Popularity_of_Music_Records.R

Suchitra

songs = read.csv("songs.csv")
str(songs)

```
## 'data.frame': 7574 obs. of 39 variables:
## $ year
                            ## $ songtitle
                            : Factor w/ 7141 levels "'03 Bonnie & Clyde",..: 6204 5522 241 309
8 47 607 254 4419 2887 6756 ...
## $ artistname
                            : Factor w/ 1032 levels "50 Cent", "98 Degrees", ...: 3 3 3 3 3 3 3 3
 3 12 ...
## $ songID
                            : Factor w/ 7549 levels "SOAACNI1315CD4AC42",..: 595 5439 5252 171
6 3431 1020 1831 3964 6904 2473 ...
## $ artistID
                            : Factor w/ 1047 levels "AR00B1I1187FB433EB",..: 671 671 671 671 6
71 671 671 671 671 507 ...
## $ timesignature
                            : int 3 4 4 4 4 4 4 4 4 ...
## $ timesignature_confidence: num 0.853 1 1 1 0.788 1 0.968 0.861 0.622 0.938 ...
## $ loudness
                            : num -4.26 -4.05 -3.57 -3.81 -4.71 ...
## $ tempo
                            : num 91.5 140 160.5 97.5 140.1 ...
                            : num 0.953 0.921 0.489 0.794 0.286 0.347 0.273 0.83 0.018 0.929
## $ tempo confidence
 . . .
## $ key
                            : int 11 10 2 1 6 4 10 5 9 11 ...
                            : num 0.453 0.469 0.209 0.632 0.483 0.627 0.715 0.423 0.751 0.602
## $ key confidence
                            : num 0.967 0.985 0.99 0.939 0.988 ...
## $ energy
## $ pitch
                            : num 0.024 0.025 0.026 0.013 0.063 0.038 0.026 0.033 0.027 0.004
## $ timbre_0_min
                            : num 0.002 0 0.003 0 0 ...
## $ timbre 0 max
                            : num 57.3 57.4 57.4 57.8 56.9 ...
                                  -6.5 -37.4 -17.2 -32.1 -223.9 ...
## $ timbre_1_min
                            : num
                                  171 171 171 221 171 ...
## $ timbre 1 max
                            : num
## $ timbre_2_min
                                  -81.7 -149.6 -72.9 -138.6 -147.2 ...
                            : num
## $ timbre 2 max
                            : num 95.1 180.3 157.9 173.4 166 ...
                                  -285 -380.1 -204 -73.5 -128.1 ...
##
  $ timbre_3_min
                            : num
## $ timbre_3_max
                            : num 259 384 251 373 389 ...
##
  $ timbre_4_min
                            : num
                                  -40.4 -48.7 -66 -55.6 -43.9 ...
## $ timbre 4 max
                            : num 73.6 100.4 152.1 119.2 99.3 ...
## $ timbre_5_min
                                  -104.7 -87.3 -98.7 -77.5 -96.1 ...
                            : num
## $ timbre 5 max
                            : num 183.1 42.8 141.4 141.2 38.3 ...
  $ timbre_6_min
                            : num -88.8 -86.9 -88.9 -70.8 -110.8 ...
  $ timbre 6 max
                            : num 73.5 75.5 66.5 64.5 72.4 ...
##
## $ timbre 7 min
                            : num -71.1 -65.8 -67.4 -63.7 -55.9 ...
##
  $ timbre_7_max
                            : num 82.5 106.9 80.6 96.7 110.3 ...
## $ timbre 8 min
                            : num -52 -61.3 -59.8 -78.7 -56.5 ...
                                  39.1 35.4 46 41.1 37.6 ...
