Classification

Bishal Neupane

9/17/2022

Source:

https://www.kaggle.com/code/abhpasha/logistic-regression-predicting-rain-in-australia

Importing data

```
df <- read.csv("weatherAUS.csv", header = TRUE)</pre>
```

head(df)

##		Date	Location	MinTemp	MaxTemp	Rainfall	Evapo	ration	Sunsh	ine Wi	indGu	stDir
##	1	12/1/2008	Albury	13.4	22.9	0.6		NA		NA		W
##	2	12/2/2008	Albury	7.4	25.1	0.0		NA		NA		WNW
##	3	12/3/2008	Albury	12.9	25.7	0.0		NA		NA		WSW
##	4	12/4/2008	Albury	9.2	28.0	0.0		NA		NA		NE
##	5	12/5/2008	Albury	17.5	32.3	1.0		NA		NA		W
##	6	12/6/2008	Albury	14.6	29.7	0.2		NA		NA		WNW
##		WindGustSp	peed Windl	Dir9am W	/indDir3pm	WindSpe	ed9am 1	WindSp	eed3pm	Humio	dity9	am
##	1		44	W	WNV	Ī	20		24			71
##	2		44	NNW	WSV	I	4		22			44
##	3		46	W	WSV	I	19		26			38
##	4		24	SE	E		11		9			45
##	5		41	ENE	NV	I	7		20			82
##	6		56	W	V		19		24			55
##		Humidity3p			-			-	-	-	-	
##				007.7	1007.1			ΝA	16.9		1.8	
##				010.6	1007.8			ΝA	17.2		1.3	
##				007.6	1008.7			2	21.0		3.2	
##				017.6	1012.8			ΝA	18.1		5.5	
##				010.8	1006.0		7	8	17.8		9.7	
##	6			009.2	1005.4	· NA	A	ΝA	20.6	28	3.9	
##		RainToday RainTomorrow										
##		No		No								
##		No		No								
##		No		No								
##		No		No								
##		No		No								
##	6	No		No								

#There are alot of column so removing columns with non numeric values.

```
df$Date<- NULL
df$WindGustDir<-NULL
df$WindGustDir <-NULL
df$WindDir3pm <- NULL</pre>
df$WindDir3pm <-NULL
df$Location <-NULL
df$Sunshine <-NULL
df$RainToday <- NULL</pre>
df$WindDir9am <-NULL
df$Evaporation <-NULL
```

Structure of Data Frame

```
str(df)
## 'data.frame': 145460 obs. of 15 variables:
##
   $ MinTemp
                  : num 13.4 7.4 12.9 9.2 17.5 14.6 14.3 7.7 9.7 13.1 ...
## $ MaxTemp
                  : num 22.9 25.1 25.7 28 32.3 29.7 25 26.7 31.9 30.1 ...
## $ Rainfall
                  : num 0.6 0 0 0 1 0.2 0 0 0 1.4 ...
## $ WindGustSpeed: int 44 44 46 24 41 56 50 35 80 28 ...
```

```
## $ WindSpeed9am : int
                        20 4 19 11 7 19 20 6 7 15 ...
## $ WindSpeed3pm : int 24 22 26 9 20 24 24 17 28 11 ...
## $ Humidity9am : int 71 44 38 45 82 55 49 48 42 58 ...
## $ Humidity3pm : int 22 25 30 16 33 23 19 19 9 27 ...
## $ Pressure9am : num 1008 1011 1008 1018 1011 ...
## $ Pressure3pm : num 1007 1008 1009 1013 1006 ...
## $ Cloud9am
                : int 8 NA NA NA 7 NA 1 NA NA NA ...
```

\$ Cloud3pm : int NA NA 2 NA 8 NA NA NA NA NA ... ## \$ Temp9am : num 16.9 17.2 21 18.1 17.8 20.6 18.1 16.3 18.3 20.1 ... ## \$ Temp3pm : num 21.8 24.3 23.2 26.5 29.7 28.9 24.6 25.5 30.2 28.2 ...

\$ RainTomorrow : chr "No" "No" "No" "No" ...

Data Exploration

[5] "WindSpeed9am"

Names of Column

##

```
names(df)
    [1] "MinTemp"
##
                          "MaxTemp"
                                           "Rainfall"
                                                            "WindGustSpeed"
```

"Humidity9am"

"Humidity3pm"

"WindSpeed3pm" ## [9] "Pressure9am" "Pressure3pm" "Cloud9am" "Cloud3pm" ## [13] "Temp9am" "Temp3pm" "RainTomorrow"

Importing Package and using it to Change to factor

```
#install.packages("dplyr")
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
      filter, lag
## The following objects are masked from 'package:base':
##
##
      intersect, setdiff, setequal, union
df <- mutate_if(df, is.character, as.factor)</pre>
Dimensions of df
dim(df)
## [1] 145460
                 15
str(df)
                  145460 obs. of 15 variables:
## 'data.frame':
                  : num 13.4 7.4 12.9 9.2 17.5 14.6 14.3 7.7 9.7 13.1 ...
## $ MinTemp
## $ MaxTemp
                  : num 22.9 25.1 25.7 28 32.3 29.7 25 26.7 31.9 30.1 ...
## $ Rainfall
                  : num 0.6 0 0 0 1 0.2 0 0 0 1.4 ...
## $ WindGustSpeed: int 44 44 46 24 41 56 50 35 80 28 ...
## $ WindSpeed9am : int 20 4 19 11 7 19 20 6 7 15 ...
## $ WindSpeed3pm : int 24 22 26 9 20 24 24 17 28 11 ...
## $ Humidity9am : int
                         71 44 38 45 82 55 49 48 42 58 ...
## $ Humidity3pm : int
                         22 25 30 16 33 23 19 19 9 27 ...
## $ Pressure9am : num 1008 1011 1008 1018 1011 ...
## $ Pressure3pm : num 1007 1008 1009 1013 1006 ...
## $ Cloud9am
                  : int 8 NA NA NA 7 NA 1 NA NA NA ...
## $ Cloud3pm
                  : int NA NA 2 NA 8 NA NA NA NA NA ...
## $ Temp9am
                  : num 16.9 17.2 21 18.1 17.8 20.6 18.1 16.3 18.3 20.1 ...
                  : num 21.8 24.3 23.2 26.5 29.7 28.9 24.6 25.5 30.2 28.2 ...
## $ Temp3pm
## $ RainTomorrow : Factor w/ 2 levels "No", "Yes": 1 1 1 1 1 1 1 1 2 1 ...
Statistics Summary of Each column
summary(df)
```

```
##
       MinTemp
                        MaxTemp
                                         Rainfall
                                                        WindGustSpeed
                            :-4.80
           :-8.50
                                                               : 6.00
##
    Min.
                                             : 0.000
                                                        Min.
                     Min.
                                     Min.
    1st Qu.: 7.60
##
                     1st Qu.:17.90
                                      1st Qu.:
                                                0.000
                                                        1st Qu.: 31.00
    Median :12.00
                     Median :22.60
                                     Median :
                                                0.000
                                                        Median : 39.00
##
           :12.19
##
    Mean
                    Mean
                            :23.22
                                     Mean
                                             : 2.361
                                                        Mean
                                                                : 40.03
    3rd Qu.:16.90
##
                     3rd Qu.:28.20
                                     3rd Qu.: 0.800
                                                        3rd Qu.: 48.00
           :33.90
                            :48.10
                                             :371.000
                                                                :135.00
##
    Max.
                     Max.
                                     Max.
                                                        Max.
    NA's
                     NA's
                                     NA's
                                             :3261
                                                        NA's
##
           :1485
                            :1261
                                                                :10263
##
     WindSpeed9am
                       WindSpeed3pm
                                       Humidity9am
                                                         Humidity3pm
##
    Min.
           : 0.00
                      Min.
                             : 0.00
                                      Min.
                                              : 0.00
                                                        Min.
                                                                : 0.00
    1st Qu.: 7.00
                      1st Qu.:13.00
                                      1st Qu.: 57.00
                                                        1st Qu.: 37.00
    Median : 13.00
                      Median :19.00
                                      Median: 70.00
                                                        Median : 52.00
##
           : 14.04
                             :18.66
                                                               : 51.54
##
    Mean
                                      Mean
                                              : 68.88
                                                        Mean
                      Mean
    3rd Qu.: 19.00
                                      3rd Qu.: 83.00
                                                        3rd Qu.: 66.00
##
                      3rd Qu.:24.00
##
    Max.
           :130.00
                             :87.00
                                              :100.00
                                                        Max.
                                                                :100.00
                      Max.
                                      Max.
##
    NA's
           :1767
                      NA's
                             :3062
                                      NA's
                                              :2654
                                                        NA's
                                                                :4507
##
    Pressure9am
                      Pressure3pm
                                           Cloud9am
                                                            Cloud3pm
##
   Min.
           : 980.5
                      Min.
                             : 977.1
                                       Min.
                                               :0.00
                                                                :0.00
                                                        Min.
                                       1st Qu.:1.00
##
    1st Qu.:1012.9
                      1st Qu.:1010.4
                                                        1st Qu.:2.00
##
    Median :1017.6
                      Median :1015.2
                                       Median:5.00
                                                        Median:5.00
##
    Mean
           :1017.6
                      Mean
                             :1015.3
                                       Mean
                                               :4.45
                                                        Mean
                                                                :4.51
##
    3rd Qu.:1022.4
                      3rd Qu.:1020.0
                                        3rd Qu.:7.00
                                                        3rd Qu.:7.00
##
           :1041.0
                             :1039.6
    Max.
                      Max.
                                       Max.
                                               :9.00
                                                        Max.
                                                                :9.00
    NA's
           :15065
                      NA's
                             :15028
                                       NA's
                                                        NA's
                                                                :59358
##
                                               :55888
##
       Temp9am
                        Temp3pm
                                     RainTomorrow
##
   Min.
           :-7.20
                     Min.
                            :-5.40
                                     No :110316
##
    1st Qu.:12.30
                     1st Qu.:16.60
                                     Yes: 31877
##
   Median :16.70
                    Median :21.10
                                     NA's:
                                             3267
##
           :16.99
                            :21.68
   Mean
                     Mean
##
    3rd Qu.:21.60
                     3rd Qu.:26.40
##
    Max.
           :40.20
                     Max.
                            :46.70
##
    NA's
           :1767
                     NA's
                            :3609
```

