## Clara

## Anqi Chi SID:460204008 22/10/2018

### Data Clean

```
## [1] 12153
               145
##
       BDYMSQ04
                          BMR
                                           SEX
                                                            EIBMR1
           :0.0000
                            : 4275
                                                               :0.0000
##
    Min.
                     Min.
                                      Min.
                                             :0.0000
                                                       Min.
    1st Qu.:0.0000
                     1st Qu.: 5734
                                      1st Qu.:0.0000
                                                       1st Qu.:0.9381
   Median :0.0000
                     Median: 6504
                                      Median :0.0000
                                                       Median :1.2371
  Mean
           :0.1382
                     Mean
                            : 6710
                                      Mean
                                             :0.4757
                                                       Mean
                                                               :1.3064
                     3rd Qu.: 7595
##
    3rd Qu.:0.0000
                                      3rd Qu.:1.0000
                                                        3rd Qu.:1.6033
                             :12759
##
    Max.
           :1.0000
                                             :1.0000
                                                               :5.8661
                     Max.
                                      Max.
                                                       Max.
       ADTOTSE
                                                       PROPER1
##
                      CHOPER1
                                       FATPER1
##
   Min.
          : 0
                   Min.
                           : 0.00
                                    Min.
                                           : 0.00
                                                    Min.
                                                            : 0.00
   1st Qu.:1410
                   1st Qu.:36.11
                                    1st Qu.:24.99
                                                    1st Qu.:14.14
##
  Median:2165
                   Median :43.51
                                    Median :30.88
                                                    Median :17.40
  Mean
           :2358
                   Mean
                           :43.22
                                           :30.83
                                                            :18.34
                                    Mean
                                                    Mean
                                                    3rd Qu.:21.38
##
    3rd Qu.:3180
                   3rd Qu.:50.48
                                    3rd Qu.:36.53
## Max.
           :9180
                   Max.
                           :98.73
                                    Max.
                                           :82.87
                                                    Max.
                                                            :63.65
```

### LDA

Load the functions from cvTools into memory.

Fit the LDA method

```
n = length(y)
dat = data.frame(y,X)
X1 = model.matrix(~-1+BMR+EIBMR1+ADTOTSE+SEX+BDYMSQ04+CHOPER1+FATPER1+PROPER1,data=dat)
X1 = data.frame(X1)
summary(X1)
```

##	BMR	EIBMR1	ADTOTSE	SEX
##	Min. : 4275	Min. :0.0000	Min. : 0	Min. :0.0000
##	1st Qu.: 5734	1st Qu.:0.9381	1st Qu.:1410	1st Qu.:0.0000
##	Median : 6504	Median :1.2371	Median :2165	Median :0.0000
##	Mean : 6710	Mean :1.3064	Mean :2358	Mean :0.4757
##	3rd Qu.: 7595	3rd Qu.:1.6033	3rd Qu.:3180	3rd Qu.:1.0000
##	Max. :12759	Max. :5.8661	Max. :9180	Max. :1.0000
##	BDYMSQ04	CHOPER1	FATPER1	PROPER1
## ##	BDYMSQ04 Min. :0.0000	CHOPER1 Min. : 0.00	FATPER1 Min. : 0.00	PROPER1 Min. : 0.00
##	Min. :0.0000	Min. : 0.00	Min. : 0.00	Min. : 0.00
## ##	Min. :0.0000 1st Qu.:0.0000	Min. : 0.00 1st Qu.:36.11	Min. : 0.00 1st Qu.:24.99	Min. : 0.00 1st Qu.:14.14
## ## ##	Min. :0.0000 1st Qu.:0.0000 Median :0.0000	Min. : 0.00 1st Qu.:36.11 Median :43.51	Min. : 0.00 1st Qu.:24.99 Median :30.88	Min. : 0.00 1st Qu.:14.14 Median :17.40

```
res <- lda(y~., data=X1,subset=1:n)
res
## Call:
## lda(y ~ ., data = X1, subset = 1:n)
## Prior probabilities of groups:
##
## 0.7236162 0.2763838
##
## Group means:
                EIBMR1 ADTOTSE
                                      SEX BDYMSQ04 CHOPER1 FATPER1
##
          BMR
## 0 6426.343 1.380460 2313.456 0.4791776 0.1073358 43.38162 30.74535
## 1 7452.157 1.112322 2475.082 0.4666971 0.2189781 42.79542 31.06969
      PROPER1
##
## 0 18.05556
## 1 19.08146
##
## Coefficients of linear discriminants:
##
                      LD1
## BMR
             1.248732e-03
## EIBMR1
            -4.342037e-01
## ADTOTSE
           -4.590553e-05
            -2.093857e+00
## SEX
## BDYMSQ04 3.632406e-01
## CHOPER1
           -5.031900e-03
## FATPER1
             1.558290e-03
## PROPER1
             2.123950e-03
```

#### Comment:

The above output suggests the following interpretations for each of the variables. \* People who have higher BMR are more likely to obese \* Lower EIBMR1(Energy intake) increases obese probability (since the coefficient -0.434 is negative). \* Lower ADTOTSE(Total mins spent sitting or lying down) increases obese probability (since the coefficient -4.590553e-05 is negative).

• Sex = 1 for males. So females are more likely to obese

Comment: The CV error for LDA is 18.232 percent

- People on a diet are more likely to obese compared with people not on a diet
- People who have high fat and high protein diet type are more likely to obese
- People who have high carbon diet type decrease the probability of obesity

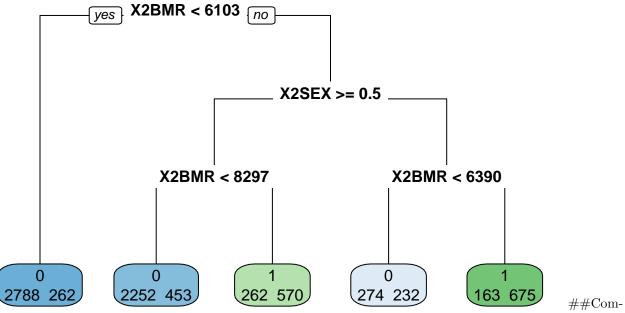
### CV error

```
#cross validation error for LDA.
res.lda = cv.da(X1,y,method="lda",V,seed=1)
res.lda
## [1] 0.1823225
```

## **CART**

```
library(rpart)
## Warning: package 'rpart' was built under R version 3.4.3
X2 = model.matrix(~-1+BMR+EIBMR1+ADTOTSE+SEX+BDYMSQ04+CHOPER1+FATPER1+PROPER1,data=dat)
# Be careful as coding y as a factor here, Otherwise R will do a regression tree rather than a classifi
res.rpart <- rpart(as.factor(y) ~ X2, data=dat)
library(rpart.plot)
## Warning: package 'rpart.plot' was built under R version 3.4.4
rpart.plot(res.rpart,type=0,extra=1,main="CART fit",cex.main=2,cex=1)</pre>
```

# **CART fit**



 $ment:\ Interpret??$ 

cross-validation for rpart.

### CV error

```
res.rpart = cv.rpart(X2,y,V,seed=1)
res.rpart
```

## [1] 0.1755138

Comment: The CV error for CART is 17.551 percent

## Logistic regression

Fit a logistic regression model on most of the data.

```
res.glm = glm(y~.,family=binomial,data=X1)
summary(res.glm)
##
## Call:
## glm(formula = y ~ ., family = binomial, data = X1)
##
## Deviance Residuals:
                                          Max
##
      Min
                10
                     Median
                                   30
## -2.7799 -0.6546 -0.3851
                               0.4044
                                        3.2858
##
## Coefficients:
##
                Estimate Std. Error z value Pr(>|z|)
## (Intercept) -1.093e+01 4.700e-01 -23.246 < 2e-16 ***
               1.879e-03 5.203e-05 36.109
                                             < 2e-16 ***
## BMR
## EIBMR1
               -7.113e-01
                          7.220e-02
                                     -9.852
                                              < 2e-16 ***
## ADTOTSE
              -5.952e-05 2.449e-05 -2.430
                                              0.0151 *
## SEX
               -3.423e+00
                          1.174e-01 -29.159
                                             < 2e-16 ***
               3.802e-01
                          8.342e-02
                                      4.557 5.18e-06 ***
## BDYMSQ04
## CHOPER1
              -1.014e-02 3.948e-03 -2.567
                                              0.0103 *
## FATPER1
               1.507e-03 4.357e-03
                                      0.346
                                               0.7295
## PROPER1
               -9.982e-04 5.854e-03 -0.171
                                              0.8646
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 9350.7 on 7930
                                      degrees of freedom
## Residual deviance: 6587.0 on 7922 degrees of freedom
## AIC: 6605
## Number of Fisher Scoring iterations: 5
```

### Comment:

The full model has the coefficients for BMR, EIBMR1, ADTOTSE, SEX, BDYMSQ04, CHOPER1 as statistically significantly different from zero at the 0.05 level. The fitted model is

```
\text{logit}(p) = -0.1093 + 0.001879 \cdot \text{BMR} - 3.423 \cdot \text{SEX} - 0.7113 \cdot \text{EIBMR} \\ 1 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 1 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.3802 \cdot \text{BDYMSQ04} - 0.01014 \cdot \text{CHOMERAL SECONDARY } \\ 2 - 0.00005952 \cdot \text{ADTOTSE} + 0.0000592 \cdot \text{ADTOTSE} + 0.0000592 \cdot \text{ADTOTSE} + 0.0000592 \cdot \text{ADTOTSE} + 0.0000592 \cdot \text{AD
```

where p is the probability of obesity.

The effect of the significant variables on surival are: \* Larger BMR reduces the probability of obesity. \* Males have reduced the probability of obesity compared to women.

#### CV error for glms.

```
## [1] 0.1777834
```

Comment: The CV error for glm is 17.78 percent

## summary

We now display the results nicely using the package huxtable.

## Warning: package 'huxtable' was built under R version 3.4.4

Methods	Errors
LDA	18.2
rpart	17.6
$_{ m glm}$	17.8

The effect of different predictors on obesity are relatively consistent. In summary: