

$$AD^{-1}V = \lambda V$$

$$D = \begin{bmatrix} k_1 & 0 & 0 & \dots \\ 0 & k_2 & 0 & \dots \\ 0 & 0 & k_3 & \dots \\ \vdots & \vdots & \vdots & \ddots \end{bmatrix} \Rightarrow D^{-1} = \begin{bmatrix} 1/k_1 & 0 & 0 & \dots \\ 0 & 1/k_2 & 0 & \dots \\ 0 & 0 & 1/k_3 & \dots \\ \vdots & \vdots & \vdots & \ddots \end{bmatrix}$$

$$A = \begin{bmatrix} 1/k_1 & & & \\ & 1/k_2 & & \\ & & 1/k_3 & \\ & & & \ddots \end{bmatrix} \begin{bmatrix} k_1 \\ k_2 \\ k_3 \\ \vdots \end{bmatrix}$$

$$= \begin{bmatrix} k_1/k_1 & 0 & 0 & \dots \\ 0 & k_2/k_2 & 0 & \dots \\ 0 & 0 & k_3/k_3 & \dots \\ \vdots & \vdots & \vdots & \ddots \end{bmatrix} \begin{bmatrix} k_1/k_1 \\ k_2/k_2 \\ k_3/k_3 \\ \vdots \end{bmatrix}$$

$$= \begin{bmatrix} 1 & 0 & 0 & \dots \\ 0 & 1 & 0 & \dots \\ 0 & 0 & 1 & \dots \\ \vdots & \vdots & \vdots & \ddots \end{bmatrix} \Rightarrow \begin{bmatrix} 1 \\ 1 \\ 1 \\ \vdots \end{bmatrix}$$

$$A \cdot \begin{bmatrix} 1 \\ 1 \\ 1 \\ \vdots \end{bmatrix} = \begin{bmatrix} 0 & \alpha_{12} & \alpha_{13} & \alpha_{14} & \dots \\ \alpha_{21} & & & & \\ \alpha_{31} & & & & \\ \vdots & \vdots & \vdots & \vdots & \ddots \end{bmatrix} \begin{bmatrix} 1 \\ 1 \\ 1 \\ \vdots \end{bmatrix}$$

$$= \begin{bmatrix} \alpha_{12} + \alpha_{13} + \alpha_{14} + \dots \\ \alpha_{21} + \alpha_{23} + \dots \\ \vdots \end{bmatrix} = \begin{bmatrix} k_1 \\ k_2 \\ k_3 \\ \vdots \end{bmatrix} \Leftarrow V_1 \quad \lambda = 1$$

