

1. Table:

|        | Training Error | Test Error | Validation Error |
|--------|----------------|------------|------------------|
| K = 1  | 0.0            | 0.094      | 0.082            |
| K = 3  | 0.0435         | 0.092      | 0.098            |
| K = 5  | 0.0565         | 0.098      | 0.095            |
| K = 9  | 0.0685         | 0.101      | 0.104            |
| K = 15 | 0.0925         | 0.114      | 0.108            |

Based on the table, when  $K = 1$ , validation error is lowest. So 1NN classifier performs the best on validation data. The test error is 0.094.

2.

|        | Training Error | Test Error | Validation Error |
|--------|----------------|------------|------------------|
| K = 1  | 0.0            | 0.335      | 0.335            |
| K = 3  | 0.1695         | 0.322      | 0.315            |
| K = 5  | 0.195          | 0.31       | 0.312            |
| K = 9  | 0.2285         | 0.309      | 0.309            |
| K = 15 | 0.257          | 0.317      | 0.306            |

Based on the table, when  $k = 15$ , validation error is lowest. So 15NN classifier performs the best on validation data. The test error is 0.257. My program will run faster on projected data with less accuracy.

----- Code -----

```
/*
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 *
 * KNN, K = 1, 5, 9, 15
 */

import java.io.*;
import java.util.*;
import java.lang.Math;

public class KNN {

    // list of list to store each number in one line
    static LinkedList<double[]> trainList;
    static LinkedList<double[]> testList1;
    static LinkedList<double[]> testList2;
    static LinkedList<double[]> testList3;
```

```

    public static void main(String args[]) throws
IOException{

        // get training error

        // read data from pa1train.txt as train points
        //File trainFile = new
File("/Users/Jason/Desktop/151pa1/151pa1/src/pa1train.txt");
        File trainFile = new
File("/Users/Jason/Desktop/151pa1/151pa1/src/projection.txt");
        BufferedReader rtrain = new BufferedReader(new
FileReader(trainFile));

        // read data from pa1train.txt as test points
        File testTrainFile1 = new
File("/Users/Jason/Desktop/151pa1/151pa1/src/pa1train.txt");
        File testTrainFile2 = new
File("/Users/Jason/Desktop/151pa1/151pa1/src/pa1test.txt");
        File testTrainFile3 = new
File("/Users/Jason/Desktop/151pa1/151pa1/src/pa1validate.txt");
        BufferedReader rtest1 = new BufferedReader(new
FileReader(testTrainFile1));
        BufferedReader rtest2 = new BufferedReader(new
FileReader(testTrainFile2));
        BufferedReader rtest3 = new BufferedReader(new
FileReader(testTrainFile3));

        // collect each number in one line
        // for train data
        //eg. tl[0] = {...}, tl[1] = {...}, tl[2] = {...}
        trainList = collectData(rtrain);
        // for test data
        testList1 = collectData(rtest1);
        testList2 = collectData(rtest2);
        testList3 = collectData(rtest3);

        // for part 2
        LinkedList<double[]> pTr;
        LinkedList<double[]> pVa;
        LinkedList<double[]> pTe;
        double [][] Proj = new double[trainList.size()][2];
        for (int i = 0; i < trainList.size(); i++) {
            Proj[i] = trainList.get(i);
        }
        pTr = project(testList1, Proj);

```

```

pVa = project(testList2, Proj);
pTe = project(testList3, Proj);

// set the index of case
// set pq for KNN
//PriorityQueue<Data> KNN;
int err = 0;
int setSize = testList3.size();
int K;
double result;

//---- part 2 -----//
K = 1;
System.out.println("When K = : " + K);
err = getKNN(K, pTr, pVa);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);

K = 3;
System.out.println("When K = : " + K);
err = getKNN(K, pTr, pVa);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);

K = 5;
System.out.println("When K = : " + K);
err = getKNN(K, pTr, pVa);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);

K = 9;
System.out.println("When K = : " + K);
err = getKNN(K, pTr, pVa);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);

K = 15;
System.out.println("When K = : " + K);
err = getKNN(K, pTr, pVa);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);

//----- part 1 -----//

/*

```

```
// for case 1
K = 1;
err = getKNN(K, trainList, testList);
System.out.println("When K = : " + K);
//System.out.println("Error: " + err);
//setSize = trainList.size();
//System.out.println("Size: " + setSize);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);
```

```
// test case: for case 3
K = 3;
// get the error number
err = getKNN(K, trainList, testList);
System.out.println("When K = : " + K);
//System.out.println("Error: " + err);
//setSize = trainList.size();
//System.out.println("Size: " + setSize);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);
```

```
// for case 5
K = 5;
err = getKNN(K, trainList, testList);
System.out.println("When K = : " + K);
//System.out.println("Error: " + err);
//setSize = trainList.size();
//System.out.println("Size: " + setSize);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);
```

```
// for case 9
K = 9;
err = getKNN(K, trainList, testList);
System.out.println("When K = : " + K);
//System.out.println("Error: " + err);
//setSize = trainList.size();
//System.out.println("Size: " + setSize);
result = (double)err / (double)setSize;
System.out.println("Training errors: " + result);
```

```
// for case 15
K = 15;
```

```

        err = getKNN(K, trainList, testList);
        System.out.println("When K = : " + K);
        //System.out.println("Error: " + err);
        //setSize = trainList.size();
        //System.out.println("Size: " + setSize);
        result = (double)err / (double)setSize;
        System.out.println("Training errors: " + result);

        */
    }

    private static LinkedList<double[]>
    project(LinkedList<double[]> testList2, double[][] p2) {
        LinkedList<double[]> p = new LinkedList<double[]>();
        // for each row
        for (double[] row : testList2) {
            // set label
            double label = row[784];
            // save data
            double[] data = new double[row.length-1];
            for (int i = 0; i < row.length - 1; i++){
                data[i] = row[i];
            }
            double[] tmpv = new double[21];
            tmpv[20] = label;
            // project element in two matrix
            for (int i = 0; i < tmpv.length - 1; i++) {
                for (int j = 0; j < data.length - 1; j++) {
                    tmpv[i] += data[j] * p2[j][i];
                }
            }
            p.add(tmpv);
        }

        return p;
    }

    // function for collecting actual data from .txt file
    public static LinkedList<double[]>
    collectData(BufferedReader br) throws IOException{
        // set a return value
        LinkedList<double[]> dataList = new
        LinkedList<double[]>();

        // read one line each time
        String st;

```

```

        while( (st = br.readLine()) != null){
            // set a array to store each number in line
            splited by whitespace
            String snum[] = st.split("\\s");
            // get length of snum
            int numOfNum = snum.length;
            // set a array to store each number in integer
            double[] inum = new double[numOfNum];
            // transfer String to integer
            for( int i = 0; i < numOfNum; i++){
                // transfer
                inum[i] = Double.parseDouble(snum[i]);
            }
            // this line is done, collect all integer data
            dataList.add(inum);
        }
        // return dataList
        return dataList;
    } // collectData done

    // class for pair(distance, label)
    public static class Data implements Comparable<Data>{
        public double getLabel() {
            return label;
        }

        public void setLabel(double label) {
            this.label = label;
        }

        public void setDistance(double distance) {
            this.distance = distance;
        }

        public double getDistance() {
            return distance;
        }

        private double distance;
        private double label;

        public Data( double distance, double label){
            this.distance = distance;
            this.label = label;
        }

        @Override

```

```

        public int compareTo(Data o) {
            // TODO Auto-generated method stub
            return 0;
        }

    }

    static class DataComparator implements
Comparator<Data>{
        public int compare(Data d1, Data d2) {
            if (d1.distance < d2.distance)
                return 1;
            else if (d1.distance > d2.distance)
                return -1;
            return 0;
        }
    }

    // function to get KNN
    public static int getKNN( int K, LinkedList<double[]>
p, LinkedList<double[]> p2){
        // set return value
        PriorityQueue<Data> KNN = new PriorityQueue<Data>(K,
new DataComparator());
        //PriorityQueue<Integer> dis = new
PriorityQueue<Integer>();
        int errNum = 0;

        // calculate the distance
        // for each array element in bList
        for( double btemp[] : p2){
            // set b label
            double blabel = btemp[btemp.length - 1];
            // for each array element in alist
            for( double atemp[] : p){
                // calculate distance and add into KNN
                //Integer distance = calDistance(atemp,
btemp);

                //dis.add(distance);
                //Data tmp = calDistance(atemp, btemp);
                double distance = calDistance(atemp,
btemp);

                double label = atemp[atemp.length - 1];
                // if pq < K, add them
                Data data = new Data(distance, label);
                KNN.add(data);
            }
        }
    }

```

```

        // else throw biggest distance
        if ( KNN.size() > K){
            KNN.poll();
        }
    }
    // all lines of btemp done.
    // get the target label
    // because the number of label is fixed
    Integer labelTable[] = { 0, 0, 0, 0, 0, 0, 0, 0,
0, 0, 0 };

    // loop for KNN
    while(KNN.isEmpty() != true){
        int tmpLabel = (int)KNN.poll().label;
        labelTable[tmpLabel]++;
    }
    // check which label is greatest
    int retLabel = 0;
    for(int i = 0; i < labelTable.length; i++){
        if(labelTable[i] >
labelTable[retLabel] ){
            retLabel = i;
        }
    }
    // check error
    if( retLabel != blabel){
        errNum++;
    }
} // for loop ends
// return
return errNum;
}

public static double calDistance(double[] atemp,
double[] btemp) {
    // set return value
    double distance = 0.0;
    //int label = 0;

    for( int i = 0; i < atemp.length - 2; i++){
        //distance += Math.pow((atemp[i] - btemp[i]),
2);
        distance += (atemp[i] - btemp[i]) * (atemp[i]
- btemp[i]);
    }
    // return var
    //label = atemp[atemp.length - 1];
    return distance;
}

```



```
        //Data ret = new Data(distance, label);  
        //return ret;  
        //PriorityQueue<Data> ret = new PriorityQueue<>();  
        //Data var = null;  
        //var.setDistance(distance);  
        //var.setLabel(label);  
        //ret.add(var);  
        //return ret;  
    }  
}
```