```
R version 3.3.3 (2017-03-06) -- "Another Canoe"
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Platform: x86_64-w64-mingw32/x64 (64-bit)
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Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.
[Previously saved workspace restored]
> getwd()
[1] "C:/Users/bhaskarnilh/Documents/Official Learning centre/Edx/MITx/The Analytics Edge/2nd week
-LR"
> data=read.csv("climate_change.csv")
> str(data)
'data.frame':
                308 obs. of 11 variables:
          : int 1983 1983 1983 1983 1983 1983 1983 1984 1984 ...
 $ Year
          : int 5 6 7 8 9 10 11 12 1 2 ...
 $ Month
          : num 2.556 2.167 1.741 1.13 0.428 ...
 $ MEI
 $ CO2
          : num 346 346 344 342 340 ...
 $ CH4
          : num 1639 1634 1633 1631 1648 ...
 $ N2O
          : num 304 304 304 304 ...
 $ CFC.11 : num 191 192 193 194 194 ...
 $ CFC.12 : num 350 352 354 356 357
          : num 1366 1366 1366 1366 ...
 $ TSI
 $ Aerosols: num 0.0863 0.0794 0.0731 0.0673 0.0619 0.0569 0.0524 0.0486 0.0451 0.0416 ...
 $ Temp
          : num 0.109 0.118 0.137 0.176 0.149 0.093 0.232 0.078 0.089 0.013 ...
     dt = sort(sample(nrow(data), nrow(data)*.7))
>
      train<-data[dt,]
     test<-data[-dt,]
>
      climate_train<-data[dt,]</pre>
> climate_test<-dat[-dt,]</pre>
Error: object 'dat' not found
> climate_test<-data[-dt,]</pre>
> str(climate_train)
'data.frame':
               215 obs. of 11 variables:
          : int 1983 1983 1983 1983 1983 1984 1984 1984 1984 ...
 $ Year
 $ Month
          : int 5 6 7 8 9 11 1 2 4 5 ...
          : num 2.556 2.167 1.741 1.13 0.428 ...
 $ MEI
          : num 346 346 344 342 340 ...
 $ CO2
 $ CH4
          : num 1639 1634 1633 1631 1648 ...
          : num 304 304 304 304 ...
 $ N2O
 $ CFC.11 : num 191 192 193 194 194 ...
 $ CFC.12 : num 350 352 354 356 357
 $ TSI
          : num 1366 1366 1366 1366 ...
 $ Aerosols: num 0.0863 0.0794 0.0731 0.0673 0.0619 0.0524 0.0451 0.0416 0.0352 0.0324 ...
          : num 0.109 0.118 0.137 0.176 0.149 0.232 0.089 0.013 -0.019 0.065 ...
> model1=lm(Temp~MEI+CO2+CH4+N2O+CFC.11+CFC.12+TSI+Aerosols, data=climate_train)
> summary(model1)
Call:
lm(formula = Temp \sim MEI + CO2 + CH4 + N2O + CFC.11 + CFC.12 +
    TSI + Aerosols, data = climate_train)
Residuals:
                                     3Q
                 10
     Min
                      Median
-0.257292 -0.068086 0.001382 0.062702 0.316031
```

R Console Coefficients: Estimate Std. Error t value Pr(>|t|) (Intercept) -1.127e+02 2.394e+01 -4.709 4.56e-06 *** 6.688e-02 7.911e-03 8.454 5.13e-15 *** 4.745e-03 2.751e-03 CO₂ 1.725 0.086036 . CH4 -2.518e-04 6.252e-04 -0.403 0.687612 N20 -1.484e-02 9.524e-03 -1.558 0.120762 -7.039e-03 1.797e-03 -3.918 0.000122 *** CFC.11 4.024 8.03e-05 *** 4.364e-03 1.084e-03 CFC.12 4.882 2.10e-06 *** TSI 8.487e-02 1.739e-02 -1.645e+00 2.467e-01 Aerosols -6.668 2.34e-10 *** Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1 Residual standard error: 0.09583 on 206 degrees of freedom Multiple R-squared: 0.7317, Adjusted R-squared: 0.7212 F-statistic: 70.21 on 8 and 206 DF, p-value: < 2.2e-16 > dataTrain=subset(data,data\$Year <=2006)</pre> > dataTest=subset(data,data\$Year>2006) > summary(datTrain) Error in summary(datTrain) : object 'datTrain' not found > summary(dataTrain) Year Month MEI CO2 Min. : 1.000 Min. :-1.5860:1983 :340.2 Min. 1st Qu.: 4.000 1st Qu.:1989 1st Qu.:-0.3230 1st Qu.:352.3 Median : 7.000 Median : 0.3085 Median :359.9 Median :1995 Mean : 0.3419 Mean :361.4 Mean :1995 Mean : 6.556 3rd Qu.:2001 3rd Qu.:10.000 3rd Qu.: 0.8980 3rd Qu.:370.6 :2006 Max. : 3.0010 Max. :12.000 Max. :385.0 Max. CFC.11 CFC.12 CH4 N20 TST :303.7 :191.3 :350.1 Min. :1630 Min. :1365 Min. Min. Min. 1st Qu.:307.7 1st Qu.:1716 1st Qu.:249.6 1st Qu.:462.5 1st Qu.:1366 Median :1759 Median :310.8 Median :260.4 Median :522.1 Median:1366 Mean :1746 Mean :311.7 Mean :252.5 Mean :1366 Mean :494.2 3rd Qu.:1782 3rd Qu.:267.4 3rd Qu.:316.1 3rd Qu.:541.0 3rd Qu.:1366 :1808 Max. :320.5 Max. :271.5 Max. :543.8 Max. :1367 Max. Aerosols Temp Min. :0.00160 :-0.2820 Min. 1st Qu.: 0.1180 1st Qu.:0.00270 Median : 0.2325 Median : 0.00620 Mean : 0.2478 :0.01772 3rd Qu.: 0.4065 3rd Qu.:0.01400 :0.14940 Max. : 0.7390 > model1=lm(Temp~MEI+CO2+CH4+N2O+CFC.11+CFC.12+TSI+Aerosols) Error in eval(expr, envir, enclos) : object 'Temp' not found > model1=lm(Temp~MEI+CO2+CH4+N2O+CFC.11+CFC.12+TSI+Aerosols, data=dataTrain) > summary(dataTrain) CO2 Year Month MEIMin. :340.2 :1983 Min. : 1.000 Min. :-1.5860Min. 1st Qu.: 4.000 1st Qu.:1989 1st Qu.:-0.3230 1st Qu.:352.3 Median : 7.000 Median : 0.3085 Median :359.9 Median :1995 Mean : 6.556 Mean : 0.3419 Mean :361.4 :1995 3rd Qu.:2001 3rd Qu.:10.000 3rd Qu.: 0.8980 3rd Qu.:370.6 :2006 Max. :12.000 Max. : 3.0010 Max. :385.0 Max. CFC.11 CFC.12 CH4 N20 TST :303.7 :191.3 :350.1 :1630 Min. Min. Min. :1365 Min. Min. 1st Qu.:307.7 1st Qu.:1716 1st Qu.:249.6 1st Qu.:462.5 1st Qu.:1366 Median :1759 Median :310.8 Median :260.4 Median :522.1 Median :1366 Mean :311.7 Mean :1366 :1746 Mean :252.5 Mean :494.2 Mean 3rd Qu.:1782 3rd Qu.:316.1 3rd Qu.:267.4 3rd Qu.:541.0 3rd Qu.:1366 Max. :1808 Max. :320.5 Max. :271.5 Max. :543.8 Max. :1367 Aerosols Temp Min. :0.00160 :-0.2820 Min. 1st Qu.: 0.1180 1st Qu.:0.00270 Median : 0.2325 Median : 0.00620 Mean : 0.2478 Mean :0.01772 3rd Qu.: 0.4065 3rd Qu.:0.01400

Max. :0.14940 > summary(model1) Max. : 0.7390

```
Call:
lm(formula = Temp \sim MEI + CO2 + CH4 + N2O + CFC.11 + CFC.12 +
    TSI + Aerosols, data = dataTrain)
Residuals:
                   Median
     Min
               10
                                  30
-0.25888 -0.05913 -0.00082 0.05649 0.32433
Coefficients:
              Estimate Std. Error t value Pr(>|t|)
(Intercept) -1.246e+02 1.989e+01 -6.265 1.43e-09 ***
             6.421e-02 6.470e-03
                                   9.923 < 2e-16 ***
MEI
             6.457e-03 2.285e-03
                                   2.826 0.00505 **
CO2
            1.240e-04 5.158e-04
                                   0.240 0.81015
CH4
            -1.653e-02 8.565e-03 -1.930 0.05467
N20
CFC. 11
            -6.631e-03 1.626e-03 -4.078 5.96e-05 ***
             3.808e-03 1.014e-03
                                   3.757 0.00021 ***
CFC.12
             9.314e-02 1.475e-02
                                   6.313 1.10e-09 ***
TST
            -1.538e+00 2.133e-01 -7.210 5.41e-12 ***
Aerosols
Signif. codes: 0 \***' 0.001 \**' 0.01 \*' 0.05 \.' 0.1 \ ' 1
Residual standard error: 0.09171 on 275 degrees of freedom
Multiple R-squared: 0.7509, Adjusted R-squared: 0.7436
F-statistic: 103.6 on 8 and 275 DF, p-value: < 2.2e-16
> cor(model1)
Error in cor(model1) : supply both 'x' and 'y' or a matrix-like 'x'
> cor(dataTrain)
                             Month
                                              MET
                Year
                                                           CO2
          1.00000000 - 0.0279419602 - 0.0369876842 0.98274939 0.91565945
Year
         -0.02794196 \quad 1.0000000000 \quad 0.0008846905 \quad -0.10673246 \quad 0.01856866
Month
MEI
         -0.03698768 0.0008846905 1.0000000000 -0.04114717 -0.03341930
          0.98274939 - 0.1067324607 - 0.0411471651 1.00000000 0.87727963
CO<sub>2</sub>
          0.91565945 0.0185686624 -0.0334193014 0.87727963 1.00000000
CH4
          0.99384523 0.0136315303 -0.0508197755 0.97671982 0.89983864
N20
          0.56910643 \ -0.0131112236 \ \ 0.0690004387 \ \ 0.51405975 \ \ 0.77990402
CFC.11
CFC.12
         0.89701166 0.0006751102 0.0082855443 0.85268963 0.96361625
          0.17030201 - 0.0346061935 - 0.1544919227 0.17742893 0.24552844
TSI
Aerosols -0.34524670 0.0148895406 0.3402377871 -0.35615480 -0.26780919
          0.78679714 - 0.0998567411 \ 0.1724707512 \ 0.78852921 \ 0.70325502
Temp
                 N20
                          CFC.11
                                         CFC.12
                                                        TSI
                                                               Aerosols
Year
          0.99384523 0.56910643 0.8970116635 0.17030201 -0.34524670
          0.01363153 - 0.01311122 \ 0.0006751102 - 0.03460619 \ 0.01488954
Month
         -0.05081978 \quad 0.06900044 \quad 0.0082855443 \quad -0.15449192 \quad 0.34023779
MEI
CO<sub>2</sub>
          0.97671982 0.51405975 0.8526896272 0.17742893 -0.35615480
          0.89983864 0.77990402 0.9636162478 0.24552844 -0.26780919
CH4
          1.00000000 \quad 0.52247732 \quad 0.8679307757 \quad 0.19975668 \quad -0.33705457
N20
CFC.11
          0.52247732 1.00000000 0.8689851828 0.27204596 -0.04392120
         0.86793078 0.86898518 1.0000000000 0.25530281 -0.22513124
CFC.12
          0.19975668 0.27204596 0.2553028138 1.00000000 0.05211651
TSI
Aerosols -0.33705457 -0.04392120 -0.2251312440 0.05211651 1.00000000
          0.77863893 0.40771029 0.6875575483 0.24338269 -0.38491375
Temp
                Temp
          0.78679714
Year
         -0.09985674
Month
          0.17247075
MEI
          0.78852921
CO<sub>2</sub>
CH4
          0.70325502
N20
          0.77863893
          0.40771029
CFC.11
CFC.12
          0.68755755
          0.24338269
TSI
Aerosols -0.38491375
          1.00000000
Temp
> model2=lm(N2O~MEI+TSI+Aerosols, data=dataTrain)
> summary(model2)
```

Call:

```
lm(formula = N20 ~ MEI + TSI + Aerosols, data = dataTrain)
Residuals:
   Min
            1Q Median
                            3Q
                                   Max
-6.8849 -4.5183 0.4462 2.7020 8.8085
Coefficients:
             Estimate Std. Error t value Pr(>|t|)
(Intercept) -3549.5201 896.8079 -3.958 9.59e-05 ***
                         0.3009
                                  2.018 0.0445 *
MF: T
               0.6073
TSI
               2.8271
                          0.6565
                                 4.306 2.30e-05 ***
Aerosols
             -61.8079
                          9.2217 -6.702 1.13e-10 ***
Signif. codes: 0 \***' 0.001 \**' 0.01 \*' 0.05 \.' 0.1 \' 1
Residual standard error: 4.351 on 280 degrees of freedom
Multiple R-squared: 0.173, Adjusted R-squared: 0.1641
F-statistic: 19.52 on 3 and 280 DF, p-value: 1.6e-11
> model2=lm(Temp~N2O+MEI+TSI+Aerosols, data=dataTrain)
> summary(model2)
Call:
lm(formula = Temp ~ N2O + MEI + TSI + Aerosols, data = dataTrain)
Residuals:
              10
                  Median
                                30
    Min
-0.27916 -0.05975 -0.00595 0.05672 0.34195
Coefficients:
             Estimate Std. Error t value Pr(>|t|)
(Intercept) -1.162e+02 2.022e+01 -5.747 2.37e-08 ***
N20
            2.532e-02 1.311e-03 19.307 < 2e-16 ***
MEI
            6.419e-02 6.652e-03
                                  9.649 < 2e-16 ***
            7.949e-02 1.487e-02
                                  5.344 1.89e-07 ***
TST
           -1.702e+00 2.180e-01 -7.806 1.19e-13 ***
Aerosols
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.09547 on 279 degrees of freedom
Multiple R-squared: 0.7261, Adjusted R-squared: 0.7222
F-statistic: 184.9 on 4 and 279 DF, p-value: < 2.2e-16
> newStepModel=step(model1)
Start: AIC=-1348.16
Temp \sim MEI + CO2 + CH4 + N2O + CFC.11 + CFC.12 + TSI + Aerosols
          Df Sum of Sq
                         RSS
           1 0.00049 2.3135 -1350.1

    CH4

<none>
                       2.3130 -1348.2
          1 0.03132 2.3443 -1346.3
- N2O
          1 0.06719 2.3802 -1342.0
- CO2
- CFC.12
          1 0.11874 2.4318 -1335.9
- CFC.11 1 0.13986 2.4529 -1333.5
- TSI 1 0.33516 2.6482 -1311.7
- Aerosols 1 0.43727 2.7503 -1301.0
- MEI
          1 0.82823 3.1412 -1263.2
Step: AIC=-1350.1
Temp \sim MEI + CO2 + N2O + CFC.11 + CFC.12 + TSI + Aerosols
          Df Sum of Sq
                         RSS
                       2.3135 -1350.1
<none>
               0.03133 2.3448 -1348.3
- N2O
           1 0.06672 2.3802 -1344.0
- CO2
- CFC.12
          1 0.13023 2.4437 -1336.5
- CFC.11 1 0.13938 2.4529 -1335.5
          1 0.33500 2.6485 -1313.7
- TSI
- Aerosols 1 0.43987 2.7534 -1302.7
          1 0.83118 3.1447 -1264.9
- MEI
```

```
> summary(newStepModel)
lm(formula = Temp ~ MEI + CO2 + N2O + CFC.11 + CFC.12 + TSI +
   Aerosols, data = dataTrain)
Residuals:
                                 3Q
    Min
               1Q
                   Median
                                         Max
-0.25770 -0.05994 -0.00104 0.05588 0.32203
Coefficients:
             Estimate Std. Error t value Pr(>|t|)
(Intercept) -1.245e+02 1.985e+01 -6.273 1.37e-09 ***
            6.407e-02 6.434e-03
                                  9.958 < 2e-16 ***
            6.402e-03 2.269e-03
                                  2.821 0.005129 **
CO<sub>2</sub>
N20
           -1.602e-02 8.287e-03
                                  -1.933 0.054234
CFC. 11
           -6.609e-03 1.621e-03
                                  -4.078 5.95e-05 ***
                                  3.942 0.000103 ***
CFC. 12
             3.868e-03 9.812e-04
                                  6.322 1.04e-09 ***
TST
             9.312e-02 1.473e-02
           -1.540e+00 2.126e-01 -7.244 4.36e-12 ***
Aerosols
Signif. codes: 0 `***' 0.001 `**' 0.01 `*' 0.05 `.' 0.1 ` ' 1
Residual standard error: 0.09155 on 276 degrees of freedom
Multiple R-squared: 0.7508, Adjusted R-squared: 0.7445
F-statistic: 118.8 on 7 and 276 DF, p-value: < 2.2e-16
> help(step)
starting httpd help server ... done
> predict_Temp=predict(newStepModel1,newdat=dataTest)
Error in predict(newStepModel1, newdat = dataTest) :
  object 'newStepModel1' not found
> predict_Temp=predict(newStepModel1,newdata=dataTest)
Error in predict(newStepModel1, newdata = dataTest) :
  object 'newStepModel1' not found
> predict_Temp=predict(newStepModel,newdata=dataTest)
> summary(predict_temp)
Error in summary(predict_temp) : object 'predict_temp' not found
> summary(predict_Temp)
  Min. 1st Qu. Median
                          Mean 3rd Qu.
                                           Max.
 0.3142 0.3418 0.3771 0.3832 0.4245 0.4678
> predict_Temp
                         287
                286
                                    288
                                              289
                                                        290
                                                                  291
      285
0.4677808 \ 0.4435404 \ 0.4265541 \ 0.4299162 \ 0.4455113 \ 0.4151422 \ 0.4097367 \ 0.3839390
      293
                294
                         295
                                    296
                                              297
                                                        298
                                                                  299
0.3255595 \ 0.3274147 \ 0.3231401 \ 0.3316704 \ 0.3522134 \ 0.3313129 \ 0.3142112 \ 0.3703410
                         303
                                    304
                                              305
                                                        306
                                                                  307
      301
                302
0.4162213 0.4391458 0.4237965 0.3913679 0.3587615 0.3451991 0.3607087 0.3638076
> summary(data_Test)
Error in summary(data_Test) : object 'data_Test' not found
> summary(dataTest)
                   Month
                                                       CO2
     Year
                                    MEI
               Min. : 1.00
       :2007
                               Min. :-1.6350
                                                 Min.
                                                        :380.9
Min.
 1st Qu.:2007
               1st Qu.: 3.75
                                1st Qu.:-1.0437
                                                  1st Qu.:383.1
Median :2008
              Median: 6.50
                               Median :-0.5305
                                                 Median:384.5
      :2008
               Mean : 6.50
                               Mean :-0.5098
                                                 Mean :384.7
Mean
               3rd Qu.: 9.25
 3rd Qu.:2008
                                3rd Qu.:-0.0360
                                                  3rd Qu.:386.1
               Max. :12.00
                               Max. : 0.9740
      :2008
                                                 Max. :388.5
 Max.
                                                   CFC.12
      CH4
                    N20
                                   CFC.11
                                                                     TSI
                                     :244.1
       :1772
                                                                Min. :1366
               Min.
                      :320.3
                                               Min.
                                                     :534.9
Min.
                                Min.
 1st Qu.:1792
               1st Qu.:320.6
                                1st Qu.:244.6
                                               1st Qu.:535.1
                                                                1st Qu.:1366
 Median :1798
              Median :321.3
                                                               Median :1366
                               Median :246.2
                                               Median :537.0
      :1797
               Mean :321.1
                               Mean :245.9
                                               Mean :536.7
                                                                Mean :1366
Mean
 3rd Qu.:1804
               3rd Qu.:321.4
                                3rd Qu.:246.6
                                                3rd Qu.:537.4
                                                                3rd Qu.:1366
      :1814
              Max.
                       :322.2
                               Max. :248.4
                                               Max. :539.2
                                                                Max. :1366
 Max.
   Aerosols
                        Temp
 Min. :0.003100
                   Min.
                         :0.074
 1st Qu.:0.003600
                   1st Qu.:0.307
                   Median :0.380
 Median :0.004100
```

Mean :0.004071

Mean :0.363

```
3rd Qu.:0.004500 3rd Qu.:0.414
Max. :0.005400 Max. :0.601
> model5=lm(Temp~MEI+CO2+CH4+N2O+CFC.11+CFC.12+TSI+Aerosols, data=dataTest)
> summary(model5)
Call:
lm(formula = Temp \sim MEI + CO2 + CH4 + N2O + CFC.11 + CFC.12 +
   TSI + Aerosols, data = dataTest)
Residuals:
     Min
               1Q
                    Median
                                  30
-0.164432 -0.044591 -0.002422 0.039589 0.159291
Coefficients:
            Estimate Std. Error t value Pr(>|t|)
(Intercept) 1.517e+03 1.158e+03 1.310 0.2100
           3.175e-02 4.571e-02 0.695
MEI
                                        0.4979
           4.379e-03 1.784e-02 0.245
CO2
                                       0.8094
          -2.262e-03 4.250e-03 -0.532
CH4
                                       0.6024
          -1.180e-01 1.591e-01 -0.742
N20
                                        0.4697
CFC.11
           3.817e-02 1.494e-01 0.255
                                        0.8018
         -7.364e-02 1.630e-01 -0.452
CFC.12
                                       0.6578
          -1.060e+00 8.147e-01 -1.301
TSI
                                       0.2130
           1.484e+02 6.559e+01 2.263 0.0389 *
Aerosols
Signif. codes: 0 \***' 0.001 \**' 0.01 \*' 0.05 \.' 0.1 \' 1
Residual standard error: 0.08178 on 15 degrees of freedom
Multiple R-squared: 0.6249, Adjusted R-squared: 0.4249
F-statistic: 3.124 on 8 and 15 DF, p-value: 0.02734
```