

DS-670 Assignme...

```
%r
# loading the data into RStudio. All the data with the dimension = ARQ.
market_data <- read.csv("/Users/Mohamar/Documents/ARQ_Data_file.csv", header=TRUE, sep=",")
head(market_data, 2)
t(names(market_data))
```

FINISHED

```
ticker dimension calendardate    datekey reportperiod    accoci
1      A      ARQ    2011-03-31 2011-03-09    2011-01-31 -63000000
2      A      ARQ    2011-06-30 2011-06-07    2011-04-30 278000000

  assets assetsavg  assetsc  assetsnc assetturnover  bvps  capex
1 8.044e+09      NA 4.598e+09 3.446e+09      NA 9.602 -3.8e+07
2 8.649e+09      NA 5.096e+09 3.553e+09      NA 11.392 -5.1e+07
  cashneq cashnequsd  cor currentratio  de  debt  debtusd
1 2.655e+09 2.655e+09 7.03e+08      3.270 1.412 2.139e+09 2.139e+09
2 2.975e+09 2.975e+09 7.77e+08      3.201 1.186 2.144e+09 2.144e+09
  depamor divyield dps  ebit  ebitda ebitdamargin ebitdausd  ebitusd
1 6.3e+07      0  0 2.21e+08 2.84e+08      0.187 2.84e+08 2.21e+08
2 6.4e+07      0  0 2.80e+08 3.44e+08      0.205 3.44e+08 2.80e+08
  ebt  eps epsdil epsusd  equity equityavg equityusd  ev
1 1.98e+08 0.56  0.54  0.56 3.332e+09      NA 3.332e+09 10852293091
2 2.60e+08 0.58  0.56  0.58 3.953e+09      NA 3.953e+09 11044359780
  evebit evebitda  fcf fcfps fxusd  gp grossmargin intangibles
1 12 9.612 8.20e+07 0.236 1 8.16e+08 0.537 1.915e+09
2 10 8.655 8.27e+07 0.012 1 0.00e+00 0.537 2.018e+00
```

```
%r
# for loop to estimate returns (as a single column) based on price: P(i)/P(i-1)
returns <- vector();
for(i in 2:length(market_data[,1]))
{
  if(identical(market_data[i,1], market_data[i-1,1]))
  {
    returns[i]=market_data[i,72]/market_data[i-1,72];
  }
  else {
    returns[i]=0;
  }
}

returns[1]=0;

# adding the returns column to the market_data
market_data <- cbind(market_data,returns)

head(market_data, 2)
t(names(market_data))
```

FINISHED

ticker	dimension	calendar	date	key	report	period	acc	ci
1	A	ARQ	2011-03-31	2011-03-09	2011-01-31	-63000000		
2	A	ARQ	2011-06-30	2011-06-07	2011-04-30	278000000		
	assets	assetsavg	assetsc	assetsnc	assetturnover	bvps	capex	
1	8.044e+09	NA	4.598e+09	3.446e+09	NA	9.602	-3.8e+07	
2	8.649e+09	NA	5.096e+09	3.553e+09	NA	11.392	-5.1e+07	
	cashneq	cashnequsd	cor	currentratio	de	debt	debtusd	
1	2.655e+09	2.655e+09	7.03e+08	3.270	1.412	2.139e+09	2.139e+09	
2	2.975e+09	2.975e+09	7.77e+08	3.201	1.186	2.144e+09	2.144e+09	
	depamor	divyield	dps	ebit	ebitda	ebitdamargin	ebitdausd	ebitusd
1	6.3e+07	0	0	2.21e+08	2.84e+08	0.187	2.84e+08	2.21e+08
2	6.4e+07	0	0	2.80e+08	3.44e+08	0.205	3.44e+08	2.80e+08
	ebt	eps	epsdil	epsusd	equity	equityavg	equityusd	ev
1	1.98e+08	0.56	0.54	0.56	3.332e+09	NA	3.332e+09	10852293091
2	2.60e+08	0.58	0.56	0.58	3.953e+09	NA	3.953e+09	11044359780
	evebit	evebitda	fcf	fcfps	fxusd	gp	grossmargin	intangibles
1	12	9.612	8.20e+07	0.236	1	8.16e+08	0.537	1.915e+09
2	10	8.655	8.27e+07	0.242	1	8.00e+08	0.537	2.018e+09

```
%r
# selecting my 20 factors
market_data.factors <- market_data[c(1,3,12,17,18,22,26,30,38,40,43,65,67,68,69,70,72,73,74)]
head(market_data.factors, 2)
t(names(market_data.factors))
```

FINISHED

ticker	calendar	date	bvps	currentratio	de	divyield	ebitdamargin	eps
1	A	2011-03-31	9.602	3.270	1.412	0	0.187	0.56
2	A	2011-06-30	11.392	3.201	1.186	0	0.205	0.58
	evebitda	fcfps	grossmargin	netmargin	payoutratio	pb	pe	pe1
1	9.612	0.236	0.537	0.127	0	3.412	14.246	14.322
2	8.655	0.942	0.537	0.119	0	3.004	13.343	13.276
	price	ps	ps1	revenue	sps	tbvps	returns	
1	32.94	1.977	1.988	1.519e+09	16.571	17.663	0.000000	
2	34.12	1.929	1.923	1.677e+09	17.741	19.023	1.035823	

```
[,1] [,2] [,3] [,4] [,5] [,6]
[1,] "ticker" "calendar" "date" "bvps" "currentratio" "de" "divyield"
[,7] [,8] [,9] [,10] [,11] [,12]
[1,] "ebitdamargin" "eps" "evebitda" "fcfps" "grossmargin" "netmargin"
[,13] [,14] [,15] [,16] [,17] [,18] [,19] [,20] [,21]
[1,] "payoutratio" "pb" "pe" "pe1" "price" "ps" "ps1" "revenue" "sps"
[,22] [,23]
[1,] "tbvps" "returns"
```

```
%r
# for loop to estimate log of returns (as a single column) based on price: Pt/P(t-1)
logreturns <- vector();
for(i in 2:length(market_data.factors[,1]))
{
  logreturns[i]=log(market_data.factors[i,23]);
}
```

FINISHED

```

head(logreturns)

# adding the logreturns column to the market_data
market_data.factors <- cbind(market_data.factors,logreturns)

head(market_data.factors, 2)
#(names(market_data.factors))

[1] NA 0.03519600 -0.29006866 -0.06451502 0.24573265 -0.12271741
  ticker calendardate  bvps currentratio  de divyield ebitdamargin  eps
1      A 2011-03-31  9.602          3.270 1.412      0      0.187 0.56
2      A 2011-06-30 11.392          3.201 1.186      0      0.205 0.58
  evebitda fcfps grossmargin netmargin payoutratio  pb  pe  pe1
1  9.612 0.236      0.537      0.127      0 3.412 14.246 14.322
2  8.655 0.942      0.537      0.119      0 3.004 13.343 13.276
  price  ps  ps1  revenue  sps  tbvps  returns logreturns
1 32.94 1.977 1.988 1.519e+09 16.571 17.663 0.0000000 NA
2 34.12 1.929 1.923 1.677e+09 17.741 19.023 1.035823 0.035196
  [,1] [,2] [,3] [,4] [,5] [,6]
[1,] "ticker" "calendardate" "bvps" "currentratio" "de" "divyield"
  [,7] [,8] [,9] [,10] [,11] [,12]
[1,] "ebitdamargin" "eps" "evebitda" "fcfps" "grossmargin" "netmargin"
  [,13] [,14] [,15] [,16] [,17] [,18] [,19] [,20] [,21]
[1,] "payoutratio" "pb" "pe" "pe1" "price" "ps" "ps1" "revenue" "sps"
  [,22] [,23] [,24]
[1,] "tbvps" "returns" "logreturns"

```

```

%r
# replacing all 'Inf' in the data with NA
market_data.factors[mapply(is.infinite, market_data.factors)] <- NA
head(market_data.factors)

# removing all NAs
market_data.factors.noNA <- na.omit(market_data.factors)
head(market_data.factors.noNA, 2)

  ticker calendardate  bvps currentratio  de divyield ebitdamargin  eps
1      A 2011-03-31  9.602          3.270 1.412      0.000      0.187 0.56
2      A 2011-06-30 11.392          3.201 1.186      0.000      0.205 0.58
3      A 2011-09-30 12.046          3.470 1.086      0.000      0.215 0.95
4      A 2011-12-31 12.415          3.032 1.101      0.000      0.219 0.84
5      A 2012-03-31 12.920          3.352 1.023      0.000      0.210 0.66
6      A 2012-06-30 13.569          3.275 0.993      0.003      0.219 0.73
  evebitda fcfps grossmargin netmargin payoutratio  pb  pe  pe1
1  9.612 0.236      0.537      0.127      0.000 3.412 14.246 14.322
2  8.655 0.942      0.537      0.119      0.000 3.004 13.343 13.276
3  5.968 0.632      0.527      0.195      0.000 2.115  8.733  8.713
4  5.099 1.329      0.533      0.167      0.000 1.934  8.233  8.197
5  6.399 0.299      0.535      0.141      0.000 2.366 10.141 10.099
6  5.243 0.908      0.530      0.147      0.096 1.992  8.520  8.512
  price  ps  ps1  revenue  sps  tbvps  returns  logreturns
1 32.940 1.977 1.988 1.519e+09 16.571 17.663 0.0000000 NA
2 34.120 1.929 1.923 1.677e+09 17.741 19.023 1.0358227 0.03519600
3 25.520 1.372 1.375 1.601e+09 18.572 19.284 0.7182122 0.20006866

```

FINISHED

%r

FINISHED

Normalizing all 20 factors

```
bvps_N <- (market_data.factors.noNA[,3] - mean(market_data.factors.noNA[,3]))/sd(market_data.factors.noNA[,3])
currentratio_N <- (market_data.factors.noNA[,4] - mean(market_data.factors.noNA[,4]))/sd(market_data.factors.noNA[,4])
de_N <- (market_data.factors.noNA[,5] - mean(market_data.factors.noNA[,5]))/sd(market_data.factors.noNA[,5])
divyield_N <- (market_data.factors.noNA[,6] - mean(market_data.factors.noNA[,6]))/sd(market_data.factors.noNA[,6])
ebitdamargin_N <- (market_data.factors.noNA[,7] - mean(market_data.factors.noNA[,7]))/sd(market_data.factors.noNA[,7])
eps_N <- (market_data.factors.noNA[,8] - mean(market_data.factors.noNA[,8]))/sd(market_data.factors.noNA[,8])
evebitda_N <- (market_data.factors.noNA[,9] - mean(market_data.factors.noNA[,9]))/sd(market_data.factors.noNA[,9])
fcfps_N <- (market_data.factors.noNA[,10] - mean(market_data.factors.noNA[,10]))/sd(market_data.factors.noNA[,10])
grossmargin_N <- (market_data.factors.noNA[,11] - mean(market_data.factors.noNA[,11]))/sd(market_data.factors.noNA[,11])
netmargin_N <- (market_data.factors.noNA[,12] - mean(market_data.factors.noNA[,12]))/sd(market_data.factors.noNA[,12])
payoutratio_N <- (market_data.factors.noNA[,13] - mean(market_data.factors.noNA[,13]))/sd(market_data.factors.noNA[,13])
pb_N <- (market_data.factors.noNA[,14] - mean(market_data.factors.noNA[,14]))/sd(market_data.factors.noNA[,14])
pe_N <- (market_data.factors.noNA[,15] - mean(market_data.factors.noNA[,15]))/sd(market_data.factors.noNA[,15])
pe1_N <- (market_data.factors.noNA[,16] - mean(market_data.factors.noNA[,16]))/sd(market_data.factors.noNA[,16])
price_N <- (market_data.factors.noNA[,17] - mean(market_data.factors.noNA[,17]))/sd(market_data.factors.noNA[,17])
ps_N <- (market_data.factors.noNA[,18] - mean(market_data.factors.noNA[,18]))/sd(market_data.factors.noNA[,18])
ps1_N <- (market_data.factors.noNA[,19] - mean(market_data.factors.noNA[,19]))/sd(market_data.factors.noNA[,19])
revenue_N <- (market_data.factors.noNA[,20] - mean(market_data.factors.noNA[,20]))/sd(market_data.factors.noNA[,20])
sps_N <- (market_data.factors.noNA[,21] - mean(market_data.factors.noNA[,21]))/sd(market_data.factors.noNA[,21])
tbvps_N <- (market_data.factors.noNA[,22] - mean(market_data.factors.noNA[,22]))/sd(market_data.factors.noNA[,22])
```

%r

FINISHED

creating a data frame of all the normalized 20 factors

```
market_data.factors.Norm <- data.frame(bvps_N, currentratio_N, de_N, divyield_N, ebitdamargin_N, eps_N, evebitda_N, fcfps_N, grossmargin_N, netmargin_N, payoutratio_N, pb_N, pe_N, pe1_N, price_N, ps_N, ps1_N, revenue_N, sps_N, tbvps_N)
```

cbinding columns 'calendardate', 'returns', and 'logreturns' to the normalized factors.

```
calendardate <- market_data.factors.noNA$calendardate
```

```
returns <- market_data.factors.noNA$returns
```

```
logreturns <- market_data.factors.noNA$logreturns
```

```
ticker <- market_data.factors.noNA$ticker
```

```
market_data.factors.Norm_complete <- cbind(calendardate, market_data.factors.Norm, returns  
head(market_data.factors.Norm_complete)
```

	calendardate	bvps_N	currentratio_N	de_N	divyield_N
1	2011-06-30	-0.002459223	0.05235115	0.0017163731	-0.09739857
2	2011-09-30	0.006320483	0.11527403	0.0009796611	-0.09739857
3	2011-12-31	0.011274170	0.01281968	0.0010901679	-0.09739857
4	2012-03-31	0.018053607	0.08767217	0.0005155326	-0.09739857
5	2012-06-30	0.026766189	0.06966079	0.0002945190	-0.07909305
6	2012-09-30	0.032471656	-0.22507090	0.0003681902	-0.06688936

	ebitdamargin_N	eps_N	evebitda_N	fcfps_N	grossmargin_N
1	0.008747055	-0.003881792	0.004304101	0.018521000	0.03571064
2	0.008748785	-0.003630736	0.003810672	0.011472763	0.03331195
3	0.008749477	-0.003705374	0.003651093	0.027319929	0.03475116
4	0.008747920	-0.003827510	0.003889819	0.003901592	0.03523090
5	0.008749477	-0.003780013	0.003677537	0.017747968	0.03403156
6	0.008746363	-0.003800369	0.003909835	0.009585654	0.03091326

	netmargin_N	payoutratio_N	pb_N	pe_N	pe1_N
1	0.008862848	-0.04068744	-0.0009749304	0.0039505328	6.077121e-03
2	0.008875600	-0.04068744	-0.0041137844	0.0001323263	3.477839e-04
3	0.008870007	-0.04068744	-0.0017528527	0.0002817050	0.0010070-04

```
%r
# finding out how many different date are there in the data
date <- split(market_data.factors.Norm_complete, as.factor(market_data.factors.Norm_complete$calendardate))
length(date) # there are 20 different calendar dates

# extracting all data for a particular calendar date and assign each to a dataframe
funct3 <- split(market_data.factors.Norm_complete, market_data.factors.Norm_complete$calendardate)
factor_names <- c("n.market_data.factors_2011_03_31", "n.market_data.factors_2011_06_30", "n.market_data.factors_2011_09_30", "n.market_data.factors_2011_12_31", "n.market_data.factors_2012_03_31", "n.market_data.factors_2012_06_30", "n.market_data.factors_2012_09_30", "n.market_data.factors_2012_12_31", "n.market_data.factors_2013_03_31", "n.market_data.factors_2013_06_30", "n.market_data.factors_2013_09_30", "n.market_data.factors_2013_12_31", "n.market_data.factors_2014_03_31", "n.market_data.factors_2014_06_30", "n.market_data.factors_2014_09_30", "n.market_data.factors_2014_12_31", "n.market_data.factors_2015_03_31", "n.market_data.factors_2015_06_30", "n.market_data.factors_2015_09_30", "n.market_data.factors_2015_12_31")

for (i in 1:length(funct3)) {
  assign(factor_names[i], funct3[[i]])
}

# Verifying data for few calendar dates
head(n.market_data.factors_2011_09_30, 2)
head(n.market_data.factors_2013_03_31, 2)
head(n.market_data.factors_2011_12_31, 2)
head(n.market_data.factors_2014_06_30, 2)
head(n.market_data.factors_2015_09_30, 2)

head(n.market_data.factors_2011_06_30)

head(n.market_data.factors_2011_03_31)
```

FINISHED

```
[1] 20
  calendardate      bvps_N currentratio_N      de_N  divyield_N
2   2011-09-30 0.006320483      0.1152740 0.0009796611 -0.09739857
21  2011-09-30 0.032793847      -0.3773489 0.0035065832 -0.02417646
  ebitdamargin_N      eps_N  evebitda_N      fcfps_N grossmargin_N
2   0.008748785 -0.003630736 0.003810672 0.0114727627 0.03331195
21  0.008731313 -0.004166774 0.003704347 0.0006048354 -0.05088193
  netmargin_N payoutratio_N      pb_N      pe_N      pe1_N
2   0.008875600 -0.040687439 -0.004113784 0.0001323263 0.0003477839
21  0.008847411 -0.001323075 -0.009074516 0.0011734294 0.0017766653
  price_N      ps_N      ps1_N revenue_N      sps_N      tbvps_N
2  -0.06561558 -0.01136768 -0.01112355 0.144882 -0.03191092 -0.04735782
21 -0.26310794 -0.01146580 -0.01122471 1.218632 -0.02520986 0.04456954
  returns logreturns
2  0.7482122 -0.2900687
21 0.6309448 -0.4605368
  calendardate      bvps_N currentratio_N      de_N  divyield_N
2   2012-03-31 0.05150772      0.00022515 0.0002707212 -0.012121026
```

```
%r
# Using Neuralnet on logreturns on the 20 factors, for 75% of the dates.
# I am using the first three quaters of years 2011 to 2015.
```

FINISHED

```
install.packages('neuralnet', repos = 'http://cran.us.r-project.org')
library(neuralnet)
```

The downloaded binary packages are in
 /var/folders/7b/jk0vn7m91g599255yn29jd500000gn/T//Rtmp8EWqL7/downloaded_packages

```
%r
names(n.market_data.factors_2011_03_31)

# creating a formula to be used with neuralnet
colnames <- names(n.market_data.factors_2011_03_31)
# colnames %in% c("calendardate", "returns", "logreturns")
# !colnames %in% c("calendardate", "returns", "logreturns")
# paste(colnames[!colnames %in% c("calendardate", "returns", "logreturns")])
# paste(colnames[!colnames %in% c("calendardate", "returns", "logreturns")], collapse = " +
# paste("logreturns ~", paste(colnames[!colnames %in% c("calendardate", "returns", "logretui

nn.formula <- as.formula(paste("logreturns ~", paste(colnames[!colnames %in% c("calendarda
nn.formula
```

FINISHED

```

[1] "calendardate"    "bvps_N"          "currentratio_N"  "de_N"
[5] "divyield_N"      "ebitdamargin_N"  "eps_N"           "evebitda_N"
[9] "fcfps_N"         "grossmargin_N"   "netmargin_N"     "payoutratio_N"
[13] "pb_N"            "pe_N"            "pe1_N"           "price_N"
[17] "ps_N"            "ps1_N"           "revenue_N"       "sps_N"
[21] "tbvps_N"         "returns"         "logreturns"

```

```

logreturns ~ bvps_N + currentratio_N + de_N + divyield_N + ebitdamargin_N +
  eps_N + evebitda_N + fcfps_N + grossmargin_N + netmargin_N +
  payoutratio_N + pb_N + pe_N + pe1_N + price_N + ps_N + ps1_N +
  revenue_N + sps_N + tbvps_N

```

```

%r
# For 2011
nn.model_2011_03_31 <- neuralnet(nn.formula, data=n.market_data.factors_2011_03_31, hidden=
plot(nn.model_2011_03_31)

weights_nn.model_2011_03_31 <- nn.model_2011_03_31$result.matrix

View(weights_nn.model_2011_03_31)

```

FINISHED

```
%r
```

READY