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West

HW 9

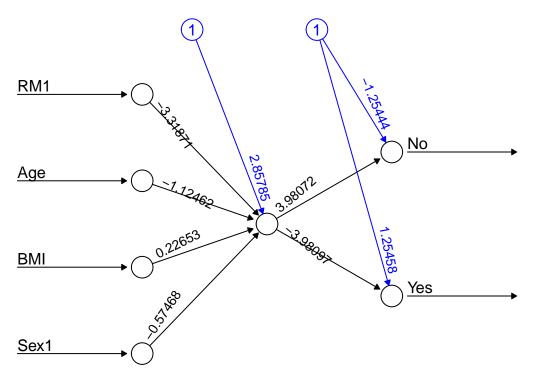
```
# Read in packages and data
suppressPackageStartupMessages({
 library(tidyverse)
 library(NHANES)
 library(neuralnet)
})
1).
# Create indicator variable RM1 and Sex1
data <- NHANES %>%
  mutate(RM1 = ifelse(RegularMarij=="Yes",1,0), Sex1 = ifelse(Gender=="male",1,0))
# Summarize indicators
data %>%
  select(RM1, Sex1) %>%
 summary()
##
        RM1
                        Sex1
                          :0.000
## Min. :0.000 Min.
## 1st Qu.:0.000 1st Qu.:0.000
## Median :0.000 Median :0.000
## Mean :0.276
                  Mean :0.498
## 3rd Qu.:1.000 3rd Qu.:1.000
## Max.
         :1.000
                  Max. :1.000
## NA's
          :5059
2).
# Limit dataset to HardDrugs, RM1, Age, BMI and Sex1
# Scale Age and BMI to be between 0-1
data <- data %>%
  select(HardDrugs, RM1, Age, BMI, Sex1) %>%
 mutate_at(vars(Age, BMI), funs(scale(.) %>% as.vector))
data %>% glimpse()
## Observations: 10,000
## Variables: 5
## $ HardDrugs <fct> Yes, Yes, Yes, NA, Yes, NA, NA, No, No, No, No, Yes,...
              <dbl> 0, 0, 0, NA, 0, NA, NA, 0, 0, 0, NA, 1, 1, NA, NA, 0...
## $ RM1
## $ Age
              <dbl> -0.1224285, -0.1224285, -0.1224285, -1.4618598, 0.54...
## $ BMI
              <dbl> 0.753718485, 0.753718485, 0.753718485, -1.540027677,...
## $ Sex1
              <dbl> 1, 1, 1, 1, 0, 1, 1, 0, 0, 0, 1, 1, 1, 0, 0, 1, 0, 1...
```

```
3).
```

```
# remove missing values
data <- data %>% na.omit()
# get length of remaining columns
data %>% lapply(length)
## $HardDrugs
## [1] 4907
## $RM1
## [1] 4907
##
## $Age
## [1] 4907
##
## $BMI
## [1] 4907
##
## $Sex1
## [1] 4907
4).
# Set random seed
set.seed(1847)
p < -0.2
m <- 4907
# get random indices and split train and test data
train_ind <- sample.int(m, (1-p)*m)</pre>
traind <- data[train_ind,]</pre>
testd <- data[-train_ind,]</pre>
traind %>% glimpse()
## Observations: 3,925
## Variables: 5
## $ HardDrugs <fct> No, No, No, Yes, No, No, No, No, Yes, No, No, No, No...
## $ RM1
               <dbl> 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 1, 0, 0...
## $ Age
               <dbl> 0.90446882, 0.41334403, -0.56890557, -0.47961016, -0...
## $ BMI
               <dbl> -0.3687530, -0.5504091, 1.7270694, 0.3849839, -0.143...
## $ Sex1
               <dbl> 0, 1, 0, 0, 1, 0, 1, 0, 1, 1, 0, 0, 0, 0, 0, 1, 0, 0...
testd %>% glimpse()
## Observations: 982
## Variables: 5
## $ HardDrugs <fct> Yes, No, No, Yes, No, No, No, Yes, Yes, No, No, ...
## $ RM1
               <dbl> 0, 0, 0, 1, 0, 0, 0, 0, 1, 1, 0, 0, 0, 0, 0, 0, 1, 0...
## $ Age
               <dbl> -0.12242848, 0.36869632, 0.36869632, 0.77052570, 0.0...
## $ BMI
               <dbl> 0.75371848, 0.07860880, 0.07860880, -0.08542388, 1.2...
               <dbl> 1, 0, 0, 1, 1, 1, 0, 0, 1, 0, 0, 0, 1, 1, 0, 0, 1, 0...
## $ Sex1
```

5).

```
# Set random seed
set.seed(1847)
# create formula
f <- formula(HardDrugs ~ RM1 + Age + BMI + Sex1)
# fit the NN on the training data
mNN <- neuralnet(f, traind, hidden=1, linear.output=F, rep=10, lifesign="minimal")
## hidden: 1
              thresh: 0.01
                            rep: 1/10
                                          steps:
                                                   2657
                                                          error: 471.62653
                                                                            time: 2.33 secs
## hidden: 1
            thresh: 0.01
                           rep: 2/10
                                          steps:
                                                   1434
                                                          error: 471.62676
                                                                            time: 1.45 secs
## hidden: 1
            thresh: 0.01
                           rep: 3/10
                                                                            time: 1.17 secs
                                          steps:
                                                   1166
                                                          error: 471.62645
                                                          error: 471.62666
## hidden: 1
            thresh: 0.01
                                                                            time: 0.58 secs
                           rep: 4/10
                                          steps:
                                                   567
## hidden: 1 thresh: 0.01
                          rep: 5/10
                                                          error: 471.62667 time: 1.5 secs
                                          steps: 1469
## hidden: 1 thresh: 0.01
                                          steps: 1481
                          rep: 6/10
                                                          error: 471.62639
                                                                            time: 1.55 secs
                           rep: 7/10
## hidden: 1
             thresh: 0.01
                                          steps:
                                                   441
                                                          error: 471.6256
                                                                            time: 0.47 secs
## hidden: 1
            thresh: 0.01
                           rep: 8/10
                                                    909
                                                          error: 471.62642
                                                                           time: 0.92 secs
                                          steps:
## hidden: 1
            thresh: 0.01
                                                          error: 471.62635 time: 0.65 secs
                           rep: 9/10
                                          steps:
                                                    602
## hidden: 1
            thresh: 0.01
                           rep: 10/10
                                                   2242
                                                          error: 471.62608
                                                                            time: 2.28 secs
                                          steps:
6).
# plot network form for result
plot(mNN, rep="best")
```



Error: 471.6256 Steps: 441

7).

hidden: 2

```
# get predictions on test data for the best network result
p1 <- compute(mNN, testd, rep=7)
# create confusion matrix
table(round(p1$net.result[,2]), ifelse(testd$HardDrugs=="Yes",1,0))
##
##
         0
           1
##
     0 717 113
     1 59 93
8).
# set random seed
set.seed(1847)
# fit the NN on the training data with 2 hidden layers
mNN2 <- neuralnet(f, traind, hidden=2, linear.output=F, rep=10, lifesign="minimal")
## hidden: 2
                thresh: 0.01
                                rep: 1/10
                                              steps:
                                                       16242
                                                                error: 462.56932
                                                                                     time: 21.83 secs
## hidden: 2
                thresh: 0.01
                                rep: 2/10
                                                        3332
                                                                error: 467.32647
                                                                                     time: 4.37 secs
                                              steps:
```

steps:

16335

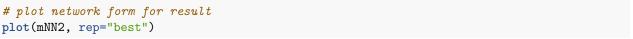
error: 462.54016

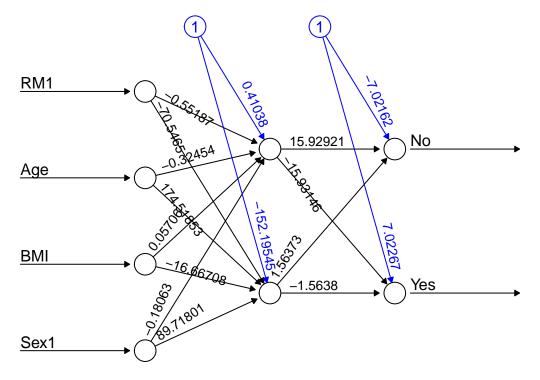
time: 22.07 secs

rep: 3/10

thresh: 0.01

```
## hidden: 2
               thresh: 0.01
                               rep: 4/10
                                             steps:
                                                      71781
                                                               error: 460.51255
                                                                                   time: 1.65 mins
## hidden: 2
                                                                                   time: 22.9 secs
              thresh: 0.01
                               rep: 5/10
                                             steps:
                                                      17179
                                                               error: 462.54186
## hidden: 2
               thresh: 0.01
                               rep: 6/10
                                                               error: 465.14661
                                                                                   time: 6.18 secs
                                             steps:
                                                       4714
## hidden: 2
               thresh: 0.01
                               rep: 7/10
                                                       4571
                                                               error: 465.05289
                                                                                   time: 5.93 secs
                                             steps:
                               rep: 8/10
## hidden: 2
                                                                                   time: 15.65 secs
               thresh: 0.01
                                             steps:
                                                      12005
                                                               error: 467.35928
## hidden: 2
               thresh: 0.01
                               rep: 9/10
                                             steps:
                                                       1257
                                                               error: 471.63031
                                                                                   time: 1.63 secs
## hidden: 2
               thresh: 0.01
                               rep: 10/10
                                             steps:
                                                       5176
                                                               error: 467.32646
                                                                                   time: 6.9 secs
9).
```





Error: 460.512552 Steps: 71781

10).

```
# get predictions on test data for the best network result
p2 <- compute(mNN2, testd, rep=4)

# create confusion matrix
table(round(p2$net.result[,2]), ifelse(testd$HardDrugs=="Yes",1,0))

##
## 0 1
## 0 720 126</pre>
```