## $ timbre_8_max
                            : num
## $ timbre 9 min
                                  -35.4 -81.9 -46.3 -49.2 -48.6 ...
                            : num
##
  $ timbre 9 max
                            : num 71.6 74.6 59.9 95.4 67.6 ...
##
   $ timbre 10 min
                                  -126.4 -103.8 -108.3 -102.7 -52.8 ...
                            : num
## $ timbre_10_max
                            : num
                                  18.7 121.9 33.3 46.4 22.9 ...
                                  -44.8 -38.9 -43.7 -59.4 -50.4 ...
## $ timbre 11 min
                            : num
                            : num 26 22.5 25.7 37.1 32.8 ...
## $ timbre_11_max
## $ Top10
                            : int 0000000001...
```

```
View(head(songs))
#number of observations (songs) from the year 2010
songs_2010 = subset(songs, year == 2010)
nrow(songs_2010)
## [1] 373
#songs of Michael Jackson
songs mj = subset (songs, artistname =="Michael Jackson")
nrow(songs mj)
## [1] 18
View(songs_mj)
table(songs$timesignature)
##
##
                               7
      0
           1
                3
                     4
                          5
##
     10 143 503 6787 112
                              19
#song with the highest tempo
which.max(songs$tempo)
## [1] 6206
songs[6206,]
##
                               songtitle
                                              artistname
        year
## 6206 1995 Wanna Be Startin' Somethin' Michael Jackson SONHIQM13738B7BE80
                  artistID timesignature timesignature confidence loudness
##
                                                                 1 -14.528
## 6206 ARXPPEY1187FB51DF4
          tempo tempo_confidence key key_confidence
##
                                                        energy pitch
## 6206 244.307
                           0.566
                                                0.44 0.6379941 0.009
##
        timbre_0_min timbre_0_max timbre_1_min timbre_1_max timbre_2_min
## 6206
               11.84
                           44.378
                                          -80.4
                                                     187.038
                                                                  -106.47
##
        timbre_2_max timbre_3_min timbre_3_max timbre_4_min timbre_4_max
                                                     -77.158
             220.751
                          -79.722
                                       199.699
## 6206
                                                                  147.564
##
        timbre_5_min timbre_5_max timbre_6_min timbre_6_max timbre_7_min
## 6206
             -68.229
                          186.391
                                       -110.029
                                                      63.148
                                                                  -58.978
        timbre_7_max timbre_8_min timbre_8_max timbre_9_min timbre_9_max
##
## 6206
                93.6
                          -52.012
                                        95.827
                                                     -63.554
                                                                   84.129
```

timbre_10_min timbre_10_max timbre_11_min timbre_11_max Top10

-73.421

67.308

67.001

##

6206

-53.492

```
#subsetting the data
SongsTrain = subset(songs, year <= 2009)
SongsTest = subset(songs, year == 2010)
nrow(SongsTrain)</pre>
```

```
## [1] 7201
```

```
#removing non-numeric colnames
nonvars = c("year", "songtitle", "artistname", "songID", "artistID")

SongsTrain = SongsTrain[ , !(names(SongsTrain) %in% nonvars) ]

SongsTest = SongsTest[ , !(names(SongsTest) %in% nonvars) ]

SongsLog1 = glm(Top10 ~ ., data=SongsTrain, family=binomial)
summary(SongsLog1)
```

```
##
## Call:
## glm(formula = Top10 ~ ., family = binomial, data = SongsTrain)
##
## Deviance Residuals:
##
      Min
                1Q
                     Median
                                  3Q
                                         Max
## -1.9220 -0.5399 -0.3459 -0.1845
                                       3.0770
##
## Coefficients:
##
                             Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                            1.470e+01 1.806e+00
                                                  8.138 4.03e-16 ***
## timesignature
                            1.264e-01 8.674e-02
                                                  1.457 0.145050
## timesignature confidence 7.450e-01 1.953e-01
                                                  3.815 0.000136 ***
## loudness
                            2.999e-01 2.917e-02 10.282 < 2e-16 ***
## tempo
                            3.634e-04 1.691e-03 0.215 0.829889
## tempo_confidence
                            4.732e-01 1.422e-01
                                                  3.329 0.000873 ***
## key
                            1.588e-02 1.039e-02 1.529 0.126349
## key confidence
                            3.087e-01 1.412e-01
                                                  2.187 0.028760 *
## energy
                           -1.502e+00 3.099e-01 -4.847 1.25e-06 ***
                           -4.491e+01 6.835e+00 -6.570 5.02e-11 ***
## pitch
## timbre_0_min
                           2.316e-02 4.256e-03
                                                 5.441 5.29e-08 ***
## timbre_0_max
                           -3.310e-01 2.569e-02 -12.882 < 2e-16 ***
                           5.881e-03 7.798e-04 7.542 4.64e-14 ***
## timbre_1_min
## timbre_1_max
                           -2.449e-04 7.152e-04 -0.342 0.732087
                           -2.127e-03 1.126e-03 -1.889 0.058843 .
## timbre_2_min
## timbre 2 max
                           6.586e-04 9.066e-04 0.726 0.467571
## timbre_3_min
                            6.920e-04 5.985e-04
                                                  1.156 0.247583
                           -2.967e-03 5.815e-04 -5.103 3.34e-07 ***
## timbre_3_max
## timbre_4_min
                           1.040e-02 1.985e-03 5.237 1.63e-07 ***
## timbre_4_max
                           6.110e-03 1.550e-03 3.942 8.10e-05 ***
## timbre_5_min
                           -5.598e-03 1.277e-03 -4.385 1.16e-05 ***
                           7.736e-05 7.935e-04 0.097 0.922337
## timbre 5 max
                           -1.686e-02 2.264e-03 -7.445 9.66e-14 ***
## timbre_6_min
## timbre 6 max
                            3.668e-03 2.190e-03 1.675 0.093875 .
## timbre_7_min
                           -4.549e-03 1.781e-03 -2.554 0.010661 *
## timbre_7_max
                           -3.774e-03 1.832e-03 -2.060 0.039408 *
## timbre 8 min
                           3.911e-03 2.851e-03 1.372 0.170123
## timbre_8_max
                           4.011e-03 3.003e-03
                                                  1.336 0.181620
## timbre 9 min
                            1.367e-03 2.998e-03 0.456 0.648356
## timbre_9_max
                            1.603e-03 2.434e-03
                                                  0.659 0.510188
                           4.126e-03 1.839e-03
## timbre 10 min
                                                  2.244 0.024852 *
## timbre 10 max
                            5.825e-03 1.769e-03
                                                  3.292 0.000995 ***
## timbre 11 min
                           -2.625e-02 3.693e-03 -7.108 1.18e-12 ***
                                                 5.811 6.21e-09 ***
## timbre_11_max
                            1.967e-02 3.385e-03
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 6017.5 on 7200 degrees of freedom
## Residual deviance: 4759.2 on 7167 degrees of freedom
## AIC: 4827.2
```

```
##
```

Number of Fisher Scoring iterations: 6

cor(SongsTrain\$loudness, SongsTrain\$energy)

[1] 0.7399067

```
#avoiding correlation
SongsLog2 = glm(Top10 ~ . - loudness, data=SongsTrain, family=binomial)
summary(SongsLog2)
```

```
##
## Call:
## glm(formula = Top10 ~ . - loudness, family = binomial, data = SongsTrain)
##
## Deviance Residuals:
##
      Min
                1Q
                     Median
                                  3Q
                                          Max
## -2.0983 -0.5607 -0.3602 -0.1902
                                       3.3107
##
## Coefficients:
##
                             Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                           -2.241e+00 7.465e-01 -3.002 0.002686 **
## timesignature
                            1.625e-01 8.734e-02 1.860 0.062873 .
## timesignature confidence 6.885e-01 1.924e-01 3.578 0.000346 ***
## tempo
                            5.521e-04 1.665e-03 0.332 0.740226
## tempo confidence
                            5.497e-01 1.407e-01 3.906 9.40e-05 ***
## key
                            1.740e-02 1.026e-02
                                                  1.697 0.089740 .
## key confidence
                            2.954e-01 1.394e-01
                                                  2.118 0.034163 *
## energy
                            1.813e-01 2.608e-01
                                                  0.695 0.486991
## pitch
                           -5.150e+01 6.857e+00 -7.511 5.87e-14 ***
## timbre_0_min
                            2.479e-02 4.240e-03
                                                  5.847 5.01e-09 ***
## timbre_0_max
                           -1.007e-01 1.178e-02 -8.551 < 2e-16 ***
## timbre_1_min
                            7.143e-03 7.710e-04
                                                 9.265 < 2e-16 ***
                           -7.830e-04 7.064e-04 -1.108 0.267650
## timbre_1_max
## timbre_2_min
                           -1.579e-03 1.109e-03 -1.424 0.154531
                            3.889e-04 8.964e-04 0.434 0.664427
## timbre_2_max
## timbre 3 min
                            6.500e-04 5.949e-04 1.093 0.274524
## timbre_3_max
                           -2.462e-03 5.674e-04 -4.339 1.43e-05 ***
                           9.115e-03 1.952e-03 4.670 3.02e-06 ***
## timbre_4_min
## timbre_4_max
                            6.306e-03 1.532e-03
                                                 4.115 3.87e-05 ***
                           -5.641e-03 1.255e-03 -4.495 6.95e-06 ***
## timbre_5_min
## timbre_5_max
                           6.937e-04 7.807e-04
                                                  0.889 0.374256
                           -1.612e-02 2.235e-03 -7.214 5.45e-13 ***
## timbre 6 min
## timbre_6_max
                           3.814e-03 2.157e-03 1.768 0.076982 .
## timbre 7 min
                           -5.102e-03 1.755e-03 -2.907 0.003644 **
## timbre_7_max
                           -3.158e-03 1.811e-03 -1.744 0.081090 .
## timbre 8 min
                            4.488e-03 2.810e-03
                                                 1.597 0.110254
## timbre_8_max
                            6.423e-03 2.950e-03
                                                  2.177 0.029497 *
## timbre_9_min
                           -4.282e-04 2.955e-03 -0.145 0.884792
## timbre 9 max
                            3.525e-03 2.377e-03 1.483 0.138017
## timbre_10_min
                            2.993e-03 1.804e-03
                                                  1.660 0.097004 .
                                                  4.255 2.09e-05 ***
## timbre 10 max
                            7.367e-03 1.731e-03
                           -2.837e-02 3.630e-03 -7.815 5.48e-15 ***
## timbre_11_min
## timbre 11 max
                            1.829e-02 3.341e-03 5.476 4.34e-08 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 6017.5 on 7200 degrees of freedom
## Residual deviance: 4871.8 on 7168 degrees of freedom
## AIC: 4937.8
##
## Number of Fisher Scoring iterations: 6
```

