Analysis of Airbnb Prices in Amsterdam - R Appendix

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R Code Appendix

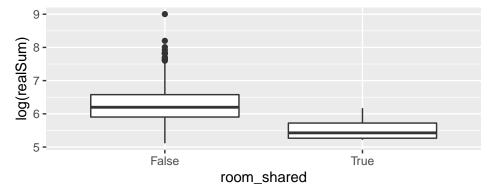
Min. : 0

```
library(tidyverse)
## -- Attaching packages -----
                                              ----- tidyverse 1.3.1 --
## v ggplot2 3.3.5
                    v purrr
                               0.3.4
## v tibble 3.1.3 v dplyr
                               1.0.7
## v tidyr
          1.1.3 v stringr 1.4.0
## v readr
          2.0.1
                     v forcats 0.5.1
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
library(GGally)
## Registered S3 method overwritten by 'GGally':
    method from
##
           ggplot2
    +.gg
library(ggResidpanel)
library(broom)
library(car)
## Loading required package: carData
## Attaching package: 'car'
## The following object is masked from 'package:dplyr':
##
##
      recode
## The following object is masked from 'package:purrr':
##
##
      some
library(knitr)
# import dataset
airbnb <- read.csv("amsterdam_weekends.csv")</pre>
airbnb_mutate <- airbnb %>% mutate(case = row_number())
# EDA
summary(airbnb)
                    realSum
                                  room_type
                                                   room_shared
                Min.: 165.9 Length:977
```

Length:977

```
## 1st Qu.:244
                 1st Qu.: 362.8
                                Class :character
                                                     Class : character
## Median :488
                 Median: 491.6
                                Mode :character
                                                     Mode : character
## Mean :488
                 Mean
                        : 604.8
## 3rd Qu.:732
                 3rd Qu.: 716.6
## Max.
          :976
                 Max.
                        :8130.7
##
  room private
                      person_capacity host_is_superhost
                                                            multi
  Length:977
                             :2.00
                                      Length:977
                      Min.
                                                        Min.
                                                                :0.0000
                      1st Qu.:2.00
## Class :character
                                      Class :character
                                                         1st Qu.:0.0000
   Mode :character
                      Median:2.00
                                      Mode :character
                                                         Median : 0.0000
##
                      Mean :2.77
                                                         Mean
                                                                :0.2549
##
                      3rd Qu.:4.00
                                                         3rd Qu.:1.0000
##
                             :6.00
                                                                :1.0000
                      Max.
                                                         Max.
##
        biz
                     cleanliness_rating guest_satisfaction_overall
##
   Min.
          :0.00000
                     Min. : 2.000
                                        Min.
                                               : 20.00
   1st Qu.:0.00000
                     1st Qu.: 9.000
                                        1st Qu.: 93.00
##
   Median :0.00000
                     Median :10.000
                                        Median : 96.00
          :0.09417
                     Mean : 9.471
                                        Mean : 94.69
##
   Mean
   3rd Qu.:0.00000
                     3rd Qu.:10.000
                                        3rd Qu.: 99.00
  Max.
          :1.00000
                     Max. :10.000
                                              :100.00
##
                                        Max.
##
      bedrooms
                        dist
                                        metro dist
                                                          attr index
##
  Min.
          :0.000
                  \mathtt{Min}.
                          : 0.01504
                                      Min.
                                             :0.03652
                                                        Min. : 40.89
   1st Qu.:1.000
                   1st Qu.: 1.41004
                                      1st Qu.:0.46714
                                                        1st Qu.: 132.72
                   Median : 2.31455
                                                        Median: 208.90
## Median :1.000
                                      Median :0.87617
## Mean :1.303
                   Mean : 2.80634
                                      Mean :1.08929
                                                        Mean : 266.87
   3rd Qu.:2.000
##
                   3rd Qu.: 3.61017
                                      3rd Qu.:1.50086
                                                        3rd Qu.: 366.69
## Max.
          :5.000
                   Max.
                          :11.19593
                                      Max.
                                             :4.41190
                                                        Max.
                                                              :1888.74
## attr_index_norm
                       rest_index
                                       rest_index_norm
                                                              lng
## Min. : 2.165
                     Min.
                           : 50.82
                                       Min. : 4.431
                                                        Min.
                                                                :4.776
                                       1st Qu.: 14.879
  1st Qu.: 7.027
                     1st Qu.: 170.68
                                                         1st Qu.:4.869
## Median : 11.061
                     Median : 266.96
                                       Median : 23.272
                                                         Median :4.888
                                       Mean : 28.692
## Mean : 14.129
                     Mean : 329.13
                                                         Mean
                                                              :4.890
   3rd Qu.: 19.414
                     3rd Qu.: 438.11
                                       3rd Qu.: 38.193
                                                         3rd Qu.:4.906
         :100.000
##
  Max.
                     Max. :1147.10
                                       Max. :100.000
                                                         Max. :5.011
##
        lat
## Min.
          :52.29
##
  1st Qu.:52.35
## Median :52.37
## Mean
         :52.36
## 3rd Qu.:52.38
## Max. :52.42
# fit a rich model
airbnb_lm <- lm(realSum ~ room_type+room_shared+room_private+person_capacity+host_is_superhost+multi+bi
summary(airbnb_lm)
##
## Call:
## lm(formula = realSum ~ room_type + room_shared + room_private +
##
      person_capacity + host_is_superhost + multi + biz + cleanliness_rating +
      guest_satisfaction_overall + bedrooms + dist + metro_dist +
##
##
      attr_index + attr_index_norm + rest_index + rest_index_norm +
##
      lng + lat, data = airbnb)
##
## Residuals:
##
     Min
             1Q Median
                           3Q
                                 Max
```

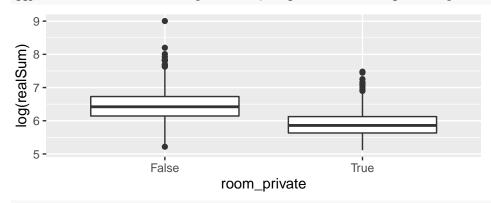
```
## -745.6 -138.3 -35.5
                        76.2 6772.0
##
## Coefficients: (4 not defined because of singularities)
                                Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                              -6.109e+04 4.857e+04 -1.258
## room_typePrivate room
                              -1.626e+02 2.561e+01 -6.349 3.35e-10 ***
## room typeShared room
                              -3.139e+02 1.707e+02 -1.839
                                                              0.0663 .
## room_sharedTrue
                                      NA
                                                 NA
                                                         NA
                                                                  NA
## room_privateTrue
                                      NA
                                                 NA
                                                         NA
                                                                  NA
                               1.275e+02 1.449e+01
                                                      8.799
                                                             < 2e-16 ***
## person_capacity
                                          2.559e+01 -0.037
## host_is_superhostTrue
                              -9.423e-01
                                                              0.9706
## multi
                               2.155e+01 2.653e+01
                                                      0.812
                                                              0.4167
## biz
                              -3.615e+01 3.920e+01 -0.922
                                                              0.3567
## cleanliness_rating
                                                      0.710
                                                              0.4780
                               1.263e+01 1.780e+01
## guest_satisfaction_overall 1.942e+00 2.259e+00
                                                      0.860
                                                              0.3903
## bedrooms
                               1.589e+02
                                          2.013e+01
                                                      7.893 8.03e-15 ***
## dist
                              -1.654e+01 1.133e+01 -1.459
                                                              0.1448
## metro dist
                              -8.253e+00 1.797e+01 -0.459
                                                              0.6461
## attr index
                               1.806e-01 1.072e-01
                                                      1.684
                                                              0.0925
## attr_index_norm
                                      NA
                                                 NA
                                                         NA
                                                                  NA
                               2.279e-01
                                                      2.052
## rest_index
                                         1.111e-01
                                                              0.0404 *
## rest_index_norm
                                      NA
                                                 NA
                                                         NA
                                                      1.485
                               4.348e+02 2.928e+02
                                                              0.1379
## lng
## lat
                               1.121e+03 9.230e+02
                                                      1.214
                                                               0.2249
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 335.2 on 961 degrees of freedom
## Multiple R-squared: 0.438, Adjusted R-squared: 0.4292
## F-statistic: 49.93 on 15 and 961 DF, p-value: < 2.2e-16
# check model transformation
# room_type vs. realSum
ggplot(airbnb, aes(x=room_type, y=log(realSum))) + geom_boxplot()
  9 -
log(realSum)
  5
                                                  Shared room
                               Private room
          Entire home/apt
                               room_type
table(airbnb$room_type)
## Entire home/apt
                      Private room
                                       Shared room
               588
                               385
# room_shared vs. realSum
ggplot(airbnb, aes(x=room_shared, y=log(realSum))) + geom_boxplot()
```



