```
Breast Cancer Prediction with R
                                                                                                   Code ▼
                                                                                                     Hide
 data <- read.csv("breast cancer.csv", header=FALSE, sep=",")</pre>
 str(data)
 'data.frame':
               699 obs. of 11 variables:
 $ V1 : int 1000025 1002945 1015425 1016277 1017023 1017122 1018099 1018561 1033078 1033078 ...
 $ V2: int 5536481224...
 $ V3 : int 1 4 1 8 1 10 1 1 1 2 ...
 $ V4: int 14181101211...
 $ V5: int 1511381111...
 $ V6: int 272327222...
 $ V7 : chr "1" "10" "2" "4" ...
 $ V8: int 3 3 3 3 3 9 3 3 1 2 ...
 $ V9: int 1217171111...
 $ V10: int 1 1 1 1 1 1 1 5 1 ...
 $
 Error in gregexpr(calltext, singleline, fixed = TRUE) :
  regular expression is invalid UTF-8
 Error in gregexpr(calltext, singleline, fixed = TRUE) :
  regular expression is invalid UTF-8
 Error in gregexpr(calltext, singleline, fixed = TRUE) :
  regular expression is invalid UTF-8
 V11: int 2 2 2 2 2 4 2 2 2 2 ...
                                                                                                     Hide
 head(data)
                       V1
                                 V2
                                          V3
                                                    V4
                                                             V5
                                                                       V6 V7
                                                                                         V8
                                                                                                   V9
                      <int>
                               <int>
                                                  <int>
                                                                     <int> <chr>
                                                                                        <int>
                                                                                                 <int>
                                         <int>
                                                            <int>
                                  5
                                                                                           3
 1
                   1000025
                                                     1
                                                                        2 1
                                                                                                    1
                                           1
                                                              1
 2
                                  5
                                           4
                                                                                           3
                   1002945
                                                     4
                                                              5
                                                                        7 10
                                                                                                    2
 3
                   1015425
                                  3
                                           1
                                                     1
                                                              1
                                                                        2 2
                                                                                           3
                                                                                                    1
                                                                                           3
                                                                                                    7
 4
                   1016277
                                  6
                                           8
                                                     8
                                                                        3 4
                                                              1
 5
                                  4
                                                              3
                                                                                           3
                   1017023
                                           1
                                                     1
                                                                        2 1
                                                                                                    1
                                                                                                    7
 6
                   1017122
                                  8
                                          10
                                                    10
                                                              8
                                                                        7 10
                                                                                           9
6 rows | 1-10 of 11 columns
                                                                                                     Hide
 summary(data)
                        V2
                                       ٧3
                                                       V4
                  Min. : 1.000 Min. : 1.000
                                                 Min. : 1.000
 Min. :
           61634
 1st Qu.: 870688
                  1st Qu.: 2.000
                                  1st Qu.: 1.000
                                                 1st Qu.: 1.000
 Median : 1171710
                  Median : 4.000
                                  Median : 1.000
                                                 Median : 1.000
  Mean : 1071704
                   Mean : 4.418
                                  Mean : 3.134
                                                 Mean : 3.207
                                  3rd Qu.: 5.000
 3rd Qu.: 1238298
                   3rd Qu.: 6.000
                                                 3rd Qu.: 5.000
  Max. :13454352
                   Max. :10.000
                                  Max. :10.000
                                                 Max. :10.000
       V5
                      V6
                                    V7
                                                      ٧8
  Min. : 1.000
                                                 Min. : 1.000
                Min. : 1.000
                                Length:699
 1st Qu.: 1.000
                 1st Qu.: 2.000
                                Class :character
                                                 1st Qu.: 2.000
  Median : 1.000
                 Median : 2.000
                                Mode :character
                                                 Median : 3.000
 Mean : 2.807
                 Mean : 3.216
                                                 Mean : 3.438
  3rd Qu.: 4.000
                 3rd Qu.: 4.000
                                                 3rd Qu.: 5.000
                 Max. :10.000
                                                 Max. :10.000
  Max. :10.000
       V9
                     V10
                                     V11
 Min. : 1.000 Min. : 1.000
                                Min. :2.00
 1st Qu.: 1.000
                 1st Qu.: 1.000
                                1st Qu.:2.00
 Median : 1.000
                 Median : 1.000 Median :2.00
  Mean : 2.867
                                Mean :2.69
                 Mean : 1.589
                                3rd Qu.:4.00
 3rd Qu.: 4.000
                 3rd Qu.: 1.000
                 Max. :10.000
                              Max. :4.00
  Max. :10.000
                                                                                                     Hide
 names(data) <- c('Id','Cl_thickness','Cell_size','Cell_shape','Marg_adhesion','Epith_c_size','Bare_nuclei','Bl_cr</pre>
 omat','Normal_nucleoli','Mitoses','Class')
 data$Class[data$Class == 2] = 0
 data\Class[data\Class == 4] = 1
                                                                                                     Hide
 summary(data)
                   Cl_thickness
       Ιd
                                    Cell_size
                                                   Cell_shape
  Min. :
                   Min. : 1.000 Min. : 1.000
           61634
                                                 Min. : 1.000
 1st Qu.: 870688
                  1st Qu.: 2.000
                                  1st Qu.: 1.000
                                                 1st Qu.: 1.000
 Median : 1171710
                  Median : 4.000
                                  Median : 1.000
                                                 Median : 1.000
 Mean : 1071704
                  Mean : 4.418
                                  Mean : 3.134
                                                 Mean : 3.207
 3rd Qu.: 1238298
                  3rd Qu.: 6.000
                                  3rd Qu.: 5.000
                                                 3rd Qu.: 5.000
 Max. :13454352 Max. :10.000
                                  Max. :10.000
                                                 Max. :10.000
                                                 Bl_cromat
 Marg_adhesion
                  Epith_c_size
                                Bare_nuclei
 Min. : 1.000
                 Min. : 1.000
                                Length:699
                                                 Min. : 1.000
 1st Qu.: 1.000
                 1st Qu.: 2.000
                                Class :character
                                                 1st Qu.: 2.000
 Median : 1.000
                 Median : 2.000
                                Mode :character
                                                 Median : 3.000
 Mean : 2.807
                 Mean : 3.216
                                                 Mean : 3.438
 3rd Qu.: 4.000
                 3rd Qu.: 4.000
                                                 3rd Qu.: 5.000
 Max. :10.000
                 Max. :10.000
                                                 Max. :10.000
 Normal_nucleoli
                  Mitoses
                                    Class
 Min. : 1.000 Min. : 1.000 Min. :0.0000
 1st Qu.: 1.000
                1st Qu.: 1.000 1st Qu.:0.0000
 Median : 1.000
                 Median : 1.000
                                Median :0.0000
                 Mean : 1.589
 Mean : 2.867
                                Mean :0.3448
 3rd Qu.: 4.000
                 3rd Qu.: 1.000
                                3rd Qu.:1.0000
  Max. :10.000
                 Max. :10.000 Max. :1.0000
                                                                                                     Hide
 sum(data == '?')
 [1] 16
                                                                                                     Hide
 data[data == '?'] <- 0
 data$Bare_nuclei <- as.numeric(data$Bare_nuclei)</pre>
 data$Bare_nuclei[data$Bare_nuclei == 0 ] <- mean(data$Bare_nuclei, na.rm =TRUE)</pre>
                                                                                                     Hide
 data$Id <- NULL
 str(data)
 'data.frame':
               699 obs. of 10 variables:
 $ Cl_thickness : int 5 5 3 6 4 8 1 2 2 4 ...
             : int 14181101112...
 $ Cell_size
 $ Cell_shape : int 1 4 1 8 1 10 1 2 1 1 ...
 $ Marg_adhesion : int 1511381111...
 $ Epith_c_size : int 2 7 2 3 2 7 2 2 2 2 ...
 $ Bare_nuclei : num 1 10 2 4 1 10 10 1 1 1 ...
 $ Bl_cromat
             : int 3333393312...
 $ Normal_nucleoli: int 1217171111...
 $ Mitoses : int 1 1 1 1 1 1 1 5 1 ...
 $ Class
                : num 0000010000...
