

## Questionário 5: Detecção de comunidades

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Disciplina: Redes Complexas (SME0130)

```
In [1]: import numpy as np
import matplotlib.pyplot as plt
import networkx as nx
from networkx.algorithms import community
np.random.seed(50)
```

```
In [2]: from networkx.algorithms.community import greedy_modularity_communities
```

```
In [3]: import community as community_louvain
```

```
In [4]: def modularity(G, c):
    A = nx.adjacency_matrix(G)
    N = len(G)
    M = G.number_of_edges()
    Q = 0
    for i in np.arange(0,N):
        ki = len(list(G.neighbors(i)))
        for j in np.arange(0,N):
            if(c[i]==c[j]):
                kj = len(list(G.neighbors(j)))
                Q = Q + A[i,j]-(ki*kj)/(2*M)
    Q = Q/(2*M)
    return Q
```

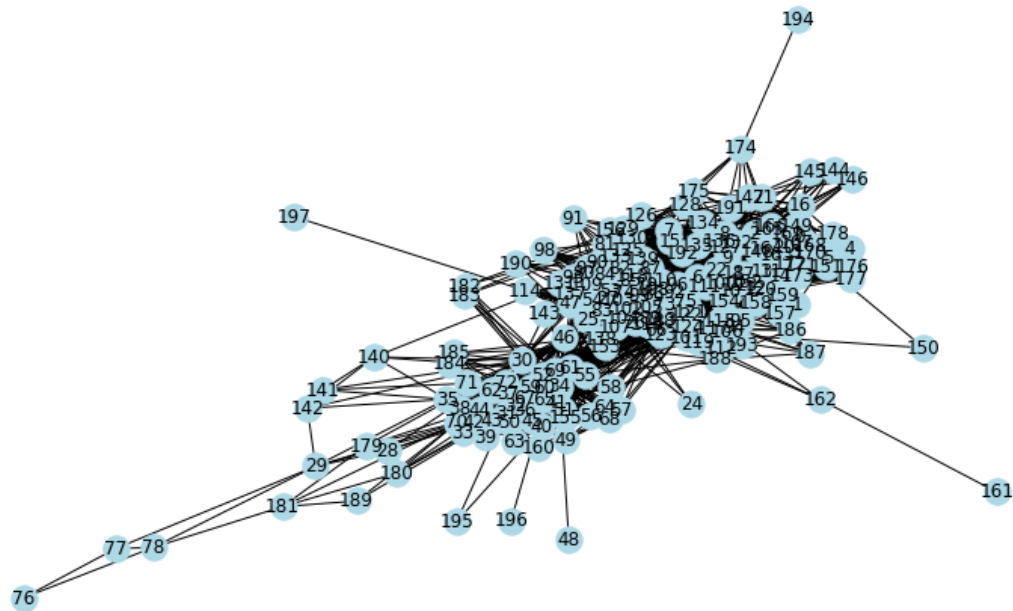
```
In [5]: def ler_G(endereco):
    G= nx.read_edgelist(endereco, nodetype=int)
    # nodes_original = G.nodes
    G = G.to_undirected()
    G.remove_edges_from(nx.selfloop_edges(G))
    Gcc = sorted(nx.connected_components(G), key=len, reverse=True)
    e)
    G = G.subgraph(Gcc[0])
    G = nx.convert_node_labels_to_integers(G, first_label=0)
    return G
```

```
In [6]: colors = ['red', 'blue', 'green', 'black', 'magenta', 'yellow', 'white']
```

