



Programming in C/C++

- Graphs -



Graphs

Basics and refresher

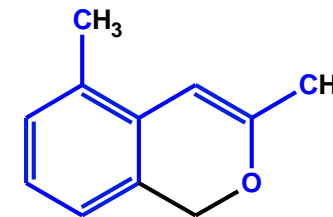
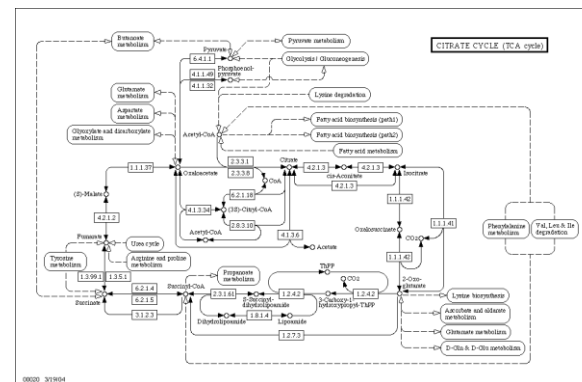
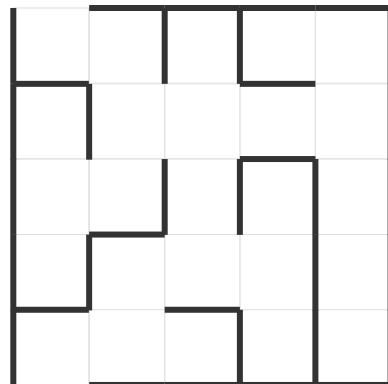
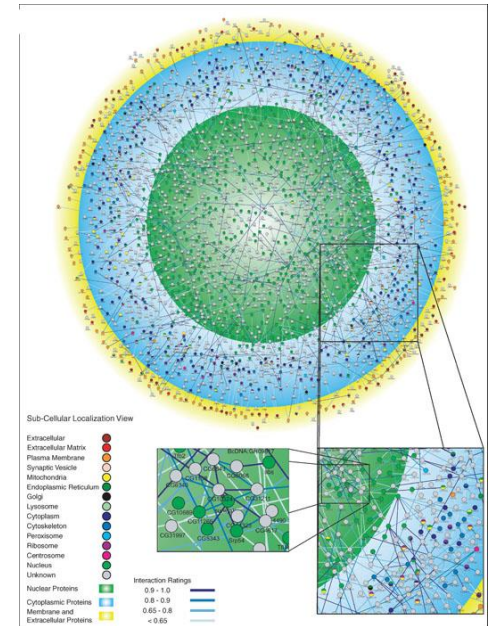
Adjacency Lists

Adjacency Matrices

Traversal

Graphs

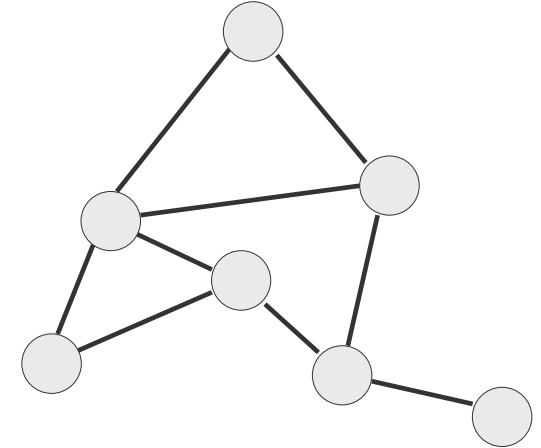
- Powerful structure to represent binary relations (= edges) between objects (= vertices)
- Examples:
 - Street or network maps
 - Social networks
 - Molecules, Biological networks, Pathways
 - Neighborhood relations e.g. adjacent pixel in image ...



Definition – (Un)directed Graph

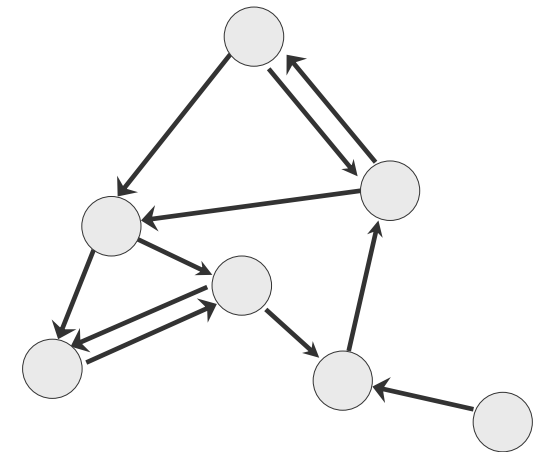
An **undirect Graph** is a Pair $G = (V, E)$, where

- V is a non-empty set of vertices (=nodes) and
- E a set of two-element subsets of V called (*edges*).



