project

Qiao

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```
library(caret)
## Loading required package: lattice
## Loading required package: ggplot2
library(glm2)
library(glmnet)
## Loading required package: Matrix
## Loading required package: foreach
## Loaded glmnet 2.0-16
library(Metrics)
##
## Attaching package: 'Metrics'
## The following object is masked from 'package:glmnet':
##
##
       auc
## The following objects are masked from 'package:caret':
##
##
       precision, recall
set.seed(1)
team <- read.csv("/home/qiaoqiao/Desktop/basketball/CSP571/final.csv", sep=",", header=T)
train <- createDataPartition(team$pct, p = 0.8,list=FALSE)</pre>
team.train <- team[train, ]</pre>
team.test <- team[-train, ]</pre>
team.fit <- lm(pct~., data = team.train)</pre>
summary(team.fit)
##
## Call:
## lm(formula = pct ~ ., data = team.train)
##
## Residuals:
        Min
                  1Q
                      Median
                                    3Q
                                             Max
## -0.23342 -0.05414 -0.01079 0.05376 0.20014
## Coefficients:
##
                                Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                              -4.565e+00 1.708e+00 -2.673 0.00816 **
                              -7.434e-05 1.523e-05 -4.881 2.2e-06 ***
## OffPoss
## Fg2Pct
                              -1.400e-01 2.206e+00 -0.063 0.94947
## Fg3Pct
                              2.764e+00 5.179e+00 0.534 0.59422
                             -1.634e+00 5.108e+00 -0.320 0.74932
## NonHeaveFg3Pct
                               8.150e-03 7.286e-03 1.119 0.26472
## FtsMade
```

```
## PtsAssisted2s
                              2.115e-02 2.266e-02
                                                     0.934
                                                            0.35172
## PtsUnassisted2s
                             -4.180e-03 2.225e-02 -0.188
                                                            0.85121
                             -1.291e-02 1.699e-02 -0.760
## PtsAssisted3s
                                                            0.44806
## PtsUnassisted3s
                              1.589e-02 1.807e-02
                                                     0.879
                                                            0.38042
## Assisted2sPct
                             -7.714e-01 2.311e+00 -0.334
                                                            0.73894
## Assisted3sPct
                                                     2.090
                              9.785e-01 4.681e-01
                                                            0.03791 *
## FG3APct
                              1.667e+00 2.039e+00
                                                     0.818
                                                            0.41458
## ShotQualityAvg
                              6.557e-01 8.878e-01
                                                     0.739
                                                            0.46109
## TsPct
                              4.306e+00
                                         2.366e+00
                                                     1.820
                                                            0.07027 .
## PtsPutbacks
                             -3.279e-02 1.194e-02 -2.746
                                                            0.00660 **
## Fg2aBlocked
                              1.097e-01 1.153e-01
                                                     0.952
                                                            0.34230
## FG2APctBlocked
                             -8.711e+00 7.096e+00 -1.227
                                                            0.22113
## Fg3aBlocked
                             -3.154e-01 4.232e-01 -0.745
                                                            0.45695
## FG3APctBlocked
                              7.400e+00 9.611e+00
                                                     0.770
                                                            0.44227
## AtRimAssists
                             -2.364e-02 1.274e-02 -1.855
                                                            0.06506 .
## ShortMidRangeAssists
                             -2.716e-02 1.508e-02 -1.802
                                                            0.07317
                                                     1.786
## Corner3Assists
                              3.708e-02 2.076e-02
                                                            0.07563 .
## Def2ptReboundPct
                              1.421e+00 1.156e+00
                                                    1.229
                                                            0.22075
## Def3ptReboundPct
                              3.470e+00 5.454e+00
                                                     0.636
                                                            0.52532
## OffFTReboundPct
                             -2.008e-01 1.719e-01 -1.168
                                                            0.24441
## Off2ptReboundPct
                              3.882e+00 1.652e+00
                                                     2.350
                                                            0.01977 *
## Off3ptReboundPct
                              4.942e+00 4.261e+00
                                                     1.160
                                                            0.24753
## DefAtRimReboundPct
                              4.067e-01 4.858e-01
                                                     0.837
                                                            0.40349
## DefShortMidRangeReboundPct 3.474e-02 4.854e-01
                                                     0.072
                                                            0.94301
## DefLongMidRangeReboundPct -2.586e-02 5.414e-01 -0.048
                                                            0.96195
## DefArc3ReboundPct
                             -2.608e+00 4.085e+00 -0.638
                                                            0.52397
## DefCorner3ReboundPct
                             -9.290e-01 1.393e+00 -0.667
                                                            0.50567
## OffAtRimReboundPct
                             -6.220e-01 6.059e-01 -1.027
                                                            0.30590
## OffShortMidRangeReboundPct -1.402e+00 6.168e-01 -2.273
                                                            0.02411 *
## OffLongMidRangeReboundPct -8.327e-01 6.235e-01 -1.336
                                                            0.18324
## OffArc3ReboundPct
                             -2.543e+00
                                         3.249e+00 -0.783
                                                            0.43473
## OffCorner3ReboundPct
                             -1.026e+00 1.077e+00 -0.953 0.34196
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.08425 on 193 degrees of freedom
## Multiple R-squared: 0.7495, Adjusted R-squared: 0.7014
## F-statistic: 15.6 on 37 and 193 DF, p-value: < 2.2e-16
predict_0 <- predict(team.fit,team.train,type = "response")</pre>
prediction<-ifelse(predict_0<=0.5,0,1)</pre>
true<-ifelse(team.train$pct<=0.5,0,1)</pre>
confusionMatrix(table(prediction, true),mode="everything")
## Confusion Matrix and Statistics
##
##
            true
##
  prediction 0 1
           0 92 26
##
##
           1 14 99
##
##
                 Accuracy: 0.8268
##
                   95% CI: (0.7718, 0.8733)
##
      No Information Rate: 0.5411
##
      P-Value [Acc > NIR] : < 2e-16
```

```
##
##
                     Kappa: 0.6543
    Mcnemar's Test P-Value: 0.08199
##
##
##
               Sensitivity: 0.8679
               Specificity: 0.7920
##
##
            Pos Pred Value: 0.7797
            Neg Pred Value: 0.8761
##
##
                 Precision: 0.7797
                    Recall: 0.8679
##
##
                        F1: 0.8214
                Prevalence: 0.4589
##
            Detection Rate: 0.3983
##
      Detection Prevalence: 0.5108
##
##
         Balanced Accuracy: 0.8300
##
##
          'Positive' Class : 0
##
mse(team.test$pct,predict_0)
## Warning in actual - predicted: longer object length is not a multiple of
## shorter object length
## [1] 0.03717523
predict_1 <- predict(team.fit,team.test,type = "response")</pre>
prediction<-ifelse(predict_1<=0.5,0,1)</pre>
true<-ifelse(team.test$pct<=0.5,0,1)</pre>
confusionMatrix(table(prediction, true),mode="everything")
## Confusion Matrix and Statistics
##
##
             true
  prediction 0 1
            0 23 4
##
            1 4 25
##
##
##
                  Accuracy : 0.8571
##
                    95% CI: (0.7378, 0.9362)
##
       No Information Rate: 0.5179
##
       P-Value [Acc > NIR] : 9.573e-08
##
##
                     Kappa: 0.7139
    Mcnemar's Test P-Value : 1
##
##
##
               Sensitivity: 0.8519
               Specificity: 0.8621
##
##
            Pos Pred Value: 0.8519
##
            Neg Pred Value: 0.8621
##
                 Precision: 0.8519
                    Recall: 0.8519
##
##
                         F1: 0.8519
##
                Prevalence: 0.4821
##
            Detection Rate: 0.4107
##
      Detection Prevalence: 0.4821
```

