Week 08: Connectivity

FanFly

April 26, 2020

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A Mysterious Data Structure

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Connected Components

We want to label the vertices with the **connected components** they belong to.

Connected Components

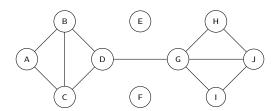
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Connected Components

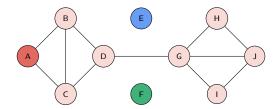
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 A connected component of a graph is a maximal set of vertices such that each pair of vertices are connected.



Connected Components (cont.)

For each connected components, we choose a representative to identify it.



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class Graph:
    def __init__(self, vertices):
        self.vertices = list(vertices)
        self.adj = {u: [] for u in vertices}
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We are going to introduce a very useful "algorithm", which is called depth-first search.

First we construct a class in Python called Graph.

```
class Graph:
    def __init__(self, vertices):
        self.vertices = list(vertices)
        self.adj = {u: [] for u in vertices}

    def add_edge(self, u, v):
        self.adj[u].append(v)
        self.adj[v].append(u)
```

The Graph Class (cont.)

For example, we can represent the graph as follows.

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The Graph Class (cont.)

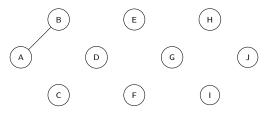
For example, we can represent the graph as follows.



```
>>> G = Graph(["A", "B", "C", "D", "E", "F", "G", "H", "I", "J"])
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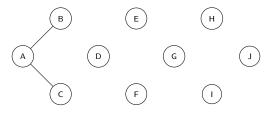
The Graph Class (cont.)

For example, we can represent the graph as follows.



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>>> G = Graph(["A", "B", "C", "D", "E", "F", "G", "H", "I", "J"])
>>> G.add_edge("A", "B")
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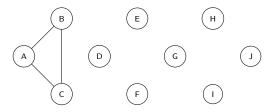
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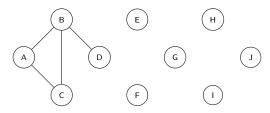
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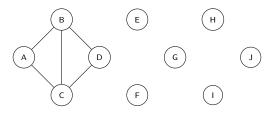
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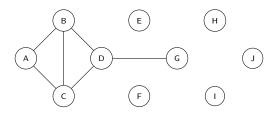
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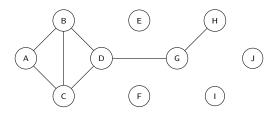
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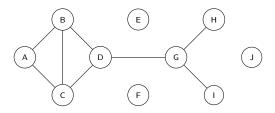
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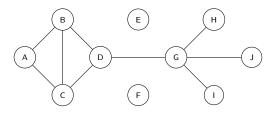
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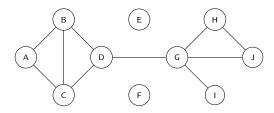
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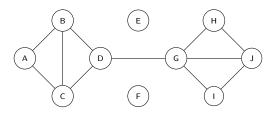
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            for v in self.adj[u]:
                if v not in visited:
                     dfs visit(v)
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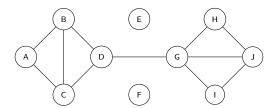
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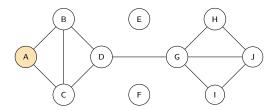
In fact, the method dfs() does not do anything, but it traverses all the vertices exactly once in a specific order.

```
>>> for u in G.vertices:
         print(u, G.adj[u])
  ["B", "C"]
   "A", "C", "D"]
  ["A", "B", "D"]
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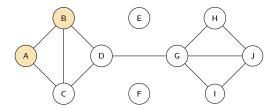


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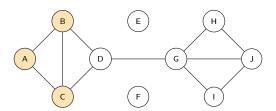
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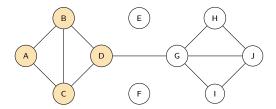
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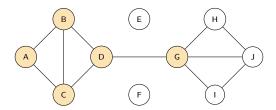
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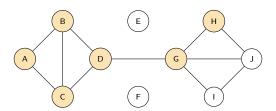
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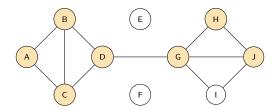
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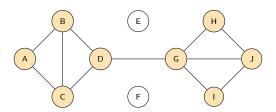
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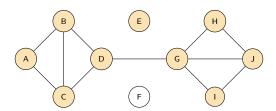
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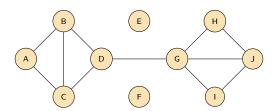
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What is the time complexity of depth-first search?

