

# Assignment 2 : CS 215

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Report for Question 2

**Instructions for running the code is given at the end**

## Question 2.1:

Generate N points (with N taking the values 10, 102, 103, 104, 105) from a multivariate 2D Gaussian probability density function with mean  $\mu = [1, 2]'$  and a covariance matrix C with the first row as [1.6250, -1.9486] and the second row as [-1.9486, 3.8750].

$$X = A*W + \mu$$

- Here C is symmetric and PSD with all positive eigenvalues so there exists an orthogonal matrix Q and diagonal matrix D such that  $C = QDQ'$  where D is composed of eigenvalues of C and Q with eigenvectors of C.

Now coming to generation of points:

- First calculated A using C and eigen function.

```
r = np.sqrt(evalue) #eigenvalues
A = r*(evect)#eigen vector matrix Q
```

- Generated W consisting of two randomly generated values using np.random.normal.
- Then calculated the X with the given  $\mu$ .

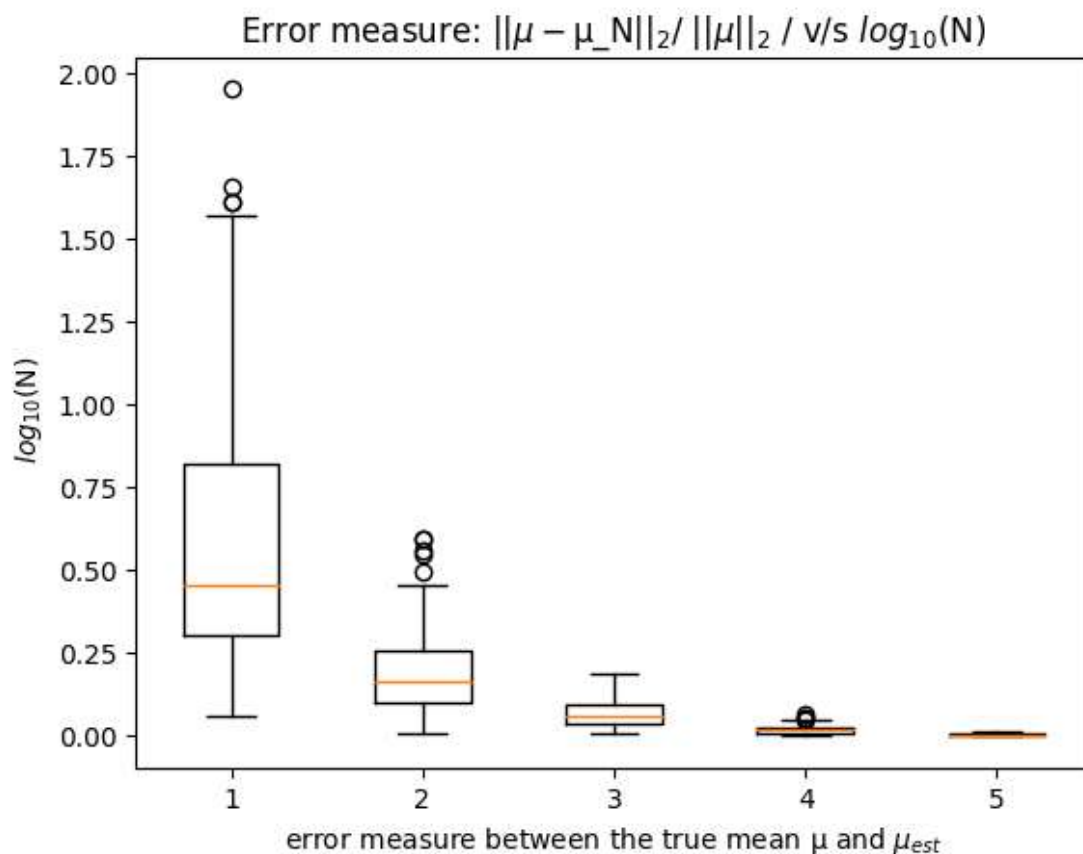
```
p = np.random.normal()
q = np.random.normal()
W = np.array([[p],[q]])
X = matrixsum(np.dot(A,W) , mean)
```

- Here matrix A is QS, hence the covariance matrix is  $AA'$  which is also equal to  $QSS'Q'$  but here  $S = S'$  and  $S^2 = D$
- So  $AA' = QDQ'$ , this matches perfectly with the given matrix C and also the generated mean would also be equal to  $\mu$ .
- Hence it is justified that we have the same Covariance matrix as  $\mu$  is already fixed.

Also we can see the error to be diminishing as N approaches to larger values as in the next subparts of the question.

### **Question 2.2:**

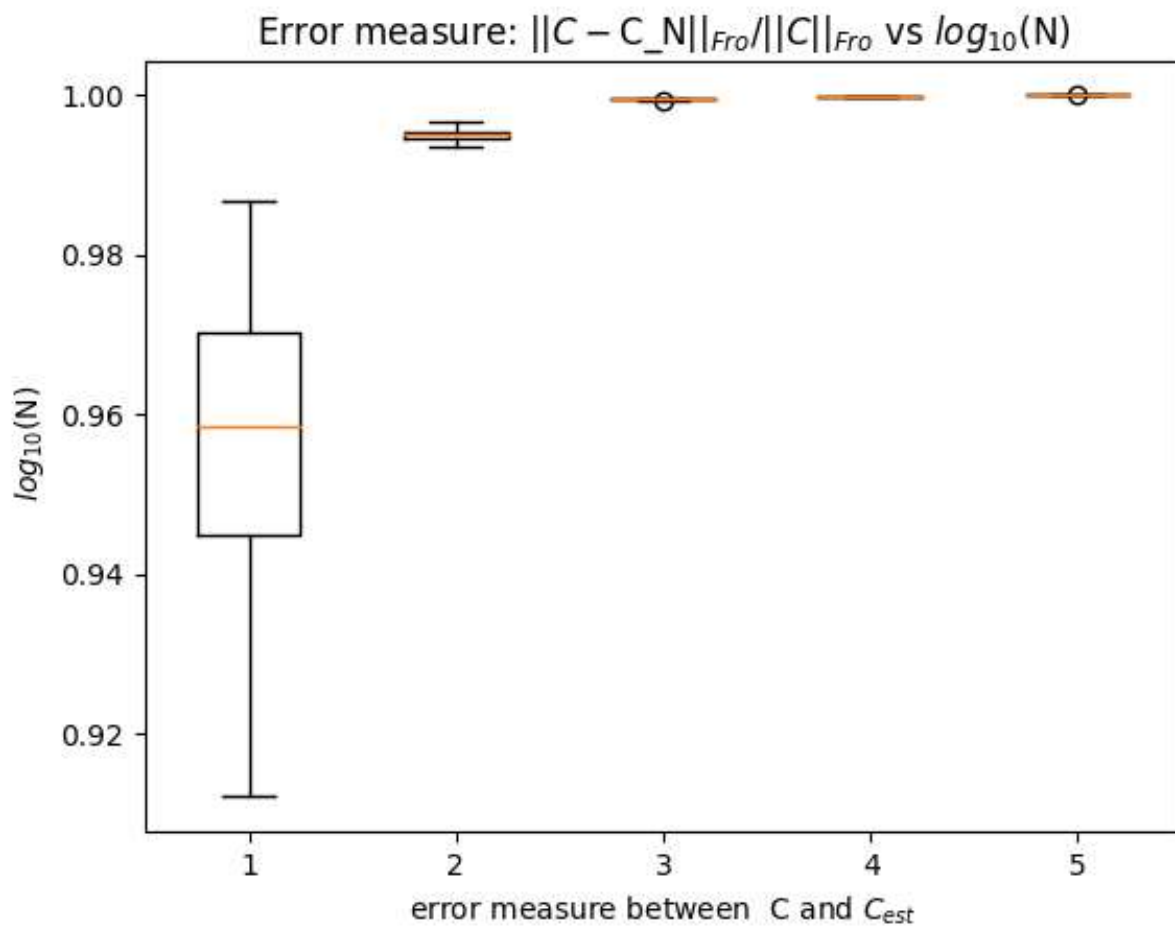
For each value of N, repeat the experiment 100 times, and plot a boxplot of the error between the true mean  $\mu$  and the ML estimate  $\mu_N$  (which depends on N), where the error measure is  $\|\mu - \mu_N\|_2 / \|\mu\|_2$ . Use a logarithmic scale on the horizontal axis, i.e.,  $\log_{10} N$ .



As we can see in the graph as said above the difference between the estimate and true mean gets reduced as N tends to move as 10,100,1000,10000,100000.

### Question 2.3:

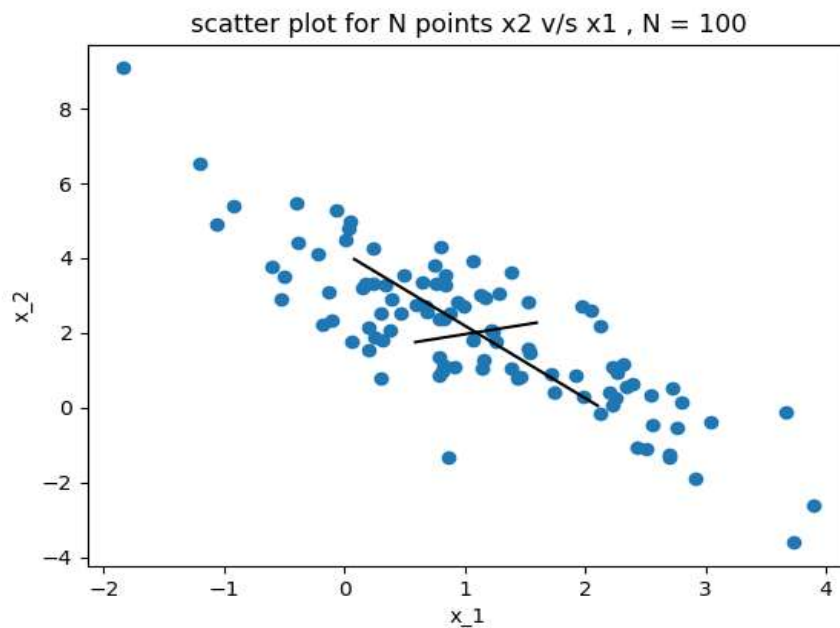
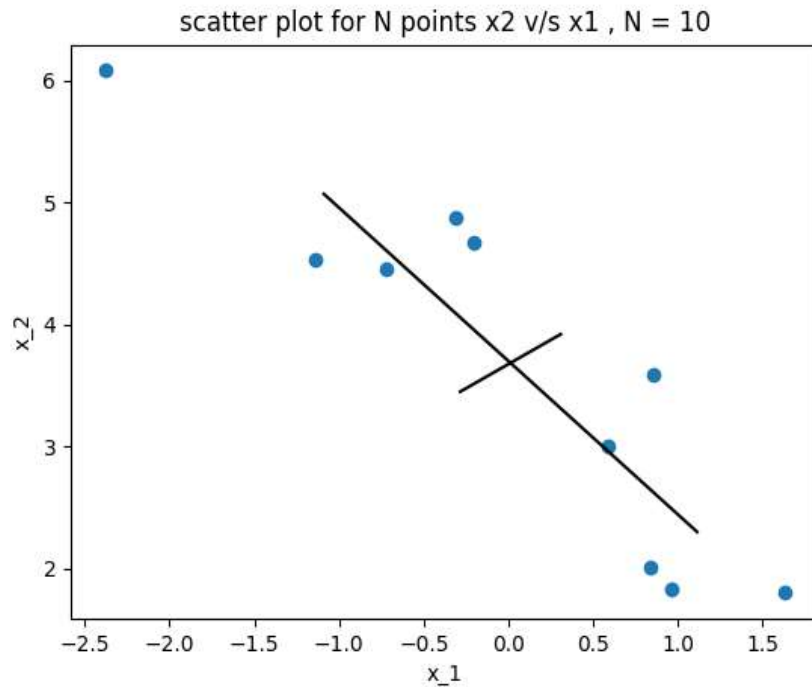
For each value of  $N$ , repeat the experiment 100 times, and plot a boxplot of the error between the true covariance  $C$  and the ML estimate  $C_N$  (which depends on  $N$ ), where the error measure is  $\|C - C_N\|_{Fro} / \|C\|_{Fro}$ . Use a logarithmic scale on the horizontal axis, i.e.,  $\log_{10} N$ .

