

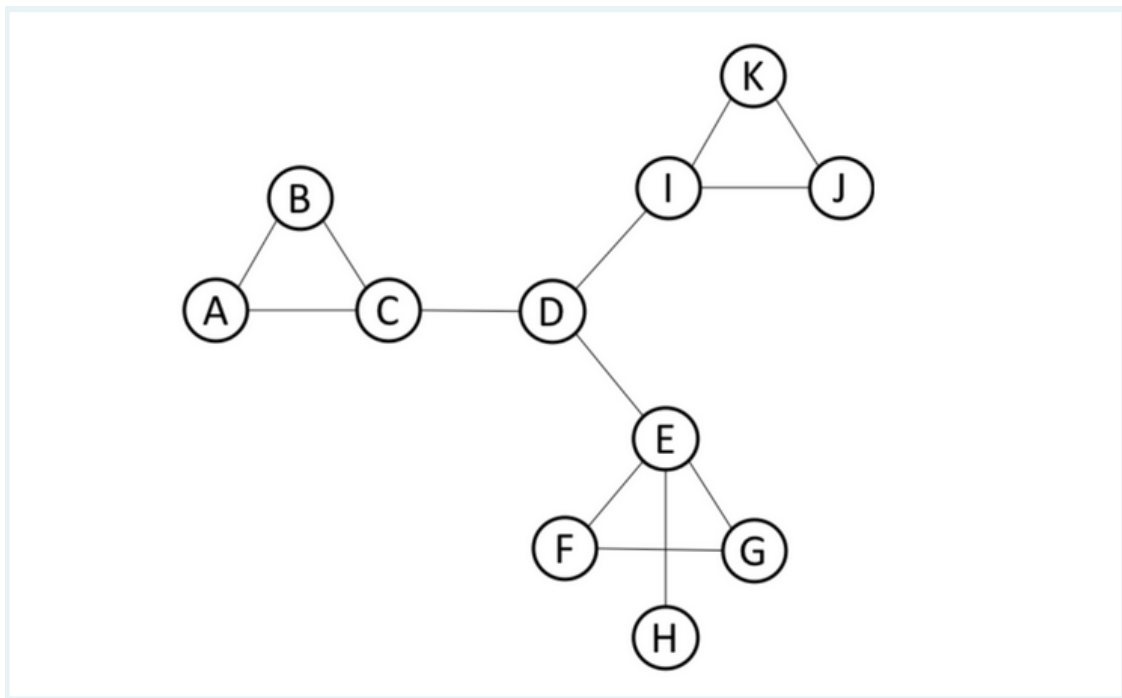
# network\_ana\_25\_assignment\_gn

March 4, 2025

University of Helsinki, Master's Programme in Data Science  
DATA16001 Network Analysis - Spring 2025  
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## 1 Assignment: Girvan-Newman (due on March 4)

Consider the undirected graph in the figure below, and the Girvan-Newman algorithm as defined in the textbook's Section 3.6.A.



**Exercise.** What are the partitions identified by the Girvan-Newman algorithm after 1, 2, 3, 4, and 5 steps? Explain your answer.

Notes:

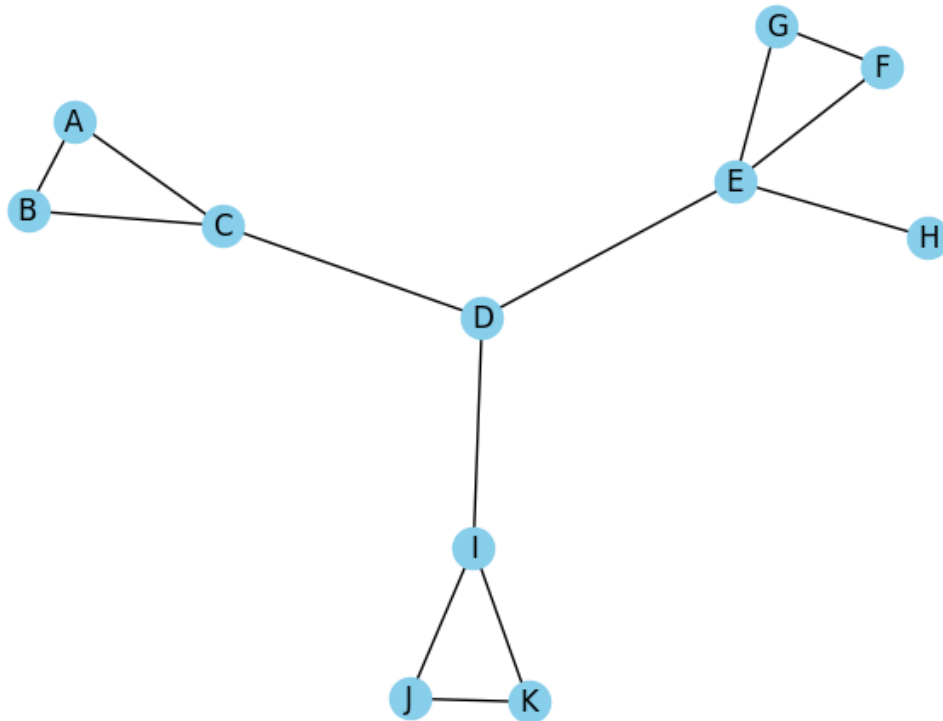
- It is optional to produce figures for your answer. If you do, please attach them (do not insert them in the textbox).
- It is optional to use software for your solution. If you do, please attach it as instructed at the bottom of the assignment.

```
[2]: import networkx as nx
import matplotlib.pyplot as plt
```

```
[3]: graph_edges = [
    ("A", "B"), ("A", "C"), ("B", "C"), ("C", "D"), ("D", "E"), ("D", "I"),
    ("E", "F"),
    ("E", "G"), ("E", "H"), ("F", "G"), ("I", "K"), ("I", "J"), ("J", "K")
]

G = nx.Graph()
G.add_edges_from(graph_edges)
```

```
[4]: pos = nx.spring_layout(G, seed = 12)
nx.draw(G, pos, node_color="skyblue", with_labels = True)
plt.show()
```



```
[5]: print(f"initial edge betweenness centrality list:")
print(f"{nx.edge_betweenness_centrality(G)}")
print(f"sorted initial edge betweenness centrality list:")
```

```
print(f"{sorted(nx.edge_betweenness centrality(G).items(), key = lambda item:
↪item[1], reverse = True)}")
```

initial edge betweenness centrality list:

```
{('A', 'B'): 0.01818181818181818, ('A', 'C'): 0.16363636363636364, ('B', 'C'):
0.16363636363636364, ('C', 'D'): 0.43636363636363634, ('D', 'E'):
0.50909090909090909, ('D', 'I'): 0.43636363636363634, ('E', 'F'):
0.16363636363636364, ('E', 'G'): 0.16363636363636364, ('E', 'H'):
0.18181818181818182, ('I', 'K'): 0.16363636363636364, ('I', 'J'):
0.16363636363636364, ('F', 'G'): 0.01818181818181818, ('K', 'J'):
0.01818181818181818}
```

