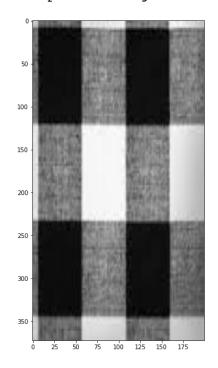
## 1.

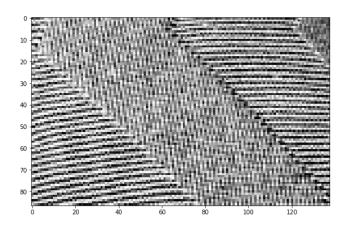
```
In [1]: import matplotlib
import matplotlib.pyplot as plt
import matplotlib.image as mpimg
import pandas as pd
import numpy as np
import scipy as sp
import cv2
import os
import sys
#suppress warnings for cleanliness
import warnings
warnings.filterwarnings('ignore')
executed in 709ms, finished 18:22:09 2019-04-20
```

```
In [67]: flower = "texture2.jpg"
leaf = "texture1.jpg"

imgtex1 = cv2.imread(flower)
imgtex2 = cv2.imread(leaf)
imgtex1 = cv2.cvtColor(imgtex1, cv2.COLOR_BGR2GRAY)
imgtex2 = cv2.cvtColor(imgtex2, cv2.COLOR_BGR2GRAY)
imgtex1 = cv2.resize(imgtex1, (200,373))
plt.figure(figsize=(20,10))
plt.subplot(121)
plt.imshow(imgtex1, cmap="gray")
plt.subplot(122)
plt.imshow(imgtex2, cmap="gray")
executed in 317ms, finished 19:07:25 2019-04-20
```

Out[67]: <matplotlib.image.AxesImage at 0x127024550>





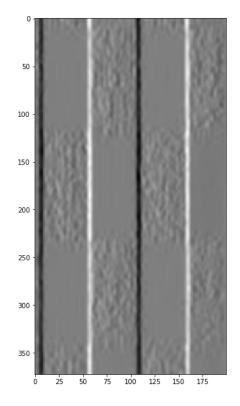
```
In [68]: #blur
blurred1 = cv2.GaussianBlur(imgtex1, (5,5), 1.5)
blurred2 = cv2.GaussianBlur(imgtex2, (5,5), 1.5)
executed in 3ms, finished 19:07:27 2019-04-20
```

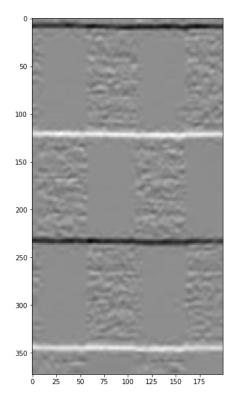
```
In [69]: sobelx = cv2.Sobel(blurred1,cv2.CV_64F,1,0,ksize=5)
    sobely = cv2.Sobel(blurred1,cv2.CV_64F,0,1,ksize=5)

    plt.figure(figsize=(20,10))
    plt.subplot(121)
    plt.imshow(sobelx, cmap="gray")
    plt.subplot(122)
    plt.imshow(sobely, cmap="gray")

    executed in 336ms, finished 19:07:30 2019-04-20
```

Out[69]: <matplotlib.image.AxesImage at 0x1270aeac8>





```
In [70]: shape = sobelx.shape + (2,)
A_1 = np.zeros(shape)

for i in range(shape[0]):
    for j in range(shape[1]):
        A_1[i][j][0]=sobelx[i][j]
        A_1[i][j][1]=sobely[i][j]

executed in 97ms, finished 19:07:33 2019-04-20
```

```
In [71]: shape = sobelx.shape + (2,2)
          B 1 = np.zeros(shape)
          for i in range(shape[0]):
              for j in range(shape[1]):
                  B_1[i][j] = np.matmul(A_1[i][j], A_1[i][j].T)
          def avg(matrix, i, j):
              C = np.zeros((2,2))
              counter = 0
              for i in range(max(i-2, 0), min(i+2, matrix.shape[0]-1)):
                  for j in range(max(j-2, 0), min(j+2, matrix.shape[1]-1)):
                        print(i, j)
                      C = C + matrix[i][j]
                      counter = counter + 1
              C = C/counter
              return C
         N = np.zeros(shape)
          for i in range(N.shape[0]):
              for j in range(N.shape[1]):
                  N[i][j] = avg(B_1, i, j)
         D = []
          for i in range(N.shape[0]):
              for j in range(N.shape[1]):
                  D.append(N[i][j])
         executed in 1.46s, finished 19:07:35 2019-04-20
```

