Examining Trends in BikeShare Data

Martin Garcia-Angel

2023-12-03

```
hour =read.csv("C:\\Users\\Marti\\Downloads\\hour.csv")
head(hour)
```

```
instant
                 dteday season yr mnth hr holiday weekday workingday weathersit
##
## 1
           2 2011-01-01
                                                           6
                                                                      0
                                                                                  1
## 2
                                      1
                                         1
           3 2011-01-01
                                                                      0
## 3
                              1
                                         2
                                                           6
                                                                                  1
                                      1
## 4
           4 2011-01-01
                              1
                                 0
                                      1
                                         3
                                                                      0
                                                                                  1
## 5
           5 2011-01-01
                                      1 4
## 6
           6 2011-01-01
                              1
##
     temp atemp hum windspeed casual registered cnt
## 1 0.24 0.2879 0.81
                          0.0000
## 2 0.22 0.2727 0.80
                          0.0000
                                                     40
## 3 0.22 0.2727 0.80
                                      5
                                                     32
                          0.0000
                                                 27
## 4 0.24 0.2879 0.75
                          0.0000
                                      3
                                                 10
                                                     13
## 5 0.24 0.2879 0.75
                          0.0000
## 6 0.24 0.2576 0.75
                          0.0896
                                                  1
```

```
day =read.csv("C:\\Users\\Marti\\Downloads\\day.csv")
head(day)
```

```
##
                 dteday season yr mnth holiday weekday workingday weathersit
     instant
## 1
           1 2011-01-01
           2 2011-01-02
                                                       0
                                                                               2
## 2
           3 2011-01-03
                                 0
## 3
                                      1
                                               0
                                                       1
                                                                   1
                                                                               1
                                 0
                                                       2
                                                                   1
                                                                               1
## 4
           4 2011-01-04
                              1
                                      1
                                                       3
           5 2011-01-05
                                      1
                                                                   1
## 6
           6 2011-01-06
                              1
##
         temp
                 atemp
                             hum windspeed casual registered
                                                                cnt
## 1 0.344167 0.363625 0.805833 0.1604460
                                               331
                                                          654
                                                                985
## 2 0.363478 0.353739 0.696087 0.2485390
                                               131
                                                          670
                                                                801
## 3 0.196364 0.189405 0.437273 0.2483090
                                               120
                                                         1229 1349
                                               108
## 4 0.200000 0.212122 0.590435 0.1602960
                                                         1454 1562
## 5 0.226957 0.229270 0.436957 0.1869000
                                                82
                                                         1518 1600
## 6 0.204348 0.233209 0.518261 0.0895652
                                                         1518 1606
```

```
nrow(hour)
```

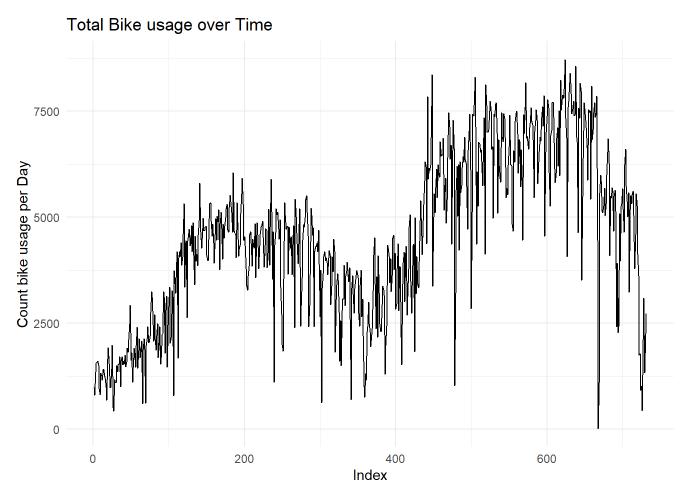
```
## [1] 17379
```

```
nrow(day)
```

```
## [1] 731
```