**1 -Calcule a modularidade para a rede Jazz usando método fastgreedy.**

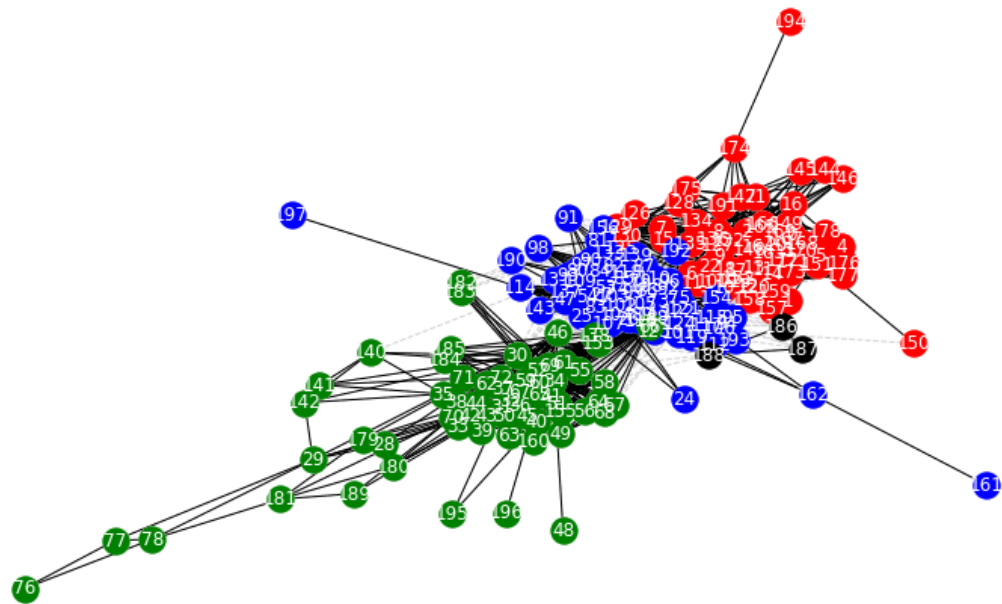
```
In [7]: G = ler_G("data/jazz.txt")

pos=nx.spring_layout(G)
fig= plt.figure(figsize=(10,6))
nx.draw(G, pos=pos, node_color = 'lightblue', with_labels = True)
plt.show(True)
```



```
In [8]: communities = list(greedy_modularity_communities(G))
# for k in range(0,len(communities)):
#     print('Community',k,':', sorted(communities[k]))
```

```
In [9]: fig= plt.figure(figsize=(10,6))
nx.draw(G, pos=pos, node_color = 'white', edge_color='lightgray',
style='dashed')
aux = 0
for cm in communities:
    nx.draw(G.subgraph(cm), pos=pos, node_color = colors[aux],
            with_labels = True, node_size=300, font_color =
r = 'white')
    aux = aux + 1
# plt.savefig('Jazz.eps') #save the figure into a file
plt.show(True)
```



```
In [10]: c = list(greedy_modularity_communities(G))
communities = np.zeros(len(G.nodes()))
nc = 0
for k in range(0,len(c)):
    communities[sorted(c[k])]=nc
    nc = nc+1
# print('Community:', sorted(c[k]))
# print(communities)
```

