Heart Disease Visualization

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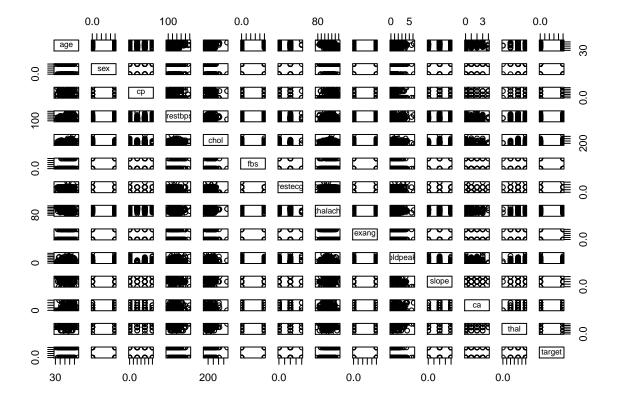
#Background ## The database contains 76 attributes, but all published experiments refer to using a subset of 14 of them, at particular, the Cleveland database is

##Data Description ###age: patients' age ###sex: 1 is male, 2 is female ###cp: chest pain type 4 level ###trestbps: resting blood presure ###chol: serum cholestoral in mg/dl ###fbs: fasting blood sugar >120 mg/dl is value 1 ###restecg: resting electrocardiographic reults (values 0,1,2) ###thalach: maximum heart rate achieved ###exang: exercise incuced angina ###oldpeak: ST depression induced by exercise relative to rest ###slope: the slope of the peak exercise ST segment ###ca: number of major vessels (0-3) colored by flourosopy ###thal: 3 is normal; 6 fixed defect; 7 reversable defect ###target: 1 has heart disease, 0 not

```
data<-read.csv("heart.csv",header = TRUE)
head(data)</pre>
```

```
##
     age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca thal
## 1
                                                                    2.3
                                                                             0
                                                                                 0
      63
            1
               3
                        145
                             233
                                    1
                                             0
                                                    150
                                                             0
                                                                             0
                                                                                 0
                                                                                      2
## 2
      37
            1
               2
                        130
                             250
                                    0
                                             1
                                                    187
                                                             0
                                                                    3.5
## 3
                                             0
                                                                             2
                                                                                 0
                                                                                      2
      41
            0
               1
                        130
                             204
                                    0
                                                    172
                                                             0
                                                                    1.4
## 4
      56
            1
               1
                        120
                             236
                                    0
                                             1
                                                    178
                                                             0
                                                                    0.8
                                                                             2
                                                                                 0
                                                                                      2
## 5
      57
            0
               0
                        120
                             354
                                    0
                                             1
                                                    163
                                                             1
                                                                    0.6
                                                                             2
                                                                                 0
                                                                                      2
                             192
                                                    148
                                                                                      1
## 6
      57
            1
               0
                        140
                                    0
                                             1
                                                             0
                                                                    0.4
                                                                                 0
     target
## 1
           1
## 2
           1
## 3
           1
## 4
           1
## 5
           1
## 6
```

