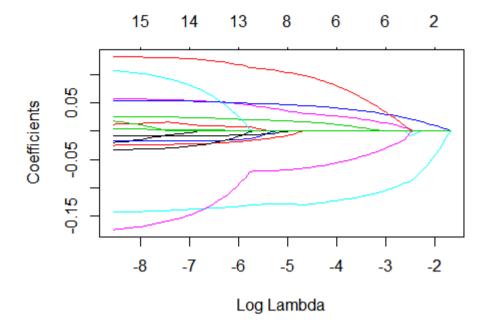
## The codes & results

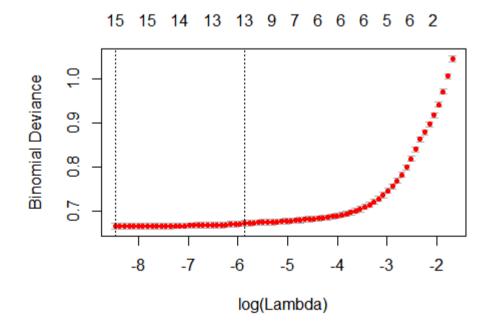
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```
> ## Prepare the data
> library(ISLR)
> library(glmnet)
> library(caret)
> rm(list = ls())
> set.seed(123)
> weather <- read.csv("weather.csv")</pre>
> weather$RainTomorrow <- factor(weather$RainTomorrow,levels=c(0,1),labels=c("FALSE","TRUE"))
> summary(weather)
   MinTemp
                                         Rainfall
                       MaxTemp
                                                            Evaporation
                                                                                  Sunshine
 Min. :-6.70
1st Qu.: 8.40
                   Min. : 4.10
1st Qu.:18.60
                                      Min. : 0.000
1st Qu.: 0.000
                                                          Min. : 0.000
1st Qu.: 2.800
                                                                              Min. : 0.000
1st Qu.: 5.000
                   Median :23.80
                                      Median : 0.000
 Median :13.10
                                                           Median: 4.800
                                                                               Median: 8.600
                                      Mean : 2.117
3rd Qu.: 0.600
                   Mean :24.13
                                                           Mean : 5.445
                                                                               Mean : 7.699
 Mean :13.34
                   3rd Qu.:29.60
                                                           3rd Qu.: 7.400
 3rd Qu.:18.30
                                                                               3rd Qu.: 10.700
                                      Max. :206.200
WindSpeed3pm
 Max. :31.40
WindGustSpeed
                   Max. :48.10
WindSpeed9am
                                                                              Max. :14.500
Humidity3pm
                                                          Max. :81.200
Humidity9am
                                                         Min. : 0.00
1st Qu.: 55.00
                                                                             Min. : 0.0
1st Qu.: 36.0
 Min. : 9.00
1st Qu.: 31.00
                    Min. : 0.00
1st Qu.: 9.00
                                       Min. : 0.00
                                       1st Ou.:13.00
                                                          Median : 67.00
 Median : 39.00
                    Median :15.00
                                       Median :19.00
                                                                             Median: 51.0
 Mean : 40.56
3rd Qu.: 48.00
                                                          Mean : 66.22
3rd Qu.: 80.00
                    Mean :15.24
                                       Mean :19.58
                                                                             Mean : 49.7
                    3rd Qu.:20.00
                                       3rd Qu.:24.00
                                                                             3rd Qu.: 63.0
                                       Max. :76.00
Cloud9am
                                                          Max. :100.00
Cloud3pm
                                                                             Max. :100.0
Temp9am
 Max. :124.00
                    Max. :67.00
  Pressure9am
                     Pressure3pm
                                                                                                   Temp3pm
 Min. : 980.5
1st Qu.:1012.7
                    Min. : 977.1
1st Qu.:1010.1
                                        Min. :0.000
1st Qu.:1.000
                                                          Min. :0.000
1st Qu.:2.000
                                                                             Min. :-0.90
                                                                                                Min. : 3.70
                                                                                                1st Qu.:17.30
                                                                             1st Qu.:12.90
 Median :1017.3
                                                           Median :5.000
                                                                             Median :17.70
                    Median:1014.8
                                        Median:5.000
                                                                                                Median :22.30
 Mean :1017.3
                    Mean :1014.9
                                        Mean :4.247
                                                           Mean :4.328
                                                                             Mean :18.09
                                                                                                Mean :22.63
 3rd Qu.:1022.0
                                                                             3rd Qu.:23.20
                    3rd Qu.:1019.5
                                        3rd Qu.:7.000
                                                           3rd Qu.:7.000
                                                                                                3rd Qu.:27.80
 Max. :1040.4
                    Max. :1038.9
                                        Max. :8.000
                                                          Max. :9.000
                                                                             Max. :39.40
                                                                                               Max. :46.10
 RainTomorrow
 FALSE:45361
 TRUE :12729
```

