# Homework 6

# **Neural Networks**

Group 22

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#### Problem 1

```
"``{r warning=FALSE,message=FALSE}
library(readxl)
Toyota_Corolla<-read_excel("C:/Users/pc/Desktop/Spring2019/DM/Rdown/DataMining/homework5/ToyotaCorolla.xlsx",sheet=2)
library(neuralnet)
Toyota_Corolla<-read_excel("C:/Users/pc/Desktop/Spring2019/DM/hw6/ToyotaCorolla.xlsx")
normalize<-function(x){
    return((x-min(x))/(max(x)-min(x)))
}
rmse<-function(x,y){
    sqrt(mean(x-y)^2)
}
library(fastDummies)
Toyota_Corolla<-dummy_cols(Toyota_Corolla,select_columns = c("Fuel_Type"))
Toyota_Corolla<-Toyota_Corolla[,-c(1,2,5,6,8,11,41,51)]</pre>
```

Splitting the data into train and test(Validation set)

Record the RMS error for the training data and the validation data. Repeat the process, changing the threshold values, 1, 0.1, 0.05, 0.01, 0.005, 0.001, and 0.0001. Set threshold to these values.

(a)

Creating Neural Net with threshold values, 1, 0.1, 0.05, 0.01, 0.005, 0.001, and 0.0001:

```
46 + ```{r}
                Price <- neuralnet(Price-Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
 47
                                                                                        Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
 49
                                                                                        Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
  50
  51
  52
                                                                                          Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
  53
                                                                                        Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, threshold = 1)
  55
                 \label{eq:price} \textit{Price1} \leftarrow \textit{neuralnet}(\textit{Price}\_\textit{Age\_08\_04+KM++HP+Met\_Color}+\textit{Automatic}+\textit{cc+Doors+Cylinders}++\textit{Gears}+\textit{Quarterly\_Tax+Weight+}+\textit{Met\_Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Color}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomatic}+\textit{Met\_Motomati
                                                                                       Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
  56
  57
  58
                                                                                          Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
                                                                                        Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
  59
  60
  61
                                                                                          Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, threshold = 0.1)
  62
                         Price2 <- neuralnet(Price~Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
Mfr_Guarantee+B0VAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
                                                                                                Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps-
                                                                                                Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
           66
67
            68
                                                                                                Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
Toyota_Corolla_violet+Toyota_Corolla_White,train_split, threshold = 0.05)
           69
                         Price3 <- neuralnet(Price~Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
Mfr_Guarantee+B0VAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
                                                                                                Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
            73
74
           75
76
77
                                                                                                 Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
                                                                                                Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, threshold = 0.01)
                         Price4 <- neuralnet(Price~Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
                                                                                                Nfr_Guarantee+B0VAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
           81
                                                                                                Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
            82
                                                                                                Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
            83
           84
                                                                                                Toyota_Corolla_Violet+Toyota_Corolla_White, train_split, threshold = 0.005)
           87
                          Price5 <- neuralnet(Price~Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
                                                                                                Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
           89
            90
                                                                                                Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_cNg+
                                                                                                Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
            91
            92
            93
                                                                                                Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, threshold = 0.001)
                         \label{lem:price} \textit{Price} \leftarrow \textit{neuralnet}(\textit{Price}\_\textit{Age}\_\textit{08}\_\textit{04}+\textit{KM}+\textit{HP}+\textit{Met}\_\textit{Color}+\textit{Automatic}+\textit{cc}+\textit{Doors}+\textit{Cylinders}++\textit{Gears}+\textit{Quarter}\\\textit{ly}\_\textit{Tax}+\textit{Weight}+\textit{Met}\_\textit{Color}+\textit{Automatic}+\textit{Cc}+\textit{Doors}+\textit{Cylinders}++\textit{Gears}+\textit{Quarter}\\\textit{ly}\_\textit{Tax}+\textit{Weight}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Automatic}+\textit{Cc}+\textit{Doors}+\textit{Cylinders}++\textit{Gears}+\textit{Quarter}\\\textit{ly}\_\textit{Tax}+\textit{Weight}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Color}+\textit{Met}\_\textit{Co
                                                                                              Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
           96
                                                                                               Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
           98
           99
       100
       1.01
                                                                                               Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, threshold = 0.0001)
       102
```

#### Getting RMS for models mentioned above:

```
106 results
                     - compute(Price,train_split[,-1])
       train_split<- cbind(train_split, Adata.frame(results$net.result))
rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))</pre>
107
108
109
       train_split$results.net.result <- NULL
results <- compute(Price1,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))</pre>
110
111
112
113
       rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
114
       train_split$results.net.result <- NULL
115
       results <- compute(Price2,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))</pre>
116
117
       rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
118
119
120 train_split$results.net.result <-
       results <- compute(Price3,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))</pre>
121
122
123
       rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
124
       train_split$results.net.result <- NULL
125
       results - compute(Price4,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))
rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
127
```

```
train_split$results.net.result <- NULL

results <- compute(Price5,train_split[,-1])

train_split<- cbind(train_split,data.frame(results$net.result))

rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))

train_split$results.net.result <- NULL

results <- compute(Price6,train_split[,-1])

train_split<- cbind(train_split,data.frame(results$net.result))

rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))

"""
```

### Output:

Answer: We can see that even though we are increasing the number of hidden layers RMS values across models isn't changing and remains the same.

(b)

Using the neural nets created above we test those against test data(validation data)

```
(i) ¥
142 results
                      - compute(Price,test_split[,-1])
      test_split<- cbind(test_split,data.frame(results*net.result))
rmse(as.numeric(test_split*Price),as.numeric(test_split*results.net.result))</pre>
143
144
146 test_split$results.net.result <- NULL
147 results <- compute(Price1,test_split[,-1])
148 test_split<- cbind(test_split,data.frame(results$net.result))</pre>
149 rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))
150
               _split$results.net.result <-
152 results <- compute(Price2,test_split[,-1])
153 test_split<- cbind(test_split,data.frame(results$net.result))
154 rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))
155
156 test_split$results.net.result <- NULL
157 results <- compute(Price3,test_split[,-1])
158 test_split<- cbind(test_split,data.frame(results\net.result))
      rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))
160
161 test_split$results.net.result <- NULL
results <- compute(Price4,test_split[,-1])
test_split<- cbind(test_split,data.frame(results$net.result))
rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))
166 test_split$results.net.result <- NULL
167 results <- compute(Price5,test_split[,-1])
168 test_split<- cbind(test_split,data.frame(results$net.result))
      rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))
170
171 test_split$results.net.result <- NULL
      results <- compute(Price6,test_split[,-1])
test_split<- cbind(test_split,data.frame(results\net.result))
rmse(as.numeric(test_split\results\result),as.numeric(test_split\results\result))
173
174
```

### Output:

```
175 ***

[1] 4065.956481
[1] 4065.956537
[1] 4065.956541
[1] 4065.956541
[1] 4065.956541
[1] 4065.956541
[1] 4065.956541
```

Answer: We can see that as we decrease the value of threshold RMSE increases for validation data set.

(c)

Creating models with hidden layers 1,2,4, and 8. Calculating RMSE for train and validation dataset:

```
Price <- neuralnet(Price~Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
180
                              Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
181
                              Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
                               Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG
183
                              Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
184
                               Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, hidden = 1, threshold = 1)
186
      Price1 <- neuralnet(Price~Age 08 04+KM++HP+Met Color+Automatic+cc+Doors+Cvlinders++Gears+Ouarterly Tax+Weight+
                              Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
                              Boardcomputer+CD_Player+Central_Lock+Powered_windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
189
190
191
                               Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
                              Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, hidden = 2, threshold = 1)
192
193
194
      Price2 <- neuralnet(Price~Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cvlinders++Gears+Ouarterly_Tax+Weight+
195
                              Mfr_Guarantee+B0VAG_Guarantee+Guarantee_Period+AB5+Airbag_1+Airbag_2+Airco+Automatic_airco+
197
                              Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
198
                               Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
200
201
                               Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
                              Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, hidden = 4, threshold = 1)
203
      Price3 <- neuralnet(Price-Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
Mfr_Guarantee+B0VAG_Guarantee+Guarantee_Period+AB5+Airbag_1+Airbag_2+Airco+Automatic_airco+
204
205
                               Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps
                              Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
206
207
                               Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
209
                              Toyota_Corolla_Violet+Toyota_Corolla_White,train_split, hidden = 8, threshold = 1)
```

## Testing the models on train and validation datasets:

```
213 -
214 train_split$results.net.result <- NULL
      results <- compute(Price,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))
217
      rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
218
219 train_split$results.net.result <- NULI
      results <- compute(Price1,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))
220
222
      rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
223
224 train_split$results.net.result <- NULL
      results <- compute(Price2,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))</pre>
225
      rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
227
228
      train_split$results.net.result <-
      results <- compute(Price3,train_split[,-1])
train_split<- cbind(train_split,data.frame(results$net.result))
230
232 rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))|
```

```
233
      test_split$results.net.result <-
     results <- compute(Price,test_split[,-1])
test_split<- cbind(test_split,data.frame(results$net.result))
235
236
237
      rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))
238
239
     test_split$results.net.result <- NULL
240 results <- compute(Price1,test_split[,-1])
241 test_split<- cbind(test_split,data.frame(results%net.result))
242 rmse(as.numeric(test_split%Price),as.numeric(test_split%results.net.result))
243
244 test_split$results.net.result <- NULL
      results <- compute(Price2,test_split[,-1])
test_split<- cbind(test_split,data.frame(results*net.result))
rmse(as.numeric(test_split,Price),as.numeric(test_split*results.net.result))
245
246
247
248
249 test_split$results.net.result <- NULL
252
      rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))
```

## Output:

```
[1] 3468.517823

[1] 3468.517823

[1] 3468.517823

[1] 3468.517823

[1] 4065.956481

[1] 4065.956537

[1] 4065.956541

[1] 4065.95654
```

Ans: Fortraining dataset, as we increase number of hidden layers RMSE doesn't change but for validation dataset (test data) we can see that as number of hidden layers increase RMSE value also increases.

(d)

## Creating models:

```
Price <- neuralnet(Price-Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_Blue+
Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
Toyota_Corolla_violet+Toyota_Corolla_White,train_split, hidden = c(2,1), threshold = 1)

Price1 <- neuralnet(Price-Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_Blue+
Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
Toyota_Corolla_Diesel+Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
Toyota_Corolla_Violet+Toyota_Corolla_Mhite,train_split, hidden = 1, threshold = 1)
```

Testing the models on train and validation datasets:

```
276 · ```{r}
277 train_split$results.net.result <- NULL
278 results <- compute(Price,train_split[,-1])
279 train_split<- cbind(train_split,data.frame(results*net.result))
280 rmse(as.numeric(train_split*Price),as.numeric(train_split*results.net.result))
281
282 train split$results.net.result <- NULL
283 results <- compute(Price1,train_split[,-1])</pre>
284 train_split<- cbind(train_split,data.frame(results$net.result))
285 rmse(as.numeric(train_split$Price),as.numeric(train_split$results.net.result))
286
287
288 test split$results.net.result <- NULL
      results <- compute(Price,test_split[,-1])
289
290 test_split<- cbind(test_split,data.frame(results\net.result))
291 rmse(as.numeric(test_split\results\net.result))</pre>
293
294
295 test_split$results.net.result <- NULL
results <- compute(Price1,test_split[,-1])
test_split<- cbind(test_split,data.frame(results$net.result))
rmse(as.numeric(test_split$Price),as.numeric(test_split$results.net.result))</pre>
299
```

## Output:

```
300 ```

[1] 3468.517823
[1] 3468.517823
[1] 4065.956613
[1] 4065.956488
```

Ans: We can see that, changing the number of layers from 1 to 2 in the network decrease the RMSE for validation dataset (test data) whereas RMSE remains the same for train dataset.

(e)

Create models with learning rate 0.2, 0.7 & 1.2:

```
303 \quad \texttt{Price} \gets \texttt{neuralnet}(\texttt{Price} - \texttt{Age\_08\_04} + \texttt{KM} + \texttt{HP} + \texttt{Met\_color} + \texttt{Automatic} + \texttt{Cc+Doors} + \texttt{Cylinders} + \texttt{Hears} + \texttt{Quarterly\_Tax} + \texttt{Weight} + \texttt{Met\_color} + \texttt{Automatic} + \texttt{Cc+Doors} + \texttt{Cylinders} + \texttt{Color} + \texttt{Cylinders} + \texttt{Cylinders} + \texttt{Color} + \texttt{Cylinders} + \texttt{Cyl
                                                               Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
305
                                                                Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
306
                                                                Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
                                                                 Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
308
                                                                 Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
309
                                                               Toyota_Corolla_Violet+Toyota_Corolla_White,train_split,
hidden = 8, threshold = 1,learningrate = 0.2)
311
312
             Price1 <- neuralnet(Price~Age 08 04+KM++HP+Met Color+Automatic+cc+Doors+Cylinders++Gears+Ouarterly Tax+Weight+
                                                               Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
                                                               Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
314
315
                                                                 Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
                                                               Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+Toyota_Corolla_Violet+Toyota_Corolla_White,train_split,
317
318
319
                                                                hidden = 8, threshold = 1, learning rate
320
321
             Price2 <- neuralnet(Price~Age_08_04+KM++HP+Met_Color+Automatic+cc+Doors+Cylinders++Gears+Quarterly_Tax+Weight+
322
                                                                Mfr_Guarantee+BOVAG_Guarantee+Guarantee_Period+ABS+Airbag_1+Airbag_2+Airco+Automatic_airco+
                                                                Boardcomputer+CD_Player+Central_Lock+Powered_Windows+Power_Steering+Radio+Mistlamps+
323
324
                                                                Sport_Model+Backseat_Divider+Metallic_Rim+Radio_cassette+Tow_Bar+Toyota_Corolla_CNG+
325
                                                                 Toyota_Corolla_Diesel+Toyota_Corolla_Beige+Toyota_Corolla_Black+Toyota_Corolla_Blue+
326
                                                                 Toyota_Corolla_Green++Toyota_Corolla_Grey+Toyota_Corolla_Red+Toyota_Corolla_Silver+
                                                                 Toyota_Corolla_Violet+Toyota_Corolla_White,train_split,
                                                                hidden = 8, threshold = 1, learningrate = 1.2)
```

Testing the models on train and validation datasets:

```
rain_split$results.net.result <- NULL
results <- compute(Price, train_split[,-1])
rrain_split$results.net.result <- NULL
rrain_split$results.net.result <- NULL
results <- compute(Price, train_split[,-1])
rrain_split$results.net.result <- NULL
results <- compute(Price2, train_split[,-1])
rrain_split$results.net.result <- NULL
results <- compute(Price2, train_split[,-1])
rmse(as.numeric(train_split$price), as.numeric(train_split$results.net.result))
rmse(as.numeric(train_split$price), as.numeric(train_split$results.net.result))
rmse(as.numeric(test_split(,-1])
results <- compute(Price, test_split(,-1])
rmse(as.numeric(test_split, data.frame(results$net.result))
rmse(as.numeric(test_split, f-1])
results <- compute(Price, test_split(,-1])
results <- compute(Price, test_split, f-1])
results <- compute(Price, test_split, f-1)
results <- compute(Price, test_split, f
```

## Output:

```
[1] 3468.517823
[1] 3468.517823
[1] 3468.517823
[1] 4065.956519
[1] 4065.956587
[1] 4065.956587
```

Ans: Changing the learning rate doesn't have effect on RMSE of train dataset but as we increase learning rate RSME value for validation dataset (test data) also increases.