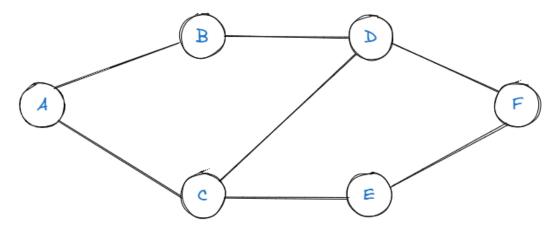
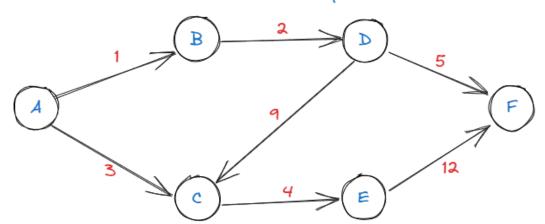
GRAFOS

Grafo de Exemplo 1



Grafo de Exemplo 2



Representação como um Dicionário

```
1 graph = {
2    "A": ["B", "C"],
3    "B": ["A", "D"],
4    "C": ["A", "D", "E"],
5    "D": ["B", "C", "F"],
6    "E": ["C", "F"],
7    "F": ["D", "E"]
8 }
```

Representação como um Dicionário

```
1 graph = {
2    "A": {"B": 1, "C": 3},
3    "B": {"D": 2},
4    "C": {"E": 4},
5    "D": {"C": 9, "F": 5, },
6    "E": {"F": 12},
7    "F": {}
8 }
```

Algoritmo BFS

```
BFS(G,s)
for u:V[G]-{s} do
             cor[u] ← BRANCO
             d[u] \leftarrow \infty
             \pi[u] \leftarrow NIL
cor[s] ← CINZA
d[s] \leftarrow 0
\pi[s] \leftarrow \mathsf{NIL}
Q \leftarrow \{s\}
while Q \neq \emptyset do
           u ← dequeue[Q]
          for v:Adj[u] do
            if cor[v] = BRANCO then
                     cor[v] \leftarrow CINZA
                     d[v] \leftarrow d[u] + 1
                     \pi[v] \leftarrow u
                     enqueue(Q, v)
          cor[u] ← PRETO
```

G = (V, E) com lista de adjacências

cor[u]: cor do vértice u $\pi[u]$ predecessor de u na árvore de largura $(\pi[u] = \text{NIL quando não houver})$ d[u] distância entre o vértice inicial e u.

fila Q (FIFO) com vértices de cor cinza

```
BFS - Simples
```

```
def bfs(graph, start):
    visited = set()
    queue = []
    visited.add(start)
    queue.append(start)

    while queue:
        vertex = queue.pop()
        print(vertex)

for adj in graph[vertex]:
    if adj not in visited:
        visited.add(adj)
    queue.append(adj)
```

BFS - Slide

```
1 def bfs(graph, start = None):
       colors = {}
       distance = {}
       parent = {}
       queue = []
       if start is None:
           start = list(graph.keys())[0]
       for vertex in graph:
           colors[vertex] = "WHITE"
           distance[vertex] = float('inf')
           parent[vertex] = None
       colors[start] = "GRAY"
       distance[start] = 0
       queue.append(start)
       while queue:
           vertex = queue.pop(0)
           for adj in graph[vertex]:
               if colors[adj] = "WHITE":
                   colors[adj] = "GRAY"
                   distance[adj] = distance[vertex] + 1
                   parent[adj] = vertex
                   queue.append(adj)
           colors[vertex] = "BLACK"
```

CUSTO: O(V + E)

Algoritmo DFS

```
\begin{aligned} & \mathsf{DFS}(\mathsf{G}) \\ & \textbf{for} \ u \text{:} \mathsf{V}[\mathsf{G}] \ \ \textbf{do} \\ & & \mathsf{cor}[u] \leftarrow \mathsf{BRANCO} \\ & \mathsf{p}[u] \leftarrow \mathsf{NIL} \\ & \mathsf{tempo} \leftarrow 0 \\ & \textbf{for} \ \ u \text{:} \mathsf{V}[\mathsf{G}] \ \textbf{do} \\ & & \mathsf{if} \ \mathsf{cor}[u] = \mathsf{BRANCO} \ \textbf{then} \\ & & \mathsf{VisitaDFS}(u) \end{aligned}
```

```
VisitaDFS(u)
cor[u] \leftarrow CINZA
d[u] \leftarrow tempo \leftarrow tempo + 1
for \ v:Adj[u] \ do
if \ cor[v] = BRANCO \ then
p[v] \leftarrow u
VisitaDFS(v)
cor[u] \leftarrow PRETO
[u] \leftarrow tempo \leftarrow tempo + 1
```

CUSTO: O(V + E)

DFS - Simples

```
def dfs(graph, start, visited = None):
    if visited is None:
        visited = set()

    visited.add(start)
    print(start)

for adj in graph[start]:
    if adj not in visited:
        dfs(graph, adj, visited)
```

DFS - Slide

$\begin{tabular}{ll} \hline \textbf{Topological-Sort}\,(\textit{G}) \\ \hline \textbf{Execute DFS}(\textit{G}) & \textbf{e calcule o tempo final } f[v] \ \textbf{para todo} \ v \in V \\ \hline \textbf{Quando a visita para um vértice for completada, proceda sua inserção} \\ \hline \textbf{na cabeça de uma lista encadeada} \\ \hline \textbf{retorne a lista encadeada} \ \textbf{de vértices} \\ \hline \end{tabular}$