A **direct Graph** is a Pair $G = (V, E)$, where

- V is a non-empty set of vertices and
- $E \subseteq V \times V$ a set of ordered pairs.





Graphs – Properties and Terms

- **Path:** Sequence of edges e_1, e_2, \dots, e_S that connect nodes $v_0, v_1, v_2, \dots, v_S$ such that

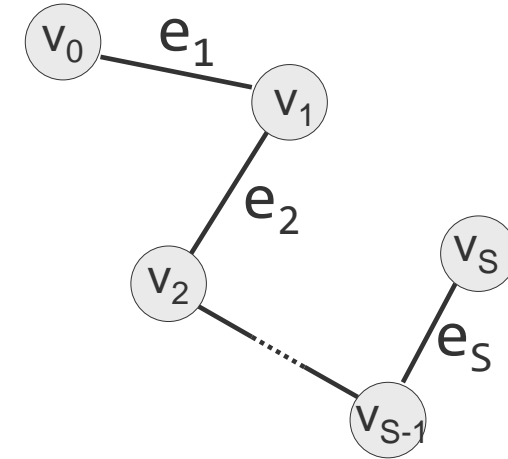
e_1 connects v_0 and v_1 ,

e_2 connects v_1 and v_2 ,

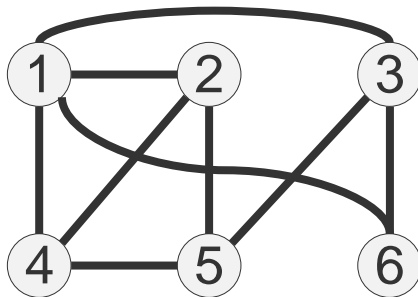
...

e_S connects v_{S-1} and v_S

We say: the path of length S connects v_0 and v_S .



- A **path** is called **simple** if no node appears twice.
- A **cycle** is a path that starts and ends at the same node.

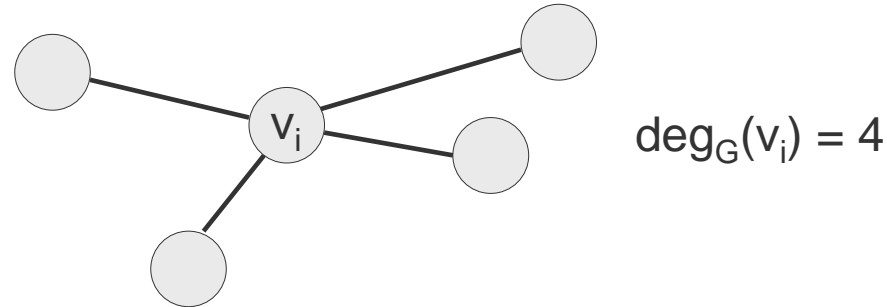


e.g.,: cycle 1,3,6,1 or 1,2,5,4,1

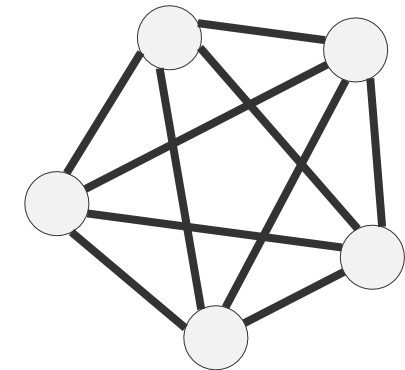
- A graph without cycles is called **acyclic**.

Graphs – Properties and Terms

- **Degree of a node:** number of edges going in or out of node v_i



- **Indegree / Outdegree of a node:** number of directed edges going in / out of node v_i
- An edge that connects v_i and v_j is called **incident with v_i and v_j** .
- If v_i is a neighbor of v_j we say v_i **is adjacent to** v_j
- If each pair of vertices is connected by an edge the graph is complete and fully connected