```
##
                          Balanced Accuracy: 0.8570
##
##
                              'Positive' Class: 0
##
mse(team.test$pct,predict_1)
## [1] 0.007277765
predict_1 <- predict(team.fit,team.test,type = "response")</pre>
prediction<-ifelse(predict_1<=0.7,0,1)</pre>
true<-ifelse(team.test$pct<=0.7,0,1)</pre>
confusionMatrix(table(prediction, true),mode="everything")
## Confusion Matrix and Statistics
##
                                     true
## prediction 0 1
                                  0 50 2
##
##
                                   1 2 2
##
##
                                                    Accuracy : 0.9286
##
                                                          95% CI: (0.8271, 0.9802)
##
                    No Information Rate: 0.9286
##
                    P-Value [Acc > NIR] : 0.6289
##
##
                                                             Kappa: 0.4615
##
         Mcnemar's Test P-Value : 1.0000
##
##
                                           Sensitivity: 0.9615
##
                                           Specificity: 0.5000
                                   Pos Pred Value: 0.9615
##
##
                                   Neg Pred Value: 0.5000
                                                 Precision: 0.9615
##
                                                          Recall: 0.9615
##
                                                                      F1: 0.9615
##
                                               Prevalence: 0.9286
##
                                   Detection Rate: 0.8929
##
##
                 Detection Prevalence: 0.9286
##
                          Balanced Accuracy: 0.7308
##
##
                              'Positive' Class: 0
##
mse(team.test$pct,predict_1)
## [1] 0.007277765
\# fit0 < -lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct, data = lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct, data = lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct, data = lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct, data = lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct, data = lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct, data = lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct, data = lm(pct \sim Off Poss + Pts Putbacks + Assisted 3s Pct + Off 2pt Rebound Pct + Off Short MidRange Rebound Pct + Off Sh
# summary(fit0)
fit <- glm(pct~., data = team.train, family = binomial)</pre>
```

```
## Warning in eval(family$initialize): non-integer #successes in a binomial
## glm!
summary(fit)
##
## Call:
## glm(formula = pct ~ ., family = binomial, data = team.train)
##
## Deviance Residuals:
##
       Min
                   10
                         Median
                                       3Q
                                                Max
## -0.49776 -0.11283 -0.01468
                                  0.10745
                                            0.40294
##
## Coefficients:
##
                                Estimate Std. Error z value Pr(>|z|)
                              -2.239e+01 4.241e+01 -0.528
## (Intercept)
                                                               0.598
## OffPoss
                              -3.097e-04
                                          3.762e-04 -0.823
                                                               0.410
## Fg2Pct
                              -5.544e-01
                                          5.444e+01
                                                    -0.010
                                                               0.992
## Fg3Pct
                               1.217e+01
                                         1.286e+02
                                                      0.095
                                                               0.925
## NonHeaveFg3Pct
                              -7.806e+00 1.263e+02 -0.062
                                                               0.951
## FtsMade
                               3.110e-02 1.786e-01
                                                      0.174
                                                               0.862
                                                      0.147
## PtsAssisted2s
                               8.310e-02 5.657e-01
                                                               0.883
## PtsUnassisted2s
                              -1.563e-02
                                          5.532e-01 -0.028
                                                               0.977
## PtsAssisted3s
                              -5.171e-02 4.283e-01 -0.121
                                                               0.904
## PtsUnassisted3s
                              8.455e-02 4.551e-01
                                                      0.186
                                                               0.853
## Assisted2sPct
                              -2.695e+00
                                         5.740e+01 -0.047
                                                               0.963
## Assisted3sPct
                                                      0.377
                               4.449e+00
                                         1.181e+01
                                                               0.706
## FG3APct
                               6.532e+00 5.123e+01
                                                      0.128
                                                               0.899
## ShotQualityAvg
                               2.775e+00 2.182e+01
                                                      0.127
                                                               0.899
## TsPct
                               1.909e+01 5.817e+01
                                                      0.328
                                                               0.743
## PtsPutbacks
                              -1.407e-01 2.953e-01 -0.476
                                                               0.634
## Fg2aBlocked
                               5.013e-01 2.867e+00
                                                      0.175
                                                               0.861
## FG2APctBlocked
                              -3.875e+01
                                         1.764e+02 -0.220
                                                               0.826
## Fg3aBlocked
                              -1.446e+00
                                         1.035e+01 -0.140
                                                               0.889
## FG3APctBlocked
                               3.366e+01 2.348e+02
                                                      0.143
                                                               0.886
## AtRimAssists
                              -1.001e-01 3.148e-01 -0.318
                                                               0.750
                              -1.153e-01 3.696e-01 -0.312
                                                               0.755
## ShortMidRangeAssists
## Corner3Assists
                               1.635e-01
                                         5.112e-01
                                                      0.320
                                                               0.749
## Def2ptReboundPct
                               6.702e+00 2.882e+01
                                                      0.233
                                                               0.816
## Def3ptReboundPct
                               1.370e+01 1.346e+02
                                                      0.102
                                                               0.919
## OffFTReboundPct
                              -8.161e-01 4.239e+00 -0.193
                                                               0.847
## Off2ptReboundPct
                               1.603e+01 4.056e+01
                                                      0.395
                                                               0.693
## Off3ptReboundPct
                               2.018e+01 1.060e+02
                                                      0.190
                                                               0.849
## DefAtRimReboundPct
                               1.488e+00 1.213e+01
                                                      0.123
                                                               0.902
## DefShortMidRangeReboundPct -1.654e-02
                                          1.197e+01 -0.001
                                                               0.999
## DefLongMidRangeReboundPct -3.516e-01 1.336e+01 -0.026
                                                               0.979
## DefArc3ReboundPct
                              -1.019e+01
                                         1.009e+02 -0.101
                                                               0.920
## DefCorner3ReboundPct
                              -3.639e+00
                                          3.438e+01 -0.106
                                                               0.916
## OffAtRimReboundPct
                              -2.344e+00
                                          1.497e+01
                                                    -0.157
                                                               0.876
## OffShortMidRangeReboundPct -5.809e+00
                                         1.517e+01 -0.383
                                                               0.702
## OffLongMidRangeReboundPct -3.342e+00 1.531e+01 -0.218
                                                               0.827
## OffArc3ReboundPct
                              -1.038e+01 8.076e+01
                                                    -0.129
                                                               0.898
## OffCorner3ReboundPct
```

5

-4.047e+00 2.681e+01 -0.151

(Dispersion parameter for binomial family taken to be 1)

##

0.880

```
##
##
       Null deviance: 22.8267 on 230 degrees of freedom
## Residual deviance: 5.8598 on 193 degrees of freedom
## AIC: 325.01
## Number of Fisher Scoring iterations: 4
predict_fit <- predict(fit, team.train,type ="response")</pre>
prediction_fit<-ifelse(predict_fit<=0.5,0,1)</pre>
true<-ifelse(team.train$pct<=0.5,0,1)</pre>
confusionMatrix(table(prediction_fit, true),mode="everything")
## Confusion Matrix and Statistics
##
##
                 true
##
  prediction_fit
                   0 1
                0 93 25
##
                1 13 100
##
##
                  Accuracy: 0.8355
                    95% CI: (0.7813, 0.8809)
##
##
       No Information Rate: 0.5411
##
       P-Value [Acc > NIR] : < 2e-16
##
##
                     Kappa: 0.6716
   Mcnemar's Test P-Value: 0.07435
##
##
##
               Sensitivity: 0.8774
##
               Specificity: 0.8000
##
            Pos Pred Value: 0.7881
            Neg Pred Value: 0.8850
##
##
                 Precision: 0.7881
##
                    Recall: 0.8774
##
                        F1: 0.8304
##
                Prevalence: 0.4589
##
            Detection Rate: 0.4026
##
      Detection Prevalence: 0.5108
##
         Balanced Accuracy: 0.8387
##
##
          'Positive' Class: 0
##
mse(team.test$pct,predict_fit)
## Warning in actual - predicted: longer object length is not a multiple of
## shorter object length
## [1] 0.03725496
predict_fit_1 <- predict(fit, team.test,type ="response")</pre>
prediction_fit_1<-ifelse(predict_fit_1<=0.5,0,1)</pre>
true 1<-ifelse(team.test$pct<=0.5,0,1)
confusionMatrix(table(prediction_fit_1, true_1),mode="everything")
## Confusion Matrix and Statistics
##
##
                   true 1
```

```
## prediction_fit_1 0 1
##
                  0 23 4
##
                  1 4 25
##
##
                  Accuracy : 0.8571
##
                    95% CI: (0.7378, 0.9362)
##
       No Information Rate: 0.5179
       P-Value [Acc > NIR] : 9.573e-08
##
##
##
                     Kappa: 0.7139
##
    Mcnemar's Test P-Value : 1
##
               Sensitivity: 0.8519
##
##
               Specificity: 0.8621
##
            Pos Pred Value: 0.8519
##
            Neg Pred Value: 0.8621
##
                 Precision: 0.8519
                    Recall: 0.8519
##
##
                        F1: 0.8519
                Prevalence: 0.4821
##
##
            Detection Rate: 0.4107
##
      Detection Prevalence: 0.4821
         Balanced Accuracy: 0.8570
##
##
##
          'Positive' Class : 0
mse(team.test$pct,predict_fit_1)
## [1] 0.00712028
predict_fit_2 <- predict(fit, team.test,type ="response")</pre>
prediction_fit_2<-ifelse(predict_fit_2<=0.7,0,1)</pre>
true_2<-ifelse(team.test$pct<=0.7,0,1)</pre>
confusionMatrix(table(prediction_fit_2, true_2),mode="everything")
## Confusion Matrix and Statistics
##
##
                   true_2
##
   prediction_fit_2 0 1
##
                  0 50 2
##
                  1 2 2
##
##
                  Accuracy : 0.9286
##
                    95% CI: (0.8271, 0.9802)
##
       No Information Rate: 0.9286
##
       P-Value [Acc > NIR] : 0.6289
##
##
                     Kappa: 0.4615
    Mcnemar's Test P-Value: 1.0000
##
##
##
               Sensitivity: 0.9615
##
               Specificity: 0.5000
##
            Pos Pred Value: 0.9615
##
            Neg Pred Value: 0.5000
```

```
##
                 Precision: 0.9615
##
                    Recall: 0.9615
##
                        F1: 0.9615
##
                Prevalence: 0.9286
##
            Detection Rate: 0.8929
##
      Detection Prevalence: 0.9286
         Balanced Accuracy: 0.7308
##
##
##
          'Positive' Class: 0
##
mse(team.test$pct,predict_fit_2)
## [1] 0.00712028
# fit1 <- glm(pct~OffPoss+PtsAssisted3s+Assisted3sPct+Corner3Assists, data = team.train, family = binom
```

```
# summary(fit1)
# predict_fit <- predict(fit1, team.train,type ="response")</pre>
# prediction<-ifelse(predict fit<=0.5,0,1)</pre>
# true<-ifelse(team.train$pct<=0.5,0,1)</pre>
# confusionMatrix(table(prediction, true), mode="everything")
# grid<-seq(0,10,0.01)
# y <- team.train$pct
\# \ x < - \ model.matrix(team.train\$pct \ \ ^OffPoss+PtsPutbacks+Assisted3sPct+Off2ptReboundPct+OffShortMidRange)
\# lasso_fit \leftarrow qlmnet(x, y, alpha = 1, lambda = qrid)
# cross.validation <- cv.glmnet(x, y, alpha = 1, lambda = grid)
# minimum.lambda <- cross.validation$lambda.min</pre>
# cat("minimum lambda", minimum.lambda, "\n")
# x.test <- model.matrix(team.test$pct ~OffPoss+PtsPutbacks+Assisted3sPct+Off2ptReboundPct+OffShortMidR
# lasso_pred <- predict(lasso_fit, s = minimum.lambda, newx = x.test)</pre>
\# cat("test MSE" , mse(team.test$pct, lasso_pred), "\n")
\# lasso.mod \leftarrow glmnet(x, y, alpha = 1)
# coefs <- predict(lasso.mod, type = "coefficients", s = minimum.lambda)
# coefs
# library(corrplot)
# correlations <- cor(team[,2:8])</pre>
# corrplot(correlations, method="circle")
```