Data 621 - Final Project

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5/22/2020

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Abstract

Breast cancer its one of the most common cancer nowadays in our society. For this project, I going to work with a dataset from Kaggle and also available on the UIC repository. In this project analysis we going to use regression modeling and try to replicate the outcome of the prediction which its this case we determine the change of cancer by declaring the results if they are Benign or Malignant. The modeling will try to come with the best accuracy prediction outcome. on this dataset we most will be working with the dimension and spect of the cancer cell.

Introduction

In this paper analysis, we going to work on getting a results product prediction by finding some insight into the dataset. most of our predictor variables are cancer cell dimensions for which just will allow us just to predict those base on those features. This analysis won't support other aspects that may be important in the analysis of cancer prediction such as, people age, use or drug or alcohol, and more.

Literature Review

When it comes to research on the type of cancer, breast cancer it's one with a big notorious amount of research because it one of the most dangerous illnesses that affect thousands of women worldwide.

Breast cancer its one of the leading causes of death and compassion with other types of cancer. There have been many approaches to do analysis and predict the risk of breast cancer. many of these approaches are using logistic regression, Machine learning, SVM, and others modeling. LR, SVM and KNN approaches (Madhu Kumaria, Vijendra Singhb, 2018).

Kumaria and Singh worked on different modeling techniques and were able to obtain an accuracy of 99.28. The methodology on how they worked with the dataset it's similar on how I work with, for example, data selection, data processing/splitting the data, work with different model and select the most accurate one to test it on the evaluation dataset.

Breast cancer affects a range of different ages in a woman but according to this journal paper we see that more 89% percent of cancer was diagnosed with women older than 50 years old and just in 2017 more than 40,000 thousand women die because of this type of cancer (DeSantis, Jiemin Ma, Ann Goding Sauer, Newman, Ahmedin Jemal 2017).

Methodology

The mythology for this project is to work with regression modeling on a dataset which contains 570 rows and 33 columns. this dataset source comes from Kaggle and UIC repository. the data will be split and 2 datasets first by having the training dataset and the evaluation dataset. Later apply the GLM regression model to the training sample data and select the most accurate ones to test it with the evaluation dataset.

Experiment and results

Data Exploratory

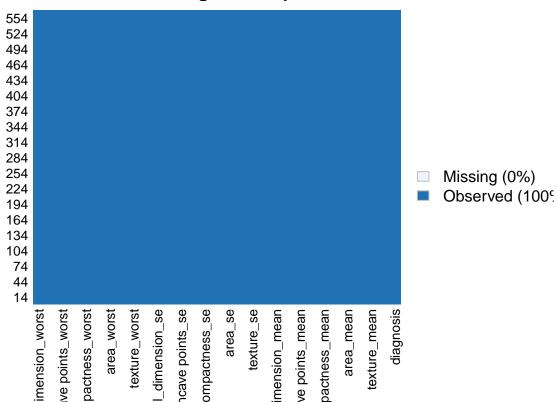
```
## Classes 'tbl_df', 'tbl' and 'data.frame':
                                                 368 obs. of 31 variables:
   $ diagnosis
                                    1 1 1 1 1 1 1 1 1 1 ...
##
   $ radius mean
                                    18 20.6 19.7 11.4 20.3 ...
                             : num
##
   $ texture mean
                                    10.4 17.8 21.2 20.4 14.3 ...
                               nıım
##
  $ perimeter_mean
                                    122.8 132.9 130 77.6 135.1 ...
                             : num
##
  $ area mean
                                    1001 1326 1203 386 1297 ...
                              : num
##
   $ smoothness_mean
                                    0.1184 0.0847 0.1096 0.1425 0.1003 ...
                             : num
##
   $ compactness_mean
                                    0.2776 0.0786 0.1599 0.2839 0.1328 ...
                             : num
##
   $ concavity_mean
                                    0.3001 0.0869 0.1974 0.2414 0.198 ...
                             : num
##
                                    0.1471 0.0702 0.1279 0.1052 0.1043 ...
   $ concave points_mean
                             : num
##
   $ symmetry_mean
                                    0.242 0.181 0.207 0.26 0.181 ...
                               num
##
   $ fractal_dimension_mean : num
                                    0.0787 0.0567 0.06 0.0974 0.0588 ...
##
   $ radius_se
                                    1.095 0.543 0.746 0.496 0.757 ...
                             : num
##
   $ texture se
                             : num
                                    0.905 0.734 0.787 1.156 0.781 ...
                                    8.59 3.4 4.58 3.44 5.44 ...
   $ perimeter_se
                              : num
```

^{*}Key works: Cancer, cells,regression.

