TRABALHO REDES COMPLEXAS GOT

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 UNIFOR - Universidade de Fortaleza

MBA EM CIÊCIA DE DADOS - REDES COMPLEXAS

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```
[1]: import glob
     import networkx as nx
     import pandas as pd
     import numpy as np
     from matplotlib import pylab
     import plotly.graph_objects as go
     from pyvis.network import Network
     from collections import Counter
     import matplotlib.pyplot as plt
     %matplotlib inline
     import seaborn as sns
     from collections import defaultdict
     import networkx as nx
     import nxviz as nxv
     import community
     import EoN
     import powerlaw
     import re
```

C:\Users\valclemir\AppData\Roaming\Python\Python37\sitepackages\nxviz__init__.py:29: UserWarning:

nxviz has a new API! Version 0.7.3 onwards, the old class-based API is being deprecated in favour of a new API focused on advancing a grammar of network graphics. If your plotting code depends on the old API, please consider pinning nxviz at version 0.7.3, as the new API will break your old code.

To check out the new API, please head over to the docs at https://ericmjl.github.io/nxviz/ to learn more. We hope you enjoy using it!

0.1 Pré-processamento

0.1.1 Carrega os dados da primeira a ultima temporada

```
[2]: # Season 01
path1 = 'datasets/datasets/genius/s01/*.txt'
files1 = glob.glob(path1)

got1 = {}
for file in sorted(files1):
    key1 = file[24:-4]

with open(file,'r',encoding='utf-8') as f:
    text1 = f.readlines()

got1[key1] = text1
```

```
[3]: # Season 02
path2 = 'datasets/datasets/genius/s02/*.txt'
files2 = glob.glob(path2)

got2 = {}
for file in sorted(files2):
    key2 = file[24:-4]

with open(file,'r',encoding='utf-8') as f:
    text2 = f.readlines()

got2[key2] = text2
```

```
[4]: # Season 03
path3 = 'datasets\datasets\genius\s03\*.txt'
files3 = glob.glob(path3)

got3 = {}
for file in sorted(files3):
    key3 = file[24:-4]
```

```
with open(file,'r',encoding='utf-8') as f:
   text3 = f.readlines()

got3[key3] = text3
```

```
[5]: # Season 04
path4 = 'datasets/datasets/genius/s04/*.txt'
files4= glob.glob(path4)

got4 = {}
for file in sorted(files4):
    key4 = file[24:-4]

with open(file,'r',encoding='utf-8') as f:
    text4 = f.readlines()

got4[key4] = text4
```

```
[6]: # Season 05
path5 = 'datasets/datasets/genius/s05/*.txt'
files5= glob.glob(path5)

got5 = {}
for file in sorted(files5):
    key5 = file[24:-4]

with open(file,'r',encoding='utf-8') as f:
    text5 = f.readlines()

got5[key5] = text5
```

```
[7]: # Season 06
path6 = 'datasets/datasets/genius/s06/*.txt'
files6= glob.glob(path6)

got6 = {}
for file in sorted(files6):
    key6 = file[24:-4]

with open(file,'r',encoding='utf-8') as f:
    text6 = f.readlines()
```

```
got6[key6] = text6
```

```
[8]: # Season 07
path7 = 'datasets/datasets/genius/s07/*.txt'
files7= glob.glob(path7)

got7 = {}
for file in sorted(files7):
    key7 = file[24:-4]

with open(file,'r',encoding='utf-8') as f:
    text7 = f.readlines()

got7[key7] = text7
```

```
[9]: # Season 08
path8 = 'datasets/datasets/genius/s08/*.txt'
files8= glob.glob(path8)

got8 = {}
for file in sorted(files8):
    key8 = file[24:-4]

with open(file,'r',encoding='utf-8') as f:
    text8 = f.readlines()

got8[key8] = text8
```

0.1.2 Limpeza dos dados - Temporada a Temporada 01 a 08

```
[10]: #Season 01
dicionario_season_01 ={}
i = 0
person = []

for n in list(got1):
    for k in got1[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
```

```
i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
                value.find('/') == -1 and
                value.find('(') == -1 and
                value.find("") == -1 and
                value.find('MAN') == -1 and
                value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_01[key] = person
    i = 0
#Season 02
dicionario_season_02 ={}
i = 0
person = []
for n in list(got2):
    for k in got2[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
            i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
                value.find('/') == -1 and
                value.find('(') == -1 and
                value.find('"') == -1 and
                value.find('MAN') == -1 and
                value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_02[key] = person
```

```
i = 0
#Season 03
dicionario_season_03 ={}
i = 0
person = []
for n in list(got3):
    for k in got3[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
            i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
                value.find('/') == -1 and
                value.find('(') == -1 and
                value.find("") == -1 and
                value.find('MAN') == -1 and
                value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_03[key] = person
    i = 0
#Season 04
dicionario_season_04 ={}
i = 0
person = []
for n in list(got4):
    for k in got4[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
            i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
```

```
value.find('/') == -1 and
                value.find('(') == -1 and
                value.find('"') == -1 and
                value.find('MAN') == -1 and
                value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_04[key] = person
    i = 0
#Season 05
dicionario_season_05 ={}
i = 0
person = []
for n in list(got5):
    for k in got5[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
            i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
                value.find('/') == -1 and
                value.find('(') == -1 and
                value.find('"') == -1 and
                value.find('MAN') == -1 and
                value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_05[key] = person
    i = 0
#Season 06
dicionario_season_06 ={}
i = 0
```

```
person = []
for n in list(got6):
    for k in got6[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
            i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
                value.find('/') == -1 and
                value.find('(') == -1 and
                value.find('"') == -1 and
                value.find('MAN') == -1 and
                value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_06[key] = person
    i = 0
#Season 07
dicionario_season_07 ={}
i = 0
person = []
for n in list(got7):
    for k in got7[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
            i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
                value.find('/') == -1 and
                value.find('(') == -1 and
                value.find('"') == -1 and
                value.find('MAN') == -1 and
```

```
value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_07[key] = person
    i = 0
#Season 08
dicionario_season_08 ={}
i = 0
person = []
for n in list(got8):
    for k in got8[n]:
        x = re.split(":", k, 0)
        if not re.search(":", k) and k != '\n':
            key = str(n).upper() + "/" + str(i)
            person = []
            i +=1
        if re.search(":", k) and k != '\n':
            value = x[0]
            if (value.find('#') == -1 and
                value.find('.') == -1 and
                value.find('/') == -1 and
                value.find('(') == -1 and
                value.find('"') == -1 and
                value.find('MAN') == -1 and
                value.find('MEN') == -1 and
                value.find('GUARD') == -1 and
                value.find('INT') == -1 and
                value.find('EXT') == -1 and
                value.find('CUT') == -1 and
                value.find('SOLDIER') == -1 ):
                person.append(value.capitalize())
                dicionario_season_08[key] = person
    i = 0
```

0.1.3 Definindo o Dataframe - Edges Season 01 a 08

```
[11]: # populando os DataFrames
# Season 01
edges_season_01 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario_season_01.items():
    for k,j in enumerate(value):
```

```
if value[k] != value[k-1] and k > 0:
                edges_season_01 = edges_season_01.append({'Source':
→value[k], 'Target':value[k-1]},ignore_index = True)
edges season 01 = edges season 01.groupby(['Source', 'Target']).size().
→reset_index(name="Weight")
edges season 01['Season'] = 1
# Season 02
edges_season_02 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario_season_02.items():
     for k, j in enumerate(value):
            if value[k] != value[k-1] and k > 0:
                edges_season_02 = edges_season_02.append({'Source':
→value[k], 'Target':value[k-1]},ignore_index = True)
edges_season_02 = edges_season_02.groupby(['Source', 'Target']).size().
→reset index(name="Weight")
edges_season_02['Season'] = 2
#Season 03
edges season 03 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario season 03.items():
     for k,j in enumerate(value):
            if value [k] != value [k-1] and k > 0:
                edges_season_03 = edges_season_03.append({'Source':
 →value[k], 'Target':value[k-1]}, ignore_index = True)
edges_season_03 = edges_season_03.groupby(['Source', 'Target']).size().
→reset index(name="Weight")
edges season 03['Season'] = 3
#Season 04
edges_season_04 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario_season_04.items():
     for k,j in enumerate(value):
            if value[k] != value[k-1] and k > 0:
                edges_season_04 = edges_season_04.append({'Source':
→value[k], 'Target':value[k-1]},ignore_index = True)
edges_season_04 = edges_season_04.groupby(['Source', 'Target']).size().
→reset_index(name="Weight")
edges_season_04['Season'] = 4
#Season 05
edges_season_05 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario_season_05.items():
     for k,j in enumerate(value):
            if value[k] != value[k-1] and k > 0:
```