In [ ]:

```
In [81]: #defining loss functions
          from scipy import linalg
          def forb_loss(mat1, mat2):
              diff = mat1 - mat2
              A = np.square(diff)
              return np.sqrt(np.sum(A))
          def max col sums(mat1, mat2):
              diff = mat1-mat2
              diff = np.absolute(diff)
              maxcol = 0
              for i in range(diff.shape[1]):
                  colsum = diff.sum(axis=0)
                  if np.sum(colsum) > maxcol:
                      maxcol = np.sum(colsum)
              return maxcol
          def stein loss(mat1, mat2):
              d = 10000
              try:
                  choleskyA = np.linalg.cholesky(np.absolute(mat1) + np.identity(2))
                  choleskyB = np.linalg.cholesky(np.absolute(mat2) + np.identity(2))
                  choleskyAB = np.linalg.cholesky(np.absolute((mat1 + mat2)/2) + np.i
                  d = 2* np.log(np.linalg.det(choleskyAB)) - np.log(np.linalg.det(choleskyAB))
              except:
                  return d
         executed in 8ms, finished 19:16:43 2019-04-20
```

In [ ]:

```
In [51]: | #My own k means
         import random
         metrics = [forb_loss, max_col_sums, stein_loss]
         clusters_imgs = [np.zeros(imgtex1.shape), np.zeros(imgtex1.shape), np.zeros
         clusters = 2
         iterations = 5
         def color(cluster_count, k):
             return 250 * k/cluster_count
         def recompute(cluster_centers, cluster_members):
             cont = 0
             for group in cluster members:
                 craw = np.zeros((2,2))
                 counter = 0
                  for item in group:
                     craw = item + craw
                     counter = counter + 1
                 craw = craw/counter
                 cluster_centers[cont] = craw
                  cont = cont + 1
             return cluster centers
         clus count = 0
         for metric in metrics:
             #init
             cluster centers = []
             cluster_centers_size = np.ones(clusters)
             cluster members = np.empty((clusters, 0)).tolist()
             for k in range(clusters):
                  i_rand = random.randint(0, imgtex1.shape[0])
                  j rand = random.randint(0, imgtex1.shape[1])
                  cluster centers.append(N[i rand][j rand])
                  cluster members[k].append(N[i rand][j rand])
             for it in range(iterations):
                  for i in range(N.shape[0]):
                      #starting iteration
                      for j in range(N.shape[1]):
                          shortest = 0
                          short dist = 1073741823
                          for k in range(len(cluster centers)):
                              d = metric(N[i][j], cluster centers[k])
                              if d <= short dist:</pre>
                                  shortest = k
                                  short dist = d
                          clusters_imgs[clus_count][i][j] = color(clusters, shortest)
                          cluster members[shortest].append(N[i][j])
                      #recompute means after iteration
                      cluster_centers = recompute(cluster_centers, cluster_members)
                      cluster members = np.empty((clusters, 0)).tolist()
             clus count = clus count + 1
```

4/20/2019

```
print("Clustering for forbloss finished")
```

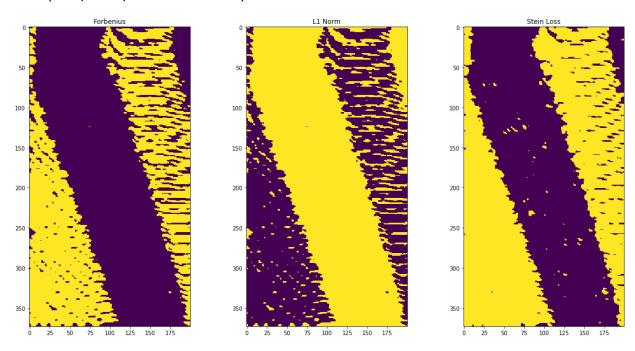
executed in 1m 4.02s, finished 18:59:43 2019-04-20

```
17 55
253 21
Cluster center shape (2, 2, 2)
40 127
190 130
Cluster center shape (2, 2, 2)
237 165
258 45
Cluster center shape (2, 2, 2)
Clustering for forbloss finished
```

```
In [53]: print("Iterations = ", iterations)
          print("Clusters = ", clusters)
          plt.figure(figsize=(20,10))
          plt.subplot(131)
          plt.imshow(clusters_imgs[0])
          plt.title("Forbenius")
          plt.subplot(132)
          plt.imshow(clusters_imgs[1])
          plt.title("L1 Norm")
          plt.subplot(133)
          plt.imshow(clusters_imgs[2])
          plt.title("Stein Loss")
          executed in 410ms, finished 19:00:13 2019-04-20
```

Iterations = 5 Clusters = 2

Out[53]: Text(0.5, 1.0, 'Stein Loss')



```
In [65]: | metrics = [forb_loss, max_col_sums, stein loss]
         clusters imqs = [np.zeros(imqtex1.shape), np.zeros(imqtex1.shape), np.zeros
         clusters = 3
         iterations = 5
         clus count = 0
         for metric in metrics:
             #init
             cluster centers = []
             cluster_centers_size = np.ones(clusters)
             cluster_members = np.empty((clusters, 0)).tolist()
              for k in range(clusters):
                  i_rand = random.randint(0, imgtex1.shape[0])
                  j rand = random.randint(0, imgtex1.shape[1])
                  cluster_centers.append(N[i_rand][j_rand])
                  cluster_members[k].append(N[i_rand][j_rand])
              for it in range(iterations):
                  for i in range(N.shape[0]):
                      #starting iteration
                      for j in range(N.shape[1]):
                          shortest = 0
                          short_dist = 1073741823
                          for k in range(len(cluster_centers)):
                              d = metric(N[i][j], cluster_centers[k])
                              if d <= short dist:</pre>
                                  shortest = k
                                  short dist = d
                          clusters_imgs[clus_count][i][j] = color(clusters, shortest)
                          cluster members[shortest].append(N[i][j])
                      #recompute means after iteration
                      cluster centers = recompute(cluster centers, cluster members)
                      cluster members = np.empty((clusters, 0)).tolist()
             clus count = clus count + 1
         print("Clustering for forbloss finished")
         executed in 1m 36.9s, finished 19:05:09 2019-04-20
```

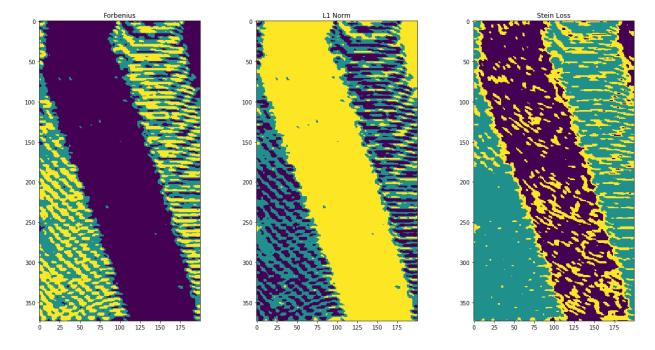
Clustering for forbloss finished

```
In [66]: print("Iterations = ", iterations)
    print("Clusters = ", clusters)
    plt.figure(figsize=(20,10))
    plt.subplot(131)
    plt.imshow(clusters_imgs[0])
    plt.title("Forbenius")
    plt.subplot(132)
    plt.imshow(clusters_imgs[1])
    plt.title("L1 Norm")
    plt.subplot(133)
    plt.imshow(clusters_imgs[2])
    plt.imshow(clusters_imgs[2])
    plt.title("Stein Loss")

executed in 565ms, finished 19:05:09 2019-04-20
```

Iterations = 5
Clusters = 3

Out[66]: Text(0.5, 1.0, 'Stein Loss')



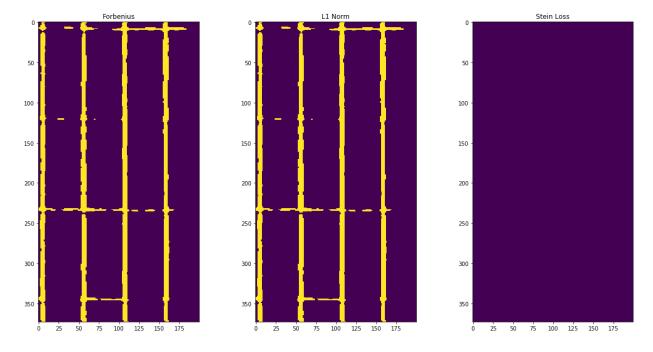
```
In [82]: | metrics = [forb_loss, max_col_sums, stein loss]
         clusters imqs = [np.zeros(imqtex1.shape), np.zeros(imqtex1.shape), np.zeros
         clusters = 2
         iterations = 5
         clus count = 0
         for metric in metrics:
             #init
             cluster centers = []
             cluster_centers_size = np.ones(clusters)
             cluster_members = np.empty((clusters, 0)).tolist()
              for k in range(clusters):
                  i_rand = random.randint(0, imgtex1.shape[0])
                  j rand = random.randint(0, imgtex1.shape[1])
                  cluster_centers.append(N[i_rand][j_rand])
                  cluster_members[k].append(N[i_rand][j_rand])
              for it in range(iterations):
                  for i in range(N.shape[0]):
                      #starting iteration
                      for j in range(N.shape[1]):
                          shortest = 0
                          short_dist = 1073741823
                          for k in range(len(cluster_centers)):
                              d = metric(N[i][j], cluster_centers[k])
                              if d <= short_dist:</pre>
                                  shortest = k
                                  short dist = d
                          clusters_imgs[clus_count][i][j] = color(clusters, shortest)
                          cluster members[shortest].append(N[i][j])
                      #recompute means after iteration
                      cluster centers = recompute(cluster centers, cluster members)
                      cluster members = np.empty((clusters, 0)).tolist()
             clus count = clus count + 1
         print("Clustering for forbloss finished")
         executed in 52.5s, finished 19:17:38 2019-04-20
```

Clustering for forbloss finished

```
In [83]: print("Iterations = ", iterations)
    print("Clusters = ", clusters)
    plt.figure(figsize=(20,10))
    plt.subplot(131)
    plt.imshow(clusters_imgs[0])
    plt.title("Forbenius")
    plt.subplot(132)
    plt.imshow(clusters_imgs[1])
    plt.title("L1 Norm")
    plt.subplot(133)
    plt.imshow(clusters_imgs[2])
    plt.imshow(clusters_imgs[2])
    plt.title("Stein Loss")
```