table(airbnb\$room_shared)

```
## ## False True
## 973 4
```

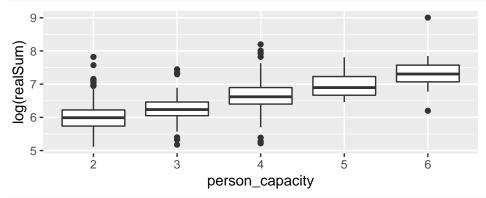
room_private vs. realSum
ggplot(airbnb, aes(x=room_private, y=log(realSum))) + geom_boxplot()



table(airbnb\$room_private)

```
## ## False True ## 592 385
```

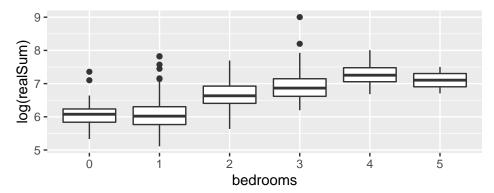
person_capacity vs. realSum
airbnb\$person_capacity <- as.factor(airbnb\$person_capacity)
ggplot(airbnb, aes(x=person_capacity, y=log(realSum))) + geom_boxplot()</pre>



table(airbnb\$person_capacity)

```
##
##
     2
          3
              4
                   5
                       6
## 591 60 301 10
\#\ host\_is\_superhost\ vs.\ realSum
ggplot(airbnb, aes(x=host_is_superhost, y=log(realSum))) + geom_boxplot()
   9 -
log(realSum)
   5 -
                      False
                                                      True
                              host_is_superhost
table(airbnb$host_is_superhost)
##
## False True
     709
            268
##
# multi vs. realSum
airbnb$multi <- as.factor(airbnb$multi)</pre>
ggplot(airbnb, aes(x=multi, y=log(realSum))) + geom_boxplot()
   9 -
log(realSum)
   5 -
                       Ö
                                     multi
# biz vs. realSum
airbnb$biz <- as.factor(airbnb$biz)</pre>
ggplot(airbnb, aes(x=biz, y=log(realSum))) + geom_boxplot()
   9 -
log(realSum)
   5 -
                       0
                                      biz
```

```
# cleanliness_rating vs. realSum
airbnb$cleanliness_rating <- as.factor(airbnb$cleanliness_rating)</pre>
ggplot(airbnb, aes(x=cleanliness_rating, y=log(realSum))) + geom_boxplot()
   9 -
log(realSum)
   5
          2
                          5
                                   6
                                                            9
                                                                    10
                              cleanliness_rating
table(airbnb$cleanliness_rating)
##
##
                                   10
      2
##
                       8
                          81 278 599
# guest_satisfaction_overall vs. realSum
ggplot(airbnb, aes(x=guest_satisfaction_overall, y=log(realSum))) + geom_point()
   9 -
log(realSum)
   5 -
                                      60
                                                                     100
       20
                       40
                                                      80
                          guest_satisfaction_overall
{\tt ggplot(airbnb, aes(x=log(101-guest\_satisfaction\_overall), y=log(realSum))) + geom\_point()}
   9
log(realSum)
   5 -
                                                                 4
                     log(101 - guest_satisfaction_overall)
# bedrooms vs. realSum
airbnb$bedrooms <- as.factor(airbnb$bedrooms)</pre>
ggplot(airbnb, aes(x=bedrooms, y=log(realSum))) + geom_boxplot()
```

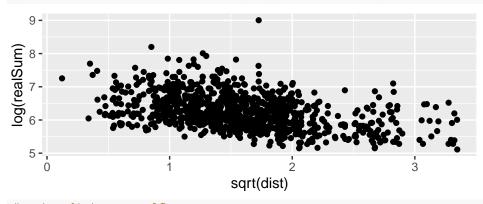


table(airbnb\$bedrooms)

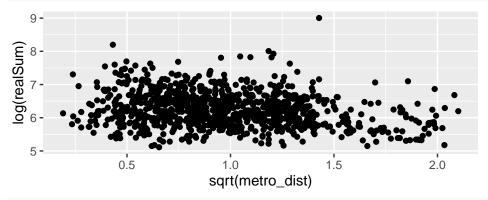
```
## ## 0 1 2 3 4 5
## 63 636 210 57 9 2
```

dist vs. realSum

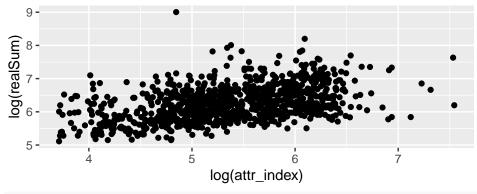
ggplot(airbnb, aes(x=sqrt(dist), y=log(realSum))) + geom_point()



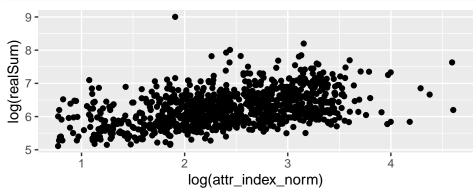
metro_dist vs. realSum
ggplot(airbnb, aes(x=sqrt(metro_dist), y=log(realSum))) + geom_point()



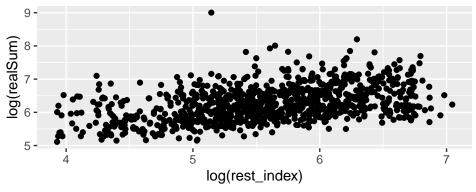
attr_index vs. realSum
ggplot(airbnb, aes(x=log(attr_index), y=log(realSum))) + geom_point()



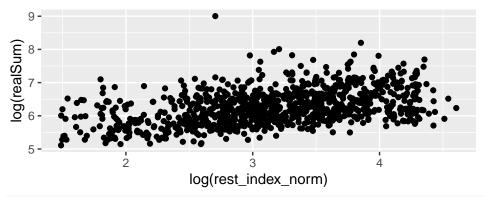
attr_index_norm vs. realSum
ggplot(airbnb, aes(x=log(attr_index_norm), y=log(realSum))) + geom_point()



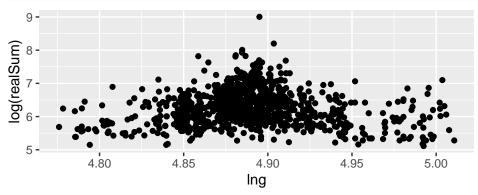
rest_index vs. realSum
ggplot(airbnb, aes(x=log(rest_index), y=log(realSum))) + geom_point()



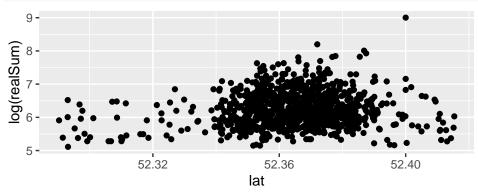
rest_index_norm vs. realSum
ggplot(airbnb, aes(x=log(rest_index_norm), y=log(realSum))) + geom_point()



