

ACAD**GILD**

SESSION 13: DecisionTree Based Models

Assignment 3

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Data Analytics

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1. Problem Statement

Use the given link below:

https://archive.ics.uci.edu/ml/machine-learning-databases/00304/

Problem-prediction of the number of comments in the upcoming 24 hours on those blogs, the train data was generated from different base times that may temporally overlap. Therefore, if you simply split the train into disjoint partitions, the underlying time intervals may overlap. Therefore, the you should use the provided, temporally disjoint train and test splits to ensure that the evaluation is fair.

- a) Interpret the final model coefficients.
- b) Plot the model result and compare it with assumptions of the model.

2. Solution

a) Interpret the final model coefficients.

The R-script for the given problem is as follows:

```
library(foreach)
library(readr)
library(dplyr)

setwd("E:/uday/acadgild data analytics/supporting files/BlogFeedback") getwd()

blogData_train <- read_csv("E:/uday/acadgild data analytics/supporting files/BlogFeedback/blogData_train.csv")

# retrieve filenames of test sets

test_filenames = list.files(pattern = "blogData_test")

# load and combine dataset

train = fread("blogData_train.csv")

fbtest = foreach(i = 1:length(test_filenames), .combine = rbind) %do% {

temp = fread(test_filenames[i], header = F)
```

```
# Assign variable names to the train and test data set
colnames(blogData_train) <-
c("plikes","checkin","talking","category","d5","d6","d7","d8","d9","d10","d11","d12",
"d13","d14","d15","d16","d17","d18","d19","d20","d21","d22","d23","d24","d25","d26",
"d27","d28","d29","cc1","cc2","cc3","cc4","cc5","basetime","postlength","postshre",
 "postpromo","Hhrs","sun","mon","tue","wed","thu","fri","sat","basesun","basemon",
                                           "basetue", "basewed", "basethu", "basefri", "basesat", "target")
dim(blogData train)
dim(fbtest)
View(blogData_train)
View(fbtest)
str(blogData_train)
str(fbtest)
train <- blogData_train; test <- fbtest
head(train); head(test)
# making the data tidy by constructing single collumn for post publish day
train$pubday<- ifelse(train$sun ==1, 1, ifelse(train$mon ==1, 2, ifelse(train$tue ==1, 3,
                                                                                                     ifelse(train$wed ==1, 4, ifelse(train$thu
==1, 5, ifelse(train\$fri ==1, 6,
ifelse(train\$sat ==1, 7, NA))))))
# making the data tidy by constructing single collumn for base day
train$baseday<- ifelse(train$basesun ==1, 1, ifelse(train$basemon ==1, 2,
ifelse(train$basetue == 1, 3,
                                                                                                                  ifelse(train$basewed ==1, 4,
ifelse(train$basethu ==1, 5,
library(MASS)
final_model < -lm(target \sim checkin + talking + d5 + d6 + d7 + d8 + d9 + d10 + d11 
                            d12 + d13 + d16 + d17 + d19 + d20 + d21 + d22 + d23 + d24 +
                            cc1 + cc2 + cc3 + cc4 + basetime + postshre + Hhrs + wed +
                            thu + fri + basemon + basewed, data = train)
summary(final_model)
# a interpret the final model coefficients
summary(final_model)
coef(final_model) # coefficients of the model
```