Ordenação Topológica

```
1 def dfs_order(graph, start, visited):
       order = []
       visited.add(start)
       for adj in graph[start]:
           if adj not in visited:
               order += dfs_order(graph, adj, visited)
       return order + [start]
11 def topological_sorting(graph, start = None):
       visited = set()
       order = []
       if start:
           order += dfs_order(graph, start, visited)
      for vertex in graph.keys():
           if vertex not in visited:
               order += dfs_order(graph, vertex, visited)
       return order[::-1]
```

CUSTO: O(V + E)

Grafo Trasnposto

```
def transpose(graph):
    transpose = {node: [] for node in graph}

for node in graph:
    for adj in graph[node]:
        transpose[adj].append(node)

return transpose
```

CUSTO: O(V + E)

Algoritmo SCC

calcula f[u] para cada vértice

```
SCC(G)
DFS(G)
calcula G^T
DFS(G^T), onde o laço principal vai em ordem decrescente de f[u] do 1o. DFS
return cada árvore floresta resultante do 2o. DFS é um SCC
```

CUSTO: O(V + E)

Componentes Fortemente Conectado (SCC) Grafo direcionado

```
. . .
1 def dfs_comp(graph, start, visited):
       component = [start]
       visited.add(start)
       for adj in graph[start]:
          if adj not in visited:
              component += dfs_comp(graph, adj, visited)
      return component
11 def scc directed graph(graph);
       topological_order = topological_sorting(graph)
       graphT = transpose(graph)
       components = []
       visited = set()
       for vertex in topological order:
           if vertex not in visited:
               components.append(dfs_comp(graphT, vertex, visited))
      return components
```

Componentes Fortemente Conectado (SCC) Grafo não direcionado

```
def dfs_comp(graph, start, visited):
    component = [start]
    visited.add(start)

for adj in graph[start]:
    if adj not in visited:
        component += dfs_comp(graph, adj, visited)

return component

def scc_undirected_graph(graph):
    components = []
    visited = set()

for vertex in graph.keys():
    if vertex not in visited:
        components.append(dfs_comp(graph, vertex, visited))

return components
```

```
DIJKSTRA(G, s)

1 INICIAMENORCAMINHO(G,s) O(V)

2 S = \emptyset

3 Q = V[G] O(V)

4 while Q \neq \emptyset

5 u = \text{ExtractMin}(Q) ExtractMin tem custo lg V e é

6 S = S \cup \{u\} executado V vezes: O(V lg V)

7 for each V \in \text{Adj}[u] Relaxa tem custo lg V e é

8 RELAXA(U, V) executado V vezes: O(V lg V)

Custo total = O(V) + O(V lg V) = O(V lg V)
```

Dijkstra

```
• • •
1 import heapq
3 def dijkstra(graph, start):
       distances = {node:float('inf') for node in graph}
       parent={node:None for node in graph}
       distances[start] = 0
       queue = [(0, start)]
       while queue:
           current_distance, current_node = heapq.heappop(queue)
           for next_node, weight in graph[current_node].items():
               distance_temp = current_distance + weight
               if distance_temp < distances[next_node]:</pre>
                   distances[next_node] = distance_temp
                   parent[next node] = current node
                   heapq.heappush(queue, (distance_temp, next_node))
       return distances, parent
```

```
BELLMAN-FORD(G, s)

1 INICIAMENORCAMINHO(G, s) O(V)

2 for i = 1 to n - 1

3 for each (u, v) \in E[G]

4 RELAX(u, v) O(V*E)

5 for each (u, v) \in E[G]

6 if d[v] > d[u] + w(u, v) O(E)

7 return FALSE

8 return TRUE

Custo total = O(V*E)
```

Bellman Ford

```
def bellman_ford(graph, node):
    distances = {node:float('inf') for node in graph}
    nodes = graph.keys()
    distances[node] = 0
    for _ in range(len(nodes) - 1):
        for current node in nodes:
            for next_node, weight in graph[current_node].items():
                distance_temp = distances[current_node] + weight
                if distance_temp < distances[next_node]:</pre>
                    distances[next_node] = distance_temp
    for current_node in nodes:
        for next node, weight in graph[current node].items():
            distance_temp = distances[current_node] + weight
            if distance temp < distances[next node]:</pre>
                return (False, distances)
    return (True, distances)
```

```
Se Q for implementado por uma Min-Heap,
                                      inicialização (linhas 1-5) é feita em O(V).
                                      O laco while é executado V vezes.
PRIM(G, r)
                                      O custo de Extract-Min é O(lg V).
                                      A atribuição da linha 10 envolve, implicitamente, uma
 1 for each u \in V[G]
                                      mudança de elementos na heap (colocar o menor no
          key[u] = \infty
                                      topo). Cada Decrease-Key tem custo O(lg V).
          \pi[u] = NIL
     key[r] = 0
                                      IVI chamadas EXTRACT-MIN = O(VIgV)
     Q = V[G]
                                      <= |E| chamadas DECREASE-KEY = O(ElqV)
     while Q \neq \emptyset
          u = \text{Extract-Min}(Q)
                                                Custo Total: O(V \lg V + E \lg V) = O(E \lg V)
               if v \in Q and w(u, v) < key[v] Em um grafo conexo |E| >= |V|
          for each v \in Adj[u]
                    key[v] = w(u, v)
10
                    \pi[v] = u
11
```

```
Inicialização: O(V)
KRUSKAL(G,r)
                              Ordenação arestas: O(E log E)
                                Find-set e Union: O(E log V)
   A = \emptyset
                                  Custo total: O(E log E)
   for each v \in G[V]
3
        MAKE-SET(v)
   ordene E em ordem crescente de pesos
   for each (u, v) da lista ordenada
        if FIND-SET(u) \neq FIND-SET(v)
6
            A = A \cup \{(u, v)\}
8
            Union(u, v)
   return A
```