Assignment 6 CS532-s16: Web Sciences

Spring 2016

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1

Question

1. D3 graphing (5 points)

Use D3 to visualize your Twitter followers. Use my twitter account ("@phonedude_mln") if you do not have >= 50 followers. For example, @hvdsomp follows me, as does @mart1nkle1n. They also follow each other, so they would both have links to me and links to each other.

To see if two users follow each other, see: https://dev.twitter.com/rest/reference/get/friendships/show

Attractiveness of the graph counts! Nodes should be labeled (avatar images are even better), and edge types (follows, following) should be marked.

Note: for getting GitHub to serve HTML (and other media types), see: http://stackoverflow.com/questions/6551446/can-i-run-html-files-directly-from-github-instead

Be sure to include the URI(s) for your D3 graph in your report.

Answer

The twitter account I choose to visualize was the WebSciDL. Doing so proved to be an undertaking. The python file seen in listing 1 shows the process. The first thing I do is to get the followers of the WebSciDl group, this was easy as the rate limit for this was not an issue. After getting that comes the hard part.

In checking if the followers friends follow each other was not easy. The rate limit for "reference/get/friendships/show" only let me get through about 3 a day with sleeping to avoid rate limit hits. So I decided to do it a "longer way". So I simply got the friends the normal way and computed the friendship by code. It must be noted that in the method getFriends the json output is simply appended to the file. To correct this you must when finished do so by hand. The past assignments we have been asking twitter and I simply re-used the majority of that code to complete this portion.

Building the graph was simple enough thanks to using the networkx python library as seen in listing 2. As usual for more information please see the comments in the listing for details but in short the process is as such.

- 1. Get the twitter followers and those followers friends
- 2. Add the followers as nodes to the directed graph
- 3. Add WebSciDL edge to all nodes except WebSciDL
- 4. Add rest of the edges
- 5. Prepare data for output
- 6. Write out data

Please not that the image url contains _normal so I by hand well editor find replace removed it for the full image.

The javascript used for the vis is seen in listing 4 and the vis can be seen at

http://www.cs.odu.edu/~jberlin/WebSciGraphVis/a6.html

Table 1: Gender Homophilly results

$_{\mathrm{males}}$	females	nodes	$_{ m edges}$	p	\mathbf{q}	2pq	crossEdges	crossEdgesP	homophily	
120	82	38	120	1181	0.68	0.32	0.43	386	0.33	Yes

2

Question

2. Gender homophily in your Twitter graph (5 points)

Take the Twitter graph you generated in question #1 and test for male-female homophily. For the purposes of this question you can consider the graph as undirected (i.e., no distinction between "follows" and "following"). Use the twitter name (not "screen name"; for example "Michael L. Nelson" and not "@phonedude_mln") and programatically determine if the user is male or female. Some sites that might be useful:

```
https://genderize.io/
https://pypi.python.org/pypi/gender-detector/0.0.4
```

Create a table of Twitter users and their likely gender. List any accounts that can't be determined and remove them from the graph.

Perform the homophily test as described in slides 11-15, Week 7.

Does your Twitter graph exhibit gender homophily?