}

The output of the R-Script (from Console window) is given as follows:

```
> library(data.table)
> library(foreach)
> library(readr)
> library(dplyr)
>
> setwd("E:/uday/acadgild data analytics/supporting files/BlogFeedback")
[1] "E:/uday/acadgild data analytics/supporting files/BlogFeedback"
> blogData_train <- read_csv("E:/uday/acadgild data analytics/supporting
files/BlogFeedback/blogData_train.csv") Parsed with column specification:
  .default = col_double()
See spec(...) for full column specifications.
====== | 100%
> # retrieve filenames of test sets
> test filenames = list.files(pattern = "blogData test")
> # load and combine dataset
> train = fread("blogData train.csv")
> fbtest = foreach(i = 1:length(test_filenames), .combine = rbind) %do% {
    temp = fread(test filenames[i], header = F)
+ }
>
> # Assign variable names to the train and test data set
> colnames(blogData_train) <-
c ("plikes", "checkin", "talking", "category", "d5", "d6", "d7", "d8", "d9", "d10", "d11 ", "d12",
   "d13", "d14", "d15", "d16", "d17", "d18", "d19", "d20", "d21", "d22", "d23", "d24", "d25"
"d26",
"d27","d28","d29","cc1","cc2","cc3","cc4","cc5","basetime","postlength","post shre",
"postpromo", "Hhrs", "sun", "mon", "tue", "wed", "thu", "fri", "sat", "basesun", "basem on",
"basetue", "basewed", "basethu", "basefri", "basesat", "target")
> dim(blogData_train) [1]
52396
              281
> dim(fbtest)
[1] 7624
            281
> View(blogData_train)
> View(fbtest)
> str(blogData_train)
Classes 'spec_tbl_df', 'tbl_df', 'tbl' and 'data.frame':
                                                                         52396 obs. of
281 variables:
                                      40.3 40.3 40.3 ...
 $ plikes
                          40.3 40.3
               : num
                                      53.8 53.8 53.8 ...
 $ checkin
                          53. 8 53. 8
               : num
 $ talking
              : num
                          00000
                                      0 0 0 0 0 ...
 $ category
               : num
```

```
$ d5
              : num
                      15 15 15 15 15 15 15 15 15 15 ...
$ d6
                        15. 5 15. 5 15. 5
                                        15.5 15.5 . . .
                num
$ d7
                        32. 4 32. 4 32. 4
                                         32.4 32.4 . . .
                num
$ d8
                      0 0 0 0 0 0 0 0 0 0 ...
              : num
$ d9
              : num
                      377 377 377 377 377 377 377 377 377 ...
$ d10
                      3 3 3 3 3 3 3 3 3 3 . . .
              : num
                      14 14 14 14 14 . . .
$ d11
              : num
$ d12
                      32.6 32.6 32.6 32.6 32.6 ...
               num
$ d13
                       0 0 0 0 0 0 0 0
                                         0 0 ...
                num
                                          377 377 377 377 377 ...
$ d14
                       377 377 377 377
                num
$ d15
                       2 2 2 2 2 2 2 2
                                           2 2 ...
                num
                        34.6 34.6 34.6
                                         34.6 34.6 ...
$ d16
                num
                        48. 5 48. 5 48. 5 48. 5 . . .
$ d17
                num
$ d18
              : num
                      0 0 0 0 0 0 0 0 0 0 ...
$ d19
                      num
$ d20
                      12 12 12 12 12 12 12 12 12 12 ...
                num
                            1.48 1.48
$ d21
                      1. 48
                                        1.48 1.48 ...
                num
                                         46.2 46.2 ...
$ d22
                             46. 2 46. 2
                num
              : num
                            -356 -356
                                        -356 -356 -356 -356 -356
$ d23
                                                                     -356 -356
                                                                                . . .
                      377 377 377 377 377 377 377 377 377 ...
$ d24
              : num
                      0 0 0 0 0 0 0 0 0 0 ...
$ d25
              : num
$ d26
              : num
                      1.08 1.08 1.08 1.08 1.08 ...
$ d27
                      1.8 1.8 1.8 1.8 1.8 ...
              : num
                       0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ \dots
$ d28
                num
$ d29
                num
                       11 11
                              $ cc1
                num
                       000 000
                                     0 0 0 0 ...
$ cc2
              : num
                      0.4 0.4 0.4 0.4 0.4 ...
$ cc3
              : num
                      1.08 1.08 1.08 1.08 1.08 ...
                      0 0 0 0 0 0 0 0 0 0 ...
$ cc4
              : num
                      9 9 9 9 9 9 9 9 9 ...
$ cc5
              : num
                      0 0 0 0 0 0 0 0 0 0 ...
$ basetime
                num
$ postlength: num
                      0. 378 0. 378 0. 378 0. 378 0. 378 . . .
                      1. 07 1. 07 1. 07 1. 07 1. 07 . . .
$ postshre
              : num
                      0 0 0 0 0 0 0 0 0 0 ...
 $ postpromo :
                num
                      9 9 9 9 9 9 9 9 9 ...
$ Hhrs
                num
$ sun
                num
                      0 0 0 0 0 0 0 0 0 0 ...
$ mon
                      0. 973 0. 973 0. 973 0. 973 0. 973 . . .
              : num
$ tue
              : num
                      1.7 1.7 1.7 1.7 1.7 ...
                       000 000 0000...
$ wed
                num
                       10 10 10 10 10 10 10 10 10 10 ...
$ thu
                num
                       000 000
$ fri
              : num
                                     0000...
                      0.0229 0.0229 0.0229 0.0229 0.0229 ...
$ sat
              : num
$ basesun
              : num
                      1. 52 1. 52 1. 52 1. 52 1. 52 . . .
$ basemon
              : num
                      -8 -8 -8 -8 -8 -8 -8 -8 -8 ...
$ basetue
                      9 9 9 9 9 9 9 9 9
               num
                                              . . .
                        0 0 0 0 0 0 0 0 0
$ basewed
                      0
                num
$ basethu
                         6
                          2 3 6 6 3 30 30
                                              0 . . .
                num
                      6
                        2 2
                             1 0 0 1 27 27
                                              0 ...
$ basefri
                num
                      4 4 0 2 2 2 2 1 1 0
$ basesat
                num
                      5 5 2 2 5 5 2 2 2 0
$ target
                num
$ NA
                      -2 -2 2 -1 -2 -2 -1 26 26
               num
                      0 0 0 0 0 0 0 0 0 2 ...
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$ NA
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$ NA
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                num
                      0 0 0 0 0 0 0 0 0 2 ...
$ NA
              : num
```

```
      $ NA
      : num
      35 35 10 34 59 59 34 58 58 11 ...

      $ NA
      : num
      0 0 0 0 0 0 0 0 0 0 ...

      $ NA
      : num
      0 0 0 0 0 0 0 0 0 0 ...

      $ NA
      : num
      0 0 0 0 0 0 0 0 0 0 ...

      $ NA
      : num
      0 0 0 0 0 0 0 0 0 0 ...
```

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$ NA
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$ NA
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                          0
                 num
                        0
 [list output truncated]
- attr( ,* "spec")=
    cols(
        `40.30467` = col_double(),
       `53.845657` = col_double(),
       0.0 = col_double()
       `401.0` = col double().
       15.0 = col_double(),
       15.52416 = col_double(),
       32.44188 = col_double(),
       0.0_1 = col_double()
       377.0 = col_double()
       3.0 = col_double(),
       14.044226 = col_double(),
       `32.615417` = col_double(),
       0.0_2 = col_double()
       377.0_1 = col_double()
       `2.0` = col_double(),
       34.567566 = col_double(),
       `48.475178` = col_double(),
       0.0_3 = col_double()
       378.0 = col_double()
 . .
        `12.0` = col_double(),
 . .
```

```
.. `1.4799345` = col_double(),
.. `46.18691` = col_double(),
```

```
-356.0 = col_double(),
      377.0_2 = col_double(),
      0.0_4 = col_double()
      1.0761671 = col_double(),
      `1.795416` = col_double(),
      0.0_5 = col_double()
      `11.0` = col_double(),
      0.0_6 = col_double(),
      0.4004914 = col_double(),
      `1.0780969` = col_double(),
      0.0_7 = col_double(),
      9.0 = col double().
      0.08 = coldouble().
      0.37755936 = coldouble().
      1.07421 = col_double(),
      0.09 = coldouble().
      9.0_1 = col_double()
      `0.0 10` = col double(),
      0.972973 = col_double(),
      1.704671 = col_double(),
      0.0_{11} = col_double(),
      10.0 = col_double(),
      0.012 = coldouble().
      `0.022932023` = col_double(),
      `1.521174` = col_double(),
      -8.0 = col double().
      9.0_2 = col_double(),
      0.013 = coldouble().
      2.0_1 = col_double()
      2.0_2 = col_double()
      0.0_{14} = col_double(),
      2.0_3 = col_double(),
      ^{2}.04 = coldouble()
      0.0_{15} = col_double(),
      0.0_{16} = col_double(),
      0.0_{17} = col_double(),
      0.0_{18} = col_double(),
      0.019 = coldouble().
      10.0_1 = col_double(),
      0.0_{20} = col_double()
      0.0_{21} = col_double(),
      0.0_{22} = col_double(),
      0.0_{23} = col_double()
      `0.0_24` = col_double(),
      0.0_{25} = col_double(),
      0.0_{26} = col_double()
      0.0_{27} = col_double(),
      0.0_{28} = col_double()
      0.0_{29} = col_double(),
      0.0_{30} = col_double()
      0.0_{31} = col_double(),
      0.0_32 = col_double(),
      0.0_{33} = col_double(),
      0.0_34 = col_double(),
. .
      0.0_{35} = col_double()
```

```
... `0.0_36` = col_double(),
... `0.0_37` = col_double(),
... `0.0_38` = col_double(),
... `0.0_39` = col_double(),
... `0.0_40` = col_double(),
```

```
`0.0_41` =
                           col_double(),
          `0.0 42`
                    =
                           col_double(),
          `0.0_43`
                    =
                           col_double(),
. .
         `0.0_44`
                    =
                           col_double(),
          `0.0_45`
                    =
                           col_double(),
. .
          `0.0_46`
                    =
                           col double().
          `0.0_47`
                    =
                           col_double(),
. .
         `0. 0_48`
                    =
                           col_double(),
          `0.0_49`
                    =
                           col_double(),
. .
          `0.0_50`
                    =
                           col_double(),
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          `0.0_51`
                           col_double(),
. .
         `0.0_52`
                    =
                           col_double(),
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          `0.0_53`
                           col_double(),
. .
          `0.0 54`
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                           col double().
. .
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          `0. 0_55`
                           col_double(),
         `0. 0_56`
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                           col_double(),
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         `0.0_57`
                           col_double(),
. .
          `0.0_58`
                    =
                           col_double(),
. .
          `0.0 59`
                    =
                           col double().
. .
         `0.0_60`
                    =
                           col double().
. .
         `0.0_61`
                    =
                           col_double(),
. .
          `0.0_62`
                    =
                           col_double(),
. .
          `0.0_63`
                    =
                           col_double(),
. .
                    =
         `0.0_64`
                           col_double(),
. .
         `0.0_65`
                           col_double(),
          `0.0_66`
                    =
                           col_double(),
. .
          `0.0_67`
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                           col_double(),
         `0.0 68`
                    =
                           col double(),
. .
         `0. 0_69`
                    =
                           col_double(),
          `0.0_70`
                    =
                           col_double(),
. .
          `0.0_71`
                    =
                           col_double(),
          `0.0_72`
                    =
                           col_double(),
. .
         `0.0 73`
                           col double().
          `0.0_74`
                    =
                           col_double(),
. .
          `0.0_75`
                    =
                           col_double(),
                    =
          `0.0_76`
                           col_double(),
. .
                    =
         `0.0 77`
                           col double().
                    =
         `0.0_78`
                           col_double(),
. .
          `0.0_79`
                    =
                           col_double(),
. .
          `0.0_80`
                    =
                           col_double(),
         `0.081`
                    =
                           col double().
         `0.0_82`
                    =
                           col_double(),
          `0.0_83`
                    =
                           col_double(),
. .
          `0.0_84`
                    =
                           col_double(),
. .
         `0.0_85`
                    =
                           col_double(),
. .
         `0.0_86`
                    =
                           col_double(),
. .
         `0.0_87`
                    =
                           col_double(),
. .
          `0.0_88`
                    =
                           col_double(),
         `0.0_89`
                    =
                           col_double(),
. .
         `0.0_90`
                    =
                           col_double(),
. .
                    =
          `0.0_91`
                           col_double(),
. .
                           col_double(),
          `0.0_92`
                    =
          `0.0_93`
                    =
                           col_double(),
. .
                           col_double(),
         `0.0 94`
                    =
. .
          `0.0_95`
                    =
                           col_double(),
. .
          `0.0_96`
                    =
                           col_double(),
          `0.0_97`
                    =
                           col_double(),
. .
         `0.0 98`
                           col_double(),
          `0.0_99`
                    =
                           col_double(),
       `0.0_100` = col_double(),
```

```
`0.0_101` =
                         col_double(),
          `0.0 102`
                     =
                         col double().
          `0. 0_103`
                     =
                         col_double(),
          `0.0_104`
                         col_double(),
                     =
          `0.0_105`
                         col_double(),
. .
                     =
          `0. 0_106`
                         col double().
          `0.0_107`
                     =
                         col double().
          `0. 0_108`
                     =
                         col_double(),
          `0.0_109`
                     =
                         col_double(),
. .
          `0.0_110`
                    =
                         col_double(),
                     =
          `0.0_111`
                         col_double(),
                     =
          `0.0_112`
                         col_double(),
                     =
          `0.0_113`
                         col_double(),
. .
          `0.0_114`
                     =
                         col double().
                     =
          `0. 0_115`
                         col_double(),
          `0. 0_116`
                     =
                         col_double(),
          `0. 0_117`
                     =
                         col_double(),
          `0.0_118`
                     =
                         col_double(),
. .
          `0.0 119`
                     =
                         col double().
          `0.0 120`
                     =
                         col double().
          `0. 0_121`
                         col_double(),
. .
                     =
          `0. 0_122`
                         col_double(),
. .
          `0. 0_123`
                     =
                         col_double(),
                     =
          `0.0_124`
                         col_double(),
          `0. 0_125`
                         col_double(),
          `0. 0_126`
                     =
                         col double().
. .
          `0. 0_127`
                     =
                         col double().
                     =
          `0. 0_128`
                         col double().
          `0. 0_129`
                         col_double(),
                     =
          `0.0_130`
                         col_double(),
. .
                     =
          `0. 0_131`
                         col_double(),
                     =
          `0.0 132`
                         col_double(),
          `0.0 133`
                         col double().
          `0. 0_134`
                     =
                         col_double(),
          `0. 0_135`
                     =
                         col double().
                     =
          `0. 0_136`
                         col_double(),
          `0.0 137`
                     =
                         col double().
                     =
          `0.0_138`
                         col_double(),
. .
                     =
          `0.0_139`
                         col_double(),
. .
          `0.0_140`
                     =
                         col_double(),
          `0.0 141`
                     =
                         col double().
          `0. 0_142`
                         col_double(),
                     =
          `0. 0_143`
                     =
                         col_double(),
          `0.0_144`
                     =
                         col_double(),
. .
          `0.0_145`
                     =
                         col_double(),
. .
          `0.0_146`
                         col_double(),
          `0. 0_147`
                     =
                         col_double(),
. .
          `0. 0_148`
                     =
                         col_double(),
                     =
          `0.0_149`
                         col_double(),
          `0.0_150`
                         col_double(),
                     =
          `0. 0_151`
                         col_double(),
. .
                     =
          `0. 0_152`
                         col_double(),
                     =
          `0.0_153`
                         col double().
. .
                     =
          `0.0 154`
                         col double().
. .
                     =
          `0. 0_155`
                         col_double(),
. .
                     =
          `0. 0_156`
                         col_double(),
          `0.0_157`
                     =
                         col_double(),
          `0.0 158`
                         col_double(),
          `0.0_159`
                     =
                         col_double(),
. .
                     =
          `0.0_160`
                         col_double(),
. .
```

```
col_double(),
          `0. 0_161`
          `0. 0_162`
                     =
                         col double().
          `0.0_163`
                     =
                         col_double(),
          `0.0_164`
                         col_double(),
                     =
          `0.0_165`
                         col_double(),
. .
                     =
          `0. 0_166`
                         col double().
          `0.0_167`
                     =
                         col double().
          `0. 0_168`
                     =
                         col_double(),
          `0.0_169`
                     =
                         col_double(),
. .
          `0.0_170`
                     =
                         col_double(),
                     =
          `0.0_171`
                         col_double(),
                     =
          `0. 0_172`
                         col_double(),
                     =
          `0. 0_173`
                         col_double(),
. .
                     =
          `0.0_174`
                         col double().
          `0.0_175`
                     =
                         col_double(),
          `0. 0_176`
                     =
                         col_double(),
          `0. 0_177`
                     =
                         col_double(),
          `0.0_178`
                     =
                         col_double(),
. .
          `0.0 179`
                     =
                         col double().
          `0.0 180`
                     =
                         col double().
          `0. 0_181`
                         col_double(),
. .
                     =
          `0. 0_182`
                         col_double(),
. .
          `0. 0_183`
                     =
                         col_double(),
                     =
          `0.0_184`
                         col_double(),
          `0.0_185`
                         col_double(),
                     =
          `0. 0_186`
                         col double().
. .
          `0. 0_187`
                     =
                         col double().
          `0.0 188`
                     =
                         col double().
                     =
          `0. 0_189`
                         col_double(),
                     =
          `0.0_190`
                         col_double(),
. .
                     =
          `0.0_191`
                         col_double(),
                     =
          `0.0 192`
                         col_double(),
          `0.0 193`
                         col double().
          `0. 0_194`
                     =
                         col_double(),
                     =
          `0. 0_195`
                         col double().
                     =
          `0. 0_196`
                         col_double(),
          `0.0 197`
                     =
                         col double().
                     =
          `0.0_198`
                         col_double(),
. .
                     =
          `0.0_199`
                         col double().
          `0.0_200`
                     =
                         col_double(),
          `0.0 201`
                     =
                         col double().
          `0. 0_202`
                         col_double(),
                     =
          `0. 0_203`
                     =
                         col_double(),
          `0.0_204`
                     =
                         col_double(),
. .
          `0.0_205`
                     =
                         col_double(),
. .
          `0. 0_206`
                         col_double(),
          `0. 0_207`
                     =
                         col_double(),
. .
          `0.0_208`
                     =
                         col_double(),
          `0.0_209`
                     =
                         col_double(),
          `0.0_210`
                         col_double(),
          `0.0_211`
                     =
                         col_double(),
. .
          `0.0_212`
                     =
                         col_double(),
                     =
          `0.0_213`
                         col double().
. .
          `0.0 214`
                     =
                         col double().
. .
                     =
          `0. 0_215`
                         col_double(),
. .
          `0. 0_216`
                     =
                         col_double(),
          `0. 0_217`
                     =
                         col_double(),
          `0.0_218`
                         col_double(),
          `0.0_219`
                     =
                         col_double(),
. .
          `0.0_220`
                     =
                         col_double(),
. .
```

```
`0.0_221` = col_double(),
         `0.0_222` = col_double(),
         0.0_{223} = col_double(),
         0.0_{224} = col_double(),
         1.0 = col_double(),
         `0.0_225` = col_double(),
         0.0_{226} = col_double(),
         `0.0_227` = col_double(),
         0.0_{228} = col_double(),
         `0.0_229` = col_double(),
         `1.0 1` = col double(),
         0.0_{230} = col_double(),
         0.0_{231} = col_double(),
         0.0232 = coldouble().
         0.0_{233} = col_double(),
         0.0_{234} = col_double(),
         0.0_{235} = col_double(),
         `0.0 236` = col double().
         1.0_2 = col_double()
  ..)
> str (fbtest)
         'data.table' and 'data.frame': 7624 obs. of
Classes
                                                                   281 variables:
                  10.63 43.44 1.73 27.23 4.5 ...
 $ V1
       : num
                                   0 0 0 0 ...
  $ V144: num
                   000 000
 $ V145: num
                   000 000
                                   0 0 0 0 . . .
                  17. 88 75. 59 3. 04 45. 97 6. 68 . . .
 $ V2
       : num
                  1 0 0 0 0 0 0 0 0 0 ...
 $ V3
         : num
                  0 0 0 0 0 0 0 0 0 ...
 $ V142:
           num
                  0 0 1 1 1 1 1 1 0 1 ...
           num
 $ V143:
 $ V4
        : num
                  259 634 9 371 18 . . .
 $ V5
                  5 20 0 14 0.5 28 1 87 7.5 0 . . .
         : num
 $ V6
                  4. 018 15. 999 0. 733 10. 784 3 . . .
         : num
 $ V7
                  10. 4 44. 56 1. 53 24. 21 4 . . .
         : num
 $ V146: num
                  0 0 0 0 0 0 0 0 0 0 ...
 $ V147: num
                  0000010000...
 $ V8
         : num
                  0\ 0\ 0\ 0\ 0\ 0\ 0\ 0\ \dots
 $ V9
                  235 473 5 228 10 725 179 491 174 0 ...
         : num
 $ V148: num
                                      0 0 0 ...
                  0 0 0 0 0 0
 $ V149: num
                  0 0 0 0 0 0 0
                                     0 0 0 ...
 $ V10 : num
                  1 2 0 4 0.5 16 0 19.5 1.5 0 . . .
 $ V11 : num
                  3. 817 15. 47 0. 667 9. 998 1. 333 . . .
 $ V150: num
                  0 0 0 0 0 0 0 0 0 0 ...
                  0 1 1 0 0 1 1 0 0 1 ...
 $ V151: num
 $ V12 : num
                  10. 3 44. 69 1. 53 24. 4 2. 56 . . .
  $ V13 :
                  0 0 0 0 0 0 0 0 0 0 ...
           num
                   \  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, \dots 
  $ V152:
           num
 $ V153: num
                  0 0 1 0 0 1 0 0 0 0 ...
 $ V14 : num
                  235 473 5 228 7 725 179 491 174 0 . . .
                  1 1 0 2 0 3 0 14 1 0 ...
 $ V15 : num
                   \  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, 0\  \, \dots 
  $ V154: num
  $ V155: num
                  0 0 0 0 0 0 0 0 0 ...
 $ V16 : num
                  9. 78 40. 97 1. 13 22. 56 2. 83 . . .
 $ V17 : num
                  16. 07 70. 31 1. 82 39. 76 3. 67 . . .
  $ V156:
                  0 0 0 0 0 0 0 0 0 0 ...
           num
  $ V157:
                  0 0 0 0 0 0 0 0 0
           num
  $ V18 :
                  1 0 0 0 0 0 0 0 0 0
           num
```

```
      $ V19 : num
      192 479 5 337 8 913 189 786 186 0 ...

      $ V158: num
      0 0 1 1 0 1 1 0 0 1 ...

      $ V159: num
      0 0 1 0 0 1 0 0 0 0 ...

      $ V20 : num
      5 18 0 10 0.5 26 0 74 5.5 0 ...
```

```
$ V21 :
                0. 201 0. 5289 0. 0667 0. 7866 1. 6667 . . .
         num
                0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; \dots
$ V160:
         num
$ V161:
                0000000000...
         num
$ V22 :
                13. 95 62. 13 1. 73 30. 36 2. 21 . . .
          num
$ V23 :
                -229 -461 -5 -156 0 -519 -178 -418 -161
                                                                  0 ...
         num
$ V162:
                00000000000...
          num
                0000000000...
$ V163:
          num
$ V24 :
          num
                217 473 4 228 6 725 170 491 174 0
$ V25 :
                0 0 0 0 0 5 2 0 -3 0 0 ...
         num
$ V164:
                0000000000...
         num
$ V165:
          num
                0 0 0 0 0 0 0 0 0 0 . . .
                0. 252 0. 193 0. 333 0. 11 0 . . .
$ V26 :
         num
                0.904 0.458 0.699 0.356 0 ...
$ V27 :
         num
$ V166:
                0 0 0 0 0 0 0 0 0 0 ...
         num
$ V167:
                0 0 0 0 0 0 0 0 0 0 ...
          num
$ V28 :
                0 0 0 0 0 0 0 0 0 0 ...
         num
$ V29 :
         num
                14 2 2 2 0 0 6 0 1 0 .
$ V168:
                0 0 0 0 0 0 0 0 0 0 ...
         num
$ V169:
                0 0 0 0 0 0 0 0 0 0 ...
         num
$ V30 :
                0 0 0 0 0 0 0 0 0 0 ...
         num
$ V31 : num
                0.0944 0.0733 0.1333 0.0432 0 . . .
$ V170: num
                001 001 0000 ...
$ V171: num
                000 000 0000 ...
                0.507 0.286 0.34 0.215 0 ...
$ V32 : num
$ V33 : num
                0 0 0 0 0 0 0 0 0 0 ...
$ V172:
                0 0 0 0 0 0 0 0 0 0 ...
         num
$ V173:
                0 0 0 0 0 0 0 0 0 0 ...
         num
$ V34 : num
                12 2 1 2 0 0 5 0 1 0 . . .
$ V35 : num
                0 0 0 0 0 0 0 0 0 0 ...
$ V174: num
                0 0 0 0 0 0 0 0 1 0 ...
$ V175: num
                0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; \dots
$ V36 : num
                0.0919 0.0677 0.1333 0.0408 0 ...
$ V37 : num
                0.504 0.278 0.34 0.21 0 . . .
$ V176: num
                0 0 0 0 0 0 0 0 0 0 . . .
$ V177: num
                0 0 0 0 0 0 0 0 0 0 . . .
$ V38 : num
                0000000000...
$ V39 : num
                12 2 1 2 0 0 5 0 1 0 . . .
$ V178: num
                0 0 0 0 0 0 0 0 0 0 . . .
$ V179: num
                0 0 0 0 0 0 0 0 0 0 . . .
$ V40 : num
                0 0 0 0 0 0 0 0 0 0 . . .
$ V41 : num
                0. 2335 0. 1763 0. 2 0. 0983 0 . . .
$ V180: num
                0 0 1 0 0 1 1 0 0 0 ...
$ V181: num
                0 \ 0 \ 1 \ 0 \ 0 \ 0 \ 0 \ 0 \ \dots
                0.855 0.43 0.4 0.321 0 ...
$ V42 : num
$ V43 : num
                0 0 0 0 0 0 0 0 0 0 ...
                0000000000...
$ V182: num
                0 0 0 0 0 1 0 0 0 0 ...
$ V183: num
$ V44 : num
                13 2 1 2 0 0 5 0 1 0 ...
$ V45 : num
                0 0 0 0 0 0 0 0 0 0 ...
$ V184: num
                0 0 0 0 0 0 0 0 0 0 ...
$ V185: num
                0 0 0 0 0 0 0 0 0 0 ...
$ V46 : num
                0.00245 0.00564 0 0.0024 0 ...
$ V47 : num
                0.675 0.404 0.365 0.29 0 ...
$ V186: num
                0 0 0 0 0 0 0 0 0 0 ...
                0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; 0\; \dots
$ V187: num
```

```
      $ V48 : num
      -10 -2 -1 -2 0 0 -5 0 -1 0 ...

      $ V49 : num
      12 2 1 2 0 0 5 0 1 0 ...

      $ V188: num
      0 0 0 0 0 0 0 0 0 0 ...

      $ V189: num
      0 0 0 0 0 0 0 0 0 0 ...

      $ V50 : num
      0 0 0 0 0 0 0 0 0 0 ...
```

```
$ V51 : num
                                                                                            35 21 2 3 0 12 103 61 7 0 . . .
              [list output truncated]
        - attr(,*".internal.selfref")=<externalptr>
 > train <- blogData_train; test <- fbtest</pre>
 > head(train); head(test) # A
 tibble: 6 x 281
                                                                                                                                                                                                                                                    d5
                                                                                                                                                                                                                                                                                           d6
                                                                                                                                                                                                                                                                                                                                  d7
                                                                                                                                                                                                                                                                                                                                                                          d8
                                                                                                                                                                                                                                                                                                                                                                                                                  d9
                                                                                                                                                                                                                                                                                                                                                                                                                                                    d10
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                          d11
              plikes checkin talking d12
                                                                                                                                                                                category
                                        d13
                                                                                d14
                                                                                                                      d15
                                                                                                                                                                                        <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
                     <db1>
                                                                          <db1>
                                                                                                                              <db1>
  <db1> <db1> <db1> <db1>
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                                                                                 53.8
                          40.3
                                                                                      377
 32. 6
                                                                                                                                          2
                                                                                                                                                                                                                                                                                                                         32.4
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                                                                                  53.8
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                          40.3
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                                                            0
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 32. 6
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                                                                                  53.8
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 32.6
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                                                                                                                                          2
                           40.3 0
                                                                                       377
 6
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 32.6
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 #... with 266 more variables: d16 <db1>, d17 <db1>, d18 <db1>, d19 <db1>, d20 <db1>,
 d21 < db1 >.
                           d22 <db1>, d23 <db1>, d24 <db1>, d25 <db1>, d26 <db1>, d27 <db1>, d28
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  <db1>, fri <db1>,
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   <db1>. NA <db1>. NA <db1>.
                           NA <dbl>, NA <db
  <db1>, NA <db1>, NA <db1>,
                          NA <dbl>, NA <db
   <db1>, NA <db1>, NA <db1>,
                           NA <dbl>, NA <db
  <db1>, NA <db1>, NA <db1>,
                           NA <dbl>, ...
                                                                        V1 V144 V145
                                                                                                                                                                                                                V2 V3 V142 V143
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                                                                                                                                                                                                                                                                                                                                                                                                                                         ۷6
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 V146 V147 V8
                                                                                            V9 V148
 1:
                           10.630660
                                                                                                               0
                                                                                                                                                                 17. 882992
                                                                                                                                                                                                                                           1
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 0
                                 0 0 235
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 2:
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                           43. 435825
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                                                                                                                                                                   75. 590485
                                                                                                                                                                                                                                           0
                                                                                                                                                                                                                                                                            0
                                                                                                                                                                                                                                                                                                                                                                                                                                                                  44. 56087
                                                                                                                                                0
 0
                                 0 0 473
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 3:
                                 1. 733333
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                                                                                                                                                                                                                                                                                                                                                                                         0. 7333333
                                                                                                                                                                                                                                                                                                                                                                                                                                                                         1. 52607
                                 0
                                               0
                                                                   5
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                     V149
                                                          V10
                                                                                                                                    V11 V150 V151
                                                                                                                                                                                                                                                                           V12 V13 V152 V153 V14 V15 V154 V155 V16
                                                                        V17 V156
1:
                                       0 1.0
                                                                                           3.8172395
                                                                                                                                                                                0
                                                                                                                                                                                                                0 10. 297346
                                                                                                                                                                                                                                                                                                                   0
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 9. 776869
 16. 073494
 0

 2:
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 2. 0
 15. 4696760
 0
 1
 44. 685085
 0
 0
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 473
 1
 0
 0

 40. 971790
 70. 307840
 0
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 473
 1
 0
 0

| 3: 1. 1333; | | | | | _ | 0 | 1 | 1. 5 | 34782 | | 0 | 0 | | 1 | 5 0 | (| 0 0 |
|----------------------|----------|------|---------|-----------|------------------|-------|--------|--------|---------|------|-------|------------|------|---------|--------|--------------|---------|
| | 57 V18 | V19 | V158 | V159 | | V20 |) | | V21 V | /160 | V161 | | | V2 | 22 V: | 23 V16 | 62 |
| 1: | | 1 1 | | | 0 | 5. | 0 0.2 | 201036 | 656 | (| 0 | 0 | 13. | 94886 | 37 -2 | 229 | 0 |
| 0 217 | | | 0 | 0 | | | | | | | | | | | | | |
| 2: 0 473 | | 0 4 | 79 0 | 0 | 0 | 18. | 0 0. | 528914 | 100 | (| 0 | 0 | 62. | 13496 | j8 –4 | 461 | 0 |
| | | | | 0 | 1 | 0. | 0 0.0 | 366666 | 367 | | 0 | 0 | 1. | . 73076 | 67 | -5 | 0 |
| 3: | | 0 | | 1 | | | | | | | | | | | | | |
| 0 4 | | | 0 | 0 V27 | V166 | : \ | /167 \ | 128 V | 120 V | 168 | V160 | V٦ | n | | V31 | V170 | V171 |
| V32 V3 | | | | | VIOC | , | V107 | 120 V | 25 V | 100 | V 103 | V O | U | | VO1 | V 170 | V 1 / 1 |
| 1: 0.2 | | | | | | 0 | 0 | 0 | 14 | 0 | 0 | (| 0 | 0.094 | 38080 | 0 | 0 |
| 0. 50673 | 316 | 0 | (|) | 0 | 12 | • | • | • | • | • | | ^ | 0 070 | 0.4070 | • | • |
| 2: 0.19 | 932299 | 0. 4 | 57699 | 4 | | 0 | 0 | 0 | 2 | 0 | 0 | (| 0 | 0. 073 | 342/3 | 0 | 0 |
| 0. 2864 [°] | | 0 | | | 0 | 2 | 0 | 0 | 2 | 0 | 0 | (| 0 | 0. 133 | 33334 | 1 | 0 |
| 3: 0.33 | | | | | | 0 | | | | | | | | | | | |
| 0. 33993 | | | | | 0 | | | V07 | V170 | \/47 | 7 1/0 | 10 M | 120 | V170 | V170 | V/40 | |
| V35 V41 V18 | 5 V174 | | 5 | | | 56 | | V3/ | V176 | V1/ | , v3 | ŏV | 39 | VI/8 | V179 | v4U | |
| V41 VI | | | | - | | 0 ደ0 | /216N | | 0 | 1 | 0 | 0 | 12 | 0 | 0 | 0 | |
| 0. 23349 | | | | | ,2361). 8547 | | 76100 | | - | | | | | • | | | |
| 2: (| | | | | | | 78884 | | 0 | (| 0 | 0 | 2 | 0 | 0 | 0 | |
| 0. 17630 | - | - | 0 | |). 4297 | | | | 0 | | 0 | 0 | 1 | 0 | 0 | 0 | |
| 3: (| 0 | 0 | 0 0 | . 1333 | 33334 | 0. 33 | 99347 | | U | , | U | U | ' | U | U | U | |
| 0. 2000 | | | 1 | | | | | | | | | | | | | | |
| | 3 V182 | | | | V184 | V188 | V185 | , | | V46 | | | V47 | V186 | V187 | V48 | V49 |
| V189 V | | | | | | | 0 | | 00045 | 4000 | ٥ | C74- | 7005 | ^ | 0 | 10 | 10 |
| | | 0 | | 13 | | 0 | 0 | U. | . 00245 | 4992 | 0. | 6747 | 285 | 0 | U | -10 | 12 |
| | | 0 | | 0 | 0 | • | 0 | 0 | . 00564 | 1749 | 0. | 4044 | 1489 | 0 | 0 | -2 | 2 |
| | | 2 | | 2 0 | 0 | 0 | | | | | | | | | | | |
| 3: | 0 | 0 | 0 | 1 | 0 0 | 0 | 0 | 0. | . 00000 | 0000 | 0. | 3651 | 484 | 0 | 0 | -1 | 1 |
| 0 | 0 0 | : | 2 | 0 | 1 | U | | | | | | | | | | | |
| V52 | 2 V53 ' | V192 | | - | V55 V | 60 | V194 | V195 | V56 | V57 | V19 | 6 V | /197 | V58 | V59 | V198 | V199 |
| V61 V20 | | | | | V63 | | | | | | | | | | | | |
| 35 | 5 0 | | 0 | 0 | 35 | 35 | 0 | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 9 | | | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | 0 | 0 |
| 2: (| _ | | 0 | 0 | 21 | -2 | U | U | U | U | | U | U | U | U | U | U |
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| ۷20 V211 V | | | | | V Z U O | ٧ZI | ٧٥٥ ر | ¥ U / | ¥∠U0 | ٧Z | .07 V | UU | งบฮ | v Z U Ö | v 209 | v / U | V / I |
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 [ reached getOption("max.print") -- omitted 3 rows ]
> # making the data tidy by constructing single collumn for post publish day
> train$pubday<- ifelse(train$sun ==1, 1, ifelse(train$mon ==1, 2,</pre>
ifelse(train$tue ==1, 3,
ifelse(train$wed ==1, 4, ifelse(train$thu ==1, 5, ifelse(train$fri ==1, 6,
ifelse(train$sat ==1, 7, NA))))))
> # making the data tidy by constructing single collumn for base day
> train$baseday<- ifelse(train$basesun ==1, 1, ifelse(train$basemon ==1, 2,
ifelse(train$basetue ==1, 3,
```

```
ifelse(train$basewed ==1, 4, ifelse(train$basethu ==1, 5,
+
ifelse(train$basefri ==1, 6, ifelse(train$basesat ==1, 7, NA))))))
```

```
> # # clean dataset, impute missing values and perform exploratory data analysis
> #
> # distinct(train)
                                                         # removing overlapping observations if any
> # dim(train)
>
> library (MASS)
> final_model < Im(target \sim checkin + talking + d5 + d6 + d7 + d8 + d9 + d10
+ d11 +
+
                                                          d12 + d13 + d16 + d17 + d19 + d20 + d21 + d22 + d23 + d24 +
+
                                                          cc1 + cc2 + cc3 + cc4 + basetime + postshre + Hhrs + wed +
                                                          thu + fri + basemon + basewed, data = train)
> summary(final_model)
Call:
Im(formula = target \sim checkin + talking + d5 + d6 + d7 + d8 + d9 + d10 + d10
          d11 + d12 + d13 + d16 + d17 + d19 + d20 + d21 +
          d22 + d23 + d24 + cc1 + cc2 + cc3 + cc4 + basetime + postshre + Hhrs + wed +
          thu + fri + basemon + basewed, data = train)
Residuals:
          Min
                                  1Q
                                                                            3Q
                                                                                              Max
                                            Median
-561.78
                       -13.04
                                               -1.83
                                                                       0.00 1743.64
Coefficients: (2 not defined because of singularities)
                                         Estimate
                                                                Std. Error
                                                                                            t value
                                                                                                                   Pr (>|t|)
(Intercept)
                                     -4. 947e-04
                                                                    5. 171e-01
                                                                                               -0.001
                                                                                                                         0.999
checkin
                                       3.892e-05
                                                                    1.692e-01
                                                                                                 0.000
                                                                                                                         1.000
talking
                                       1. 700e-04
                                                                    1. 203e-01
                                                                                                 0.001
                                                                                                                         0.999
                                                                                                                         1.000
d5
                                       1. 263e-05
                                                                    1. 282e-01
                                                                                                 0.000
d6
                                                                    6.649e+05
                                                                                               -0.002
                                                                                                                         0.999
                                     -9. 984e+02
d7
                                     -1.411e-03
                                                                    5. 473e-01
                                                                                               -0.003
                                                                                                                         0.998
d8
                                       4. 528e-04
                                                                    3.698e+00
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                                                                    2. 347e-02
d9
                                       3.487e-05
                                                                                                 0.001
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d10
                                     -3. 316e-04
                                                                    1. 752e-01
                                                                                              -0.002
                                                                                                                         0.998
d11
                                       9.984e+02
                                                                    6.649e+05
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                                       3.521e-04
                                                                    3.883e-01
                                                                                                                         0.999
d12
d13
                                                     NA
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                                                                                                                               NA
                                       9.999e-01
                                                                                                                   5.55e-07 ***
d16
                                                                    1.997e-01
                                                                                                 5.007
d17
                                       5.831e-05
                                                                    1.330e-01
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d19
                                     -1. 190e-05
                                                                    1.008e-02
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d20
                                     -8. 603e-05
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                                                                                                                         1.000
d21
                                       9.984e+02
                                                                    6.649e+05
                                                                                                 0.002
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d22
                                       5. 252e-04
                                                                    2. 758e-01
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d23
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                                                                    1.088e-02
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d24
                                     -1. 133e-06
                                                                    1. 780e-02
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cc1
                                     -7. 536e-03
                                                                    1.932e+00
                                                                                              -0.004
                                                                                                                         0.997
cc2
                                       1. 402e-02
                                                                    8.699e+00
                                                                                                 0.002
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cc3
                                       2. 395e-04
                                                                    1. 436e+01
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                                     -8. 246e-03
                                                                    1.027e+01
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basetime
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basemon
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Signif. codes:
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                                              0.01
                                                                      0.1
Residual standard error: 67.27 on 52366 degrees of freedom Multiple
                  0.4976. Adjusted R-squared:
                                                    0.4973 F-statistic:
                  1788 on 29 and 52366 DF.
                                                    p-value: < 2.2e-16
>
>
> # a interpret the final model coefficients
> summary(final model)
Call:
Im(formula = target \sim checkin + talking + d5 + d6 + d7 + d8 + d9 + d10 +
     d11 + d12 + d13 + d16 + d17 + d19 + d20 + d21 +
     d22 + d23 + d24 + cc1 + cc2 + cc3 + cc4 + basetime + postshre + Hhrs + wed +
     thu + fri + basemon + basewed, data = train)
Residuals:
     Min
                 1Q
                      Median
                                      3Q
                                               Max
-561.78
           -13.04
                       -1.83
                                   0.00 1743.64
Coefficients: (2 not defined because of singularities)
                    Estimate
                                Std. Error
                                              t value Pr(>|t|)
     (Intercept) -4.947e-04
                                  5. 171e-01
                                               -0.001
                                                           0.999
  checkin
                   3.892e-05
                                  1.692e-01
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                   1.700e-04
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  d6
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  d7
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  d8
                   4.528e-04
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  d11
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  d12
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  d20
                  -8.603e-05
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                   9.984e+02
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  d21
                                                0.002
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  d22
                   5. 252e-04
                                  2. 758e-01
                                                0.002
                                                           0.998
  d23
                   1.633e-05
                                  1.088e-02
                                                0.002
                                                           0.999
  d24
                  -1. 133e-06
                                  1.780e-02
                                                0.000
                                                           1.000
                  -7. 536e-03
                                  1.932e+00
                                               -0.004
                                                           0.997
  cc1
                                  8.699e+00
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  cc2
                   1. 402e-02
  сс3
                   2.395e-04
                                  1.436e+01
                                                0.000
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cc4
                          NA
                                         NA
                                                   NA
                                                               NA
  basetime
                  -8. 246e-03
                                  1.027e+01
                                               -0.001
                                                           0.999
  postshre
                   2.803e-03
                                  1.443e+01
                                                0.000
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  Hhrs
                  -8.483e-04
                                  8.746e-01
                                               -0.001
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                                  4.810e+00
                                                0.000
                                                           1.000
                   3.968e-04
                                  3. 294e-01
                                                0.001
  thu
                                                           0.999
  fri
                   4.796e-04
                                  1.784e+00
                                                0.000
                                                           1.000
  basemon
                  -2. 404e-504
                                  8. 184e - 0.1
                                                0.000*
                                                           1.000
                   4. 229e-03
                                  2.081e+01
  basewed
                                                0.000
                                                           1.000
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Signif. codes: 0 '• ' 0.001 ' ' 0.01 ' 0.05 '.' 0.1 ' '

```
0.4976, Adjusted R-squared:
R-squared:
                                                  0.4973 F-statistic:
                 1788 on 29 and 52366 DF.
                                                  p-value: < 2.2e-16
> coef(final_model) # coefficients of the model
  (Intercept)
                         checkin
                                          talking
                                                                   d5
                                                                                     d6
d7
                 d8
-4. 946570e-04
                  3.891451e-05
                                    1. 700457e-04
                                                      1. 262629e-05 -9. 983858e+02 -
1.410870e-03
                 4. 528305e-04
             d9
                              d10
                                                d11
                                                                  d12
                                                                                   d13
d16
                 d17
 3. 486801e-05 -3. 316009e-04
                                    9.983864e+02
                                                      3.520834e-04
                                                                                     NA
                 5.831097e-05
9. 999110e-01
            d19
                              d20
                                                d21
                                                                  d22
                                                                                   d23
d24
                 cc1
-1. 189822e-05 -8. 602563e-05
                                    9. 983873e+02
                                                      5. 251878e-04
                                                                        1.632576e-05 -
1. 133489e-06 -7. 535792e-03
            cc2
                                                           basetime
                              cc3
                                                cc4
                                                                             postshre
Hhrs
                  wed
 1. 402018e-02
                  2. 395188e-04
                                                 NA -8. 245685e-03
                                                                        2.802928e-03 -
8. 483031e-04
                 8.754786e-04
                              fri
                                                            basewed
                                           basemon
 3.967947e-04
                  4. 795834e-04 -2. 404461e-04
                                                      4. 228575e-03
    talking
                              d5
                                                d7
                                                                                  d10
> #
d11
> # -1.858115e-05 -4.759496e-01
                                         8. 609203e-01
                                                           1. 675394e-01 -1. 239555e-01 -
2. 236221e-03
> # d12
                      d13
                                        d16
                                                          d17
                                                                            d19
                                                                                             d20
d22
> # 1.612318e-01
                      1. 276223e-01
                                        1. 114969e-02
                                                          1. 085186e-01 -1. 165972e-01
4. 201675e-01 -8. 837498e-01
> # d23
                                                                            cc4
                                                                                       basetime
                      cc1
                                        cc2
                                                          cc3
postshre
> # -2. 159461e-01
                        4. 338324e-02
                                         2. 196493e-01 -2. 272725e-02 -6. 728051e-02 -
1. 933110e-01
                 2. 921963e-03
> # Hhrs
> # 3.880629e-01
```

Residual standard error: 67.27 on 52366 degrees of freedom Multiple

b) Plot the model result and compare it with assumptions of the model.

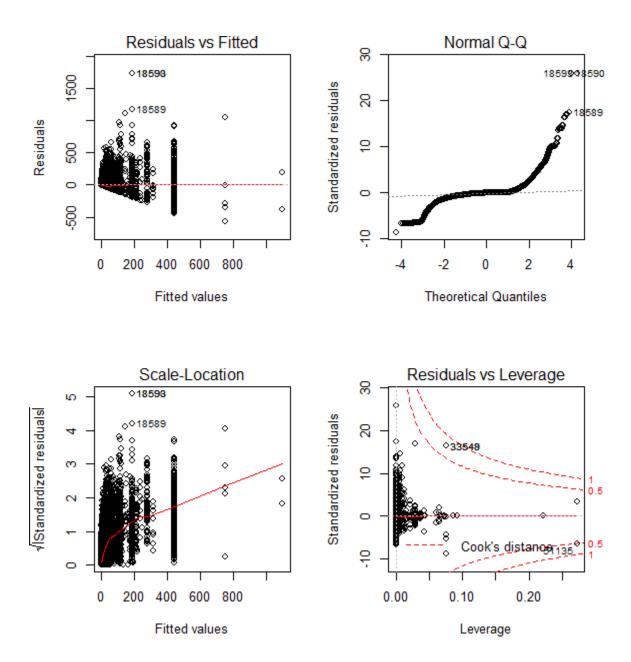
The R-script for the given problem is as follows:

b plot the model result and compare it with assumptions of the model par(mfrow=c(2,2)) plot(final_model)

The output of the R-Script (from Console window) is given as follows:

> # b plot the model result and compare it with assumptions of the model > par(mfrow=c(2, 2))

> plot(final_model)



Conclusion/Interpretation:

- Model does not pass the test of normality
- The data is heteroscadatic
- Observations shown may have the leverage or potential for influencing the model