```
edges_season_05 = edges_season_05.append({'Source':
 →value[k], 'Target':value[k-1]}, ignore_index = True)
edges_season_05 = edges_season_05.groupby(['Source', 'Target']).size().
→reset index(name="Weight")
edges_season_05['Season'] = 5
#Season 06
edges_season_06 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario_season_06.items():
     for k, j in enumerate(value):
            if value[k] != value[k-1] and k > 0:
                edges_season_06 = edges_season_06.append({'Source':
→value[k], 'Target':value[k-1]},ignore_index = True)
edges_season_06 = edges_season_06.groupby(['Source', 'Target']).size().
→reset_index(name="Weight")
edges_season_06['Season'] = 6
#Season 07
edges_season_07 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario season 07.items():
     for k,j in enumerate(value):
            if value[k] != value[k-1] and k > 0:
                edges_season_07 = edges_season_07.append({'Source':
→value[k], 'Target':value[k-1]},ignore_index = True)
edges_season_07 = edges_season_07.groupby(['Source', 'Target']).size().
→reset_index(name="Weight")
edges_season_07['Season'] = 7
#Season 08
edges_season_08 = pd.DataFrame(columns = ['Source', 'Target'])
for key, value in dicionario_season_08.items():
     for k, j in enumerate(value):
            if value[k] != value[k-1] and k > 0:
                edges_season_08 = edges_season_08.append({'Source':
 →value[k], 'Target':value[k-1]},ignore_index = True)
edges season 08 = edges season 08.groupby(['Source', 'Target']).size().
edges_season_08['Season'] = 8
```

0.1.4 Formatando os Nodes a partir de Source e Target Season 01 a 08

```
[12]: # Season 01
nodes_s01= pd.DataFrame(edges_season_01['Source'])
nodes_s01.rename(columns={'Source': 'Label'}, inplace = True)
nodes_t01 = pd.DataFrame(edges_season_01["Target"])
nodes_t01.rename(columns={'Target': 'Label'}, inplace = True)
```

```
# Season 02
      nodes_s02= pd.DataFrame(edges_season_02['Source'])
      nodes_s02.rename(columns={'Source': 'Label'}, inplace = True)
      nodes_t02 = pd.DataFrame(edges_season_02["Target"])
      nodes_t02.rename(columns={'Target': 'Label'}, inplace = True)
      # Season 03
      nodes s03= pd.DataFrame(edges season 03['Source'])
      nodes s03.rename(columns={'Source': 'Label'}, inplace = True)
      nodes t03 = pd.DataFrame(edges season 03["Target"])
      nodes_t03.rename(columns={'Target': 'Label'}, inplace = True)
      # Season 04
      nodes_s04= pd.DataFrame(edges_season_04['Source'])
      nodes_s04.rename(columns={'Source': 'Label'}, inplace = True)
      nodes_t04 = pd.DataFrame(edges_season_04["Target"])
      nodes_t04.rename(columns={'Target': 'Label'}, inplace = True)
      # Season 05
      nodes_s05= pd.DataFrame(edges_season_05['Source'])
      nodes s05.rename(columns={'Source': 'Label'}, inplace = True)
      nodes_t05 = pd.DataFrame(edges_season_05["Target"])
      nodes_t05.rename(columns={'Target': 'Label'}, inplace = True)
      # Season 06
      nodes_s06= pd.DataFrame(edges_season_06['Source'])
      nodes_s06.rename(columns={'Source': 'Label'}, inplace = True)
      nodes_t06 = pd.DataFrame(edges_season_06["Target"])
      nodes_t06.rename(columns={'Target': 'Label'}, inplace = True)
      # Season 07
      nodes_s07= pd.DataFrame(edges_season_07['Source'])
      nodes_s07.rename(columns={'Source': 'Label'}, inplace = True)
      nodes_t07 = pd.DataFrame(edges_season_07["Target"])
      nodes_t07.rename(columns={'Target': 'Label'}, inplace = True)
      # Season 08
      nodes s08= pd.DataFrame(edges season 08['Source'])
      nodes s08.rename(columns={'Source': 'Label'}, inplace = True)
      nodes_t08 = pd.DataFrame(edges_season_08["Target"])
      nodes_t08.rename(columns={'Target': 'Label'}, inplace = True)
[13]: # unindo os DF source e target, removendo duplicados, para gerar nodes final
```

Nodes_01.drop_duplicates(subset='Label', keep='first', inplace=True)

#season 01

Nodes_01 = pd.concat([nodes_s01,nodes_t01])

```
Nodes_01['id'] = Nodes_01['Label'].str.upper()
Nodes_01 = Nodes_01.reindex(columns=['id','Label'])
#season 02
Nodes_02 = pd.concat([nodes_s02,nodes_t02])
Nodes_02.drop_duplicates(subset='Label', keep='first', inplace=True)
Nodes 02['id'] = Nodes 02['Label'].str.upper()
Nodes_02 = Nodes_02.reindex(columns=['id','Label'])
#season 03
Nodes 03 = pd.concat([nodes s03,nodes t03])
Nodes_03.drop_duplicates(subset='Label', keep='first', inplace=True)
Nodes 03['id'] = Nodes 03['Label'].str.upper()
Nodes_03 = Nodes_03.reindex(columns=['id','Label'])
#season 04
Nodes_04 = pd.concat([nodes_s04,nodes_t04])
Nodes_04.drop_duplicates(subset='Label', keep='first', inplace=True)
Nodes_04['id'] = Nodes_04['Label'].str.upper()
Nodes_04 = Nodes_04.reindex(columns=['id','Label'])
#season 05
Nodes_05 = pd.concat([nodes_s05,nodes_t05])
Nodes 05.drop duplicates(subset='Label', keep='first', inplace=True)
Nodes_05['id'] = Nodes_05['Label'].str.upper()
Nodes 05 = Nodes 05.reindex(columns=['id', 'Label'])
#season 06
Nodes_06 = pd.concat([nodes_s06,nodes_t06])
Nodes_06.drop_duplicates(subset='Label', keep='first', inplace=True)
Nodes_06['id'] = Nodes_06['Label'].str.upper()
Nodes_06 = Nodes_01.reindex(columns=['id','Label'])
#season 07
Nodes_07 = pd.concat([nodes_s07,nodes_t07])
Nodes_07.drop_duplicates(subset='Label', keep='first', inplace=True)
Nodes 07['id'] = Nodes 07['Label'].str.upper()
Nodes_07 = Nodes_07.reindex(columns=['id','Label'])
#season 08
Nodes 08 = pd.concat([nodes s08,nodes t08])
Nodes_08.drop_duplicates(subset='Label', keep='first', inplace=True)
Nodes 08['id'] = Nodes 08['Label'].str.upper()
Nodes_08 = Nodes_08.reindex(columns=['id', 'Label'])
```

0.1.5 Salvando Edges e Nodes

```
[14]: edges season 01.to csv('s1-edges.csv', sep=',', index=False,header=True)
      edges_season_02.to_csv('s2-edges.csv', sep=',', index=False,header=True)
      edges_season_03.to_csv('s3-edges.csv', sep=',', index=False,header=True)
      edges_season_04.to_csv('s4-edges.csv', sep=',', index=False,header=True)
      edges_season_05.to_csv('s5-edges.csv', sep=',', index=False,header=True)
      edges_season_06.to_csv('s6-edges.csv', sep=',', index=False,header=True)
      edges_season_07.to_csv('s7-edges.csv', sep=',', index=False,header=True)
      edges_season_08.to_csv('s8-edges.csv', sep=',', index=False,header=True)
      Nodes_01.to_csv('s1-nodes.csv', sep=',', index=False,header=True)
      Nodes_02.to_csv('s2-nodes.csv', sep=',', index=False,header=True)
      Nodes_03.to_csv('s3-nodes.csv', sep=',', index=False,header=True)
      Nodes_04.to_csv('s4-nodes.csv', sep=',', index=False,header=True)
      Nodes 05.to csv('s5-nodes.csv', sep=',', index=False,header=True)
      Nodes_06.to_csv('s6-nodes.csv', sep=',', index=False,header=True)
      Nodes_07.to_csv('s7-nodes.csv', sep=',', index=False,header=True)
      Nodes_08.to_csv('s8-nodes.csv', sep=',', index=False,header=True)
```

1 Análise dos Dados

1.0.1 Carregando DataFrames Edges e Nodes por Season e Agrupando em um Unico Dataframe