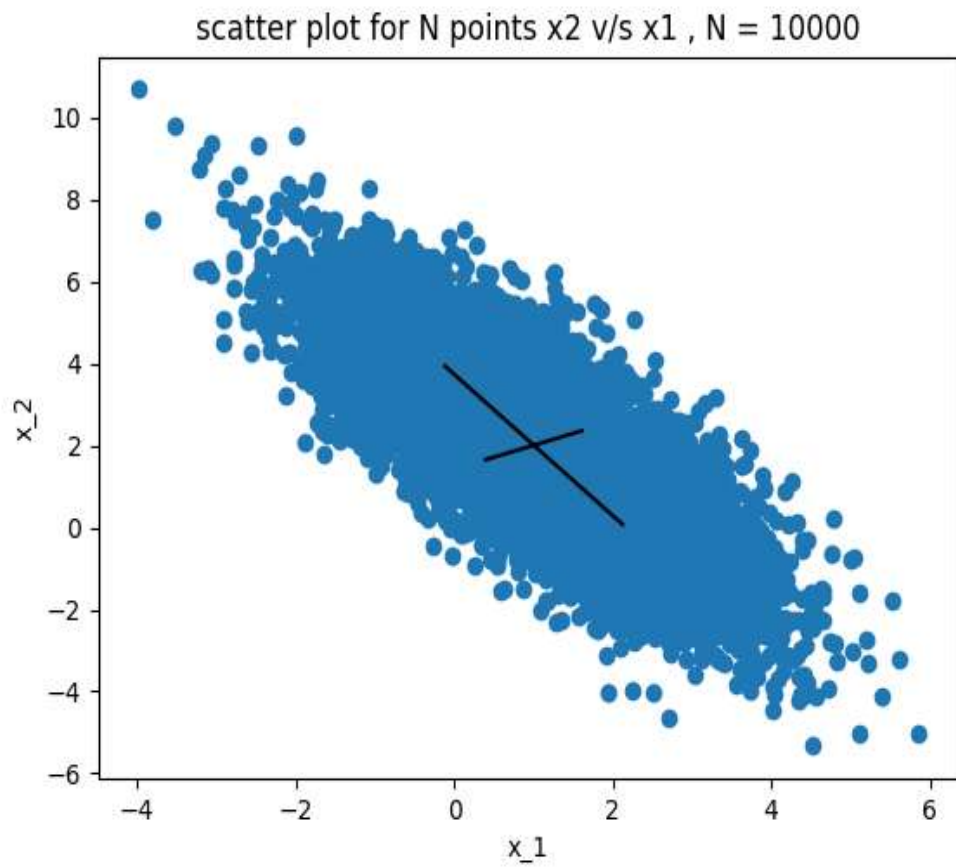
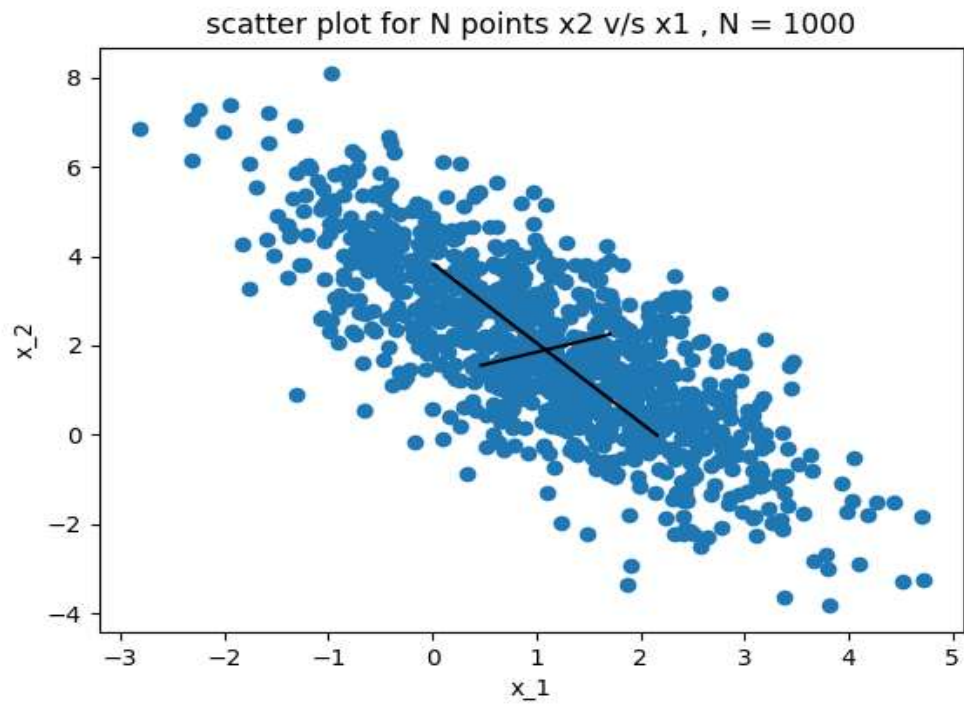