Exploring Missing values

```
sum(is.na(df))
```

[1] 182242

Removing the row with target value NA

```
df <- subset(df,RainTomorrow != "NA")</pre>
```

Dimension after removing rows with NA as Rain Tomorrow

```
dim(df)
```

[1] 142193 15

str(df)

```
'data.frame':
                   142193 obs. of 15 variables:
##
   $ MinTemp
                  : num 13.4 7.4 12.9 9.2 17.5 14.6 14.3 7.7 9.7 13.1 ...
   $ MaxTemp
                         22.9 25.1 25.7 28 32.3 29.7 25 26.7 31.9 30.1 ...
##
                  : num
## $ Rainfall
                  : num 0.6 0 0 0 1 0.2 0 0 0 1.4 ...
## $ WindGustSpeed: int 44 44 46 24 41 56 50 35 80 28 ...
                         20 4 19 11 7 19 20 6 7 15 ...
##
   $ WindSpeed9am : int
##
   $ WindSpeed3pm : int
                         24 22 26 9 20 24 24 17 28 11 ...
## $ Humidity9am : int 71 44 38 45 82 55 49 48 42 58 ...
## $ Humidity3pm : int
                         22 25 30 16 33 23 19 19 9 27 ...
## $ Pressure9am : num 1008 1011 1008 1018 1011 ...
## $ Pressure3pm : num 1007 1008 1009 1013 1006 ...
## $ Cloud9am
                 : int 8 NA NA NA 7 NA 1 NA NA NA ...
## $ Cloud3pm
                  : int
                         NA NA 2 NA 8 NA NA NA NA NA ...
                        16.9 17.2 21 18.1 17.8 20.6 18.1 16.3 18.3 20.1 ...
## $ Temp9am
                  : num
## $ Temp3pm
                  : num 21.8 24.3 23.2 26.5 29.7 28.9 24.6 25.5 30.2 28.2 ...
   $ RainTomorrow : Factor w/ 2 levels "No", "Yes": 1 1 1 1 1 1 1 1 2 1 ...
```

Replacing NA's with mean of a column

```
#install.packages('tidyr')
for(i in 1:ncol(df)){
   df[is.na(df[,i]), i] <- mean(df[,i], na.rm = TRUE)
}

## Warning in mean.default(df[, i], na.rm = TRUE): argument is not numeric or
## logical: returning NA</pre>
```

Summary after replacing NA's with mean

summary(df)

```
##
                                                  WindGustSpeed
      MinTemp
                      MaxTemp
                                     Rainfall
##
   Min.
          :-8.50
                  Min.
                          :-4.80
                                        : 0.00
                                                  Min.
                                                        : 6.00
                                  Min.
                                                  1st Qu.: 31.00
##
   1st Qu.: 7.60
                   1st Qu.:17.90
                                  1st Qu.: 0.00
  Median :12.00
                  Median :22.70
                                  Median: 0.00
                                                  Median: 39.00
## Mean
         :12.19
                         :23.23
                                            2.35
                                                  Mean : 39.98
                   Mean
                                  Mean
                                       :
##
   3rd Qu.:16.80
                   3rd Qu.:28.20
                                  3rd Qu.: 0.80
                                                  3rd Qu.: 46.00
##
  Max.
          :33.90
                   Max.
                         :48.10
                                  Max.
                                        :371.00
                                                  Max.
                                                         :135.00
##
    WindSpeed9am WindSpeed3pm
                                 Humidity9am
                                                 Humidity3pm
## Min.
          : 0
                 Min.
                       : 0.00
                                Min. : 0.00
                                                      : 0.00
                                                Min.
                                1st Qu.: 57.00
                                                 1st Qu.: 37.00
##
  1st Qu.: 7
                 1st Qu.:13.00
  Median: 13
                 Median :18.64
                                Median : 70.00
                                                Median: 51.48
         : 14
                                                      : 51.48
## Mean
                 Mean
                      :18.64
                                Mean
                                     : 68.84
                                                Mean
##
   3rd Qu.: 19
                 3rd Qu.:24.00
                                3rd Qu.: 83.00
                                                 3rd Qu.: 65.00
                                                      :100.00
## Max.
         :130
                 Max.
                      :87.00
                                Max.
                                       :100.00
                                                Max.
   Pressure9am
                    Pressure3pm
                                       Cloud9am
                                                      Cloud3pm
## Min. : 980.5 Min.
                          : 977.1 Min.
                                          :0.000
                                                   Min.
                                                          :0.000
```

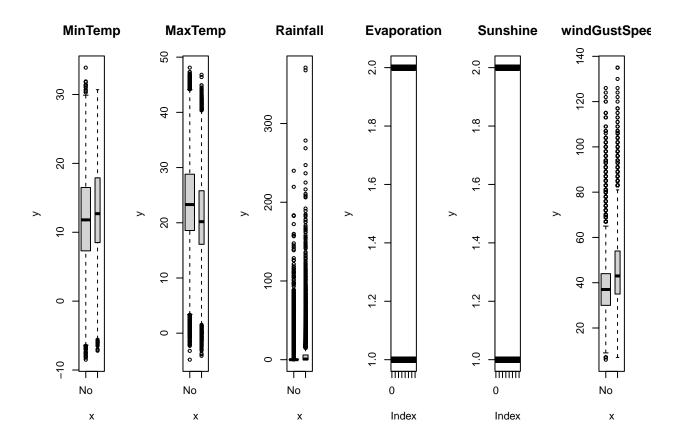
```
## 1st Qu.:1013.5 1st Qu.:1011.0 1st Qu.:3.000
                                              1st Qu.:4.000
## Median :1017.7 Median :1015.3 Median :4.437
                                              Median :4.503
                       :1015.3 Mean :4.437
## Mean :1017.7 Mean
                                              Mean :4.503
## 3rd Qu.:1021.8
                 3rd Qu.:1019.4
                                3rd Qu.:6.000
                                              3rd Qu.:6.000
## Max.
         :1041.0 Max.
                        :1039.6 Max.
                                      :9.000
                                              Max. :9.000
##
      Temp9am
                            RainTomorrow
                   Temp3pm
        :-7.20 Min. :-5.40 No :110316
## Min.
## 1st Qu.:12.30 1st Qu.:16.70
                               Yes: 31877
## Median :16.80 Median :21.30
## Mean
        :16.99 Mean :21.69
## 3rd Qu.:21.50
                 3rd Qu.:26.30
                 Max. :46.70
## Max. :40.20
```

Data Visualization

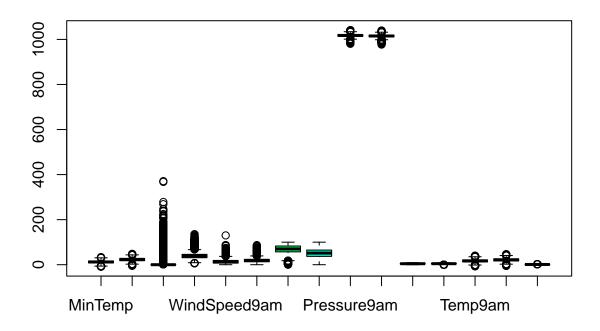
```
par(mfrow=c(1,6))
plot(df$RainTomorrow, df$MinTemp, data=df, main="MinTemp",
varwidth=TRUE)
plot(df$RainTomorrow, df$MaxTemp, data=df, main="MaxTemp", varwidth=TRUE)
plot(df$RainTomorrow, df$Rainfall, data=df, main="Rainfall", varwidth=TRUE)
plot(df$RainTomorrow, df$Evaporation, data=df, main="Evaporation", varwidth=TRUE)
## Warning in plot.window(...): "data" is not a graphical parameter
## Warning in plot.window(...): "varwidth" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "data" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "varwidth" is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "data" is not a
## graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "varwidth" is not a
## graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "data" is not a
## graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "varwidth" is not a
## graphical parameter
## Warning in box(...): "data" is not a graphical parameter
## Warning in box(...): "varwidth" is not a graphical parameter
## Warning in title(...): "data" is not a graphical parameter
## Warning in title(...): "varwidth" is not a graphical parameter
```

```
## Warning in plot.window(...): "data" is not a graphical parameter
## Warning in plot.window(...): "varwidth" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "data" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "varwidth" is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "data" is not a
## graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "varwidth" is not a
## graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "data" is not a
## graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "varwidth" is not a
## graphical parameter
## Warning in box(...): "data" is not a graphical parameter
## Warning in box(...): "varwidth" is not a graphical parameter
## Warning in title(...): "data" is not a graphical parameter
## Warning in title(...): "varwidth" is not a graphical parameter
plot(df$RainTomorrow, df$WindGustSpeed, data=df, main="windGustSpeed",
varwidth=TRUE)
```

plot(df\$RainTomorrow, df\$Sunshine, data=df, main="Sunshine", varwidth=TRUE)



boxplot(df, col = rainbow(ncol(df)))



Model Building (Logistic Regression)

Building Model and getting summary for all of the 15 predictors

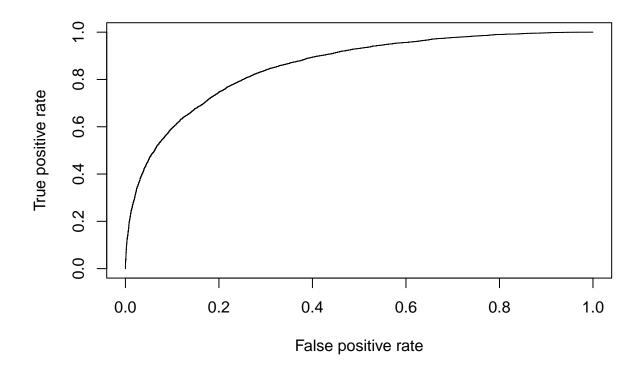
```
set.seed(1234)
i <- sample(1:nrow(df), 0.80*nrow(df), replace=FALSE)</pre>
train <-df[i,]</pre>
test <- df[-i,]</pre>
glm1 <- glm(RainTomorrow~., data=train, family=binomial)</pre>
summary(glm1)
##
## Call:
## glm(formula = RainTomorrow ~ ., family = binomial, data = train)
##
## Deviance Residuals:
##
       Min
                  1Q
                       Median
                                     3Q
                                             Max
## -4.2931 -0.5709 -0.3325 -0.1304
                                          3.2242
##
## Coefficients:
##
                    Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                  56.3125905 1.6039308 35.109 < 2e-16 ***
                  0.0193635 0.0042659
                                         4.539 5.65e-06 ***
## MinTemp
```

```
## MaxTemp
                -0.0461163  0.0052193  -8.836  < 2e-16 ***
## Rainfall
                 0.0227846  0.0012042  18.921  < 2e-16 ***
## WindGustSpeed 0.0544559 0.0009793 55.607 < 2e-16 ***
## WindSpeed9am -0.0103997 0.0013181 -7.890 3.03e-15 ***
## WindSpeed3pm -0.0260557 0.0013288 -19.608 < 2e-16 ***
## Humidity9am
                 0.0069509 0.0008930
                                     7.784 7.05e-15 ***
## Humidity3pm 0.0537375 0.0009197 58.429 < 2e-16 ***
## Pressure9am 0.1069824 0.0049713 21.520 < 2e-16 ***
## Pressure3pm -0.1699806 0.0050141 -33.900 < 2e-16 ***
## Cloud9am
                 0.0417745 0.0051255
                                     8.150 3.63e-16 ***
## Cloud3pm
                 0.1798765 0.0054734 32.864 < 2e-16 ***
## Temp9am
                 0.0120170 0.0060172
                                     1.997 0.04581 *
                 0.0171757 0.0055089 3.118 0.00182 **
## Temp3pm
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 120923 on 113753 degrees of freedom
## Residual deviance: 83519 on 113739 degrees of freedom
## AIC: 83549
##
## Number of Fisher Scoring iterations: 5
```

Prediction and result summary

Predicting Test Set and plotting ROC

```
#install.packages("ROCR")
library(ROCR)
p <- predict(glm1, newdata=test, type="response")
pr <- prediction(p, test$RainTomorrow)
# TPR = sensitivity, FPR=specificity
prf <- performance(pr, measure = "tpr", x.measure = "fpr")
plot(prf)</pre>
```



```
# compute AUC
auc <- performance(pr, measure = "auc")
auc <- auc@y.values[[1]]
print(auc)</pre>
```

[1] 0.8566688

Explaination of Summary

we are using glm() generalized linear function. For the logistic regression, the residuals are deviance residuals. The deviance residual is a mathematical transformation of loss function. The null deviance measures the lack of fit of the model with only intercept while residual deviance measures lack of fit of the entire model. In our case residual deviance is lower than the Null deviance. The Fisher scoring algorithm is a modified form of Newton's method of solving a maximum likelihood problem. In logistic regression, the coefficient quantifies the difference in the log odds of the target variable rather than measuring difference in target variable. ROC curves goes up from 0 to 1 which means that the model is performing pretty well. AUC value is also 0.86

Dimension of Test Case

```
dim(test)
```

[1] 28439 15

Predicting on Test data and print accuracy

```
probs <- predict(glm1, newdata=test, type="response")

pred <- ifelse(probs>0.5, 2, 1)
acc1 <- mean(pred==as.integer(test$RainTomorrow))
print(paste("glm1 accuracy = ", acc1))

## [1] "glm1 accuracy = 0.840219416997785"</pre>
```

Accuracy Explaination:

The accuracy of the model is about 84 percent.

Model Building (Naive Bayes)

Installing package and using it to train

```
#install.packages("e1071")
library(e1071)
nb1 <- naiveBayes(RainTomorrow~., data=train)</pre>
##
## Naive Bayes Classifier for Discrete Predictors
##
## Call:
## naiveBayes.default(x = X, y = Y, laplace = laplace)
## A-priori probabilities:
## Y
##
          No
                    Yes
## 0.7763331 0.2236669
##
## Conditional probabilities:
##
        MinTemp
                       [,2]
## Y
             [,1]
##
    No 11.90616 6.396925
##
     Yes 13.21459 6.319109
##
##
        MaxTemp
## Y
             [,1]
                       [,2]
##
     No 23.84033 7.062661
     Yes 21.16600 6.942200
##
##
        Rainfall
##
## Y
             [,1]
                        [,2]
##
    No 1.284295 5.377816
     Yes 6.032321 14.107786
```

```
##
   {\tt WindGustSpeed}
##
## Y [,1] [,2]
   No 38.38022 12.02649
##
    Yes 45.54337 15.25268
##
##
##
     WindSpeed9am
## Y
    [,1] [,2]
    No 13.57903 8.598428
##
##
    Yes 15.50484 9.594962
##
##
     WindSpeed3pm
## Y [,1] [,2]
##
    No 18.21943 8.393907
##
    Yes 20.05846 9.713400
##
##
      Humidity9am
    [,1] [,2]
## Y
    No 66.24121 18.92812
##
    Yes 77.74624 16.04076
##
##
##
     Humidity3pm
## Y [,1] [,2]
    No 46.61060 18.29663
##
    Yes 68.24655 18.97738
##
##
##
     Pressure9am
## Y
      [,1] [,2]
   No 1018.501 6.429970
##
    Yes 1014.688 7.009321
##
##
     Pressure3pm
## Y
    [,1] [,2]
    No 1016.027 6.380775
##
    Yes 1012.558 7.033430
##
##
##
      Cloud9am
## Y
       [,1] [,2]
    No 4.129147 2.275001
##
##
    Yes 5.511903 1.951483
##
##
     Cloud3pm
## Y [,1] [,2]
##
   No 4.160614 2.067661
    Yes 5.685443 1.792424
##
##
      Temp9am
    [,1] [,2]
## Y
    No 17.08196 6.512454
##
    Yes 16.71863 6.374956
##
##
      Temp3pm
## Y [,1] [,2]
## No 22.39961 6.800710
```

Explaination of Result:

The prior and likelihood is calculated from the training set. The prior is shown in the form of A-priori which is 0.77 and 0.22 in our case. Likelihood is shown as the conditional probability. Each row sums upto one and each shows the likelihood of occurring each events.

```
p2_raw <- predict(nb1, newdata=test, type="raw")
head(p2_raw, n=2)</pre>
```

```
## No Yes
## [1,] 0.9996001 0.000399853
## [2,] 0.9538949 0.046105099
```

Explaination on test

The prediction of test for two rows of test data set is shown above which is 99 percent and 95 percent no.

Comparison of Models:

The result of both models seems to be pretty similar. The ROC of logistic regression shows that the model is pretty good. The accuracy was also almost similar. I have used all of the 15 features for both logistic regression and naive bayes.

Strength of Logistic Regressions:

- 1) Logistic regression is easier to implement, interpret and very efficient to train
- 2) It can easily extend to multiple classes.
- 3) It provides a measure of how appropriate is a predictor.

Weakness of Logistic Regression:

- 1) If number of rows is less than the number of attributes then it will lead to over fitting.
- 2) It can only be used to predict descrete function
- 3) Non linear problems cannot be solved with logistic regression.

Strength of Naive Bayes Classifier:

- 1) It is simple to implement.
- 2) It is very fast because probabilities can be directly calculated without loops.
- 3) It works well with both continuous and discrete data.

Weakness of Naive Bayes Classifier:

- 1) This algorithm assumes that all features are independent which rarely happens in real life.
- 2) It would create problem when the categorical variable is only seen in test dataset. It will assign the zero probability which can create problem to the result.

Explaination of benefits and drawbacks of each Classification metrics used:

1) Accuracy:

Accuracy is the ratio of correctly classified to the total number of rows.

Advantages of Accuracy

- 1) Easy to use, understand and relate.
- 2) Give the proper effectiveness of model if data is balanced.

Drawbacks of Accuracy

- 1) Not as interreptable as confusion matrix
- 2) It doesn't take wrong prediction into consideration

2) Confusion Matrix:

Advantages of Confusion Matrix:

- 1) It specifies for which label model is confused.
- 2) It shows the correct and incorrect prediction.

Disadvantages:

- 1) Checking for over and under fitting is difficult.
- 2) It doesn't give a class probabilities.

3) ROC curves and AUC:

Advantages:

- 1) It shows the graphical representation of accuracy of test
- 2) It allows more complex and more exact measure of accuracy.

Disadvantages:

- 1) Actual decision threshold is not displayed.
- 2) It is not easily interreptable from business prospective.

5) MCC:

Advantages:

1) It accounts for difference in class distribution.