```
! Recentione of a General 242 Months
A = \begin{bmatrix} a & b \\ & d \end{bmatrix} \implies dee(A) = ad-bc.
2. Mechanical Proble
          a) \begin{bmatrix} J & O \end{bmatrix} \Rightarrow \lambda_1 = J \Rightarrow \begin{bmatrix} 3 & 0 \end{bmatrix} \begin{bmatrix} 3 & 0 \end{bmatrix}
          \begin{bmatrix} 22 & 6 \\ 6 & 13 \end{bmatrix} \Rightarrow \begin{bmatrix} 22-\lambda & 6 \\ 6 & 13-\lambda \end{bmatrix} \Rightarrow (22-\lambda)(3-\lambda) - 36 \Rightarrow 286 - 3+\lambda + \lambda^2 - 26 = \lambda^2 - 2+\lambda + 250 = (\lambda-2+)(\lambda-10) = 0
                                                              \exists \lambda_i = 2t / \lambda_1 = 10 \Rightarrow \lambda_i = 2t : \begin{bmatrix} -3 & 6 \\ 6 & -12 \end{bmatrix} \begin{bmatrix} \pi_i \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \end{bmatrix} \Rightarrow \begin{bmatrix} \pi_i = 2\pi \\ \pi_i = \pi_1 \end{bmatrix} \Rightarrow \begin{bmatrix} 2\pi \\ 1 \end{bmatrix}
                                                                                                                                                                                                                                                                                                                                           \lambda_1 = \langle 0: \begin{bmatrix} 1/2 & 6 \\ 6 & 3 \end{bmatrix} \begin{bmatrix} \pi_1 \\ \pi_2 \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \end{bmatrix} \Rightarrow \begin{bmatrix} \pi_1 = -2\pi_1 \\ \pi_1 = \pi_2 \end{bmatrix} \Rightarrow \begin{bmatrix} 1/2 \\ -2 \end{bmatrix}
               9 \begin{bmatrix} 1 & 2 \\ 2 & 4 \end{bmatrix} \ni \begin{bmatrix} 1-\lambda & 2 \\ 2 & 4-\lambda \end{bmatrix} \Rightarrow (1-\lambda)(4-\lambda)-4=\lambda-1 = \lambda(\lambda-1)=0 \lambda_1=1/\lambda_2=0
                                                                       \lambda_{i} = \lambda \Rightarrow \begin{bmatrix} -4 & 2 \\ 2 & -1 \end{bmatrix} \begin{bmatrix} \pi_{i} \\ \pi_{i} \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \end{bmatrix} \Rightarrow \pi_{i} = 2\pi_{i} \Rightarrow \begin{bmatrix} 1 \\ 2 \end{bmatrix}
\lambda_{i} = 0 \Rightarrow \begin{bmatrix} 1 & 2 \\ 2 & 4 \end{bmatrix} \begin{bmatrix} \pi_{i} \\ \pi_{i} \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \end{bmatrix} \Rightarrow \pi_{i} = -1\pi_{i} \Rightarrow \begin{bmatrix} -2 \\ 1 \end{bmatrix}
            λ(= (3+i) =) [-i/2 |0] => λ(=-2δ) =) [-i]]
                                                                     九=歩きョ「まましの」ラガニスカラ [[:]]
            e) \begin{bmatrix} \frac{1}{2} & \frac{1}{2} & 0 \\ \frac{1}{2} & \frac{1}{2} & 0 \end{bmatrix} \Rightarrow \begin{bmatrix} \frac{1}{2} & \frac{1}{2} & \lambda \\ \frac{1}{2} & \frac{1}{2} & 0 \end{bmatrix} \Rightarrow (1-\lambda)(\frac{1}{2}-\lambda)(-\lambda) = -\lambda^{3} + \frac{7}{2}\lambda^{2} - \frac{1}{2}\lambda = 0 = \lambda (2\lambda-1)(\lambda-1) = 0 \Rightarrow \lambda = 0 / \lambda = \frac{1}{2}/\lambda = \frac{1}{2}

\lambda_{i} = 0 \Rightarrow \begin{bmatrix} \frac{1}{1} & \frac{1}{1} & \frac{1}{1} & \frac{1}{1} & \frac{1}{1} & \frac{1}{1} & \frac{1}{1} \\ \frac{1}{1} & \frac{1}{1} \\ \frac{1}{1} & \frac{1}{1} \\ \frac{1}{1} & \frac{1}{1} \\ \frac{1}{1} & \frac{1}{1} \\ \frac{1}{1} & \frac{1}{1} \\ \frac{1}{1} & \frac{1}{1} &
```