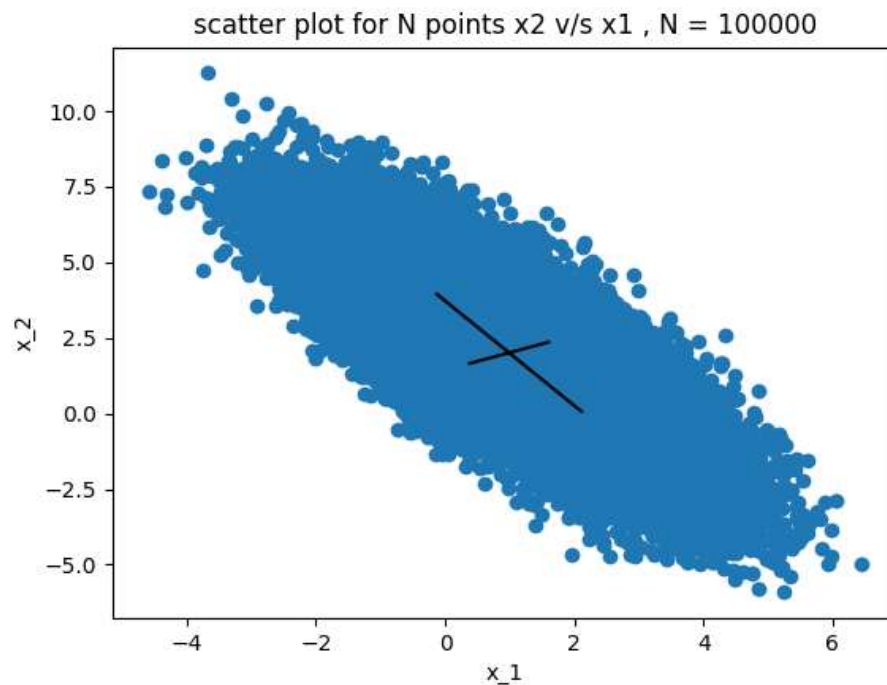
As we can see in the graph as said above the difference between the estimate and true mean gets reduced as  $N$  tends to move as 10, 100, 1000, 10000, 100000.

### **Question 2.4:**

For each value of  $N$ , for a single data sample, within a single figure, plot the 2D scatter plot of the generated data and show the principal modes of variation of the data by plotting a line starting at the empirical mean and going a distance equal to the empirical eigenvalue along a direction given by the empirical eigen-vector.







- Didn't use a for loop for change of N as to store the data of the error into a separate array so that boxplot can work properly.
- As N gets to large values such as  $10^4$  it takes time to generate picture and the same with the box plot.

Instructions to run the code :-

Please move to the Q2 directory and

- `python3 ./code/q2.py` will run the python script q2.py, the program will plot and show the plots one by one (exit the current graph to view the next one)