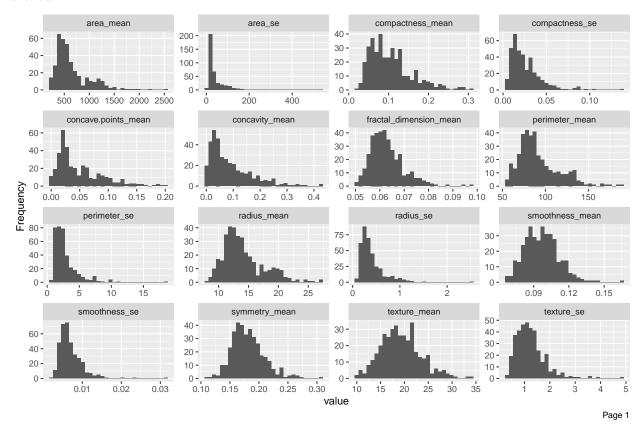
```
## $ area se
                                  153.4 74.1 94 27.2 94.4 ...
                           : num
##
                                  0.0064 0.00522 0.00615 0.00911 0.01149 ...
   $ smoothness se
                           : num
                                  0.049 0.0131 0.0401 0.0746 0.0246 ...
## $ compactness se
                           : num
                                  0.0537 0.0186 0.0383 0.0566 0.0569 ...
## $ concavity_se
                            : num
##
   $ concave points se
                            : num
                                  0.0159 0.0134 0.0206 0.0187 0.0188 ...
##
                                  0.03 0.0139 0.0225 0.0596 0.0176 ...
   $ symmetry se
                            : num
   $ fractal_dimension_se
                                  0.00619 0.00353 0.00457 0.00921 0.00511 ...
                           : num
                                  25.4 25 23.6 14.9 22.5 ...
##
   $ radius worst
                            : num
##
   $ texture worst
                           : num
                                  17.3 23.4 25.5 26.5 16.7 ...
##
   $ perimeter_worst
                            : num
                                  184.6 158.8 152.5 98.9 152.2 ...
   $ area_worst
                            : num
                                  2019 1956 1709 568 1575 ...
##
                                  0.162 0.124 0.144 0.21 0.137 ...
   $ smoothness_worst
                            : num
##
   $ compactness_worst
                                  0.666 0.187 0.424 0.866 0.205 ...
                            : num
##
                                  0.712 0.242 0.45 0.687 0.4 ...
   $ concavity_worst
                            : num
##
                                  0.265 0.186 0.243 0.258 0.163 ...
   $ concave points_worst
                            : num
##
   $ symmetry_worst
                            : num
                                  0.46 0.275 0.361 0.664 0.236 ...
##
   ##
   - attr(*, "problems")=Classes 'tbl_df', 'tbl' and 'data.frame': 569 obs. of 5 variables:
##
                : int 1 2 3 4 5 6 7 8 9 10 ...
    ..$ row
##
    ..$ col
                : chr NA NA NA NA ...
##
    ..$ expected: chr
                      "33 columns" "33 columns" "33 columns" ...
##
                      "32 columns" "32 columns" "32 columns" "32 columns" ...
    ..$ actual : chr
                : chr "'data.csv'" "'data.csv'" "'data.csv'" ...
##
    ..$ file
                                     texture_mean
     diagnosis
                     radius mean
##
                                                   perimeter mean
##
   Min.
          :0.0000
                    Min. : 8.219
                                    Min.
                                          : 9.71
                                                   Min.
                                                         : 53.27
   1st Qu.:0.0000
                    1st Qu.:11.705
                                                   1st Qu.: 75.41
                                    1st Qu.:16.33
##
   Median :0.0000
                    Median :13.325
                                    Median :18.82
                                                   Median: 86.04
##
   Mean
         :0.3696
                    Mean
                          :14.115
                                    Mean :19.21
                                                   Mean : 91.89
   3rd Qu.:1.0000
##
                    3rd Qu.:15.715
                                    3rd Qu.:21.70
                                                   3rd Qu.:103.45
                    Max.
##
   Max.
         :1.0000
                          :27.420
                                    Max.
                                          :33.81
                                                   Max. :186.90
##
     area_mean
                    smoothness_mean
                                     compactness_mean concavity_mean
##
         : 203.9
                           :0.06576
                                            :0.02344
                                                      Min.
                                                             :0.00000
   Min.
                    Min.
                                     Min.
##
   1st Qu.: 422.4
                    1st Qu.:0.08660
                                     1st Qu.:0.06363
                                                       1st Qu.:0.02964
   Median : 548.8
                    Median :0.09671
                                     Median :0.09403
                                                      Median :0.06071
##
   Mean : 651.7
                    Mean
                         :0.09675
                                     Mean
                                            :0.10473
                                                       Mean
                                                             :0.08814
##
   3rd Qu.: 761.4
                    3rd Qu.:0.10540
                                     3rd Qu.:0.13000
                                                       3rd Qu.:0.12662
          :2501.0
                    Max. :0.16340
                                            :0.31140
                                                      Max.
                                                             :0.42680
##
   concave points_mean symmetry_mean
                                       fractal_dimension_mean radius_se
   Min.
         :0.00000
                       Min.
                             :0.1060
                                       Min.
                                              :0.05024
                                                             Min.
                                                                   :0.1144
##
   1st Qu.:0.01969
                       1st Qu.:0.1620
                                       1st Qu.:0.05828
                                                             1st Qu.:0.2315
   Median : 0.03367
                       Median :0.1783
                                       Median :0.06158
                                                             Median :0.3320
   Mean
##
          :0.04914
                       Mean
                            :0.1811
                                       Mean
                                              :0.06285
                                                             Mean
                                                                    :0.4013
##
   3rd Qu.:0.06616
                       3rd Qu.:0.1958
                                       3rd Qu.:0.06620
                                                             3rd Qu.:0.4704
##
   Max.
          :0.20120
                       Max.
                             :0.3040
                                       Max. :0.09744
                                                             Max.
                                                                    :2.5470
##
     texture_se
                     perimeter_se
                                       area_se
                                                      smoothness_se
##
   Min.
          :0.3602
                    Min. : 0.757
                                    Min. : 6.802
                                                     Min.
                                                            :0.001713
##
   1st Qu.:0.8398
                    1st Qu.: 1.601
                                    1st Qu.: 17.793
                                                     1st Qu.:0.005078
## Median :1.1500
                    Median : 2.303
                                    Median : 24.530
                                                     Median :0.006176
## Mean
         :1.2297
                          : 2.829
                                    Mean
                                          : 39.635
                                                     Mean
                    Mean
                                                            :0.006975
##
   3rd Qu.:1.4785
                    3rd Qu.: 3.228
                                    3rd Qu.: 44.852
                                                      3rd Qu.:0.008104
##
   Max.
          :4.8850
                    Max.
                          :18.650
                                    Max.
                                           :542.200
                                                     Max.
                                                            :0.031130
   compactness_se
                       concavity_se
                                       concave points_se
                                                          symmetry_se
                     Min.
                            :0.00000 Min.
                                              :0.000000 Min.
##
   Min.
          :0.003012
                                                                :0.007882
```

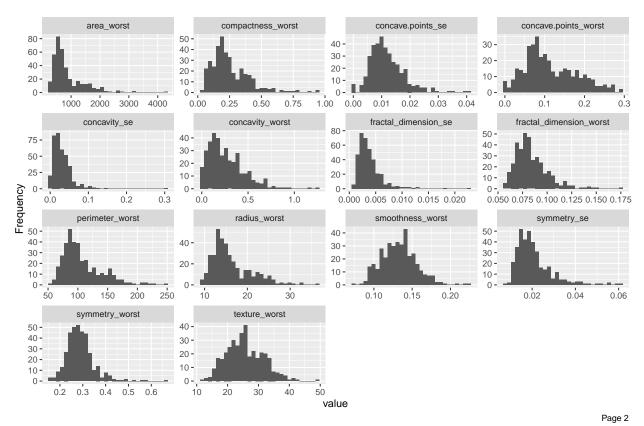
```
1st Qu.:0.013695
                       1st Qu.:0.01456
                                         1st Qu.:0.007616
                                                             1st Qu.:0.015128
   Median :0.021075
                       Median :0.02581
                                         Median :0.010680
                                                             Median :0.018765
          :0.025632
                                                :0.011784
                       Mean
                              :0.03123
                                         Mean
                                                             Mean
                                                                    :0.020627
##
   3rd Qu.:0.032745
                       3rd Qu.:0.04253
                                         3rd Qu.:0.015012
                                                             3rd Qu.:0.023398
           :0.135400
                       Max.
                              :0.30380
                                         Max.
                                                 :0.040900
                                                             Max.
                                                                    :0.061460
##
   fractal dimension se radius worst
                                          texture worst
                                                           perimeter worst
           :0.0008948
                         Min. : 8.952
                                          Min.
                                                 :12.02
                                                           Min.
                                                                  : 56.65
   1st Qu.:0.0022870
                         1st Qu.:13.045
                                          1st Qu.:21.29
                                                           1st Qu.: 84.28
##
##
   Median: 0.0032625
                         Median :14.875
                                          Median :25.21
                                                           Median: 97.78
##
           :0.0037782
                         Mean :16.203
   Mean
                                          Mean :25.60
                                                           Mean
                                                                :106.80
    3rd Qu.:0.0045625
                         3rd Qu.:18.370
                                          3rd Qu.:30.06
                                                           3rd Qu.:123.58
##
           :0.0228600
                                :36.040
                                          Max.
                                                 :49.54
                                                           Max.
                                                                  :251.20
   Max.
                         Max.
##
      area_worst
                     smoothness_worst compactness_worst concavity_worst
                                              :0.02729
##
                            :0.07117
                                                                 :0.0000
          : 240.1
                     Min.
                                       Min.
                                                          Min.
##
    1st Qu.: 515.7
                     1st Qu.:0.11675
                                       1st Qu.:0.15245
                                                          1st Qu.:0.1210
##
   Median : 673.5
                     Median :0.13135
                                       Median :0.21375
                                                          Median :0.2248
##
         : 868.0
                                              :0.25240
                                                                 :0.2663
   Mean
                     Mean
                            :0.13239
                                       Mean
                                                          Mean
    3rd Qu.:1037.2
                     3rd Qu.:0.14522
                                       3rd Qu.:0.33930
                                                          3rd Qu.:0.3798
           :4254.0
                     Max.
                            :0.22260
                                       Max.
                                              :0.93790
##
   Max.
                                                          Max.
                                                                 :1.2520
##
    concave points worst symmetry worst
                                          fractal dimension worst
                                                  :0.05504
##
   Min.
           :0.00000
                         Min.
                                :0.1565
                                          Min.
    1st Qu.:0.06557
                         1st Qu.:0.2511
                                          1st Qu.:0.07213
##
   Median :0.09885
                         Median :0.2826
                                          Median :0.08071
   Mean :0.11405
                         Mean
                                :0.2902
                                          Mean
                                                  :0.08368
   3rd Qu.:0.15890
                         3rd Qu.:0.3185
                                          3rd Qu.:0.09169
   Max.
           :0.29100
                         Max.
                                :0.6638
                                          Max.
                                                 :0.17300
```

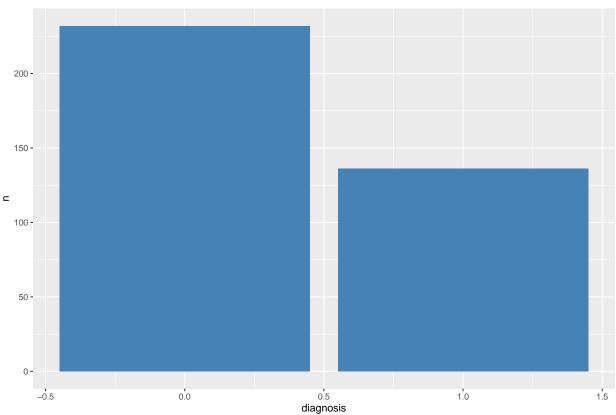
Missingness Map



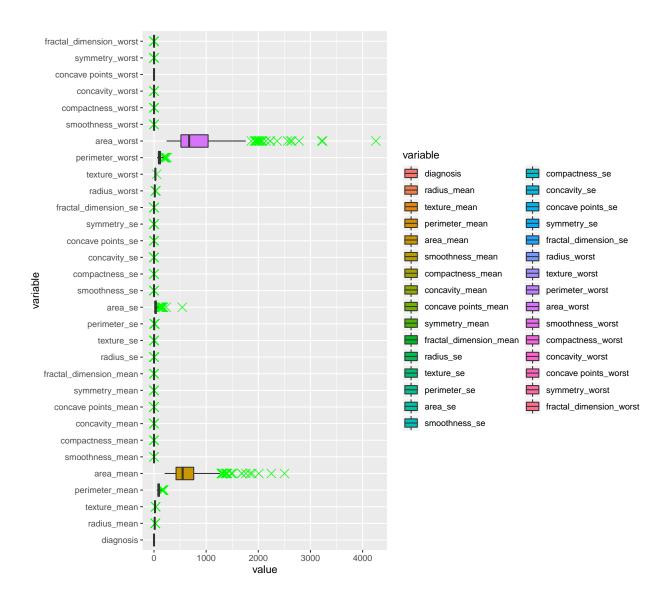
The first insight we can observe its that our dataset it's small with just 570 rows but all the observation is complete and we don't have missing values. in the histogram plot we can see that most of the variables nearly close to normal distributed especially the most significant variables one and others somehow a little skewed.



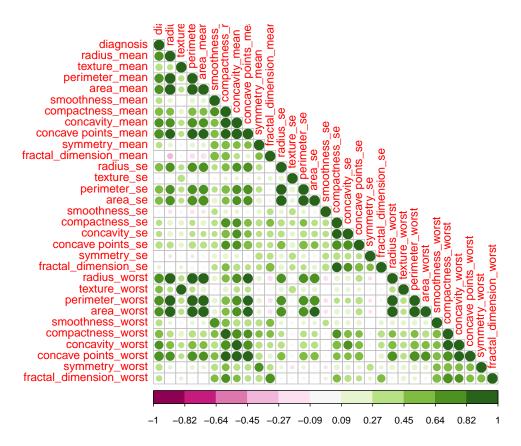




No id variables; using all as measure variables



Warning in brewer.pal(n = 12, name = "PiYG"): n too large, allowed maximum for palette PiYG is 11 ## Returning the palette you asked for with that many colors



In the correlation plot we can observe they are many correlate variables for which this can be an issue and affect our modeling design. we going to use GLM modeling regression. we going to try to run a model with all the variables and then we going to implement a stepwise function in order to remove the correlate variables and enhance the model by obtaining one with just the most significant variables.

Modeling

```
##
## Call:
## lm(formula = diagnosis ~ ., data = df.train)
##
##
  Residuals:
##
        Min
                   10
                        Median
                                      30
                                              Max
##
   -0.54827 -0.16468 -0.02668
                                0.14195
                                          0.64714
##
##
  Coefficients:
##
                              Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                            -2.564e+00
                                         5.300e-01
                                                     -4.838
                                                               2e-06 ***
  radius_mean
                            -2.436e-01
                                         2.245e-01
                                                             0.27860
##
                                                     -1.085
## texture_mean
                             1.840e-03
                                         9.748e-03
                                                      0.189
                                                             0.85038
                                         3.288e-02
                                                      1.268
                                                             0.20567
  perimeter_mean
                             4.169e-02
   area_mean
                            -3.697e-04
                                         7.886e-04
                                                     -0.469
                                                             0.63948
   smoothness_mean
                             3.587e+00
                                         2.475e+00
                                                      1.449
                                                             0.14824
## compactness_mean
                            -5.850e+00
                                         1.679e+00
                                                     -3.484
                                                             0.00056 ***
                                         1.278e+00
## concavity_mean
                             1.662e+00
                                                      1.301
                                                             0.19422
## `concave points_mean`
                             1.116e+00
                                         2.411e+00
                                                      0.463
                                                             0.64373
## symmetry_mean
                             7.962e-01
                                        8.724e-01
                                                      0.913
                                                             0.36208
```

```
## fractal_dimension_mean -5.306e+00 7.049e+00 -0.753 0.45215
## radius se
                           3.032e-01 3.914e-01
                                                 0.775 0.43914
                          -3.591e-02 4.438e-02 -0.809
## texture se
                                                        0.41904
                                                 0.383
## perimeter_se
                           1.954e-02 5.104e-02
                                                        0.70215
## area se
                          -9.152e-04
                                      1.849e-03 -0.495
                                                        0.62099
## smoothness se
                           9.547e+00 8.079e+00
                                                 1.182 0.23816
## compactness se
                          -6.434e-01 3.358e+00 -0.192 0.84817
## concavity_se
                          -3.081e+00 1.917e+00 -1.608 0.10882
## `concave points_se`
                           9.357e+00
                                      6.617e+00
                                                 1.414
                                                        0.15828
## symmetry_se
                           7.871e+00
                                      3.456e+00
                                                 2.277
                                                        0.02340 *
## fractal_dimension_se
                          -1.302e+01 1.639e+01 -0.794
                                                        0.42773
                                                 2.496
## radius_worst
                           2.033e-01
                                      8.146e-02
                                                        0.01304 *
                           1.401e-02 8.301e-03
                                                 1.687
                                                        0.09246
## texture_worst
                                                        0.22482
## perimeter_worst
                          -9.516e-03 7.826e-03 -1.216
                          -8.728e-04 5.122e-04 -1.704
## area_worst
                                                        0.08930 .
## smoothness_worst
                           8.510e-02
                                      1.761e+00
                                                 0.048
                                                        0.96149
## compactness_worst
                           3.241e-01 5.578e-01
                                                 0.581
                                                        0.56160
## concavity worst
                           2.779e-01 3.887e-01
                                                 0.715
                                                        0.47519
## `concave points_worst`
                           9.876e-01 1.161e+00
                                                 0.850
                                                        0.39572
## symmetry worst
                          -2.545e-01 6.025e-01 -0.422
                                                        0.67298
## fractal_dimension_worst 7.663e+00 3.326e+00
                                                 2.304 0.02184 *
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.232 on 337 degrees of freedom
## Multiple R-squared: 0.7884, Adjusted R-squared: 0.7696
## F-statistic: 41.86 on 30 and 337 DF, p-value: < 2.2e-16
##
## Call:
## glm(formula = diagnosis ~ ., family = "binomial", data = df.train)
## Deviance Residuals:
                      1Q
                              Median
## -7.138e-05 -2.100e-08 -2.100e-08
                                       2.100e-08
                                                  9.689e-05
##
## Coefficients:
                            Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                          -1.119e+03 1.359e+06 -0.001
                                                          0.999
## radius_mean
                           1.687e+02
                                      3.492e+05
                                                 0.000
                                                          1.000
## texture_mean
                          -5.011e+00 7.406e+03 -0.001
                                                          0.999
## perimeter_mean
                          -1.243e+01 4.432e+04
                                                 0.000
                                                          1.000
## area mean
                          -7.243e-01 2.725e+03
                                                 0.000
                                                          1.000
## smoothness mean
                           1.034e+03
                                      3.243e+06
                                                 0.000
                                                          1.000
## compactness_mean
                          -8.985e+02 3.593e+06
                                                 0.000
                                                          1.000
## concavity_mean
                           2.069e+03 2.645e+06
                                                 0.001
                                                          0.999
## `concave points_mean`
                          -8.579e+02 3.952e+06
                                                 0.000
                                                          1.000
## symmetry_mean
                                                 0.000
                                                          1.000
                           7.357e+01 1.029e+06
## fractal_dimension_mean
                          2.785e+03 9.669e+06
                                                 0.000
                                                         1.000
                                                          1.000
## radius_se
                          -3.781e+02 8.915e+05
                                                 0.000
## texture_se
                          -1.166e+02
                                      8.913e+04 -0.001
                                                          0.999
                           7.782e+01
## perimeter_se
                                      6.248e+04
                                                 0.001
                                                          0.999
## area_se
                           1.222e+00
                                      8.794e+03
                                                 0.000
                                                          1.000
                           9.697e+03 2.109e+07
                                                 0.000
                                                          1.000
## smoothness_se
```

```
## compactness se
                            1.550e+03 4.939e+06
                                                     0.000
                                                              1.000
                            -1.294e+03 4.094e+06
                                                     0.000
                                                              1.000
## concavity_se
## `concave points se`
                                        2.095e+07
                             1.816e+03
                                                     0.000
                                                              1.000
## symmetry_se
                            -1.167e+03 6.000e+06
                                                     0.000
                                                              1.000
## fractal_dimension_se
                            -2.962e+04
                                        7.371e+07
                                                     0.000
                                                              1.000
## radius worst
                                                              1.000
                             3.565e+01 2.494e+05
                                                     0.000
                                                              0.999
## texture worst
                             1.353e+01 7.632e+03
                                                     0.002
## perimeter worst
                            -1.197e+01 6.140e+03
                                                    -0.002
                                                              0.998
## area worst
                             3.430e-01
                                        2.424e+03
                                                     0.000
                                                              1.000
                                                              1.000
## smoothness_worst
                            -1.068e+03
                                        3.669e+06
                                                     0.000
## compactness_worst
                            -2.014e+02
                                        1.299e+06
                                                     0.000
                                                              1.000
## concavity_worst
                                                              1.000
                            -1.157e+02
                                        4.475e+05
                                                     0.000
## `concave points_worst`
                             6.814e+02 1.698e+06
                                                     0.000
                                                              1.000
## symmetry_worst
                                                     0.001
                             4.278e+02 8.251e+05
                                                              1.000
## fractal_dimension_worst 3.088e+03 9.668e+06
                                                     0.000
                                                              1.000
##
##
   (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 4.8482e+02 on 367
                                           degrees of freedom
## Residual deviance: 6.0596e-08 on 337
                                           degrees of freedom
##
  AIC: 62
##
## Number of Fisher Scoring iterations: 25
##
               radius_mean
                                       texture_mean
                                                              perimeter_mean
##
               15748.44212
                                            75.69624
                                                                 13264.43906
##
                 area_mean
                                    smoothness_mean
                                                            compactness_mean
##
                8456.51404
                                           95.32661
                                                                  1537.85717
##
            concavity_mean
                              `concave points_mean`
                                                               symmetry_mean
                                                                    33.87372
##
                1046.81925
                                          539.75379
##
    fractal_dimension_mean
                                          radius_se
                                                                  texture_se
##
                 202.81641
                                         1477.82063
                                                                   150.36683
##
              perimeter_se
                                            area_se
                                                               smoothness_se
##
                 523.96968
                                         1720.22186
                                                                    106.34432
##
            compactness_se
                                       concavity_se
                                                         `concave points_se`
##
                 535.84836
                                          674.75609
                                                                    662.88494
##
               symmetry_se
                               fractal_dimension_se
                                                                radius_worst
##
                  95.34593
                                         1697.15462
                                                                  9311.91355
##
             texture worst
                                    perimeter worst
                                                                  area worst
##
                 172.18668
                                          369.64718
                                                                  9618.43288
##
                                  compactness worst
          smoothness worst
                                                             concavity_worst
##
                                         1883.51196
                 293.49460
                                                                   302.71959
##
    `concave points_worst`
                                     symmetry_worst fractal_dimension_worst
                 243.96246
##
                                           89.87959
                                                                  1819.15228
##
   glm(formula = diagnosis ~ ., family = binomial(link = "logit"),
       data = df.train, trace = F)
##
##
## Deviance Residuals:
          Min
                                Median
                                                 3Q
                                                            Max
                        10
  -7.138e-05 -2.100e-08 -2.100e-08
                                         2.100e-08
                                                      9.689e-05
##
```

```
## Coefficients:
##
                             Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                                                             0.999
                           -1.119e+03 1.359e+06 -0.001
                                                    0.000
## radius_mean
                            1.687e+02 3.492e+05
                                                             1.000
## texture mean
                           -5.011e+00
                                       7.406e+03
                                                   -0.001
                                                             0.999
## perimeter mean
                           -1.243e+01 4.432e+04
                                                    0.000
                                                             1.000
## area mean
                           -7.243e-01 2.725e+03
                                                    0.000
                                                             1.000
## smoothness mean
                            1.034e+03
                                       3.243e+06
                                                    0.000
                                                             1.000
## compactness mean
                           -8.985e+02
                                       3.593e+06
                                                    0.000
                                                             1.000
## concavity_mean
                            2.069e+03
                                       2.645e+06
                                                    0.001
                                                             0.999
## `concave points_mean`
                           -8.579e+02
                                       3.952e+06
                                                    0.000
                                                             1.000
## symmetry_mean
                            7.357e+01
                                       1.029e+06
                                                    0.000
                                                             1.000
## fractal_dimension_mean
                            2.785e+03
                                       9.669e+06
                                                    0.000
                                                             1.000
## radius_se
                           -3.781e+02 8.915e+05
                                                    0.000
                                                             1.000
                                                   -0.001
                                                             0.999
## texture_se
                           -1.166e+02
                                       8.913e+04
## perimeter_se
                            7.782e+01
                                       6.248e+04
                                                    0.001
                                                             0.999
## area_se
                            1.222e+00
                                       8.794e+03
                                                    0.000
                                                             1.000
## smoothness se
                            9.697e+03
                                       2.109e+07
                                                    0.000
                                                             1.000
                                                             1.000
## compactness_se
                            1.550e+03 4.939e+06
                                                    0.000
## concavity se
                           -1.294e+03 4.094e+06
                                                    0.000
                                                             1.000
## `concave points_se`
                            1.816e+03 2.095e+07
                                                    0.000
                                                             1.000
## symmetry se
                                                    0.000
                                                             1.000
                           -1.167e+03 6.000e+06
## fractal_dimension_se
                                                             1.000
                           -2.962e+04 7.371e+07
                                                    0.000
## radius_worst
                            3.565e+01
                                       2.494e+05
                                                    0.000
                                                             1.000
## texture worst
                            1.353e+01 7.632e+03
                                                    0.002
                                                             0.999
## perimeter worst
                           -1.197e+01 6.140e+03
                                                   -0.002
                                                             0.998
## area_worst
                                       2.424e+03
                                                    0.000
                                                             1.000
                            3.430e-01
## smoothness_worst
                           -1.068e+03
                                       3.669e+06
                                                    0.000
                                                             1.000
                                                    0.000
                                                             1.000
## compactness_worst
                           -2.014e+02 1.299e+06
## concavity_worst
                           -1.157e+02
                                       4.475e+05
                                                    0.000
                                                             1.000
## `concave points_worst`
                            6.814e+02
                                       1.698e+06
                                                    0.000
                                                             1.000
## symmetry_worst
                            4.278e+02 8.251e+05
                                                    0.001
                                                             1.000
## fractal_dimension_worst 3.088e+03 9.668e+06
                                                    0.000
                                                             1.000
##
##
   (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 4.8482e+02 on 367
                                          degrees of freedom
## Residual deviance: 6.0596e-08 on 337 degrees of freedom
## AIC: 62
##
## Number of Fisher Scoring iterations: 25
##
               radius mean
                                       texture mean
                                                             perimeter mean
               15748.44212
##
                                           75.69624
                                                                13264.43906
##
                                                           compactness_mean
                 area mean
                                    smoothness mean
##
                8456.51404
                                           95.32661
                                                                 1537.85717
##
            concavity_mean
                              `concave points_mean`
                                                              symmetry_mean
##
                1046.81925
                                          539.75379
                                                                   33.87372
##
   fractal_dimension_mean
                                          radius_se
                                                                 texture_se
##
                 202.81641
                                         1477.82063
                                                                  150.36683
##
              perimeter_se
                                                              smoothness_se
                                            area_se
##
                 523.96968
                                         1720.22186
                                                                  106.34432
##
                                       concavity_se
            compactness_se
                                                         `concave points_se`
##
                                          674.75609
                 535.84836
                                                                  662.88494
```

```
##
                              fractal_dimension_se
                                                             radius worst
               symmetry_se
                                                                9311.91355
##
                 95.34593
                                        1697.15462
                                  perimeter_worst
##
             texture worst
                                                                area worst
##
                 172.18668
                                         369.64718
                                                                9618.43288
##
          smoothness_worst
                                 compactness_worst
                                                           concavity worst
##
                 293.49460
                                       1883.51196
                                                                 302.71959
                                    symmetry_worst fractal_dimension_worst
    `concave points worst`
                 243.96246
                                          89.87959
##
                                                                1819.15228
##
## Call:
## glm(formula = diagnosis ~ concavity_mean + perimeter_se + smoothness_se +
       concavity_se + texture_worst + perimeter_worst + area_worst +
##
       `concave points_worst` + symmetry_worst, family = "binomial",
       data = df.train)
##
##
## Deviance Residuals:
                       1Q
                               Median
                                                          Max
         Min
                                               3Q
## -1.982e-03 -2.000e-08 -2.000e-08
                                        2.000e-08
                                                    2.647e-03
##
## Coefficients:
##
                           Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                          -3212.28
                                    49333.92 -0.065
                           12627.95 195002.93
                                               0.065
                                                          0.948
## concavity_mean
                             660.75
                                     10764.30
                                                0.061
                                                          0.951
## perimeter se
## smoothness se
                          64635.17 935717.40
                                               0.069
                                                          0.945
                          -24581.21 392285.53 -0.063
## concavity se
                                                          0.950
## texture_worst
                            136.11
                                       2100.46
                                                0.065
                                                          0.948
## perimeter_worst
                            -218.98
                                       3352.27 -0.065
                                                          0.948
## area_worst
                                        269.14 0.066
                              17.78
                                                          0.947
## `concave points_worst`
                           22976.17 346316.75
                                               0.066
                                                          0.947
                           12729.76 195183.52 0.065
## symmetry_worst
                                                          0.948
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 4.8482e+02 on 367 degrees of freedom
## Residual deviance: 2.4451e-05 on 358 degrees of freedom
## AIC: 20
##
## Number of Fisher Scoring iterations: 25
##
           concavity_mean
                                                          smoothness_se
                                    perimeter_se
##
                2224.6820
                                       2535.5272
                                                               293.1970
##
                                                        perimeter_worst
             concavity_se
                                   texture_worst
##
                 927.1817
                                       2652.3247
                                                             39019.2171
##
               area_worst `concave points_worst`
                                                         symmetry_worst
               19257.4881
                                       3398.6951
                                                              3983.2079
##
## Call:
## glm(formula = diagnosis ~ texture_mean + compactness_mean + concavity_mean +
##
      radius_se + area_se + smoothness_se + compactness_se + concavity_se +
##
       `concave points_se` + radius_worst + area_worst + compactness_worst +
```

```
##
      symmetry_worst + fractal_dimension_worst, data = df.train)
##
## Deviance Residuals:
       Min
                1Q
                                     3Q
##
                       Median
                                              Max
##
  -0.57997 -0.15296 -0.03476
                                0.14902
##
## Coefficients:
##
                           Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                          -2.6018212 0.2363349 -11.009 < 2e-16 ***
## texture_mean
                          0.0170717 0.0032534
                                               5.247 2.67e-07 ***
## compactness_mean
                         5.261 2.49e-07 ***
## concavity_mean
                           3.2240935 0.6128373
## radius_se
                          0.3925925 0.1904650
                                                 2.061 0.040013 *
## area_se
                         -0.0008786 0.0013780 -0.638 0.524127
## smoothness_se
                          15.3960482 5.3463758
                                                2.880 0.004223 **
## compactness_se
                          -3.8564944
                                     1.7949419
                                                -2.149 0.032351 *
## concavity_se
                         -3.5806993 1.2005270 -2.983 0.003057 **
## `concave points se`
                         15.4361616 4.0337759
                                                 3.827 0.000154 ***
                          0.1626584 0.0215023
                                                7.565 3.40e-13 ***
## radius_worst
## area worst
                          ## compactness_worst
                          0.6501844 0.2625606
                                                 2.476 0.013743 *
## symmetry_worst
                          1.0502906 0.2609726
                                                 4.025 6.99e-05 ***
## fractal_dimension_worst 5.4127475 1.5755455
                                                3.435 0.000662 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for gaussian family taken to be 0.05445245)
##
##
      Null deviance: 85.739 on 367
                                    degrees of freedom
## Residual deviance: 19.222 on 353 degrees of freedom
## AIC: -10.013
##
## Number of Fisher Scoring iterations: 2
##
             texture_mean
                                compactness_mean
                                                         concavity_mean
##
                 1.242884
                                       13.257475
                                                              15.970499
##
                radius_se
                                         area_se
                                                          smoothness_se
##
                17.138708
                                       23.583979
                                                               1.752302
##
           compactness se
                                    concavity se
                                                     `concave points_se`
##
                 6.801459
                                        6.823981
                                                               4.037250
##
             radius worst
                                      area worst
                                                       compactness worst
##
                                       83.556326
                                                              10.574976
                68.319526
##
           symmetry_worst fractal_dimension_worst
##
                 1.795425
                                        4.736530
##
##
  glm(formula = diagnosis ~ radius_mean + perimeter_mean + compactness_mean +
      `concave points_mean` + fractal_dimension_mean + radius_se +
##
      perimeter_se + compactness_se + fractal_dimension_se + texture_worst +
##
##
      perimeter_worst + concavity_worst + symmetry_worst, family = "binomial",
##
      data = df.train)
##
## Deviance Residuals:
```

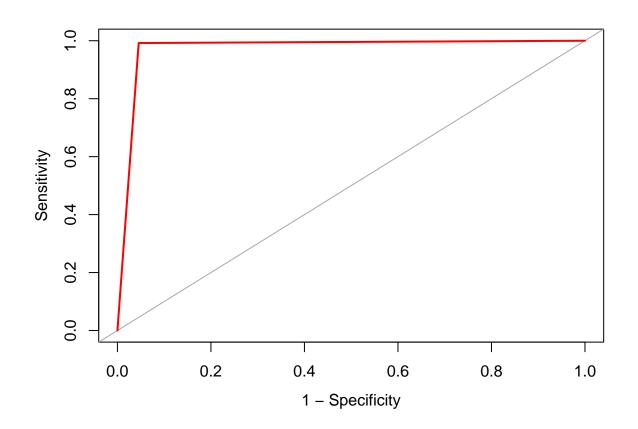
```
##
                          Median
                                                   Max
                    1Q
                                         3Q
## -1.56369
             -0.00022
                         0.00000
                                    0.00000
                                              2.51818
##
## Coefficients:
##
                            Estimate Std. Error z value Pr(>|z|)
                                         55.2772
                                                  -2.050
                                                            0.0403 *
##
  (Intercept)
                           -113.3328
## radius mean
                                                            0.3561
                             12.9620
                                         14.0446
                                                    0.923
## perimeter_mean
                             -2.1005
                                          2.1926
                                                   -0.958
                                                            0.3381
  compactness mean
                           -181.9062
                                        115.1628
                                                   -1.580
                                                            0.1142
  `concave points_mean`
                            469.9835
                                        228.3478
                                                    2.058
                                                            0.0396 *
## fractal_dimension_mean
                            -52.6371
                                        478.6441
                                                   -0.110
                                                            0.9124
## radius_se
                                                    0.575
                             11.1797
                                         19.4267
                                                            0.5650
## perimeter_se
                               2.0698
                                          3.0294
                                                    0.683
                                                            0.4945
                                                   -1.644
                                                            0.1002
## compactness_se
                           -362.8651
                                        220.7315
## fractal_dimension_se
                           2059.0926
                                       1384.5538
                                                    1.487
                                                            0.1370
## texture_worst
                               1.0678
                                          0.4380
                                                    2.438
                                                            0.0148 *
## perimeter_worst
                               0.4992
                                          0.3086
                                                    1.617
                                                            0.1058
  concavity worst
                             28.7160
                                         13.9103
                                                    2.064
                                                            0.0390 *
                                                    2.086
                                                            0.0370 *
## symmetry_worst
                             91.3814
                                         43.8143
##
## Signif. codes:
                    0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
   (Dispersion parameter for binomial family taken to be 1)
##
##
##
       Null deviance: 484.821
                                 on 367
                                         degrees of freedom
## Residual deviance:
                       22.415
                                 on 354
                                         degrees of freedom
   AIC: 50.415
##
## Number of Fisher Scoring iterations: 13
##
              radius_mean
                                    perimeter_mean
                                                          compactness_mean
                2072.09528
                                                                   88.40949
##
                                        2239.85188
##
    `concave points_mean`
                                                                  radius se
                           fractal_dimension_mean
##
                  49.11191
                                          33.62067
                                                                   70.46288
##
             perimeter_se
                                    compactness_se
                                                      fractal_dimension_se
##
                  71.09107
                                         131.23234
                                                                  106.17452
##
            texture_worst
                                   perimeter_worst
                                                           concavity_worst
                                          53.25954
##
                  25.98067
                                                                   38.11723
##
           symmetry_worst
##
                  35.90475
```

