

4.

Dataset of Hand-Written images of digits  
60,000 examples.

each example  $\rightarrow$   $28 \times 28$  matrix.

\* Convert Integer datatype - float32

(i) Calculated the mean for each cell in the  $28 \times 28$  matrix i.e 784 cells from the 60,000 samples for each digit from 0-9. So, there will be a 2D-array of  $784 \times 10$

(ii) Similar to the part (i);  
Calculated the variance for each cell in the  $28 \times 28$  matrix i.e 784 cells from the 60,000 samples for each digit from 0-9. So, there will be a 2D-array of  $784 \times 10$ .

(iii) For every digit 0-9 from the  $784 \times 10$  set calculate the mean, eigen value for each digit and corresponding vector and

store them in the vector.

We will store these values and vectors for each digit 0-9.

- Also in Q4-a.py we are printing all these values to console.

① Q4-b.py code      Figure1 to Figure10 images.

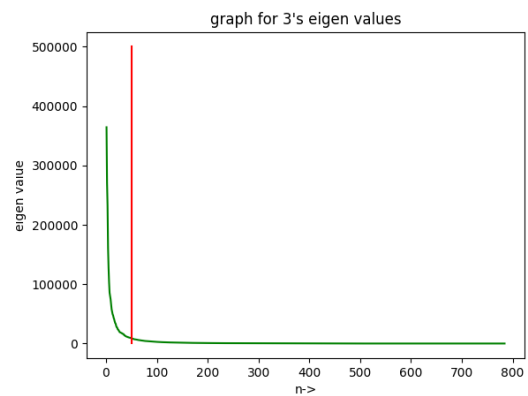
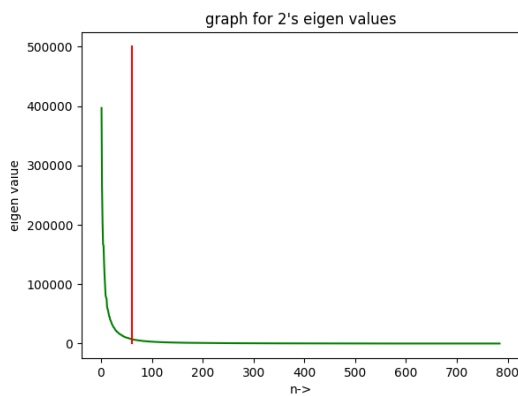
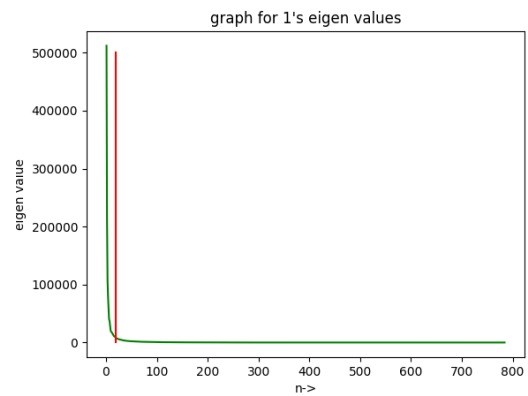
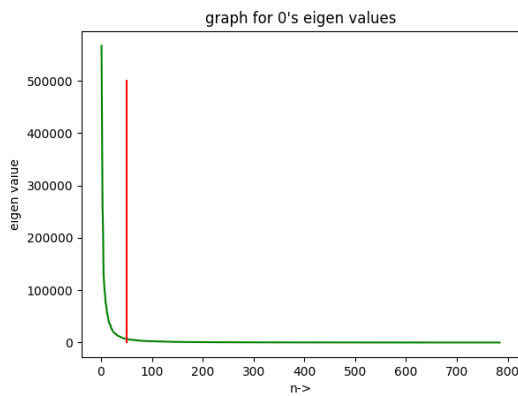
Here  $28^2$  eigenvalues and eigenvectors are calculated for each digit and they are sorted and stored.

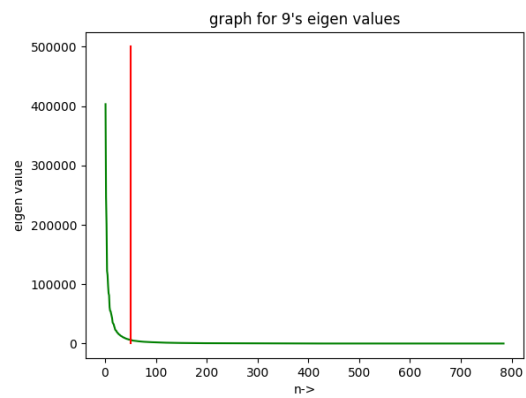
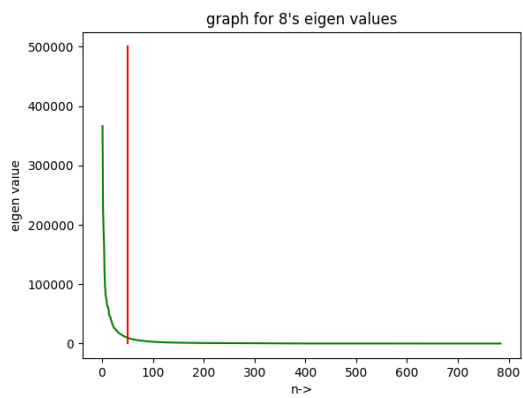
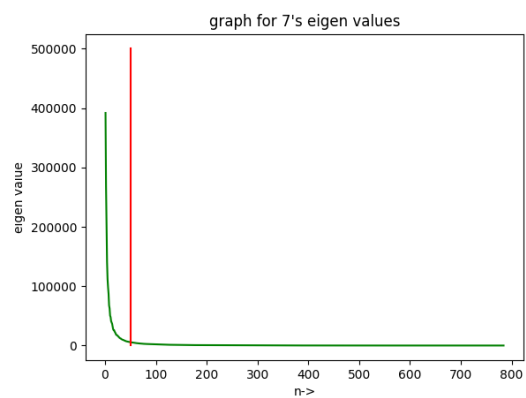
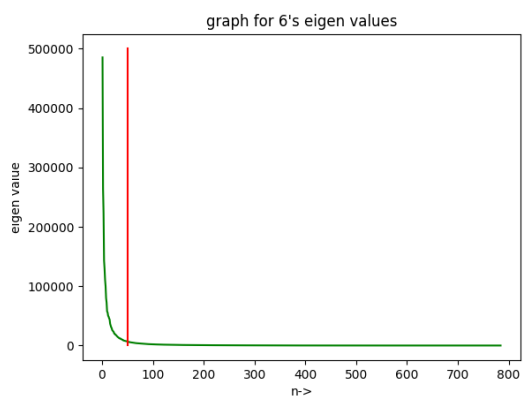
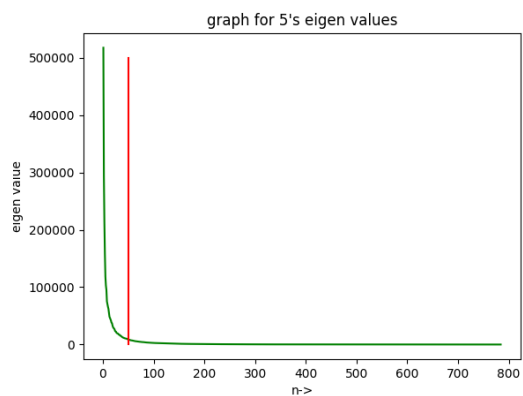
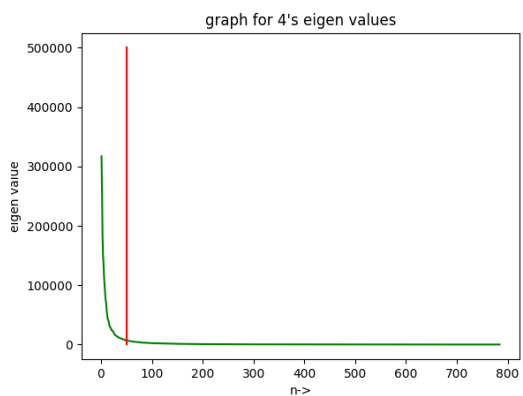
Here from the graph we can see the eigenvalues becomes very less or negligible after a certain extent. These disturbances are most likely caused due to external noise and disturbance. So we can neglect all the eigenvalues after a certain extent of  $N$ .

