

# Master Informatique, parcours MALIA & MIAHS

Carnets de note Python pour le cours de Network Analysis for Information Retrieval

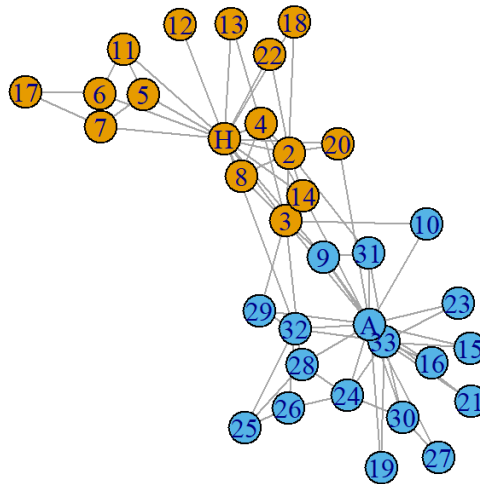
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## Prérequis

```
In [5]: from torch_geometric.datasets import karate
import networkx as nx
from torch_geometric.utils import to_networkx
```

## Visualisation d'un graphe "jouet"

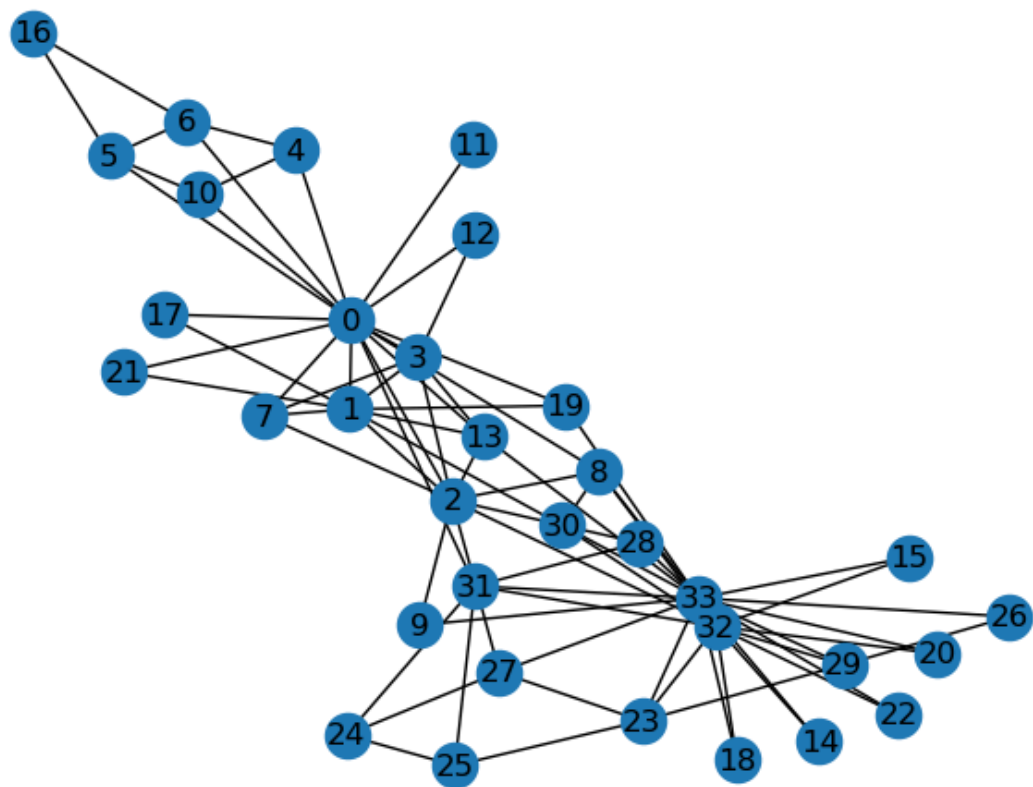
Zachary's Karate Network



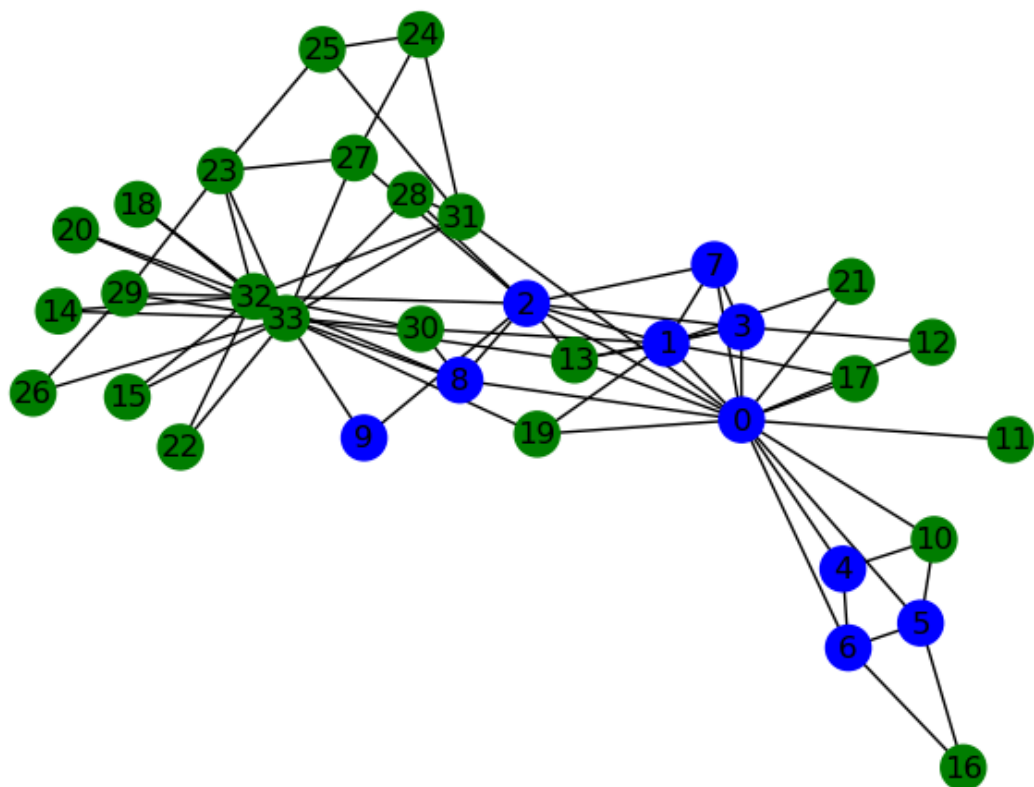
```
In [1]: dataset = karate.KarateClub()
dataset._data
```

```
Out[1]: Data(x=[34, 34], edge_index=[2, 156], y=[34], train_mask=[34])
```

```
In [2]: g = to_networkx(dataset._data, to_undirected=True)
        nx.draw(g, with_labels=True)
```



```
In [3]: color_map = []
        for node in g:
            if node < 10:
                color_map.append('blue')
            else:
                color_map.append('green')
        nx.draw(g, node_color=color_map, with_labels=True)
```