sorted initial edge betweenness centrality list:

```
[(('D', 'E'), 0.50909090909090909), (('C', 'D'), 0.43636363636363634), (('D',
'I'), 0.43636363636363634), (('E', 'H'), 0.18181818181818182), (('A', 'C'),
0.16363636363636364), (('B', 'C'), 0.16363636363636364), (('E', 'F'),
0.16363636363636364), (('E', 'G'), 0.16363636363636364), (('I', 'K'),
0.16363636363636364), (('I', 'J'), 0.16363636363636364), (('A', 'B'),
0.01818181818181818), (('F', 'G'), 0.01818181818181818), (('K', 'J'),
0.01818181818181818)]
```

```
[6]: def gn(G, iterations):
    graph = G.copy()
    for i in range(iterations):
        edge_betweenness = nx.edge_betweenness centrality(
            graph
            ,k = None
            ,normalized = True
            ,weight = None
            ,seed = None
        )
        sorted_edge_betweenness = dict(
            sorted(edge_betweenness.items(), key = lambda item:
↪item[1], reverse = True)
        )
        highest_edge_betweenness = list(sorted_edge_betweenness.
↪values())[0] if len(list(sorted_edge_betweenness.values())) > 0 else 0
        highest_edge_betweenness_list = [key for key, x in
↪sorted_edge_betweenness.items() if x == highest_edge_betweenness]
        print(f"iteration: { i + 1 }")
        print(f"removed edge list: {highest_edge_betweenness_list}, for
↪edge betweenness value: {highest_edge_betweenness}")
        graph.remove_edges_from(highest_edge_betweenness_list)
    return graph
```

```
[7]: one_step_graph = gn(G, 1)
two_step_graph = gn(one_step_graph, 1)
three_step_graph = gn(two_step_graph, 1)
```

```
four_step_graph = gn(three_step_graph, 1)
five_step_graph = gn(four_step_graph, 1)
```

```
iteration: 1
removed edge list: [('D', 'E')], for edge betweenness value: 0.509090909090909
iteration: 1
removed edge list: [('C', 'D'), ('D', 'I')], for edge betweenness value:
0.21818181818181817
iteration: 1
removed edge list: [('E', 'H')], for edge betweenness value: 0.05454545454545454
iteration: 1
removed edge list: [('A', 'B'), ('A', 'C'), ('B', 'C'), ('E', 'F'), ('E', 'G'),
('I', 'K'), ('I', 'J'), ('F', 'G'), ('K', 'J')], for edge betweenness value:
0.01818181818181818
iteration: 1
removed edge list: [], for edge betweenness value: 0
```

```
[8]: from matplotlib.patches import Rectangle
graph_list = [G, one_step_graph, two_step_graph, three_step_graph,
↳four_step_graph, five_step_graph]
fig, axs = plt.subplots(2, 3, figsize = (15, 10))

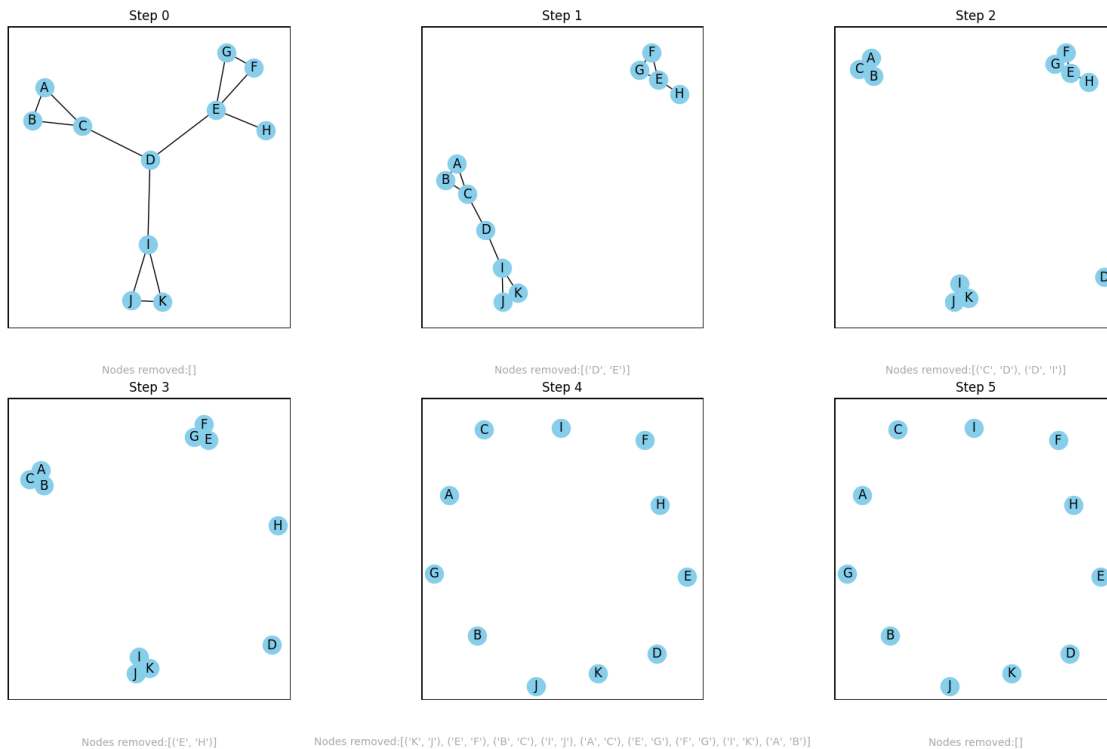
prev_graph = graph_list[0].copy()
for idx, graph in enumerate(graph_list):
    row = idx // 3 # row index (0 for first row, 1 for second)
    col = idx % 3 # column index (0, 1, or 2)
    pos = nx.spring_layout(graph, seed = 12)
    nx.draw(graph, pos = pos, ax = axs[row, col], node_color = "skyblue",
↳with_labels = True)
    axs[row, col].set_title(f"Step {idx}")
    removed_nodes = set(prev_graph.edges()).symmetric_difference(set(graph.
↳edges()))
    axs[row, col].text(0.5, -0.15, f"Nodes removed:{list(removed_nodes)}",
                        transform=axs[row, col].transAxes,
                        ha="center", fontsize=10,
↳color="darkgrey")

    for spine in axs[row, col].spines.values():
        spine.set_edgecolor("black")
        spine.set_linewidth(1.5)

    rect = Rectangle((0, 0), 1, 1, transform = axs[row, col].transAxes,
↳fill = False, edgecolor = "black", linewidth = 2)
    axs[row, col].add_patch(rect)
    prev_graph = graph.copy()

plt.tight_layout() # Adjust spacing between plots
```

```
plt.show()
```



