Assignment 3

Kevin Gardner

2/28/2022

Following is the link to my GitHub account:

https://github.com/Kgardner22/64060_-kgardner

IMPORT AND PREPARE DATA:

Import the UniversalBank.csv file

```
UniversalBank <- read.table('C:/R/MyData/UniversalBank.csv', header = T, sep</pre>
= ',')
summary(UniversalBank)
##
         ID
                                   Experience
                                                    Income
                       Age
ZIP.Code
                         :23.00
## Min. : 1
                  Min.
                                 Min.
                                        :-3.0
                                                Min.
                                                      : 8.00
                                                                Min.
9307
## 1st Qu.:1251
                  1st Qu.:35.00
                                 1st Qu.:10.0
                                                1st Qu.: 39.00
                                                                1st
Qu.:91911
## Median :2500
                  Median :45.00
                                 Median :20.0
                                                Median : 64.00
                                                                Median
:93437
## Mean
                         :45.34
                                        :20.1
                                                      : 73.77
                                                                Mean
          :2500
                  Mean
                                 Mean
                                                Mean
:93153
## 3rd Qu.:3750
                  3rd Qu.:55.00
                                 3rd Qu.:30.0
                                                3rd Qu.: 98.00
                                                                3rd
Qu.:94608
                         :67.00
                                        :43.0
                                                      :224.00
## Max.
          :5000
                  Max.
                                 Max.
                                                Max.
                                                                Max.
:96651
##
       Family
                       CCAvg
                                     Education
                                                     Mortgage
## Min.
          :1.000
                   Min.
                          : 0.000
                                   Min.
                                          :1.000
                                                  Min. : 0.0
## 1st Qu.:1.000
                   1st Qu.: 0.700
                                   1st Qu.:1.000
                                                   1st Qu.: 0.0
## Median :2.000
                   Median : 1.500
                                   Median :2.000
                                                   Median : 0.0
## Mean
          :2.396
                         : 1.938
                                        :1.881
                                                         : 56.5
                   Mean
                                   Mean
                                                  Mean
## 3rd Qu.:3.000
                   3rd Qu.: 2.500
                                   3rd Qu.:3.000
                                                   3rd Qu.:101.0
```

```
##
    Max.
                    Max.
                            :10.000
           :4.000
                                      Max. :3.000
                                                       Max.
                                                              :635.0
##
                    Securities.Account
                                                              Online
    Personal.Loan
                                          CD.Account
                                               :0.0000
##
   Min.
           :0.000
                    Min.
                            :0.0000
                                        Min.
                                                          Min.
                                                                 :0.0000
##
    1st Qu.:0.000
                    1st Qu.:0.0000
                                        1st Qu.:0.0000
                                                          1st Qu.:0.0000
##
   Median :0.000
                    Median :0.0000
                                        Median :0.0000
                                                          Median :1.0000
##
    Mean
           :0.096
                    Mean
                            :0.1044
                                        Mean
                                                :0.0604
                                                          Mean
                                                                 :0.5968
##
    3rd Ou.:0.000
                    3rd Ou.:0.0000
                                        3rd Qu.:0.0000
                                                          3rd Ou.:1.0000
##
    Max.
           :1.000
                    Max.
                            :1.0000
                                        Max.
                                               :1.0000
                                                          Max.
                                                                 :1.0000
##
      CreditCard
##
   Min.
           :0.000
##
    1st Qu.:0.000
   Median:0.000
##
##
    Mean
           :0.294
##
    3rd Qu.:1.000
   Max. :1.000
##
```

Create a copy of the original data file to preserve

```
Original_File <- UniversalBank
```

Load required libraries

```
library(caret)
## Loading required package: ggplot2
## Loading required package: lattice
library(reshape2) #used for melt() and dcast();
## Warning: package 'reshape2' was built under R version 4.1.2
library(e1071) #used for naiveBayes();
```