```
[15]: #Carregando os arquivos com EDGES
      temp1_E = pd.read_csv('s1-edges.csv',
                  header = 0,
                  usecols=[0, 1, 2,3])
      temp2_E = pd.read_csv('s2-edges.csv',
                  header = 0,
                  usecols=[0, 1, 2,3])
      temp3_E = pd.read_csv('s3-edges.csv',
                  header = 0,
                  usecols=[0, 1, 2,3])
      temp4_E = pd.read_csv('s4-edges.csv',
                  header = 0,
                  usecols=[0, 1, 2,3])
      temp5_E = pd.read_csv('s5-edges.csv',
                  header = 0,
                  usecols=[0, 1, 2,3])
      temp6_E= pd.read_csv('s6-edges.csv',
                  header = 0,
                  usecols=[0, 1, 2,3])
      temp7_E= pd.read_csv('s7-edges.csv',
                  header = 0,
                  usecols=[0, 1, 2,3])
      temp8_E= pd.read_csv('s8-edges.csv',
```

```
header = 0,
                  usecols=[0, 1, 2,3])
[16]: # Criando um unico dataframe com os Vertices (Edges) e somando todos os pesosu
      \hookrightarrow (Weigths)
      data_Edges = temp1_E.append(temp2_E).append(temp3_E).append(temp4_E).
       \rightarrowappend(temp5_E).append(temp6_E).append(temp7_E).append(temp8_E)
      data_Edges = data_Edges.groupby(['Source', 'Target']).agg({'Weight':'sum'}).
       →reset_index()
      data_Edges.sort_values('Weight',ascending=False).head()
[16]:
            Source Target Weight
      379
                     Jaime
            Cersei
                                151
      2389
             Varys Tyrion
                                151
      865
             Jaime Cersei
                                149
      2295 Tyrion
                    Varys
                                136
      2243 Tyrion Cersei
                                135
[17]: # Carregando arquivos Nodes e criando um unico Nodes
      temp1_N = pd.read_csv('s1-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
      temp2_N = pd.read_csv('s2-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
      temp3_N = pd.read_csv('s3-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
      temp4_N = pd.read_csv('s4-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
      temp5_N = pd.read_csv('s5-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
      temp6_N= pd.read_csv('s6-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
      temp7_N= pd.read_csv('s7-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
      temp8_N= pd.read_csv('s8-nodes.csv',
                  header = 0,
                  usecols=[0, 1])
```

[18]: Nodes = temp1_N.append(temp2_N).append(temp3_N).append(temp4_N).append(temp5_N).

 \rightarrow append(temp6_N).append(temp7_N).append(temp8_N)

```
Nodes = Nodes.drop_duplicates()
Nodes
```

```
[18]:
                          id
                                           Label
             ADDAM MARBRAND
                                 Addam marbrand
      0
      1
                         AT.T.
                                             A11
             ALLISER THORNE
      2
                                 Alliser thorne
      3
                        ARYA
                                            Arya
                 ARYA STARK
      4
                                     Arya stark
      43
                  VALE LORD
                                      Vale lord
      45
                       VICKY
                                           Vicky
      46
                       WILLA
                                           Willa
      49
          UNSULLIED CAPTAIN Unsullied captain
      52
             MAESTER WOLKAN
                                 Maester wolkan
```

[506 rows x 2 columns]

1.0.2 Criando rede de Visualização

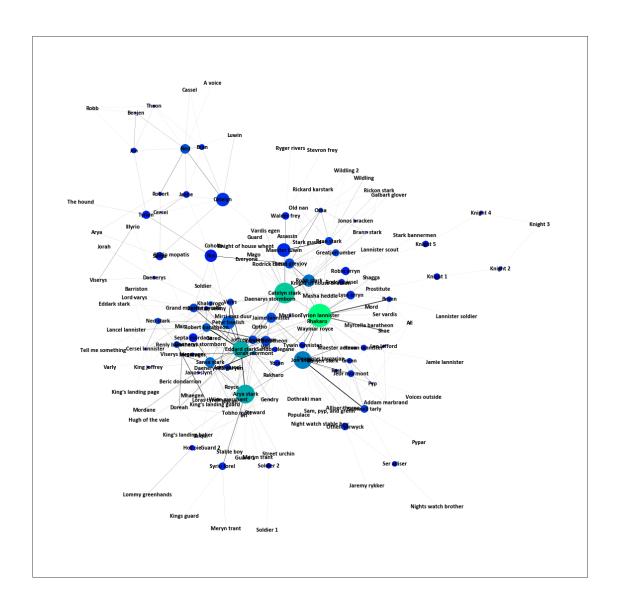
```
[19]: # qerando rede de visualização por season e a global
      G1 = nx.from_pandas_edgelist(temp1_E, source = 'Source', target = 'Target', __
      ⇔edge_attr='Weight')
      G2 = nx.from_pandas_edgelist(temp2_E, source = 'Source', target = 'Target', __
      ⇔edge_attr='Weight')
      G3 = nx.from_pandas_edgelist(temp3 E, source = 'Source', target = 'Target', __
      ⇔edge_attr='Weight')
      G4 = nx.from_pandas_edgelist(temp4_E, source = 'Source', target = 'Target',
      ⇔edge_attr='Weight')
      G5 = nx.from_pandas_edgelist(temp5_E, source = 'Source', target = 'Target', __
      →edge_attr='Weight')
      G6 = nx.from_pandas_edgelist(temp6 E, source = 'Source', target = 'Target', __
      →edge_attr='Weight')
      G7 = nx.from_pandas_edgelist(temp7_E, source = 'Source', target = 'Target', __
      →edge_attr='Weight')
      G8 = nx.from_pandas_edgelist(temp8_E, source = 'Source', target = 'Target', u
      ⇔edge_attr='Weight')
      G = nx.from_pandas_edgelist(data_Edges, source = 'Source', target = __
       →'Target',edge attr='Weight')
```

1.1 Rede de Graphos por Temporada e Global

1.1.1 Season 1

```
[20]: # Definindo paramentros para controle : Size / Color
      tam=nx.betweenness_centrality(G1)
      col=nx.pagerank(G1)
      weights = np.array([i['Weight'] for i in dict(G1.edges).values()])
      sizes = np.array([tam[i] for i in G1])
      colors = np.array([col[i] for i in G1])
[21]: # Definindo os Nodes a partir dos Edges
      labels1 = {
          list(G1.nodes)[n]: (list(G1.nodes)[n]
              if len(list(nx.all_neighbors(G1, list(G1.nodes)[n])))
              else '')
          for n in range(len(G1.nodes))
      }
[22]: plt.figure(figsize = [20,20])
      nx.draw_networkx_nodes(G1,
              pos=nx.kamada_kawai_layout(G1),
              node_size=10000*sizes,
              node color=colors,
              cmap="winter")
      nx.draw_networkx_edges(G1,
              pos=nx.kamada_kawai_layout(G1),
              width=0.04*weights)
      labels=nx.draw_networkx_labels(G1,
                              pos=nx.kamada_kawai_layout(G1),
                              labels=labels1,
                              font_size=12,
                              font_family="calibri",
```

font_weight="bold")



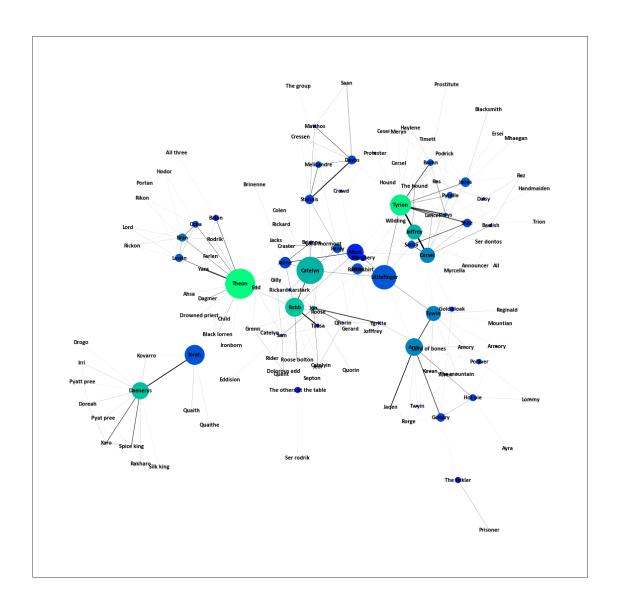
Para a primeira temporada, os personagens de maiores influências são os que estão mais destacados em circulos maiores, exemplo: Tyrion Lannister, Catelyn Stark, Arya Stark e Eddard Stark (Obs: Pra quem assistiu a série, sabe que o Ned Stark foi morto decapitado no nono episódio da primeira temporada, por isso ele tem tanto destaque na primeira temporada)

1.1.2 Season 2

