## Part 1

### Write your own KNN code without using any pack

```
myKnn = function(traindata, testdata, Ytrain, k = 1){
  Ytest = array(0,dim=nrow(testdata))

for (row in 1:nrow(testdata)) {
  distances = sqrt(rowSums((traindata - testdata[row,])^2))
}
```

As shown on the next page, the student's KNN result is not correct. This is because the calculation for "distances" is not correct.

```
traindata = matrix(1:8, 4, 2)
testdata = matrix(1:4, 2, 2)
traindata
testdata[1, 3]
traindata - testdata[1,]

# instead one should use
t(t(traindata) -testdata[1,])
```

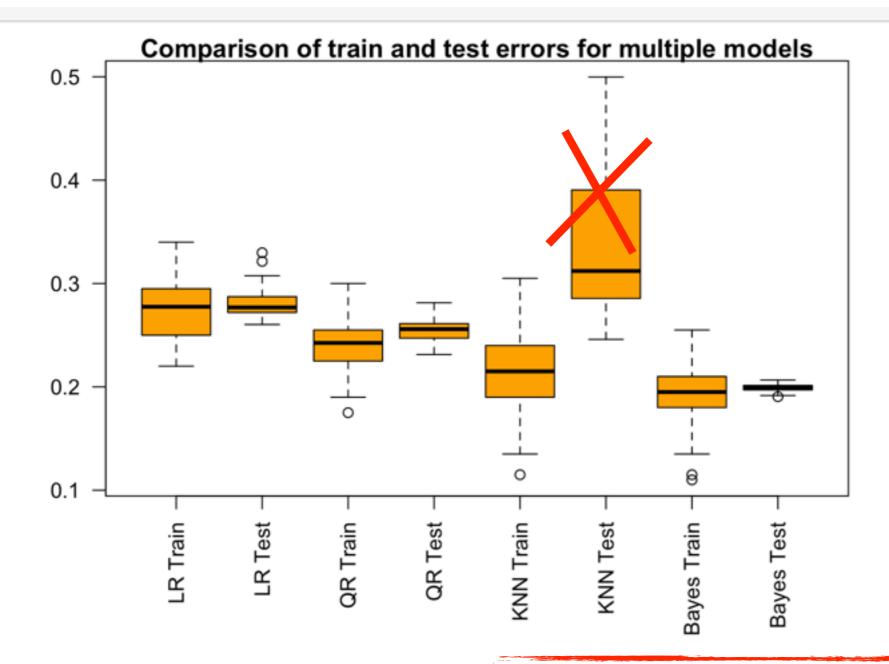
# Test your code with mydata when K = 1, 3, 5; compare your results with from the R command knn.

```
library(class)
test.pred = knn(traindata, testdata, Ytrain, k = 1)
table(Ytest, test.pred)
      test.pred
## Ytest
      0 3589 1411
      1 1334 3666
test.pred = myKnn(traindata, testdata, Ytrain, k = 1)
table(Ytest, test.pred)
                                               This assignment DOES NOT ask
                                               students to just DUMP their results
      test.pred
## Ytest
                                               in the report and leave us to GUESS
      0 1179 3821
                                               what their results mean.
      1 973 4027
test.pred = knn(traindata, testdata, Ytrain, k = 3)
                                               Apparently the results do not
table(Ytest, test.pred)
                                               match, and the student should say
                                               something in the report.
      test.pred
## Ytest
      0 3642 1358
##
      1 1076 3924
```

```
library(class)
calc error rate <- function(predicted.value, true.value){</pre>
return(mean(true.value!=predicted.value))
cvKNNAveErrorRate = function(K, traindata, Ytrain) {
 foldNum = 10
 n = nrow(traindata)
                                                      No wonder the box plot (on the next
 foldSize = floor(n/foldNum)
                                                      page) looks so weird.
 error = 0
 myIndex = sample(1 : n)
 for(runId in 1:foldNum){
    testSetIndex = ((runId-1)*foldSize + 1):(ifelse(runId == foldNum, n, runId
   testSetIndex = myIndex[testSetIndex]
    trainX = traindata[-testSetIndex, ]
```

```
cvKNN = function(data) {
  foldNum = 10
  n = nrow(data$traindata)
  foldSize = floor(n/foldNum)
  KVector = seq(1, (nrow(data$traindata) - foldSize), 1)
  cvErrorRates = sapply(KVector, cvKNNAveErrorRate, data$traindata,
  result = list()
  bestK = max(KVector[cvErrorRates == min(cvErrorRates)])
  result$bestK = bestK
  result$train error = cvErrorRates[KVector == bestK]
```

This is the CV error NOT the training error. Run knn with bestK on the training data, and compute the corresponding error.



Rotate X-tick label 45 or 60 degree

```
for (i in seq(1, length(k))){
   Ytest_pred = get_assignment(k[i], get_distance(traindata,testdata))
   print(paste("For K =", k[i]))
   print(table(Ytest, Ytest_pred))
   test.pred = knn(traindata, testdata, Ytrain, k = k[i], prob=TRUE)
   print(table(Ytest, test.pred))
   mm = which(attributes(test.pred)$prob == 0.5)
   if (length(mm)>0){
      print(paste(length(mm), "mismatches due to R's kNN distance buffer:"))
      print(mm)
   }
}
```

```
## [1] "For K = 5"

## Ytest_pred

## Ytest 0 1

## 0 4067 933

## 1 687 4313

## test.pred

## Ytest 0 1
```

## [1] 1419 5491

0 4066 934 1 687 4313

## [1] "2 mismatches due to R's kNN distance buffer:"

### Students need to provide

- 1) IDs whose test.pred != Ytest\_pred
- 2) For IDs in 1), whose prob from knn are 0.5

Are there two mismatches in the table shown above? Or you mean 2 potential mismatches...

Hide

table(Ytest, test.pred.k5)

test.pred.k5
Ytest 0 1
0 2939 2061
1 1321 3679

Mismatch due to 0.5 probabilities

Why? How do you know it's due to 0.5 prob?

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attributes(test.pred.k5)\$prob[attributes(test.pred.k5)\$prob == 0.5]

[1] 0.5 0.5

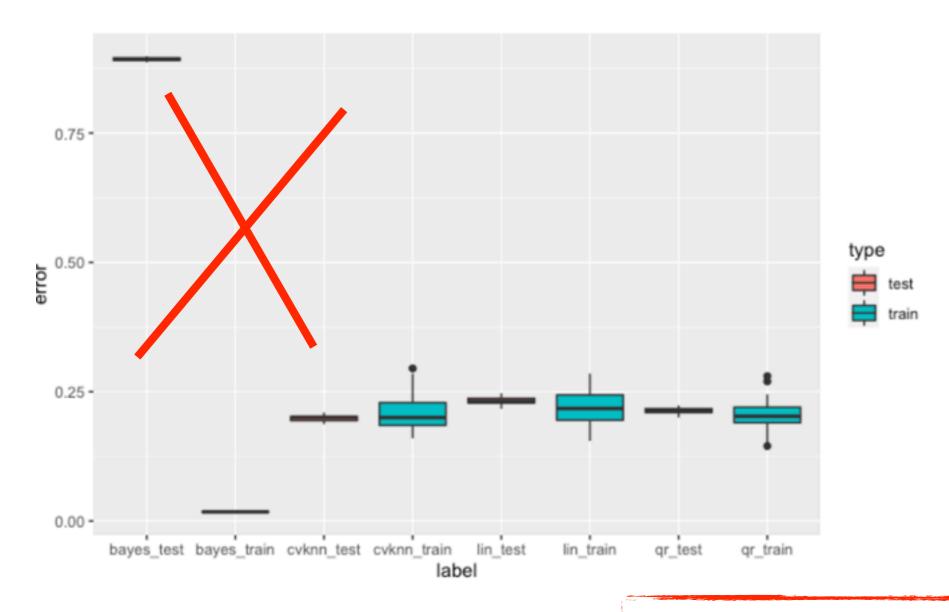
Even if a prediction prob = 0.5, the output from knn could still match with yours.

You have to show that the prediction prob (from knn) of that mismatched test point is equal to 0.5

```
csize = 10
p = 2
s = np.sqrt(float(1)/5)
n = 5000 # training sample for each class
N = 100
```

### Wrong values for n and N

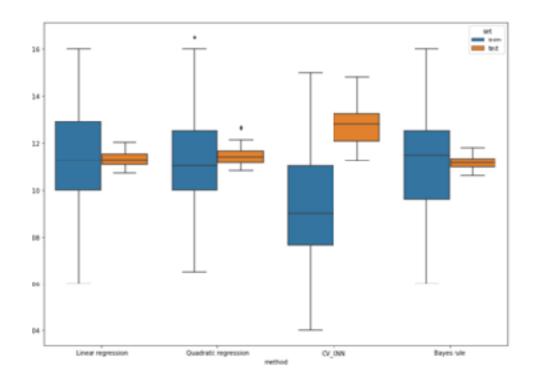
```
cv err = np.array(cv err)
best k idx = np.argmin(cv err.mean(axis=1))
best k = k range[best k idx]
print('selected k = ', best k)
print(f'the mean error of selected k: {cv err[best k idx].mean()}')
print(f'the std error of selected k: {cv err[best k idx].std()}')
selected k = 25
the mean error of selected k: 0.07
                                                            Each procedure should be
the std error of selected k: 0.045825756949558406
                                                            evaluated on the same 50
train error knn = []
                                                            sets of training/test data
test_error_knn = []
for r in range(50):
    X_train, Y_train, X_test, Y_test = generate sim data(center 0, cent
    Y_train_pred = knn_pred(X_train, X_train, Y_train, best_k)
    Y test pred = knn pred(X train, X test, Y train, best k)
                                                             Wrong CVkNN procedure:
                                                             You need to select best_k
                                                             for each r
```

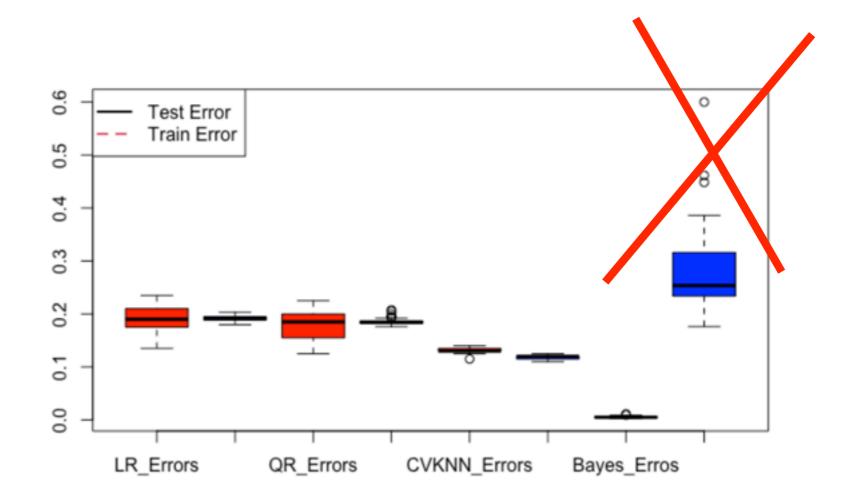


Apparently something is wrong.

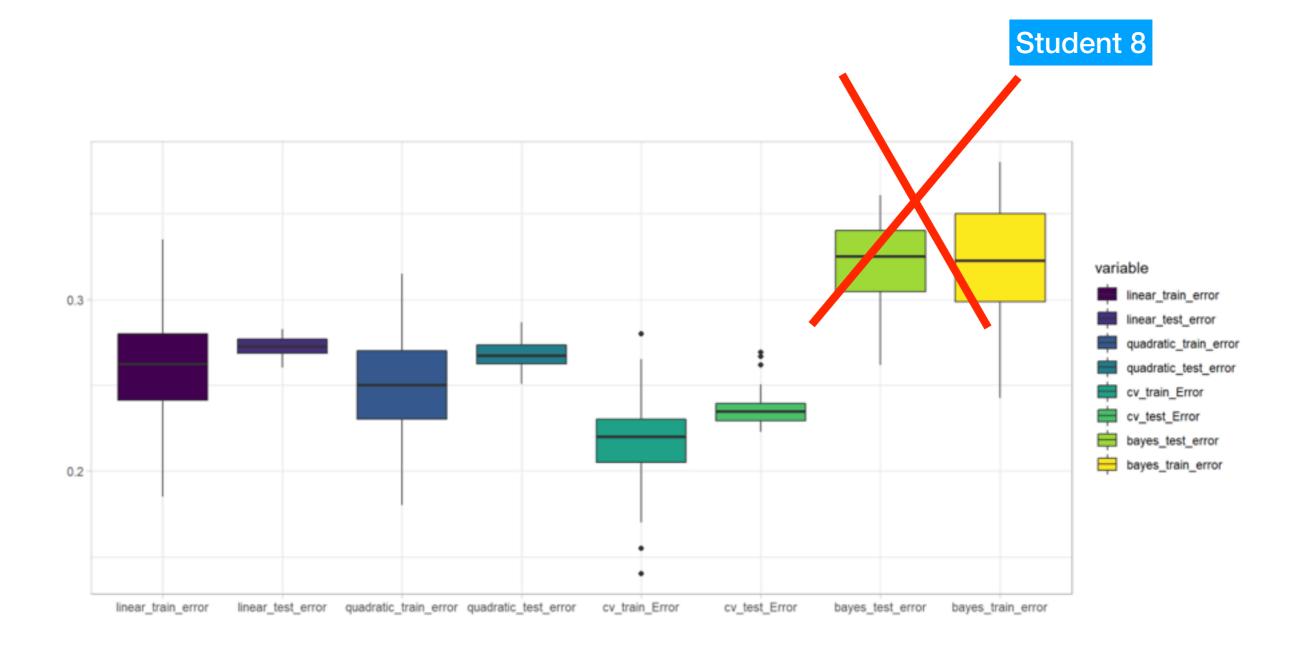
The three k-values, 1, 3, 5, used in Part I has nothing do with cvKNN in part II. No wonder your box plot does not look right.

```
def cvKNN(tr_x, tr_y, nfolds=10, k_vals=[1,3,5]):
    pos_splits = list(split(list(np.where(tr_y == 1)[0]), nfolds))
    neg_splits = list(split(list(np.where(tr_y == 0)[0]), nfolds))
    cv_idxs = [pos_splits[i]+neg_splits[i] for i in range(nfolds)]
```





**Apparently something is wrong.** 



```
Ytest_pred_Bayes = apply(testdata, 1, mixnorm, m1, m0, sqrt(1/5))
Ytest_pred_Bayes = as.numeric(Ytest_pred_Bayes > 1/2)
```

Apparently something is wrong.
The cut-off for mixnorm is NOT 1/2.

Suggest to display the 8 sets of errors in ONE figure.