Horework 3

```
3. Image Congresion.
  a) Since [v, - - Vm] | v, T = V, V, T + V, V, T + - + Vm Vm T
         Let U= [vi...vn]. and W= #UT
        Since \begin{bmatrix} \lambda_1 \vec{v}_1 & \dots & \lambda_1 \vec{v}_n \end{bmatrix} = \lambda_1 \vec{v}_n \vec{v}_1 + \lambda_2 \vec{v}_n \vec{v}_1 + \dots + \dots + \lambda_n \vec{v}_n \vec{v}_n \vec{v}_n \end{bmatrix}

And since \begin{bmatrix} \lambda_1 \vec{v}_1 + \dots & \lambda_n \vec{v}_n \end{bmatrix} = \begin{bmatrix} \vec{v}_1 & \dots & \vec{v}_n \end{bmatrix} \begin{bmatrix} \lambda_1 & \dots & \ddots & \dots \\ \lambda_n & \dots & \ddots & \dots \end{bmatrix}

And since \begin{bmatrix} \lambda_1 \vec{v}_1 + \dots & \lambda_n \vec{v}_n \end{bmatrix} = \begin{bmatrix} \vec{v}_1 & \dots & \vec{v}_n \end{bmatrix} \begin{bmatrix} \lambda_1 & \dots & \dots & \dots \\ \vdots & \ddots & \dots & \ddots \end{bmatrix}

A = \begin{bmatrix} \lambda_1 \vec{v}_1 + \dots & \lambda_n \vec{v}_n \end{bmatrix} = \begin{bmatrix} \vec{v}_1 & \dots & \vec{v}_n \end{bmatrix} \begin{bmatrix} \lambda_1 & \dots & \dots & \dots \\ \vdots & \ddots & \dots & \dots \end{bmatrix}
         Thus We can get that A= 2 NVT+ his vit + -.. + hove vit = VNW
  I'me de mayo is a 400 x 400 marists, and more of de organismes one o. we should have
         40 agentalies, and this we need to know the 600 consequely eigenvectors to filly capane
        the infrasolin in inage.
  C) Pose
 d) I think around 12 should be an reasonable buse calve of R.
4. Sports Rank
  a) 1/ A 2 This we can have madin Q: [2/6 0 0]
8 12 3 C
b) Since si= 272 & 5=QT, we have QT=2T, Mrs. T's expersector of Q
a) Q'CV = CQ'V. since QV = 2V. Q'CV = CQ"-12V = c2"V
d) Q(In avi) = In Qavi = In liavi
e) + Qm(=avi)= 1 = 2 liavi = CIVI + = 1 2 2 mavi
       This for (ZCIV) = CIVI + O (sine ()) (0, (()) =0) = CIVI
```

```
Since line and the Pist will + zero, we got (2) = the most the City City All Sine to Q'(Encity) = City, we got (3) = the O'(Encity) = City

And Sine to Q'(Encity) = City, we got (3) = the O'(Encity) = 167/11
             D) Top fre: Oregon. Nabana. A Bone Mississippi. OCLA
                                    Fourteenth: LSU / Seventeenth: USC
          J. He Byranius of Romeo and Juliee's Love Affor.

a) A[i] = [a+b] =) since a+b=c+d. => A[i] = (a+b)[i] = (c+d)[i]
                                 They [i] is an eigenvector of A and 2. = atb = cel
                                Sue 1.+ 1.= trace(a) = ard. h= ard-1.= ard-a-b=d-b.

*A-1.1=[a+b-d b]=[c b] = [c b] = 12 = [-c]
with sme [ 0.2+ 0.2+] ≥ a=0.2+ l=0.2+ l= a+b=1. Vi=[i] / h=d-b=0.+ Vi=[-i]
             ii) Any pire on 5x = [i]= vi is final pine suce vi=1 is an eigeneur of A arresponly as he
             iii) The state superery 5 5[1] = 27,"vi + Pr."vi
                             She \mathfrak{F}[0] = \begin{bmatrix} -1 \end{bmatrix} = \overline{V}_2. \lambda = 0. Thus \widetilde{S}[n] = \beta \lambda_n^{\mu} \overline{V}_2 = \beta o.5^{n} [-1]. \Rightarrow \beta = 1. \begin{bmatrix} RU_1 \end{bmatrix} = \begin{bmatrix} o.5^{\mu} \end{bmatrix}. n \in \mathbb{N}. and as n \Rightarrow \infty. \begin{bmatrix} RU_1 \end{bmatrix} = \begin{bmatrix} o \end{bmatrix}.
                             Thus faulty Romes and Isliel will become "no feelig" is couch other.
        |\widetilde{SU}| = \partial \widetilde{U} + \beta \widetilde{U} + \beta \widetilde{U} = |\widetilde{U}| = |\widetilde{U}| + |\widetilde{U}| = |\widetilde{U}| |\widetilde{U}| = |\widetilde{U}| |\widetilde{U}| = |\widetilde{U}| = |\widetilde{U}| |\widetilde{U}| = |\widetilde{U}|
                             The 3[-]= 42. vi+(-1)2. vi = 4[i] + (-1)as [-1] = [4-as ]
                         Sue la at 20. lin 327 = [4]
```

```
b) Rosea and Julie will be in a cycle of RT -JJ - RV - JT - RT ...
               A = \begin{bmatrix} 0 & 1 \\ -1 & 0 \end{bmatrix} \quad \begin{vmatrix} A - \lambda I \end{vmatrix} = \begin{vmatrix} A^{1} & 1 \\ -1 & -1 \end{vmatrix} = \lambda^{2} + 1 = 0 \Rightarrow \lambda_{i} = i \quad \lambda_{i} = -i
               λ=i: A-λI=[-1-1] => x=i7, => v=[i]
               λ=i: A-λ[=[-i] = λ=-2/1 = vi=[-i]
               Since 3[0] = [0] = [u vi][0] = [1 1][0] = 2 = 0.5
              Mes 5[n]= alivi+81: vi = st osin[i] + os (i) [-i] = 0.5[in+4 (-i) n+1]
               573= [0] n\%4==0 (\%=) mul, ==)equele to)
                       [-1] n/4 == |
                       \begin{bmatrix} -1 \\ 0 \end{bmatrix} \quad h\%4 == 2
\begin{bmatrix} 0 \\ 1 \end{bmatrix} \quad h\%4 == 3
                                                         This 1 3 [ ] = 1
                Sice | 5[4] | = 1. Fill goes in closeries around de organt poul.
                                                            & Julia likes Roses he devreuse. at Rose likes Fills more as Tille sail likes him
The thes knee more and so
Loes Roseo.
Roneo sear as investyly distille
                                                              E Julie more and more chis like Rome. Romes start to not to like
Julie he dan pokes the like him more :- .
           6. Filing Will Space.
            a) Sue de versos one in R3. dere one 3 timenty independent recors at maximum.
            b) Sue der are 2 thoug ilepedal vers in A. Acel of there ships la
                A sel of verting theil speans the range of A is $[0].[2]
            c) let 67 = 0. Then \begin{bmatrix} 1 & 1 & 0 & -2 & 3 \end{bmatrix} \begin{bmatrix} 74 \\ 72 \\ 0 & 0 & 0 \end{bmatrix} = 0 Thu 76 = 274 - 712 - 374
74 = 74 - 712 - 374
74 = 74 - 712 - 712 - 713
73 = 74 - 712 - 713 - 713
                The 18 = [24-71-32] = 71 [ ] + 74 [ ] + 74 [ ]
```

```
d) B = \begin{bmatrix} 2 & 4 & 4 & 0 \\ 1 & -2 & 3 & 4 \\ 2 & -4 & 4 & 9 \\ 3 & -6 & 1 & 13 \end{bmatrix}
Guasi-Ellainand, \Rightarrow \begin{bmatrix} 1 & -2 & 2 & 4 \\ 0 & 0 & 1 & 1 \\ 0 & 0 & 1 & 1 \end{bmatrix} \Rightarrow \begin{bmatrix} 1 & -2 & 2 & 2 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 0 & 0 \end{bmatrix} \Rightarrow B'
                7. Traffic Flows.
   a) Yes. sice-tith=0. ti=tz, al ti=t=-tz. thur. ti=10. ti=10. ti=-10
   D) For 18/8/C/O we can where equillers
                          ti+ti=t4, ti-ti, ti=ti+ti, ti=ts A

ti+ti=t4, ti-ti, ti=ti+ti, ti=ts A

ti-ti ten e-

line | 1-1 0 0 0 | tis = 0

ti ti-ti ten e-

line | 1-1 0 0 0 | tis = 0
                 Goussian Ellowinese A: [ 1-1000 ] = [ 1-1000 ] = ] we must know me for ti/to all one from tu/to
                Beddey salae goe AD(to) and BA(t.) with fliftl the goodien
                Starford standare gets CB(ta) at BA(ta) which consider under unique solution for to/ty/to
c) let the vallet for be v. den 20 fors one salar a still satisfy de assertation answales
                since both inflows and mellow equals (both obleges / small by a same scalar)
               lee U, be iffer at intersection A and the onether in A is U. ) Vie Vi
             be is be the inflow are idenceton R onl the onefor in B is Up. = Us=Vy
                VitVi=Vz+Vu = salyly do consenación conserientes.
             Take the word Adjul in b) the [ 3000]. The And And The sol of the state of the stat
              Thus $\frac{\pi_1}{\pi_4} = \frac{\pi_1}{\pi_4} = \frac{\pi_2}{\pi_1} \\
\frac{\pi_4}{\pi_4} = \pi_3
\end{array} = \frac{\pi_2}{\pi_1} \\
\frac{\pi_4}{\pi_1} = \pi_3
\end{array} = \frac{\pi_2}{\pi_1} \\
\frac{\pi_4}{\pi_1} = \pi_3
\end{array} = \frac{\pi_2}{\pi_1} \\
\frac{\pi_1}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_1}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_2} \\
\frac{\pi_2}{\pi_1} \\
\frac{\pi_2}{\pi_2} \\
\frac{\
```