```
[23]: # Definindo paramentros para controle : Size / Color
tam2=nx.betweenness_centrality(G2)
col2=nx.pagerank(G2)
weights2 = np.array([i['Weight'] for i in dict(G2.edges).values()])
```

```
sizes2 = np.array([tam2[i] for i in G2])
      colors2 = np.array([col2[i] for i in G2])
[24]: # Definindo os Nodes a partir dos Edges
      labels2 = {
          list(G2.nodes)[n]: (list(G2.nodes)[n]
              if len(list(nx.all_neighbors(G2, list(G2.nodes)[n])))
              else '')
          for n in range(len(G2.nodes))
      }
[25]: plt.figure(figsize = [20,20])
      nx.draw_networkx_nodes(G2,
              pos=nx.kamada_kawai_layout(G2),
              node_size=10000*sizes2,
              node_color=colors2,
              cmap="winter")
      nx.draw_networkx_edges(G2,
              pos=nx.kamada_kawai_layout(G2),
              width=0.04*weights2)
      labels=nx.draw_networkx_labels(G2,
                              pos=nx.kamada_kawai_layout(G2),
                              labels=labels2,
                              font_size=12,
                              font_family="calibri",
```

font_weight="bold")



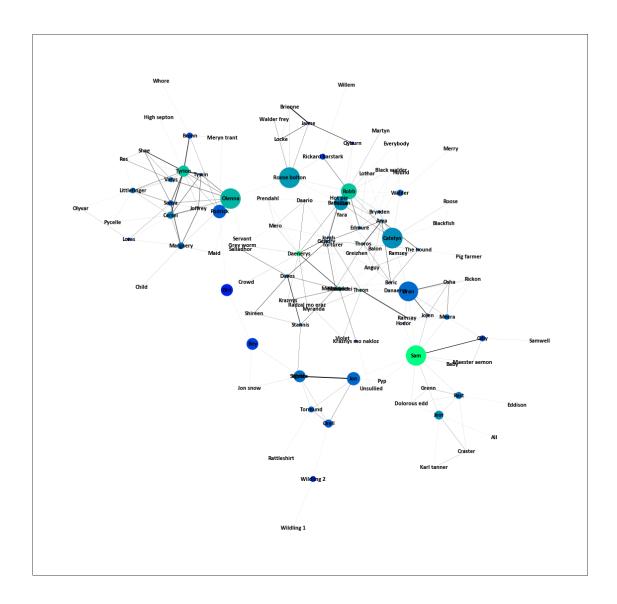
Na segunda temporada, os personagens que mais se destacam são Theon e Robb, pois logo após morte de Ned Stark, Theon se alia ao filho de Ned, Robb Stark. Em paralelo, começa surgir Daenerys com seus 3 dragões que eventualmente, eles se tornarão monstros aterrorizantes capazes de destruir cidades ao seu comando.

1.1.3 Season 3

```
[26]: # Definindo paramentros para controle : Size / Color
tam3=nx.betweenness_centrality(G3)
col3=nx.pagerank(G3)

weights3 = np.array([i['Weight'] for i in dict(G3.edges).values()])
sizes3 = np.array([tam3[i] for i in G3])
```

```
colors3 = np.array([col3[i] for i in G3])
[27]: # Definindo os Nodes a partir dos Edges
      labels3 = {
          list(G3.nodes)[n]: (list(G3.nodes)[n]
              if len(list(nx.all_neighbors(G3, list(G3.nodes)[n])))
              else '')
          for n in range(len(G3.nodes))
      }
[28]: plt.figure(figsize = [20,20])
      nx.draw_networkx_nodes(G3,
              pos=nx.kamada_kawai_layout(G3),
              node_size=10000*sizes3,
              node_color=colors3,
              cmap="winter")
      nx.draw_networkx_edges(G3,
              pos=nx.kamada_kawai_layout(G3),
              width=0.04*weights3)
      labels=nx.draw_networkx_labels(G3,
                              pos=nx.kamada_kawai_layout(G3),
                              labels=labels3,
                              font_size=12,
                              font_family="calibri",
                              font_weight="bold")
```



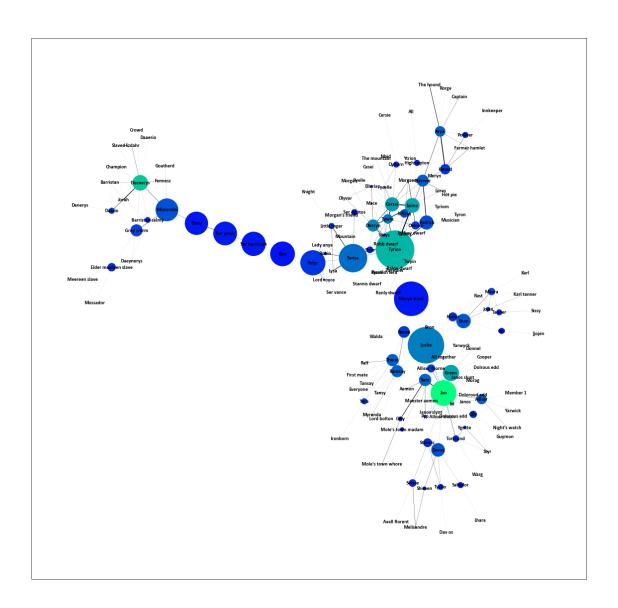
Na terceira temporada, alguns personagens se destacam, como Robb e Bran . Robb Stark após ter ganhado o posto de rei, depois da morte de seu pai, Ned Stark, permanece no campo de batalha, enquanto Bran Stark e seus protetores devem atravessar os desertos congelados do Norte para chegar à Muralha.

1.1.4 Season 4

```
[29]: # Definindo paramentros para controle : Size / Color
  tam4=nx.betweenness_centrality(G4)
  col4=nx.pagerank(G4)

weights4 = np.array([i['Weight'] for i in dict(G4.edges).values()])
  sizes4 = np.array([tam4[i] for i in G4])
```

```
colors4 = np.array([col4[i] for i in G4])
[30]: # Definindo os Nodes a partir dos Edges
      labels4 = {
          list(G4.nodes)[n]: (list(G4.nodes)[n]
              if len(list(nx.all_neighbors(G4, list(G4.nodes)[n])))
              else '')
          for n in range(len(G4.nodes))
      }
[31]: plt.figure(figsize = [20,20])
      nx.draw_networkx_nodes(G4,
              pos=nx.kamada_kawai_layout(G4),
              node_size=10000*sizes4,
              node_color=colors4,
              cmap="winter")
      nx.draw_networkx_edges(G4,
              pos=nx.kamada_kawai_layout(G4),
              width=0.04*weights4)
      labels=nx.draw_networkx_labels(G4,
                              pos=nx.kamada_kawai_layout(G4),
                              labels=labels4,
                              font_size=10,
                              font_family="calibri",
                              font_weight="bold")
```



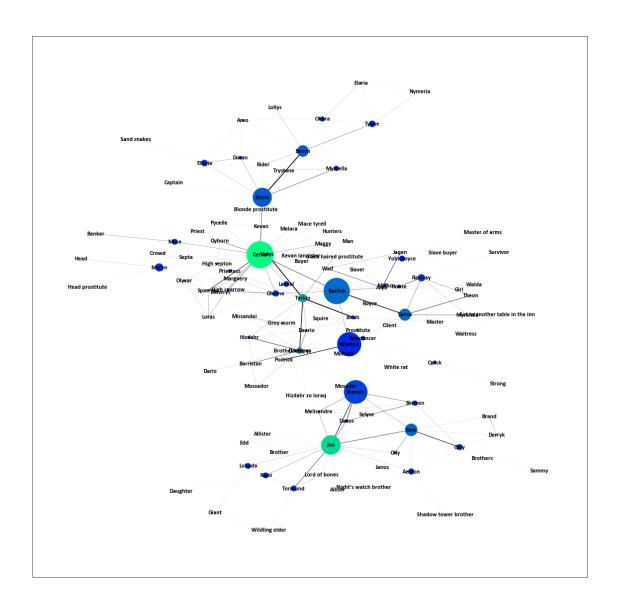
1.1.5 Season 5