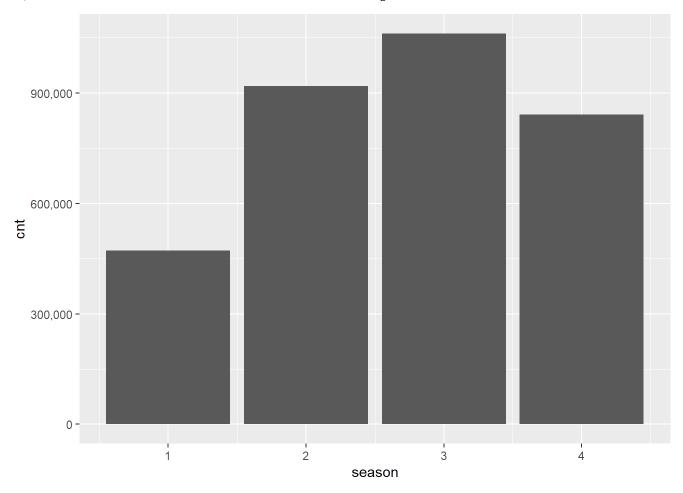
Line plot showing bike usage per day

```
# Create the line plot
ggplot(day, aes(x = instant, y = cnt)) +
  geom_line() +
  labs(x = "Index", y = "Count bike usage per Day", title = "Total Bike usage over Time") +
  theme_minimal()
```



Checking total count of bikes per season

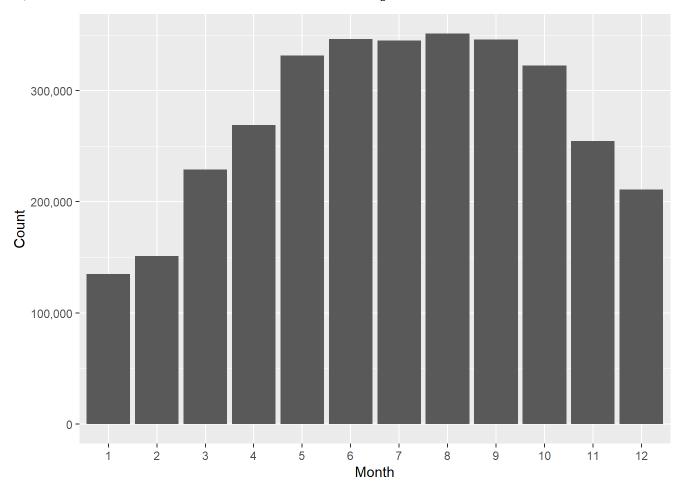
```
ggplot(day, aes(x = season, y = cnt)) + geom_bar(stat = 'identity')+ scale_y_continuous(labels =
scales::comma)
```



Checking total number of bikes per every month of the year

```
day$mnth <- as.factor(day$mnth)

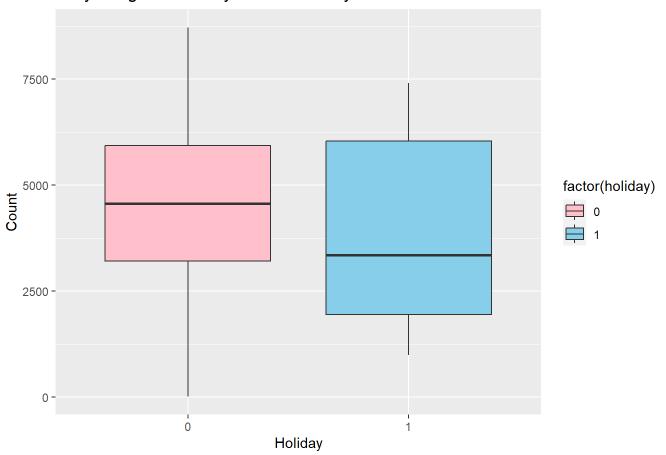
ggplot(day, aes(x = factor(mnth), y = cnt)) +
  geom_bar(stat = 'identity') +
  scale_y_continuous(labels = scales::comma) +
  labs(x = "Month", y = "Count")</pre>
```



box plot of Daily usage during Holiday vs Non-Holiday

```
box_plot <- ggplot(day, aes(x = factor(holiday), y = cnt, fill = factor(holiday))) +
  geom_boxplot() +
  labs(x = "Holiday", y = "Count", title = "Daily Usage for Holiday vs Non-Holiday") +
  scale_fill_manual(values = c("pink", "skyblue")) # Specify colors for boxes
box_plot</pre>
```