As seen in the table below yes because crossEdge Percent (0.33) is greater than 2pq(0.32). The code used to generate the results is seen in listing 3 I used a method found on github to ask genderize io for the results. The actual data is too large to put in this report and can be found in the file wsdlGenderResults2.csv.

```
import csv
  import json
  import networks as nx
  import tweepy
  import config
  # get the friends for a person
  def getFriends(api, screenname):
      print ("looking up friends for follower: %s\n" % screenname)
13
      fl = []
      # get the friends by using a cursor to query the twitter api
14
      items = { 'screenname ': screenname}
16
          for friend in tweepy. Cursor (api.friends, screen_name=
17
      screenname, count=200).items():
               fl.append(friend.screen_name)
18
       except Exception as e:
19
          print ("There was an exception", e)
20
      items['friends'] = fl
21
      with open("wsdlfollwerFriends.json", "a") as out:
22
          out.write(json.dumps(items, indent=2) + ",\n")
23
24
       return fl
25
26
27
28 # get the wsdl groups twitter followers
  def getWSDL_follwers(tapi):
29
      fs = [] # type: list[tweepy.User]
30
      # get the followers by using a cursor to query the twitter api
31
      for page in tweepy. Cursor (tapi.followers, screen_name="WebSciDL
      ", count=200).pages():
33
           print(page)
           fs.extend(page)
34
35
          # add the followers to out dic
36
      with open("wsdltwitterfollwers.csv", "w+") as out:
37
          out.write("name, screenName, imurl\n")
38
           for pp in fs:
39
40
               print (pp)
               out.write("%s,%s,%s\n" % (pp.name, pp.screen_name, pp.
41
      profile_image_url))
42
43
  def get_friends():
44
      auth = tweepy.OAuthHandler(config.consumer_key, config.
45
      consumer_secret )
      auth.set_access_token(config.access_token, config.access_secret
46
      # do not want twitter to slap a rate limit exceeded on me so
47
      explicitly wait after each request to avoid that
      api = tweepy.API(auth, wait_on_rate_limit=True,
      wait_on_rate_limit_notify=True) # type: tweepy.API
      with open("wsdlfollwerFriends.json", "r+") as r:
          it = json.load(r)
```

```
print(it)
51
       gotten = set(map(lambda x: x['screenname'], it['followers']))
52
       for g in gotten:
53
54
           print(g)
56
       with open('wsdltwitterfollwers.csv', "r") as o:
           reader = csv.DictReader(o)
57
           out = \{\}
58
           for row in reader:
59
               print(row)
60
               if row['screenName'] not in gotten:
    print(row['screenName'])
61
62
                    flist = getFriends(api=api, screenname=row['
63
      screenName'])
                    if len(flist) > 0:
                        print(len(flist))
65
66
67
68
  69
70
       auth = tweepy.OAuthHandler(config.consumer_key, config.
71
       consumer_secret )
       auth.set_access_token(config.access_token, config.access_secret
72
      # do not want twitter to slap a rate limit exceeded on me so
      explicitly wait after each request to avoid that
       api = tweepy.API(auth, wait_on_rate_limit=True,
74
       wait\_on\_rate\_limit\_notify = True) \quad \# \ type: \ tweepy.API
      ## build_graph()
      ## tweepy. User
      # bg2()
77
       getWSDL_follwers(api)
79
       get_friends()
80
      # set up oauth
```

Listing 1: Get Twitter Data for the WSDL

```
import csv
  import json
  import networks as nx
  class Node:
       def __init__(self, row):
           # name, screenName, imurl
           self.name = row['name']
           self.screenName = row['screenName']
           self.imurl = row['imurl']
           self.indegree = 0
           self.outdegree = 0
13
           self.group = 0
14
           self.eGroup = set()
16
17
       def to_jdic(self):
           out = { 'name': self.name, 'screenName': self.screenName, '
18
      imurl': self.imurl,
                   'indegree': self.indegree, 'outdegree': self.
19
                  'group': self.group,
      outdegree,
                   'egroups': list(self.eGroup)}
20
21
           return out
22
23
       def = str_{-}(self):
           return self.screenName
24
25
26
27
  class Edge:
       def __init__(self , source , sIndex , target , tIndex , edgeToGroup)
28
           self.source = source
29
           self.sIndex = sIndex
30
           self.target = target
31
           self.tIndex = tIndex
32
           self.edgeToGroup = edgeToGroup
33
34
       def to_jdic(self):
35
           out = { 'source': self.sIndex, 'sname': self.source, 'target
       ': self.tIndex, 'tname': self.target,
                   'egroup': self.edgeToGroup}
37
           return out
38
39
40
  class Edge2:
41
42
       def __init__(self , source , target):
           self.source = source
43
           self.target = target
44
45
       def to_jdic(self):
46
           out = { 'source': self.source, 'target': self.target}
47
           return out
48
49
50
51
  These are the groups I got after inspecting the wsdl twitter
      followers by hand
```

```
53 wsdlTwitterHandles members themselves
54
  digLibHandles digital libraries and archival twitter accounts
56
   wsdlTwitterHandles = ['machawk1', 'aalsum', 'justinfbrunelle', '
phonedude_mln', 'weiglemc', 'Galsondor',
57
      hanysalaheldeen', 'simplesimon2013', 'fmccown', 'mart1nkle1n', 'joansm1th', 'hvdsomp', '
60
       johnaberlin', 'WebSciDL', 'DanMilanko']
61
  62
63
                    "WebArch_RT"
64
65
   userToGroup = {}
66
67
68
       node groups:
69
70
       normal: 0
       wsdl: 1
71
72
       diglib: 2
       odu: 3
73
74
       edge groups means which node groups
75
       point to another node groups
76
77
78
       edge groups:
       normal \rightarrow normal 0
79
       normal -> wsdl 1
80
       normal -> dlib 2
81
       normal -> odu 3
82
83
84
       wsdl -> normal 4
       wsdl \rightarrow wsdl 5
85
86
       wsdl -> dlib 7
       wsdl \rightarrow odu 6
87
88
89
       dlib -> normal 8
90
       dlib -> wsdl 9
91
       dlib -> dlib 10
92
       dlib -> odu 11
93
94
       odu -> normal 12
95
       odu \rightarrow wsdl 13
96
       odu -> dlib 14
97
       odu -> odu 15
98
99
101
   def getGroup(test):
       g = 0
```

```
if test in wsdlTwitterHandles:
105
                               # print("We have a wsdl person ", test)
                               g = 1
106
                     elif test in digLibHandles:
107
                               # print("We have a diglib person", test)
108
                               g = 2
                     elif 'odu' in test.lower() or 'monarch' in test.lower() or '
                    MaceandCrown' in test.lower():
                               # print("We have odu", test)
111
                               g = 3
                    userToGroup[test] = g
113
114
                    return g
115
        #simple enumeration of the edge groups possibilities
        {\tt edgeTGroup} \, = \, \{ (\,0 \,, \ 0\,) \, \colon \ 0 \,, \ (\,0 \,, \ 1\,) \, \colon \ 1 \,, \ (\,0 \,, \ 2\,) \, \colon \ 2 \,, \ (\,0 \,, \ 3\,) \, \colon \ 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 2 \,, \ (\,0 \,, \ 3\,) \, \colon \ 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \, \colon \, 3 \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) \,, \ (\,1 \,, \ 0\,) 
117
                    118
                                                 (3, 0): 12, (3, 1): 13, (3, 2): 14, (3, 3): 15}
119
120
         def bg():
122
                    with open("wsdlfollwerFriends.json", "r+") as r:
                                it = json.load(r)
124
                    it = it['followers']
127
                    nlist = []
128
                    #get a directed graph object
129
                    graph = nx.DiGraph()
130
132
                    # add the nodes to the graph
                    with open('wsdltwitterfollwers.csv', "r") as o:
                                reader = csv.DictReader(o)
134
                                for row in reader:
                                            nlist.append(row['screenName'])
136
137
                                           n = Node(row)
                                           sname = row['screenName']
138
139
                                            if sname in "WebSciDL":
140
141
                                                       print(sname)
142
                                           n.group = getGroup(sname)
143
                                            graph.add_node(row['screenName'], attr_dict={'nclass':
                    n })
145
                    # since I know that these nodes were gotten by the followers of
146
                      the wsdl I add by hand the edge to it
                    for sname in nlist:
147
                                if "WebSciDL" not in sname:
148
                                            graph.add_edge(sname, "WebSciDL")
149
                     nlist = sorted(nlist)
                                get the friendship for the followers by adding the edges
                                and checking if graph has the node we added first from the
154
                               only wsdl follower file
156
```

```
for ff in it:
           fflist = []
158
           screanname = ff['screenname']
           for ffFriend in ff['friends']:
160
               if graph.has_node(ffFriend) and "WebSciDL" not in
       ffFriend:
                   fflist.append(ffFriend)
                   graph.add_edge(screanname, ffFriend)
164
       nodeList =
       edgeList = []
166
167
           build our output
168
169
           for each node in the graph
           get its python class and determine the in out degree
           for each edge for the node add its edge groups
171
172
       for node, ndata in sorted(graph.nodes(data=True), key=lambda x:
173
       x[0]:
           # print(node, ndata['nclass'])
174
           nodeClass = ndata['nclass']
175
           # print(nodeClass.screenName)
           nodeClass.indegree = graph.in_degree(node)
177
178
           nodeClass.outdegree = graph.out_degree(node)
           nodeList.append(nodeClass)
179
           for source, target in graph.edges(node):
               nodeClass.eGroup.add(edgeTGroup[(userToGroup[source],
181
       userToGroup[target])])
               e = Edge(source, nlist.index(source), target, nlist.
182
       index (target),
                        edgeTGroup[(userToGroup[source], userToGroup[
       target])])
               edgeList.append(e)
184
               print("%s->%s" % (source, target))
185
           186
187
       g = \{\}
188
       g['nodes'] = nodeList
189
       g['links'] = edgeList
190
191
       print(json.dumps(g, default=lambda c: c.to_jdic(), indent=1))
       with open("wsdlgraphData.json", "w+") as out:
192
           out.write(json.dumps(g, default=lambda c: c.to_jdic(),
       indent=1))
```