pairs(data) #paris data to see the relationship in numeric values

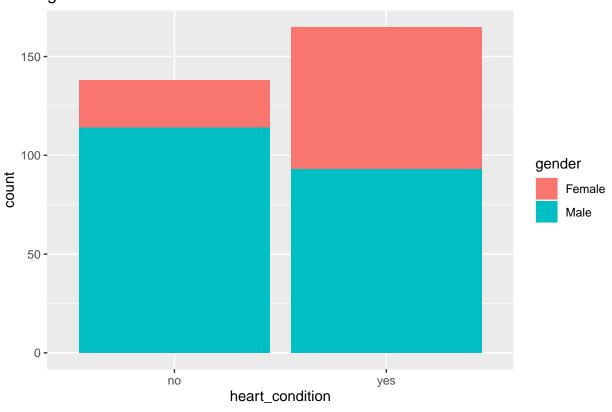


```
library(ggplot2)
library(tidyverse)
## -- Attaching packages -----
                                                    ----- tidyverse 1.3.0 --
## v tibble 3.0.4
                      v dplyr 1.0.2
## v tidyr 1.1.2
                      v stringr 1.4.0
## v readr
           1.4.0
                      v forcats 0.5.0
          0.3.4
## v purrr
## -- Conflicts ------ tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag() masks stats::lag()
library(dplyr)
heart<-data%>%
 mutate(gender= ifelse(sex==1, "Male", "Female"),
        chest_pain_level= ifelse(cp==0, "normal",
                                ifelse(cp==1,"mild",
                                       ifelse(cp==2, "moderate", "severe"))),
        fblood_sugar=ifelse(fbs==1,">120","<=120"),
        rest_electrocardigoraphic= ifelse(restecg==0, "normal",
                                         ifelse(restecg==1, "abnormality", "definite")),
        exercise=ifelse(exang==1, "yes", "no"),
       heart_condition=ifelse(target==1, "yes", "no")) # rebuild the column to the data frame
```

heart%>%

ggplot(aes(heart_condition,fill=gender))+geom_bar()+ggtitle("gender vs heart condition") #data visual

gender vs heart condition

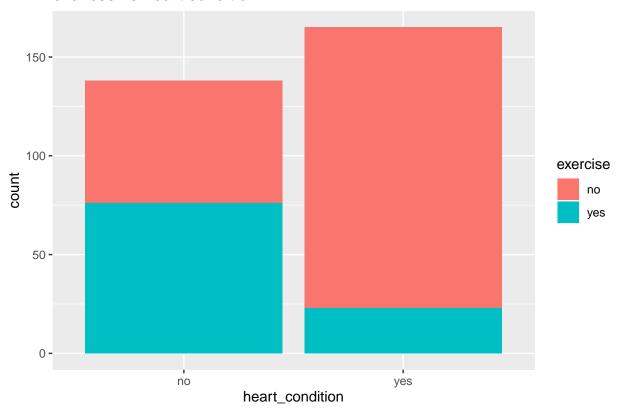


```
heart%>%
group_by(exercise)%>%
summarise(exercise_rate=mean(target))
```

```
## `summarise()` ungrouping output (override with `.groups` argument)
## # A tibble: 2 x 2
## exercise exercise_rate
```

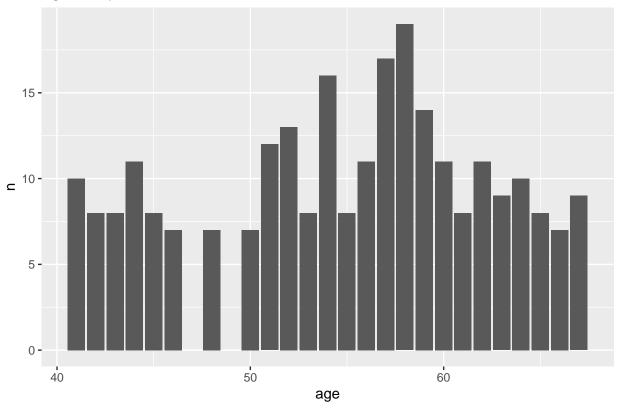
```
heart%>%
ggplot(aes(heart_condition,fill=exercise))+geom_bar()+ggtitle("exercise vs heart condition")
```

exericse vs heart condition



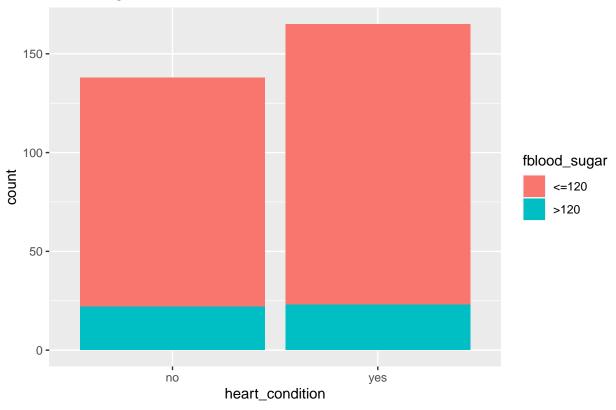
```
heart%>%
  group_by(age)%>%
  count()%>%
  filter(n>5)%>%
  ggplot(aes(age,n))+geom_col()+ggtitle("age analysis") # checking a proportion of heart condition with
```