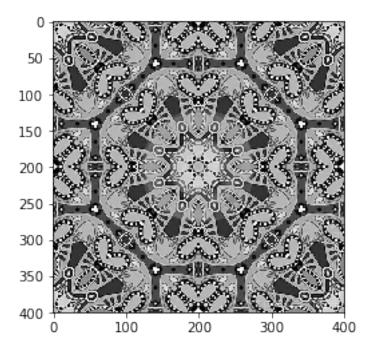
Eats must & mours de offer of a horseeller each I means inflow and I heave neglow. Bah alumi's (+1) shows the scal of a real and C-1) show where the destruction is Each row's (+1) shows the flow ove of a real and (+1) shows the inflow in the intersection by e) B= [+0-1 10] = [1-10] = B7=0= [1-1000] [7] = 0 Thus $\frac{\pi_1 = \pi_1}{\pi_1 = \pi_2}$ $\Rightarrow \vec{\pi}^2 \begin{bmatrix} 1 \\ 0 \\ 1 \end{bmatrix} \pi_1 + \begin{bmatrix} 0 \\ 1 \\ 1 \end{bmatrix} \pi_2 \Rightarrow NM(B) = \text{Span} \begin{bmatrix} 1 \\ 0 \\ 1 \end{bmatrix} \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix}$ $\pi_4 = \pi_1 + \pi_2$ $\pi_4 = \pi_1 + \pi_2$ This matches my annuar in part (c) since day span the same (hill space) space. In figure 2 there are two inlegalese cycles, while in figure I there is just one. Evay systems can be taken as to some amount of independent system cycles. Thus de dinencion of the null-space is the number of independent roycles 81 Fansley Chay: 30332078+5 Samuel Harreschan: 23864699

prob3

July 8, 2017

1 EE16A Homework 3

1.1 Question 2: Image Compression



Use the command shape to find the dimensions of the image. How many eigenvalues do you expect?

Run the code below to find the eigenvector and eigenvalues of pattern and sort them in descending order (first eigenvalue/vector corresponds to the largest eigenvalue)

```
In [5]: eig_vals, eig_vectors = np.linalg.eig(pattern)
       idx = (abs(eig_vals).argsort())
       idx = idx[::-1]
       eig_vals = eig_vals[idx]
       eig_vectors = eig_vectors[:,idx]
       A = np.zeros((400,400))
       for i in range(len(eig_vals)):
           A[i, i] = eig_vals[i]
       V = eig_vectors
In [6]: shape(pattern)
Out[6]: (400, 400)
In [7]: print(A)
[[ 5.17977812e+04
                    0.0000000e+00
                                     0.00000000e+00 ...,
                                                           0.0000000e+00
   0.0000000e+00
                    0.0000000e+00]
 [ 0.0000000e+00
                    8.34455214e+03
                                     0.00000000e+00 ...,
                                                           0.0000000e+00
   0.0000000e+00
                    0.0000000e+001
                    0.0000000e+00 -6.53777196e+03 ...,
 [ 0.0000000e+00
                                                           0.0000000e+00
   0.0000000e+00
                    0.0000000e+00]
```

```
[ 0.0000000e+00 0.0000000e+00
                                     0.00000000e+00 ...,
                                                          1.25439907e+00
   0.0000000e+00 0.0000000e+00]
 [ 0.00000000e+00 0.0000000e+00
                                     0.00000000e+00 ...,
                                                          0.0000000e+00
   5.73743124e-01 0.0000000e+00]
 [ 0.00000000e+00 0.0000000e+00
                                     0.00000000e+00 ...,
                                                          0.00000000e+00
   0.00000000e+00 5.28745994e-01]]
In [8]: print(V)
[[ 0.05272712  0.00485203  0.03648574 ...,  0.08319636  0.06586539
 -0.004197317
 [ 0.05362817  0.05090675  0.0096022  ..., -0.0413083  -0.02076564
  0.1048611
 [ 0.04938267  0.05893814 -0.05341189 ..., -0.02096135 -0.12229795
  0.12034818]
 [ 0.04947531  0.06231956 -0.04602839 ..., 0.01555162  0.14062768
 -0.1194096 ]
 [ 0.05423878  0.0479798  0.01289808  ...,  0.03292486  -0.00820568
 -0.09842246]
             0.00151874 0.03694918 ..., -0.07124379 -0.04447344
 [ 0.0523673
  0.01607259]]
In [9]: print(0 in eig_vals)
False
```

1.1.2 Part c)

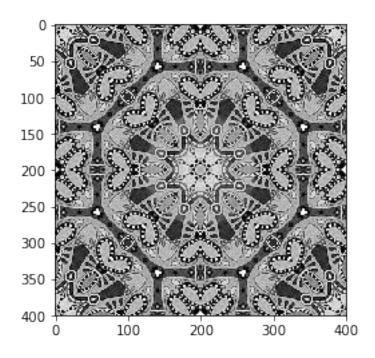
Find the pattern approximation using 100 largest eigenvalues/eigenvectors.