Iterations = 5
Clusters = 2

Out[83]: Text(0.5, 1.0, 'Stein Loss')



```
In [84]: | metrics = [forb_loss, max_col_sums, stein loss]
         clusters imqs = [np.zeros(imqtex1.shape), np.zeros(imqtex1.shape), np.zeros
         clusters = 3
         iterations = 5
         clus count = 0
         for metric in metrics:
             #init
             cluster centers = []
             cluster_centers_size = np.ones(clusters)
             cluster_members = np.empty((clusters, 0)).tolist()
              for k in range(clusters):
                  i_rand = random.randint(0, imgtex1.shape[0])
                  j rand = random.randint(0, imgtex1.shape[1])
                  cluster_centers.append(N[i_rand][j_rand])
                  cluster_members[k].append(N[i_rand][j_rand])
              for it in range(iterations):
                  for i in range(N.shape[0]):
                      #starting iteration
                      for j in range(N.shape[1]):
                          shortest = 0
                          short_dist = 1073741823
                          for k in range(len(cluster_centers)):
                              d = metric(N[i][j], cluster_centers[k])
                              if d <= short_dist:</pre>
                                  shortest = k
                                  short dist = d
                          clusters_imgs[clus_count][i][j] = color(clusters, shortest)
                          cluster members[shortest].append(N[i][j])
                      #recompute means after iteration
                      cluster centers = recompute(cluster centers, cluster members)
                      cluster members = np.empty((clusters, 0)).tolist()
             clus count = clus count + 1
         print("Clustering for forbloss finished")
         executed in 1m 8.77s, finished 19:18:47 2019-04-20
```

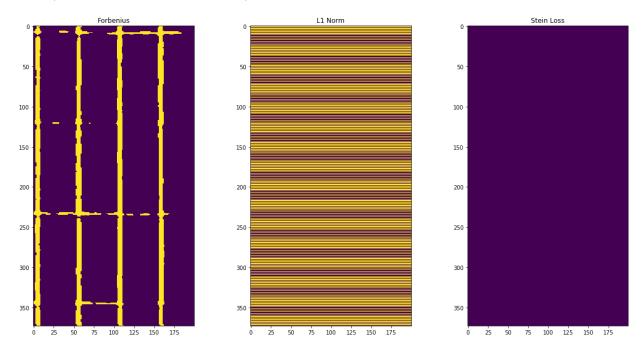
Clustering for forbloss finished

```
In [85]: print("Iterations = ", iterations)
    print("Clusters = ", clusters)
    plt.figure(figsize=(20,10))
    plt.subplot(131)
    plt.imshow(clusters_imgs[0])
    plt.title("Forbenius")
    plt.subplot(132)
    plt.imshow(clusters_imgs[1])
    plt.title("L1 Norm")
    plt.subplot(133)
    plt.imshow(clusters_imgs[2])
    plt.imshow(clusters_imgs[2])
    plt.title("Stein Loss")

executed in 442ms, finished 19:18:47 2019-04-20
```

Iterations = 5
Clusters = 3

Out[85]: Text(0.5, 1.0, 'Stein Loss')



2.

In [ ]: executed in 9m 33s, finished 19:28:54 2019-04-20

```
In [87]:
         executed in 10m 7s, finished 19:28:54 2019-04-20
         (400, 112, 92)
         [[ 41.
                 43. 63. ... 125. 119. 125.]
                 50. 53. ... 119. 120. 124.]
          [ 47.
          [ 47.
                 41. 35. ... 124. 120. 124.]
          [ 35. 158.
                       41. ...
                                36.
                                     89.
                                           36.1
          [ 37. 153. 10. ...
                                39.
                                     94.
                                          35.]
          [ 38. 169. 24. ...
                                40.
                                     85.
                                          34.]]
         KeyboardInterrupt
                                                     Traceback (most recent call las
         <ipython-input-87-cf3d6e9df9e2> in <module>
              16
                     u.append(colmean)
              17 #eignvalues
         ---> 18 w, v= np.linalg.eig(np.matmul(A, A.T))
              19 print(w, v)
              20 summed = []
         ~/miniconda3/lib/python3.7/site-packages/numpy/linalg/linalg.py in eig(a)
            1309
                          _raise_linalgerror_eigenvalues_nonconvergence)
            1310
                      signature = 'D->DD' if isComplexType(t) else 'd->DD'
         -> 1311
                      w, vt = _umath_linalg.eig(a, signature=signature, extobj=exto
         bj)
            1312
            1313
                      if not isComplexType(t) and all(w.imag == 0.0):
         KeyboardInterrupt:
 In [ ]:
```

```
localhost:8888/notebooks/Hw3.ipynb#
```

In [ ]: