## **PageRank**

```
_{0s}^{\checkmark} [1] # Before we begin, let's load the libraries.
       %pylab notebook
       import numpy as np
       import numpy.linalg as la
       np.set printoptions(suppress=True)
   Populating the interactive namespace from numpy and matplotlib
[1/3, 0, 0, 1/2, 0],
                    [1/3, 1/2, 0, 1, 0, 1/2],
                    [1/3, 0, 1/3, 0, 1/2, 1/2],
                    [0, 0, 0, 0, 0, 0],
                    [0,
                        0, 1/3, 0, 0, 0]])
[3] eVals, eVecs = la.eig(L) # Gets the eigenvalues and vectors
   order = np.absolute(eVals).argsort()[::-1] # Orders them by their eigenvalues
   eVals = eVals[order]
```

```
[5] for i in np.arange(100) : # Repeat 100 times
          r = L @ r
      r
 → array([16. , 5.33333333, 40. , 25.33333333, 0.
             13.33333333])
 [6] r = 100 * np.ones(6) / 6 # Sets up this vector (6 entries of 1/6 x 100 each)
     lastR = r
     r = L @ r
     i = 0
     while la.norm(lastR - r) > 0.01 :
          lastR = r
          r = L @ r
          i += 1
     print(str(i) + " iterations to convergence.")

→ 18 iterations to convergence.

     array([16.00149917, 5.33252025, 39.99916911, 25.3324738, 0.
             13.33433767])
[9] d = 0.5 # Feel free to play with this parameter after running the code once.
    M = d * L2 + (1-d)/7 * np.ones([7, 7]) # np.ones() is the J matrix, with ones for each entry.
[13]
    # Use the following function to generate internets of different sizes.
    generate_internet(5)
→ array([[1. , 0.2, 0.2, 0.2, 0.2],
           [0., 0.2, 0.2, 0.2, 0.2],
           [0., 0.2, 0.2, 0.2, 0.2],
           [0. , 0.2, 0.2, 0.2, 0.2],
           [0., 0.2, 0.2, 0.2, 0.2]])
[14] pageRank(L, 1)
→ array([16.00149917, 5.33252025, 39.99916911, 25.3324738, 0.
           13.33433767])
```

```
[15] # Do note, this is calculating the eigenvalues of the link matrix, L,
     # without any damping. It may give different results that your pageRank function.
     # If you wish, you could modify this cell to include damping.
     eVals, eVecs = la.eig(L) # Gets the eigenvalues and vectors
     order = np.absolute(eVals).argsort()[::-1] # Orders them by their eigenvalues
     eVals = eVals[order]
     eVecs = eVecs[:,order]
     r = eVecs[:, 0]
     100 * np.real(r / np.sum(r))
→ array([16.
                       , 5.33333333, 40.
                                                , 25.33333333, 0.
            13.33333333])
[17] # You may wish to view the PageRank graphically.
     # This code will draw a bar chart, for each (numbered) website on the generated internet,
     # The height of each bar will be the score in the PageRank.
     # Run this code to see the PageRank for each internet you generate.
     # Hopefully you should see what you might expect
     # - there are a few clusters of important websites, but most on the internet are rubbish!
     %pylab notebook
     r = pageRank(generate_internet(100), 0.9)
     plt.bar(arange(r.shape[0]), r);
```

→ Populating the interactive namespace from numpy and matplotlib