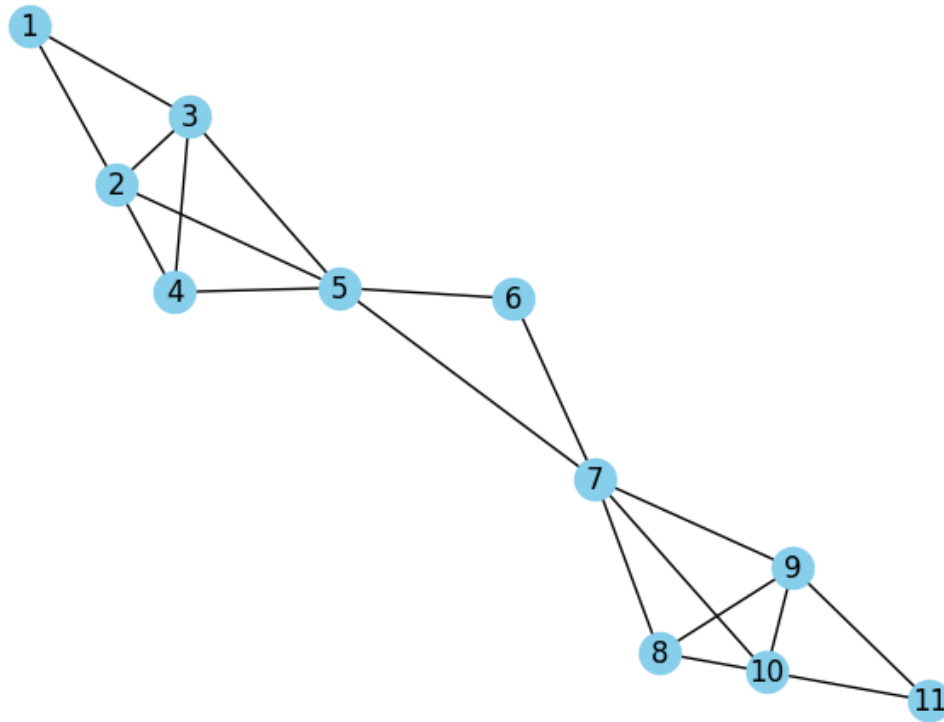
### 1.0.1 Answer

We can be seen from the plots that after 1 step the graph is split in 2 partitions,  $\{A, B, C, D, I, J, K\}$  and  $\{E, F, G, H\}$  because the highest edge betweenness is found in  $(D, E)$  with value  $\sim 0.5$ . After 2 steps the graph is split in 4 partitions  $\{A, B, C\}$ ,  $\{D\}$ ,  $\{E, F, G, H\}$  and  $\{I, J, K\}$ , with highest edge betweenness found in  $(C, D)$  and  $(D, I)$  with value  $\sim 0.22$ . After 3 steps the graph is split in 5 partitions  $\{A, B, C\}$ ,  $\{D\}$ ,  $\{E, F, G\}$ ,  $\{H\}$  and  $\{I, J, K\}$  with highest edge betweenness found in  $(E, H)$  for edge betweenness value  $\sim 0.05$ . After 4 steps the graph remains without edges since the edge betweenness is positive constant between all edges remaining.

```
[9]: textbook_graph_edges = [
    ("1", "2"), ("1", "3"), ("2", "3"), ("2", "4"), ("2", "5"), ("3", "4"),
    ("3", "5"),
    ("4", "5"), ("5", "6"), ("5", "7"), ("6", "7"), ("7", "8"), ("7",
    ("7", "9"), ("7", "10"), ("8", "9"),
    ("8", "10"), ("9", "10"), ("9", "11"), ("10", "11")
]

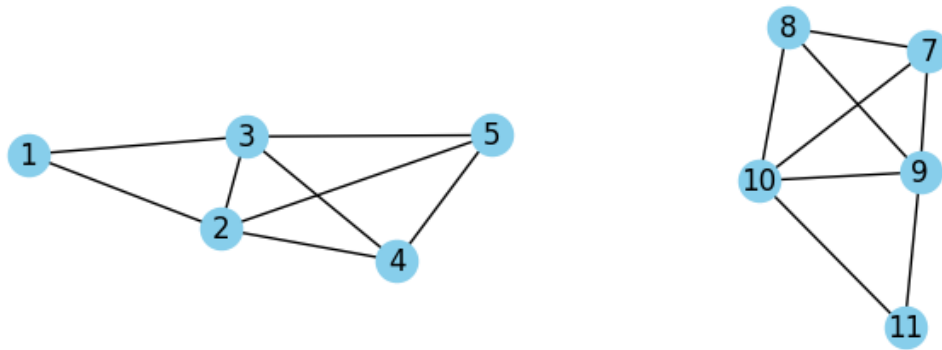
textbook_graph = nx.Graph()
textbook_graph.add_edges_from(textbook_graph_edges)
```

```
[10]: pos = nx.spring_layout(textbook_graph, seed = 12)
      nx.draw(textbook_graph, pos, node_color="skyblue", with_labels = True)
      plt.show()
```



```
[11]: two_step_textbook_graph = gn(textbook_graph, 2)
      pos = nx.spring_layout(two_step_textbook_graph, seed = 12, k = 0.3, iterations=
      ↪ 20)
      nx.draw(two_step_textbook_graph, pos, node_color="skyblue", with_labels = True)
      plt.show()
```

