set h_v that keeps track of the visited nodes.



- **Compute step:** Pop a node from the stack.

- **Node is not visited:** This node is the representative of a new strongly connected component. Add it to h_v . Perform a DFS starting from that node. For the nodes that are being explored:

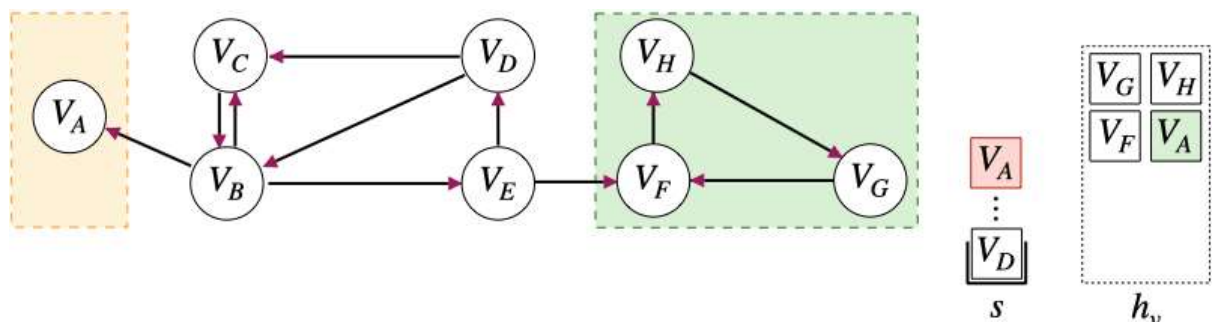
- **DFS node is not visited:** Add it to h_v and add the node to the hash set identifying the strongly connected component.



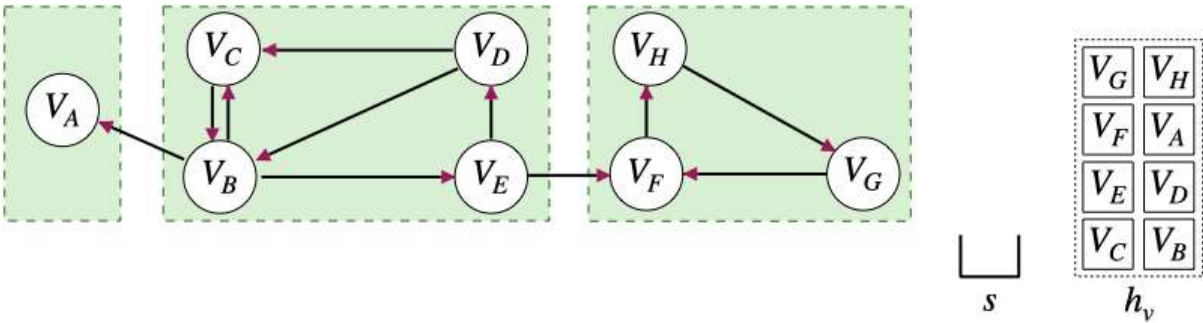
- **DFS node is visited:** Skip it.

- **Node is visited:** Skip it.

Repeat this process again...



- **Final step:** ...until the stack is empty.



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