age analysis



heart%>%
ggplot(aes(heart_condition,fill=fblood_sugar))+geom_bar()+ggtitle("blood_sugar > 120 vs_heart_conditi

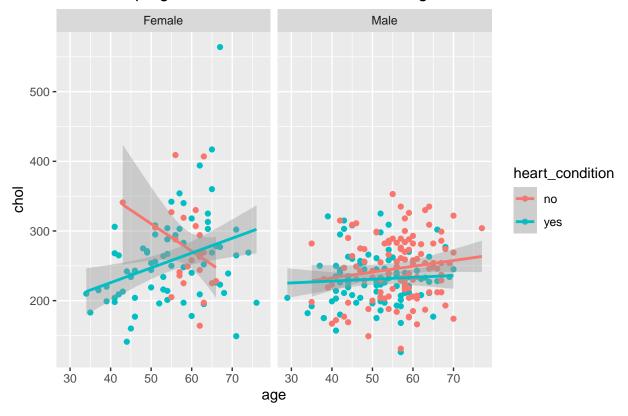
blood sugar > 120 vs heart condition



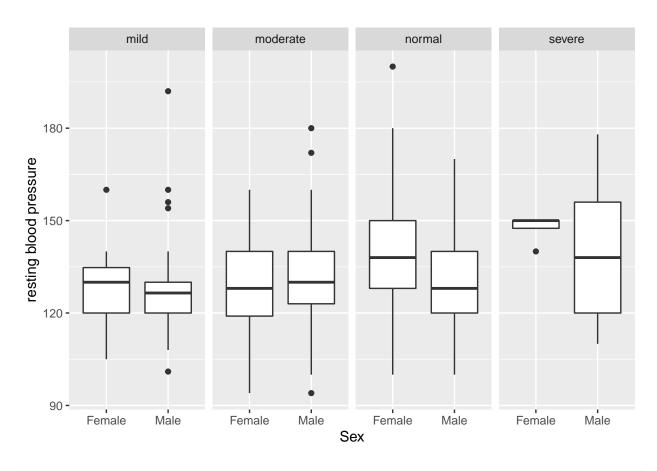
heart%>%
ggplot(aes(x=age,y=chol,color=heart_condition))+geom_point()+geom_smooth(method="lm")+ggtitle("relati

`geom_smooth()` using formula 'y ~ x'

relationship age and chol vs heart_condition in gender



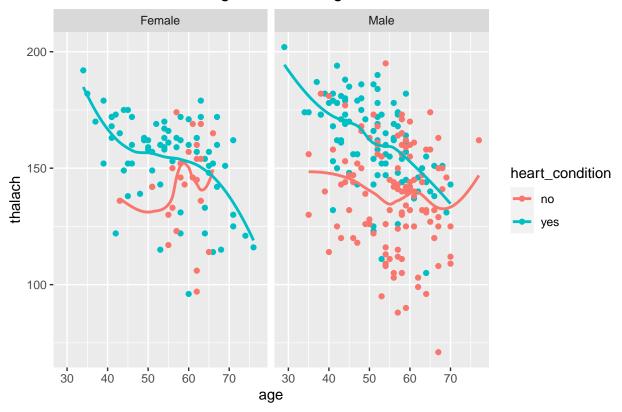
heart%>%
ggplot(aes(gender,trestbps))+geom_boxplot()+xlab("Sex")+ylab("resting blood pressure")+facet_grid(~ch



heart%>%
ggplot(aes(age,thalach,color=heart_condition))+geom_point()+geom_smooth(se=FALSE)+facet_grid(~gender)