- Index into above variables to choose the first 100 eigenvalues and eigenvectors.
- You can use the command np.outer to find the outer product of two vectors

```
In [10]: rank = 100
    S = np.zeros(pattern.shape)
    for i in range(rank):
        vec_i = eig_vectors[:,i]  # i-th largest eigenvector
        val_i = eig_vals[i]  # i-th largest eigenvalue
        S += val_i * np.outer(vec_i, vec_i)  # Your Code Here

plt.imshow(S, cmap='gray', vmin=0, vmax=255)

Out[10]: <matplotlib.image.AxesImage at 0x1169637b8>
```



1.1.3 Part d)

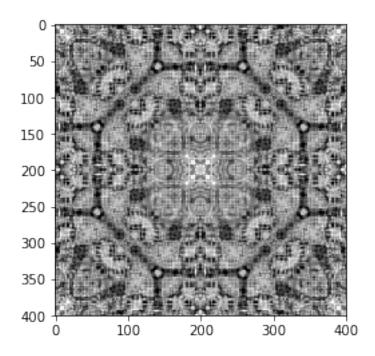
Find the pattern approximation using 50 largest eigenvalues/eigenvectors.

```
In [16]: rank = 12

S = np.zeros(pattern.shape)
for i in range(rank):
    vec_i = eig_vectors[:,i] # i-th largest eigenvector
    val_i = eig_vals[i] # i-th largest eigenvalue
    S += val_i * np.outer(vec_i, vec_i)# Your Code Here

plt.imshow(S, cmap='gray', vmin=0, vmax=255)

Out[16]: <matplotlib.image.AxesImage at Ox1198c9160>
```



1.2 Question 3: Sports Rank

In this part, we will implement the power iteration method to find the dominant eigenvector of a matrix. For the matrix in consideration the dominant eigenvector will correspond to a ranking of the top 25 teams in College football for the 2014 regular season.

First we load the wins of all the teams into a matrix

```
In [12]: # Creating W (win) Matrix
         W=np.zeros([26,26])
         # Alabama
         count=0
         W[count, [7,15,18,21]]=1
         W[count, 25] = 8.0
         Teams={count:'ALA'}
         count=count+1
         # FSU
         Teams.update({count:'FSU'})
         W[1,[9,17,19]]=1
         W[1,25]=10.0
         count=count+1
         # Oregon
         Teams.update({count:'ORE'})
         W[2,[6,11,13,22]]=1
```

```
W[2,25]=8.0
\mathtt{count} {=} \mathtt{count} {+} 1
# Baylor
Teams.update({count: 'BAY'})
W[3,[5,10]]=1
W[3,25]=9.0
count=count+1
# OSU
Teams.update({count:'OSU'})
W[4, [6, 16]] = 1
W[4,25]=10.0
count=count+1
# TCU
Teams.update({count:'TCU'})
W[5,[10]]=1
W[5,25]=10.0
count=count+1
# MSU
Teams.update({count:'MSU'})
W[6,[24]]=1
W[6,25]=9.0
count=count+1
# MSST
Teams.update({count:'MSST'})
W[7,[18,21]]=1
W[7,25]=8.0
count=count+1
# MISS
Teams.update({count:'MISS'})
W[8,[0,7,20]]=1
W[8,25]=6.0
count=count+1
Teams.update({count:'GT'})
W[9,[17,12]]=1
W[9,25]=8.0
count = count + 1
# KSU
Teams.update({count:'KSU'})
W[count, 25] = 9.0
```

```
count=count+1
# ARIZ
Teams.update({count:'ARIZ'})
W[count,[2,22,14]]=1
W[count, 25] = 7.0
count=count+1
# UGA
Teams.update({count:'UGA'})
W[count,[17,15,18]]=1
W[count, 25] = 6.0
count=count+1
# UCLA
Teams.update({count:'UCLA'})
W[count,[14,11,23]]=1
W[count, 25] = 6.0
count=count+1
# ASU
Teams.update({count:'ASU'})
W[count,[23,22]]=1
W[count, 25] = 7.0
count=count+1
# MIZZ
Teams.update({count:'MIZZ'})
W[count, 25] = 10.0
count=count+1
# WISC
Teams.update({count:'WISC'})
W[count,[24]]=1
W[count, 25] = 9.0
count=count+1
# CLEM
Teams.update({count:'CLEM'})
W[count,[19]]=1
W[count, 25] = 8.0
count=count+1
# AUB
Teams.update({count:'AUB'})
W[count,[10,8,21]]=1
W[count, 25] = 5.0
count=count+1
```

```
Teams.update({count:'LOU'})
         W[count, 25] = 9.0
         count=count+1
         # BSU
         Teams.update({count:'BSU'})
         W[count, 25]=11.0
         count=count+1
         # LSU
         Teams.update({count:'LSU'})
         W[count,[16,8]]=1
         W[count, 25] = 6.0
         count=count+1
         # UTAH
         Teams.update({count:'UTAH'})
         W[count,[13,23]]=1
         W[count, 25] = 6.0
         count=count+1
         # USC
         Teams.update({count: 'USC'})
         W[count,[11]]=1
         W[count, 25] = 7.0
         count=count+1
         Teams.update({count:'NEB'})
         W[count, 25] = 9.0
         count=count+1
         # OTHERS
         Teams.update({count:'Others'})
         W[count,[3,4,8,13,14,15,16,18,19,20,21,22,23,24]]=1
         W[count,[9,12]]=2
In [13]: # Creating Q matrix (accounts for normalization by games played)
         numrows, numcols=W.shape
         Q=np.zeros([numrows,numcols])
         for j in range(0,numrows):
             Q[j,:]=W[j,:]/(np.sum(W[:,j])+np.sum(W[j,:])) # sum over column j plus sum over rou
   As we discussed earlier the power iteration method can be used to find the dominant eigen-
```