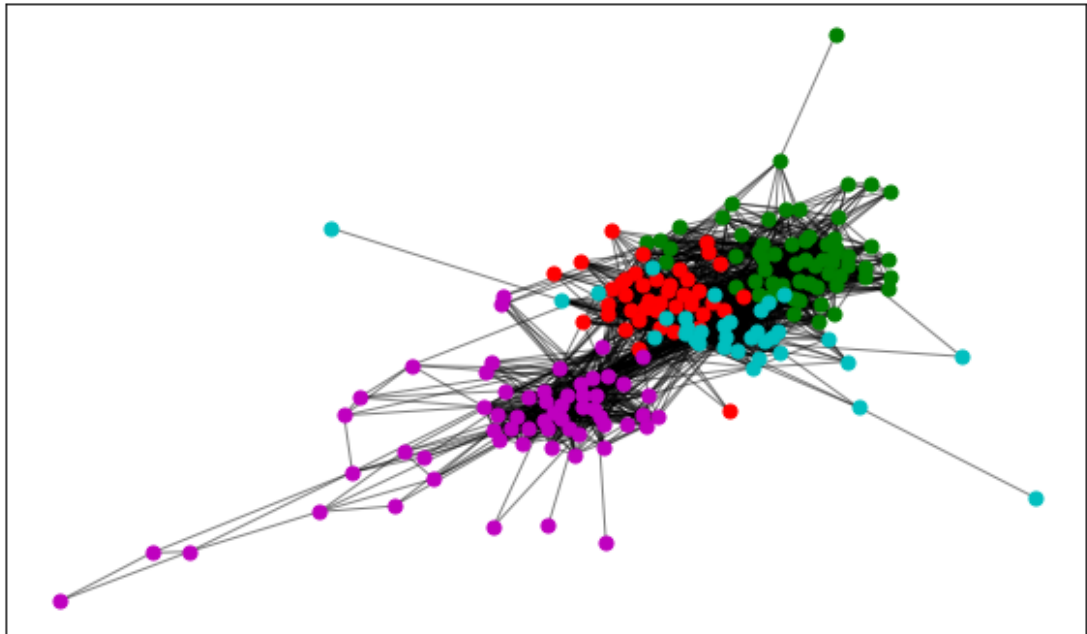
```
In [11]: print("Modularity Q = ", modularity(G,communities))

Modularity Q = 0.4389078153753761
```

## 2 -Calcule a modularidade para a rede Jazz usando método Louvain.

```
In [12]: partition = community_louvain.best_partition(G)
```

```
In [13]: #drawing
fig= plt.figure(figsize=(10,6))
size = float(len(set(partition.values())))
count = 0
for com in set(partition.values()) :
    count = count + 1.
    list_nodes = [nodes for nodes in partition.keys() if partition[nodes] == com]
    nx.draw_networkx_nodes(G, pos, list_nodes, node_size = 50, node_color = colors[int(count)])
nx.draw_networkx_edges(G, pos, alpha=0.5)
plt.show()
```



```
In [14]: print("Modularity Q = ", modularity(G,partition))
```

```
Modularity Q = 0.44021125576638676
```

**3 - Considere o método de geração de redes `LFR_benchmark_graph`. Obtenha os valores da modularidade para  $\mu=0.05$ ,  $\mu=0.1$  e  $\mu=0.2$ . Use o algoritmo de Louvain.**

```

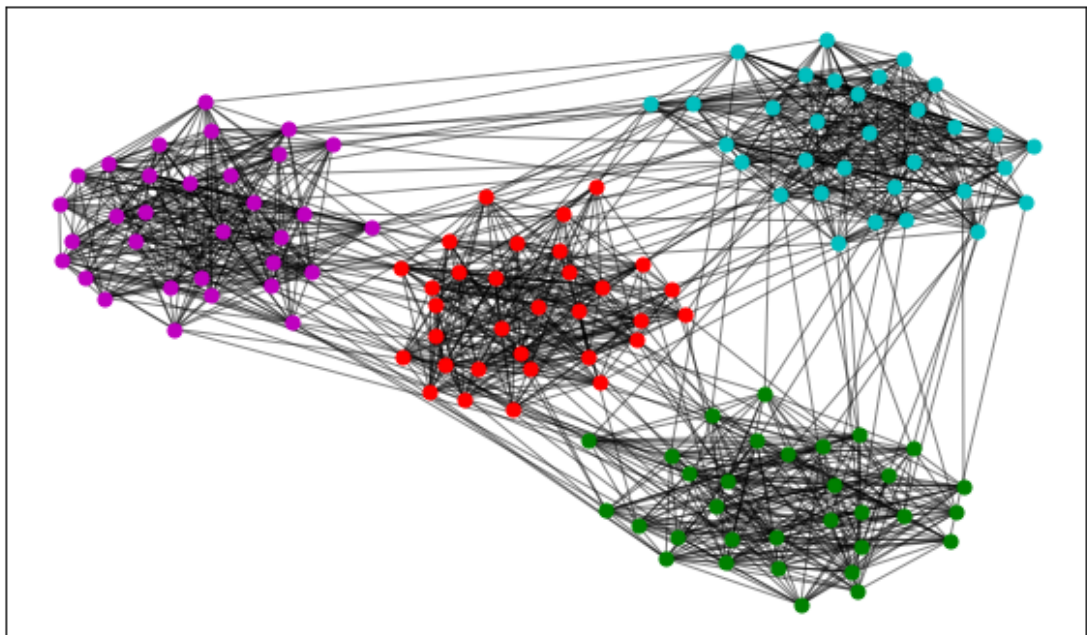
In [15]: N = 128
        tau1 = 3
        tau2 = 1.5
        k = 16
        minc = 32
        maxc = 32
        mu = 0.05

        G = nx.LFR_benchmark_graph(n = N, tau1 = tau1, tau2 = tau2, mu =
        mu, min_degree = k, max_degree = k, min_community=minc, max_commu
        nity = maxc, seed = 10)
        pos=nx.spring_layout(G)
        # fig= plt.figure(figsize=(10,6))
        # nx.draw(G, pos=pos, node_color = 'lightblue', with_labels = Tru
        e)
        # plt.show(True)

        partition = community_louvain.best_partition(G)
        #drawing
        fig= plt.figure(figsize=(10,6))
        size = float(len(set(partition.values())))
        count = 0
        for com in set(partition.values()) :
            count = count + 1.
            list_nodes = [nodes for nodes in partition.keys() if partiti
            on[nodes] == com]
            nx.draw_networkx_nodes(G, pos, list_nodes, node_size = 50, no
            de_color = colors[int(count)])
            nx.draw_networkx_edges(G, pos, alpha=0.5)
            plt.show()

        print("Modularity Q para mu 0.05 = ", modularity(G,partition))