$geom_smooth()$ using method = 'loess' and formula 'y ~ x'

maxium heart rate vs gender and target



##Principle Component Analysis

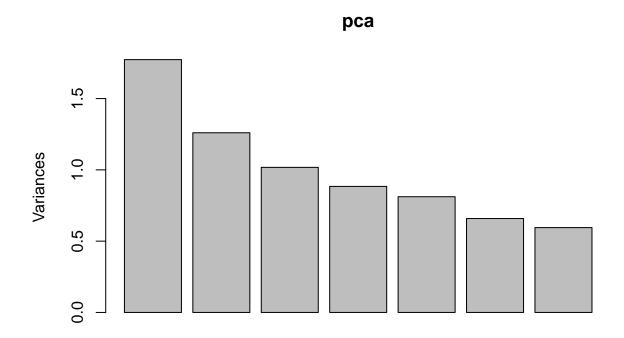
```
pca<-prcomp(heart[,4:10],scale=TRUE)
pca</pre>
```

```
## Standard deviations (1, .., p=7):
## [1] 1.3315929 1.1225306 1.0087031 0.9402348 0.9008774 0.8115652 0.7713909
##
## Rotation (n \times k) = (7 \times 7):
##
                    PC1
                               PC2
                                            PC3
                                                        PC4
                                                                    PC5
                                                                                 PC6
## trestbps -0.2962509
                         0.4836945 -0.28351741
                                                 0.5166899 -0.33164295 -0.41673496
## chol
            -0.1787205 0.4122420 0.61954768 0.3047407
                                                            0.54268445
                                                                         0.15616166
## fbs
            -0.1208119   0.4598572   -0.63005504   -0.3290019
                                                             0.45347280 0.23869262
             0.2092606 \ -0.4497390 \ -0.36233415 \quad 0.6286817 \quad 0.47640056 \ -0.02035216
## restecg
## thalach
             0.5229093 0.3295268 0.03266711 0.1562670 -0.09496291 -0.13444831
            -0.5180609 \ -0.2336930 \quad 0.04786729 \ -0.1924133 \quad 0.27701992 \ -0.61645776
## exang
##
  oldpeak -0.5292331 -0.1384268 -0.06453488 0.2742982 -0.27776514 0.58860905
##
## trestbps 0.217415421
             0.050163486
## chol
            -0.078182227
## fbs
             0.006815801
## restecg
## thalach
            -0.751928923
## exang
            -0.425354114
## oldpeak -0.444670682
```

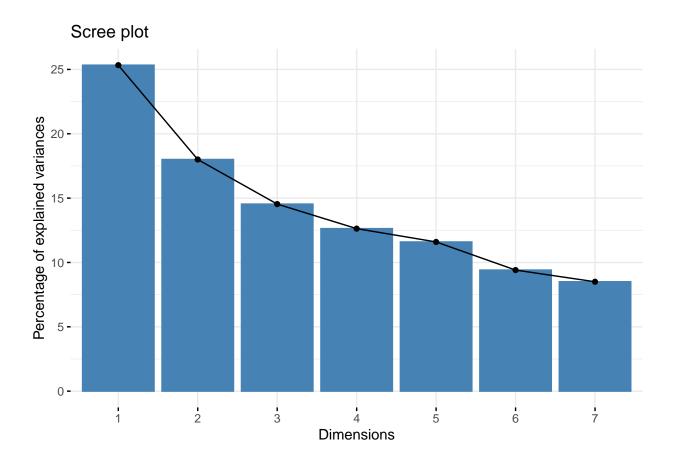
library(factoextra)

Welcome! Want to learn more? See two factoextra-related books at https://goo.gl/ve3WBa

screeplot(pca)



 ${\tt fviz_screeplot(pca)} \ \textit{\#plot the tendency of pricingle component analysis}$