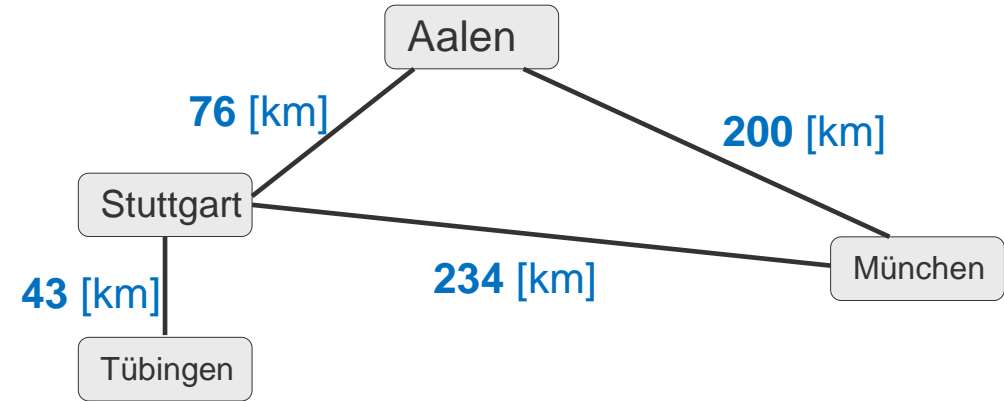




Definition – Weighted (un)directed Graph

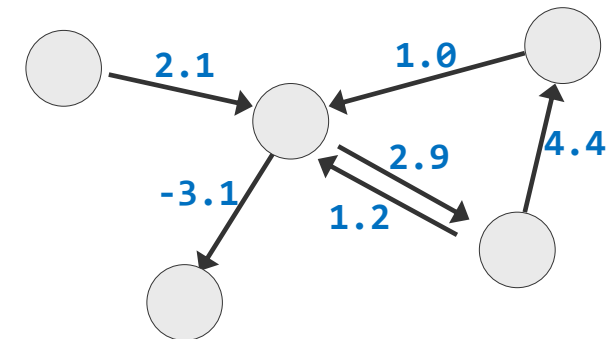
An **weighted undirect Graph** is a Triplet $G = (V, E, w)$, where

- (V, E) is an undirected Graph
- $w: E \rightarrow M$ is a mapping from edge to weight



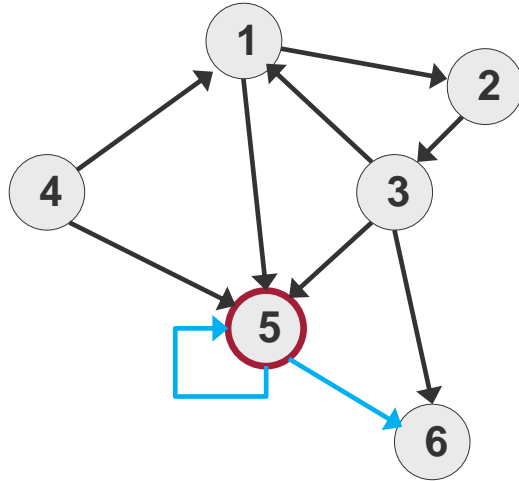
A **weighted directed Graph** is a Triplet $G = (V, E, w)$, where

- (V, E) is a directed Graph
- $w: E \rightarrow M$ is a mapping from edge to weight



Note: one can also define weights for nodes analogously.

Representing Graphs - Adjacency matrices

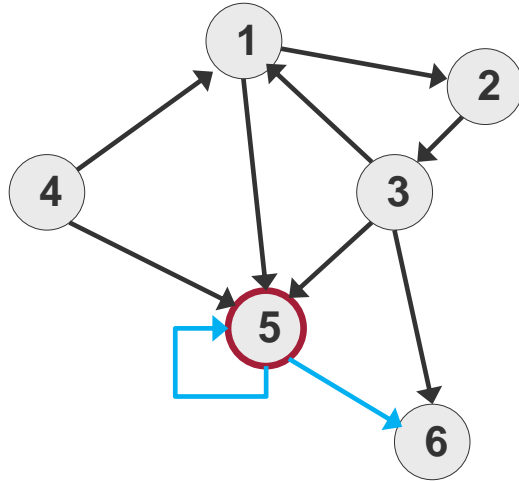


	j →					
	1	2	3	4	5	6
1	0	1	0	0	1	0
2	0	0	1	0	0	0
3	1	0	0	0	1	1
4	1	0	0	0	1	0
5	0	0	0	0	1	1
6	0	0	0	0	0	0

Adjacency matrix of a **directed graph with n vertices**:

- Matrix $A = [a_{ij}]$
- Entry a_{ij} is 1 if v_i has an edge to v_j
- For undirected graph, the matrix is symmetric
- For weighted graph, the entries are the weights

Representing Graphs - Adjacency matrices



	j →					
	1	2	3	4	5	6
1	0	1	0	0	1	0
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4	1	0	0	0	1	0
5	0	0	0	0	1	1
6	0	0	0	0	0	0

```
int n; // number of nodes
vector<vector<int>> adjM(n, vector<int>(n, 0));

// ... for unweighted edges
vector<vector<bool>> adjM(n, vector<bool>(n, 0));
```

Implementation:

- Even with a space efficient `vector<bool>` specialization in the STL. The representation is inefficient for very large graphs with few edges (sparse matrix with most entries 0).



Representing Graphs - Adjacency matrices

Inserting a **node** into an **adjacency matrix**:

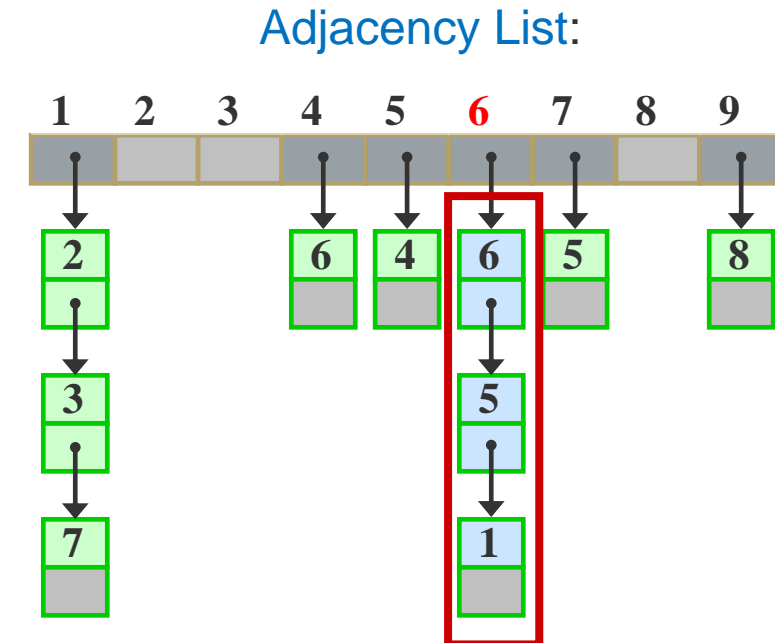
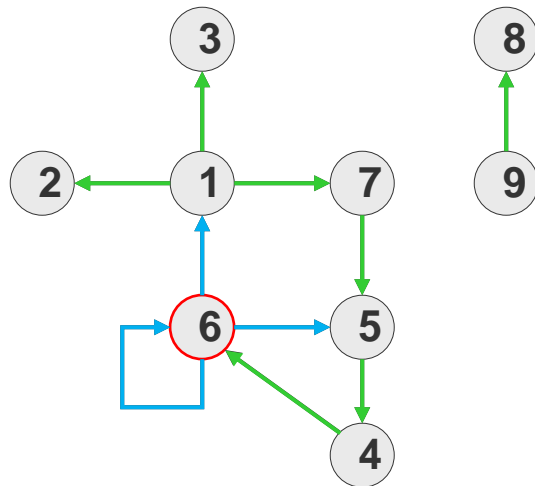
- Input
 - for **undirected** graphs: new node (with value, item) has a set of neighbor nodes;
 - for **directed** graphs: new node (with value) has a set of successor nodes and a set of predecessor nodes (and weighs)
- Append an item as a **new row** in the adjacency matrix
- For **each row**, a **new column** item must also be appended
- This can get inefficient very fast (vectors may grow often; a lot of reallocations happen).
- Adjacency lists can mitigate some of these problems and work well for sparse graphs.



Representing Graphs - Adjacency Lists

- A graph $G(V, E)$ is
 - defined by a node array of length $\text{card}\{V\}$ whose elements contain **pointers to lists of neighboring nodes** (nodes that can be reached directly through an outedge).

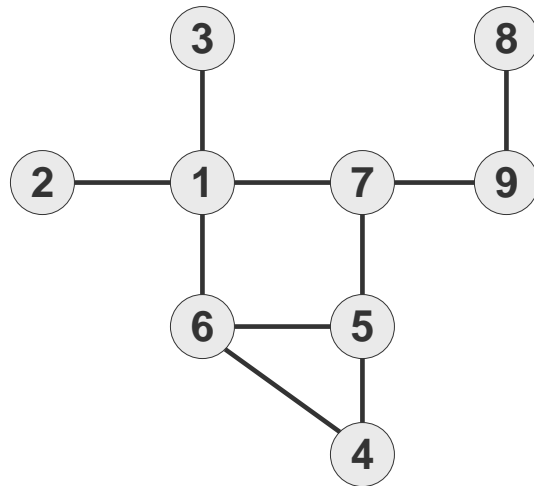
Example: directed graph G



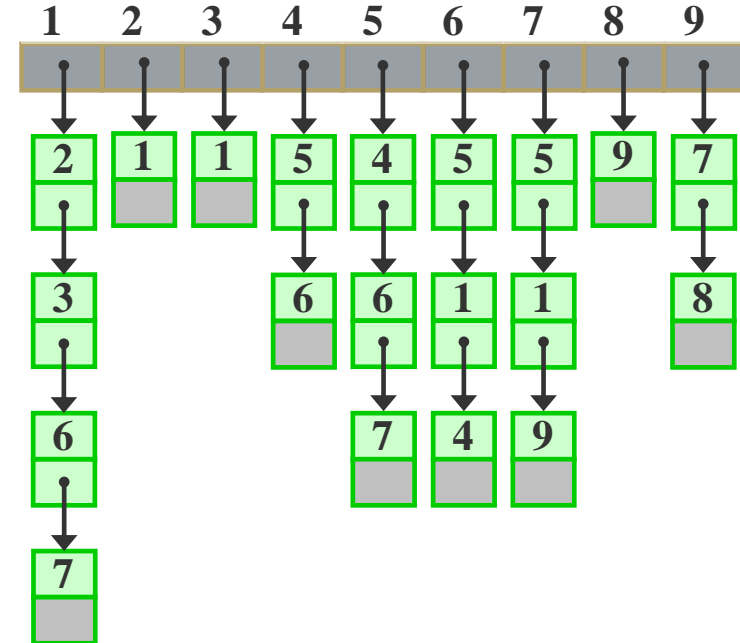


Representing Graphs - Adjacency Lists

Example: undirected graph G



Adjacency List:



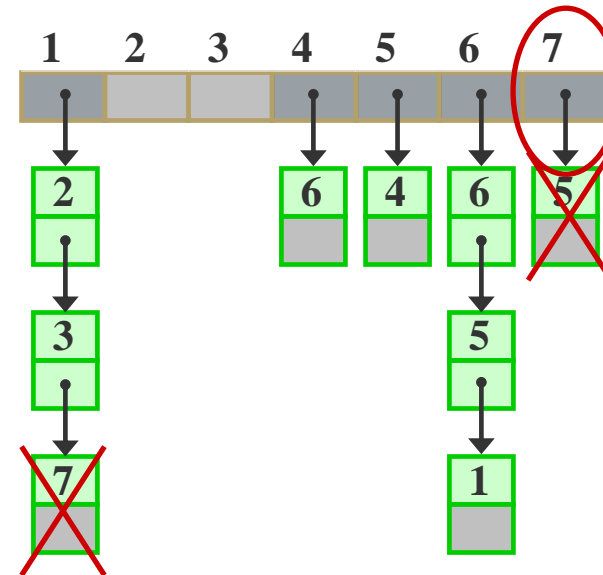
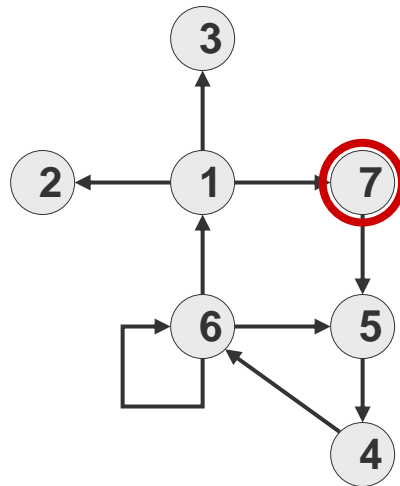
For **weighted graphs**, the weights are stored in the nodes of the lists.

- Memory:
 - Average case: adjacency list $O(|V| + |E|)$ vs. adjacency matrix $O(|V| \cdot |V|)$
 - Worst case: both $O(|V| \cdot |V|)$



Removing an Element

- First, the element is **searched**; the element (node) is marked (e.g. pointer, index of the node in the node list).
- **Deleting the connections** of the marked node in the adjacency matrix or in the adjacency list.
- Example - Delete node 7 in **directed graph G** and **adjacency list**:





Algorithms on Graphs

Simple example algorithms:

- Determine if node can be reached (is there a path between v_i and v_j ?)
- Determine if graph contains cycles
- Determining whether a given graph is **fully connected**.

Can easily be answered by **traversing the graph**.

More advanced example algorithms:

- **Shortest path problem**: finding the shortest path starting from a node S to a node Z (edges can be weighted)
- Determination of **minimum spanning trees**: Find the tree with the minimum cost (sum of weights) connecting all possible nodes.
- Travel/optimization problems (**traveling salesman problem**): Computation of a round-trip through all nodes. Nodes are visited only once, and the total cost of the path is minimized.



Depth-first Search in a Graph

When traversing a graph, two basic strategies are distinguished

- Depth-first search
- Breadth-first search

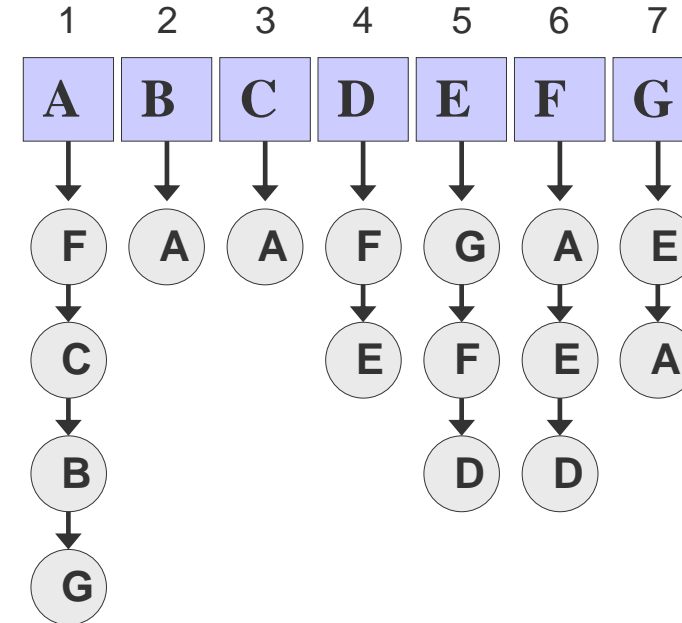
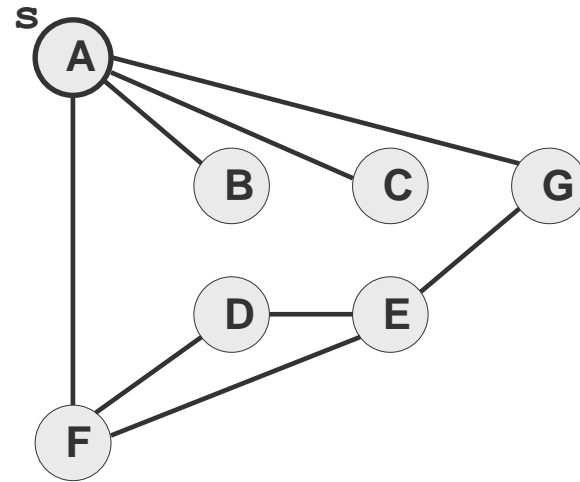
Depth-first search (recursive)

- Mark node $s \in G$.
- Follow all incident edges and mark the visited node v
- If one encounters already visited nodes, this path is not explored further. Instead, an alternative edge $e \in \text{nb}(v)$ to another neighbor is followed
- If all edges starting from a current node have been traversed, the algorithm backtracks to the predecessor (to the node from which the current node was reached)
- Continue recursively
- **Note:** Non recursive versions can be implemented using a stack (LIFO) data structure



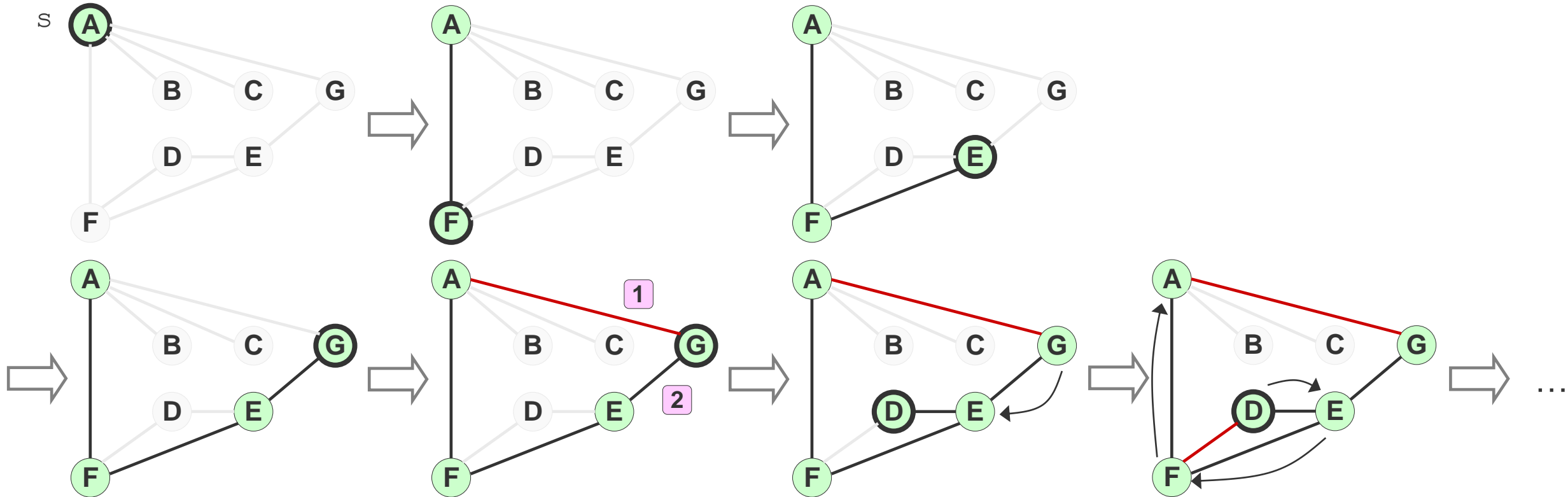
Example – Depth First Search

- For a graph $G(V, E)$ and a distinguished start node $s \in G$
- Example graph and its representation (adjacency list).



- The strategy of depth-first search runs from a node (starting with s) along one of the edges an edge $e_1 = v_{\text{current}}v_{\text{NB}}$ starting from it,
- If node not yet visited, trace edge, etc.

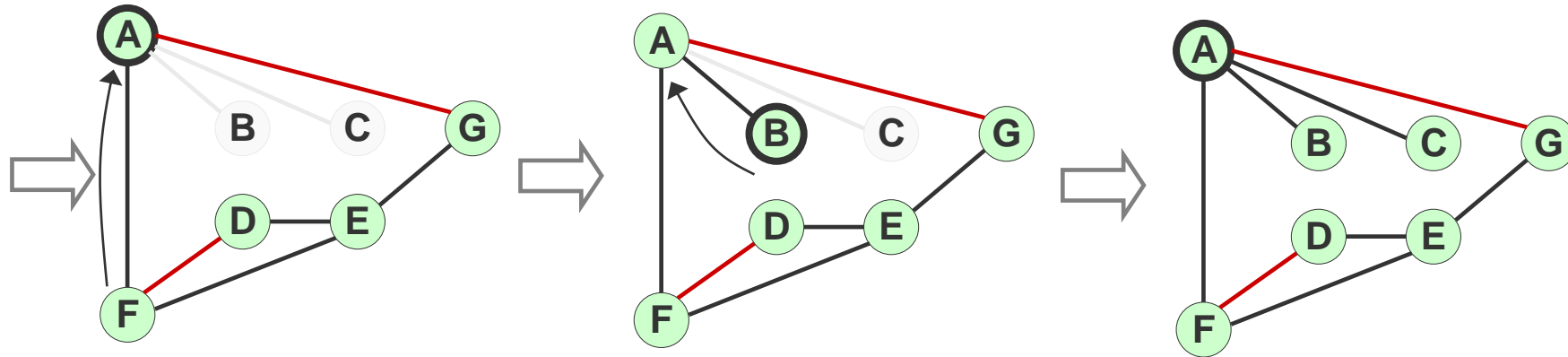
Depth-first Exploration



- Current node: **bold outline**
- Visited nodes: **green**
- Non-followed edge: **red**