```



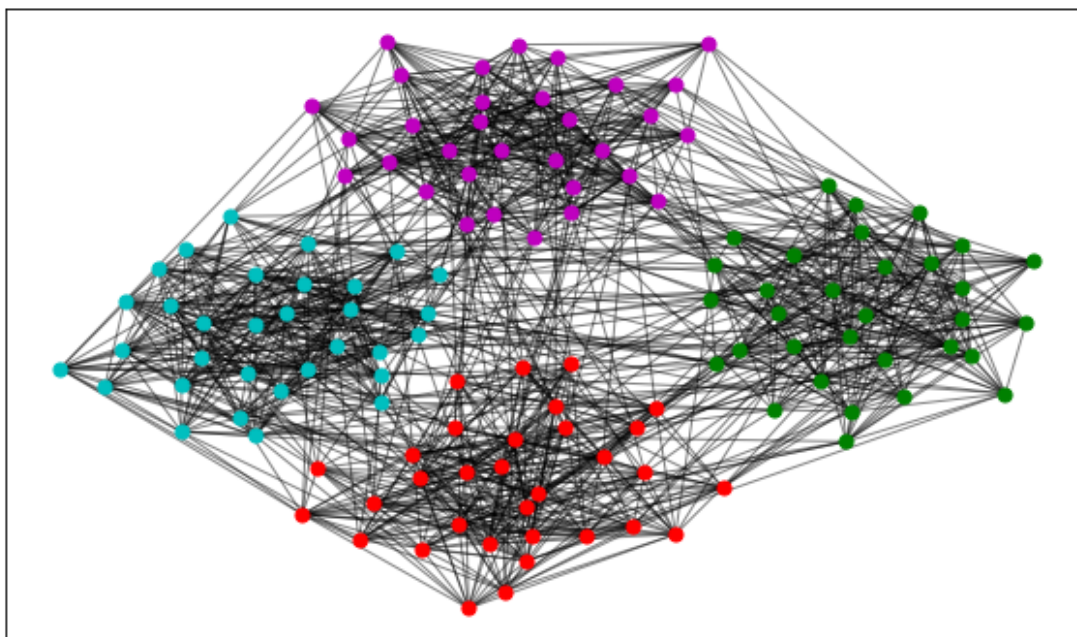
Modularity Q para mu 0.05 = 0.643639535397838