Prepare the data by converting predictor and target variable to factors

```
UniversalBank$CreditCard=as.factor(UniversalBank$CreditCard)
UniversalBank$Online=as.factor(UniversalBank$Online)
UniversalBank$Personal.Loan=as.factor(UniversalBank$Personal.Loan)
summary(UniversalBank)
                                      Experience
##
          ID
                        Age
                                                       Income
ZIP.Code
## Min.
               1
                   Min.
                          :23.00
                                   Min.
                                           :-3.0
                                                   Min.
                                                             8.00
                                                                     Min.
9307
                   1st Qu.:35.00
                                    1st Qu.:10.0
                                                   1st Qu.: 39.00
## 1st Qu.:1251
                                                                     1st
Qu.:91911
## Median :2500
                   Median :45.00
                                    Median :20.0
                                                   Median : 64.00
                                                                     Median
:93437
## Mean
           :2500
                          :45.34
                                           :20.1
                                                           : 73.77
                   Mean
                                    Mean
                                                   Mean
                                                                     Mean
:93153
```

```
## 3rd Ou.:3750
                   3rd Qu.:55.00
                                   3rd Qu.:30.0
                                                   3rd Qu.: 98.00
                                                                    3rd
Qu.:94608
## Max.
                          :67.00
                                          :43.0
           :5000
                   Max.
                                   Max.
                                                  Max.
                                                          :224.00
                                                                    Max.
:96651
##
        Family
                        CCAvg
                                       Education
                                                         Mortgage
Personal.Loan
## Min.
           :1.000
                    Min.
                           : 0.000
                                     Min.
                                             :1.000
                                                     Min.
                                                                0.0
                                                                      0:4520
   1st Qu.:1.000
                    1st Qu.: 0.700
##
                                     1st Qu.:1.000
                                                      1st Qu.:
                                                                0.0
                                                                      1: 480
## Median :2.000
                    Median : 1.500
                                     Median :2.000
                                                      Median :
                                                                0.0
## Mean
           :2.396
                    Mean
                           : 1.938
                                     Mean
                                             :1.881
                                                     Mean
                                                             : 56.5
## 3rd Qu.:3.000
                    3rd Qu.: 2.500
                                     3rd Qu.:3.000
                                                      3rd Qu.:101.0
## Max.
           :4.000
                    Max.
                           :10.000
                                            :3.000
                                     Max.
                                                     Max.
                                                             :635.0
## Securities.Account
                         CD.Account
                                        Online
                                                 CreditCard
## Min.
           :0.0000
                       Min.
                              :0.0000
                                        0:2016
                                                 0:3530
##
   1st Qu.:0.0000
                       1st Qu.:0.0000
                                        1:2984
                                                 1:1470
## Median :0.0000
                       Median :0.0000
## Mean
           :0.1044
                       Mean
                              :0.0604
##
   3rd Qu.:0.0000
                       3rd Qu.:0.0000
## Max. :1.0000
                       Max.
                              :1.0000
```

We need to divide the data into training (60%) and validation (40%) sets

```
set.seed(64060)

Train_Index <- createDataPartition(UniversalBank$Personal.Loan, p=0.6, list =
FALSE) #60% for train data
Train.df <- UniversalBank[Train_Index,]
Validation.df <- UniversalBank[-Train_Index,] #Remaining 40% for validation
data</pre>
```

REQUIREMENT A:

Create a pivot table for the training data with Online as a column variable, CreditCard as a row variable, and Personal.Loan as a secondary row variable. The values inside the table should convey the count. Use functions melt() and cast(), or function table().

Pivot table created using ftable

```
Table1 <- xtabs(~ CreditCard + Online + Personal.Loan, data=Train.df)</pre>
ftable(Table1)
##
                      Personal.Loan
                                              1
## CreditCard Online
## 0
                                       772
                                             75
               0
##
               1
                                      1152
                                            120
## 1
               0
                                       309
                                             34
                                       479
                                             59
##
```

Optional view of this same pivot table using melt();

```
Table1 Long=melt(Table1, measure.vars=c("No", "Yes"),
variable.name="Personal.Loan", value.name = "value")
Table1_Long
##
     CreditCard Online Personal.Loan value
## 1
                      0
## 2
              1
                      0
                                    0
                                         309
                      1
## 3
              0
                                     0 1152
              1
                      1
                                       479
## 4
                                     0
## 5
              0
                      0
                                     1
                                          75
## 6
              1
                      0
                                     1
                                          34
## 7
              0
                      1
                                     1
                                         120
## 8
                      1
                                     1
                                          59
```

Optional view of this same pivot table using dcast();

```
Table1_Wide = dcast(Table1_Long, CreditCard + Online ~ Personal.Loan,
value.var = "value" )
Table1 Wide
##
     CreditCard Online
                          0
                               1
                     0 772
## 1
                              75
              0
                     1 1152 120
## 2
## 3
              1
                        309
                     0
                              34
## 4
                        479 59
                     1
```

REQUIREMENT B:

Looking at the pivot tables created, what is the probability that this customer will accept the loan offer (Personal.Loan=1)?

```
ftable(Table1)
                      Personal.Loan
                                              1
##
                                         0
## CreditCard Online
## 0
               0
                                      772
                                             75
##
               1
                                     1152 120
## 1
               0
                                      309
                                             34
##
                                      479
                                             59
```

P(Personal.Loan=1 | CreditCard=1, Online=1)

```
((59/(479+59)) = (59/538) = 0.1096654
```

ANSWER: 0.1096654

REQUIREMENT C:

Create two separate pivot tables for the training data. One will have CreditCard (rows) as a function of Personal.Loan (columns) and the other will have Online (rows) as a function of Personal.Loan (columns).

```
table(CreditCard=Train.df$CreditCard, Personal.Loan=Train.df$Personal.Loan)
```

```
Personal.Loan
##
## CreditCard
                 0
                      1
##
           0 1924 195
##
           1 788
                     93
table(Online=Train.df$Online, Personal.Loan=Train.df$Personal.Loan)
##
         Personal.Loan
## Online
             0
                  1
        0 1081 109
##
       1 1631 179
```

REQUIREMENT D:

Compute the following quantities [P(A|B) means "the probability of A given B"]

i. $P(CreditCard=1 \mid Personal.Loan=1) (93/(195+93)) = (93/288) = 0.3229 \#Note: I'm using the CreditCard table above$

ANSWER = 0.3229

ii. $P(Online=1 \mid Personal.Loan=1) (179/(109+179)) = (179/288) = 0.6215 #Note: I'm using the Online table above$

ANSWER = 0.6215

iii. P(Personal.Loan=1) ((195+93)/(1924+788+195+93)) = (288/3000) = 0.096 #Note: I'm using the CreditCard table above

ANSWER = 0.096

iv. P(CreditCard=1 | Personal.Loan=0) (788/(1924+788)) = (788/2712) = 0.2906 #Note: I'm using the CreditCard table above

ANSWER = 0.2906

v. P(Online=1 | Personal.Loan=0) (1631/(1081+1631)) = (1631/2712) = 0.6014 #Note: I'm using the Online table above

ANSWER = 0.6014

vi. P(Personal.Loan=0) ((1924+788)/(1924+788+195+93)) = (2712/3000) = 0.904#Note: I'm using the CreditCard table above

ANSWER = 0.904

REQUIREMENT E: Use the quantities computed above to compute the naive Bayes probability P(Personal.Loan=1 | CreditCard=1, Online=1)

Using the quantities from the tables generated in requirement C, we can compute the Naive Bayes Calculations as follows:

```
 \begin{array}{l} P = ((93/288)(179/288)(288/3000)) \ / \\ (((93/288)(179/288)(288/3000)) + ((788/2712)(1631/2712)(2712/3000))) \ P = \\ (((0.3229167)(0.6215278)(0.096)) \ / \ (((0.3229167)(0.6215278)(0.096)) \ / \\ ((0.2905605)(0.6014012)(0.904))) \ P = 0.0192674 \ / \ (0.0192674 + 0.1579681) \ P = \\ 0.0192674 \ / \ 0.1772355 \ P = 0.1087107 \end{array}
```

ANSWER = 0.1087107

REQUIREMENT F: Compare the value calculated in requirement E with the one obtained from the pivot table in requirement B.

In requirement B, we calculated this as: $P(Personal.Loan=1 \mid CreditCard=1, Online=1)$ ((59/(479+59)) = (59/538) = 0.1096654 This is the Complete (Exact) Bayes Calculation

In requirement E, we calculated this as: P = (0.0192674 / 0.1772355) = 0.1087107 This is the Naive Bayes Calculation as described on page 194 of our textbook.

Which is a more accurate estimate?

ANSWER = The answer of 0.1096654 calculated in requirement B is more accurate. This is the Complete (Exact) Bayes Calculation that we calculated from the pivot tables. It does not make any assumptions as does the Naive Bayes Calculation in requirement E. Naive Bayes (E) assumes conditional independence while Bayes theorum (B) does not. This being said, Naive Bayes can provide a close estimate and typically, this has very little if any impact on the rank order of the output.

REQUIREMENT G: Which of the entries in this table are needed for computing P(Personal.Loan=1 | CreditCard=1, Online=1)?

ANSWER: The entries in the table needed to compute this are the results where CreditCard=1 and Online=1 showing the results of 479 observations for Personal.Loan=0 and 59 observations for Personal.Loan=1. We do not need the other data in the table. We then compute this by taking 59/(479+59) = 0.1096654.

Run naiveBayes on the data. Examine the model output on training data and find the entry that corresponds to P(Personal.Loan=1 | CreditCard=1, Online=1). Compare this to the number you obtained in requirement E.

```
nb.model<-naiveBayes(Personal.Loan~CreditCard+Online, data=Train.df)
To_Predict=data.frame(CreditCard="1", Online="1")
predict(nb.model, To_Predict, type='raw') #type set to raw to get
probabilities;
## 0 1
## [1,] 0.8912894 0.1087106</pre>
```

These results show, given CreditCard=1 and Online=1, the probability of the personal loan being accepted (Personal.Loan=1) is 0.1087106.

The number we calculated in requirement E was 0.1087107

There is a slight difference in these numbers due to rounding.

The niaveBayes model in requirement G computed the same value we manually calculated in requirement E. This Naive Bayes calculation assumes conditional independence while Bayes theorum, calculated in requirement B, does not. Therefore, the Bayes calculation in requirement B (0.1096654) is more accurate. This being said, Naive Bayes can provide a close estimate and typically, this has very little if any impact on the rank order of the output.