```
> ## Split data into training and test data sets
> n <- nrow(weather)
> train <- sample(n,n/2)</pre>
> weather.tr <- weather[train,]</pre>
> weather.te <- weather[-train,]</pre>
> ## Logistic regression on the full model
> # Fit on training data
> logitfit <- glm(RainTomorrow ~.,weather.tr,family='binomial')</pre>
> summary(logitfit)
call.
glm(formula = RainTomorrow ~ ., family = "binomial", data = weather.tr)
Deviance Residuals:
                  Median
    Min
                                30
              10
                                        Max
                 -0.2802 -0.1239
-3.2016 -0.5106
                                     3.1784
Coefficients:
               Estimate Std. Error z value Pr(>|z|)
                         3.414477 17.707 < 2e-16 ***
(Intercept)
              60.458777
                                    -2.681 0.00735 **
MinTemp
              -0.028145
                          0.010499
MaxTemp
               0.014853
                         0.016522
                                    0.899 0.36867
               0.026064
                          0.002773
                                     9.400 < 2e-16 ***
Rainfall
Evaporation
              -0.016305
                         0.008183 -1.993 0.04631 *
                         0.008470 -16.997
                                           < 2e-16 ***
              -0.143970
Sunshine
                                    26.606 < 2e-16 ***
WindGustSpeed 0.057950
                          0.002178
WindSpeed9am -0.007068
                          0.002865
                                    -2.467 0.01362 *
                                    -8.510 < 2e-16 ***
WindSpeed3pm
              -0.026008
                          0.003056
Humidity9am
              0.005659
                         0.002182
                                     2.594 0.00949 **
Humidity3pm
                                           < 2e-16 ***
                          0.002310
               0.053407
                                    23.117
                                           < 2e-16 ***
Pressure9am
               0.117159
                          0.011110
                                    10.545
Pressure3pm
              -0.183281
                          0.011214 -16.345
                                            < 2e-16 ***
              -0.033416
                          0.010427
                                    -3.205
                                           0.00135 **
cloud9am
cloud3pm
              0.131259
                          0.011434 11.480
                                           < 2e-16 ***
              0.031831
                          0.015460
                                    2.059
                                            0.03950 *
Temp9am
Temp3pm
              -0.009444
                          0.018714
                                    -0.505 0.61379
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
(Dispersion parameter for binomial family taken to be 1)
    Null deviance: 30394 on 29044 degrees of freedom
Residual deviance: 19337 on 29028 degrees of freedom
AIC: 19371
Number of Fisher Scoring iterations: 6
> # Predict on test data
> p = predict(logitfit, weather.te, type="response")
> logitpred = as.factor(p > 0.5)
> table(logitpred,weather.te$RainTomorrow,dnn=c("predicted","true"))
         true
predicted FALSE
                 TRUE
    FALSE 21438
                 3020
                 3403
    TRUE 1184
> logiterr <- 1-mean(logitpred==weather.te$RainTomorrow) #misclassification error rate
 logiterr
[1] 0.1447409
> ## Lasso regression (variable selection)
> # Fit on training data
> x <- model.matrix(RainTomorrow ~., weather.tr)[,-1] #no intercept
> y <- weather.tr$RainTomorrow
> lassofit.all <- glmnet(x,y,alpha=1,family="binomial")</pre>
> plot(lassofit.all,xvar="lambda")
```



- > ## Cross validation (select a good value of lambda)
  > cv.lasso <- cv.glmnet(x,y,alpha=1,family="binomial")
  > plot(cv.lasso)



```
> # Refit the model using optimal lambda
> lambda.star <- cv.lasso$lambda.min</pre>
> lassofit.star <- glmnet(x,y,alpha=1,lambda=lambda.star,family="binomial")</pre>
> coef(lassofit.star)
17 x 1 sparse Matrix of class "dgCMatrix"
                          s0
               60.888882472
(Intercept)
MinTemp
               -0.021500267
                0.011799566
MaxTemp
                0.025529100
Rainfall
Evaporation
               -0.016679747
Sunshine
               -0.142546045
WindGustSpeed 0.057006871
WindSpeed9am -0.007453108
windSpeed3pm -0.024969331
Humidity9am
                0.004271247
Humidity3pm
                0.054003484
Pressure9am
                0.105753795
Pressure3pm
               -0.172193570
cloud9am
               -0.032027381
cloud3pm
                0.130605021
Temp9am
                0.019225615
Temp3pm
> # Predict on test data
> newx <- model.matrix(RainTomorrow ~.,weather.te)[,-1]</pre>
> lassopred <- predict(lassofit.star,newx,type="class")
> table(lassopred,weather.te$RainTomorrow,dnn=c("predicted","true"))
          true
predicted FALSE TRUE
    FALSE 21446 3022
TRUE 1176 3401 > lassoerr <- 1-mean(lassopred==weather.te$RainTomorrow)
> lassoerr
[1] 0.1445343
```