From the graph we have got some values for each digit 0-9 and also have plotted the graphs from 0-9.

$n_0 = 50$   $n_1 = 20$   $n_2 = 60$   $n_3 = 50$   $n_4 = 50$   
 $n_5 = 50$   $n_6 = 50$   $n_7 = 50$   $n_8 = 50$   $n_9 = 50$   
 APPROXIMATE VAWTS.

## Graphs of Eigen values for digits 0-9





b.

For each digit we will plot 3 images.

$$[x - \sqrt{\lambda_1} v_1 \quad x \quad x + \sqrt{\lambda_1} v_1]$$

\* 10 images are are plotted with all the 3 images plots in the same image side by side for

$$[x - \sqrt{\lambda_1} v_1 \quad x \quad x + \sqrt{\lambda_1} v_1].$$

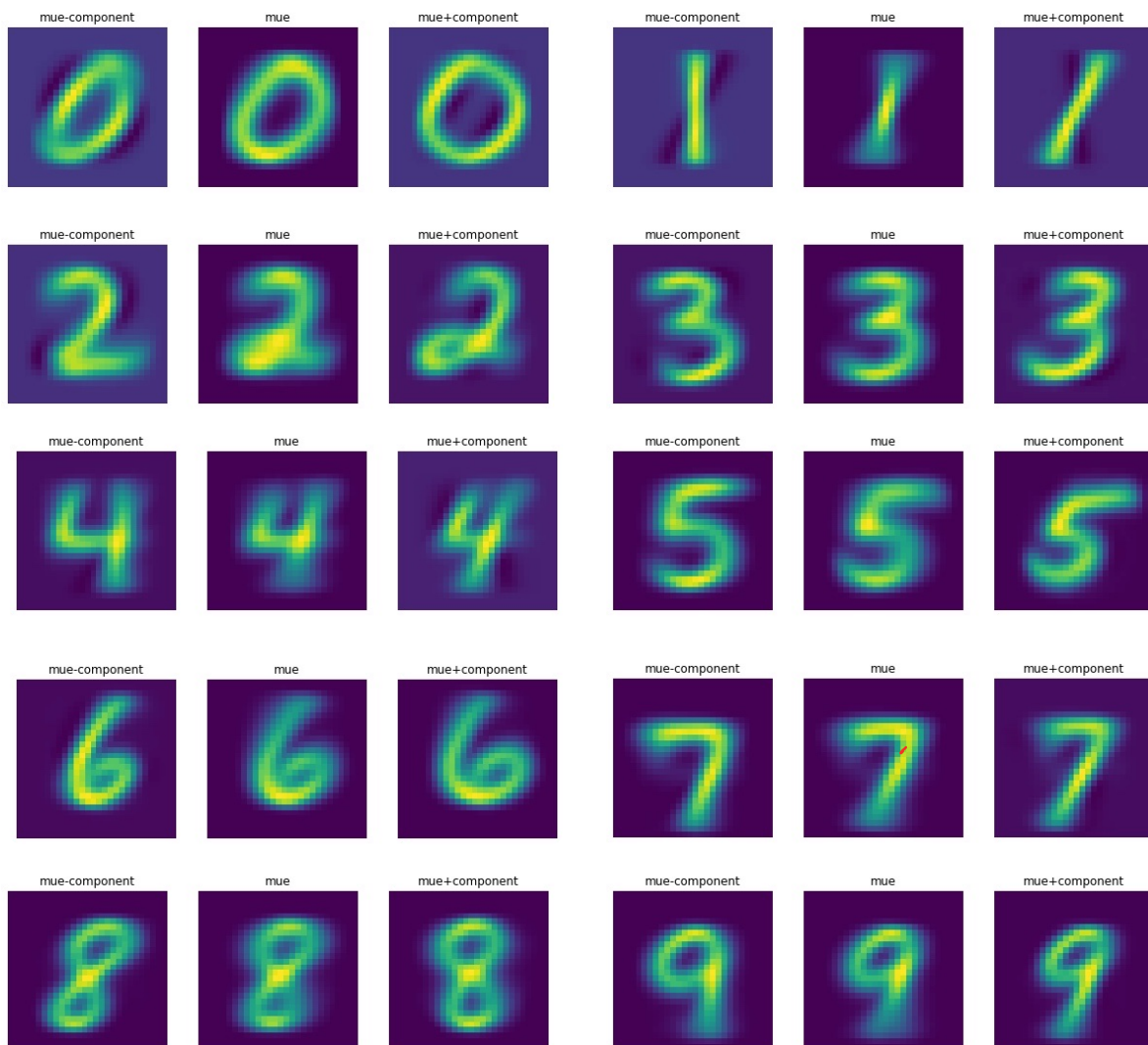
### OBSERVATIONS:

- $x - \sqrt{\lambda_1} v_1$  to  $x + \sqrt{\lambda_1} v_1$  highlights the space where most of the digit examples lie in.
- All the variations in the digit are almost covered in the region of  $x - \sqrt{\lambda_1} v_1$  to  $x + \sqrt{\lambda_1} v_1$ .
- This gives a trend as how most of the users write the numbers.
- Just like how most the matter of gaussian distribution lie  $x - \sigma$  to  $x + \sigma$  similar to that

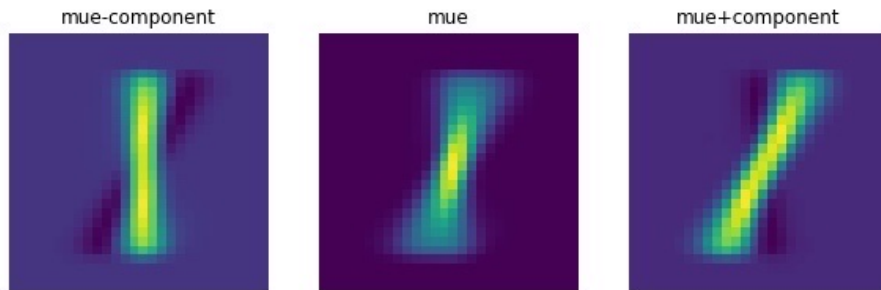
here also most of variation lie  $\mu - \sqrt{\lambda_1} V$  to  $\mu + \sqrt{\lambda_1} V$ .

where  $\sqrt{\lambda_1}$  is like variance.

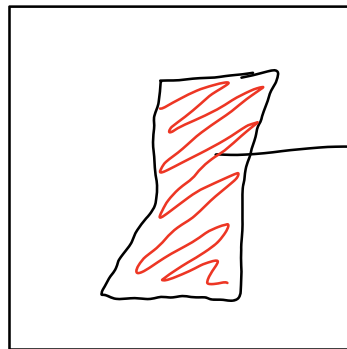
- Because there always is a style to the written numbers, it is not a random process. Though some amount of variations are handled.



## SPECIAL OBSERVATION IN THE CASE OF NUMBER 1:



from the image we can say that  
from el image that



→ This is the region  
where most of styles  
where 1 is written.

And  $\mu + \sqrt{\lambda_1} v$  has the variation of slant  
1 here  
and  $\mu - \sqrt{\lambda_1} v$  has the variation of  
1 written straight.

→ So in the region  $\mu - \sqrt{\lambda_1} v$  to  $\mu + \sqrt{\lambda_1} v$  has all  
the variation from straight to slant.