Listing 2: Build The WSDL Graph

```
1 import csv
  import json
  from collections import Counter
  import networks as nx
  import requests
  edgeTGroup = \{(0, 0): 0, (0, 1): 1, (0, 2): 2, (0, 3): 3, (1, 0): \}
      4, (1, 1): 5, (1, 2): 6, (1, 3): 7,
                 (2, 0): 8, (2, 1): 9, (2, 2): 10, (2, 3): 11,
                 (3, 0): 12, (3, 1): 13, (3, 2): 14, (3, 3): 15
  wsdlTwitterHandles = ['machawk1', 'aalsum', 'justinfbrunelle', '
phonedude_mln', 'weiglemc', 'Galsondor',
                          "shawn mjones", "ibnesayeed", "Lulwah MA", "
13
      yasmina_anwar', 'kaylamarie0110'
                           maturban1', 'CorrenMcCoy', 'acnwala', '
14
                         'simplesimon2013', 'fmccown',
'mart1nkle1n', 'joansm1th', 'hvdsomp', '
      hanysalaheldeen',
      johnaberlin', 'WebSciDL', 'DanMilanko']
16
  17
                    'JCDLConf', 'archiveitorg', "archiveis", "idjl", "
18
       webrecorder_io", "tpdl2016", "WOSP2014",
                    "WebArch_RT" |
19
20
  userToGroup = {}
21
22
23
  def getGroup(test):
24
      g = 0
25
       if test in wsdlTwitterHandles:
26
          # print("We have a wsdl person ", test)
27
28
          g = 1
       elif test in digLibHandles:
29
          # print("We have a diglib person", test)
30
          g = 2
       elif 'odu' in test.lower() or 'monarch' in test.lower() or '
      MaceandCrown' in test.lower():
          # print("We have odu", test)
34
           g = 3
      userToGroup[test] = g
35
36
       return g
37
38
  def getGenders(names):
39
40
      Thanks https://github.com/block8437/gender.py
41
      The MIT License (MIT)
42
43
       Copyright (c) 2013 block8437
44
45
       Permission is hereby granted, free of charge, to any person
46
      obtaining a copy of
       this software and associated documentation files (the "Software
      "), to deal in
```

```
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      LIABILITY, WHETHER
      IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING FROM, OUT
      OF OR IN
      CONNECTION WITH THE SOFTWARE OR THE USE OR OTHER DEALINGS IN
61
      THE SOFTWARE.
       url = ""
63
       cnt = 0
64
       for name in names:
65
           if url == "":
66
               url = "name[0] = " + name
67
           else:
68
               cnt += 1
               url = url + "&name[" + str(cnt) + "] = " + name
70
71
       req = requests.get("http://api.genderize.io?" + url)
72
73
       results = json.loads(req.text)
74
75
       retrn = []
       for result in results:
76
           if result ["gender"] is not None:
77
               retrn.append((result["gender"], result["probability"],
       result ["count"]))
           else:
               retrn.append((u'None', u'0.0', 0.0))
80
       return retrn
81
82
83
  def splitOrWhole(s):
84
      \# gender only works on first names so split the name splitted = s['name'].split(' ')
85
86
      # there was a first name
87
       if len(splitted) > 0:
88
89
          return splitted [0]
       else: # otherwise just give back the original
90
91
          return s
92
93
```

```
class GNode:
94
        def __init__(self , row , g):
95
            # name, screenName, imurl
96
            self.name = row['name']
97
            self.imurl = row['imurl']
98
            self.screenName = row['screenname']
99
            self.indegree = 0
100
            self.outdegree = 0
            self.gender = g
102
            {\tt self.group} \, = \, 0
103
        def to_jdic(self):
105
            out = { 'name': self.name, 'screenName': self.screenName, '
106
       gender': self.gender,
                    'indegree': self.indegree, 'outdegree': self.
       outdegree , "group": self.group}
108
            return out
110
        def = str_{-}(self):
            return self.screenName
112
113
   class GEdge:
114
        def __init__(self, source, sIndex, target, tIndex, edgeToGroup,
115
        sg, tg, cross):
            self.source = source
116
            self.sIndex = sIndex
117
            self.target = target
118
            self.tIndex = tIndex
119
            self.sGender = sg
120
121
            self.tGender = tg
            self.edgeToGroup = edgeToGroup
122
            self.isCross = cross
123
124
       def to_jdic(self):
            out = { 'source': self.sIndex, 'sname': self.source, 'target
126
        ': self.tIndex, 'tname': self.target,
                    'egroup': self.edgeToGroup, "cross":self.isCross}
127
128
            return out
129
130
   def getGender():
131
        with open('wsdltwitterfollwers.csv', "r") as o:
            reader = csv.DictReader(o)
133
            rrList = []
134
            rList = []
            for row in reader:
136
137
                rList.append(row)
                # be nice to the api so we only send 9 at a time as max
138
        is 10
                if len(rList) == 9:
139
                     rrList.append(list(rList))