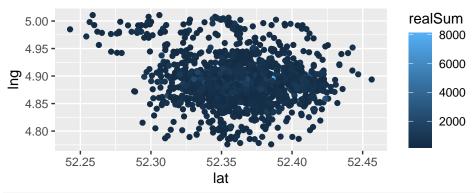
lng vs. realSum
ggplot(airbnb, aes(x=lng, y=log(realSum))) + geom_point()



lat vs. realSum
ggplot(airbnb, aes(x=lat, y=log(realSum))) + geom_point()



lng vs. lat
ggplot(airbnb, aes(x=lat, y=lng, color = realSum)) + geom_point() + geom_jitter(width = 0.05)



transformed model

airbnb_lm_transformed <- lm(log(realSum) ~ room_type+room_shared+room_private+person_capacity+host_is_s summary(airbnb_lm_transformed)

```
##
## Call:
## lm(formula = log(realSum) ~ room_type + room_shared + room_private +
       person_capacity + host_is_superhost + multi + biz + cleanliness_rating +
##
##
       log(101 - guest_satisfaction_overall) + bedrooms + sqrt(dist) +
       sqrt(metro_dist) + log(attr_index) + log(attr_index_norm) +
##
       log(rest_index) + log(rest_index_norm), data = airbnb)
##
##
## Residuals:
       Min
                 10
                      Median
## -0.96796 -0.18472 -0.02441 0.14165
##
## Coefficients: (4 not defined because of singularities)
##
                                          Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                         4.8137741 0.4835551
                                                                9.955 < 2e-16
## room_typePrivate room
                                         -0.3250904 0.0222121 -14.636 < 2e-16
## room_typeShared room
                                         -0.6211706 0.1483561 -4.187 3.09e-05
## room_sharedTrue
                                                NA
                                                            NA
                                                                   NA
                                                                            NΑ
                                                            NA
                                                                   NA
## room_privateTrue
                                                NA
                                         0.1933472 0.0411843
                                                                4.695 3.06e-06
## person_capacity3
## person_capacity4
                                         0.3266046 0.0311079 10.499 < 2e-16
## person_capacity5
                                         0.5413083 0.0972736
                                                                5.565 3.41e-08
## person_capacity6
                                         0.7711199 0.0852378
                                                                9.047 < 2e-16
## host_is_superhostTrue
                                         -0.0006424 0.0222932
                                                               -0.029 0.977016
## multi1
                                         -0.0170297 0.0230957
                                                               -0.737 0.461088
## biz1
                                         0.0061857 0.0340945
                                                                0.181 0.856071
## cleanliness_rating4
                                         0.2543658 0.3582216
                                                                0.710 0.477829
## cleanliness rating5
                                         -0.4621271 0.4160099
                                                               -1.111 0.266911
## cleanliness_rating6
                                                               -1.329 0.184311
                                        -0.4156111 0.3128272
## cleanliness_rating7
                                        -0.3738294 0.3100169
                                                               -1.206 0.228181
## cleanliness_rating8
                                         -0.3189049 0.2954928
                                                               -1.079 0.280759
## cleanliness rating9
                                         -0.3080339 0.2944443
                                                               -1.046 0.295756
## cleanliness_rating10
                                         -0.2933455 0.2956053 -0.992 0.321277
## log(101 - guest_satisfaction_overall) -0.0394297 0.0122789 -3.211 0.001366
## bedrooms1
                                          0.0454986 0.0393075
                                                               1.158 0.247358
## bedrooms2
                                          0.2215028 0.0493335
                                                                4.490 8.00e-06
## bedrooms3
                                          0.4509334 0.0623491
                                                                7.232 9.76e-13
## bedrooms4
                                          0.7568799 0.1079190
                                                                7.013 4.41e-12
```

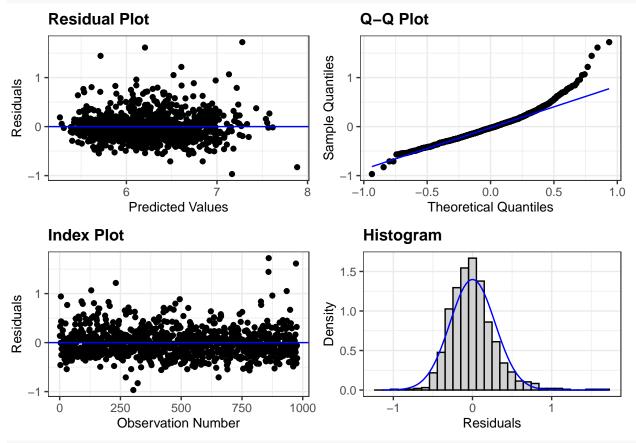
```
0.7232943 0.2102449
## bedrooms5
                                                                 3.440 0.000606
## sqrt(dist)
                                          0.0152180 0.0570692 0.267 0.789789
## sqrt(metro dist)
                                          0.0059329 0.0297082 0.200 0.841752
## log(attr_index)
                                          0.0913190 0.0656785 1.390 0.164735
## log(attr_index_norm)
                                                NΑ
                                                        NA
                                                                   NA
## log(rest index)
                                          0.2092932 0.0780708 2.681 0.007472
## log(rest_index_norm)
                                                        NA
                                                                   NA
##
## (Intercept)
                                         ***
## room_typePrivate room
                                         ***
## room_typeShared room
## room_sharedTrue
## room_privateTrue
## person_capacity3
## person_capacity4
                                         ***
## person_capacity5
## person_capacity6
                                         ***
## host_is_superhostTrue
## multi1
## biz1
## cleanliness_rating4
## cleanliness rating5
## cleanliness_rating6
## cleanliness rating7
## cleanliness rating8
## cleanliness rating9
## cleanliness_rating10
## log(101 - guest_satisfaction_overall) **
## bedrooms1
## bedrooms2
## bedrooms3
                                         ***
## bedrooms4
                                         ***
## bedrooms5
## sqrt(dist)
## sqrt(metro dist)
## log(attr_index)
## log(attr index norm)
## log(rest_index)
                                         **
## log(rest_index_norm)
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.289 on 950 degrees of freedom
## Multiple R-squared: 0.6997, Adjusted R-squared: 0.6915
## F-statistic: 85.14 on 26 and 950 DF, p-value: < 2.2e-16
airbnb_lm_transformed <- lm(log(realSum) ~ room_type+person_capacity+host_is_superhost+multi+biz+cleanl
summary(airbnb_lm_transformed)
##
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + host_is_superhost +
##
       multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
       bedrooms + sqrt(dist) + sqrt(metro_dist) + log(attr_index) +
      log(rest_index), data = airbnb)
```

```
##
## Residuals:
       Min
                 1Q Median
## -0.96796 -0.18472 -0.02441 0.14165 1.72381
## Coefficients:
##
                                         Estimate Std. Error t value Pr(>|t|)
                                        4.8137741 0.4835551 9.955 < 2e-16
## (Intercept)
## room_typePrivate room
                                      -0.3250904 0.0222121 -14.636 < 2e-16
## room_typeShared room
                                      -0.6211706 0.1483561 -4.187 3.09e-05
## person_capacity3
                                       0.1933472 0.0411843 4.695 3.06e-06
## person_capacity4
                                       0.3266046 0.0311079 10.499 < 2e-16
                                                              5.565 3.41e-08
## person_capacity5
                                       0.5413083 0.0972736
## person_capacity6
                                       0.7711199 0.0852378
                                                              9.047 < 2e-16
## host_is_superhostTrue
                                      -0.0006424 0.0222932 -0.029 0.977016
                                      -0.0170297 0.0230957 -0.737 0.461088
## multi1
## biz1
                                       0.0061857 0.0340945
                                                               0.181 0.856071
## cleanliness rating4
                                       0.2543658 0.3582216
                                                              0.710 0.477829
## cleanliness_rating5
                                      -0.4621271 0.4160099 -1.111 0.266911
## cleanliness rating6
                                      -0.4156111 0.3128272 -1.329 0.184311
                                      -0.3738294 0.3100169 -1.206 0.228181
## cleanliness_rating7
## cleanliness rating8
                                      -0.3189049 0.2954928 -1.079 0.280759
## cleanliness_rating9
                                      -0.3080339 0.2944443 -1.046 0.295756
## cleanliness rating10
                                       -0.2933455 0.2956053 -0.992 0.321277
## log(101 - guest_satisfaction_overall) -0.0394297  0.0122789  -3.211  0.001366
## bedrooms1
                                        0.0454986 0.0393075
                                                              1.158 0.247358
## bedrooms2
                                        0.2215028 0.0493335
                                                              4.490 8.00e-06
## bedrooms3
                                         0.4509334 0.0623491
                                                               7.232 9.76e-13
## bedrooms4
                                                              7.013 4.41e-12
                                        0.7568799 0.1079190
## bedrooms5
                                                              3.440 0.000606
                                        0.7232943 0.2102449
                                        0.0152180 0.0570692
                                                              0.267 0.789789
## sqrt(dist)
## sqrt(metro_dist)
                                        0.0059329 0.0297082
                                                               0.200 0.841752
## log(attr_index)
                                        0.0913190 0.0656785
                                                              1.390 0.164735
## log(rest_index)
                                        0.2092932 0.0780708
                                                               2.681 0.007472
## (Intercept)
                                        ***
## room typePrivate room
## room_typeShared room
                                        ***
## person_capacity3
## person_capacity4
                                        ***
## person capacity5
## person_capacity6
                                        ***
## host is superhostTrue
## multi1
## biz1
## cleanliness_rating4
## cleanliness_rating5
## cleanliness_rating6
## cleanliness_rating7
## cleanliness_rating8
## cleanliness_rating9
## cleanliness_rating10
## log(101 - guest_satisfaction_overall) **
## bedrooms1
```

```
## bedrooms2
## bedrooms3
## bedrooms4
## bedrooms5
## sqrt(dist)
## sqrt(metro_dist)
## log(attr_index)
## log(rest_index)
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.289 on 950 degrees of freedom
## Multiple R-squared: 0.6997, Adjusted R-squared: 0.6915
## F-statistic: 85.14 on 26 and 950 DF, p-value: < 2.2e-16
```

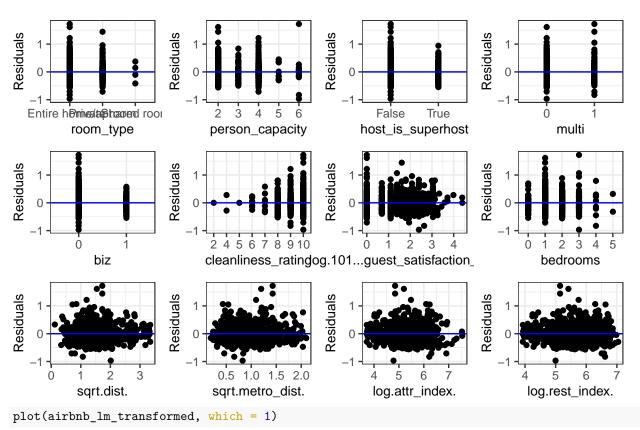
check assumptions

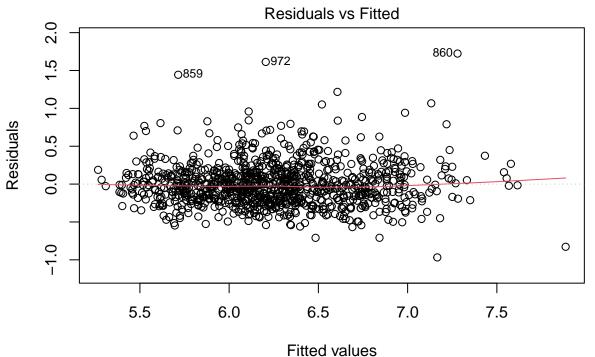
resid_panel(airbnb_lm_transformed)



resid_xpanel(airbnb_lm_transformed)

Plots of Residuals vs Predictor Variables



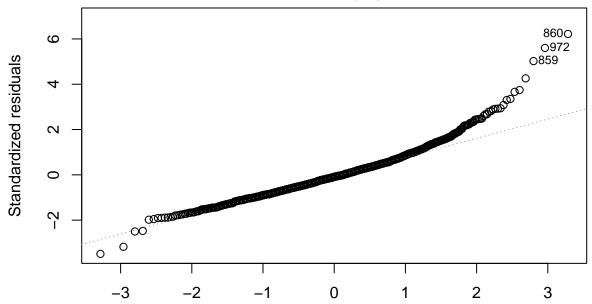


Im(log(realSum) ~ room_type + person_capacity + host_is_superhost + multi + ...

plot(airbnb_lm_transformed, which = 2)

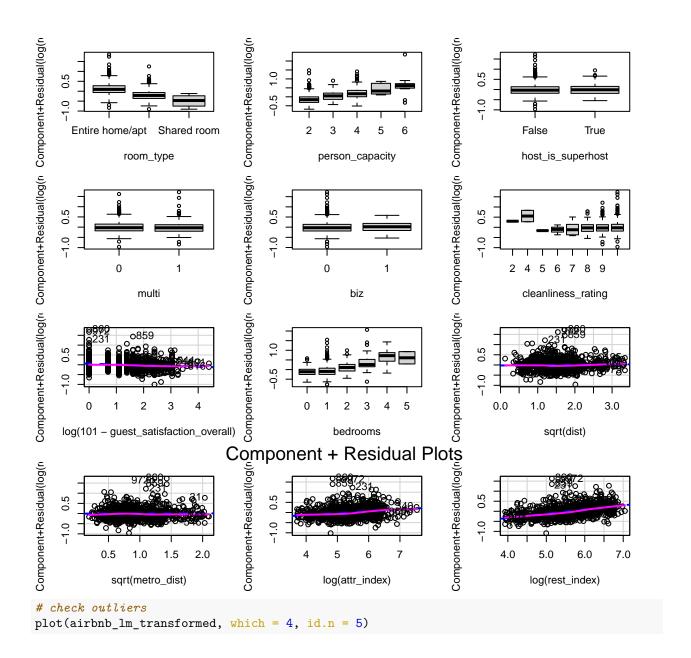
Warning: not plotting observations with leverage one: ## 816

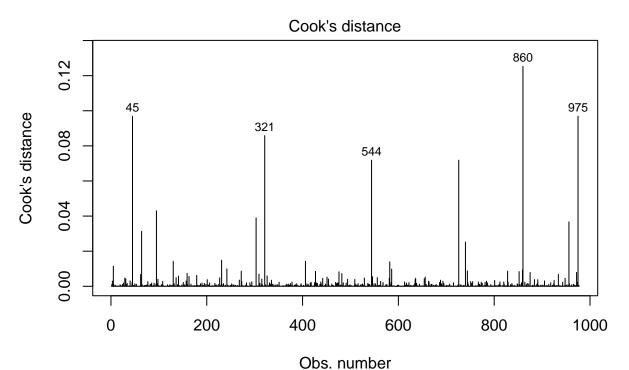
Normal Q-Q



Theoretical Quantiles
Im(log(realSum) ~ room_type + person_capacity + host_is_superhost + multi + ...

partial residuals
crp(airbnb_lm_transformed, id = list(n = 4))





Im(log(realSum) ~ room_type + person_capacity + host_is_superhost + multi + ...

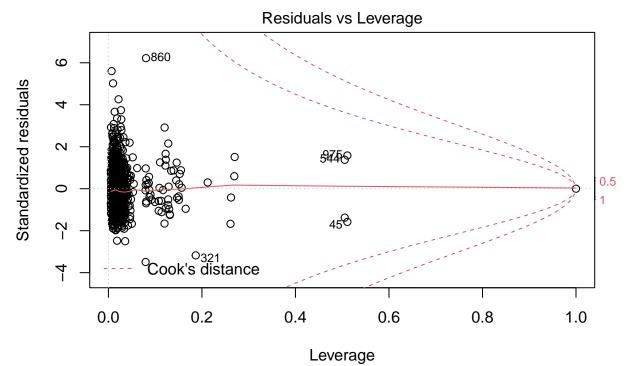
plot(airbnb_lm_transformed, which = 5, id.n = 5)

Warning: not plotting observations with leverage one:

816

Warning in sqrt(crit * p * (1 - hh)/hh): NaNs produced

Warning in sqrt(crit * p * (1 - hh)/hh): NaNs produced



lm(log(realSum) ~ room_type + person_capacity + host_is_superhost + multi + ...

```
# refit model without potential influential cases
airbnb_lm_transformed_no_inf <- lm(log(realSum) ~ room_type+person_capacity+host_is_superhost+multi+biz
# bedrooms5 is not significant anymore, only has 2 samples
summary(airbnb_lm_transformed_no_inf)</pre>
```

```
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + host_is_superhost +
       multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
##
       bedrooms + sqrt(dist) + sqrt(metro_dist) + log(attr_index) +
##
       log(rest_index), data = airbnb, subset = -c(975))
##
## Residuals:
##
                  1Q
                       Median
                                             Max
  -0.96477 -0.18614 -0.02309 0.14060
##
## Coefficients:
##
                                          Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                                      0.483231
                                                                 9.986 < 2e-16 ***
                                          4.825770
## room_typePrivate room
                                         -0.323184
                                                      0.022227 -14.540
                                                                        < 2e-16 ***
## room_typeShared room
                                         -0.617570
                                                      0.148256
                                                               -4.166 3.39e-05 ***
## person_capacity3
                                          0.193258
                                                      0.041152
                                                                 4.696 3.04e-06 ***
## person_capacity4
                                          0.326863
                                                      0.031084 10.516 < 2e-16 ***
## person_capacity5
                                          0.541535
                                                      0.097197
                                                                 5.572 3.29e-08 ***
## person_capacity6
                                                      0.085173
                                          0.770055
                                                                 9.041 < 2e-16 ***
## host_is_superhostTrue
                                         -0.001519
                                                      0.022282
                                                               -0.068 0.945661
## multi1
                                         -0.016696
                                                      0.023078
                                                               -0.723 0.469575
## biz1
                                          0.010443
                                                      0.034173
                                                                 0.306 0.759988
## cleanliness_rating4
                                          0.249953
                                                      0.357949
                                                                 0.698 0.485166
## cleanliness_rating5
                                         -0.465473
                                                      0.415685 -1.120 0.263094
```

##

```
## cleanliness_rating6
                                -0.418250
                                          0.312584 -1.338 0.181203
                                ## cleanliness_rating7
                                -0.326964 0.295302 -1.107 0.268480
## cleanliness_rating8
## cleanliness_rating9
                                ## cleanliness_rating10
                                ## bedrooms1
                                 0.045765 0.039277 1.165 0.244235
## bedrooms2
                                 ## bedrooms3
                                 0.451472
                                         0.062301
                                                  7.247 8.84e-13 ***
## bedrooms4
                                 0.757066
                                        0.107834
                                                  7.021 4.20e-12 ***
## bedrooms5
                                 0.395990
                                         0.294705
                                                  1.344 0.179372
## sqrt(dist)
                                                  0.244 0.806961
                                 0.013939
                                          0.057030
## sqrt(metro_dist)
                                 0.006623
                                         0.029688
                                                  0.223 0.823514
## log(attr_index)
                                 0.094123
                                          0.065650
                                                  1.434 0.151985
                                 0.205588
                                          0.078044
                                                  2.634 0.008569 **
## log(rest_index)
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2888 on 949 degrees of freedom
## Multiple R-squared: 0.6987, Adjusted R-squared: 0.6905
## F-statistic: 84.65 on 26 and 949 DF, p-value: < 2.2e-16
airbnb_lm_transformed_no_inf2 <- lm(log(realSum) ~ room_type+person_capacity+host_is_superhost+multi+bi
# bedrooms5 is gone
summary(airbnb_lm_transformed_no_inf2)
##
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + host_is_superhost +
     multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
     bedrooms + sqrt(dist) + sqrt(metro_dist) + log(attr_index) +
##
##
     log(rest_index), data = airbnb, subset = -c(975, 45))
##
## Residuals:
##
      Min
              1Q
                Median
                            3Q
                                  Max
## -0.96477 -0.18625 -0.02339 0.14064
##
## Coefficients:
##
                                 Estimate Std. Error t value Pr(>|t|)
                                                  9.986 < 2e-16 ***
## (Intercept)
                                 4.825770 0.483231
                                ## room_typePrivate room
## room_typeShared room
                                ## person_capacity3
## person_capacity4
                                ## person_capacity5
                                0.770055 0.085173 9.041 < 2e-16 ***
## person_capacity6
## host_is_superhostTrue
                                -0.001519 0.022282 -0.068 0.945661
## multi1
                                ## biz1
                                 0.010443
                                         0.034173
                                                  0.306 0.759988
## cleanliness_rating4
                                0.249953
                                        0.357949 0.698 0.485166
## cleanliness_rating5
                                -0.465473
                                        0.415685 -1.120 0.263094
## cleanliness_rating6
                                -0.418250
                                          0.312584 -1.338 0.181203
## cleanliness_rating7
                                         0.309774 -1.213 0.225356
                                -0.375817
## cleanliness_rating8
                                -0.326964
                                        0.295302 -1.107 0.268480
## cleanliness_rating9
```

```
## cleanliness_rating10
                                        -0.297743
                                                   0.295384 -1.008 0.313718
                                                   0.012297 -3.314 0.000956 ***
## log(101 - guest_satisfaction_overall) -0.040749
## bedrooms1
                                         0.045765
                                                   0.039277
                                                              1.165 0.244235
## bedrooms2
                                         0.222333
                                                   0.049297
                                                              4.510 7.29e-06 ***
## bedrooms3
                                         0.451472
                                                   0.062301
                                                              7.247 8.84e-13 ***
## bedrooms4
                                                             7.021 4.20e-12 ***
                                         0.757066
                                                   0.107834
## sqrt(dist)
                                                              0.244 0.806961
                                         0.013939
                                                   0.057030
## sqrt(metro_dist)
                                         0.006623
                                                   0.029688
                                                              0.223 0.823514
## log(attr_index)
                                         0.094123
                                                   0.065650
                                                              1.434 0.151985
## log(rest_index)
                                         0.205588
                                                   0.078044
                                                              2.634 0.008569 **
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2888 on 949 degrees of freedom
## Multiple R-squared: 0.6985, Adjusted R-squared: 0.6905
## F-statistic: 87.94 on 25 and 949 DF, p-value: < 2.2e-16
airbnb_lm_transformed_no_inf3 <- lm(log(realSum) ~ room_type+person_capacity+host_is_superhost+multi+bi
# bedrooms5 is gone, no significant change
summary(airbnb_lm_transformed_no_inf3)
##
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + host_is_superhost +
##
      multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
      bedrooms + sqrt(dist) + sqrt(metro_dist) + log(attr_index) +
##
##
      log(rest_index), data = airbnb, subset = -c(975, 45, 544,
##
      726))
##
## Residuals:
       Min
##
                 1Q
                     Median
                                   3Q
                                           Max
## -0.96162 -0.18657 -0.02314 0.14045 1.72403
##
## Coefficients:
##
                                         Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                        4.801261
                                                   0.483313
                                                              9.934 < 2e-16 ***
                                                   0.022217 -14.558 < 2e-16 ***
                                        -0.323445
## room_typePrivate room
## room_typeShared room
                                       -0.617442
                                                   0.148183 -4.167 3.37e-05 ***
                                                              4.694 3.08e-06 ***
## person_capacity3
                                        0.193065
                                                   0.041132
## person_capacity4
                                        0.326619
                                                   0.031069 10.513 < 2e-16 ***
## person_capacity5
                                        ## person_capacity6
                                        0.768837
                                                   0.085135
                                                             9.031 < 2e-16 ***
## host_is_superhostTrue
                                       -0.001383 0.022272 -0.062 0.950500
## multi1
                                       -0.016080 0.023071 -0.697 0.485986
## biz1
                                        0.014562
                                                  0.034284
                                                              0.425 0.671114
## cleanliness_rating5
                                       -0.464509 0.415480 -1.118 0.263849
## cleanliness rating6
                                       -0.419596 0.312431 -1.343 0.179591
## cleanliness_rating7
                                       -0.376327
                                                   0.309621 -1.215 0.224499
## cleanliness_rating8
                                        -0.328626
                                                   0.295159 -1.113 0.265825
## cleanliness_rating9
                                        -0.314079
                                                  0.294080 -1.068 0.285790
## cleanliness_rating10
                                                   0.295243 -1.017 0.309563
                                        -0.300169
## log(101 - guest_satisfaction_overall) -0.041387
                                                   0.012300 -3.365 0.000797 ***
## bedrooms1
                                         0.046476
                                                   0.039261
                                                             1.184 0.236801
## bedrooms2
                                         0.223182
                                                   0.049277
                                                              4.529 6.68e-06 ***
## bedrooms3
                                         0.452142
                                                   0.062272 7.261 8.01e-13 ***
```

```
## bedrooms4
                                     0.757246 0.107780
                                                        7.026 4.06e-12 ***
## sqrt(dist)
                                     0.017512 0.057059
                                                         0.307 0.758986
                                     0.007753 0.029684
## sqrt(metro_dist)
                                                         0.261 0.794006
## log(attr_index)
                                     0.095472 0.065625
                                                         1.455 0.146050
## log(rest_index)
                                     0.207846 0.078022
                                                         2.664 0.007854 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2886 on 948 degrees of freedom
## Multiple R-squared: 0.6991, Adjusted R-squared: 0.6914
## F-statistic: 91.75 on 24 and 948 DF, p-value: < 2.2e-16
# check collinearity
vif(airbnb_lm_transformed_no_inf2)
##
                                         GVIF Df GVIF^(1/(2*Df))
                                     1.428492 2
## room_type
                                                      1.093250
## person_capacity
                                     2.825552 4
                                                      1.138644
                                     1.157108 1
## host_is_superhost
                                                      1.075690
## multi
                                     1.184242 1
                                                      1.088229
## biz
                                     1.155490 1
                                                      1.074937
## cleanliness_rating
                                     1.789273 7
                                                      1.042433
## log(101 - guest_satisfaction_overall) 1.576988 1
                                                      1.255782
## bedrooms
                                     2.965420 4
                                                      1.145541
## sqrt(dist)
                                    12.362496 1
                                                      3.516034
## sqrt(metro_dist)
                                     1.449851 1
                                                      1.204098
## log(attr_index)
                                    23.828914 1
                                                      4.881487
## log(rest_index)
                                    32.714445 1
                                                      5.719654
# transformed model - removing dist
airbnb_lm_transformed_1 <- lm(log(realSum) ~ room_type+person_capacity+host_is_superhost+multi+biz+clea
summary(airbnb_lm_transformed_1)
##
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + host_is_superhost +
      multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
##
      bedrooms + sqrt(metro_dist) + log(attr_index) + log(rest_index),
##
      data = airbnb, subset = -c(975, 45))
##
## Residuals:
               1Q
                   Median
      Min
## -0.96597 -0.18627 -0.02322 0.13955 1.72091
## Coefficients:
                                     Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                                     4.913499  0.323386  15.194  < 2e-16 ***
## room_typePrivate room
                                    -0.322826  0.022168 -14.563  < 2e-16 ***
                                   ## room_typeShared room
## person_capacity3
                                     ## person_capacity4
                                     ## person_capacity5
                                    ## person_capacity6
                                    -0.001447 0.022269 -0.065 0.948219
## host_is_superhostTrue
## multi1
                                    -0.016646 0.023066 -0.722 0.470669
## biz1
                                     0.009801 0.034056 0.288 0.773556
```

```
## cleanliness_rating4
                                   0.251165 0.357737
                                                       0.702 0.482792
                                   ## cleanliness_rating5
## cleanliness rating6
                                  ## cleanliness_rating7
                                   ## cleanliness_rating8
                                   ## cleanliness rating9
                                   ## cleanliness rating10
                                   -0.296547 0.295197 -1.005 0.315358
## bedrooms1
                                    0.045354
                                            0.039221
                                                      1.156 0.247828
## bedrooms2
                                    ## bedrooms3
                                    0.451765 0.062258
                                                       7.256 8.26e-13 ***
                                                       7.031 3.93e-12 ***
## bedrooms4
                                    0.757603 0.107758
## sqrt(metro_dist)
                                    0.004537
                                             0.028421
                                                       0.160 0.873199
                                    0.092578
                                            0.065313 1.417 0.156678
## log(attr_index)
                                    0.195448
                                            0.066070
                                                       2.958 0.003171 **
## log(rest_index)
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2886 on 950 degrees of freedom
## Multiple R-squared: 0.6985, Adjusted R-squared: 0.6908
## F-statistic: 91.69 on 24 and 950 DF, p-value: < 2.2e-16
# anova test
anova(airbnb_lm_transformed_1, airbnb_lm_transformed_no_inf2)
## Analysis of Variance Table
## Model 1: log(realSum) ~ room_type + person_capacity + host_is_superhost +
##
      multi + biz + cleanliness rating + log(101 - guest satisfaction overall) +
      bedrooms + sqrt(metro_dist) + log(attr_index) + log(rest_index)
## Model 2: log(realSum) ~ room_type + person_capacity + host_is_superhost +
##
      multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
      bedrooms + sqrt(dist) + sqrt(metro_dist) + log(attr_index) +
##
##
      log(rest_index)
##
    Res.Df
            RSS Df Sum of Sq
                               F Pr(>F)
## 1
      950 79.139
      949 79.134 1 0.0049815 0.0597 0.807
# collinearity between attr_index and rest_index is high after removing sqrt(dist)
vif(airbnb_lm_transformed_1)
##
                                       GVIF Df GVIF^(1/(2*Df))
## room_type
                                    1.420219 2
                                                    1.091664
## person_capacity
                                    2.820576 4
                                                    1.138393
## host_is_superhost
                                    1.156903 1
                                                     1.075594
## multi
                                    1.184149 1
                                                    1.088186
## biz
                                    1.148677 1
                                                    1.071764
## cleanliness_rating
                                    1.775364 7
                                                    1.041853
## log(101 - guest_satisfaction_overall) 1.575671 1
                                                    1.255257
## bedrooms
                                    2.948508 4
                                                    1.144723
## sqrt(metro dist)
                                    1.330032 1
                                                    1.153270
                                   23.607847 1
## log(attr_index)
                                                    4.858791
## log(rest_index)
                                   23.469291 1
                                                    4.844511
\# transformed model - removing attr_index
airbnb_lm_transformed_2 <- lm(log(realSum) ~ room_type+person_capacity+host_is_superhost+multi+biz+clea
```

```
summary(airbnb_lm_transformed_2)
##
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + host_is_superhost +
      multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
      bedrooms + sqrt(metro_dist) + log(rest_index), data = airbnb,
##
      subset = -c(975, 45))
##
## Residuals:
##
       Min
                1Q
                   Median
                                30
                                       Max
## -0.96708 -0.18494 -0.02415 0.14086 1.71727
##
## Coefficients:
##
                                      Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                     4.917225 0.323547 15.198 < 2e-16 ***
## room_typePrivate room
                                     -0.611118
## room_typeShared room
                                              0.148073 -4.127 4.00e-05 ***
                                     ## person_capacity3
## person_capacity4
                                     ## person_capacity5
                                     0.542202
                                                0.097156 5.581 3.12e-08 ***
## person_capacity6
                                     0.771936
                                               0.085147
                                                         9.066 < 2e-16 ***
## host_is_superhostTrue
                                     ## multi1
                                     -0.019445 0.022994 -0.846 0.39795
## biz1
                                     0.008167 0.034054
                                                          0.240 0.81051
## cleanliness rating4
                                     0.240282 0.357844 0.671 0.50208
## cleanliness rating5
                                     -0.481796  0.415502  -1.160  0.24652
## cleanliness_rating6
                                    -0.427650 0.312392 -1.369 0.17134
## cleanliness rating7
                                     -0.387241 0.309678 -1.250 0.21144
## cleanliness_rating8
                                    -0.338553 0.295161 -1.147 0.25167
## cleanliness_rating9
                                     -0.321782 0.294079 -1.094 0.27414
                                     -0.309194 0.295219 -1.047 0.29521
## cleanliness_rating10
## log(101 - guest_satisfaction_overall) -0.040611
                                              0.012293 -3.304 0.00099 ***
## bedrooms1
                                      0.045930
                                              0.039240 1.170 0.24210
## bedrooms2
                                              0.049296 4.496 7.79e-06 ***
                                      0.221624
## bedrooms3
                                      0.450972
                                               0.062289
                                                          7.240 9.25e-13 ***
## bedrooms4
                                      0.770713
                                               0.107417
                                                          7.175 1.45e-12 ***
## sqrt(metro_dist)
                                                          0.036 0.97116
                                      0.001025
                                                0.028327
## log(rest_index)
                                      0.286335
                                                0.015941 17.962 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.2888 on 951 degrees of freedom
## Multiple R-squared: 0.6978, Adjusted R-squared: 0.6905
## F-statistic: 95.49 on 23 and 951 DF, p-value: < 2.2e-16
anova(airbnb_lm_transformed_1, airbnb_lm_transformed_2)
## Analysis of Variance Table
##
## Model 1: log(realSum) ~ room_type + person_capacity + host_is_superhost +
```

multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +

bedrooms + sqrt(metro_dist) + log(attr_index) + log(rest_index)

##

##

```
## Model 2: log(realSum) ~ room_type + person_capacity + host_is_superhost +
##
     multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
     bedrooms + sqrt(metro dist) + log(rest index)
##
          RSS Df Sum of Sq
##
   Res.Df
## 1
     950 79.139
## 2
     951 79.307 -1 -0.16737 2.0092 0.1567
# transformed model - removing rest_index
airbnb_lm_transformed_3 <- lm(log(realSum) ~ room_type+person_capacity+host_is_superhost+multi+biz+clea
summary(airbnb lm transformed 3)
##
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + host_is_superhost +
     multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
     bedrooms + sqrt(metro_dist) + log(attr_index), data = airbnb,
##
     subset = -c(975, 45))
##
## Residuals:
     Min
             1Q
               Median
                          30
                                Max
## -0.96985 -0.18250 -0.02421 0.14363 1.72845
## Coefficients:
##
                              Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                             4.991055 0.323632 15.422 < 2e-16 ***
                             ## room_typePrivate room
                             ## room_typeShared room
                             ## person_capacity3
## person_capacity4
                             ## person_capacity5
## person_capacity6
                              ## host_is_superhostTrue
                             ## multi1
                             ## biz1
## cleanliness_rating4
                             0.260581 0.359178 0.725 0.468329
## cleanliness_rating5
                             -0.459788 0.417088 -1.102 0.270577
## cleanliness_rating6
                             -0.404090 0.313571 -1.289 0.197826
                             ## cleanliness_rating7
## cleanliness_rating8
                             -0.310411 0.296288 -1.048 0.295058
                             ## cleanliness rating9
## cleanliness_rating10
                             -0.279799 0.296343 -0.944 0.345322
## bedrooms1
                              0.041021 0.039353 1.042 0.297507
## bedrooms2
                              ## bedrooms3
                              ## bedrooms4
                              0.730524 0.107805
                                              6.776 2.16e-11 ***
## sqrt(metro_dist)
                              0.002186 0.028525 0.077 0.938935
## log(attr_index)
                              ## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2898 on 951 degrees of freedom
## Multiple R-squared: 0.6957, Adjusted R-squared: 0.6883
## F-statistic: 94.53 on 23 and 951 DF, p-value: < 2.2e-16
```

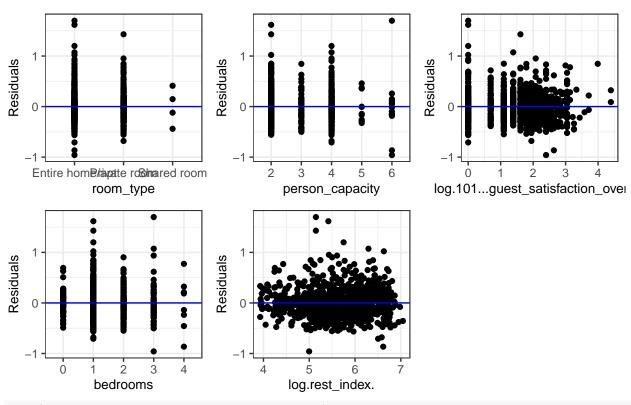
```
# anova test
anova(airbnb_lm_transformed_1, airbnb_lm_transformed_3)
## Analysis of Variance Table
## Model 1: log(realSum) ~ room_type + person_capacity + host_is_superhost +
       multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
       bedrooms + sqrt(metro_dist) + log(attr_index) + log(rest_index)
## Model 2: log(realSum) ~ room_type + person_capacity + host_is_superhost +
      multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
       bedrooms + sqrt(metro dist) + log(attr index)
##
##
    Res.Df
              RSS Df Sum of Sq
                                    F
                                       Pr(>F)
## 1
       950 79.139
## 2
       951 79.868 -1 -0.72899 8.7509 0.003171 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# no significant collinearity
vif(airbnb_lm_transformed_2)
                                            GVIF Df GVIF^(1/(2*Df))
                                         1.419437 2
## room_type
                                                           1.091513
## person_capacity
                                        2.811435 4
                                                           1.137931
## host_is_superhost
                                        1.154838 1
                                                           1.074634
## multi
                                         1.175472 1
                                                           1.084192
## biz
                                         1.147361
                                                           1.071149
## cleanliness_rating
                                        1.769499 7
                                                           1.041606
## log(101 - guest satisfaction overall) 1.575657 1
                                                           1.255252
## bedrooms
                                         2.919040 4
                                                           1.143286
## sqrt(metro dist)
                                         1.319920 1
                                                           1.148878
## log(rest_index)
                                         1.364777 1
                                                           1.168236
# anova test
airbnb_lm_transformed_reduced <- lm(log(realSum) ~ room_type+person_capacity+log(101-guest_satisfaction
summary(airbnb_lm_transformed_reduced)
##
## Call:
## lm(formula = log(realSum) ~ room_type + person_capacity + log(101 -
       guest_satisfaction_overall) + bedrooms + log(rest_index),
##
       data = airbnb, subset = -c(975, 45))
##
##
## Residuals:
       Min
                  10
                                   30
                     Median
                                            Max
## -0.95869 -0.18670 -0.02772 0.13846 1.69852
## Coefficients:
                                        Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                                         4.59366
                                                    0.09305 49.366 < 2e-16 ***
                                                    0.02076 -15.610 < 2e-16 ***
## room typePrivate room
                                        -0.32412
## room_typeShared room
                                        -0.62969
                                                    0.14651 -4.298 1.90e-05 ***
## person_capacity3
                                         0.19913
                                                    0.04074
                                                             4.888 1.19e-06 ***
## person_capacity4
                                         0.32786
                                                    0.03061 10.709 < 2e-16 ***
## person_capacity5
                                         0.53585
                                                    0.09648 5.554 3.61e-08 ***
## person_capacity6
                                         0.77503
                                                    0.08428 9.196 < 2e-16 ***
```

```
## log(101 - guest_satisfaction_overall) -0.04402
                                                       0.01008 -4.366 1.40e-05 ***
## bedrooms1
                                            0.05141
                                                       0.03868
                                                                  1.329
                                                                           0.184
## bedrooms2
                                            0.22553
                                                       0.04832
                                                                  4.667 3.49e-06 ***
## bedrooms3
                                            0.45785
                                                                  7.429 2.41e-13 ***
                                                       0.06163
## bedrooms4
                                            0.76923
                                                        0.10681
                                                                  7.202 1.20e-12 ***
## log(rest index)
                                            0.28734
                                                       0.01397
                                                                20.563 < 2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.289 on 962 degrees of freedom
## Multiple R-squared: 0.6939, Adjusted R-squared:
## F-statistic: 181.7 on 12 and 962 DF, p-value: < 2.2e-16
anova(airbnb_lm_transformed_reduced, airbnb_lm_transformed_2)
## Analysis of Variance Table
##
## Model 1: log(realSum) ~ room_type + person_capacity + log(101 - guest_satisfaction_overall) +
       bedrooms + log(rest_index)
## Model 2: log(realSum) ~ room_type + person_capacity + host_is_superhost +
       multi + biz + cleanliness_rating + log(101 - guest_satisfaction_overall) +
##
##
       bedrooms + sqrt(metro_dist) + log(rest_index)
               RSS Df Sum of Sq
##
     Res.Df
                                      F Pr(>F)
## 1
        962 80.346
## 2
        951 79.307 11
                          1.0392 1.1329 0.3315
# check assumptions
resid_panel(airbnb_lm_transformed_reduced)
                                                     Q-Q Plot
     Residual Plot
                                               Sample Quantiles
Residuals
                                                    -1.0
                                                             -0.5
                                                                       0.0
                                                                                0.5
                                                                                          1.0
                6
                 Predicted Values
                                                               Theoretical Quantiles
     Index Plot
                                                     Histogram
                                                 1.5
Residuals
                                               Density
                                                 1.0
                                                 0.5
                                                 0.0
               250
                        500
                                 750
                                          1000
                                                                     0
```

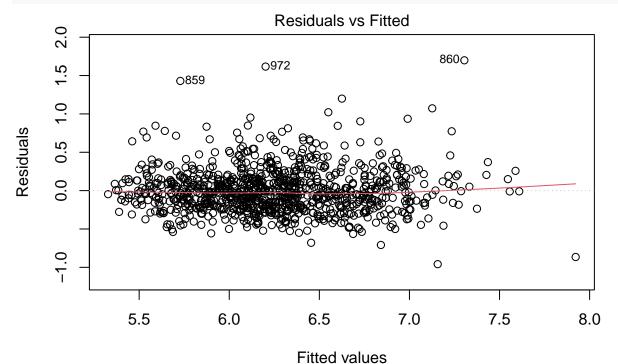
Residuals

Observation Number

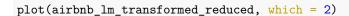
Plots of Residuals vs Predictor Variables

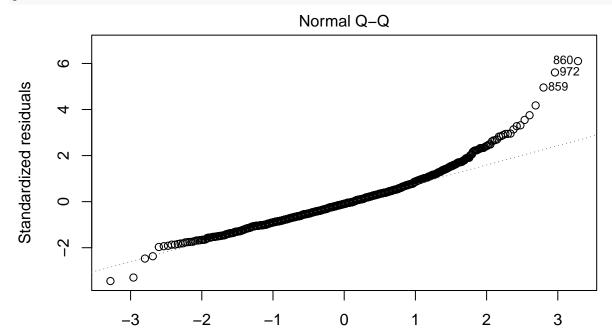


plot(airbnb_lm_transformed_reduced, which = 1)



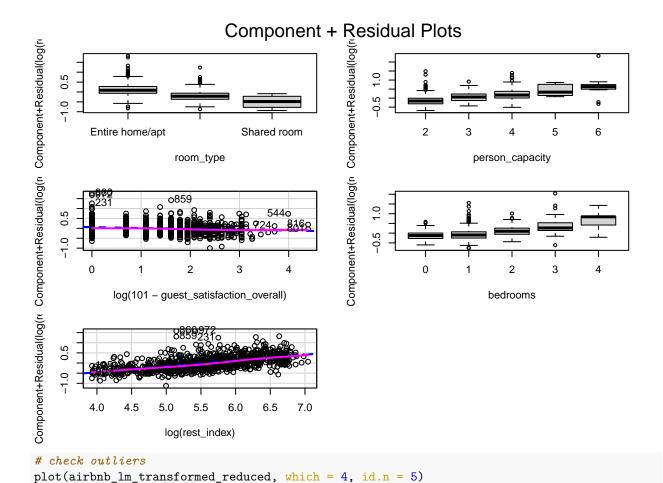
Im(log(realSum) ~ room_type + person_capacity + log(101 – guest_satisfactio ...

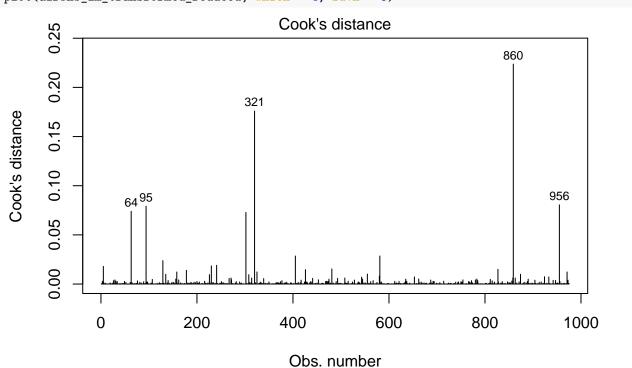




Theoretical Quantiles Im(log(realSum) ~ room_type + person_capacity + log(101 – guest_satisfactio ...

```
# partial residuals
crp(airbnb_lm_transformed_reduced, id = list(n = 4))
```



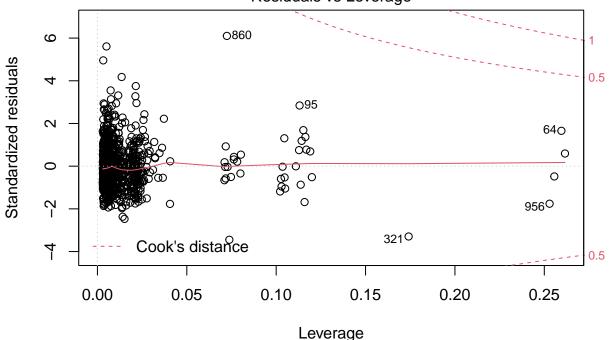


Im(log(realSum) ~ room_type + person_capacity + log(101 – guest_satisfactio ...

plot(airbnb_lm_transformed_reduced, which = 5, id.n = 5)

##

Residuals vs Leverage



Im(log(realSum) ~ room_type + person_capacity + log(101 - guest_satisfactio ...

```
# refit model without potential influential cases
airbnb_lm_transformed_reduced_no_inf <- lm(log(realSum) ~ room_type+person_capacity+log(101-guest_satis
# no change in significance
summary(airbnb_lm_transformed_reduced_no_inf)</pre>
```

```
lm(formula = log(realSum) ~ room_type + person_capacity + log(101 -
##
       guest_satisfaction_overall) + bedrooms + log(rest_index),
##
##
       data = airbnb, subset = -c(975, 45, 321, 956, 860, 95, 64))
##
## Residuals:
##
        Min
                  1Q
                       Median
                                     3Q
                                             Max
   -0.88852 -0.18304 -0.02872 0.13789
                                        1.62212
##
## Coefficients:
##
                                           Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                           4.576224
                                                      0.090793 50.403 < 2e-16 ***
## room_typePrivate room
                                          -0.324917
                                                      0.020222 -16.068
                                                                        < 2e-16 ***
## room_typeShared room
                                          -0.617941
                                                      0.201574
                                                                -3.066
                                                                        0.00223 **
## person_capacity3
                                           0.201259
                                                      0.039726
                                                                 5.066 4.87e-07 ***
## person_capacity4
                                           0.331446
                                                      0.029881
                                                                11.092 < 2e-16 ***
## person_capacity5
                                           0.542840
                                                      0.093902
                                                                 5.781 1.00e-08 ***
## person_capacity6
                                           0.728302
                                                      0.086770
                                                                 8.393
                                                                        < 2e-16 ***
## log(101 - guest_satisfaction_overall) -0.040699
                                                      0.009832
                                                                -4.139 3.79e-05 ***
## bedrooms1
                                           0.053011
                                                      0.037632
                                                                 1.409 0.15926
## bedrooms2
                                           0.225328
                                                      0.047058
                                                                 4.788 1.95e-06 ***
## bedrooms3
                                           0.434056
                                                      0.060092
                                                                 7.223 1.04e-12 ***
```

```
## bedrooms4
                                          0.781077
                                                     0.115223
                                                                6.779 2.12e-11 ***
## log(rest_index)
                                          0.289307
                                                     0.013647 21.199 < 2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.2812 on 957 degrees of freedom
## Multiple R-squared: 0.6974, Adjusted R-squared: 0.6936
## F-statistic: 183.8 on 12 and 957 DF, p-value: < 2.2e-16
# check collinearity
vif(airbnb_lm_transformed_reduced)
                                             GVIF Df GVIF^(1/(2*Df))
##
## room_type
                                         1.220335 2
                                                           1.051041
## person_capacity
                                         2.584994 4
                                                            1.126049
## log(101 - guest_satisfaction_overall) 1.058207 1
                                                            1.028692
## bedrooms
                                                            1.133350
                                         2.722158 4
## log(rest_index)
                                         1.047144 1
                                                            1.023300
# interpreation stats
(\exp(-0.324) - 1)*100
## [1] -27.67498
(\exp(-0.630) - 1)*100
## [1] -46.74082
(\exp(0.199) - 1)*100
## [1] 22.0182
(\exp(0.328) - 1)*100
## [1] 38.8189
(\exp(0.536) - 1)*100
## [1] 70.91565
(\exp(0.775) - 1)*100
## [1] 117.0592
(2^-0.044 - 1)*100
## [1] -3.003809
(\exp(0.226) - 1)*100
## [1] 25.35757
(\exp(0.458) - 1)*100
## [1] 58.0909
(\exp(0.769) - 1)*100
## [1] 115.7608
(2^0.287 - 1)*100
## [1] 22.01005
```

```
# confidence interval
(\exp(-0.365) - 1)*100
## [1] -30.58033
(\exp(-0.283) - 1)*100
## [1] -24.64802
(\exp(-0.917) - 1)*100
## [1] -60.02836
(\exp(-0.342) - 1)*100
## [1] -28.96518
(\exp(0.119) - 1)*100
## [1] 12.63699
(\exp(0.279) - 1)*100
## [1] 32.18073
(\exp(0.268) - 1)*100
## [1] 30.73471
(\exp(0.388) - 1)*100
## [1] 47.40298
(\exp(0.347) - 1)*100
## [1] 41.48167
(\exp(0.725) - 1)*100
## [1] 106.4731
(\exp(0.610) - 1)*100
## [1] 84.04314
(\exp(0.940) - 1)*100
## [1] 155.9981
(2^-0.064 - 1)*100
## [1] -4.339184
(2^-0.024 - 1)*100
## [1] -1.649793
(\exp(0.131) - 1)*100
## [1] 13.99678
(\exp(0.320) - 1)*100
## [1] 37.71278
```

```
(exp(0.337) - 1)*100

## [1] 40.07391
(exp(0.579) - 1)*100

## [1] 78.42533
(exp(0.560) - 1)*100

## [1] 75.06725
(exp(0.979) - 1)*100

## [1] 166.1793
(2^0.260 - 1)*100

## [1] 19.74787
(2^0.315 - 1)*100

## [1] 24.40117
```