Home work3: Random Network

Author: Kunlun Zhu

• Description:

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Network Centrality (due 1.5 weeks after lecture) (generate a 100x100 citation matrix)
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- 1. Compute Network centrality measures for co-citation network (degree, eigenvector, in betweenness, etc..).
- 2. Compute Network centrality measures for bibliographic coupling network (degree, eigenvector, in betweenness, etc..).
- 3. Compare the two.

Step one:

Initialize the adjacent matrix that would meet the qualification of a DAG, since there is only the possibility that the newly written paper would be able to cite the old one, so the network or graph should apper to be acyclic.

The way I'am going to do it is to give each one of the 100 papers with an index, from 1 to 100 and let's suppose if i < j, then paper with index i had been written before paper with index j. So the only thing we need to do is to make sure the element of the adjacent matrix A[i][j] = 0 if i <= j

```
In [1]:
          #!/usr/bin/python3.9
          # -*- coding: utf-8 -*-
          #author Kunlun Zhu 2022/7/10
          #setup the python environment
          import numpy as np
          import networks as nx
          import matplotlib.pyplot as plt
In [2]:
         Adj matrix = np. random. randint(2, size=(100, 100)) #Adjacency matrix
          for j in range(100): # to make sure the Adj matrix would fit a DAG graph
              for i in range (0, j + 1):
                  Adj matrix[i][j] = 0
          print(Adj matrix)
         [[0 0 0 ... 0 0 0]
          [0 \ 0 \ 0 \dots \ 0 \ 0]
          [1 \ 0 \ 0 \dots \ 0 \ 0]
          [0 \ 0 \ 0 \dots \ 0 \ 0]
          [1 \ 0 \ 0 \dots \ 1 \ 0 \ 0]
          [0 \ 1 \ 0 \dots \ 1 \ 1 \ 0]]
In [3]:
         link_list = [] # get the link list according to the Adj_matrix
          for index, a in np. ndenumerate (Adj matrix):
              if a == 1:
```

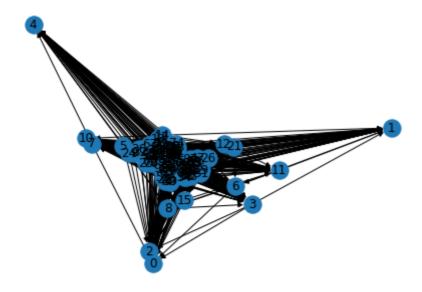
link_list.append((index[0], index[1]))

initialize the graph

G = nx. DiGraph()

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G. add_nodes_from(range(100))
G. add_edges_from(link_list)
nx. draw(G, with_labels=True)
print('Citation Network')
plt. show()
print('If the graph is a DAG:', nx. is_directed_acyclic_graph(G))
```

Citation Network



If the graph is a DAG: True

```
In [4]:
         A = Adj_{matrix}
         A_t = A. transpose()
         Co = np. matmul(A_t, A)
         Cocitation_G = nx. DiGraph()
         Cocitation_G. add_nodes_from(range(100))
         link_list_c = []
         for index, c in np.ndenumerate(Co):
             if c >= 1:
                  for k in range(c):
                      link_list_c.append((index[0], index[1]))
         Cocitation_G. add_edges_from(link_list_c)
         nx. draw(Cocitation_G, with_labels=True)
         print('Cocitation_matrix')
         print(Co)
         print('Co-citation Network')
         plt. show(Cocitation G)
```

```
Cocitation_matrix
[[46 20 21 ... 1 0 0]
[20 47 27 ... 1 1 0]
[21 27 43 ... 0 0 0]
...
[1 1 0 ... 2 1 0]
[0 1 0 ... 1 1 0]
[0 0 0 ... 0 0 0]
Co-citation Network
```