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• The function dfs_visit() is called exactly once for each vertex.

```
class Graph:
    def dfs(self):
        visited = set()
        # A recursive function used by depth first search
        def dfs_visit(u):
            visited.add(u)
            for v in self.adi[u]:
                if v not in visited:
                    dfs_visit(v)
        # Start depth first search
        for n in self vertices:
            if u not in visited:
                dfs_visit(u)
```

What is the time complexity of depth-first search?

- The function dfs_visit() is called exactly once for each vertex.
- During the execution of dfs_visit() for vertex u, the for loop runs in $\Theta(d(u))$ time.

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- The function dfs_visit() is called exactly once for each vertex.
- During the execution of dfs_visit() for vertex u, the for loop runs in $\Theta(d(u))$ time.
- Thus, the overall running time is $\Theta(n+m)$.

Finding Connected Components

Depth-first search can be used to find connected components.

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Finding Connected Components

Depth-first search can be used to find connected components.

When dfs() calls dfs_visit(), a connected component is found.

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Finding Connected Components

Depth-first search can be used to find connected components.

- When dfs() calls dfs_visit(), a connected component is found.
- Thus, with little revision we can use dfs() to label the vertices with the connected component they belong to.

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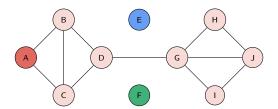
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Finding Connected Components (cont.)

We use a dictionary label to store the representative of the connected component that a vertex belongs to.

```
class Graph:
    def dfs(self):
      visited = set()
      label = \{\}
      # A recursive function used by depth first search
      def dfs_visit(u, r):
          label[u] = r
          visited.add(u)
          for v in self.adj[u]:
              if v not in visited:
                  dfs_visit(v, r)
      # Start depth first search
      for u in self.vertices:
          if u not in visited:
              dfs visit(u. u)
      return label
```



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Conclusion

With depth-first search we can know the connected component a vertex belongs to, and thus we have the following data structure.

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Adjacency List with Label

- Preprocess: O(n+m) time.
- Check if u and v are connected: O(1) time.

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Iterative Method

In fact, we can use a **stack** to eliminate recursion!

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class Graph:
    def dfs(self):
        visited = set()
        # A non-recursive function used by depth first search
        def dfs_visit(u):
            stack = [u]
            while stack:
                u = stack.pop()
                if u not in visited:
                    visited.add(u)
                     for v in self.adj[u]:
                         stack.append(v)
        # Start depth first search
        for u in self.vertices:
            if u not in visited:
                dfs visit(u)
```

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Connected Component Problem

- Input: A graph G with n vertices and m edges.
- Output: The number of connected components of *G*.

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Solution

An O(n+m)-time depth-first search can solve the connected component problem. Thus, its time complexity is $\Theta(n+m)$ since the input size is $\Omega(n+m)$.

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FanFly

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Solution

Only the last statement is correct.



Let
$$G = (V, E)$$
 with $|V| = n$ and $|E| = m$.

Let G = (V, E) with |V| = n and |E| = m. Furthermore, let A and C be $n \times n$ matrices such that

$$A_{ij} = \begin{cases} 1, & \text{if } v_i \text{ and } v_j \text{ are adjacent} \\ 0, & \text{otherwise} \end{cases}$$

and

$$C_{ij} = \begin{cases} 1, & \text{if } v_i \text{ and } v_j \text{ are connected} \\ 0, & \text{otherwise.} \end{cases}$$

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Let $B = I + A + A^2 + \cdots + A^{n-2} + A^{n-1}$. What is the relation between B and C?



FanFly Week 08: Connectivity

Let G = (V, E) with |V| = n and |E| = m. Furthermore, let A and C be $n \times n$ matrices such that

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Week 08: Connectivity

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$$B = I + A + A^2 + \cdots + A^{n-2} + A^{n-1}$$
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What is the relation between B and C?

Solution

$$C_{ij} = 1$$
 if and only if $B_{ij} \ge 1$.

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April 26, 2020