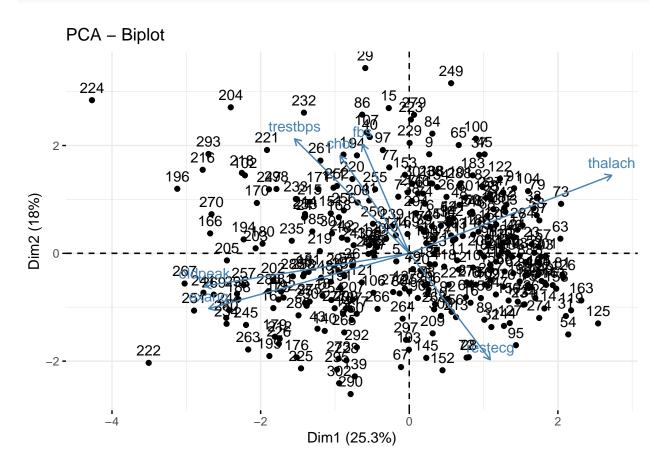


pca\$sdev^2

[1] 1.7731395 1.2600750 1.0174820 0.8840414 0.8115801 0.6586380 0.5950439

pca\$rotation

```
PC1
                                  PC3
##
                        PC2
                                           PC4
                                                     PC5
                                                               PC6
## chol
         -0.1787205  0.4122420  0.61954768  0.3047407  0.54268445
                                                        0.15616166
         -0.1208119   0.4598572   -0.63005504   -0.3290019
                                               0.45347280 0.23869262
## fbs
## restecg
         0.2092606 -0.4497390 -0.36233415 0.6286817 0.47640056 -0.02035216
## thalach
          ## exang
         -0.5180609 \ -0.2336930 \quad 0.04786729 \ -0.1924133 \quad 0.27701992 \ -0.61645776
## oldpeak -0.5292331 -0.1384268 -0.06453488 0.2742982 -0.27776514 0.58860905
## trestbps 0.217415421
## chol
          0.050163486
## fbs
         -0.078182227
## restecg
         0.006815801
## thalach
         -0.751928923
## exang
         -0.425354114
## oldpeak -0.444670682
```