In [16]: mu = 0.1

```
G = nx.LFR_benchmark_graph(n = N, tau1 = tau1, tau2 = tau2, mu =
mu, min_degree = k, max_degree = k, min_community=minc, max_commu
nity = maxc, seed = 10)
pos=nx.spring_layout(G)
# fig= plt.figure(figsize=(10,6))
# nx.draw(G, pos=pos, node_color = 'lightblue', with_labels = Tru
e)
# plt.show(True)

partition = community_louvain.best_partition(G)
#drawing
fig= plt.figure(figsize=(10,6))
size = float(len(set(partition.values())))
count = 0
for com in set(partition.values()) :
    count = count + 1.
    list_nodes = [nodes for nodes in partition.keys() if partiti
on[nodes] == com]
    nx.draw_networkx_nodes(G, pos, list_nodes, node_size = 50, no
de_color = colors[int(count)])
nx.draw_networkx_edges(G, pos, alpha=0.5)
plt.show()

print("Modularity Q para mu 0.1 = ", modularity(G,partition))
```



Modularity Q para mu 0.1 = 0.5427818606053953

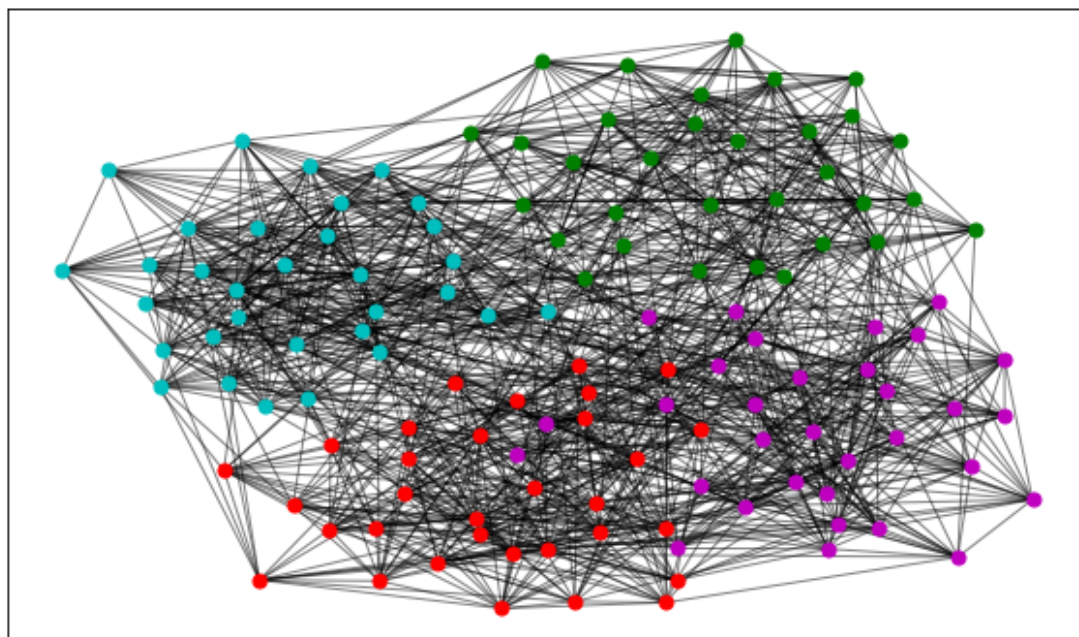


In [17]: mu = 0.2

```
G = nx.LFR_benchmark_graph(n = N, tau1 = tau1, tau2 = tau2, mu =
mu, min_degree = k, max_degree = k, min_community=minc, max_commu
nity = maxc, seed = 10)
pos=nx.spring_layout(G)
# fig= plt.figure(figsize=(10,6))
# nx.draw(G, pos=pos, node_color = 'lightblue', with_labels = Tru
e)
# plt.show(True)

partition = community_louvain.best_partition(G)
#drawing
fig= plt.figure(figsize=(10,6))
size = float(len(set(partition.values())))
count = 0
for com in set(partition.values()) :
    count = count + 1.
    list_nodes = [nodes for nodes in partition.keys() if partiti
on[nodes] == com]
    nx.draw_networkx_nodes(G, pos, list_nodes, node_size = 50, no
de_color = colors[int(count)])
nx.draw_networkx_edges(G, pos, alpha=0.5)
plt.show()

print("Modularity Q para mu 0.2 = ", modularity(G,partition))
```