140
141
                     rList.clear()
            with (open("wsdlGenderResults2.csv", "w+")) as out:
143
                out.write("name, screenname, gender, prob\n")
                for rl in rrList:
144
145
                     result = getGenders(list(map(lambda r: splitOrWhole
```

```
(r), rl)))
                     for gdr, rrl in zip(result, rl):
146
                          print(gdr)
147
                          out.write("%s,%s,%s,%s,%f\n" % (rrl['name'], rrl['
148
       screenName'], gdr[0], float(gdr[1])))
149
   def check_gender_homophily():
        with open("wsdlfollwerFriends.json", "r+") as r:
152
            it = json.load(r)
154
        it = it['followers']
155
157
        nlist = []
       ng = \{\}
158
        graph = nx.DiGraph()
159
160
        genderCounter = Counter()
        with open('wsdlGenderResults2.csv', "r") as o:
162
            reader = csv.DictReader(o)
            for row in reader:
164
                 if 'None' not in row['gender']:
                     nlist.append(row['screenname'])
167
                     n = GNode(row, row['gender'])
                     ng[row['screenname']] = row['gender']
genderCounter[row['gender']] += 1
168
169
                     genderCounter['peeps'] += 1
                     sname = row['screenname']
171
                     n.group = getGroup(sname)
172
                     graph.add_node(row['screenname'], attr_dict={'
       nclass': n})
174
        nlist = sorted(nlist)
175
        for ff in it:
177
            fflist = []
178
            screanname = ff['screenname']
179
180
            if graph.has_node(screanname):
                 for ffFriend in ff['friends']:
181
                      if graph.has_node(ffFriend):
182
                          fflist.append(ffFriend)
183
                          cross = 0
184
                          if ng[screanname] != ng[ffFriend]:
185
                              cross = 1
186
                          graph.add_edge(screanname, ffFriend, attr_dict
187
       ={'sg': ng[screanname], 'tg': ng[ffFriend], 'cross':cross})
188
       nGenders = genderCounter['peeps']
189
       nMale = genderCounter['male']
190
       nFemale = genderCounter['female']
191
192
       p = nMale / nGenders
       q \, = \, nFemale \, \, / \, \, nGenders
194
       twopq = 2 * p * q
       r = \text{``Total Members of Gender graph: } \%d \backslash nNumber \text{ of males in graph}
196
        : %d\nNumber of Females in graph: %d"%(nGenders, nMale, nFemale
```

```
r2= "P value of: \%.2 f nQ value of: \%.2 f n2pq value of \%2 f" \% (p
197
        , q, twopq)
198
199
        print("Checking cross edges")
200
       numCrossGenderEdges = 0
201
202
       nEdges = 0
       for source, target, gender in graph.edges(data=True):
203
            nEdges += 1
204
            if gender['sg'] != gender['tg']:
205
                numCrossGenderEdges += 1
206
207
208
209
        print(r)
       print(r2)
        crossPercent = numCrossGenderEdges/nEdges
211
        print ("Number of edges: %d, Number of cross-gender edges: %d,
       Percent: %.2f "%(nEdges, numCrossGenderEdges, crossPercent))
       win="Yes"
213
        if crossPercent == twopq:
214
            print("2pq(\%.2f)) = cross edge precentage(\%.2f)"\%(twopq,
       crossPercent))
            print("There is no homophily")
            win="No"
217
       else:
218
            print("2pq(%.2f) != cross edge precentage(%.2f)"%(twopq,
219
       crossPercent))
            print("There is homophily")
221
       with open("homophillyTest.csv","w+") as out:
            out.write("males, females, nodes, edges, p, q, 2pq, crossEdges,
       crossEdgesP, homophily\n")
            out.write("%d,%d,%d,%d,%d,%d,%.2f,%.2f,%d,%.2f,%d,%.2f,%s"%(
224
       nGenders\;,\;\;nMale\;,\;\;nFemale\;,nGenders\;,nEdges\;,p\;,q\;,twopq\;,
       numCrossGenderEdges, crossPercent, win))
       nodeList = [
227
        edgeList = []
       for node, ndata in sorted(graph.nodes(data=True), key=lambda x:
228
        x[0]):
            # print(node, ndata['nclass'])
            nodeClass = ndata['nclass']
230
            # print(nodeClass.screenName)
231
            nodeClass.indegree = graph.in\_degree(node)
            nodeClass.outdegree = graph.out_degree(node)
233
            nodeList.append(nodeClass)
            for source, target, data in graph.edges(node, data=True):
235
236
                e = GEdge(source, nlist.index(source), target, nlist.index
       (target), edgeTGroup[(userToGroup[source], userToGroup[target])],
       data['sg'], data['tg'], data['cross'])
                edgeList.append(e)
238
239
       g = \{\}
       g['nodes'] = nodeList
241
       g['links'] = edgeList
243
       with open("wsdlgraphGender.json","w+") as out:
```

```
out.write(json.dumps(g,default=lambda c:c.to_jdic(), indent=1))

if -_name__ == "_-main__": check_gender_homophily()
```

Listing 3: Check Gender

```
linksG, nodesG, k, tooltip, inOutExtent, circleRadius, node_drag
       , link;
  var curLinksData = [], curNodesData = [], filter,
      layout, linkedByIndex = {},
      \mathrm{node}\,,\ \mathrm{toggle}\,=\,0\,,\ \mathrm{text}\,,
      sort , allData ,
      padding = 1.5, // separation between circles
      radius = 25, curWhat = 16;
10
11
13 //most things were derived from
                                        //https://flowingdata.com
       /2012/08/02/how-to-make-an-interactive-network-visualization/
14
15 //these are the color values and groupings I have mapped
16 // node groups:
17 //
         normal: 0
18 // wsdl: 1
19 // diglib: 2
20 // odu: 3
21 //
22 // edge groups:
23 // normal -> no
24 // normal -> wsdl 1
         normal -> normal 0
25 // normal -> dlib 2
26 // normal -> odu 3
27 //
28 // wsdl -> normal 4
29 // wsdl -> wsdl 5
30 // wsdl -> dlib 7
31 // wsdl -> odu 6
32 //
33 //
34 // dlib -> normal 8
35 // dlib -> wsdl 9
36 // dlib -> dlib 10
37 // dlib -> odu 11
38 //
39 // odu -> normal 12
40 // odu -> wsdl 13
41 // odu -> dlib 14
42 // odu -> odu 15
43
44
  function linkDist(l) {
45
46
      var ret;
      //make the link distances more dynamic i Kinda gave up here
47
      if (1.source.group = 0) {
48
         ret = 200;
49
50
      } else if (l.source.group == 1) {
51
        ret = 100;
      } else if (l.source.group == 2) {
52
53
        ret = 150;
      } else {
```

```
ret = 175;
56
      if (curWhat == 0) {
57
          ret = 200;
58
59
      if (curWhat == 5) {
60
          ret = 200;
61
62
      if (curWhat == 6) {
63
         ret = 200;
64
65
      if (curWhat == 15) {
66
         ret = 200;
67
68
      if (curWhat == 8) {
69
          ret = 200;
70
71
      return ret;
72
73 }
74
75
   function collide(node) {
      //got this from examples http://bl.ocks.org/mbostock/3231298#
76
       index.html
      var r = 2 * node.radius + 8,
77
         nx1 = node.x - r,
78
         nx2 = node.x + r,
79
         ny1 = node.y - r,
80
         ny2 = node.y + r;
81
      return function (quad, x1, y1, x2, y2) {
82
          if (quad.point && (quad.point !== node)) {
83
             var x = node.x - quad.point.x,
y = node.y - quad.point.y,
84
85
                l = Math. sqrt(x * x + y * y),
86
                r = node.radius + quad.point.radius + padding;
87
             if (l < r) { l = (l - r) / l * .8;
88
89
                node.x = x *= 1;
90
91
                node.y -= y *= l;
                quad.point.x += x;
92
93
                quad.point.y += y;
             }
94
95
         return x1 > nx2
96
             |\,|\ x2\ <\ nx1
97
98
             | | y1 > ny2
             | | y2 < ny1;
99
      };
100
101
   function showDetails(d) {
103
      //show the detail about a node in the graph
104
      var content = 'User Name: ' + d.name + '</span</pre>
106
       >';
      content += '<hr class="tooltip-hr">';
107
      content += ' Screen Name: ' + d.screenName + '
108
       span > ';
```

```
content += '<hr class="tooltip-hr">';
109
      content += '<img src=' + d.imurl + ' alt="Stuff" style="width</pre>
       :100px;height:100px;">';
      tooltip.showTooltip(content, d3.event);
111
112
113
114
   //begin not really used section
115
   function mapNameToNode(nodes) {
116
      \mathbf{var} \quad \text{map} = d3 \cdot \text{map}();
117
      nodes.forEach(function (node) {
118
119
         map.set(node.screenName, node);
      });
120
121
      return map;
   }
123
124
   function buildIndex() {
125
      for (\mathbf{var} \ i = 0; \ i < allData.nodes.length; i++) {
126
         linkedByIndex[i + "," + i] = 1;
127
128
      allData.links.forEach(function (d) {
129
         linkedByIndex[d.source.index + "," + d.target.index] = 1;
130
131
133
   function neighboring (a, b) {
134
      return linkedByIndex[a.index + "," + b.index] || linkedByIndex[b
       .index + "," + a.index];
   //end not really used section
138
139
   //so when we redo things I can have the data already nice and tidy
140
141
   function prepairData(data) {
142
       //the node radius is based on the sum of their in and out degree
      inOutExtent = d3.extent(data.nodes, function (node) {
143
144
         return node.indegree + node.outdegree;
145
146
      circleRadius = d3.scale.sqrt()
147
          .range([3, 14]).domain(inOutExtent);
148
149
      data.nodes.forEach(function (n) {
         //where do we want to place our nodes
151
         n.x = Math.floor(Math.random() * width);
         n.y = Math.floor(Math.random() * height);
154
         n.radius = circleRadius(n.indegree + n.outdegree);
156
      var nameNodeMap = mapNameToNode(data.nodes);
157
      data.links.forEach(function (1) {
158
159
          //point our links to the nodes that have position computed
       already
160
         var s = nameNodeMap.get(l.sname);
         var t = nameNodeMap.get(l.tname);
161
162
         l.sx = s.x;
```

```
l.sy = s.y;
164
                       l.tx = t.x;
                       l.ty = t.y;
166
               return data;
168
169
       //\,begin\ copy\ pasta\ from\ http://www.coppelia.io/2014/07/an-a-to-z-of
                  -extra-features-for-the-d3-force-layout/
        function dragstart (d, i) {
                force.stop(); // stops the force auto positioning before you
172
                  start dragging
        function dragmove(d, i) {
174
               d.px += d3.event.dx;
               d.py += d3.event.dy;
176
               d.x += d3.event.dx;
               d.y += d3.event.dy;
178
179
               tick();
180
        function dragend(d, i) {
181
               // of course set the node to fixed so the force doesn't include
182
                  the node in its auto positioning stuff
               d.fixed = true;
183
               tick();
184
               force.resume();
185
186
       function releasenode(d) {
187
               d.fixed = false; // of course set the node to fixed so the force
188
                     doesn't include the node in its auto positioning stuff
               //force.resume();
189
190
191
        // end \ copy \ pasta \ from \ http://www.coppelia.io/2014/07/an-a-to-z-of-property and the copy \ pasta \ from \ http://www.coppelia.io/2014/07/an-a-to-z-of-property and the copy \ pasta \ from \ http://www.coppelia.io/2014/07/an-a-to-z-of-property and the copy \ pasta \ from \ http://www.coppelia.io/2014/07/an-a-to-z-of-property and the copy \ pasta \ from \ http://www.coppelia.io/2014/07/an-a-to-z-of-property and \ pasta \ from \ http://www.coppelia.io/an-a-to-z-of-property and \ pasta 
192
                  extra-features-for-the-d3-force-layout/
193
194
        function tick(e) {
196
197
                       Do one iteraction of the force simulation
                        consider our div elements size so we do not go outisde of it
198
               \mathbf{var} iw = ("#vis").innerWidth(), ih = ("#vis").innerHeight();
200
               link.attr("x1", function (d) {
201
                               return d.source.x;
202
                        })
203
                        .attr("y1", function (d) {
204
205
                               return d.source.y;
                        })
206
                        .attr("x2", function (d) {
207
                               return d.target.x;
208
                        })
209
                        .attr("y2", function (d) {
210
                               return d.target.y;
211
                        });
212
               node
213
214
                        .attr("cx", function (d) {
```

```
return d.x = Math.max(6, Math.min(iw, d.x));
215
216
          .attr("cy", function (d) {
217
             return d.y = Math.max(6, Math.min(ih, d.y));
218
219
          });
220
      node.each(collide);
222
223
224
   function updateNodes() {
225
226
          when a user choses a new set of links to display we must redo
227
         the nodes
228
      node = nodesG.selectAll("node")
229
230
          . data (curNodesData);
      node.enter().append("circle")
231
232
          .\ attr\left( \verb"class"\,,\ \verb"node" \right)
          .attr("r", function (n) {
234
             return circleRadius(n.indegree + n.outdegree);
          })
          .style("fill", function (d) {
236
             return d3.rgb(nodefill[d.group]);
237
          })
238
          .style("stroke", function (d) {
239
             return d3.rgb(nodefill[d.group]).brighter().toString();
240
          })
241
          .on("mouseover", showDetails).on("mouseout", function () {
242
          tooltip . hideTooltip();
243
244
       }).on('dblclick', releasenode)
          . call (node_drag);
245
       //nuke them when done
246
247
      node.exit().remove();
248
249
250
251
   function updateLinks() {
252
          when a user choses a new set of links to display we must redo
253
         the nodes
          this bad boy does the heavy lifting for us
254
          our nodes are set invisible based on their weight ie links to
255
        them
256
      link = linksG.selectAll("link")
257
          .data(curLinksData);
258
259
      link.enter()
260
          .append("line")
261
          .\; \mathtt{attr}\; (\; \texttt{"class"}\;, \;\; \texttt{"link"}\;)
262
          .style("marker-end", "url(#to)");
263
264
      svg.selectAll("defs").remove();
      //since this graph is directed add some pointers to indicate the
265
         direction
      var def = svg.append("defs").selectAll("marker").data(["to"]);
266
267
```

```
def.enter().append("marker")
268
269
          .attr("id", function (d) {
             return d;
270
271
          .attr("viewBox", "0 -5 10 10")
          .attr("refX", 25)
.attr("refY", 0)
273
274
          .attr("markerWidth", 6)
275
          .attr("markerHeight", 6)
276
          .attr("orient", "auto")
277
          .append("path")
278
          .attr("d", "M0,-5L10,0L0,5 L10,0 L0, -5")
279
          .style("stroke", "#080808")
.style("opacity", "1.0");
280
281
       {\tt def.exit().remove();}\\
282
       link.exit().remove();
283
      node.filter(function (n) {
284
          return n.weight = 0;
285
286
       }).style("visibility", "hidden");
287
288
289
290
291
   function update() {
      //on each change update the nodes
292
293
       force.links(curLinksData);
      force.nodes(curNodesData);
294
       force.start();
295
      updateNodes();
296
      updateLinks();
297
298
299
300
301
   function makeVis(data) {
302
303
          called once do all things to make it so number one
304
305
          perpare the data
          get width height of the vis div element
306
307
      allData = prepairData(data);
308
      width = $("#vis").width();
309
      height = $(window).innerHeight();
310
      //buildIndex();
311
       //build our link groups for our link displayer
312
      linkGroups = _.groupBy(allData.links, function (1) {
313
          return l.egroup
314
315
      linkGroups[16] = _. filter(allData.links, function(l) {
316
317
          return l.tname == "WebSciDL";
318
      linkGroups[17] = allData.links;
319
      curNodesData = allData.nodes;
      curLinksData = linkGroups[16];
321
322
       //do d3 things
      force = d3.layout.force();
323
324
       tooltip = Tooltip("vis-tooltip", 230);
```

```
node_drag = d3.behavior.drag()
325
         .on("dragstart", dragstart)
         .on("drag", dragmove)
327
         .on("dragend", dragend);
328
      svg = d3.select("#vis").append("svg")
         .attr("width", width).attr("height", height);
      linksG = svg.append("g").attr("id", "links");
331
      nodesG = svg.append("g").attr("id", "nodes");
332
      textsG = svg.append("g").attr("id", "texts");
      force.size([width, height])
334
         . charge(-100) . linkDistance(linkDist)
         .on("tick", tick);
336
337
      inOutExtent = d3.extent(data.nodes, function (node) {
338
         return node.indegree + node.outdegree;
339
340
341
      circleRadius = d3.scale.sqrt()
342
343
         .range([3, 14]).domain(inOutExtent);
      update();
344
      buildIndex();
345
      $("#link_select").on("change", function (e) {
346
         //when our link_select value has changed update vis
347
348
         updateData($(this).val());
      });
349
350
351
352
   function updateData(what) {
353
      //change our visualization to the link group selected
354
355
      curWhat = what;
      console.log("current what", what);
356
      curLinksData = linkGroups[what];
357
358
      node.each(function (n) {
         n. fixed = false;
359
360
      link.remove();
361
362
      node.remove();
      update();
363
364
365
   function resize() {
366
367
      //I wanted to take a stab at dynamic sizing of our vis
      width = $("#vis").width();
368
      height = $(window).innerHeight();
369
      svg.attr("width", width).attr("height", height);
      force.size([width, height]).resume();
371
372
373
   //when the window resizes call resize
   d3.select(window).on("resize", resize);
375
376
377
   //load our data
   d3.json("data/wsdlgraphData.json", function (error, data) {
378
      makeVis(data);
380 });
```

Listing 4: WebSciDL graph vis