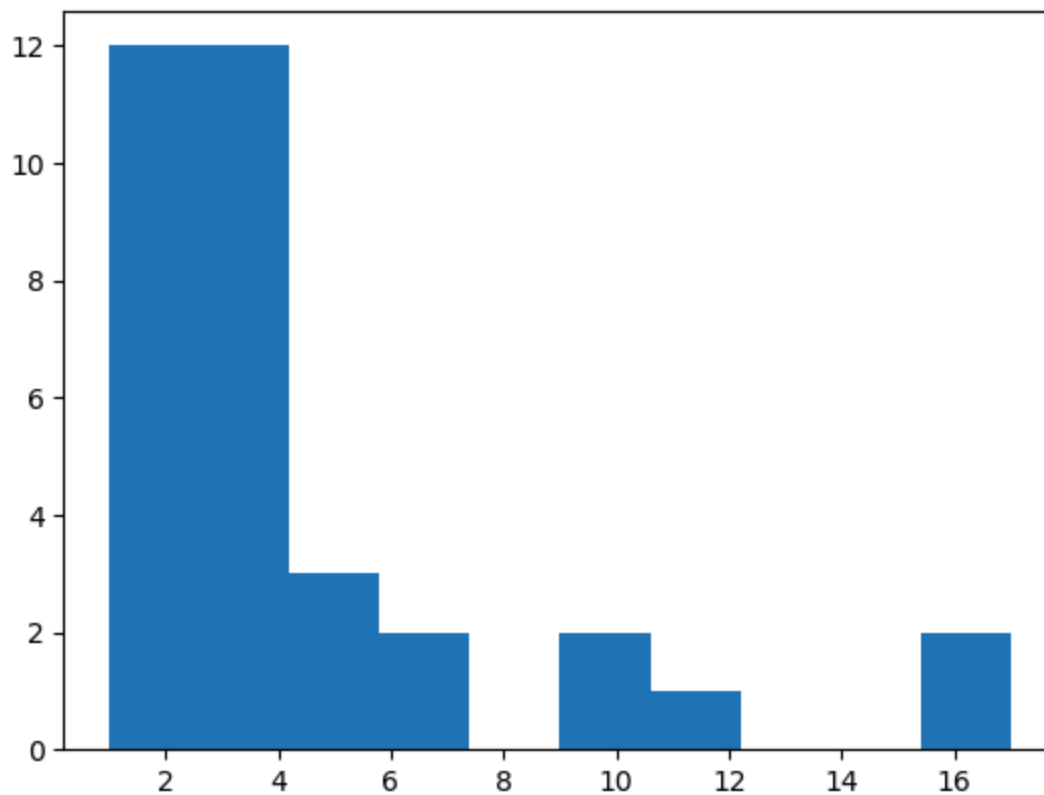
In [20]: `list(g.adj[1])`

Out[20]: `[0, 2, 3, 7, 13, 17, 19, 21, 30]`

In [21]: `g.degree()`

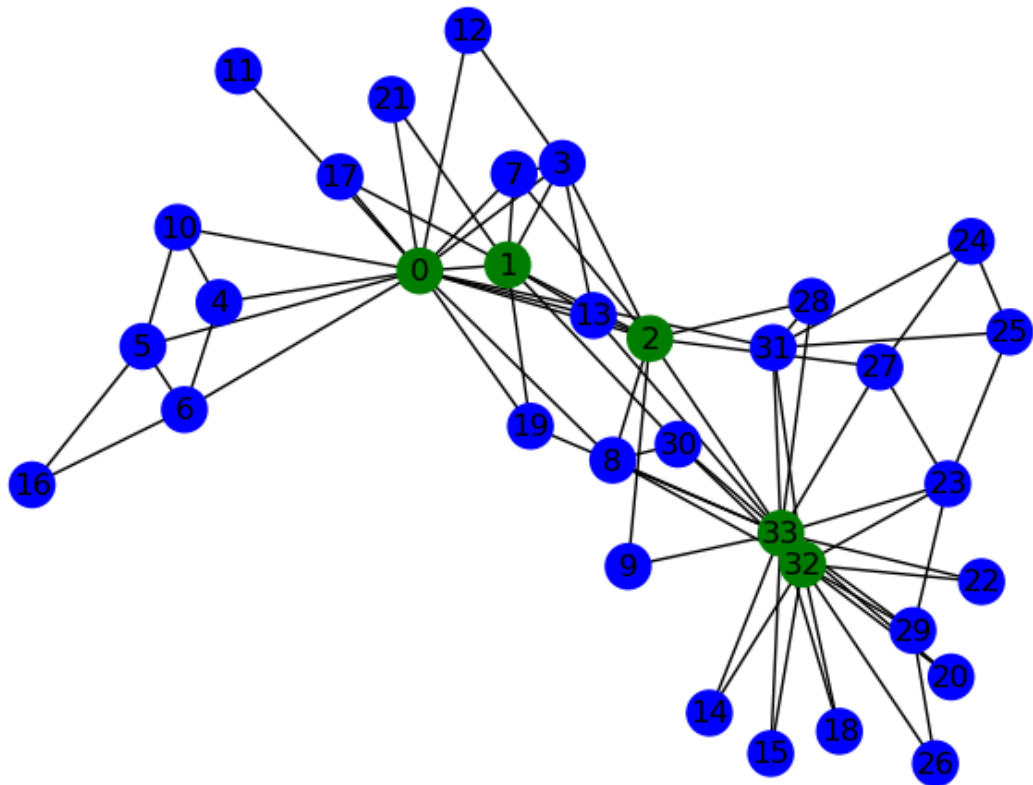
Out[21]: `DegreeView({0: 16, 1: 9, 2: 10, 3: 6, 4: 3, 5: 4, 6: 4, 7: 4, 8: 5, 9: 2, 10: 3, 11: 1, 12: 2, 13: 5, 14: 2, 15: 2, 16: 2, 17: 2, 18: 2, 19: 3, 20: 2, 21: 2, 22: 2, 23: 5, 24: 3, 25: 3, 26: 2, 27: 4, 28: 3, 29: 4, 30: 4, 31: 6, 32: 12, 33: 17})`

In [22]: `import numpy as np  
import matplotlib.pyplot as plt  
d_degree = dict(g.degree())  
n, bins, patches = plt.hist(d_degree.values())  
plt.show()`



```
In [23]: color_map = []
for node in g:
    if d_degree[node]<8:
        color_map.append('blue')
    else:
        color_map.append('green')
nx.draw(g, node_color=color_map, with_labels=True)
```





In [24]: `g.adj`

Out[24]: AdjacencyView({0: {1: {}, 2: {}, 3: {}, 4: {}, 5: {}, 6: {}, 7: {}, 8: {}, 10: {}, 11: {}, 12: {}, 13: {}, 17: {}, 19: {}, 21: {}, 31: {}}, 1: {0: {}, 2: {}, 3: {}, 7: {}, 13: {}, 17: {}, 19: {}, 21: {}, 30: {}}, 2: {0: {}, 1: {}, 3: {}, 7: {}, 8: {}, 9: {}, 13: {}, 27: {}, 28: {}, 32: {}}, 3: {0: {}, 1: {}, 2: {}, 7: {}, 12: {}, 13: {}}, 4: {0: {}, 6: {}, 10: {}}, 5: {0: {}, 6: {}, 10: {}, 16: {}}, 6: {0: {}, 4: {}, 5: {}, 16: {}}, 7: {0: {}, 1: {}, 2: {}, 3: {}}, 8: {0: {}, 2: {}, 30: {}, 32: {}, 33: {}}, 9: {2: {}, 33: {}}, 10: {0: {}, 4: {}, 5: {}}, 11: {0: {}}, 12: {0: {}, 3: {}}, 13: {0: {}, 1: {}, 2: {}, 3: {}, 33: {}}, 14: {32: {}, 33: {}}, 15: {32: {}, 33: {}}, 16: {5: {}, 6: {}}, 17: {0: {}, 1: {}}, 18: {32: {}, 33: {}}, 19: {0: {}, 1: {}, 33: {}}, 20: {32: {}, 33: {}}, 21: {0: {}, 1: {}}, 22: {32: {}, 33: {}}, 23: {25: {}, 27: {}, 29: {}, 32: {}, 33: {}}, 24: {25: {}, 27: {}, 31: {}}, 25: {23: {}, 24: {}, 31: {}}, 26: {29: {}, 33: {}}, 27: {2: {}, 23: {}, 24: {}, 33: {}}, 28: {2: {}, 31: {}, 33: {}}, 29: {23: {}, 26: {}, 32: {}, 33: {}}, 30: {1: {}, 8: {}, 32: {}, 33: {}}, 31: {0: {}, 24: {}, 25: {}, 28: {}, 32: {}, 33: {}}, 32: {2: {}, 8: {}, 14: {}, 15: {}, 18: {}, 20: {}, 22: {}, 23: {}, 29: {}, 30: {}, 31: {}, 33: {}}, 33: {8: {}, 9: {}, 13: {}, 14: {}, 15: {}, 18: {}, 19: {}, 20: {}, 22: {}, 23: {}, 26: {}, 27: {}, 28: {}, 29: {}, 30: {}, 31: {}, 32: {}})

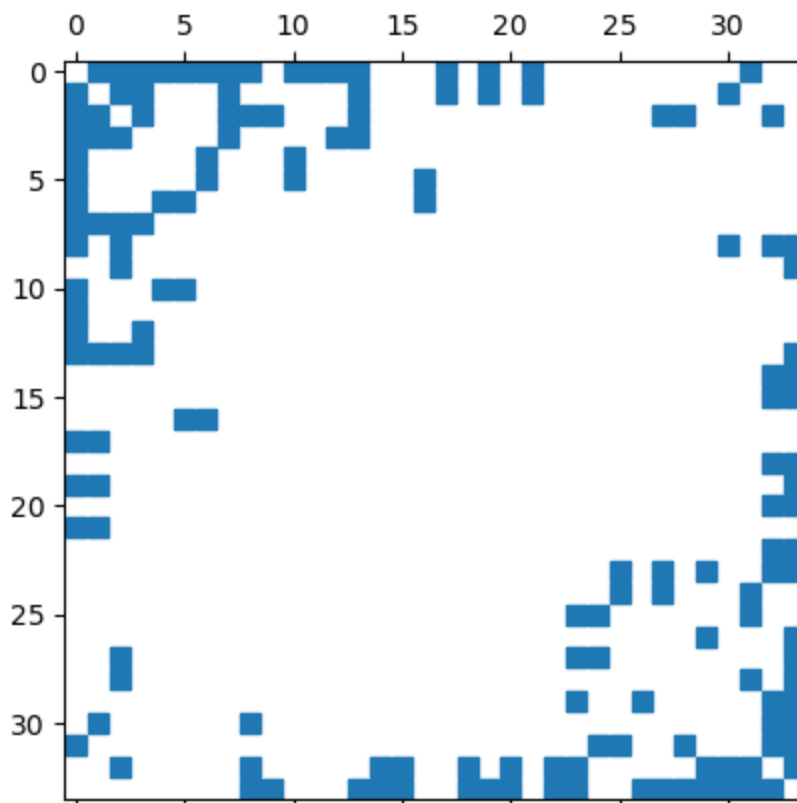
In [25]: `A = nx.to_scipy_sparse_array(g)`

In [26]: `A.todense()`

```
Out[26]: array([[0, 1, 1, ..., 1, 0, 0],
               [1, 0, 1, ..., 0, 0, 0],
               [1, 1, 0, ..., 0, 1, 0],
               ...,
               [1, 0, 0, ..., 0, 1, 1],
               [0, 0, 1, ..., 1, 0, 1],
               [0, 0, 0, ..., 1, 1, 0]])
```

```
In [27]: import matplotlib.pyplot as plt
import scipy.sparse as sparse
plt.spy(A, markersize=7)
```

```
Out[27]: <matplotlib.lines.Line2D at 0x17fb7e350>
```

