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Chapter III - The Internet Network
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 In [1]: |%pylab inline
         Populating the interactive namespace from numpy and matplotlib
 In [2]: #import libraries
         import networkx as nx
         from bs4 import BeautifulSoup
         1) Network from SVG with the best node positioning:
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In [3]: def Graph_from_SVG(stream):
             G=nx.Graph()
             attrs = {
                 "line" : ["x1", "y1", "x2", "y2"]
             op = open(stream, "r")
             xml = op.read()
             soup = BeautifulSoup(xml)
             count=0
             node_diz={}
             pos={}
             for attr in attrs.keys():
                 tmps = soup.findAll(attr)
                 for t in tmps:
                     node1=(t['x1'],t['y1'])
                     node2=(t['x2'],t['y2'])
                     if node1 not in node_diz :
                         node_diz[node1]=str(count)
                         pos[str(count)]=(float(node1[0]), float(node1[1]))
                         count+=1
                     if node2 not in node_diz:
                         node_diz[node2]=str(count)
                         pos[str(count)]=(float(node2[0]), float(node2[1]))
                     G.add_edge(node_diz[node1], node_diz[node2])
             #save the graph in an edge list format
             nx.write_edgelist(G, "C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/
         HWK 2 - TradeNet/data/test_graph.dat", data=False)
             return G, pos
         2) Next step is to Plot the test Networks:
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In [4]: #getting the network in the SVG format
         file="C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2 - TradeNet/dat
         a/test_graph.svg"
         (G,pos)=Graph_from_SVG(file)
         #plot the optimal node distribution
         nx.draw(G, pos, node_size = 150, node_color='black')
         #save the graph on a figure file
         savefig("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2 - TradeNet/
         data/test_network_best.png", dpi=200)
 In [5]: from networkx.drawing.nx_agraph import graphviz_layout
         #plotting the basic network
         G=nx.read_edgelist("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2
          TradeNet/data/test_graph.dat")
         graphviz_pos=nx.spring_layout(G)
         nx.draw(G, graphviz_pos, node_size = 150, node_color='black')
         #save the graph on a figure file
         savefig("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2 - TradeNet/
         data/test_network_graphviz.png", dpi=200)
         3) Lets find Degree Centrality:
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 In [6]: degree_centrality=nx.degree(G)
         print(degree_centrality)
         [('0', 5), ('1', 4), ('2', 7), ('3', 7), ('5', 5), ('7', 5), ('6', 7), ('4', 5), ('10', 6),
         ('9', 6), ('13', 5), ('22', 4), ('23', 4), ('14', 7), ('17', 6), ('8', 7), ('25', 6), ('16',
         3), ('11', 6), ('31', 8), ('38', 4), ('29', 6), ('12', 6), ('18', 5), ('32', 6), ('34', 6),
         ('21', 6), ('24', 7), ('15', 5), ('19', 6), ('41', 6), ('45', 5), ('20', 7), ('44', 5), ('3
         9', 7), ('46', 6), ('33', 7), ('26', 4), ('27', 7), ('28', 6), ('74', 3), ('75', 5), ('76',
         6), ('77', 6), ('30', 6), ('40', 6), ('78', 6), ('81', 5), ('85', 5), ('86', 5), ('82', 6),
         ('36', 5), ('57', 5), ('60', 7), ('35', 6), ('37', 5), ('64', 6), ('87', 8), ('50', 5), ('5
         9', 6), ('42', 7), ('43', 5), ('47', 6), ('51', 4), ('53', 6), ('48', 5), ('52', 4), ('49',
         8), ('54', 6), ('65', 7), ('66', 7), ('63', 5), ('55', 5), ('56', 4), ('67', 5), ('58', 5),
         ('61', 7), ('62', 4), ('73', 5), ('107', 7), ('90', 6), ('68', 5), ('69', 5), ('70', 7), ('7
         1', 6), ('72', 5), ('110', 6), ('112', 6), ('113', 7), ('116', 5), ('126', 5), ('79', 7), ('8
         3', 4), ('84', 5), ('92', 4), ('80', 7), ('91', 5), ('93', 7), ('97', 6), ('88', 8), ('89',
         5), ('98', 8), ('99', 5), ('105', 6), ('108', 6), ('94', 4), ('95', 5), ('96', 4), ('100',
         5), ('101', 5), ('102', 5), ('103', 5), ('106', 7), ('104', 3), ('109', 5), ('121', 5), ('11
         1', 7), ('118', 6), ('117', 5), ('114', 6), ('115', 6), ('124', 5), ('125', 5), ('119', 5),
         ('122', 6), ('120', 5), ('123', 4), ('127', 5)]
In [7]: l=[]
         res=dict(degree_centrality)
         for n in G.nodes():
             if n not in res:
                 print(res[n])
                 res[n]=0
             1.append(res[n])
         nx.draw_networkx_edges(G, pos)
         for n in G.nodes():
             list_nodes=[n]
             color = str( (res[n]-min(1))/float((max(1)-min(1))) )
             nx.draw_networkx_nodes(G, {n:pos[n]}, [n], node_size = 100, \
             node_color =
             color)
         savefig("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2 - TradeNet/
         data/degree_200.png", dpi=200)
         4) Define a function that calculate the distance from a root node:
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 In [8]: def node_distance(G, root_node):
             queue=[]
             list_distances=[]
             queue.append(root_node)
             #deleting the old keys
             if 'distance' in G.node[root_node]:
                 for n in G.nodes():
                     del G.node[n]['distance']
             G.node[root_node]["distance"]=0
             while len(queue):
                 working_node=queue.pop(0)
                 for n in G.neighbors(working_node):
                     if len(G.node[n])==0:
                         G.node[n]["distance"]=G.node[working_node] \
                         ["distance"]+1
                         queue.append(n)
             for n in G.nodes():
                 list_distances.append(((root_node,n),G.node[n]["distance"]))
             return list_distances
In [11]: # Changing node to nodes
         def node_distance(G,root_node):
             queue=[]
             list_distances=[]
             queue.append(root_node)
             #deleting the old keys
             if 'distance' in G.nodes[root_node]:
                 for n in G.nodes():
                     del G.nodes[n]['distance']
             G.nodes[root_node]["distance"]=0
             while len(queue):
                 working_node=queue.pop(0)
                 for n in G.neighbors(working_node):
                     if len(G.nodes[n])==0:
                         G.nodes[n]["distance"]=G.nodes[working_node] \
                         ["distance"]+1
                         queue.append(n)
             for n in G.nodes():
                 list_distances.append(((root_node,n),G.nodes[n]["distance"]))
             return list_distances
         5) Closeness from Centrality:
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In [12]: norm=0.0
         diz_c={}
         l_values=[]
         for n in G.nodes():
             l=node_distance(G,n)
             ave_length=0
             for path in 1:
                 ave_length+=float(path[1])/(G.number_of_nodes()-1-0)
             norm+=1/ave_length
             diz_c[n]=1/ave_length
             l_values.append(diz_c[n])
         #visualization
         nx.draw_networkx_edges(G, pos)
         for n in G.nodes():
             list_nodes=[n]
             color = str((diz_c[n]-min(l_values))/(max(l_values)- \
                                                   min(l_values)))
             nx.draw_networkx_nodes(G, {n:pos[n]}, [n], node_size = \
                                    100, node_color = color)
         savefig("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2 - TradeNet/
         data/closeness_200.png", dpi=200)
         6) Betweenness Centrality:
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In [14]: list_of_nodes=list(G.nodes())
         num_of_nodes=G.number_of_nodes()
         bc={} #we will need this dictionary later on
         for i in range(num_of_nodes-1):
             for j in range(i+1, num_of_nodes):
                 paths=nx.all_shortest_paths(G, source=list_of_nodes[i], \
                                             target=list_of_nodes[j])
                 count=0.0
                 path_diz={}
                 for p in paths:
                     #print p
                     count+=1.0
                     for n in p[1:-1]:
                         if n not in path_diz:
                             path_diz[n]=0.0
                         path_diz[n] += 1.0
                 for n in path_diz.keys():
                     path_diz[n]=path_diz[n]/count
                     if n not in bc:
                         bc[n]=0.0
                     bc[n]+=path_diz[n]
In [15]: #visualization
         1=[]
         res=bc
         for n in G.nodes():
             if n not in res:
                 res[n]=0.0
             1.append(res[n])
         nx.draw_networkx_edges(G, pos)
         for n in G.nodes():
             list_nodes=[n]
             color = str( (res[n]-min(1))/(max(1)-min(1)) )
             nx.draw_networkx_nodes(G, {n:pos[n]}, [n], node_size = 100, \
                                    node_color = color)
         savefig("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2 - TradeNet/
         data/betweenness_200.png", dpi=200)
         7) Finding Eigenvector Centrality:
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In [16]: #networkx eigenvector centrality
         centrality=nx.eigenvector_centrality_numpy(G)
         #visualization
         1=[]
         res=centrality
         for n in G.nodes():
             if n not in res:
                 res[n]=0.0
             1.append(res[n])
         nx.draw_networkx_edges(G, pos)
         for n in G.nodes():
             list_nodes=[n]
             color = str( (res[n]-min(1))/(max(1)-min(1)) )
             nx.draw_networkx_nodes(G, {n:pos[n]}, [n], node_size = 100, \
             node_color = color)
         savefig("eigenvetor_200.png", dpi=200)
         8) Computing the Giant Connected Component:
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In [17]: #Generating the test graph with two components
         G_test=nx.Graph()
         ('E','I')])
         #disconnetted node
         G_test.add_node('X')
         nx.draw(G_test)
         savefig("components_200.png", dpi=200)
         Giant Component through a Breadth First Search
In [19]: def giant_component_size(G_input):
             G=G_input.copy()
             components=[]
             node_list=list(G.nodes())
             while len(node_list)!=0:
                 root_node=node_list[0]
                 component_list=[]
                 component_list.append(root_node)
                 queue=[]
                 queue.append(root_node)
                 G.nodes[root_node]["visited"]=True
                 while len(queue):
                     working_node=queue.pop(0)
                     for n in G.neighbors(working_node):
                         #check if any node attribute exists
                         if len(G.nodes[n])==0:
                             G.nodes[n]["visited"]=True
                             queue.append(n)
                             component_list.append(n)
                 components.append((len(component_list),component_list))
                 #remove the nodes of the component just discovered
                 for i in component_list: node_list.remove(i)
             components.sort(reverse=True)
             GiantComponent=components[0][1]
             SizeGiantComponent=components[0][0]
             return GiantComponent,len(components)
         (GCC, num_components)=giant_component_size(G_test)
         print ("Giant Connected Component:",GCC)
         print ("Number of components:", num_components)
         Giant Connected Component: ['A', 'B', 'C', 'D', 'E', 'F', 'H', 'G', 'I']
         Number of components: 2
         9) Findind Robustness:
         Breaking the GCC:
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In [20]: import copy
         def breaking_graph(H, node_list):
             #define the new graph as the subgraph induced by the GCC
             n_l=copy.deepcopy(node_list)
             H = H.copy()
             #iterate deleting from the GCC while the graph comprises
             #one component (num_components=1)
             num_components=1
             count=0
             while num_components==1:
                 count+=1
                 #node_to_delete=random.choice(H.nodes()) #select at random an element in the node li
         st
                 #select a node according to the betweenness ranking
                 #(the last in the list)
                 node_to_delete=n_l.pop()
                 H.remove_node(node_to_delete)
                 #(GCC, num_components) = giant_component_size(H)
                 num_components=nx.number_connected_components(H)
             return count
In [21]: (GCC, num_components)=giant_component_size(G_test)
         G_GCC = G_test.subgraph(GCC)
         random_list=list(copy.deepcopy(G_GCC.nodes()))
         random.shuffle(random_list)
In [22]: G\_GCC\_1 = G\_GCC.copy()
         nx.is_frozen(G_GCC_1)
Out[22]: False
         Breaking the graph randomly:
In [23]: (GCC, num_components)=giant_component_size(G_test)
         G_GCC = G_test.subgraph(GCC)
         random_list= list(copy.deepcopy(G_GCC.nodes()))
         G\_GCC = G\_GCC.copy()
         random.shuffle(random_list)
         c= breaking_graph(G_GCC, random_list)
         print ("num of iterations:", c)
         graphviz_pos=nx.spring_layout(G_GCC)
         nx.draw(G_GCC, graphviz_pos, node_size = 200, with_labels=True)
         savefig("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK 2 - TradeNet/
         data/broken_component_200.png", dpi=200)
         num of iterations: 2
         Averaging the random result:
In [24]: #loading the Automous System (AS) graph
         G_AS=nx.read_edgelist("C:/Users/shrey/OneDrive/Desktop/Data Engineering/HWK 4 - Internet/HWK
         2 - TradeNet/data/AS-19971108.dat")
         print ("number of nodes:",G_AS.number_of_nodes(),"number of edges:",G_AS.number_of_edges())
         (GCC, num_components)=giant_component_size(G_AS)
         n_iter=1000
         count=0.0
         for i in range(n_iter):
             G\_GCC = G\_AS.subgraph(GCC)
             random_list=list(copy.deepcopy(G_GCC.nodes()))
             random.shuffle(random_list)
             c= breaking_graph(G_GCC, random_list)
             count+=c
         print ("average iterations to break GCC:",count/n_iter)
         number of nodes: 3015 number of edges: 5156
         average iterations to break GCC: 7.713
         Breaking with Betweenness Centrality:
In [25]: import operator
         G\_GCC = G\_AS.subgraph(GCC)
         node_centrality=nx.betweenness_centrality(G_GCC, k=None, \
         normalized=True, weight=None, endpoints=False, seed=None)
         #node_centrality=nx.degree_centrality(G)
         sorted_bc = sorted(node_centrality.items(), \
         key=operator.itemgetter(1))
```

#selecting the ranked node list

node_ranking.append(e[0])

print ("num of iterations:", c)

c=breaking_graph(G_GCC, node_ranking)

node_ranking=[]
for e in sorted_bc:

num of iterations: 1

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