                                                                                                     Hide
 summary(data)
  Cl_thickness
                   Cell_size
                                  Cell_shape
                                               Marg_adhesion
  Min. : 1.000
                Min. : 1.000
                                Min. : 1.000
                                               Min. : 1.000
 1st Qu.: 2.000    1st Qu.: 1.000    1st Qu.: 1.000
                                               1st Qu.: 1.000
 Median : 4.000 Median : 1.000 Median : 1.000
                                               Median : 1.000
 Mean : 4.418 Mean : 3.134 Mean : 3.207
                                               Mean : 2.807
                                               3rd Qu.: 4.000
 3rd Qu.: 6.000 3rd Qu.: 5.000 3rd Qu.: 5.000
 Max. :10.000 Max. :10.000 Max. :10.000 Max. :10.000
  Epith_c_size
                 Bare_nuclei
                                Bl_cromat
                                               Normal_nucleoli
 Min. : 1.000 Min. : 1.000 Min. : 1.000 Min. : 1.000
 1st Qu.: 2.000
                 Median : 2.000 Median : 1.000 Median : 3.000 Median : 1.000
 Mean : 3.216 Mean : 3.543 Mean : 3.438 Mean : 2.867
 3rd Qu.: 4.000 3rd Qu.: 5.000 3rd Qu.: 5.000 3rd Qu.: 4.000
 Max. :10.000 Max. :10.000
                               Max. :10.000 Max. :10.000
                  Class
    Mitoses
 Min. : 1.000 Min. :0.0000
 1st Qu.: 1.000 1st Qu.:0.0000
 Median : 1.000 Median :0.0000
 Mean : 1.589 Mean :0.3448
 3rd Qu.: 1.000 3rd Qu.:1.0000
 Max. :10.000 Max. :1.0000
                                                                                                     Hide
 library(caTools)
 set.seed(123)
 split=sample.split(data, SplitRatio = 0.8)
 training_set=subset(data, split==TRUE)
 test_set=subset(data, split==FALSE)
 dim(training_set)
 [1] 559 10
                                                                                                     Hide
 training_set[,1:9] = scale(training_set[,1:9])
 test_set[,1:9] = scale(test_set[,1:9])
                                                                                                     Hide
 Classifier = glm(formula = Class ~ .,
                family = binomial,
                data = training_set)
                                                                                                     Hide
 prob_pred = predict(Classifier, type = 'response', newdata = test_set[1:9])
 prob_pred
                              15
 0.038800843\ 0.010011047\ 0.999875910\ 0.022122579\ 0.004326489\ 0.026918754
                              45
                                         48
 0.012214239 \ 0.222147240 \ 0.999019664 \ 0.003056325 \ 0.999349755 \ 0.869301407
                        75
                                         78
 0.003056325 \ 0.962959991 \ 0.962447877 \ 0.043209554 \ 0.999821609 \ 0.996978797
                   98 105 108
 0.007474883 \ 0.037730478 \ 0.999991536 \ 0.995008064 \ 0.048630123 \ 0.999909901
 0.997359324 \ 0.012884720 \ 0.009682919 \ 0.006455280 \ 0.005285325 \ 0.005003077
                  158 165 168
 0.002158245 \ 0.007474883 \ 0.102711084 \ 0.999937986 \ 0.997478333 \ 0.976448474
                  188 195 198
 0.997731560\ 0.9999999255\ 0.012884720\ 0.085469008\ 0.004326489\ 0.004075962
             218 225 228
 0.999996563 \ 0.004326489 \ 0.999892682 \ 0.998523034 \ 0.035920270 \ 0.997810358
             248 255 258
 0.004326489\ 0.963479042\ 0.998047967\ 0.009125070\ 0.994939724\ 0.936990556
                  278
                             285 288
 0.014202821 \ 0.003056325 \ 0.999083117 \ 0.009682919 \ 0.008870513 \ 0.193330979
                             315 318
 0.997485950 \ 0.004326489 \ 0.002879135 \ 0.999512587 \ 0.004326489 \ 0.003056325
                  338 345 348
 0.997457016 \ 0.004326489 \ 0.999881243 \ 0.002475756 \ 0.003056325 \ 0.999997191
                  368 375 378
 0.007474883\ 0.999941252\ 0.012214239\ 0.002879135\ 0.003734723\ 0.109154654
                  398 405 408 415
 0.006073169\ 0.011135473\ 0.004687212\ 0.003056325\ 0.997738218\ 0.003056325
             428 435 438
 0.006455280 \ 0.970863924 \ 0.991087299 \ 0.011135473 \ 0.111043267 \ 0.019143511
             458 465 468
 0.004840716\ 0.999362988\ 0.011135473\ 0.998897357\ 0.019143511\ 0.011135473
                  488 495 498
 0.025536879 \ 0.999998387 \ 0.763531146 \ 0.012295840 \ 0.002158245 \ 0.007910529
                  518 525 528
 0.999902456 \ 0.002879135 \ 0.009125070 \ 0.022122579 \ 0.005285325 \ 0.050014819
                  548 555 558
 0.012634610 \ 0.003518342 \ 0.006455280 \ 0.033653140 \ 0.024362386 \ 0.036691925
             578 585 588
 0.994529946\ 0.003056325\ 0.080991836\ 0.029629437\ 0.987811123\ 0.066024291
                             615 618
 0.996177046 \ 0.002158245 \ 0.004979554 \ 0.005912059 \ 0.033633440 \ 0.020902428
                             645 648 655
 0.006455280 \ 0.105338463 \ 0.003734723 \ 0.003844525 \ 0.012884720 \ 0.287808475
 0.016166478\ 0.012884720\ 0.003056325\ 0.019143511\ 0.002158245\ 0.011095114
 0.010544126 0.972222443
                                                                                                     Hide
 y_pred = ifelse(prob_pred > 0.5, 1, 0)
 y_pred
            18 25 28 35 38 45 48 55 58 65 68 75 78 85 88
            98 105 108 115 118 125 128 135 138 145 148 155 158 165 168 175 178 185 188
  0 1 1 0 1 1 0 0 0 0 0 0
                                                 0 1 1 1 1
 195 198 205 208 215 218 225 228 235 238 245 248 255 258 265 268 275 278 285
  288 295 298 305 308 315 318 325 328 335 338 345 348 355 358 365 368 375 378
                              0
                                 1
 385 388 395 398 405 408 415 418 425 428 435 438 445 448 455 458 465 468 475
        0 0 0
                    0 1 0 0 1 1 0 0 0 0
 478 485 488 495 498 505 508 515 518 525 528 535 538 545 548 555 558 565 568
            1 0 0 0 1 0 0 0 0 0 0
 575 578 585 588 595 598 605 608 615 618 625 628 635 638 645 648 655 658 665
        668 675 678 685 688 695 698
  0 0 0 0 0
                                                                                                     Hide
 cm = table(test_set[,10], y_pred)
   y_pred
     0 1
  0 96 2
  1 0 42
                                                                                                     Hide
 accuracy = (cm[1,1] + cm[2,2]/(cm[1,1] + cm[2,2] + cm[1,2] + cm[2,1]))
 accuracy
 [1] 96.3
                                                                                                     Hide
 library(caret)
 Loading required package: lattice
 Loading required package: ggplot2
 Registered S3 method overwritten by 'data.table':
  method
                  from
  print.data.table
                                                                                                     Hide
 folds = createFolds(training_set$Class, k = 10)
 CrossValidation = lapply(folds, function(x){
  training_fold = training_set[-x,] # taking all the training set but without the fold
  test_fold = training_set[x,]
  Classifier = glm(formula = Class \sim .,
                  family = binomial,
                  data = training_fold)
  prob_pred = predict(Classifier, type = 'response', newdata = test_fold[1:9])
  y_pred = ifelse(prob_pred > 0.5, 1, 0)
  cm = table(test_fold[,10], y_pred)
  accuracy = ((cm[1,1] + cm[2,2])/(cm[1,1] + cm[2,2] + cm[1,2] + cm[2,1]))
  return(accuracy)
 })
 CrossValidation
 $Fold01
 [1] 0.9821429
 $Fold02
 [1] 0.9821429
 $Fold03
 [1] 0.9821429
 $Fold04
 [1] 0.9642857
 $Fold05
 [1] 0.9107143
 $Fold06
 [1] 0.9464286
 $Fold07
 [1] 0.9818182
 $Fold08
 [1] 0.9464286
 $Fold09
 [1] 0.9642857
 $Fold10
 [1] 0.9821429
                                                                                                     Hide
 accuracies = mean(as.numeric(CrossValidation))
 accuracies
 [1] 0.9642532
                                                                                                     Hide
 library(caret)
 classifier = train(form = as.factor(Class) ~ ., data = training_set, method='glm')
 classifier
 Generalized Linear Model
 559 samples
  9 predictor
  2 classes: '0', '1'
 No pre-processing
 Resampling: Bootstrapped (25 reps)
 Summary of sample sizes: 559, 559, 559, 559, 559, ...
 Resampling results:
            Kappa
  Accuracy
  0.9512439 0.8926616
                                                                                                     Hide
 classifier$bestTune
            parameter
            <chr>
 1
            none
1 row
                                                                                                     Hide
 summary(Classifier)
 Call:
 glm(formula = Class ~ ., family = binomial, data = training_set)
 Deviance Residuals:
    Min
             1Q Median
 -3.1991 -0.1547 -0.0718 0.0297 2.2621
 Coefficients:
               Estimate Std. Error z value Pr(>|z|)
 (Intercept)
               0.2892 0.6459 0.448 0.654360
 Cell_size
              0.8320 0.6726 1.237 0.216104
 Cell_shape
 Marg_adhesion 0.8626 0.3897 2.214 0.026858 *
 Epith_c_size 0.1314 0.3666 0.358 0.719992
 Bare_nuclei 1.5123 0.3676 4.113 3.9e-05 ***
                 0.8234 0.4189 1.966 0.049319 *
 Bl_cromat
 Normal_nucleoli 0.2803 0.3297 0.850 0.395298
 Mitoses
              0.7276 0.5501 1.323 0.185983
 Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
 (Dispersion parameter for binomial family taken to be 1)
    Null deviance: 727.9 on 558 degrees of freedom
 Residual deviance: 103.0 on 549 degrees of freedom
 AIC: 123
 Number of Fisher Scoring iterations: 8
                                                                                                     Hide
 summ = summary(Classifier)
 p_values = summ$coefficients[,4]
 p_values = p_values[p_values>0.5]
 imp_cols = names(p_values)
 imp_cols
 [1] "Cell_size"
                  "Epith_c_size"
                                                                                                     Hide
 set = data
 plot(set)
            2 6
                                     2 6
                                                 2 6
                                                             0.0
```

arg_adhesic

Mitoses ______