Depth-first Exploration

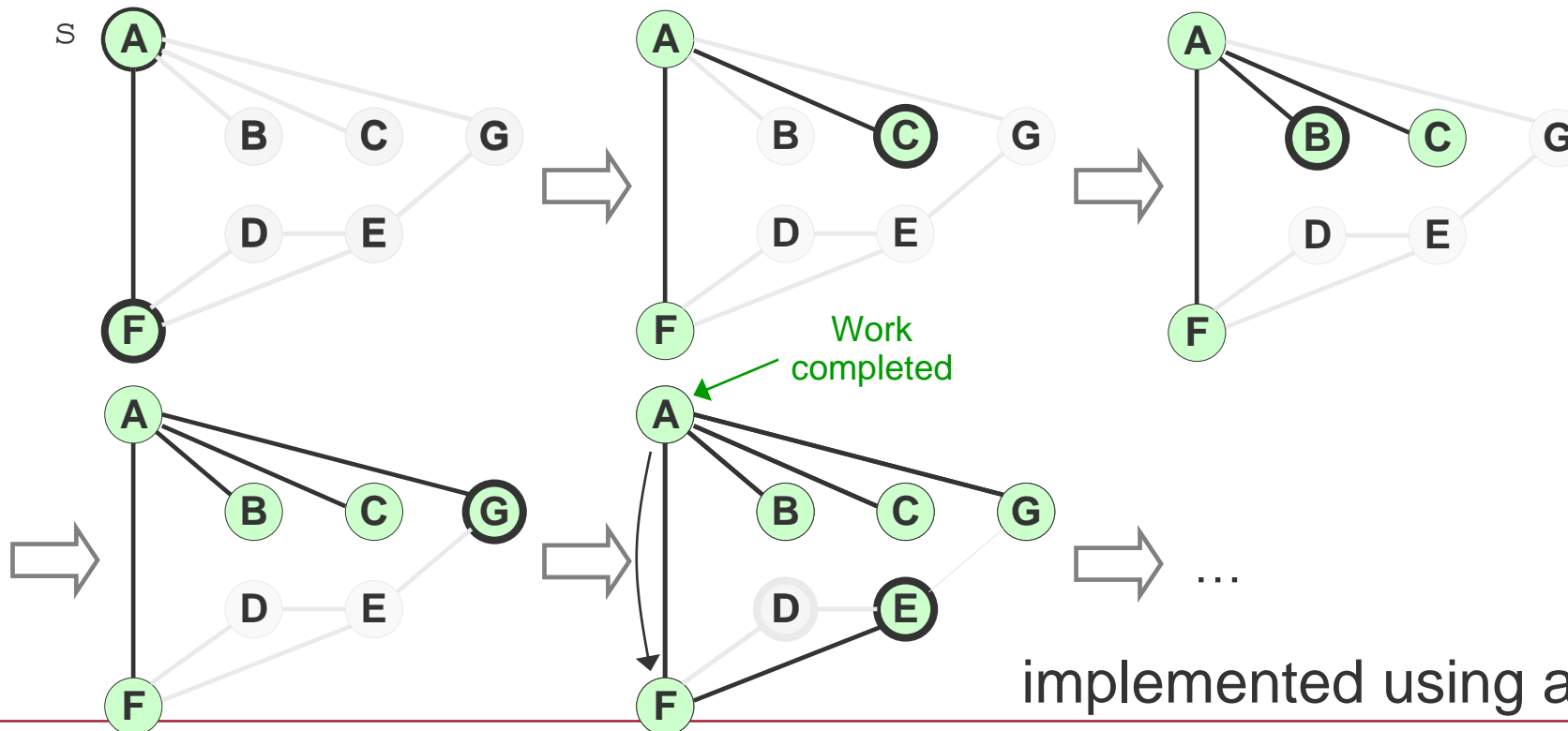


- Current node: bold outline
- Visited nodes: green
- Non-followed edge: red



Breadth-first Search

- Starting from a start node, all directly connected nodes are visited before going to the next lower level
- For the same example graph, exploration in breadth-first search is discussed (adjacency list of A: F - C - B - G)



implemented using a queue (FIFO)



Summary

- Both BFS and DFS can be easily modified to solve the reachability problem.
 - If the target node is reached during traversal, we are done else it is not reachable.

- Graph, Vertex, Edge, Basic terms

- Adjacency Lists

- Adjacency Matrices

- Traversal, DFS, BFS



Summary

- Graph representation
 - Adjacency matrix
 - Adjacency list
 - Drawbacks and benefits?
- Depth-first traversal vs. Breadth-first traversal
 - Stack vs. queue

Outlook:

- Shortest path algorithm
 - Dijkstra
 - Dynamic programming
- A*-Algorithm
 - Shortest path with heuristics