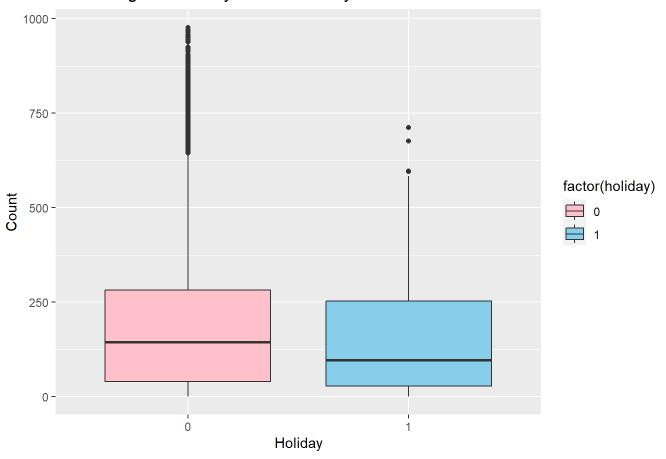
Daily Usage for Holiday vs Non-Holiday



box plot of Hourly usage during Holiday vs Non-Holiday

```
box_plot <- ggplot(hour, aes(x = factor(holiday), y = cnt, fill = factor(holiday))) +
   geom_boxplot() +
   labs(x = "Holiday", y = "Count", title = "Hour Usage for Holiday vs Non-Holiday") +
   scale_fill_manual(values = c("pink", "skyblue")) # Specify colors for boxes
box_plot</pre>
```

Hour Usage for Holiday vs Non-Holiday



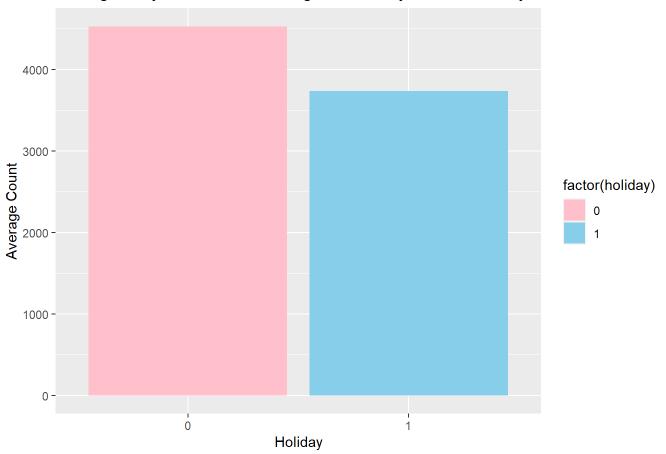
Bar plot of average ridership for holiday vs non-holiday

```
avg_counts <- day %>%
  group_by(holiday) %>%
  summarise(avg_count = mean(cnt, na.rm = TRUE))

bar_chart <- ggplot(avg_counts, aes(x = factor(holiday), y = avg_count, fill = factor(holiday)))
+
  geom_bar(stat = 'identity') +
  labs(x = "Holiday", y = "Average Count", title = "Average Daily Count of Bike Usage for Holida y vs Non-Holiday") +
  scale_fill_manual(values = c("pink", "skyblue"))

bar_chart</pre>
```

