**NAME: ISHITA GARG** 

**ROLL NUMBER: 102203992** 

**SUB GROUP: CO18** 

# **ELC ASSIGNMENT**

# **Handwritten Digit Recognition**

Following are the results where K varies as [2,4,5,6,7,10] and test size [60:40, 70:30, 75:25, 80:20, 90:10, 95:5].

## **ANALYSIS:-**

**Best Combination:** 

The combination with the highest validation accuracy is Test Size: 0.2 and K: 5, with a validation accuracy of 0.935. This means that when using 20% of the data for testing and 5 for the number of neighbours in the k-nearest neighbours algorithm, the model achieved the highest accuracy on the validation set.

#### Worst Combination:

The combination with the lowest validation accuracy is Test Size: 0.25 and K: 2, with a validation accuracy of 0.921. This means that when using 25% of the data for testing and 2 for the number of neighbours in the k-nearest neighbours algorithm, the model achieved the lowest accuracy on the validation set.

## **Accuracy & Confusion Matrix:-**

```
Test Size: 0.4
                     K: 2
 Validation Accuracy: 0.9167857142857143 Confusion
 Matrix:
[[1596 0
                 3 3 2 5
                               700
                                        1]
                      0 1
    [ 1 1863 3 0
                              002
                                        1]
  [ 27 28 1596 22 7 2 9 12 7 3] [ 8 11 56 1679
  2 22 1 9 11 4] [ 2 35 20 3 1535 3 4 12 2 26]
       [ 13 5 6 100 9 1340 19 7
                                       5 21
  [ 42
            4 16 1 6 24 1518
                                       1 0]
                                  0
       [ 3 29 19 17 31 1 0 1616
                                       1 35]
  [ 18 25 32 71 29 105 6 11 1275 16]
  [ 10 12 9 25 95 13 0 137 11 1384]]
```

```
Test Size: 0.4 K: 4
```

Validation Accuracy: 0.9288095238095239 Confusion

Matrix:

```
[[1587 0 2 4 0 6 13 2 1 2]

[1 1860 3 0 0 1 3 1 1 1]

[18 30 1593 21 9 1 12 15 9 5]
```

```
[ 5 10 29 1682 1 27 2 18 19 10]
```

```
1 34 14 4 1525 6 4 8 2 44] 14
6 5 77 7 1351 25 6 7 8] 29
4 12 3 5 13 1545 0 1 0]
```

1 29 11 8 27 0 0 1619 1 56] [ 14 22 18 41 20 76 4 8 1362 2 3] [ 13 6 8 20 59 6 0 92 12 1480]]

Test Size: 0.4 K: 5

Validation Accuracy: 0.9298214285714286 Confusion

Matrix:

[[1582 2 3 3 0 8 13 2 2 2] [ 0 1857 3 0 0 1 4 1 2 3] [ 16 28 1577 32 11 1 13 16 13 6] [ 5 10 25 1681 2 33 3 18 18 8]

[ 1 32 13 4 1513 5 3 7 4 60]

[11 7 4 65 8 1358 31 5 8 9] [

24 3 12 2 6 15 1550 0 0 0] [ 2 28 8 6 30

0 0 1601 1 76]

[ 13 19 18 38 17 64 5 9 1382 23]

[ 11 7 8 19 45 6 0 68 12 1520]]

Test Size: 0.4 K: 6

Validation Accuracy: 0.9272619047619047 Confusion

Matrix:

[[1584 0 3 3 0 8 14 2 1 2]

[01858 2001422 2]

[ 22 29 1576 30 8 1 14 15 11 7]

[79291676230317228]

[ 1 35 15 4 1513 8 4 5 3 54] [ 12 9 3 70

8 1360 28 4 6 6]

 $[\ 31\ 3\ 12\ 3\ 5\ 14\ 1542\ 0\ 2\ 0]\ [\ 1\ 35\ 7\ 7\ 26\ 0\ 0$ 

1609 1 66]

[ 16 22 16 43 20 72 7 8 1362 2 2]