```
[32]: # Definindo paramentros para controle : Size / Color
   tam5=nx.betweenness_centrality(G5)
   col5=nx.pagerank(G5)

weights5 = np.array([i['Weight'] for i in dict(G5.edges).values()])
   sizes5 = np.array([tam5[i] for i in G5])
   colors5 = np.array([col5[i] for i in G5])

[33]: # Definindo os Nodes a partir dos Edges
   labels5 = {
      list(G5.nodes)[n]: (list(G5.nodes)[n]
```

```
if len(list(nx.all_neighbors(G5, list(G5.nodes)[n])))
  else '')
for n in range(len(G5.nodes))
}
```

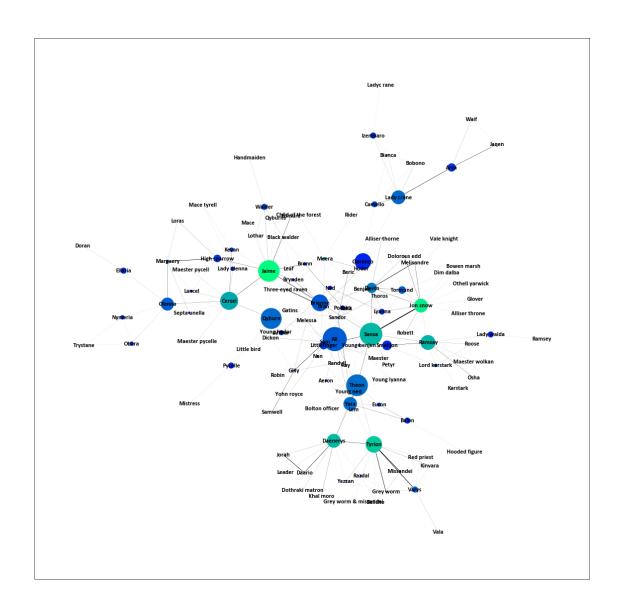


Na quinta temporada, Daenerys recebe um forte destaque, como podemos ver no grafo, ela tem várias conexões e uma das conexões fortes é a Missandei, que teve também um papel importante nessa temporada, fazendo algumas revelações para Daenerys.

1.1.6 Season 6

```
[35]: # Definindo paramentros para controle : Size / Color
tam6=nx.betweenness_centrality(G6)
col6=nx.pagerank(G6)

weights6 = np.array([i['Weight'] for i in dict(G6.edges).values()])
sizes6 = np.array([tam6[i] for i in G6])
colors6 = np.array([col6[i] for i in G6])
```



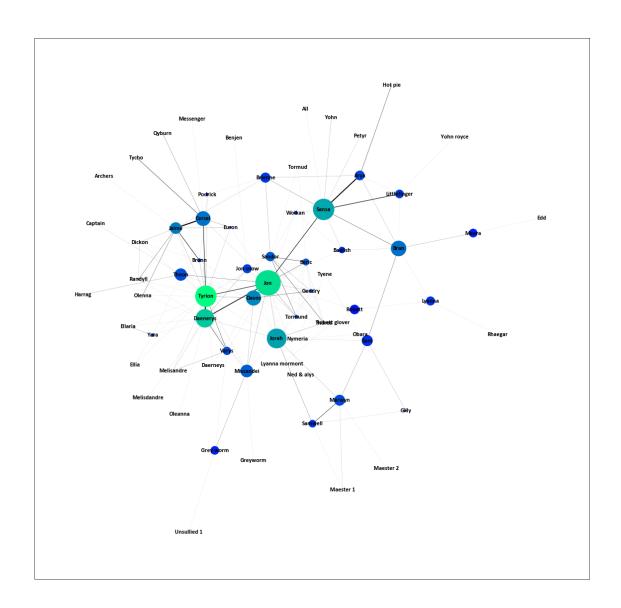
1.1.7 Season 7

```
[38]: # Definindo paramentros para controle : Size / Color
  tam7=nx.betweenness_centrality(G7)
  col7=nx.pagerank(G7)

weights7 = np.array([i['Weight'] for i in dict(G7.edges).values()])
  sizes7 = np.array([tam7[i] for i in G7])
  colors7 = np.array([col7[i] for i in G7])

[39]: # Definindo os Nodes a partir dos Edges
  labels7 = {
    list(G7.nodes)[n]: (list(G7.nodes)[n]
```

```
if len(list(nx.all_neighbors(G7, list(G7.nodes)[n])))
  else '')
for n in range(len(G7.nodes))
}
```



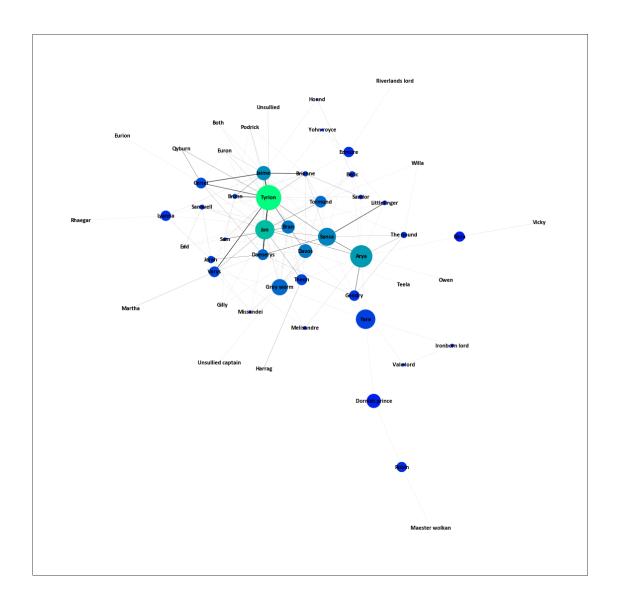
1.1.8 Season 8

```
[41]: # Definindo paramentros para controle : Size / Color
   tam8=nx.betweenness_centrality(G8)
   col8=nx.pagerank(G8)

weights8 = np.array([i['Weight'] for i in dict(G8.edges).values()])
   sizes8 = np.array([tam8[i] for i in G8])
   colors8 = np.array([col8[i] for i in G8])

[42]: # Definindo os Nodes a partir dos Edges
   labels8 = {
      list(G8.nodes)[n]: (list(G8.nodes)[n]
```