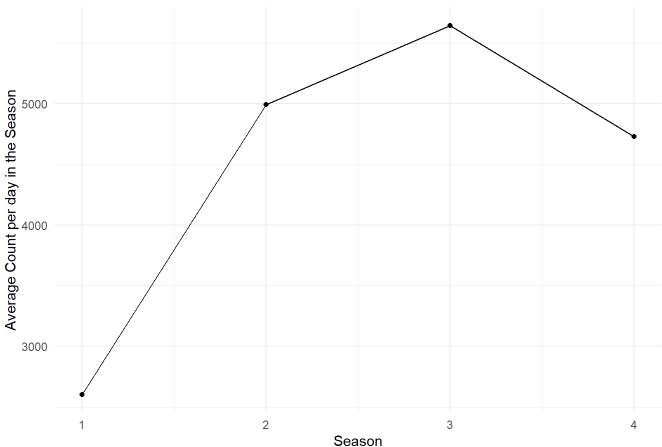
Average Daily Count of Bike Usage for Holiday vs Non-Holiday



```
# Calculate average counts per hour
avg_counts <- day %>%
  group_by(season) %>%
  summarise(avg_count = mean(cnt, na.rm = TRUE))

# Create the line plot
ggplot(avg_counts, aes(x = season, y = avg_count)) +
  geom_point() +
  geom_line() +
  labs(x = "Season", y = "Average Count per day in the Season", title = "Average Count of Everyd
ay Bike Usage per season") +
  theme_minimal()
```

Average Count of Everyday Bike Usage per season



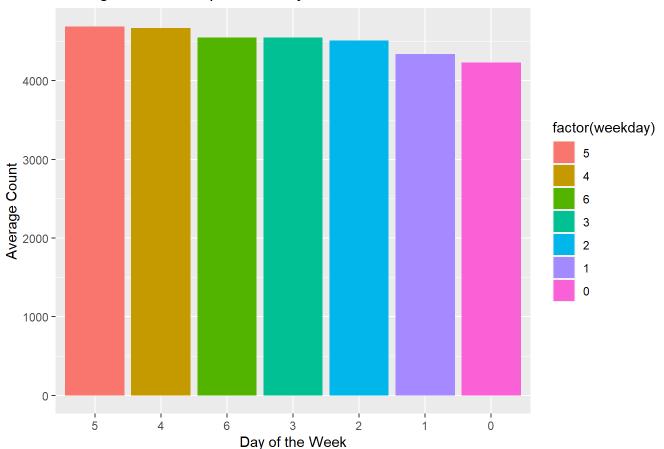
Bar plot of average ridership for per day of the week

```
avg_counts <- day %>%
  group_by(weekday) %>%
  summarise(avg_count = mean(cnt, na.rm = TRUE))

# Reorder the Levels of 'weekday' based on average count (descending order)
avg_counts <- avg_counts %>%
  mutate(weekday = reorder(factor(weekday), -avg_count))

# Create the bar chart
ggplot(avg_counts, aes(x = weekday, y = avg_count, fill = factor(weekday))) +
  geom_bar(stat = 'identity') +
  labs(x = "Day of the Week", y = "Average Count", title = "Average Count Comparison: Day of the
Week")
```

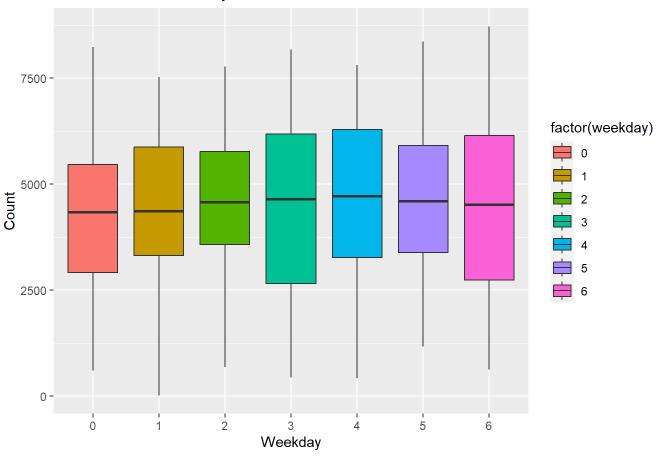
Average Count Comparison: Day of the Week



Box plot of Ridership for per day of the week

```
ggplot(day, aes(x = factor(weekday), y = cnt, fill = factor(weekday))) +
  geom_boxplot() +
  labs(x = "Weekday", y = "Count", title = "Count Distribution: Day of the Week")
```

