

Data Mining and Web algorithm

Lab Assignment 8:

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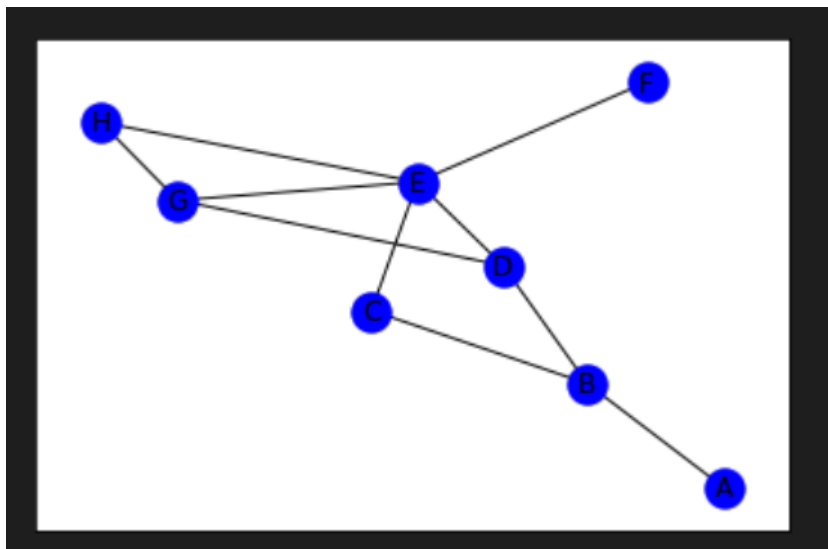
B11

Answer the following questions about this graph.

```
import networkx as nx
```

```
# Create Graph
g = nx.Graph()
g.add_nodes_from(['A', 'B', 'C', 'D', 'E', 'F', 'G', 'H'])
g.add_edges_from([('A', 'B'), ('B', 'C'), ('B', 'D'), ('C', 'E'), ('D', 'G'), ('D', 'E'), ('E', 'F'), ('H', 'G'), ('E', 'G'), ('E', 'H')])
nx.draw_networkx(g, node_color='blue')
```

a) Draw the given graph G, using networkx library



b) Count the number of nodes & edges in the network?

```
total_node=len(g2.nodes)
given_edges=len(g2.edges)
```

```
print("Nodes:",total_node," Edges:",given_edges)
```

Nodes: 4 Edges: 6

c) Create an adjacency list for this graph.

```
adj_list={}
for node in g2.nodes():
    adj_list[node]=[]
    for nei in g2.neighbors(node):
        adj_list[node].append(nei)
print(adj_list)
```

Nodes: 4 Edges: 6

```
{'Page A': ['Page B'], 'Page B': ['Page A', 'Page C'], 'Page C':
['Page A', 'Page D'], 'Page D': ['Page A']}
```

d) Create an adjacency matrix for this graph.

```
print (nx.adjacency_matrix(g2))
```

```
(0, 1)      1
(1, 0)      1
(1, 2)      1
(2, 0)      1
(2, 3)      1
(3, 0)      1
```

e) Compute density of a graph.

```
# Density
total_node=len(g.nodes)
total_edges=total_node*(total_node-1)
print(len(g.edges)/total_edges)
```

```
0.12222222222222222
```

f) Compute the degree of each node

```
# Degree
for node in g.nodes():
    print(node, g.degree(node))
```

```
A 1
B 3
C 2
D 3
E 5
F 1
```

g) Remove the node with the lowest degree.

```
# Remove
g_copy=g.copy()
```

```
g_copy.remove_node('A')
print(g_copy.nodes())
```

2. Consider the 4 web graphs and Implement the Lary and Brin PageRank algorithm with damping as a function $w = \text{PageRank}(B,d)$ that takes as input a damping factor, $d=0.7$, and returns the PageRank of each page till the solution converges.

```
import numpy as np
import numpy.linalg as la
```

```
def pageRank(linkMatrix, d) :
    n = linkMatrix.shape[0]
    # M = d * linkMatrix + (1-d)/n * np.ones([n, n])
    M = d * linkMatrix
    r = 100 * np.ones(n) / n # Sets up this vector (n entries of 1/n × 100
each)
    last = r
    r = M @ r
    for i in range(18):
        last = r
        r = M @ r
    return r
```

```
L = np.array([[0, 1/2, 1/3, 0, 0, 0 ],
               [1/3, 0, 0, 0, 1/2, 0 ],
               [1/3, 1/2, 0, 1, 0, 1/2 ],
               [1/3, 0, 1/3, 0, 1/2, 1/2 ],
               [0, 0, 0, 0, 0, 0 ],
               [0, 0, 1/3, 0, 0, 0 ]])
```

```
pageRank(L, 1)
```

```
array([16.00149917,  5.33252025, 39.99916911, 25.3324738 ,  0.
,
      13.33433767])
```

3. Implement HITS Algorithm and find out the authority score and hub scores of all pages in the below given graphs. Repeat the iterations until the solution converges.

```
import networkx as nx
```

```
def hits(graph, iterations, tolerance=1.0e-8):
    hubs = dict.fromkeys(graph, 1.0 / graph.number_of_nodes())    #{'A': 0.25, 'B': 0.25, 'C': 0.25, 'D': 0.25}
    authorities = {}
    # power iteration, which stops after given iterations or reaching tolerance
    for _ in range(iterations):
        last_hubs = hubs
        hubs = dict.fromkeys(last_hubs.keys(), 0) # {'A': 0, 'B': 0, 'C': 0, 'D': 0}
        authorities = dict.fromkeys(last_hubs.keys(), 0) # {'A': 0, 'B': 0, 'C': 0, 'D': 0}
        for node in hubs:
            for neighbor in graph[node]:
                authorities[neighbor] += last_hubs[node] * graph[node][neighbor].get('weight', 1)
        for node in hubs:
            for neighbor in graph[node]:
                hubs[node] += authorities[neighbor] * graph[node][neighbor].get('weight', 1)
        scaling = 1.0 / max(hubs.values())
        for node in hubs:
            hubs[node] *= scaling
        scaling = 1.0 / max(authorities.values())
        for node in authorities:
            authorities[node] *= scaling
        err = sum([abs(hubs[node] - last_hubs[node]) for node in hubs])
        if err < tolerance:
            break
    return hubs, authorities

G1 = nx.DiGraph()
```

```
G1.add_edges_from([('A', 'B'),
                   ('A', 'C'),
                   ('D', 'C'),
                   ('D', 'C'),
                   ('C', 'A'),
                   ('B', 'C')
                  ])

print(hits(G1, 5))
# ({'A': 1.0, 'B': 0.7071428571428572, 'C': 0.0017857142857142852, 'D':
0.7071428571428572}, {'A': 0.0025252525252525246, 'B': 0.4141414141414141,
'C': 1.0, 'D': 0.0})
```

```
{'A': 1.0, 'B': 0.7071428571428572, 'C': 0.0017857142857142852,
'D': 0.7071428571428572}, {'A': 0.0025252525252525246, 'B':
0.4141414141414141, 'C': 1.0, 'D': 0.0})
```

```
hubs, authorities = nx.hits(G1, max_iter = 5, normalized = True)
print(hubs)
print(authorities)
```

```
{'A': 0.4142135623730951, 'B': 0.2928932188134525, 'C':
-5.714524695237584e-17, 'D': 0.2928932188134525}
{'A': -1.3796083021758554e-16, 'B': 0.2928932188134525, 'C':
0.7071067811865476, 'D': 0.0}
```