Training set and Test set

```
library(caTools)
set.seed(927)
sample<-sample.split(data$target,SplitRatio=0.70)
train_set<-subset(data,sample==TRUE)
test_set<-subset(data,sample==FALSE)
head(heart,10)</pre>
```

```
age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca thal
##
## 1
                3
                        145
                                                   150
                                                                  2.3
                                                                              0
                                                                                    1
       63
             1
                             233
                                    1
                                            0
                                                            0
                                                                           0
## 2
       37
             1
               2
                        130
                             250
                                    0
                                                   187
                                                                  3.5
                                                                              0
                                                                                    2
                                                                  1.4
                                                                                    2
## 3
       41
             0 1
                        130
                             204
                                    0
                                            0
                                                   172
                                                            0
                                                                           2
                                                                              0
## 4
       56
             1
                        120
                             236
                                    0
                                                   178
                                                                  0.8
                                                                                    2
## 5
       57
            0
               0
                        120
                             354
                                    0
                                                   163
                                                                  0.6
                                                                           2
                                                                              0
                                                                                    2
                                            1
                                                            1
## 6
       57
             1 0
                        140
                             192
                                    0
                                                   148
                                                                  0.4
                                                                                    1
## 7
       56
             0 1
                        140
                             294
                                    0
                                            0
                                                   153
                                                                  1.3
                                                                           1
                                                                              0
                                                                                    2
## 8
       44
             1
                1
                        120
                             263
                                    0
                                                   173
                                                                  0.0
                                                                           2
                                                                              0
                                                                                    3
## 9
       52
             1
                2
                        172
                             199
                                    1
                                            1
                                                   162
                                                                  0.5
                                                                           2
                                                                              0
                                                                                    3
## 10
       57
                        150
                            168
                                    0
                                                   174
                                                                  1.6
                                                                           2
      target gender chest_pain_level fblood_sugar rest_electrocardigoraphic
##
```

```
## 1
               Male
                                              >120
                                                                       normal
                               severe
                                                                  abnormalily
## 2
               Male
                                             <=120
           1
                            moderate
## 3
                                             <=120
                                                                       normal
           1 Female
                                mild
## 4
               Male
                                 mild
                                             <=120
                                                                  abnormalily
                                                                  abnormalily
## 5
           1 Female
                              normal
                                             <=120
## 6
                                             <=120
                                                                  abnormalily
               Male
                              normal
## 7
           1 Female
                                             <=120
                                mild
                                                                       normal
## 8
           1
               Male
                                 mild
                                             <=120
                                                                  abnormalily
## 9
           1
               Male
                            moderate
                                              >120
                                                                  abnormalily
## 10
           1
               Male
                             moderate
                                             <=120
                                                                  abnormalily
##
      exercise heart_condition
## 1
            no
                            yes
## 2
            no
                            yes
## 3
            no
                            yes
## 4
                            yes
            no
## 5
           yes
                            yes
## 6
            no
                            yes
## 7
            no
                            yes
## 8
            no
                            yes
## 9
            no
                            yes
## 10
            nο
                            yes
logistic<-glm(target~.,train_set,</pre>
              family=binomial())
summary(logistic)
##
## Call:
## glm(formula = target ~ ., family = binomial(), data = train_set)
## Deviance Residuals:
                      Median
                                    3Q
       Min
                 1Q
                                            Max
## -2.4446 -0.3966
                      0.1437
                                0.5971
                                         2.5361
## Coefficients:
##
                Estimate Std. Error z value Pr(>|z|)
                           2.911957
                                       0.674 0.50011
## (Intercept) 1.963599
                            0.027706
                                       0.125 0.90023
## age
                0.003474
## sex
               -1.744546
                            0.563229
                                     -3.097 0.00195 **
## cp
                0.982057
                            0.229104
                                       4.287 1.82e-05
## trestbps
               -0.014493
                            0.012554
                                     -1.154 0.24830
## chol
               -0.002281
                            0.004659
                                     -0.490 0.62444
                                     -0.187
## fbs
               -0.124715
                            0.667916
                                              0.85188
## restecg
                0.574945
                            0.420552
                                       1.367
                                              0.17159
## thalach
                0.021966
                            0.012269
                                       1.790
                                              0.07340
               -0.869894
                            0.472047
                                      -1.843
