CS 595: Assignment 2

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1 Problem 1

Question

The "friendship paradox" (http://en.wikipedia.org/wiki/Friendship_paradox) says that your friends have more friends than you do.

1. Explore the friendship paradox for your Twitter account. Since Twitter has directional links (i.e., "followers" and "following"), we'll be investigating if the people you follow (Twitter calls these people "friends") follow more people than you. If you are following < 50 people, use my twitter account "phonedude_mln" instead of your own.

Create a graph of the number of friends (y-axis) and the friends sorted by number of friends (x-axis). (The friends don't need to be labeled on the x-axis as "Bob", "Mary", etc. -- just 1, 2, 3 ...) In other words, if you have 100 friends your x-axis will be 1..101 (100 + you), and the y-axis value will be number of friends that each of those friends has. The friend with the lowest number of friends will be first and the friend with the highest number of friends will be last.

Do include yourself in the graph and label yourself accordingly. Compute the mean, standard deviation, and median of the number of friends that your friends have.

The appropriate part of the Twitter API to use is:

https://dev.twitter.com/rest/reference/get/friends/list

- 1. This assignment was comparatively easy when compared to the second assignment.
- 2. I used twittersearch library to get 1000 URIs in second assignment, but to get the list of friends in the twitter this library is of no help.
- 3. So I figured tweepy does that job with out any trouble.
- 4. As I already have the consumer key and tokens I used them here in order get the data.
- 5. In tweepy there are these predefined functions "friends_count" which will give the count of the friends whom we follow and function "friends" gives the list of friends for a particular user.
- 6. Function "friends" by default gives only list of 20 friends. After a little research I figured we can set the list to a desired count.
- 7. My twitter account is very new so I don't have many friends so I used "phonedude_mln"
- 8. I wrote a Python program to get the list of friends and their friends. The output(followed.txt) from this program is not sorted.
- 9. So I sorted the list by using a simple command in Linux. The Linux command is as below and the result is stored in followed-sorted.txt file.

```
sort -n -k1 followed.txt > followed-sorted.txt
```

- 10. "Phonedude_mln" had 148 friends in total. But there is an other person who have the same number of friends so when I am highlighting "phonedude_mln" two bars in the bar plot got highlighted.
- 11. I calculated Mean , Standard Deviation and median in R using simple commands as shown in Listing 2.

• Mean: 404.926174496644

• Median: 191

• Standard Deviation: 545.993999248776

12. I plotted the graph in scatter plot which can be seen Figure 2, but it is not as clear as the bar plot.

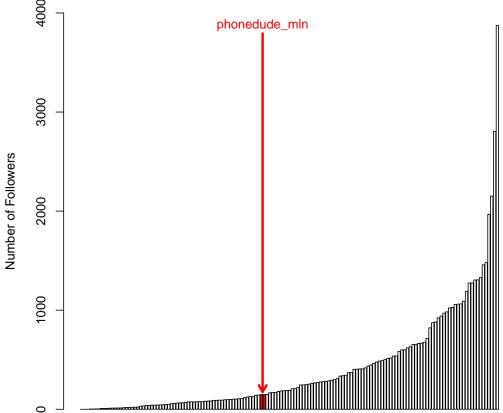
```
#! /usr/bin/env python
1
2
3
   import tweepy
   import time
4
   import sys
6
8
   CONSUMER\_KEY = "1QjOMB7IZ00zaTvPmZ6tUrR2R"
   \label{eq:consumersecret} \textbf{CONSUMER.SECRET} = "4aolvqxZYw3XwyrzWjiHb6aFAlg7iNodyxmyiIyX8NowefLL53"}
9
   OAUTH\_TOKEN = "2820592280 - iVQDNegTG1CtQLuQ14N9kwlefiVPSTA75zAKeye"
10
11
   OAUTH\_TOKEN\_SECRET = "oaUFcXLImxaL0XGUvy3nT1XfBXkVkLNWDmRHkWvvDCozi"
12
13
    def main():
14
        auth = tweepy.auth.OAuthHandler(CONSUMER_KEY,CONSUMER_SECRET)
        \verb"auth.set_access_token" (OAUTH\_TOKEN,OAUTH\_TOKEN\_SECRET)"
15
16
        api = tweepy.API(auth)
17
18
19
        followed = []
20
21
        out_file = open( "followed.txt", "w" )
22
        user = api.get_user("phonedude_mln")
23
24
25
26
        out_file.write( "{} {}\n".format( user.friends_count, user.screen_name ) )
27
28
        for friend in user.friends(count = 5000):
             out_file.write( "{} {}\n".format( friend.friends_count, friend.screen_name ) )
29
30
31
        out_file.close()
32
33
34
35
    if _-name_- == "_-main_-":
36
        try:
37
             main()
38
        except KeyboardInterrupt:
             \operatorname{sys.exit}(1)
39
```

Listing 1: Python Program for printing the list of followers

```
1
   data <- read.csv("followed-sorted.txt", stringsAsFactors = F, header = FALSE, sep = "")
2
3
4
   incdata = data[,1]
5
   meanOut <- paste("Mean: ", mean(incdata), collapse = "")</pre>
6
7
   medianOut <- paste("Median: ", median(incdata), collapse = "")</pre>
8
9
   sdOut <- paste("Std Dev: ", sd(incdata), collapse = "")</pre>
10
11
12
    write(meanOut, stdout())
   write (medianOut, stdout())
13
14
    write(sdOut, stdout())
15
    pdf("barplot.pdf")
16
17
   pos <- (incdata == 148)
18
19
    cols <- c("white", "red")
20
21
    barplot(incdata, main="Friends of Friends on Twitter", xlab="Friends sorted by increasing
22
        number of friends", ylab="Number of Friends", col=cols[pos+1], xlim = c(0,175), ylim=c
    \mathbf{text}(\mathbf{x} = \mathbf{match}(\mathbf{c}(148), \ \mathbf{incdata}) + 13, \ \mathbf{y} = \mathbf{max}(\mathbf{incdata}), \ \mathbf{labels} = "phonedude\_mln", \ \mathbf{col} = 'red')
23
   24
```

Listing 2: R script for statistics and bar plot shown in Figure 1





Followers sorted by increasing number of Followers

Figure 1: BarPlot showing the count of phonedude_mln's Twitter follower's followers

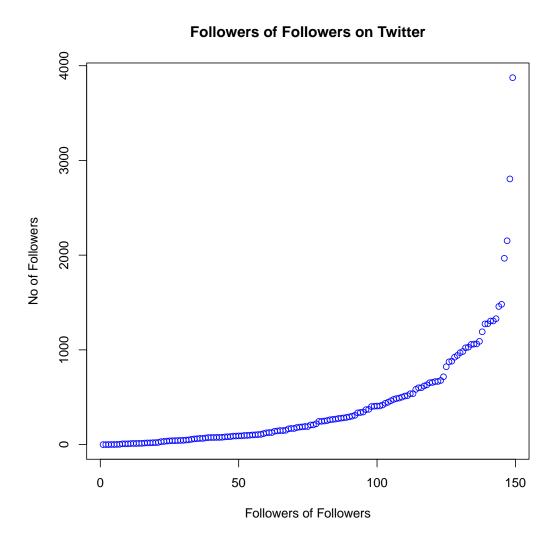


Figure 2: ScatterPlot showing the count of phonedude_mln's Twitter follower's followers

2 Problem 2

Question

2. Using your facebook account, repeat question #1 (if you have >
50 friends).

Start at: https://developers.facebook.com/docs/graph-api/reference/v2.1/user/friends
or perhaps:
http://socialnetimporter.codeplex.com/

- 1. After the second assignment I assumed that we should use API keys in order to get the data from any of the social networking sites. So I spend good amount of time in trying to figure out how to get the information by using these Keys and tokens
- 2. I registered for Facebook APP in order to get the API keys and wrote a piece of code to get the token.

```
from facepy import utils app_id = 14867915882649321 app_secret = "93595d85e282ce2bb395a21c921396312" oath_access_token = utils.get_application_access_token(app_id, app_secret) print oath_access_token
```

- 3. I tried using the library "facebook" but it did not work for me, so I shifted to facepy which worked fine for me.
- 4. But I realized the token I am computing from the above python code is not what I need. I figured that the token I want is generated here https://developers.facebook.com/tools/explorer/?method=GET&path=1310493851%3Ffields%3Dfriends&version=v2.1 and this expires every couple of hours.
- 5. The python program 3 gives the list of my friends, but when I observed the output I see only 198 but in real I have 311 friends. By this observation it is clear that I am getting the list of friends who are sharing their friends list.
- 6. When I tried to find the number of friends each of my friends have through the python program 3 I was shocked to see that the result came up for only 3 of my friends. And for others I get an error "Unsupported Operation".
- 7. After some research I understood that through tokens we can not get full data from the Facebook profile, the friend count can only be retrieved for those friends who have registered for developer account and allowed access to their friend list.
- 8. So I ended up using the code 4 ALEX had shared in the group to get the friend count. I retrieved friend count of each of my friends.
- 9. The output for the code 4 is not formatted. So I wrote a piece of code to format it as I want it. The code is listed in 5
- 10. I sorted the output retrieved from program 5 by a simple command in Linux

```
sort -n -k1 facebook.txt > fbSorted.txt
```

- 11. seeing as I am only person with 311 friends on my circle, it was easy to color the single bar with red color using the code on lines 11 and 12 in listing 6.
- 12. some friends do not share their friends counts, so they are left out of the data collected.
- 13. The median, Standard Deviation and mean is calculated by using the code on lines 4,5 and 6.

 \bullet Mean: 487.505050505051

• Median: 409.5

• Standard Deviation: 389.037217791762

14. I tried plotting the graph in scatter plot but I liked the bar plot better.

```
1
   \#import\ facebook
2
   from facepy import GraphAPI
3
   from facepy import utils
4
   def main():
5
        app_id = 1486791588264932
6
 7
        app_secret = "93595d85e282ce2bb395a21c92139631"
8
        oath_access_token = utils.get_application_access_token(app_id, app_secret)
9
        token \ = \ "CAACEdEose0cBAHdKj7pO0wWcQ1l7Nk5SXOUZAWdIEOZCvFg6JuL8IRJQcTJZBg
10
11
        GpNgoO5M2d3nZBYOhOdnDgn9gJc9mZCk8bC9N5yIMAEVpZAWX8pgIv\\
12
        CSZCGWu6vkfX5I1VDCfkyLHaKkxpgLOyTsnOCHuWkiBrjlW5dN1IHNLmZ\\
        C168XZBMJIc1r5UA7ssNZAUhJPsbNzaR1rer93oSuQA4kZAfNIjGCp95IZD"\\
13
14
15
        print oath_access_token
16
17
        graph = GraphAPI(token)
18
19
        for friendlist in graph.get('me/friendlists/')["data"]:
20
            print
21
22
            for friend in graph.get( friendlist["id"] + "/members" )["data"]:
23
                 print friend["name"]
24
25
                 \mathbf{try}:
                 print len( graph.get(friend["id"] + "/friends/")["data"] )
26
27
                     print len(frnd_friendlist)
28
                 except :
29
                     print 0
30
31
    if -name_- = "-main_-":
32
33
        \mathbf{try}:
34
            main()
35
        except KeyboardInterrupt:
36
            sys.exit(1)
```

Listing 3: Python program for getting the list of Friends by using facepy

```
\#credit to:
  1
  2
          \#https://gist.github.com/leostera/3535568
  3
          \#https://pypi.python.org/pypi/selenium
          \# cookies \ problem: \ http://stackoverflow.com/questions/7854077/using-a-session-cookie-from-problem: \ http://stackoverflow.com/question-cookie-from-problem: \ 
  4
                       selenium-in-urllib2
          5
                       scrolling-down
  6
  7
          from selenium import webdriver
  8
          from selenium.webdriver.common.keys import Keys
  9
          import time
10
           from selenium.webdriver.common.by import By
11
          import os, sys
12
          from bs4 import BeautifulSoup
13
          import codecs
14
          from random import randint
           import getpass
15
          import os
16
17
18
           globalHtmlOutputFile = 'allFacebookFriends.html'
19
           globalCSVOutputFile = 'facebookFriendFriendsCountTuples.txt'
20
21
          \#output\ file:\ globalHtmlOutputFile
22
23
          def getHtmlOfAllFriends(userFaceBookEmail, userFaceBookPassword):
24
25
                                  if (len(userFaceBookEmail) > 0 and len(userFaceBookPassword) > 0):
26
27
                                  else:
28
                                                         print "userFaceBookEmail and/or userFaceBookPassword: bad length"
29
                                                         return
30
31
                                  try:
                                                         htmlOutputFile = open(globalHtmlOutputFile, 'w')
32
33
                                  except:
34
                                                         exc_type , exc_obj , exc_tb = sys.exc_info()
                                                         fname = os.path.split(exc_tb.tb_frame.f_code.co_filename)[1]
35
36
                                                         print fname, exc_tb.tb_lineno, sys.exc_info()
                                                         return
37
38
39
                                  myFirefoxBrowser = webdriver.Firefox()
40
                                 myFirefoxBrowser.implicitly_wait(3)
                                 # or you can use Chrome(executable_path="/usr/bin/chromedriver")
41
                                  myFirefoxBrowser.get("http://www.facebook.org")
42
43
                                  assert "Facebook" in myFirefoxBrowser.title
44
45
46
                                  elem = myFirefoxBrowser.find_element_by_id("email")
47
                                  elem . send_keys (userFaceBookEmail)
48
                                  elem = myFirefoxBrowser.find_element_by_id("pass")
49
                                  elem.send_keys(userFaceBookPassword)
50
                                 elem.send_keys(Keys.RETURN)
51
52
                                 \#http://stackoverflow.com/questions/7854077/usinq-a-session-cookie-from-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-selenium-in-sele
53
                                              urllib2
54
                                  all_cookies = myFirefoxBrowser.get_cookies()
                                 \#cookies = \{\}
55
                                 \#for \ s\_cookie \ in \ all\_cookies:
56
                                                cookies[s\_cookie["name"]] = s\_cookie["value"]
57
58
59
                                 \#open\ friends\ page
60
61
                                  friendsLink = 'https://www.facebook.com/friends/'
62
                                  myFirefoxBrowser.get (friendsLink)
63
                                  myFirefoxBrowser.maximize_window()
64
65
66
                                 #scroll to bottom of page
67
                                  previousCountOfFriends = -1
                                  while True:
68
```

```
69
                      {\tt myFirefoxBrowser.execute\_script} \ (""return" \ window.scroll To \ (0\ , \ document.body.
 70
                          scrollHeight);")
 71
                      html = myFirefoxBrowser.page_source.encode('utf-8')
 72
                      soup = BeautifulSoup(html)
 73
                      parentOfUIProfileBlockContent = soup.findAll('div', { 'class' : '
 74
                          uiProfileBlockContent' })
 75
 76
                      \#lastIndexOfFriends = html.rfind('< div class="uiProfileBlockContent">')
 77
                      lastIndexOfFriends = len(parentOfUIProfileBlockContent)
 78
 79
                      \#'Friends' not found
                      if( lastIndexOfFriends == -1 ):
 80
 81
                               break
 82
                      #No new entry
83
                      if( previousCountOfFriends == lastIndexOfFriends ):
 84
                               htmlOutputFile.write(html)
 85
 86
 87
                      else:
                               previousCountOfFriends = lastIndexOfFriends
 88
 89
 90
                      sleepTime = randint(3,7)
 91
                      print "...sleeping for", sleepTime, "seconds"
                      time.sleep(sleepTime)
92
93
 94
95
             myFirefoxBrowser.close()
 96
             return previousCountOfFriends
97
98
     def getCredentials():
99
100
             userName = ','
             password = ','
101
102
103
             try:
                      credentialsFile = open('credentials.txt')
104
105
                      credInfo = credentialsFile.readlines()
106
107
                      if(len(credInfo) > 1):
108
                               userName = credInfo[0]
109
                               password = credInfo[1]
110
             except:
111
                      exc_type, exc_obj, exc_tb = sys.exc_info()
112
                      fname = os.path.split(exc_tb.tb_frame.f_code.co_filename)[1]
113
                      print fname, exc_tb.tb_lineno, sys.exc_info()
                      return
114
115
116
117
             return userName, password
118
     def getFBHtmlDump(inputFileName):
119
120
             htmlText = ','
121
122
123
             if(len(inputFileName) > 0):
124
                      try:
125
                               inputFile = open(inputFileName, 'r')
                               htmlText = inputFile.read()
126
127
                      except:
128
                               exc_type, exc_obj, exc_tb = sys.exc_info()
129
                               fname = os.path.split(exc_tb.tb_frame.f_code.co_filename)[1]
130
                               print fname, exc_tb.tb_lineno, sys.exc_info()
131
132
             return htmlText
133
134
135
     \#writes \ tuples < friend , \ friend Count > into \ global CSVO utput File
    def getFriendOfFriendsFromHtml(htmlText):
136
137
             goAheadFlag = False
138
```

```
139
             if(len(htmlText) > 0):
140
141
142
                      \mathbf{try}:
143
                               outputFile = codecs.open(globalCSVOutputFile, 'w', 'utf-8')
144
                               outputFile.write('"USER", "FRIENDCOUNT"\n')
145
                      except:
                               exc_type , exc_obj , exc_tb = sys.exc_info()
146
                               fname \ = \ os.path.split ( exc\_tb.tb\_frame.f\_code.co\_filename) [1]
147
148
                               print fname, exc_tb.tb_lineno, sys.exc_info()
149
                               return
150
151
                      soup = BeautifulSoup(htmlText)
152
153
                      parentOfUIProfileBlockContent = soup.findAll('div', { 'class' : '
                          uiProfileBlockContent ' })
154
                      for profile in parentOfUIProfileBlockContent:
155
156
                                       friendName = profile.find('div', { 'class' : 'fsl fwb fcb'
157
                                       potentialFriendsCount = profile.find('a', { 'class' : '
158
                                            uiLinkSubtle '})
159
160
                                       \#potentialFriendsCount: x (f)riends \mid x mutual friends, etc,
                                             so split
161
                                       if( potentialFriendsCount is not None ):
162
163
                                                potentialFriendsCount = potentialFriendsCount.text.
                                                    split('')
164
                                                if( len(potentialFriendsCount) > 1 ):
165
166
                                                         if ( len (potential Friends Count [1]) > 0):
167
                                                                 if ( potentialFriendsCount [1][0].
                                                                      lower() == 'f'):
168
                                                                          friendCount =
169
                                                                              potential Friends Count\\
                                                                              [0].replace(',',')
170
                                                                          stringToWrite = friendName.
171
                                                                              text + ', ' +
                                                                              friendCount + '\n'
172
                                                                          outputFile.write(
                                                                              stringToWrite)
173
                                                                          goAheadFlag = True
174
175
176
                      outputFile.close()
177
178
179
             return goAheadFlag
180
181
     if = name = "= main = ":
182
183
             print ',
184
185
186
             print 'Welcome to get fb friends of friends. If all goes well,'
             print 'The application will write your fb friends of friends into ./' +
187
                  globalCSVOutputFile
188
189
             print ',
             userNameFacebook = raw_input("Email ID: ")
190
191
             passwordFacebook \ = \ getpass.getpass \, (\ 'Password: \ ')
192
             userNameFacebook = str(userNameFacebook)
193
194
             passwordFacebook = str(passwordFacebook)
195
             userNameFacebook = userNameFacebook.strip()
196
197
             passwordFacebook = passwordFacebook.strip()
198
```

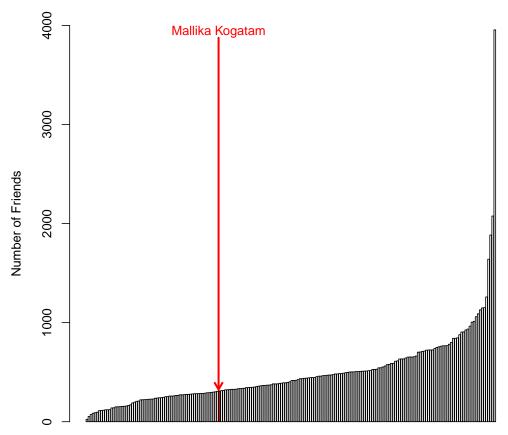
```
199
               int GoAheadFlag = getHtmlOfAllFriends (userNameFacebook), \ passwordFacebook)
200
201
               if ( intGoAheadFlag > -1 ):
                         facebook DumpInputFileName = globalHtmlOutputFile\\
202
203
                         htmlText = getFBHtmlDump(facebookDumpInputFileName)
204
                         boolGoAhead = getFriendOfFriendsFromHtml(htmlText)
205
206
                         #open file
                         if (boolGoAhead):
207
                                   myFirefoxBrowser = webdriver.Firefox()
filePath = 'file:///' + os.getcwd() + '/' + globalCSVOutputFile
myFirefoxBrowser.get(filePath)
208
209
210
```

Listing 4: Python program for getting the list of Friends by using selenium

```
\#! /usr/bin/env python
1
2
3
   import sys
4
5
6
   def main():
        file_in = open( "fb_frnds.txt", "r")
file_out = open( "facebook.txt", "w")
7
8
9
10
        {\tt counter} \, = \, 1
11
12
        for line in file_in:
            line = line.strip().split(",")
13
14
            line = [x.strip() for x in line]
15
16
            17
18
19
        file_out.close()
20
21
22
23
   if _-name_- == "_-main_-":
24
        \mathbf{try}:
25
            \min()
       except KeyboardInterrupt:
26
27
            sys.exit(1)
```

Listing 5: Python program for formatting the list

Friends of Friends on FaceBook



Friends sorted by increasing number of friends

Figure 3: BarPlot for no of friends and the friends sorted by number of friends

```
1
      2
                         data <- read.csv("fbSorted.txt", stringsAsFactors = F, header = FALSE, sep = "")
      3
                         incdata = data[,1]
                       meanOut <- paste("Mean: ", mean(incdata), collapse = "")
medianOut <- paste("Median: ", median(incdata), collapse = "")
sdOut <- paste("Std Dev: ", sd(incdata), collapse = "")
      4
      5
      6
                         write(meanOut, stdout())
       7
      8
                         write(medianOut, stdout())
     9
                          write(sdOut, stdout())
  10
                          pdf("fb_barplot.pdf"
                        pos <- (incdata == 311)
11
                          cols <- c("white", "red")
12
                         barplot(incdata, main="Friends of Friends on FaceBook", xlab="Friends sorted by increasing
13
                          number of friends", ylab="Number of Friends", col=cols[pos+1], ylim=c(0, 4000)) text(x=match(c(311), incdata)+12, y=(max(incdata)-20), labels="Mallika Kogatam", <math>col='red')
14
                        \operatorname{arrows}(x0 = \operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = \operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = \operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = \operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = \operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = \operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = \operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{max}(\operatorname{incdata}) - 80), x1 = (\operatorname{match}(\mathbf{c}(311), \operatorname{incdata}) + 12, y0 = (\operatorname{match}(\mathbf{c}(311), \operatorname{match}(\mathbf{c}(311), \operatorname{match
15
                                                     y1=325, length=0.1, lwd=2.5, col='red')
```

Listing 6: R script for bar plot shown in Figure 3 $\,$

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