```
if len(list(nx.all_neighbors(G8, list(G8.nodes)[n])))
    else '')
for n in range(len(G8.nodes))
}
```



Na última temporada, pra quem assistiu, Tyrion, Jon e Arya tiveram uma grande influência na trama, Tyrion por exemplo, tentou mais uma vez convencer sua irmã a deixar de lado suas inimizades e se unir com Daenerys contra o exército dos mortos, mas seus apelos caíram em ouvidos surdos. Embora ela tenha prometido uma aliança militar com a rainha dragão, Cersei, em vez disso, intermediou um acordo de bastidores: com a ajuda de Euron e o apoio financeiro do Banco de Ferro, ela contratou a Companhia Dourada, o mais poderoso exército mercenário de Essos, para destruir todos os seus inimigos de uma só vez e solidificar o domínio lannister sobre Westeros. No Norte, Jon Snow, escolhido como Rei no Norte por seus compatriotas, buscou uma aliança com Daenerys; não para ajudá-la a tomar o Trono de Ferro, mas para ajudá-lo na próxima guerra contra o exército dos mortos: a Grande Guerra. Em Winterfell, o Norte viu o retorno de dois irmãos Stark que se acreditava estarem mortos - Arya Stark, que matou os homens restantes da Casa Frey em vingança pelo Casamento

Vermelho, e Bran Stark, que agora se tornou o Corvo de Três Olhos. Apesar dos esquemas de Petyr Baelish para separar os Starks e tomar o poder em sua própria tentativa de tomar o Trono de Ferro, Baelish foi exposto como o verdadeiro arquiteto das mortes de Jon Arryn e Lysa Arryn, e da Guerra dos Cinco Reis, que viu a morte de inúmeras pessoas inocentes por uma causa falsa. Ele foi executado por seus crimes por ordem de Sansa Stark,acabando com seus esquemas de uma vez por todas.

1.2 Identificando Influencia na rede

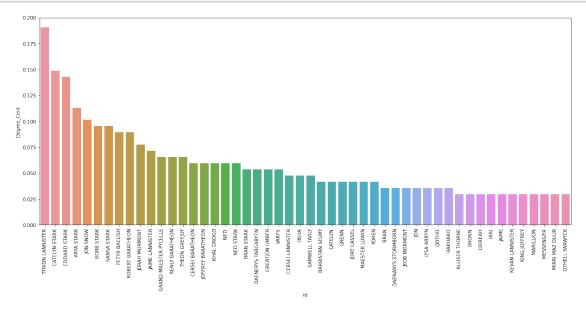
Degree Centrality

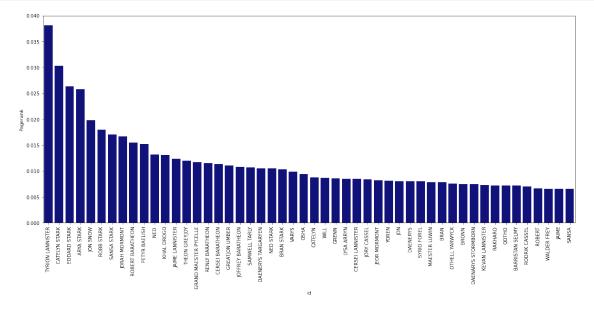
Weighted Degree Centrality

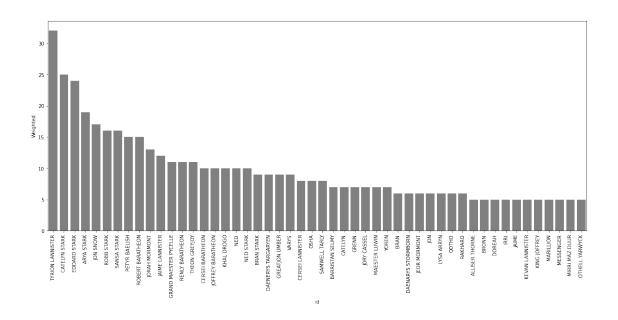
PageRank Centrality

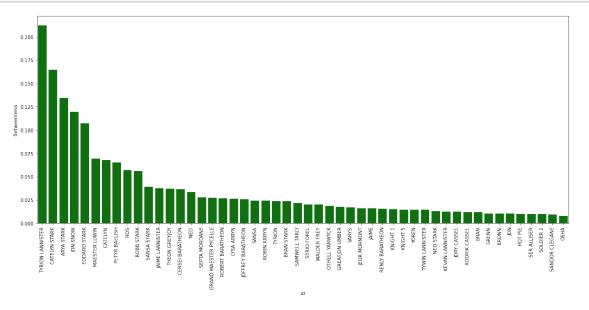
Betweenness Centrality

1.2.1 Season 1

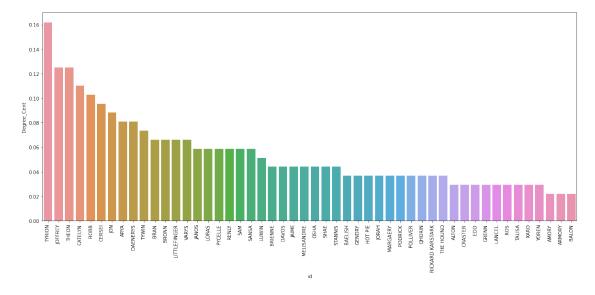


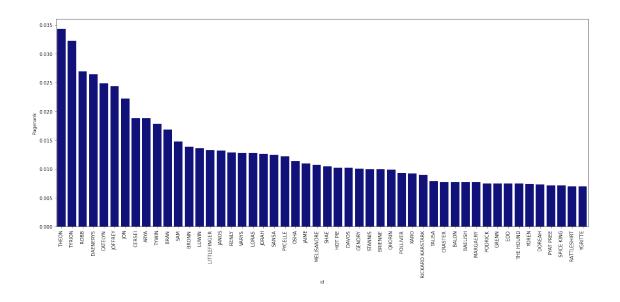


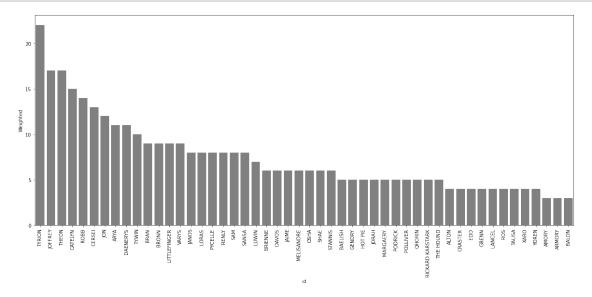


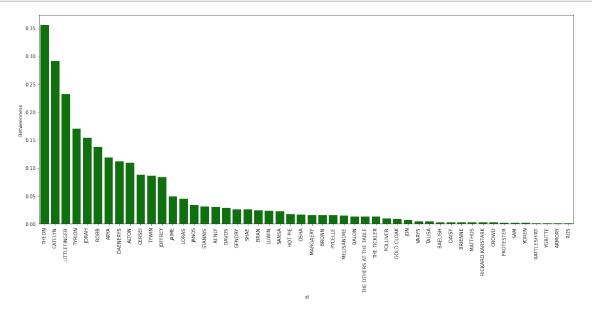


1.2.2 Season 2

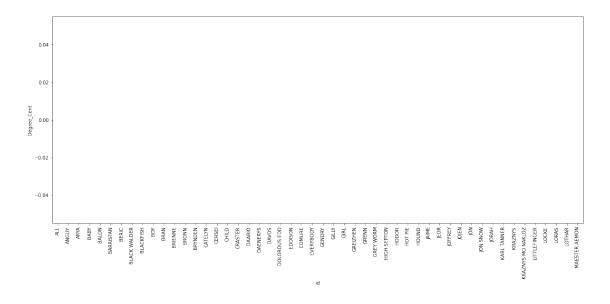


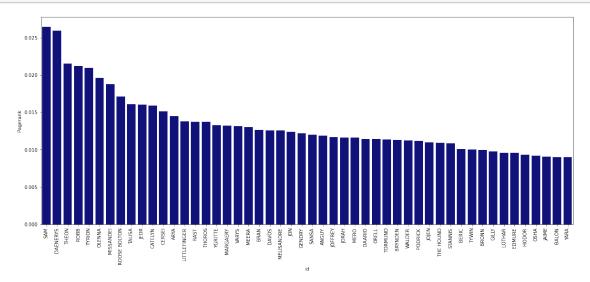


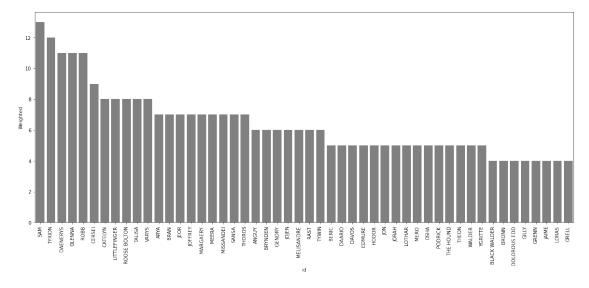


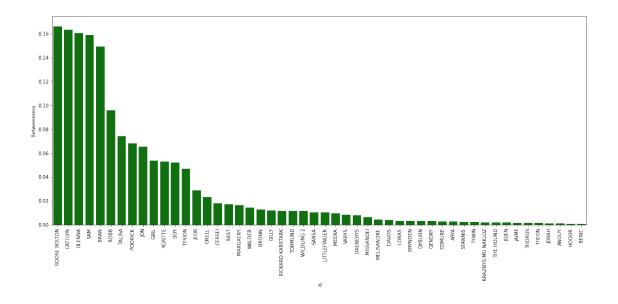


1.2.3 Season 3

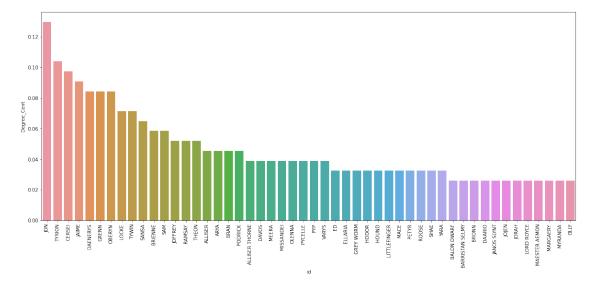


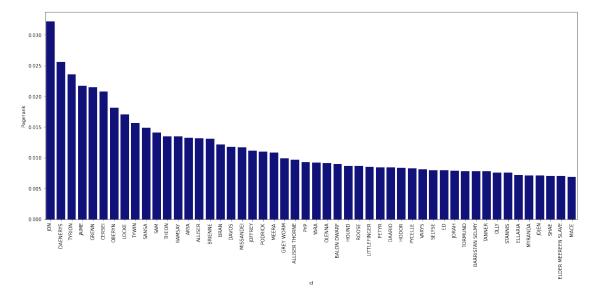


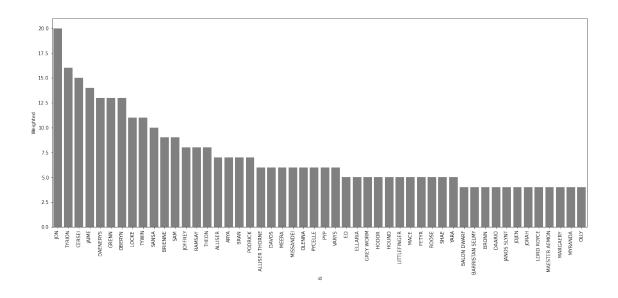


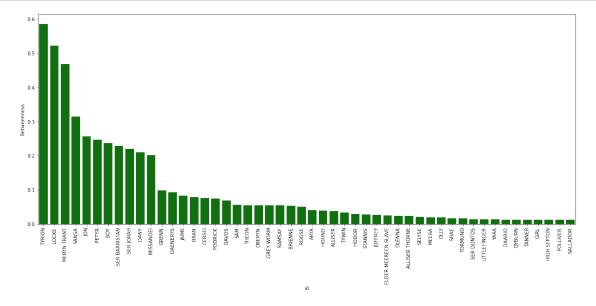


1.2.4 Season 4

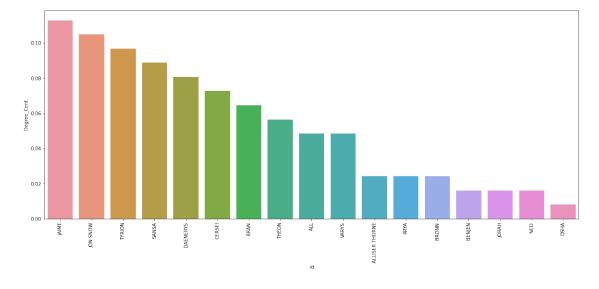


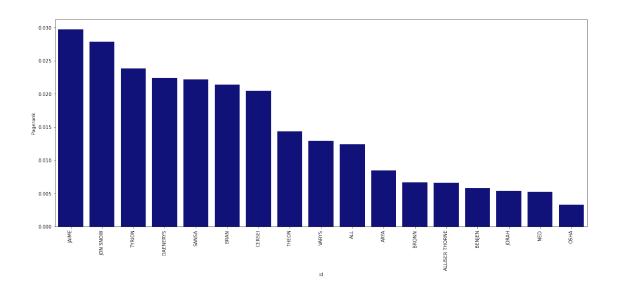


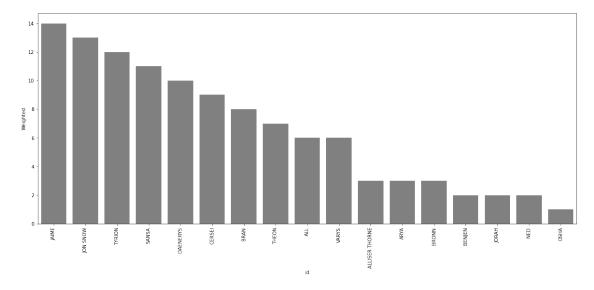


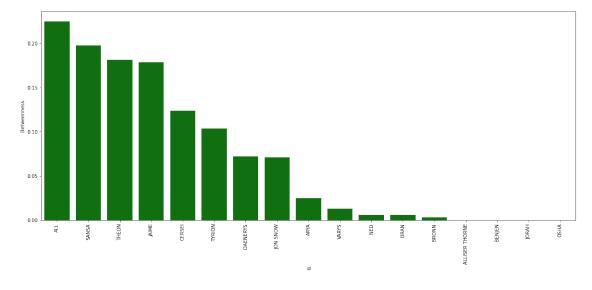


1.2.5 Season 6

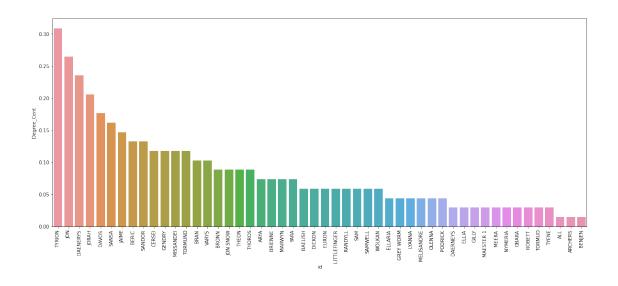


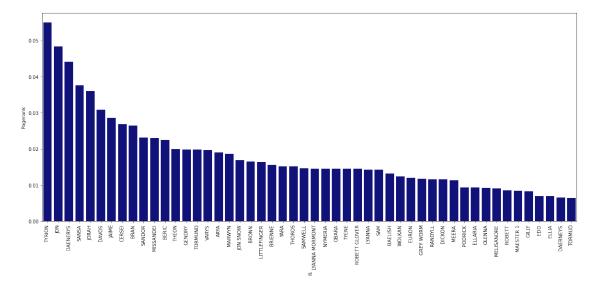


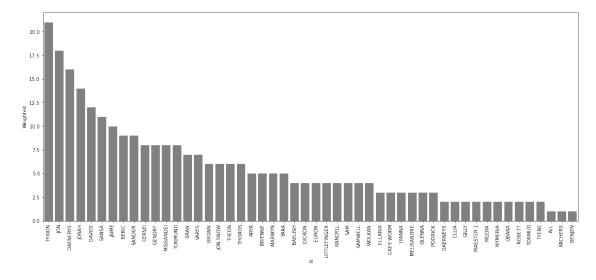


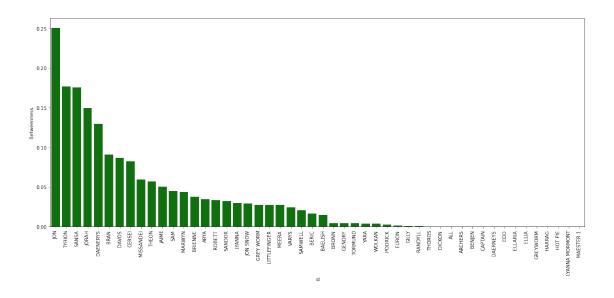


1.2.6 Season 7

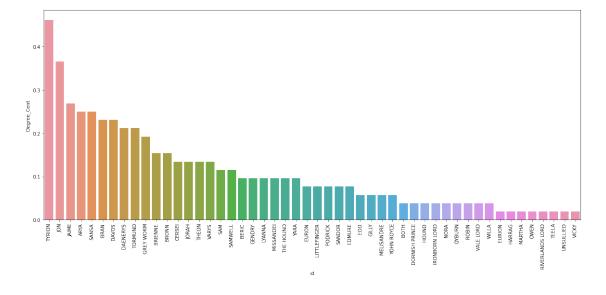


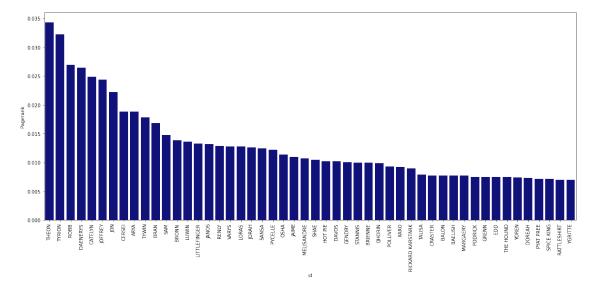


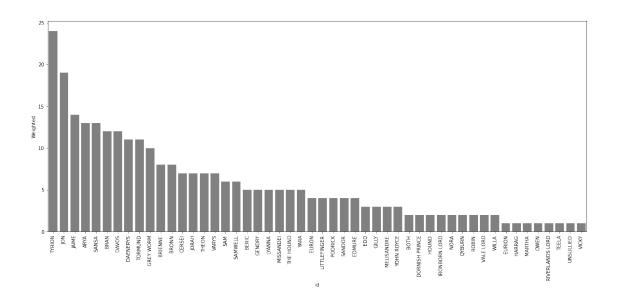


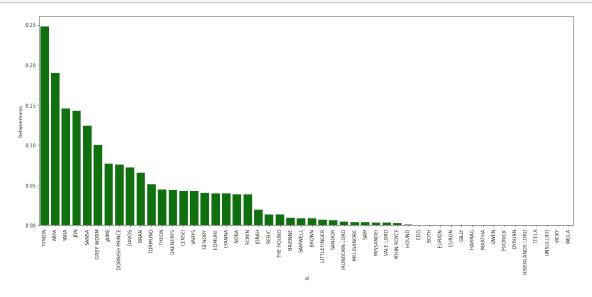


1.2.7 Season 8



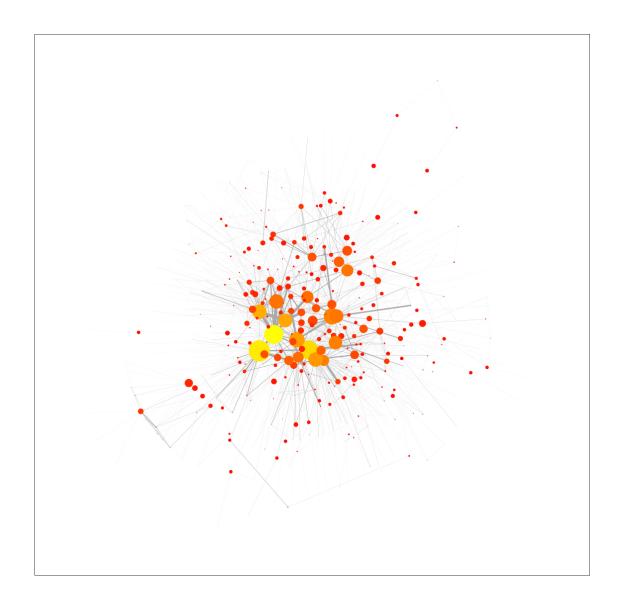






1.3 Medidas e plots Globais

