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q1.py - Visual Studio Code
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1 # Importing packages
2 import numpy as np
3 from random import random
4 import matplotlib.pyplot as plt
5 from mpl_toolkits.mplot3d import Axes3D
6
7 NOS=5000
8
9 # For first class
10 M1=[3,3]
11 S1=[3,0],[0,3]
12 # S1=[3,1],[2,3]
13 parta=[[],[]]
14 X1,Y1=np.random.multivariate_normal(M1,S1,NOS).T
15 for i in range(NOS):
16     if((X1[i]<=10 and X1[i]>=0) and (Y1[i]<=10 and Y1[i]>=0) and (len(parta[0])<1000)):
17         parta[0].append(X1[i])
18         parta[1].append(Y1[i])
19
20
21 # For second class
22 M2=[7,7]
23 S2=[3,0],[0,3]
24 # S2=[7,2],[1,7]
25 partb=[[],[]]
26 X2,Y2=np.random.multivariate_normal(M2,S2,NOS).T
27 for i in range(NOS):
28     if((X2[i]<=10 and X2[i]>=0) and (Y2[i]<=10 and Y2[i]>=0) and (len(partb[0])<1000)):
29         partb[0].append(X2[i])
30         partb[1].append(Y2[i])
31
32
33 # Specifying boundary
34 boundx=np.arange(0,11,1)
35 boundy=10-boundx
36 # boundy=(np.sqrt(1216*(boundx**2)-4408*boundx+58433)+38*boundx-.26)/45
37
38
39 # Plotting
40 fig=plt.figure()
41 plt.scatter(parta[0],parta[1],color='red',marker='x')
42 plt.scatter(partb[0],partb[1],color='green',marker='o')
43 plt.plot(boundx,boundy,color='yellow',linewidth=4)
44 plt.axis('equal')
45 plt.show()
  
```

Ans 1

Equation of decision boundary is given by the eqn:

$$[x-p_1]^T \Sigma^{-1} [x-p_1] = [x-p_2]^T \Sigma^{-1} [x-p_2]$$

$$1) \quad \Sigma_1 = \Sigma_2 = 3I$$

$$\begin{bmatrix} x-3 \\ y-3 \end{bmatrix}^T \begin{bmatrix} 3 & 0 \\ 0 & 3 \end{bmatrix}^{-1} \begin{bmatrix} x-3 \\ y-3 \end{bmatrix} = \begin{bmatrix} x-7 \\ y-7 \end{bmatrix}^T \begin{bmatrix} 3 & 0 \\ 0 & 3 \end{bmatrix}^{-1} \begin{bmatrix} x-7 \\ y-7 \end{bmatrix}$$

$$\Rightarrow [x-3, y-3] \begin{bmatrix} x-3 \\ y-3 \end{bmatrix} = [x-7, y-7] \begin{bmatrix} x-7 \\ y-7 \end{bmatrix}$$

$$\Rightarrow (x-3)^2 + (y-3)^2 = (x-7)^2 + (y-7)^2$$

$$\Rightarrow 9 - 6x + 9 - 6y = 49 - 14x + 49 - 14y$$

$$\Rightarrow 18 - 6x - 6y = 98 - 14x - 14y$$

$$\Rightarrow 8x + 8y = 80$$

$$\Rightarrow x + y = 10$$

$$\Rightarrow y = -x + 10$$

$$2) \quad \Sigma_1 = \begin{bmatrix} 3 & 1 \\ 2 & 3 \end{bmatrix} \quad \Sigma_2 = \begin{bmatrix} 7 & 2 \\ 1 & 7 \end{bmatrix}$$

$$\begin{bmatrix} x-3 \\ y-3 \end{bmatrix}^T \begin{bmatrix} 3 & 1 \\ 2 & 3 \end{bmatrix}^{-1} \begin{bmatrix} x-3 \\ y-3 \end{bmatrix} = \begin{bmatrix} x-7 \\ y-7 \end{bmatrix}^T \begin{bmatrix} 7 & 2 \\ 1 & 7 \end{bmatrix}^{-1} \begin{bmatrix} x-7 \\ y-7 \end{bmatrix}$$

$$\Rightarrow \frac{1}{7} [x-3, y-3] \begin{bmatrix} 3 & -1 \\ -2 & 3 \end{bmatrix} \begin{bmatrix} x-3 \\ y-3 \end{bmatrix} = LHS$$

$$\Rightarrow \cancel{\frac{1}{7}} \frac{1}{47} [x-7, y-7] \begin{bmatrix} 7 & -2 \\ -1 & 7 \end{bmatrix} \begin{bmatrix} x-7 \\ y-7 \end{bmatrix} = RHS$$

on solving we get:

$$y^2 = [(-1216x^2 - 4408x + 58433)^{1/2} + 30x - 29]^{1/4}$$

When we plot these decision boundaries, we see that the boundaries separate the classes.

Q29) Let student be a 200×1 vector & D be 2000×200 data matrix. According to the head of data analyst of Zomato, there are only 35 different types of families that send their child to institute, based on their food preferences. So we can assume that all children belong to 35 classes only with slight variations & hence practical rank of D is 35. If definition of D_{ij} is changed, more categories may get introduced from each class & rank would increase. Thus rank could become anything from 35 - 100.

- b) i) Break down D matrix into simpler matrices using SVD.
- ii) Reconstruct D, by zeroing insignificant eigen values, to get a rank 35 D matrix.
- iii) Now from the 1 month data, construct bit vector for each of the new 100 students.
- iv) Apply KNN to find a neighbour which resembles student.
- v) Assign that student to its neighbour's class.
- vi) Using neighbour's bit vector, we would get a list of all those restaurants from which the new student might order.
- vii) Now Zomato could recommend the dishes from the restaurants of the given student.

c) This is similar to the previous one. Let us define a restaurant as $d' \times 1$ vector where it has d' types of dishes. Using SVD, find practical rank of the

matrix & say we have c categories of restaurants. Based on transaction history, we can find how many students are likely to buy from a restaurant & thus each restaurant would be associated with certain students. Now apply KNN & find neighbour of new restaurant. Then we can recommend this restaurant to each of the student who is associated with the neighbour's restaurant.

Ans 3
$$Q = \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})(x_i - \bar{x})^T$$

where $x_i = (x_{i1}, x_{i2}, \dots)^T$ & $N = \text{no. of samples}$.

For a non zero $y \in \mathbb{R}^k$:

$$y^T Q y = y^T \left(\frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})(x_i - \bar{x})^T \right) y$$

$$= \frac{1}{N} \left(\sum_{i=1}^N y^T (x_i - \bar{x})(x_i - \bar{x})^T y \right)$$

$$= \frac{1}{N} \left(\sum_{i=1}^N ((x_i - \bar{x})^T y)^T ((x_i - \bar{x})^T y) \right)$$

$$= \frac{1}{N} \sum_{i=1}^N ((x_i - \bar{x})^T y)^2 \geq 0$$

Since $y^T Q y \geq 0$ & Q is a symmetric matrix, Q is a PSD.