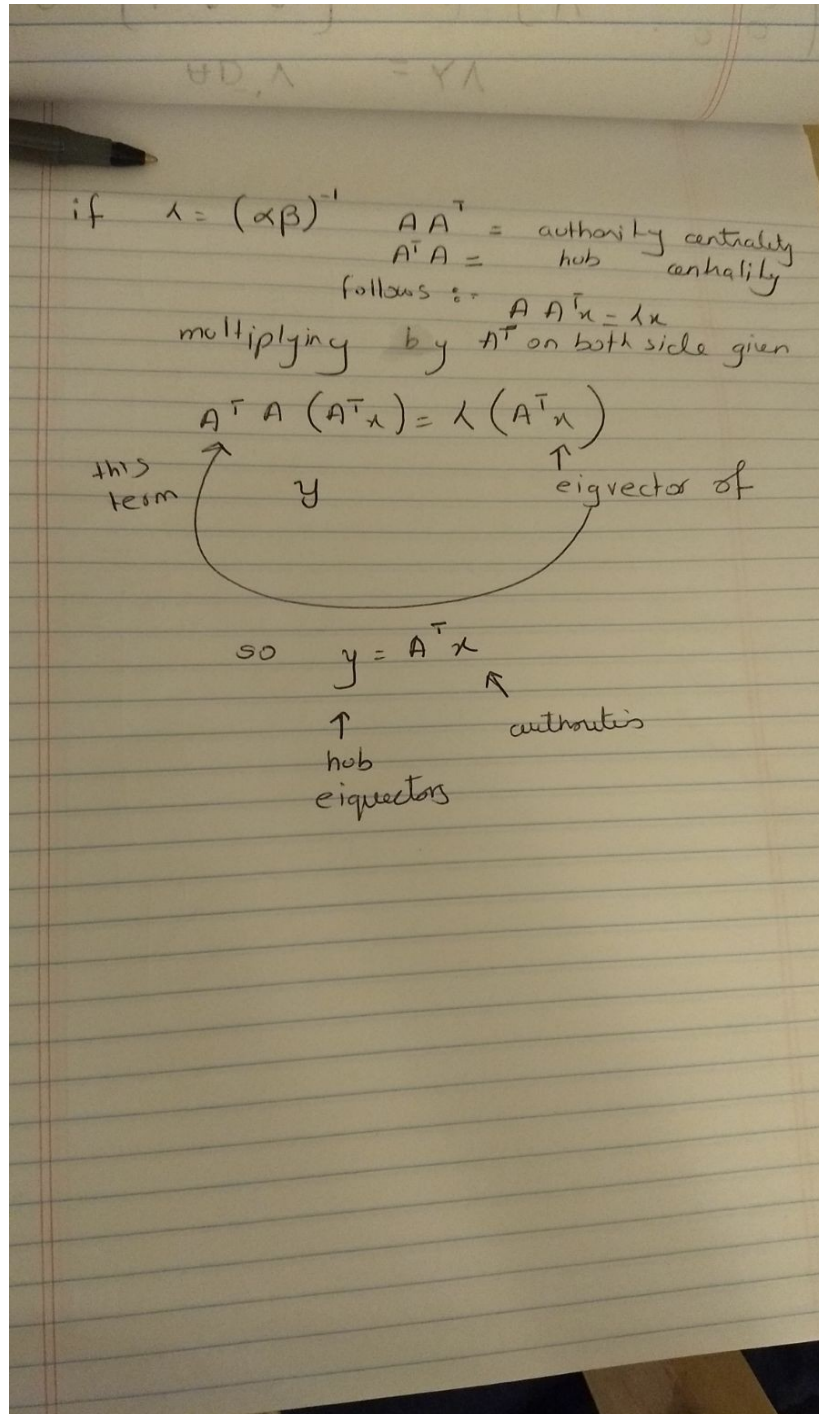
Q) Page Rank centrality Show that the vector is an eigenvalue of AD^{-1}

Ans) As we can see that the largest eigen value is equal to 1

$\alpha = 1/\text{largest eigenvalue}$. In this case the $1/1 = 1$ hence it won't exceed 1

and I have also shown in the image that i is an eigenvector of AD^{-1} by proving $\lambda = 1$

Q) relationship between hub and authority eigen vectors



The Code and the printouts for unweighted network:

kashif@kashif-Inspiron-5423:~/Desktop/Systems_Networks/Lab3\$ python lab3_stub.py

=====

Degree Centrality:

The degree centrality vector is :

```
[ 78. 140.  88.  80.  47. 124. 144.  65. 102.  63. 125.  90.  71.  71.
 58.  38.  81.  27.  99. 153.  69.  67.  77. 111.  27. 108.  94.  58.
 40.  44.  86.  48.  40.  40.  40.  40.  40.  40.  74. 113.  40.  40.
 91. 137. 110. 104.  40.  53.  50.  51. 105.  66.  40.  31.  64.  45.
 11.  26.  24.  24.  26.  17.  39.  14.  32.  55.  16.  16.  84.   7.
   7.   7.  17.  17.  57.  17.  76.  19.  64.   9.   7.  23.  21.  64.
 79.  52.  68.  61.  21.  24.  62.  24.  24.  24.  24.  24.  62.  54.
 58.  58.  96.  49.  92.  53.  43.  43.  47.  43.  49.  49.  49.  45.
 20.  31.  11.  25.  13.  16.  16.  21.  18.  11.  23.  18.  28.  24.
 22.  22.  13.  38.  20.  18.  24.  12.  24.  20.  20.   6.  23.  11.
 18.  18.  28.  22.  22.  28.  37.  22.  22.  20.  30.  31.  22.   8.
 26.   8.  21.  21.  21.  17.  12.  15.  15.]
```

1. gandalf (153.0000)
2. frodo (144.0000)
3. aragorn (140.0000)
4. pippin (137.0000)
5. elrond (125.0000)

=====

Eigenvector Centrality (by Zen):

1. gandalf (0.0153)
2. aragorn (0.0149)
3. frodo (0.0147)
4. elrond (0.0140)
5. pippin (0.0139)

Eigenvector Centrality (by linear algebra):

1. gandalf (0.1682)
2. aragorn (0.1641)
3. frodo (0.1618)
4. elrond (0.1541)
5. pippin (0.1533)

Confirming that eigenvector centrality is a steady-state of sorts for node 60 (lobelia):

lobelias centrality is

0.00300267745743

sum of lobelias neighbors centrality is

0.189604834908

normalized sum of lobelias neighbors is

[0.00300256]

Showing the convergece of eigenvector centrality...

lab3_stub.py:91: ComplexWarning: Casting complex values to real discards the imaginary part
cs[j,i] = numpy.dot(x , v[:,j]) # project x onto each of the eigenvectors

=====

Katz Centrality:

katz for alpha = 0

1. amroth (1.0000)
2. aragorn (1.0000)
3. arathorn (1.0000)
4. arwen (1.0000)
5. beregond (1.0000)

katz for alpha = 0.2

1. sauron (2.6987)
2. peregrin (2.2340)
3. tobold (1.9659)
4. gamling (1.9140)
5. erkenbrand (1.9140)

katz for alpha = 0.4

1. goatleaf (107.0039)
2. smeagol (85.9850)
3. hamfast (77.1504)
4. anborn (72.5080)
5. shadowfax (68.2373)

katz for alpha = 0.6

1. angbor (4.6228)
2. hamfast (4.4787)
3. goatleaf (3.7800)
4. theoden (3.1754)
5. orome (2.9831)

katz for alpha = 0.8

1. rumil (1.9585)
2. baran (1.4471)
3. muzgash (1.0382)
4. arathorn (0.9588)
5. ungoliant (0.9035)

=====

PageRank

pagerank for alpha = 0.8

1. gandalf (16.3241)
2. frodo (15.4448)
3. pippin (14.5563)
4. aragorn (14.2308)
5. bilbo (13.0523)

pagerank for alpha = 0.6

1. gandalf (7.3384)

2. frodo (6.9785)
3. pippin (6.5548)
4. aragorn (6.2468)
5. bilbo (5.8556)

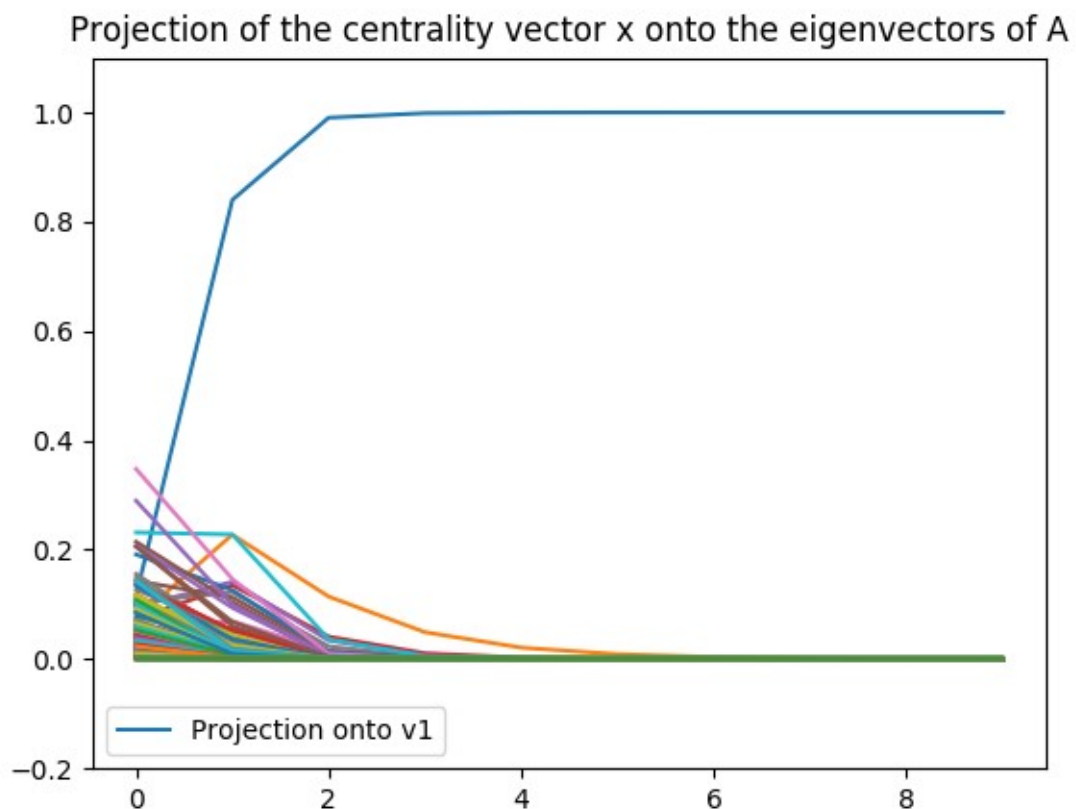
pagerank for $\alpha = 1$

1. gandalf (3743842370233084928.0000)
2. frodo (3523616348454680064.0000)
3. aragorn (3425738116553143296.0000)
4. pippin (3352329442627014656.0000)
5. elrond (3058694746922460160.0000)

=====

Betweenness Centrality

1. gandalf (0.0797)
2. frodo (0.0675)
3. pippin (0.0613)
4. aragorn (0.0486)
5. bilbo (0.0393)



The printout with the weighted graphs is

```
kashif@kashif-Inspiron-5423:~/Desktop/Systems_Networks/Lab3$  
python lab3_stub.py
```

```
=====
```

Degree Centrality:

The degree centrality matrix is :

```
[227. 632. 251. 141.  98. 423. 661. 131. 304. 115. 484. 329. 225.  
178.  
 70.  47. 228.  27. 343. 762. 129.  91. 191. 443.  27. 480. 342.  
70.  
 40.  58. 235.  76.  40.  40.  40.  40.  40.  40. 164. 454.  40.  
40.  
174. 606. 390. 297.  40.  84.  92.  60. 316. 152.  40.  46. 146.  
102.  
 15.  43.  38.  38.  46.  23.  55.  14.  52.  59.  16.  16. 265.  
7.  
  7.   7.  17.  17.  81.  17. 199.  34. 129.   9.  15.  27.  21.  
138.  
167.  64. 126.  88.  21.  24. 113.  24.  24.  24.  24.  24. 119.  
67.  
110.  90. 354.  63. 278.  71.  43.  43.  66.  43.  63.  63.  56.  
54.  
 20.  38.  11.  50.  13.  16.  16.  21.  25.  11.  37.  18.  64.  
44.  
 33.  33.  13.  49.  20.  18.  32.  12.  32.  20.  20.   6.  41.  
11.  
 30.  30.  39.  22.  22.  37.  43.  22.  22.  20.  41.  39.  26.  
8.  
 29.   8.  21.  21.  21.  17.  12.  15.  15.]
```

1. gandalf (762.0000)
2. frodo (661.0000)
3. aragorn (632.0000)
4. pippin (606.0000)
5. elrond (484.0000)

```
=====
```

Eigenvector Centrality (by Zen):

1. gandalf (0.0469)
2. frodo (0.0401)
3. aragorn (0.0400)
4. pippin (0.0390)
5. sauron (0.0316)

Eigenvector Centrality (by linear algebra):

1. gandalf (0.3412)
2. frodo (0.2920)
3. aragorn (0.2908)
4. pippin (0.2839)

5. sauron (0.2300)

Confirming that eigenvector centrality is a steady-state of sorts
for node 60 (lobelia):

lobelias centrality is

0.00284915533195

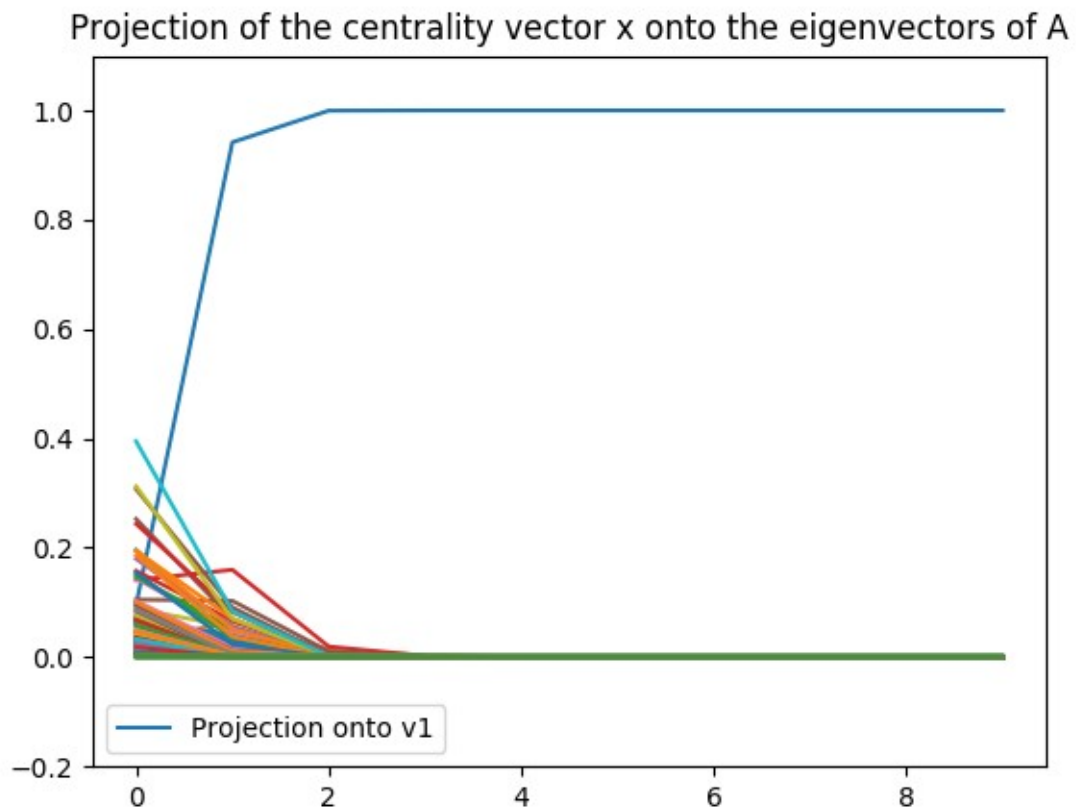
sum of lobelias neighbors centrality is

0.330196423292

normalized sum of lobelias neighbors is

[0.00110261]

Showing the convergence of eigenvector centrality...



=====

Katz Centrality:

katz for alpha = 0

1. amroth (1.0000)
2. aragorn (1.0000)
3. arathorn (1.0000)
4. arwen (1.0000)
5. beregond (1.0000)

katz for alpha = 0.2

1. gorbag (18.5698)
2. shagrat (18.5698)
3. dain (14.9485)
4. beren (13.4605)
5. meneldor (12.4077)

katz for alpha = 0.4

1. thorondor (3.4615)
2. meneldor (3.4615)
3. ungoliant (3.0283)
4. angbor (2.9851)
5. dain (2.1912)

katz for alpha = 0.6

1. varda (4.7428)
2. celebrian (4.7428)
3. goldberry (4.4167)
4. baldor (3.0469)
5. dunhere (2.8928)

katz for alpha = 0.8

1. thorondor (9.8387)
2. meneldor (9.8387)
3. cirion (5.4409)
4. hador (5.4409)
5. arvedui (4.5345)

=====

PageRank

pagerank for alpha = 0.8

1. gandalf (31.6524)
2. frodo (28.3370)
3. aragorn (25.6157)
4. pippin (25.5455)
5. elrond (20.1194)

pagerank for alpha = 0.6

1. gandalf (12.5674)
2. frodo (11.5585)
3. pippin (10.3196)
4. aragorn (10.0375)
5. elrond (8.0976)

pagerank for alpha = 1

1. anborn (-9472086958211502.0000)
2. proudfoot (-11050768117913408.0000)
3. adelard (-11050768117913408.0000)
4. twofoot (-11050768117913412.0000)
5. orome (-12629449277615308.0000)

=====

Betweenness Centrality

1. gandalf (0.0437)


```

2. pippin (0.0366)
3. aragorn (0.0345)
4. frodo (0.0289)
5. bilbo (0.0270)

```

The change that I noticed is that the centralities and moreover the degree centrality has increased overall as expected as the graph weights are now incorporated in size. Yes it is backwards compatible as the Adjacency matrix just has weights now instead of the ones and my code adds up the matrix rows in the same way.

Including the hobbit network:

the printouts are:

```

kashif@kashif-Inspiron-5423:~/Desktop/Systems_Networks/Lab3$
python lab3_stub.py

```

```

=====

```

Degree Centrality:

The degree centrality matrix is :

```

[  6. 661. 228. 901. 164. 289. 129. 520. 632. 138. 602. 126. 343.
 480.
 116. 174.  41.  11.  30.  30.  56. 227.  98.  39. 354. 235. 278.
 22.
  22.  37. 304.  43. 191.  22. 606. 297. 342. 316. 152.  22. 251.
 20.
 115. 329. 225. 178. 454.  41. 199. 443.  58.  76.  39.  26. 390.
167.
   8.  49.  29.   8. 141.  21.  21.  21.  91.  90.  84.  17. 117.
12.
  38.  38.  15.  15. 131.  70.  47.  27. 129.  27.  70.  40.  40.
40.
  40.  40.  40.  40.  40.  40. 138.  92.  78.  40.  46. 165.  15.
43.
  46.  23.  55.  14.  52.  59.  16.  16.  18. 275.  32. 140. 138.
102.
 164. 234.  18. 139. 155. 288. 139. 145. 169.  85.  81.   4.  42.
80.
  12.  32.  26.  26.   7.   7.   7.  17.  17.  81.  17.  34.   9.
15.
  27.  21.  64.  88.  21.  24.  63.  43.  43.  43.  38.  11.  50.
13.
  16.  16.  21.  25.  11.  37.  18.  64.  44.  33.  33.  13.  20.
18.
  32.  12.  32.  20.  20.]
1. gandalf (901.0000)
2. frodo (661.0000)

```

3. aragorn (632.0000)
4. pippin (606.0000)
5. bilbo (602.0000)

=====

Eigenvector Centrality (by Zen):

1. gandalf (0.0469)
2. frodo (0.0372)
3. aragorn (0.0366)
4. pippin (0.0358)
5. bilbo (0.0301)

Eigenvector Centrality (by linear algebra):

1. gandalf (0.3570)
2. frodo (0.2827)
3. aragorn (0.2783)
4. pippin (0.2723)
5. bilbo (0.2287)

Confirming that eigenvector centrality is a steady-state of sorts
for node 60 (arwen):

lobelias centrality is

0.00709220260428

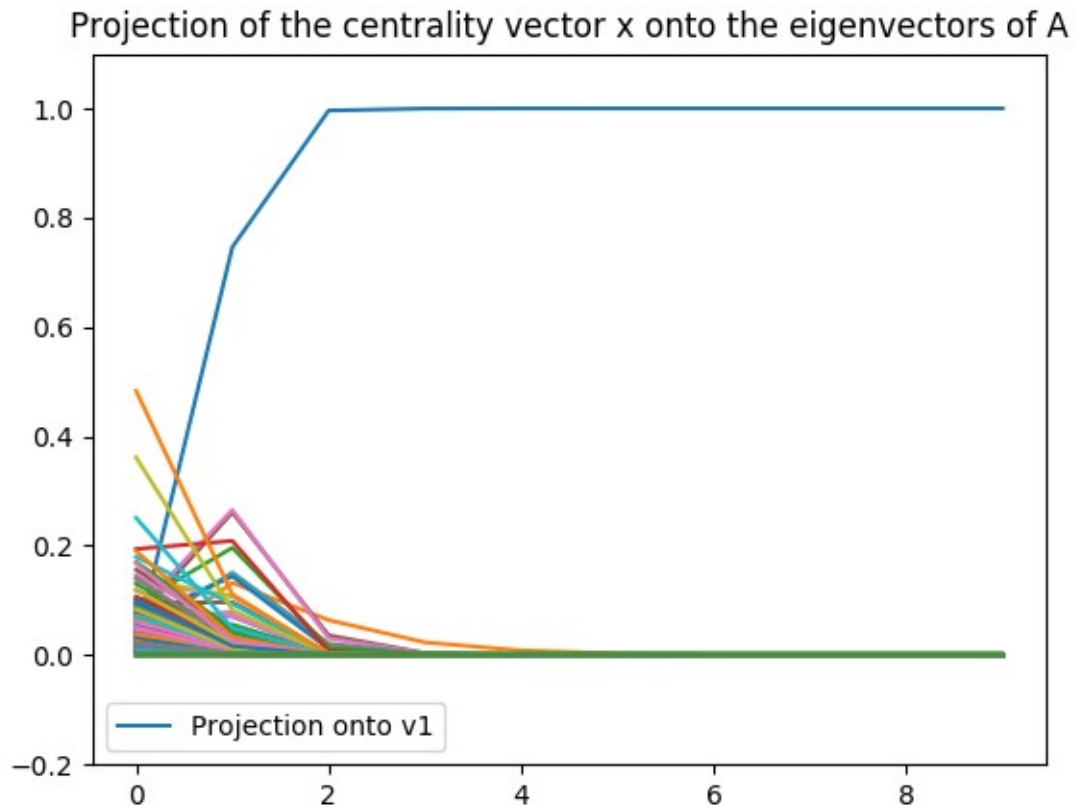
sum of lobelias neighbors centrality is

0.767092649174

normalized sum of lobelias neighbors is

[0.00247167]

Showing the converge of eigenvector centrality...



=====

```
Katz Centrality:
katz for alpha = 0
  1. anborn (1.0000)
  2. frodo (1.0000)
  3. faramir (1.0000)
  4. gandalf (1.0000)
  5. samwise (1.0000)
katz for alpha = 0.2
  1. thorondor (12.4946)
  2. meneldor (12.4946)
  3. barahir (12.3880)
  4. thingol (12.3880)
  5. beren (12.2722)
katz for alpha = 0.4
  1. feanor (8.9862)
  2. baran (8.4856)
  3. bolg (5.9853)
  4. nain (5.9853)
  5. thorondor (5.3404)
katz for alpha = 0.6
  1. meneldor (4.9592)
```

```
2. thorondor (4.9592)
3. baran (4.1887)
4. goldberry (4.1614)
5. celebrian (3.3496)
katz for alpha = 0.8
1. thorondor (11.3516)
2. meneldor (11.3516)
3. varda (8.3295)
4. celebrian (8.3295)
5. cirion (6.7214)
```

=====

PageRank

pagerank for alpha = 0.8

```
1. gandalf (34.7997)
2. frodo (26.5416)
3. pippin (23.9721)
4. aragorn (23.9582)
5. bilbo (23.8723)
```

pagerank for alpha = 0.6

```
1. gandalf (13.8056)
2. frodo (10.9015)
3. bilbo (9.7796)
4. pippin (9.7573)
5. aragorn (9.4348)
```

pagerank for alpha = 1

```
1. galion (-10839968494401312.0000)
2. anborn (-16259952741602008.0000)
3. proudfoot (-18969944865202324.0000)
4. adelard (-18969944865202328.0000)
5. twofoot (-18969944865202328.0000)
```

=====

Betweenness Centrality

```
1. gandalf (0.0498)
2. pippin (0.0370)
3. aragorn (0.0339)
4. frodo (0.0296)
5. bilbo (0.0292)
```

I notice that Bilbo has popped up in most of the centralities.

Eigenvector Centrality does not hold in the case of weighted graph because steady state convergence hasnt been achieved in the weighted graphs, it will probably take more trials and high computational power.