LOU

vector of a matrix Q. If we denote the dominant eigenvector as $\vec{v_D}$ then we showed that for almost any vector \vec{b} , $\lim_{n\to\infty}\frac{Q^n\vec{b}}{|Q^n\vec{b}|}=\frac{c_1\vec{v}_D}{|c\vec{v}_D|}$, where c is a nonzero constant. For numerical reasons, it is better to perform this method iteratively: Take the sequence $\vec{b}_{k+1}=\frac{Q\vec{b}_k}{|Q\vec{b}_k|}$ with $\vec{b}_0=\vec{b}$, in the limit it converges to $\frac{c_1\vec{v}_D}{|c_1\vec{v}_D|}$, i.e. $\lim_{n\to\infty}\vec{b}_n=\frac{c\vec{v}_D}{||c_1\vec{v}_D||}$. This iterative procedure is precisely the power iteration method.

In the next block you will implement the power iteration method. The b vector has already been intialized for you, all you need to do is update it in the for loop, $\vec{b} \leftarrow \frac{Q\vec{b}}{|Q\vec{b}|}$. The following functions might be useful: np.dot(A,x) - takes a matrix A and multiplies it by a vector x and np.linalg.norm(x) - returns the norm of a vector x.

```
In [14]: # Power Iteration Method
         # Initializing b
         b = np.ones(numrows)
         for j in range(0,500):
             b=np.dot(Q,b)/np.linalg.norm(np.dot(Q,b))
         # Don't forget to do this
         # Set v_D equal to your result
         v_D=b
In [15]: # Create rankings
         v_D=np.absolute(v_D)
         indices=np.argsort(v_D)
         ratings=np.sort(v_D)
         indices=indices[25::-1]
         ratings=ratings[25::-1]
         # Printing teams (in order) and their score
         print('Team','Score')
         for j in range(0,26):
             print(Teams[indices[j]], ratings[j])
Team Score
ORE 0.315008931845
ALA 0.288273738356
ARIZ 0.2626702629
MISS 0.255733549792
UCLA 0.249273982542
FSU 0.236751105677
AUB 0.221021399589
MSST 0.218963318695
UGA 0.212647337364
```

BAY 0.199237297226

OSU 0.198224992896

UTAH 0.193453822567

ASU 0.191687923433

LSU 0.1887957695

GT 0.187834421914

TCU 0.167165294131

USC 0.165485303897

MSU 0.153737969203

WISC 0.141911971572

CLEM 0.140310644275

BSU 0.136338991575

MIZZ 0.123944537796

KSU 0.120845924351

LOU 0.120845924351

NEB 0.120845924351

Others 0.0493322169466

1.3 (PRACTICE) Question 8: Random Surfer

In []: # There is no required IPython component, but you may wish to use IPython for calculation

1.4 (PRACTICE) Question 9: Can you Hear the Shape of a Drum?

We have seen that the PageRank Problem is defined in the form $A\vec{v} = \lambda \vec{v}$, where the transition of users from web page to web page reaches a steady state: even though the matrix A re-distributes users to some new sites, the number of users on each web page doesn't change. In general, this represents a class of problems that are important in disciplines that require modeling.

In the PageRank problem, the state \vec{v} tells you how many users there are on each site at a particular time, and λ tells you the score for each page. When you use the $(A\vec{v}=\lambda\vec{v})$ format for vibrational modes of a string or a membrane, the state \vec{v} tells you how much displacement there is at a particular location on the object, and λ tells you how much energy there is in that particular vibrational mode described by \vec{v} .