 $SongsLog3 = glm(Top10 \sim . - energy, data=SongsTrain, family=binomial)$ summary(SongsLog3)

```
##
## Call:
## glm(formula = Top10 ~ . - energy, family = binomial, data = SongsTrain)
##
## Deviance Residuals:
##
      Min
                1Q
                     Median
                                  3Q
                                          Max
## -1.9182 -0.5417 -0.3481 -0.1874
                                       3.4171
##
## Coefficients:
##
                             Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                            1.196e+01 1.714e+00
                                                  6.977 3.01e-12 ***
                            1.151e-01 8.726e-02
## timesignature
                                                  1.319 0.187183
## timesignature confidence 7.143e-01 1.946e-01
                                                  3.670 0.000242 ***
## loudness
                            2.306e-01 2.528e-02 9.120 < 2e-16 ***
                           -6.460e-04 1.665e-03 -0.388 0.698107
## tempo
## tempo_confidence
                            3.841e-01 1.398e-01
                                                  2.747 0.006019 **
## key
                            1.649e-02 1.035e-02 1.593 0.111056
## key confidence
                            3.394e-01 1.409e-01
                                                  2.409 0.015984 *
## pitch
                           -5.328e+01 6.733e+00 -7.914 2.49e-15 ***
## timbre_0_min
                            2.205e-02 4.239e-03
                                                  5.200 1.99e-07 ***
## timbre_0_max
                           -3.105e-01 2.537e-02 -12.240 < 2e-16 ***
                            5.416e-03 7.643e-04
## timbre_1_min
                                                 7.086 1.38e-12 ***
                           -5.115e-04 7.110e-04 -0.719 0.471928
## timbre_1_max
## timbre_2_min
                           -2.254e-03 1.120e-03 -2.012 0.044190 *
                            4.119e-04 9.020e-04
                                                 0.457 0.647915
## timbre_2_max
## timbre 3 min
                           3.179e-04 5.869e-04
                                                  0.542 0.588083
## timbre_3_max
                           -2.964e-03 5.758e-04 -5.147 2.64e-07 ***
                           1.105e-02 1.978e-03 5.585 2.34e-08 ***
## timbre 4 min
## timbre_4_max
                            6.467e-03 1.541e-03
                                                 4.196 2.72e-05 ***
                           -5.135e-03 1.269e-03 -4.046 5.21e-05 ***
## timbre_5_min
## timbre_5_max
                           2.979e-04 7.855e-04
                                                  0.379 0.704526
                           -1.784e-02 2.246e-03 -7.945 1.94e-15 ***
## timbre 6 min
## timbre_6_max
                           3.447e-03 2.182e-03 1.580 0.114203
## timbre 7 min
                           -5.128e-03 1.768e-03 -2.900 0.003733 **
## timbre_7_max
                           -3.394e-03 1.820e-03 -1.865 0.062208 .
## timbre 8 min
                            3.686e-03 2.833e-03
                                                 1.301 0.193229
## timbre 8 max
                            4.658e-03 2.988e-03 1.559 0.119022
## timbre_9_min
                           -9.318e-05 2.957e-03 -0.032 0.974859
                            1.342e-03 2.424e-03
## timbre 9 max
                                                 0.554 0.579900
## timbre_10_min
                                                  2.217 0.026637 *
                            4.050e-03 1.827e-03
## timbre 10 max
                            5.793e-03 1.759e-03
                                                  3.294 0.000988 ***
                           -2.638e-02 3.683e-03 -7.162 7.96e-13 ***
## timbre 11 min
## timbre 11 max
                            1.984e-02 3.365e-03 5.896 3.74e-09 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 6017.5 on 7200 degrees of freedom
## Residual deviance: 4782.7 on 7168 degrees of freedom
## AIC: 4848.7
##
## Number of Fisher Scoring iterations: 6
```

```
#validating the model
testPredict = predict(SongsLog3, newdata=SongsTest, type="response")
table(SongsTest$Top10, testPredict >= 0.45)
##
##
     FALSE TRUE
##
   0 309
               5
         40 19
##
   1
#baseline model
table(SongsTest$Top10)
##
## 0
        1
## 314 59
#accuracy
314/(314+59)
## [1] 0.8418231
#0.8418231
table(SongsTest$Top10, testPredict >= 0.45)
##
##
     FALSE TRUE
##
        309
               5
         40 19
##
    1
```

#sensitivity = 19/(19+40) = 0.3220339 #specificity = 309/(309+5) = 0.9840764

#Model 3 favors specificity over sensitivity.

#Model 3 provides conservative predictions, and predicts that a song will make it to the Top 10 very rarely.

#So while it detects less than half of the Top 10 songs,

#we can be very confident in the songs that it does predict to be Top 10 hits.

#Model 3 has a very high specificity, meaning that it favors specificity over sensitivity.
#While Model 3 only captures less than half of the Top 10 songs,
#it still can offer a competitive edge, since it is very conservative in its predictions.