## exang
                                             0.06536
## oldpeak
               -0.612452
                            0.259405
                                      -2.361
                                              0.01823
                0.557911
## slope
                                       1.224
                                             0.22082
                            0.455675
## ca
               -0.852029
                            0.235122
                                     -3.624
                                             0.00029 ***
               -0.918692
                            0.356196 -2.579 0.00990 **
## thal
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
```

```
##
       Null deviance: 292.36 on 211 degrees of freedom
## Residual deviance: 150.91 on 198 degrees of freedom
## AIC: 178.91
## Number of Fisher Scoring iterations: 6
logistic1<-glm(target~sex+cp+thalach+oldpeak+ca+thal,</pre>
               train_set,
               family=binomial())
summary(logistic1)
##
## Call:
## glm(formula = target ~ sex + cp + thalach + oldpeak + ca + thal,
       family = binomial(), data = train_set)
##
## Deviance Residuals:
##
      Min
             1Q Median
                                   3Q
                                           Max
## -2.3901 -0.4855
                    0.1999
                             0.5545
                                        2.4572
##
## Coefficients:
               Estimate Std. Error z value Pr(>|z|)
##
## (Intercept) -0.06097 1.73144 -0.035 0.971910
                           0.47503 -3.138 0.001703 **
## sex
              -1.49045
## cp
               0.99727
                           0.20969
                                    4.756 1.98e-06 ***
## thalach
               0.02621
                           0.01024
                                     2.559 0.010483 *
               -0.83470
                           0.21597 -3.865 0.000111 ***
## oldpeak
## ca
               -0.75831
                           0.21032 -3.605 0.000312 ***
## thal
               -0.97051
                           0.32970 -2.944 0.003244 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
       Null deviance: 292.36 on 211 degrees of freedom
## Residual deviance: 161.50 on 205 degrees of freedom
## AIC: 175.5
## Number of Fisher Scoring iterations: 5
logistic1$coefficients
## (Intercept)
                                           thalach
                       sex
                                                       oldpeak
                                    ср
## -0.06096859 -1.49044986 0.99726987 0.02620721 -0.83469979 -0.75830641
##
          thal
## -0.97050613
pred<-predict(logistic1,test_set,type="response")</pre>
pred_new<-as.data.frame(pred)</pre>
categorise<-function(x){</pre>
 return(ifelse(x>0.5,1,0))
```

```
pred_new<-apply(pred_new,2,categorise)</pre>
head(pred_new, 10)
##
      pred
## 2
         1
## 4
## 6
         1
## 12
## 13
         1
## 15
         1
## 20
         1
## 32
## 34
         1
## 38
         1
library(caret)
## Loading required package: lattice
##
## Attaching package: 'caret'
## The following object is masked from 'package:purrr':
##
##
       lift
confusionMatrix(as.factor(test_set$target),as.factor(pred_new))
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction 0 1
##
            0 32 9
##
            1 4 46
##
##
                  Accuracy : 0.8571
##
                    95% CI: (0.7681, 0.9217)
##
       No Information Rate: 0.6044
       P-Value [Acc > NIR] : 1.294e-07
##
##
##
                     Kappa : 0.7083
##
##
    Mcnemar's Test P-Value: 0.2673
##
##
               Sensitivity: 0.8889
##
               Specificity: 0.8364
##
            Pos Pred Value: 0.7805
            Neg Pred Value : 0.9200
##
##
                Prevalence: 0.3956
            Detection Rate: 0.3516
##
```

```
Detection Prevalence : 0.4505
##
##
         Balanced Accuracy: 0.8626
##
##
          'Positive' Class : 0
##
result<-cbind(test_set,pred_new)</pre>
head(result,10)
##
      age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca thal
       37
            1 2
                      130
                           250
                                 0
                                               187
                                                        0
                                                              3.5
                                                                              2
                                         1
## 4
                                                178
                                                              0.8
                                                                      2
                                                                         0
                                                                              2
       56
            1 1
                      120
                           236
                                 0
                                         1
                                                        0
## 6
       57
            1 0
                      140
                           192
                                 0
                                         1
                                                148
                                                        0
                                                              0.4
                                                                      1
                                                                         0
                                                                              1
## 12 48
           0 2
                           275
                                               139
                                                              0.2
                                                                      2
                                                                         0
                                                                              2
                      130
                                 0
                                         1
                                                        0
## 13
      49
           1 1
                      130
                           266
                                 0
                                         1
                                               171
                                                        0
                                                              0.6
                                                                      2
                                                                              2
           0 3
                                                                      2
## 15
       58
                      150
                           283
                                         0
                                               162
                                                        0
                                                              1.0
                                                                         0
                                                                              2
                                 1
## 20
       69
            0 3
                      140
                           239
                                 0
                                         1
                                               151
                                                        0
                                                              1.8
                                                                      2
                                                                         2
                                                                              2
## 32 65
            1 0
                      120
                           177
                                 0
                                         1
                                               140
                                                        0
                                                              0.4
                                                                      2 0
                                                                              3
## 34
            1 2
                           273
                                         0
                                               152
                                                              0.5
                                                                      0 1
                                                                              2
      54
                      125
                                 0
                                                        0
               2
## 38
     54
            1
                      150 232
                                 0
                                         0
                                               165
                                                              1.6
                                                                      2 0
                                                                              3
                                                        0
##
      target pred
## 2
           1
## 4
           1
                1
## 6
           1
## 12
           1
                1
## 13
## 15
           1
                1
## 20
           1
                1
## 32
           1
## 34
           1
                1
```

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