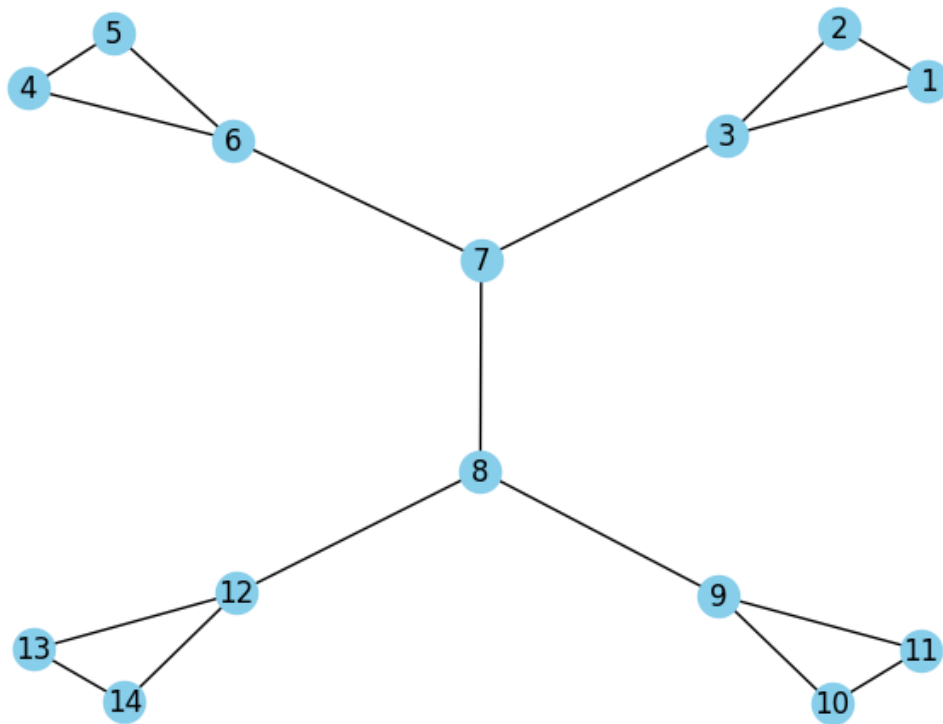
```
iteration: 1
removed edge list: [('5', '7')], for edge betweenness value: 0.45454545454545453
iteration: 2
removed edge list: [('5', '6'), ('6', '7')], for edge betweenness value:
0.5454545454545454
```



```
[12]: textbook_graph_2_edges = [
    ("1", "2"), ("1", "3"), ("2", "3"), ("3", "7"), ("4", "5"), ("4", "6"),
    ("5", "6"),
    ("6", "7"), ("7", "8"), ("8", "9"), ("8", "12"), ("9", "10"), ("9",
    ("10", "11"), ("12", "13"),
    ("12", "14"), ("13", "14")
]
```

```
textbook_graph_2 = nx.Graph()
textbook_graph_2.add_edges_from(textbook_graph_2_edges)
```

```
[13]: pos = nx.spring_layout(textbook_graph_2, seed = 13)
nx.draw(textbook_graph_2, pos, node_color="skyblue", with_labels = True)
plt.show()
```



```
[14]: two_step_textbook_graph_2 = gn(textbook_graph_2, 2)
pos = nx.spring_layout(two_step_textbook_graph_2, seed = 12, k = 0.3,
↳ iterations = 20)
nx.draw(two_step_textbook_graph_2, pos, node_color="skyblue", with_labels =
↳ True)
plt.show()
```

```
iteration: 1
removed edge list: [('7', '8')], for edge betweenness value: 0.5384615384615385
iteration: 2
removed edge list: [('3', '7'), ('7', '6'), ('8', '9'), ('8', '12')], for edge
betweenness value: 0.13186813186813187
```