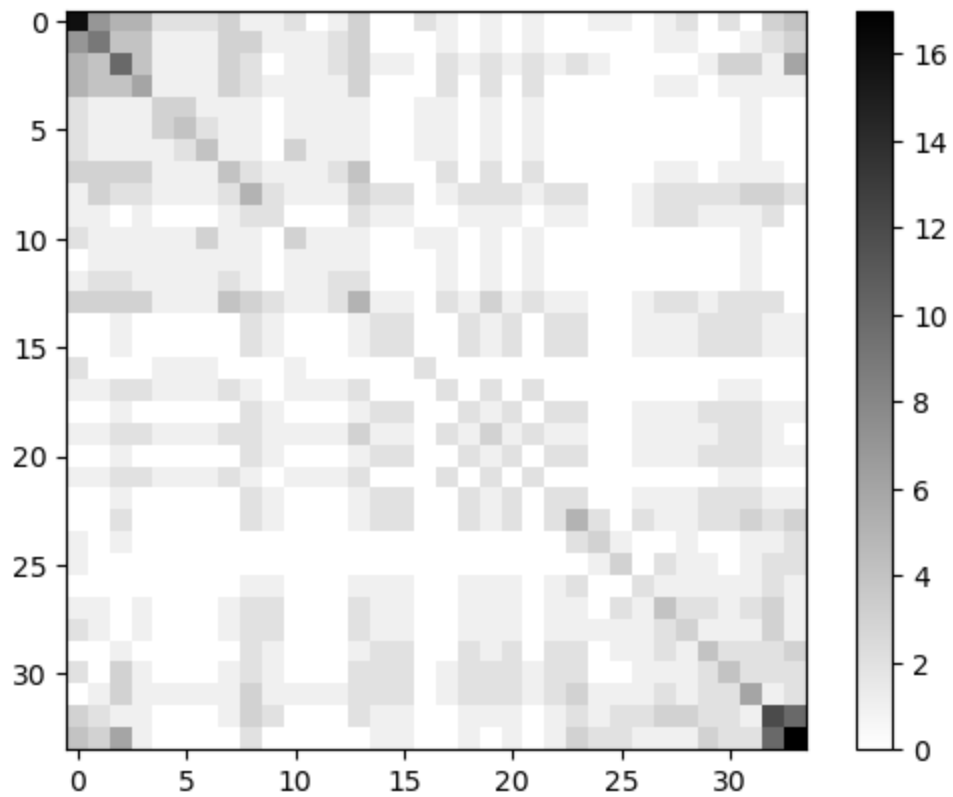


```
In [28]: A2 = A@A
A2.todense()
```

```
Out[28]: array([[16, 7, 5, ..., 0, 3, 4],
               [ 7, 9, 4, ..., 1, 2, 3],
               [ 5, 4, 10, ..., 3, 1, 6],
               ...,
               [ 0, 1, 3, ..., 6, 1, 2],
               [ 3, 2, 1, ..., 1, 12, 10],
               [ 4, 3, 6, ..., 2, 10, 17]])
```

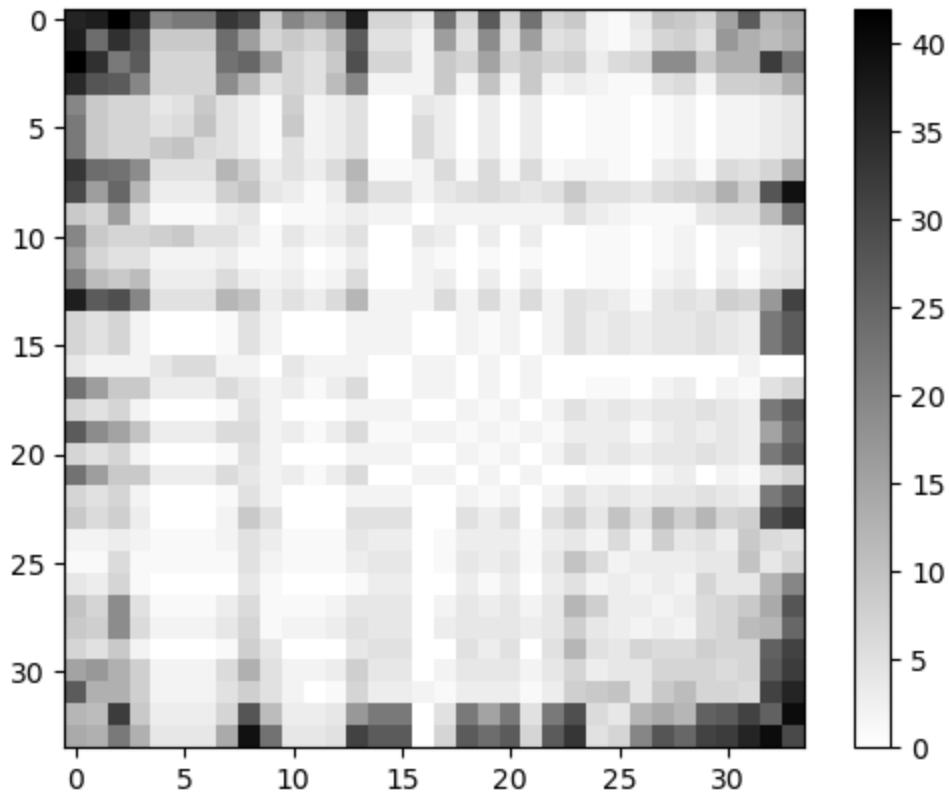
```
In [29]: d = A2.todense()
plt.imshow(d, interpolation='none', cmap='binary')
plt.colorbar()
```

```
Out[29]: <matplotlib.colorbar.Colorbar at 0x17fbbf090>
```



```
In [30]: A3 = A@A2  
d3 = A3.todense()  
plt.imshow(d3,interpolation='none',cmap='binary')  
plt.colorbar()
```

```
Out[30]: <matplotlib.colorbar.Colorbar at 0x17fbea150>
```



## Mesures de centralité

On va à présent calculer et afficher un certain nombre de mesures de centralité déjà implémentées dans la librairie.



```
In [65]: centralities = [nx.eigenvector centrality, nx.katz centrality, nx.betweenness_centrality]
centralities_names = ["eigenvector", "katz", "betweenness", "2nd order"]
val_cent = []

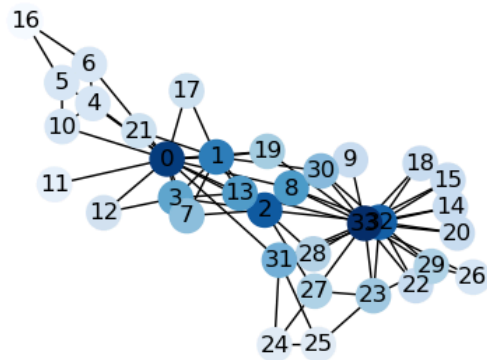
for c in centralities:
    val_cent.append(c(g))
```

```
In [69]: # on enregistre le layout du graphe pour la visualisation
my_pos = nx.spring_layout(g)
```

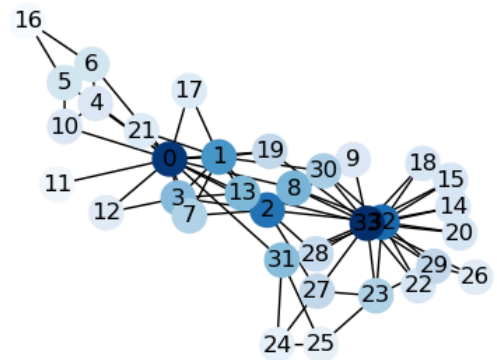
```
In [68]: figure = plt.figure(figsize=(11, 8))
for i in range(len(centralities)):
    figure.add_subplot(2, 2, i+1)
    plt.title(centralities_names[i])
    nx.draw(g, pos = my_pos, with_labels=True, node_color=[*val_cent[i].values()],
    plt.show()
```



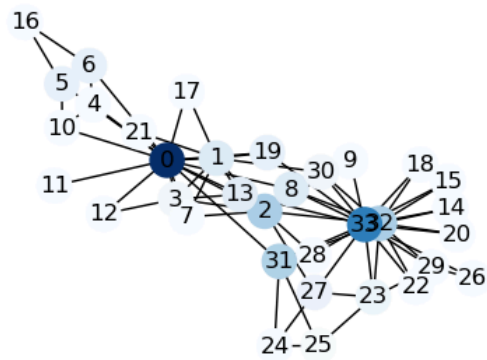
eigenvector



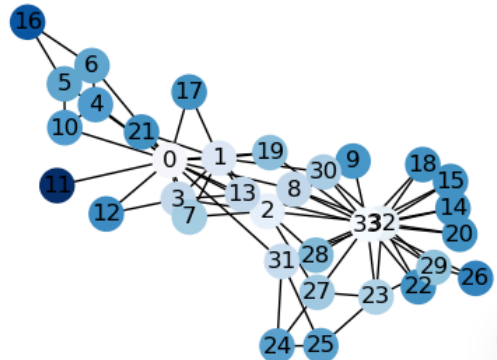
katz



betweenness



2nd order



In [ ]:

