Assignment2- Markdown

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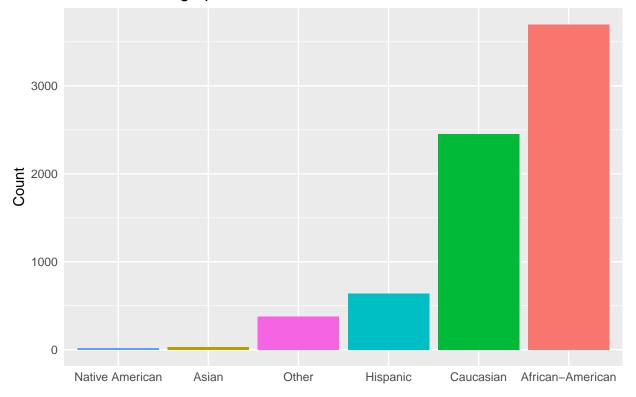
```
library(tidyverse)
library(data.table)
library(DT)
```

data <- fread(input = "D:/Columbia/Spring 2019/Data Science and Public Policy/Data Assignment 2/compas-

Including Plots

```
ggplot(data[, .(count = .N), race], aes(x = reorder(race, count), y=count, fill= race)) +
  geom_bar(stat = "identity") +
  theme(axis.ticks = element_blank(),plot.title = element_text(size = rel(1.2)),
        legend.position="none") +
  labs( x = "",y = "Count",
      title = "Data set Demographics - Race")
```

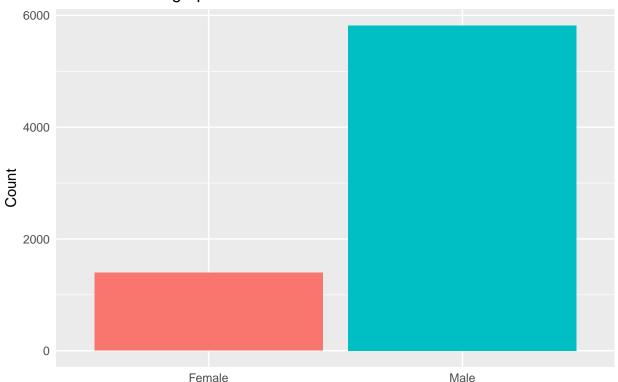
Data set Demographics – Race



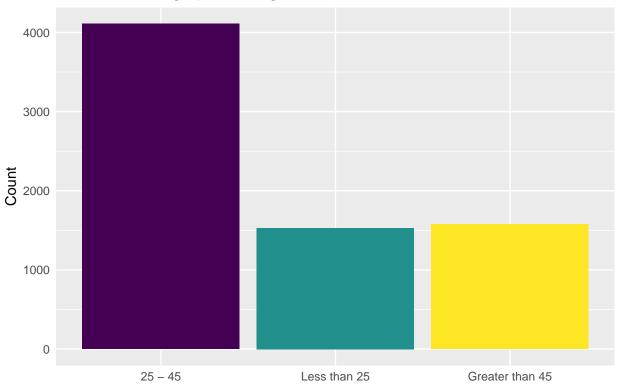
```
ggplot(data[, .(count = .N), sex], aes(x = reorder(sex, count), y=count, fill= sex)) +
  geom_bar(stat = "identity") +
  theme(axis.ticks = element_blank(),plot.title = element_text(size = rel(1.2)),
        legend.position="none") +
```

```
labs( x = "",y = "Count",
     title = "Data set Demographics - Gender")
```

Data set Demographics - Gender







```
data[score_text == "LOW"][.N]

## Empty data.table (0 rows) of 53 cols: id,name,first,last,compas_screening_date,sex...

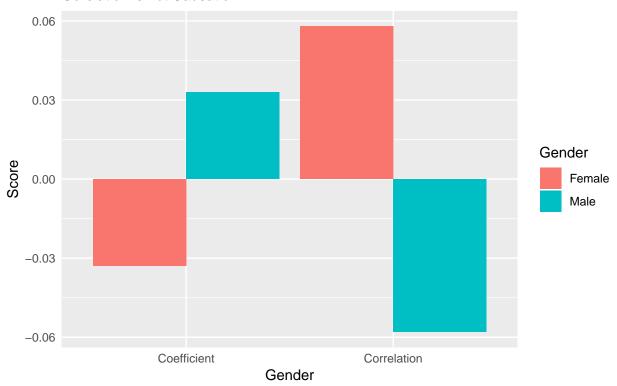
type = c('Correlation','Correlation', 'Coefficient', 'Coefficient')
gender = c('Male','Female', 'Male','Female')
value = c(-0.058, 0.058, 0.033, -0.033)

gender_score <- data.frame( "Analysis Type" = type, "Gender" = gender, "Value" = value)

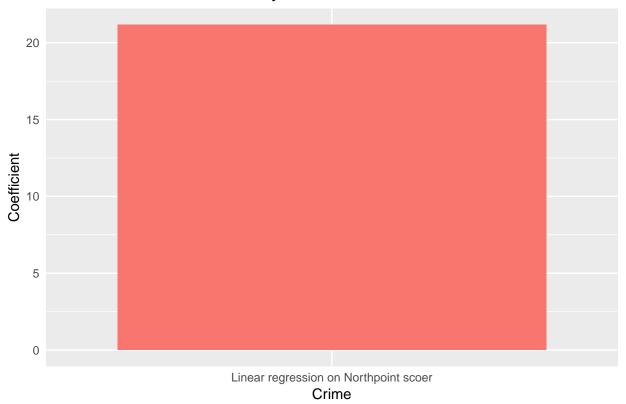
ggplot(gender_score, aes(x = Analysis.Type, y = Value, fill = Gender)) +
    geom_bar(stat = "identity", position = "dodge") +
    theme(axis.ticks = element_blank(),plot.title = element_text(size = rel(1.2))) +
    labs(x = "Gender", y = "Score",
    title = "Correlation vs Regresion Cofficcient ",
    subtitle = "Corelation is not Causation")</pre>
```

Correlation vs Regresion Coffiecient

Corelation is not Causation



Coefficient for Criminal History



This is for Medium High - 1 and Low = 0

OVerall

```
print("Overall")
## [1] "Overall"
TP = data[is_recid == 1 & (score_text == "Medium" | score_text == "High"), .N]
FN = data[is_recid == 1 & score_text == "Low", .N ]
FP = data[is_recid == 0 & (score_text == "Medium" | score_text == "High"), .N]
TN = data[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
P_{value} = c(TP, FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
##
         Type Positive Negative
## 1 Positive
                  2140
                           1177
## 2 Negative
                  1331
                           2566
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.65"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
```

```
## [1] "False Discovery Rate = 0.35"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.34"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.31"
African American
print("Race = African American")
## [1] "Race = African American"
aad = data[race == "African-American"]
TP = aad[is_recid == 1 & (score_text == "Medium" | score_text == "High"), .N]
FN = aad[is recid == 1 & score text == "Low", .N]
FP = aad[is_recid == 0 & (score_text == "Medium" | score_text == "High"), .N]
TN = aad[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
##
         Type Positive Negative
## 1 Positive
                  1445
                            729
## 2 Negative
                   591
                            931
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.64"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.34"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.39"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.44"
Caucasian
print("Race = Caucasian")
## [1] "Race = Caucasian"
cad = data[race == "Caucasian"]
TP = cad[is_recid == 1 & (score_text == "Medium" | score_text == "High"), .N]
FN = cad[is_recid == 1 & score_text == "Low", .N ]
FP = cad[is_recid == 0 & (score_text == "Medium" | score_text == "High"), .N]
TN = cad[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
```

```
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                   523
                            331
## 2 Negative
                   502
                           1098
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.66"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.39"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.31"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.23"
AGE CATEGORY
Less than 25
print("age_cat = Less than 25")
## [1] "age_cat = Less than 25"
low_age = data[age_cat == "Less than 25"]
TP = low_age[is_recid == 1 & (score_text == "Medium" |score_text == "High"), .N]
FN = low_age[is_recid == 1 & score_text == "Low", .N ]
FP = low_age[is_recid == 0 & (score_text == "Medium" | score_text == "High"), .N]
TN = low_age[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                   669
                            330
## 2 Negative
                   244
                            286
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.62"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.33"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.46"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.54"
```

```
25 - 45
print("age_cat = 25 - 45")
## [1] "age_cat = 25 - 45"
med age = data[age cat == "25 - 45"]
TP = med_age[is_recid == 1 & (score_text == "Medium" |score_text == "High"), .N]
FN = med_age[is_recid == 1 & score_text == "Low", .N ]
FP = med_age[is_recid == 0 & (score_text == "Medium" |score_text == "High"), .N]
TN = med_age[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
##
         Type Positive Negative
## 1 Positive
                  1244
                            680
                           1409
## 2 Negative
                   776
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.65"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.35"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.36"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.33"
Greater than 45
print("age_cat = Greater than 45")
## [1] "age_cat = Greater than 45"
high_age = data[age_cat == "Greater than 45"]
TP = high_age[is_recid == 1 & (score_text == "Medium" | score_text == "High"), .N]
FN = high_age[is_recid == 1 & score_text == "Low", .N ]
FP = high_age[is_recid == 0 & (score_text == "Medium" | score_text == "High"), .N]
TN = high_age[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
```

```
## Type Positive Negative
## 1 Positive 227 167
## 2 Negative 311 871
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
```

[1] "Accuracy = 0.70"

```
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.42"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.26"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.16"
Gender
MALE
print("sex = Male")
## [1] "sex = Male"
md = data[sex == "Male"]
TP = md[is_recid == 1 & (score_text == "Medium" | score_text == "High"), .N]
FN = md[is_recid == 1 & score_text == "Low", .N ]
FP = md[is_recid == 0 & (score_text == "Medium" |score_text == "High"), .N]
TN = md[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                  1821
                            905
## 2 Negative
                  1120
                           1973
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.65"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.33"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.36"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.31"
Female
print("sex = Female")
## [1] "sex = Female"
fd = data[sex == "Female"]
TP = fd[is_recid == 1 & (score_text == "Medium" | score_text == "High"), .N]
FN = fd[is recid == 1 & score text == "Low", .N]
FP = fd[is_recid == 0 & (score_text == "Medium" | score_text == "High"), .N]
```

```
TN = fd[is_recid == 0 & score_text == "Low", .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
##
         Type Positive Negative
## 1 Positive
                   319
## 2 Negative
                   211
                            593
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.65"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.46"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.26"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.31"
```

This is for High - 1 and Low, Medium = 0

OVerall

```
print("Overall")
## [1] "Overall"
TP = data[is_recid == 1 & score_text == "High", .N]
FN = data[is_recid == 1 & (score_text == "Medium" |score_text == "Low"), .N]
FP = data[is_recid == 0 & score_text == "High", .N]
TN = data[is_recid == 0 & (score_text == "Medium" | score_text == "Low"), .N]
names = c('Positive', 'Negative')
P_{value} = c(TP, FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                  1041
                            362
                  2430
                           3381
## 2 Negative
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.61"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.26"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.42"
```

```
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.10"
African-American
print("Race = African American")
## [1] "Race = African American"
aad = data[race == "African-American"]
TP = aad[is_recid == 1 & score_text == "High", .N]
FN = aad[is_recid == 1 & (score_text == "Medium" |score_text == "Low"), .N]
FP = aad[is_recid == 0 & score_text == "High", .N]
TN = aad[is_recid == 0 & (score_text == "Medium" |score_text == "Low"), .N]
names = c('Positive', 'Negative')
P_{value} = c(TP, FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                   771
                            254
                  1265
## 2 Negative
                           1406
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.59"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.25"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.47"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.15"
Caucasian
print("Race = Caucasian")
## [1] "Race = Caucasian"
cad = data[race == "Caucasian"]
TP = cad[is recid == 1 & score text == "High", .N]
FN = cad[is_recid == 1 & (score_text == "Medium" | score_text == "Low"), .N]
FP = cad[is_recid == 0 & score_text == "High", .N]
TN = cad[is_recid == 0 & (score_text == "Medium" | score_text == "Low"), .N]
names = c('Positive', 'Negative')
P \text{ value } = c(TP,FN)
N value = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
```

##

Type Positive Negative

```
## 1 Positive
                   201
                             75
## 2 Negative
                   824
                           1354
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.63"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.27"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.38"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.05"
AGE
Less than 25
print("age_cat = Less than 25")
## [1] "age_cat = Less than 25"
low_age = data[age_cat == "Less than 25"]
TP = low_age[is_recid == 1 & score_text == "High", .N]
FN = low_age[is_recid == 1 & (score_text == "Medium" |score_text == "Low"), .N]
FP = low_age[is_recid == 0 & score_text == "High", .N]
TN = low_age[is_recid == 0 & (score_text == "Medium" | score_text == "Low"), .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                   343
                            110
## 2 Negative
                   570
                            506
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.56"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.24"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.53"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.18"
25 - 45
print("age_cat = 25 - 45")
```

```
## [1] "age_cat = 25 - 45"
mid_age = data[age_cat == "25 - 45"]
TP = mid_age[is_recid == 1 & score_text == "High", .N]
FN = mid_age[is_recid == 1 & (score_text == "Medium" | score_text == "Low"), .N ]
FP = mid_age[is_recid == 0 & score_text == "High", .N]
TN = mid_age[is_recid == 0 & (score_text == "Medium" | score_text == "Low"), .N]
names = c('Positive', 'Negative')
P \text{ value } = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                   615
## 2 Negative
                  1405
                           1882
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.61"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.25"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.43"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.10"
Greater than 45
print("age_cat = Greater than 45")
## [1] "age_cat = Greater than 45"
high_age = data[age_cat == "Greater than 45"]
TP = high_age[is_recid == 1 & score_text == "High", .N]
FN = high_age[is_recid == 1 & (score_text == "Medium" | score_text == "Low"), .N]
FP = high_age[is_recid == 0 & score_text == "High", .N]
TN = high_age[is_recid == 0 & (score_text == "Medium" | score_text == "Low"), .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                    83
                             45
## 2 Negative
                   455
                            993
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.68"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.35"
```

```
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.31"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.04"
Gender
MALE
print("sex = Male")
## [1] "sex = Male"
md = data[sex == "Male"]
TP = md[is_recid == 1 & score_text == "High", .N]
FN = md[is_recid == 1 & (score_text == "Medium" |score_text == "Low"), .N]
FP = md[is_recid == 0 & score_text == "High", .N]
TN = md[is_recid == 0 & (score_text == "Medium" | score_text == "Low"), .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
         Type Positive Negative
## 1 Positive
                   921
                            292
## 2 Negative
                  2020
                           2586
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.60"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.24"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.44"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.10"
Female
print("sex = Female")
## [1] "sex = Female"
fd = data[sex == "Female"]
TP = fd[is_recid == 1 & score_text == "High", .N]
FN = fd[is recid == 1 & (score text == "Medium" | score text == "Low"), .N ]
FP = fd[is_recid == 0 & score_text == "High", .N]
TN = fd[is_recid == 0 & (score_text == "Medium" |score_text == "Low"), .N]
names = c('Positive', 'Negative')
P_{value} = c(TP,FN)
```

```
N_{value} = c(FP,TN)
data.frame( "Type" = names, "Positive" = P_value, "Negative" = N_value)
##
         Type Positive Negative
## 1 Positive
                  120
                             70
## 2 Negative
                   410
                            795
print(sprintf("Accuracy = %.2f",round((TP+TN)/(TP+TN+FP+FN),2) ))
## [1] "Accuracy = 0.66"
print(sprintf("False Discovery Rate = %.2f",round((FP)/(TP+FP),2) ))
## [1] "False Discovery Rate = 0.37"
print(sprintf("False Omission Rate = %.2f",round((FN)/(TN+FN),2) ))
## [1] "False Omission Rate = 0.34"
print(sprintf("False Positive Rate = %.2f",round((FP)/(TN+FP),2) ))
## [1] "False Positive Rate = 0.08"
```