```
In [5]:
         A_t = A. transpose()
         Bi = np. matmul(A, A_t)
         Bibliographic_G = nx. DiGraph()
         Bibliographic_G. add_nodes_from(range(100))
         link_list_b = []
         for index, b in np. ndenumerate(Bi):
             if b >= 1:
                 for k in range(b):
                     link_list_b.append((index[0], index[1]))
         Bibliographic_G. add_edges_from(link_list_b)
         nx. draw(Bibliographic_G, with_labels=True)
         print('Bibliographic_matrix')
         print(Bi)
         print('Bibliographic Coupling Network')
         plt. show(Bibliographic_G)
        Bibliographic matrix
         [[0 \ 0 \ 0 \dots \ 0 \ 0]]
         [ 0 \ 0 \ 0 \dots \ 0 \ 0 ]
         [ 0 0 1 ... 0 1 0]
         [ 0 0 0 ... 48 24 22]
```

[0 0 1 ... 24 48 19] [0 0 0 ... 22 19 45]] Bibliographic Coupling Network

Task 1:

Compute Network centrality measures for co-citation network (degree, eigenvector, in betweenness, etc..).

```
In [7]:
    degree_cen_co = nx. degree_centrality(Cocitation_G)
    print('degree centrality of cocitation Network:', degree_cen_co)
    between_cen_co = nx. betweenness_centrality(Cocitation_G)
    print('Betweenness centrality of cocitation Network:', between_cen_co)
    closeness_centrality_co = nx. closeness_centrality(Cocitation_G)
    print('Closeness centrality of cocitation Network:', closeness_centrality_co)
    eigenvector_centrality_co = nx. eigenvector_centrality(Cocitation_G)
    print('Eigenvector centrality of cocitation Network:', eigenvector_centrality_co)
    try:
        katz_centrality_co = nx. katz_centrality(Cocitation_G)
        print('Katz centrality of cocitation Network:', katz_centrality_co)
    except:
        print('Katz centrality doesn\' t exist for this particular cocitation network')
    pr_co = nx. pagerank(G, alpha=0.85)
    print('Page rank of cociatation Network:', pr_co)
```

degree centrality of cocitation Network: {0: 1.95959595959598, 1: 1.959595959595959 8, 2: 1.91919191919193, 3: 1.95959595959595959, 4: 2.0, 5: 1.8787878787879, 6: 1.93 93939393939394, 7: 1.85858585858585858, 8: 2.0, 9: 1.93939393939394, 10: 1.9595959595 959598, 11: 1.9393939393939394, 12: 1.91919191919193, 13: 1.9393939393939394, 14: 1. 95959595959595, 15: 1.9797979797979, 16: 1.89898989898992, 17: 1.959595959595959 8, 18: 2.0, 19: 1.9191919191919193, 20: 1.91919191919193, 21: 1.9393939393939394, 2 394, 26: 1.959595959595959598, 27: 1.93939393939394, 28: 1.939393939393934, 29: 1.939 39393939394, 30: 1.9797979797978, 31: 1.979797979798, 32: 2.0, 33: 1.959595959595 9598, 34: 1.979797979798, 35: 2.0, 36: 2.0, 37: 1.979797979798, 38: 1.919191919191 9193, 39: 1.9595959595959598, 40: 2.0, 41: 1.9797979797978, 42: 1.9797979797978, 43: 93, 47: 1.979797979798, 48: 1.979797979798, 49: 1.959595959595959, 50: 1.95959595 95959598, 51: 1.9393939393939394, 52: 1.97979797979798, 53: 1.9595959595959598, 54: 1. 8787878787879, 55: 1.9393939393939394, 56: 2.0, 57: 1.93939393939394, 58: 1.979797 97979798, 59: 1.9595959595959598, 60: 2.0, 61: 1.8585858585858588, 62: 1.87878787878 79, 63: 1.93939393939394, 64: 2.0, 65: 1.93939393939394, 66: 1.97979797979798, 67: 1.9595959595959598, 68: 1.8989898989898992, 69: 1.95959595959595, 70: 2.0, 71: 1.939 39393939394, 72: 1.89898989898992, 73: 2.0, 74: 1.93939393939394, 75: 2.0, 76: 1.93939393939394, 77: 2.0, 78: 2.0, 79: 1.97979797979798, 80: 1.8989898989898992, 8 1: 1.91919191919193, 82: 1.9393939393939394, 83: 1.8989898989898992, 84: 2.0, 85: 1. 89898989898992, 86: 1.959595959595959598, 87: 1.8787878787879, 88: 2.0, 89: 1.898989 898989992, 90: 1.8585858585858588, 91: 1.575757575757576, 92: 1.65656565656565656, 93: 1.53535353535355, 94: 1.77777777777778, 95: 1.53535353535355, 96: 0.9696969696969 697, 97: 1.4949494949495, 98: 0.9090909090909092, 99: 0.0} Betweenness centrality of cocitation Network: {0: 0.0003332522833170926, 1: 0.00054298 44118822193, 2: 0.0002217621664181527, 3: 0.0004848767604638036, 4: 0.0008301461699934 0.0008301461699934861, 9: 0.000262186685464067, 10: 0.0005328442663346773, 11: 0.00030580131447501615, 12: 0.00026199740094900477, 13: 0.0005026584936362471, 14: 0.00048487 67604638036, 15: 0.000561668554519216, 16: 0.00018146698289908702, 17: 0.0003332522833 170926, 18: 0.0008301461699934861, 19: 0.0002217621664181527, 20: 0.000261997400949004 77, 21: 0.0004658465525442283, 22: 0.0005923597595510934, 23: 0.000262186685464067, 2 $4: \ 0.000561668554519216, \ 25: \ 0.000415570508422617, \ 26: \ 0.0003332522833170926, \ 27: \ 0.000415570508422617, \ 28: \ 0.0003332522833170926, \ 27: \ 0.000415570508422617, \ 28: \ 0.0003332522833170926, \ 27: \ 0.000415570508422617, \ 28: \ 0.0003332522833170926, \ 27: \ 0.000415570508422617, \ 28: \ 0.0003332522833170926, \ 27: \ 0.000415570508422617, \ 28: \ 0.0003332522833170926, \ 27: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.0003332522833170926, \ 27: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.000415570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.00041570508422617, \ 28: \ 0.000415705084241, \ 28: \ 0.000415705084241, \ 28: \ 0.000415705084241, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 28: \ 0.00041570508441, \ 0.00041570508441, \ 0.00041570508441, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157050841, \ 0.0004157$ 0262186685464067, 28: 0.0004774307916942591, 29: 0.0004261832092860075, 30: 0.00056166 8554519216, 31: 0.000765205859322177, 32: 0.0008301461699934861, 33: 0.000333252283317 0926, 34: 0.0005923597595510934, 35: 0.0008301461699934861, 36: 0.0008301461699934861, 37: 0.0005923597595510934, 38: 0.0002055963850638418, 39: 0.0005429844118822193, 40: 0.0008301461699934861, 41: 0.000561668554519216, 42: 0.000561668554519216, 43: 1.14026

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Task 2:

Compute Network centrality measures for bibliographic coupling network (degree, eigenvector, in betweenness, etc..).

```
In [8]:
    degree_cen_bib = nx. degree_centrality(Bibliographic_G)
    print('degree centrality of bibliographic coupling Network:', degree_cen_bib)
    between_cen_bib = nx. betweenness_centrality(Bibliographic_G)
    print('Betweenness centrality of bibliographic coupling Network:', between_cen_bib)
    closeness_centrality_bib = nx. closeness_centrality(Bibliographic_G)
    print('Closeness centrality of bibliographic coupling Network:', closeness_centrality_
    eigenvector_centrality_bib = nx. eigenvector_centrality(Bibliographic_G)
    print('Eigenvector centrality of bibliographic coupling Network:', eigenvector_central
    try:
        katz_centrality_bib = nx. katz_centrality(Bibliographic_G)
        print('Katz centrality of bibliographic coupling Network:', katz_centrality_bib)
    except:
        print('Katz centrality doesn\'t exist for this particular bibliographic coupling r
```

degree centrality of bibliographic coupling Network: {0: 0.0, 1: 0.0, 2: 0.92929292929 29294, 3: 1.595959595959596, 4: 0.0, 5: 1.5959595959596, 6: 1.878787878787879, 7: 1. 6969696969697, 8: 1.8989898989898992, 9: 1.91919191919193, 10: 1.414141414141444, 11: 1.676767676767677, 12: 1.89898989898992, 13: 1.91919191919193, 14: 1.919191919 1919193, 15: 1.7979797979797982, 16: 1.95959595959595959, 17: 1.91919191919193, 18: 1.91919191919193, 19: 1.8989898989898992, 20: 1.93939393939394, 21: 1.818181818181 8183, 22: 1.8383838383838385, 23: 1.9595959595959598, 24: 1.959595959595959, 25: 1.89 898989898992, 26: 1.9393939393939394, 27: 1.93939393939394, 28: 1.95959595959595959 8, 29: 1.898989898989892, 30: 1.9595959595959598, 31: 1.93939393939394, 32: 1.95959 59595959598, 33: 1.959595959595959598, 34: 1.9595959595959598, 35: 1.95959595959598, 3 3939394, 40: 1.9191919191919193, 41: 1.8787878787879, 42: 1.9191919191919193, 43: 1. 9595959595959598, 44: 1.9393939393939394, 45: 1.93939393939394, 46: 1.9393939393939 94, 47: 1.919191919191919, 48: 1.91919191919193, 49: 1.9393939393939394, 50: 1.9191 919191919193, 51: 1.9393939393939394, 52: 1.8787878787879, 53: 1.9595959595959595, 5 $4: \ 1.9595959595959598, \ 55: \ 1.9393939393939394, \ 56: \ 1.9393939393939394, \ 57: \ 1.9595959595959596$ 5959598, 58: 1.8989898989898992, 59: 1.91919191919193, 60: 1.85858585858585858, 61: 1.93939393939394, 62: 1.959595959595959598, 63: 1.93939393939394, 64: 1.8383838383 8385, 65: 1.8989898989898992, 66: 1.89898989898992, 67: 1.858585858585858, 68: 1.91 919191919193, 69: 1.9393939393939394, 70: 1.9595959595959598, 71: 1.9191919191919 3, 72: 1.9393939393939394, 73: 1.89898989898992, 74: 1.89898989898992, 75: 1.85858 5858585858, 76: 1.9191919191919193, 77: 1.959595959595959, 78: 1.89898989898989, 7 9: 1.93939393939394, 80: 1.9595959595959595, 81: 1.91919191919193, 82: 1.939393939 3939394, 83: 1.9191919191919193, 84: 1.89898989898992, 85: 1.9191919191919193, 86: 1.93939393939394, 87: 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Closeness centrality of bibliographic coupling Network: {0: 0. 0, 1: 0. 0, 2: 0.63327149

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Katz centrality doesn't exist for this particular bibliographic coupling network Page rank of bibliographic coupling Network: {0: 0.0015392544753131253, 1: 0.0015392544753131253, 2: 0.005824106031805391, 3: 0.008889511016571964, 4: 0.001539254475313125 3, 5: 0.008873448594756216, 6: 0.010194839525220234, 7: 0.009356171131426746, 8: 0.010 28801562040561, 9: 0.010381046548419195, 10: 0.008037354407358956, 11: 0.0092423461764 11701, 12: 0.010271074655763114, 13: 0.01036402066358503, 14: 0.01036207793917681, 15: 0.009816729957245253, 16: 0.010567309354558439, 17: 0.01036402066358503, 18: 0.0103620

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Task 3: Compare the two.

For degree centrality we can see both network are quiet similar: All the degree centrality of each node are similar, around 1.9

For other centrality we also don't see a very obvious diffence bettwen the two.

By the difference between the two network in HW1 we notice that.

The co-citation value more defined by the in-degree number, and the bibliographic coupling Network is more affected by the out-degree number.

That is to say, the very impactful and original paper would more likely to achieve high centrality in co-citation netwrok, and a survey or review paper tend to have higher centrality in bibliographic netwrok.