```
[72]: # Definindo paramentros para controle : Size / Color
      tamG=nx.betweenness_centrality(G)
      colG=nx.pagerank(G)
      weightsG = np.array([i['Weight'] for i in dict(G.edges).values()])
      sizesG = np.array([tamG[i] for i in G])
      colorsG = np.array([colG[i] for i in G])
[73]: # Definindo os Nodes a partir dos Edges
      labelsG = {
          list(G.nodes)[n]: (list(G.nodes)[n]
                             # selecionando somente os pesos acima de 100
              if len(list(nx.all_neighbors(G, list(G.nodes)[n])))>100
              else '')
          for n in range(len(G.nodes))
[74]: plt.figure(figsize = [20,20])
      nx.draw_networkx_nodes(G,
              pos=nx.kamada_kawai_layout(G),
              node_size=10000*sizesG,
              node_color=colorsG,
              cmap="autumn")
      nx.draw_networkx_edges(G,
              pos=nx.kamada_kawai_layout(G),
              width=0.04*weightsG,
              edge_color="darkgray")
      labels=nx.draw_networkx_labels(G,
                              pos=nx.kamada_kawai_layout(G),
                              labels=labelsG,
                              font_size=15,
                              font_family="calibri",
                              font_weight="bold")
```



1.3.1 Medidas de Centralidade Global

```
[75]: # Grau de Centralidade Global
grau_cent_G = nx.degree_centrality(G)
Nodes['Degree_Cent'] = Nodes['id'].apply(lambda x: x[0].upper() + x[1:].

→lower()).apply(lambda x: grau_cent_G.get(x))

# PageRank Centrality Global
pr_G = nx.pagerank(G)
Nodes['Pagerank'] = Nodes['id'].apply(lambda x: x[0].upper() + x[1:].lower()).

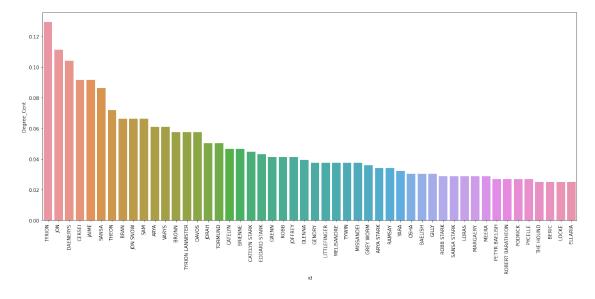
→apply(lambda x: pr_G.get(x))
```

```
# Closeness Degree Centrality Global
Closeness_G = nx.closeness_centrality(G)
Nodes['Closeness'] = Nodes['id'].apply(lambda x: x[0].upper() + x[1:].lower()).

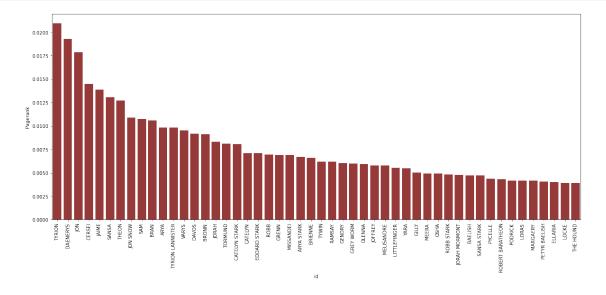
→apply(lambda x: Closeness_G.get(x))

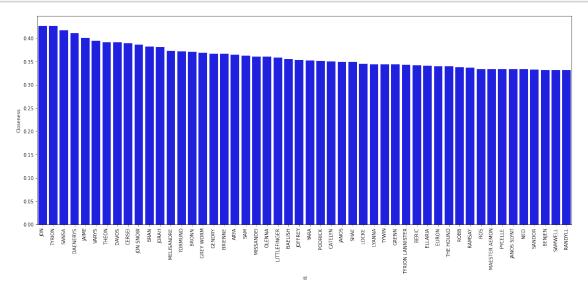
# Betweenness Degree Centrality Global
btw_G = nx.betweenness_centrality(G)
Nodes['Betweenness'] = Nodes['id'].apply(lambda x: x[0].upper() + x[1:].

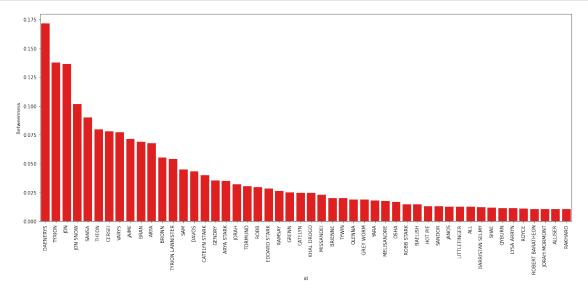
→lower()).apply(lambda x: btw_G.get(x))
```



ax.set_xticklabels(ax.get_xticklabels(), rotation=90);







1.3.2 Verificando o Maximo e o Minimo das Centralidades

print("O Node Com o Máximo de Interações com o Vizinho é", max_pr, "e o Node⊔ ⇒com a menor intereção entre os Vizinhos é", min_pr)

- O Node Com o Máximo Grau de Centralidade é Tyrion e o Node com o Mínimo de Grau de Centralidade é Ahsa
- O Node Com o Máximo de Proximidade Central é Jon e o Node Com o Máximo de Proximidade Central é Lyanna mormont
- O Node Com o Maior Alta Conectividade é Daenerys e Node Com o menor taxa de Conectividade é Ahsa
- O Node Com o Máximo de Interações com o Vizinho é Tyrion e o Node com a menor intereção entre os Vizinhos é Jofffrey

1.4 Conclusão

1.4.1 Tyrion é o node mais dominante em relação aos demais nodes, em contra partida, os nodes com baixa medida de centralidade, indica que os personagens não tem muita influência na série. Portanto, podemos concluir que Tyrion é o personagem principal da série.