This notebook will help you construct the matrix A given some geometry, and then you will write a small amount of code to solve the problem $A\vec{v} = \lambda \vec{v}$ for λ and \vec{v} .

1.5 Define Some Helper Functions

You will need to make edits to two functions below: **construct_1D_FDE** and **construct_2DSquare_FDE**.

construct_1D_FDE(l, N): This function should take in two variables (l, the length of a string; N, the number of points on the string to model, including the anchor points) and output a matrix, A, which describes the 3-point finite difference model of the vibration of the string. A should be $N \times N$.

Reminder: the 3-point difference formula is

$$\frac{d^2u}{dx^2} \approx \frac{u(x+h) - 2u(x) + u(x-h)}{h^2}$$

construct_2DSquare_FDE(l, N): This function should take in two variables (l, the side-length of a square membrane; N, the number of points on one side of a membrane to model, including the anchor points) and output a matrix, A, which describes the 5-point finite difference model of the vibration of the membrane. A should be $N^2 \times N^2$.

Reminder: the 5-point difference formula is

```
\nabla^2 u(x,y) = \frac{\partial^2 u}{\partial x^2} + \frac{\partial^2 u}{\partial u^2} \approx \frac{u(x+h,y) + u(x,y+h) - 4u(x,y) + u(x,y-h) + u(x-h,y)}{h^2}
In [ ]: def construct_1D_FDE(1, N):
             # l = length of a string
             # N = number of points on a string
             ####### STUDENT: write code to generate matrix, A
             ####### END STUDENT EDITS
             return A;
In []: def construct_2DSquare_FDE(1,N):
             # l = sidelength of a square
             # N = number of points on a side
             ####### STUDENT: write code to generate matrix, A
             ####### END STUDENT EDITS
             ####### Do not edit the section below
             G = arange((N-2)*(N-2))+1;
             G = np.reshape(G,(N-2,N-2)).T;
             G = np.c_{[zeros((N-2,1)),G,zeros((N-2,1))]}
             G = np.r_[zeros((1,N)),G,zeros((1,N))]
             ####### Do not edit the section above
             return [A,G]
```

The helper functions numgrid and delsq do not need to be edited. They will be used to automatically generate the *A* matrix for more arbitrary geometries than strings or squares. They are adapted from MATLAB developer Cleve Moler.

```
In []: def delsq(G):
    # Do not edit.
    """

DELSQ Construct five-point finite difference Laplacian.
    delsq(G) is the sparse form of the two-dimensional,
    5-point discrete negative Laplacian on the grid G.
    adapted from C. Moler, 7-16-91.
    Copyright (c) 1984-94 by The MathWorks, Inc.
    """
[m,n] = G.shape
    # Indices of interior points
G1 = G.flatten()
```

```
p = np.where(G1)[0]
N = len(p)
# Connect interior points to themselves with 4's.
i = G1[p]-1
j = G1[p]-1
s = 4*np.ones(p.shape)
# for k = north, east, south, west
for k in [-1, m, 1, -m]:
   # Possible neighbors in k-th direction
   Q = G1[p+k]
   # Index of points with interior neighbors
   q = np.where(Q)[0]
   # Connect interior points to neighbors with -1's.
   i = np.concatenate([i, G1[p[q]]-1])
   j = np.concatenate([j,Q[q]-1])
   s = np.concatenate([s,-np.ones(q.shape)])
# sparse matrix with 5 diagonals
A = zeros((N,N));
for ind in range(0,i.shape[0]-1):
    A[i[ind], j[ind]] = s[ind];
return A
```

The helper functions plotDrumMode and points_in_drum do not need to be edited. They will be used to visualize the vibrational modes of a membrane once you've solved the eigenvalue problem.

```
In [ ]: def plotDrumMode(V,modeNum,G,xx,yy):
            # Do not edit.
            numberOfPoints_x = xx.shape[0];
            numberOfPoints_y = yy.shape[0];
            V_n = V[:,modeNum];
            a_n = zeros_like(xx);
            for i in range(0,numberOfPoints_x-1):
                for j in range(0,numberOfPoints_y-1):
                    V_{ind} = G[i,j]-1;
                    if (V_ind >= 0)&(V_ind < V_n.shape[0]):
                        a_n[i,j] = V_n[int(V_ind)]
                    else:
                        a_n[i,j] = 0;
            plt.figure(figsize=(5,5))
            CS = plt.contour(xx, yy, a_n)
In [ ]: def points_in_drum(xx,yy,drumPath):
            # Do not edit.
            h = xx[0,1]-xx[0,0];
            positions = np.vstack([xx.ravel(), yy.ravel()])
            positionBooleanIn = drumPath.contains_points(positions.T,transform=None,radius=-0.00
```

```
positionBooleanOnIn = drumPath.contains_points(positions.T,transform=None,radius=0.0
            pointsInPolygon = positions.T[positionBooleanIn]/h;
            pointsOnPolygon = positions.T[positionBooleanOnIn^positionBooleanIn]/h;
            G = np.zeros(xx.shape,dtype=np.int)
            for i in range(pointsInPolygon.shape[0]):
                G[int(pointsInPolygon[i,0]),int(pointsInPolygon[i,1])] = i+1;
            return [pointsInPolygon,pointsOnPolygon,G]
In [ ]: def construct_2DPolygon_FDE(gridDensity,gridLength,drum_path):
            # Do not edit.
            N = gridDensity*gridLength;
            h = 1.0/gridDensity;
            x = linspace(0,gridLength,N+1);
            xx,yy = meshgrid(x,x);
            [pointsInPolygon,pointsOnPolygon,G] = points_in_drum(xx,yy,drum_path);
            A_drum = delsq(G)/(h**2)
            return [A_drum,G]
```

1.6 Parts a)-d)

Use the construct_1D_FDE helper function to generate the matrix A for a string length of 1 and 50 model points. Then use an eigenvalue solver to find the eigenvalues and eigenvectors for A. (You can use functions built into the linalg library to do this. I suggest the eigh function.)

```
In [ ]: stringLength = 1.0; # play with this value
        numberOfPoints = 50; # play with this value
        h = stringLength/(numberOfPoints-1);
        x = arange(numberOfPoints)*h;
        A = construct_1D_FDE(stringLength,numberOfPoints);
        # hint: if you implemented this code correctly, when stringLength=1.0 and numberOfPoints
        # you should get the 3x3 matrix that part a) asks for.
In []: # Solution to the eigenvalue problem:
        ##### Student utilize solver here.
        [evals, evecs] = ;
        # evecs = matrix whose columns are the eigenvectors of A
        # evals = vector whose columns are the eigenvalues of A corresponding to the columns of
In [ ]: # Plot the first and last eigenvectors
       first_evec = evecs[:,0]
        last_evec = evecs[:,-1]
        first_eval = evals[0]
        last_eval = evals[-1]
        x = arange(numberOfPoints)*h;
```

plt.figure(figsize=(7,7))

```
plt.plot(x,np.r_[0,first_evec,0],'r-o');
plt.plot(x,np.r_[0,last_evec,0],'b-o');
```

1.7 Part g)

Use the construct_2DSquare_FDE helper function to generate the matrix *A* for a square membrane with side-length of 1 and 50 points along a side. Then use an eigenvalue solver to find the eigenvalues and eigenvectors for *A*. (Use the same eigenvalue solver you used above.) There is a little extra code to generate a matrix, *G*, which will be used to plot the results. You don't need to modify this code to get your solution working.

The plotDrumMode function takes your eigenvectors (formatted as column vectors; if you use $[D,V] = linalg.eigh(A_squareDrum)$, you can pass V), a number corresponding to the mode you want to plot, and the variables defined in the "do not edit" section (G, xx, and yy). Plot the zero-th and first modes.

1.8 Parts h)-i)

Here are two polygon shapes that we will study, drum1 and drum1. The variables gridDensity and gridLength describe the density of model points and the side-length of the square model grid. You can modify these values to get higher spatial resolution results, but remember that this trades off with the amount of memory and time the code needs to run!

```
[A_weirdDrum2,G2] = construct_2DPolygon_FDE(gridDensity,gridLength,drum2_path);
        [D1,V1] = linalg.eigh(A_weirdDrum1);
        [D2,V2] = linalg.eigh(A_weirdDrum2);
In []: # defining drum1 and drum2 for easy plotting of the drum shape.
        drum1 = np.array([[0, 0, 2, 2, 3, 2, 1, 1, 0],
                          [0, 1, 3, 2, 2, 1, 1, 0, 0]]);
        drum2 = np.array([[1, 0, 0, 2, 2, 3, 2, 1, 1],
                          [0, 1, 2, 2, 3, 2, 1, 1, 0]]);
        N = gridDensity*gridLength;
        x = linspace(0,gridLength,N+1);
        xx,yy = meshgrid(x,x);
        # plot a drum mode
        modeNum = 0; # play with this value to see different vibrational modes.
        plotDrumMode(V1,modeNum,G1,xx,yy)
        # plot the outline of the drum
        plt.plot(drum1[0,:],drum1[1,:],'b')
In [ ]: # plot the drum mode
        plotDrumMode(V2, modenum, G2, xx, yy)
        # plot the outline of the drum
        plt.plot(drum2[0,:],drum2[1,:],'b')
```

Compare the eigenvalues for the modes of the two drum shapes. These correspond to the drum pitches, or frequencies. Do the drums sound the same according to your simulation? Why or why not?

```
In []: D1
In []: D2
```

Final student answer:

WRITE YOUR ANSWER HERE

For fun, you can go back and edit the drum shape paths to create differently-shaped membranes.