[ 11 9 7 24 50 4 0 83 10 1498]]

```
Test Size: 0.4
                   K: 7
 Validation Accuracy: 0.9273809523809524 Confusion
 Matrix:
[[1580 2
               3 4 1
                           7 14 2 2 2]
    0 1856
               200
                          1612
                                      3]
              17 32 1567 35 12 1 14 17 13 5]
    6 10 18 1683 2 30 3 19 23 9]
     1 31 14
                 5 1504 8 6
                                    3 64]
    9 11
            3 62
                    8 1360 31
                               4 9 9]
                    6 17 1552
   20 3 10 2
                                   2 0]
               7 7 24 0 0 1597
     1 33
                                    1 82]
              15 22 17 42 17 71 5 9 1366 2 4]
  [ 12 10 6 23 43 6 0 73 8 1515]]
 Test Size: 0.4
               K: 10 Validation
 Accuracy: 0.925
Confusion Matrix:
[[1585 1
                   2 3 2 7 13 3 1 0]
                   20026113]
  [ 0 1856
  [ 18 39 1563 31 12 0 15 16 12 7]
[ 3 14 24 1669 2 28 3 21 29 10]
[ 1 36 16 3 1498 12 7 5 1 63]
[ 10 11 4 58 8 1360 34 3 7 11] [ 28 3 8 3 4 18
1545 0 3 0]
  [ 1 36 7 4 24 0 0 1600 1 79]
   [ 18 26 14
                   40 18 72 8 9 1360 23]
[ 10 12 7 24 42 5 0 81 11 1504]
Test Size: 0.3
                   K: 2
 Validation Accuracy: 0.921031746031746 Confusion
 Matrix:
[[1217 0
                2 4 1 4
                             700
                                      1]
                                      0]
  [ 0 1363
               3 0 0 1
                             1 1 1
```

[ 15 20 1171 18 6 2 5 8

5 2]

```
[ 4 6 37 1283 1 18
                        1883]
   [ 1 21 17 4 1132 3
                           3 10 2 22]
  [74372
                   6 1016 12 6 3 3]
[31
        2 11 1 5 15 1151
                               [0\ 0\ 0]
    [ 3 21 13 10 19 1 0 1229
                                 1 29]
[ 12 14 18 51 19 83 4 6 980 10]
[ 9 7 7 18 66 9 0 99 9 1063]]
```

Test Size: 0.3 K: 4

Validation Accuracy: 0.9315079365079365 Confusion

Matrix:

```
[[1214 0 2 1 0 5 10 2 0 2]
 [ 0 1361
               3001211
  10 17 1165 18 5 1 8 13 8 7] 2 7 23 1280 0
  17 2 16 16 6]
      0 21 14 4 1128 3 3
                            7 0 35]
  7 3 2 52 7 1026 19
                           5 5 6]
  25 3 7 3
               3 8 1165 0
                              2 0]
   1 19 9 6 17 0 0 1229
                              1 44]
  8 10 13 30 16 60 4 4 1037 15]
```

9 5 6 14 44 4 0 64 9 1132]]

Test Size: 0.3 K: 5 Validation

Accuracy: 0.932063492063492 Confusion

Matrix:

[[1207 0 3 3 0 6 12 2 1 2]

[ 0 1359 3 0 0 1 2 1 2 2]

[ 9 18 1162 21 5 0 9 12 9 7]

[26191280021217166]

[ 0 20 14 3 1122 2 2 6 2 44]

[ 8 6 2 44 6 1027 22 4 6 7] [ 19

3 6 2 5 10 117 1 0 0 0]

[ 1 20 9 5 17 0 0 1213 1 60]

[ 6 9 12 24 15 54 4 5 1051 17]

[94 6 15 30 6 0 55 10 1152]]

Test Size: 0.3 K: 6

```
Validation Accuracy: 0.9301587301587302 Confusion
Matrix:
[[1206 0 3 2 0 8 13 2 0 2]
                                    1]
 [ 0 1361
                 2011211
 [ 10 20 1157 23 5 1 10 13 8 5]
 [ 3 5 20 1280 0 22 2 17 15 5]
 [ 0 21 14 3 1123 5 2 6 2 39]
                     6 1031 18 4 5 6]
    [85247
[ 22
         3 8 3 4 10 1165 0 1 0]
     [ 1 23 8 4 15 0
                           0 1220 1 54]
 [ 9 11 11 27 16 56 4 4 1042 17]
            7 6 17 40 3 0 61 7 1135]]
 [ 11
```

Test Size: 0.3 K: 7

Validation Accuracy: 0.92888888888889 Confusion

Matrix:

19 3 7 2 491170 0 2 0]

```
6 4 17 0 0 1212
   2 23
                                     1 61]
   8 10 12 28 14 61 4 6 1037 17]
                    5 17 28 4 0 54 7 1155]]
  11 6
Test Size: 0.3 K: 10 Validation
Accuracy: 0.9280952380952381 Confusion
Matrix:
[[1209 0 2 2 1 6 13 2 0 1]
 [ 0 1358
                 2012411
                                    1]
[ 7 23 1152 26 7 0 10 12 9 6]
[ 2 10 18 1275 1 17 2 18 19 7]
    [ 0 21 11 3 1113 7
                                  5 7 1 47]
          2 48 5 1022 23 3 5 9] [ 23 2 5
3 4 13 1164
                0 2 0]
    [ 1 25 9 3 13 0
                              0 1215 1 59]
[ 9 14 11 24 15 56 5 4 1039 20]
```

K: 2 Test Size: 0.25 Validation Accuracy: 0.9214285714285714 Confusion Matrix: [[1006 0 2 4 1 3 5 0 0 1] 1 1 1 [ 0 1124 2001 [0 [ 14 20 983 13 7 0 6 4 5 1] [ 3 5 31 1056 1 17 1 5 6 3] [ 1 20 15 2 941 2 3 8 2 20] [43 2 60 6 835 14 6 2 2] [ 26 2 8 1 3 12 956 0 0 0] 7 6 10 1 0 1034 1 23] [ 3 18 [ 12 12 17 35 14 67 3 5 841 7] [76 7 14 57 10 0 87 8 899]]

[ 9 8 5 16 29 5 0 61 7 1147]]

Test Size: 0.25 K: 4 Validation

Accuracy: 0.931047619047619 Confusion

Matrix:

[[1003 0 2 1 0 4 8 2 0 2] [ 0 1123 2 0 0 1 2 0 1 1] [ 10 14 981 16 5 1 7 8 7 4]

```
[ 2 6 18 1051 0 17 2 13 13 6]
       0 20 11 2 938 3
                            3 6 1 30]
               1 43 6 840 22 5 4 6]
   20 3 3
               3 2 8 968
                               0 1 0]
    1 15 6 2 10 0
                              0 1032 1 36]
                  7 13 22 17 48 3 4 879 12]
    6 4 6 11 33 3 0 61 10 961]]
                   K: 5
Test Size: 0.25
 Validation Accuracy: 0.9318095238095238
 Confusion Matrix:
[[ 998 0 3 2 0 5 9 2 1
                                   2]
  [ 0 1123
                 2001211
                                    0]
   [ 8 15 978 17
                        5 1 7 9 8 5]
                           0 19 2 18 13 6]
   [ 2 7 14 1047
 [ 0 19 12 2 931 2 3 7 2 36]
 [55138584323437]
  [ 17 3 3 2
                     4 7 972 0 0
                                0]
   [ 1 15 4
                       3 10 0 0 1024 1 45]
      [ 6 7 11 19 13 47 4
                                4 889 13]
   [84
                     6 13 23 4 0 50 8 979]]
Test Size: 0.25
                  K: 6
 Validation Accuracy: 0.928666666666666
 Confusion Matrix:
[[ 998 0 3 1 0 6 10 2 0
                                    2]
                2001211
  [ 0 1123
                                    0]
 [71897619419874][341510500
```

2 931 5 2

6 3 34]

4 5 6]

3 879 15]

3 8 967 0 1 01

6 13 33 4 0 59 7 958]]

Test Size: 0.25 K: 7

20 2 17 12 5]

[ 0 19 12

[19 34 3

[96

[44 138584621

[ 1 19 4 3 12 0 0 1023 1 40] [ 9 9 10 21 14 49 4

```
Validation Accuracy: 0.9282857142857143
 Confusion Matrix:
[[ 996 0 3 1 0 6 11 2 1
                                       2]
  [ 0 1120
                   2012301
                                       1]
  [ 10 18 970 22 4 0 9 7 9 4]
  [ 4 5 13 1051 0 19 2 18 11 5]
  [ 0 17 12 2 920 5 3 9 4 42]
    4 5 1 35 6 846 22 4 4 7]
    17 3 3
                  2 3 7 972
                                 0 1 0]
        184
                          3 13 0 0 1017 1 46]
            10 19 13 53 6 4 877 14]
    9 6 6 1 4 2 3 3 0 5 0 6 9 7 8 ] ]
 Test Size: 0.25
                  K: 10 Validation
 Accuracy: 0.9261904761904762 Confusion
 Matrix:
[[ 999 1 2 1 0 5 10 2 1
                                       1]
        [ 0 1120 2 0 1 2 3 0 1
                                       1]
  [72196823609793]
  [ 2 9 16 1050 1 13 2 16 13 6]
  [ 0 19 10 3 924 7 2 7 2 40]
   [ 5 7
                 1 39 5 840 23 3 3 8]
     [ 16 2 3 3
                     3 10 970 0
                                     1 0]
       [ 1 21 3 3 12 0 0 1016
                                        1 46]
  [ 11 12 10 22 14 48 5 4 871 16]
                      5 14 27 3 0 55 8 967]]
   [88]
                    K: 2
Test Size: 0.2
 Validation Accuracy: 0.9228571428571428
 Confusion Matrix:
 [[809 0 3 0 0 4 4 0 0 1]
  [089410020110]
  [ 12 14 803 8 7 0 5 4 4 1]
  [ 3 5 25 854 0 14 1 4 5 2]
  [ 1 16 9 2 732 2 2 7 1 19]
  [ 5 3 1 45 4 684 12 5 2 1]
  [21 1 8 1 3 9 765 0 0 0]
```

# [ 1 14 5 4 9 1 0 826 1 19] [ 9 8 12 26 11 51 2 4 661 5] [ 6 6 7 14 48 7 0 60 7 724]]

Test Size: 0.2 K: 4

Validation Accuracy: 0.9326190476190476

Confusion Matrix:

[[808 0 2 0 0 4 6 0 0 1]

[089410011011]

[9 10 800 12 6 0 6 5 8 2]

[261385501328104]

[ 0 15 8 2 731 2 3 7 1 22]

[ 4 3 1 36 4 685 16 4 5 4]

[ 17 1 4 2 2 7 774 0 1 0]

0 11 3 2 8 0 0 825 1 30]

6 5 11 16 11 39 2 3 689 7]

6 3 6 10 30 3 0 42 6 773]]

```
Test Size: 0.2
                  K: 5 Validation Accuracy: 0.935 Confusion Matrix:
 [[808 0 2 0 0 4 6 0 0 1]
 [089410011110]
 [6 11 798 13 6 0 7 6 8 3]
 [ 2 7 11 851 0 14 2 13 10 3]
  [ 0 15 8 2 725 2 3 8 1 27]
  [ 5 4 1 29 4 692 17 3 3 4]
  [ 15 1 3 2 3 5 779 0 0 0 ]
 [01123 1000819134]
  [ 5 6 10 11 8 34 3 3 701 8]
  [ 8 3 6 12 19 3 0 35 6 787]]
Test Size: 0.2
                    K: 6
 Validation Accuracy: 0.9314285714285714 Confusion Matrix:
 [[806 0 4 0 0 4 6 0 0 1]
 [089410011110]
 [5 14 797 14 4 0 9 5 7 3]
  [ 2 4 12 850 0 15 2 15 10 3]
  [ 0 16 7 2 727 3 2 6 1 27]
  [ 5 3 1 30 3 691 17 4 4 4]
  [ 18 1 4 2 3 5 774 0 1 0]
  [ 0 14 3 3 11 0 0 819 1 29] [ 6 7 7 13 11 38 2 2 692 11]
  [ 9 5 6 11 25 4 0 40 5 774]]
Test Size: 0.2
                    K: 7
 Validation Accuracy: 0.9314285714285714 Confusion Matrix:
 [[807 0 3 0 0 4 6 0 0 1]
 [089210112011]
 [8 12 794 14 5 0 9 5 9 2]
  [ 2 5 11 847 1 17 2 14 11 3]
  [ 0 14 7 2 722 3 1 8 3 31]
  [ 4 4 1 27 3 693 18 4 4 4]
  [ 15 1 3 2 3 4 779 0 1 0]
  [ 0 13 1 3 11 0 0 814 1 37]
```

[66912941436909]

```
Test Size: 0.2
                K: 10 Validation Accuracy: 0.9263095238095238 Confusion
 Matrix:
 [[806 1 3 0 0 3 7 0 0 1]
 [089110122011]
 [6 16 788 16 9 0 9 5 7 2]
 [ 2 9 11 844 1 13 2 15 13 3]
 [ 0 14 5 2 723 5 1 8 2 31]
 [ 4 4 1 34 3 687 19 3 2 5]
 [ 15 1 4 1 3 7 776 0 1 0]
 [ 0 17 2 3 10 0 0 809 1 38]
 [798149 403368511]
 [86512 2340436772]]
Test Size: 0.1
                  K: 2
 Validation Accuracy: 0.9238095238095239 Confusion Matrix:
 [[383 0 0 0 0 2 2 1 0 1]
 [045600000100]
 [574152503220]
 [2314402070231][0830381112011]
 [2211633447311]
 [ 14 0 3 1 2 4 404 0 0 0]
 [063261039607]
 [82215724133443]
 [ 2 3 2 10 27 3 0 28 4 355]]
Test Size: 0.1
                  K: 4
 Validation Accuracy: 0.9361904761904762 Confusion Matrix:
 [[382 0 0 0 0 2 3 0 0 2]
 [045600001000]
 [344155304241]
 [ 1 3 7 406 0 6 0 3 5 3]
 [0720377114015]
 [2011423478312]
 [11 0 2 2 1 4 408 0 0 0] [0 4 1 1 7 0 0 397 0 11]
 [4226615123674]
```

## [22291520223377]]

```
Test Size: 0.1
                   K: 5
 Validation Accuracy: 0.9378571428571428 Confusion Matrix:
 [[383 0 0 0 0 2 3 0 0 1]
 [045600001000]
 [274108405311][135404070662]
 [ 0 7 3 0 376 1 1 5 0 14] [ 3 1 1 10 2 349 8 2 1 3]
 [902213411000]
 [ 0 4 2 2 7 0 0 394 0 12]
 [5335414133683]
 [ 2 2 2 9 10 2 0 15 4 388]]
 Test Size: 0.1
                K: 6 Validation Accuracy: 0.935952380952381 Confusion
 Matrix:
 [[383 0 0 0 0 2 3 0 0 1]
 [045600001000]
 [264127305321][135406050752]
 [ 0 7 3 0 378 1 1 5 0 12] [ 3 1 1 13 2 345 9 3 1 2]
 [ 12 0 1 2 1 3 409 0 0 0] [ 0 6 2 2 6 0 0 395 0 10]
 [7225416233644]
 [ 2 2 2 7 12 2 0 20 4 383]]
                  K: 7
Test Size: 0.1
 Validation Accuracy: 0.9354761904761905 Confusion Matrix:
 [[383 0 0 0 0 2 3 0 0 1]
 [045500001001]
 [474078405420][135405050852]
 [ 0 6 3 0 375 2 1 6 1 13] [ 2 1 1 12 2 347 9 2 1 3] [ 10 0 2 1 1 3 411 0
 [0\ 0]
 [ 0 5 0 2 7 0 0 397 0 10]
 [6225418223626]
 [2328830183387]]
Test Size: 0.1
                  K: 10
 Validation Accuracy: 0.929047619047619 Confusion Matrix:
 [[382 0 0 0 0 2 4 0 0 1]
 [045400011001]
 [ 3 8 404 10 5 0 6 3 2 0]
```

```
[ 1 5 5 402 0 7 0 7 4 3]
 [0720375314114]
 [21114234610301]
 [ 11 0 2 1 1 2 410 0 1 0] [ 0 7 1 2 8 0 0 388 0 15]
 [6316518223579]
 [ 2 3 1 7 11 2 0 19 5 384]]
Test Size: 0.05
                 K: 2
 Validation Accuracy: 0.9214285714285714 Confusion Matrix:
 [[208 0 0 0 0 0 1 0 0 1]
 [0215000000000]
 [312000203110]
 [128199040010]
 [020018111104][111821796210] [70211219900
0]
[042241020702]
 [3 1 2 10 3 13 1 1 188 1]
 [ 1 2 0 7 13 3 0 14 2 159]]
Test Size: 0.05
                 K: 4
 Validation Accuracy: 0.9323809523809524 Confusion Matrix:
 [[207 0 0 0 0 0 2 0 0 1]
 [021400001000]
 [222010102111]
 [125199040112]
 [020018011105]
 [111811796211]
 [600211202000]
 [031160020506]
 [ 3 0 2 4 2 11 0 1 198 2]
 [ 1 2 0 5 7 1 0 10 2 173]]
Test Size: 0.05
                 K: 5
 Validation Accuracy: 0.9328571428571428 Confusion Matrix:
 [[207 0 0 0 0 0 2 0 0 1]
 [021400001000]
 [132002202100]
 [113201040311][010017911107]
 [211521806112]
```

```
[601211201000]
[032250020208]
 [2133211011982]
 [120562062177]]
Test Size: 0.05
              K: 6
Validation Accuracy: 0.9304761904761905 Confusion Matrix:
[[207 0 0 0 0 0 2 0 0 1]
[021400001000]
[222000103111]
[123199040411][010018111105][21172177211]
 [600211202000]
[ 0 4 2 2 4 0 0 204 0 6]
 [ 3 0 2 3 2 13 1 1 196 2]
 [120562092174]]
Test Size: 0.05
              K: 7
Validation Accuracy: 0.9314285714285714 Confusion Matrix:
[[207 0 0 0 0 0 2 0 0 1]
[021400001000]
[331971203200]
 [123198040511][000018211105]
 [111721787112]
 [601111202000]
 [040260020505]
 [ 3 1 2 3 3 11 0 1 197 2]
 [120652072176]]
Matrix:
[[207 0 0 0 0 0 2 0 0 1]
    [021400001000]
 [231990204100]
 [124199030411]
 [010017921106]
 [111821777202]
 [701111201000]
 [051270020106]
 [1114215011944]
```