Modularity Q para mu 0.2 = 0.44487909975820294

**4-Considere o método de geração de redes `LFR_benchmark_graph`. Obtenha os valores da modularidade para  $\mu = 0.05$ ,  $\mu = 0.1$  e  $\mu = 0.2$ . Use o algoritmo `fastgreedy`.**

```

In [18]: N = 128
         tau1 = 3
         tau2 = 1.5
         k = 16
         minc = 32
         maxc = 32
         mu = 0.05

         G = nx.LFR_benchmark_graph(n = N, tau1 = tau1, tau2 = tau2, mu =
mu, min_degree = k, max_degree = k, min_community=minc, max_commu
nity = maxc, seed = 10)
         pos=nx.spring_layout(G)
         # fig= plt.figure(figsize=(10,6))
         # nx.draw(G, pos=pos, node_color = 'lightblue', with_labels = True)
         # plt.show(True)

         communities = list(greedy_modularity_communities(G))
         # for k in range(0,len(communities)):
         #     print('Community',k,':', sorted(communities[k]))

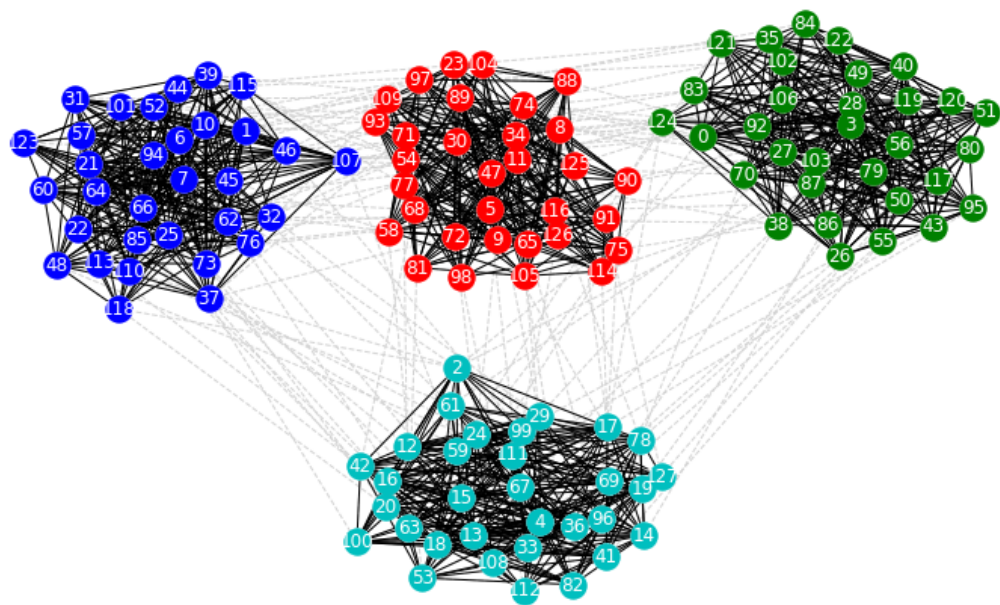
         fig= plt.figure(figsize=(10,6))
         nx.draw(G, pos=pos, node_color = 'white', edge_color='lightgray',
style='dashed')
         aux = 0
         for cm in communities:
             nx.draw(G.subgraph(cm), pos=pos, node_color = colors[aux],
                     with_labels = True, node_size=300, font_colo
r = 'white')
             aux = aux + 1
         plt.savefig('Jazz.eps') #save the figure into a file
         plt.show(True)

         c = list(greedy_modularity_communities(G))
         communities = np.zeros(len(G.nodes()))
         nc = 0
         for k in range(0,len(c)):
             communities[sorted(c[k])]=nc
             nc = nc+1
         #     print('Community:', sorted(c[k]))
         # print(communities)

         print("Modularity Q para mu 0.05 = ", modularity(G,communities))

```





Modularity Q para  $\mu = 0.05 = 0.643639535397838$

```

In [24]: N = 128
        tau1 = 3
        tau2 = 1.5
        k = 16
        minc = 32
        maxc = 32
        mu = 0.1

        G = nx.LFR_benchmark_graph(n = N, tau1 = tau1, tau2 = tau2, mu =
mu, min_degree = k, max_degree = k, min_community=minc, max_commu
nity = maxc, seed = 10)
        pos=nx.spring_layout(G)
        # fig= plt.figure(figsize=(10,6))
        # nx.draw(G, pos=pos, node_color = 'lightblue', with_labels = True)
        # plt.show(True)

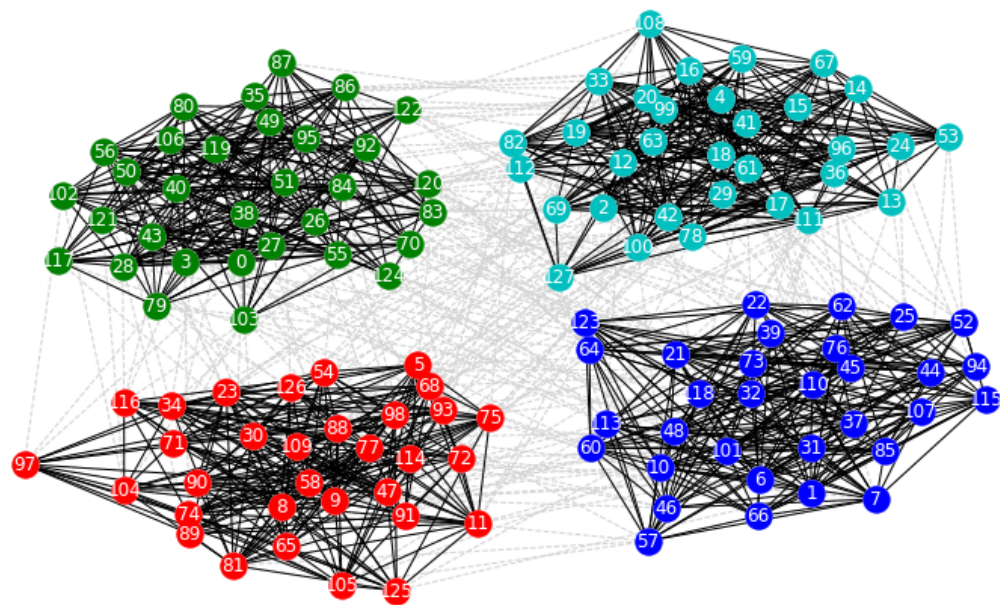
        communities = list(greedy_modularity_communities(G))
        # for k in range(0,len(communities)):
        #     print('Community',k,':', sorted(communities[k]))

        fig= plt.figure(figsize=(10,6))
        nx.draw(G, pos=pos, node_color = 'white', edge_color='lightgray',
style='dashed')
        aux = 0
        for cm in communities:
            nx.draw(G.subgraph(cm), pos=pos, node_color = colors[aux],
                    with_labels = True, node_size=300, font_color
r = 'white')
            aux = aux + 1
        plt.savefig('Jazz.eps') #save the figure into a file
        plt.show(True)

        c = list(greedy_modularity_communities(G))
        communities = np.zeros(len(G.nodes()))
        nc = 0
        for k in range(0,len(c)):
            communities[sorted(c[k])]=nc
            nc = nc+1
        #     print('Community:', sorted(c[k]))
        # print(communities)

        print("Modularity Q para mu 0.1 = ", modularity(G,communities))

```



Modularity Q para  $\mu 0.1 = 0.5427818606053953$

```

In [25]: N = 128
        tau1 = 3
        tau2 = 1.5
        k = 16
        minc = 32
        maxc = 32
        mu = 0.2

        G = nx.LFR_benchmark_graph(n = N, tau1 = tau1, tau2 = tau2, mu =
mu, min_degree = k, max_degree = k, min_community=minc, max_commu
nity = maxc, seed = 10)
        pos=nx.spring_layout(G)
        # fig= plt.figure(figsize=(10,6))
        # nx.draw(G, pos=pos, node_color = 'lightblue', with_labels = True)
        # plt.show(True)

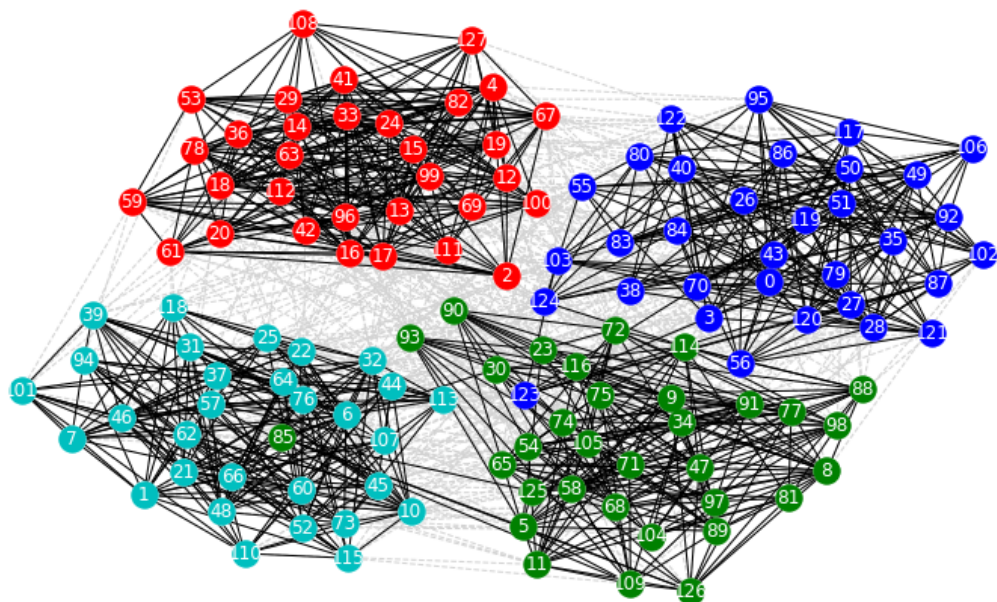
        communities = list(greedy_modularity_communities(G))
        # for k in range(0,len(communities)):
        #     print('Community',k,':', sorted(communities[k]))

        fig= plt.figure(figsize=(10,6))
        nx.draw(G, pos=pos, node_color = 'white', edge_color='lightgray',
style='dashed')
        aux = 0
        for cm in communities:
            nx.draw(G.subgraph(cm), pos=pos, node_color = colors[aux],
                    with_labels = True, node_size=300, font_color
r = 'white')
            aux = aux + 1
        plt.savefig('Jazz.eps') #save the figure into a file
        plt.show(True)

        c = list(greedy_modularity_communities(G))
        communities = np.zeros(len(G.nodes()))
        nc = 0
        for k in range(0,len(c)):
            communities[sorted(c[k])]=nc
            nc = nc+1
        #     print('Community:', sorted(c[k]))
        # print(communities)

        print("Modularity Q para mu 0.2 = ", modularity(G,communities))

```



Modularity Q para  $\mu = 0.2 = 0.4349088598177227$