Select Model

For the modeling part, I work with 5 different GLM models on model 1 I did stepwise in order to see if I can just select the most significant variables. taking in consideration the AIC results I choose model number 4 because this has the lowest AIC values (29.489) for which means it has the most accurate training modeling.

```
## Confusion Matrix and Statistics
##
## Reference
## Prediction 0 1
## 0 231 11
## 1 1 125
```

```
##
                  Accuracy : 0.9674
##
                    95% CI: (0.9437, 0.983)
##
##
       No Information Rate : 0.6304
       P-Value [Acc > NIR] : < 2.2e-16
##
##
##
                     Kappa: 0.9289
##
##
    Mcnemar's Test P-Value: 0.009375
##
##
               Sensitivity: 0.9957
               Specificity: 0.9191
##
##
            Pos Pred Value: 0.9545
            Neg Pred Value: 0.9921
##
##
                Prevalence: 0.6304
##
            Detection Rate: 0.6277
##
      Detection Prevalence : 0.6576
         Balanced Accuracy: 0.9574
##
##
##
          'Positive' Class : 0
##
```



```
## Data: df.train$diagnosis in 242 controls (df.train$target.pred 0) < 126 cases (df.train$target.pred
## Area under the curve: 0.9733
  Confusion Matrix and Statistics
##
##
             Reference
              0 1
##
  Prediction
            0 70 1
##
            1 1 41
##
##
##
                  Accuracy: 0.9823
##
                    95% CI: (0.9375, 0.9978)
##
       No Information Rate: 0.6283
       P-Value [Acc > NIR] : <2e-16
##
##
##
                     Kappa: 0.9621
##
   Mcnemar's Test P-Value : 1
##
##
##
               Sensitivity: 0.9859
               Specificity: 0.9762
##
##
            Pos Pred Value: 0.9859
##
            Neg Pred Value: 0.9762
##
                Prevalence: 0.6283
            Detection Rate: 0.6195
##
##
      Detection Prevalence: 0.6283
##
         Balanced Accuracy: 0.9811
##
##
          'Positive' Class : 0
##
## [1] 1 1 1 1 1 1
```

[1] 0.5224567 0.9463788 0.7905980 1.0065903 0.5402072 1.1607534

Discussion and Conclusion

As the final result, we conclude with a Glm model for which prediction rates of 95 %. we see that the most significant variables such as (texture_mean,compactness_mean,radius_worst,area_worst) to mention some has a big impact of diagnosed breast cancer by jus observing the cancer cell shape and dimensions. To further this analysis work could be very interesting to compare with other datasets or biggest numbers of observations dataset that contains other predictors variables such as (Age, countries, alcohol, etc) to have a more understanding of this illness.

References

1. Carol E. DeSantis MPH Jiemin Ma PhD Ann Goding Sauer MSPH Lisa A. Newman MD, MPH Ahmedin Jemal DVM, PhD, (03 October 2017). Retrieved from https://acsjournals.onlinelibrary.wiley.com/doi/full/10.3322/caac.21412

2. Madhu Kumaria, Vijendra Singhb (2018) Breast Cancer Prediction system, retireved from https: //pdf.science direct assets.com/280203/1-s2.0-S1877050918X00088/1-s2.0-S1877050918309323/main.2FwEaCXVzLWVhc3QtMSJHMEUCICTgNtCQXc%2FkfBPOwflkLlcuvmzEFHbFbfT4N5AyRvzRAiEAvpGq4DgUM 2BBAMgbmwkfBqbTDNbKCMkSUEnEZQTjY8eAqtAMISRADGgwwNTkwMDM1NDY4NjUiDCmf1UEGQgOS1Z%2BxrX85x2Dsb1OMCQwig%2FPr4VQe1ZWoPuX1zrmGHRdwLktlUsW1lCBxVCtsZlXkOfj3cUzMky9% 2BB5u74hswWYiGUcMKibNsE4HnqQJteeC1FxKFvHpBuzDlsc1ykKqAEYHCGWDdbBKojOOaDqL2R3gbdjOYPUy 2BfNIk53DDAZatcywb%2BFLK6OUgHlZtWnWUQ6iB1Ztv1afgrtDDMufEFuISoI23Vy3sOAYXX% 2F4bVTWiG5tPZipODwq0Kr%2BfZOm07X27CNAxwOjecXTfcuYfMLAmlwIhbQNfF13CcA4r4F0r% + 2F4bVTWiG5tPZipODwq0Kr%2BfZOm07X27CNAxwOjecXTfcuYfMLAmlwIhbQNfF13CcA4r4F0rW + 2F4bVTWiG5tPZipODwq0Kr%2BfZOm07X27CNAxwOjecXTfcuYfMLAmlwIhbQNfF13CcA4r4F0rW + 2F4bVTWiG5tPZipODwq0Ar4F0rW + 2F4bVTWiG5tPQAr4F0rW + 2F42FWP2U3bYyh13uLkQ9UnAVGIkHOKflYYTblJJmx2I2YKjr0jstpIZBMz1Bx7A4QpshwFvjKOayZT104OmmY%2 BibjZY1u0%2 FgVG69jEhlRLtKlZtk5y02 OScOfRQR8cSx%2 Fj9H%2 Fqc6FolOOazFY%2 BK2zO9oBzYIW6k0 peJi96yM2 Fqc6FolOOazFYM2 Fqc6F2FWQtuC%2BIW5WUHHM0le%2Ftk40m2kCMuwuvdECybybqlE72ONgXxF3WjQMFed8taflbhHIfJE6dkAahYHJSE SignedHeaders=host&X-Amz-Expires=300&X-Amz-Credential=ASIAQ3PHCVTYZMTOQFXP%

3. Dataset source retrieved from Kaggle/ UCI

 $. https://www.kaggle.com/vikasp/loadpred \\ . https://archive.ics.uci.edu/ml/datasets/Breast+Cancer+Wisconsin+\%28 Diagnostic\%29$

Appendix

```
knitr::opts_chunk$set(echo=FALSE)

library(caret)
library(dplyr)
library(sych)
library(tidyr)
library(tidyr)
library(ggplot2)
library(tidyverse)
library(DataExplorer)
library(RColorBrewer)
library(Amelia)
library(MASS)
library(car)
library(pROC)
data <- read_csv('data.csv')[,c(-1,-33)]
```

```
index <- data$diagnosis %>% createDataPartition(p = 0.8, list = FALSE, times = 1)
df <- data[index,]</pre>
eval.data <- data[-index,] # for final evaluation data</pre>
df$diagnosis <- ifelse(df$diagnosis=="M",1,0)</pre>
diagnosis <- data.matrix(df[,2])</pre>
index2 <- diagnosis %>% createDataPartition(p = 0.8, list = FALSE, times = 1)
df.train <- df[index2,]</pre>
df.test <- df[-index2,]</pre>
diagnosis.train <- diagnosis[index2,]</pre>
diagnosis.test <- diagnosis[-index2,]</pre>
str(df.train)
summary(df.train)
missmap(data)
plot histogram(df.train)
plt <- df.train %>% group_by(diagnosis) %>% count()
plt <- as.data.frame(plt)</pre>
p <- ggplot(data=plt, aes(x=diagnosis, y=n)) +</pre>
  geom_bar(stat="identity", fill="steelblue")
ggplot(data = reshape2::melt(df.train) , aes(x=variable, y=value)) +
  geom_boxplot(outlier.colour="green", outlier.shape=4, outlier.size=4,aes(fill=variable)) +
  coord_flip()
corrplot(cor(df.train, use = "na.or.complete"), type="lower",
         col=brewer.pal(n=12, name="PiYG"))
model0 <- lm(diagnosis ~.,data = df.train)</pre>
summary(model0)
model1 <- glm(diagnosis ~., data = df.train,family = 'binomial')</pre>
summary(model1)
vif(model1)
model2 <- glm(diagnosis ~.,data = df.train, family = binomial(link = "logit"), trace = F)</pre>
summary(model2)
vif(model2)
model3 <- stepAIC(model1, trace = F)</pre>
summary(model3)
```

```
vif(model3)
model4 <- glm(formula = diagnosis ~ texture_mean + compactness_mean + concavity_mean +
   radius_se + area_se + smoothness_se + compactness_se + concavity_se +
    `concave points_se` + radius_worst + area_worst + compactness_worst +
    symmetry_worst + fractal_dimension_worst, data = df.train)
summary(model4)
vif(model4)
model5 <- glm(formula = diagnosis ~ radius_mean + perimeter_mean + compactness_mean +
    `concave points_mean` + fractal_dimension_mean + radius_se +
   perimeter_se + compactness_se + fractal_dimension_se + texture_worst +
   perimeter_worst + concavity_worst + symmetry_worst, family = "binomial",
   data = df.train)
summary(model5)
vif(model5)
model4 <- glm(formula = diagnosis ~ texture_mean + compactness_mean + concavity_mean +</pre>
   radius_se + area_se + smoothness_se + compactness_se + concavity_se +
    `concave points_se` + radius_worst + area_worst + compactness_worst +
    symmetry_worst + fractal_dimension_worst, data = df.train)
df.train$pred <- predict(model4, df.train, interval="response")</pre>
df.train$target.pred<- ifelse(df.train$pred >= 0.5, 1, 0)
confusionMatrix(factor(df.train$target.pred),factor(df.train$diagnosis))
roc.value <- roc(df.train$target.pred, df.train$diagnosis, plot=TRUE, asp=NA,
                legacy.axes=TRUE, col="red")
roc.value
## Test model with evaluation data
eval.data$diagnosis <- ifelse(eval.data$diagnosis=="M",1,0)
eval.data$pre <- predict(model4, newdata = eval.data, interval="response")
eval.data$target.pred <- ifelse(eval.data$pre >= 0.5, 1, 0)
```

```
confusionMatrix(factor(eval.data$target.pred),factor(eval.data$diagnosis))
head(eval.data$target.pred)
head(eval.data$pre)
library(caret)
library(dplyr)
library(psych)
library(corrplot)
library(tidyr)
library(ggplot2)
library(tidyverse)
library(DataExplorer)
library(RColorBrewer)
library(Amelia)
library(MASS)
library(car)
library(pROC)
data <- read_csv('data.csv')[,c(-1,-33)]</pre>
index <- data$diagnosis %% createDataPartition(p = 0.8, list = FALSE, times = 1)</pre>
df <- data[index,]</pre>
eval.data <- data[-index,] # for final evaluation data</pre>
df$diagnosis <- ifelse(df$diagnosis=="M",1,0)</pre>
diagnosis <- data.matrix(df[,2])</pre>
index2 <- diagnosis %>% createDataPartition(p = 0.8, list = FALSE, times = 1)
df.train <- df[index2,]</pre>
df.test <- df[-index2,]</pre>
diagnosis.train <- diagnosis[index2,]</pre>
diagnosis.test <- diagnosis[-index2,]</pre>
str(df.train)
summary(df.train)
missmap(data)
plot_histogram(df.train)
plt <- df.train %>% group_by(diagnosis) %>% count()
```

```
plt <- as.data.frame(plt)</pre>
p <- ggplot(data=plt, aes(x=diagnosis, y=n)) +</pre>
  geom_bar(stat="identity", fill="steelblue")
ggplot(data = reshape2::melt(df.train) , aes(x=variable, y=value)) +
  geom boxplot(outlier.colour="green", outlier.shape=4, outlier.size=4,aes(fill=variable)) +
  coord_flip()
corrplot(cor(df.train, use = "na.or.complete"), type="lower",
         col=brewer.pal(n=12, name="PiYG"))
model0 <- lm(diagnosis ~.,data = df.train)</pre>
summary(model0)
model1 <- glm(diagnosis ~., data = df.train,family = 'binomial')</pre>
summary(model1)
vif(model1)
model2 <- glm(diagnosis ~.,data = df.train, family = binomial(link = "logit"), trace = F)</pre>
summarv(model2)
vif(model2)
model3 <- stepAIC(model1, trace = F)</pre>
summary(model3)
vif(model3)
model4 <- glm(formula = diagnosis ~ texture_mean + compactness_mean + concavity_mean +</pre>
    radius_se + area_se + smoothness_se + compactness_se + concavity_se +
    `concave points_se` + radius_worst + area_worst + compactness_worst +
    symmetry_worst + fractal_dimension_worst, data = df.train)
summary(model4)
vif(model4)
model5 <- glm(formula = diagnosis ~ radius_mean + perimeter_mean + compactness_mean +
    `concave points_mean` + fractal_dimension_mean + radius_se +
    perimeter_se + compactness_se + fractal_dimension_se + texture_worst +
    perimeter_worst + concavity_worst + symmetry_worst, family = "binomial",
    data = df.train)
summary(model5)
vif(model5)
```

```
model4 <- glm(formula = diagnosis ~ texture_mean + compactness_mean + concavity_mean +</pre>
    radius_se + area_se + smoothness_se + compactness_se + concavity_se +
    `concave points_se` + radius_worst + area_worst + compactness_worst +
    symmetry_worst + fractal_dimension_worst, data = df.train)
df.train$pred <- predict(model4, df.train, interval="response")</pre>
df.train$target.pred<- ifelse(df.train$pred >= 0.5, 1, 0)
confusionMatrix(factor(df.train$target.pred),factor(df.train$diagnosis))
roc.value <- roc(df.train$target.pred, df.train$diagnosis, plot=TRUE, asp=NA,
                legacy.axes=TRUE, col="red")
roc.value
## Test model with evaluation data
eval.data$diagnosis <- ifelse(eval.data$diagnosis=="M",1,0)
eval.data$pre <- predict(model4, newdata = eval.data, interval="response")</pre>
eval.data$target.pred <- ifelse(eval.data$pre >= 0.5, 1, 0)
confusionMatrix(factor(eval.data$target.pred),factor(eval.data$diagnosis))
head(eval.data$target.pred)
head(eval.data$pre)
```