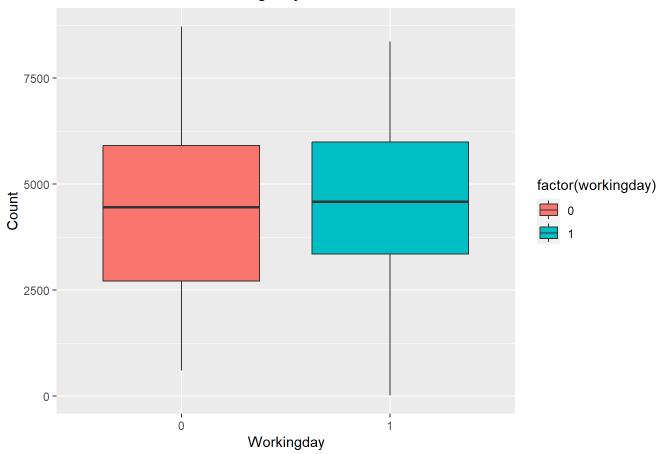
Count Distribution: Day of the Week



Box plot of Ridership for per Workingday

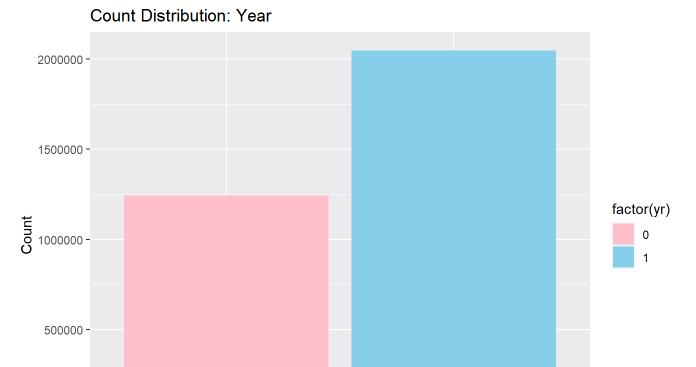
```
ggplot(day, aes(x = factor(workingday), y = cnt, fill = factor(workingday))) +
  geom_boxplot() +
  labs(x = "Workingday", y = "Count", title = "Count Distribution: Working Day?")
```

Count Distribution: Working Day?



Total number of riders during 2011 and 2012

```
ggplot(day, aes(x = factor(yr), y = cnt, fill = factor(yr))) +
  geom_bar(stat = 'identity') +
  labs(x = "Year", y = "Count", title = "Count Distribution: Year") +
  scale_fill_manual(values = c("pink", "skyblue")) # Specify colors for boxes
```



Registered Riders vs Total count

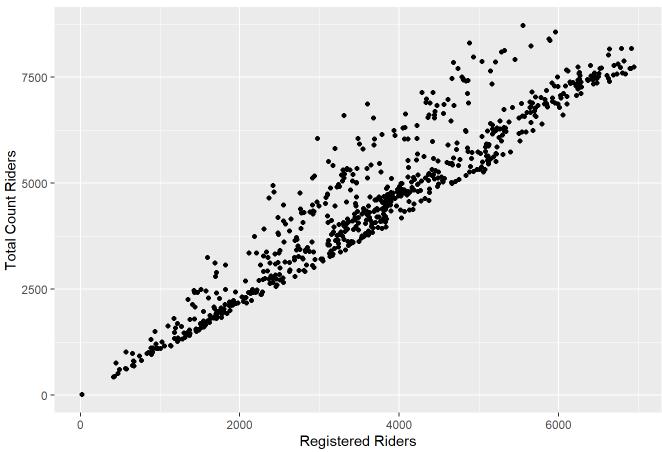
0

0 -

 $ggplot(day, aes(x = registered, y = cnt)) + geom_point() + labs(x = 'Registered Riders', y = 'Total Count Riders', title = 'Registered Riders vs Total Count')$

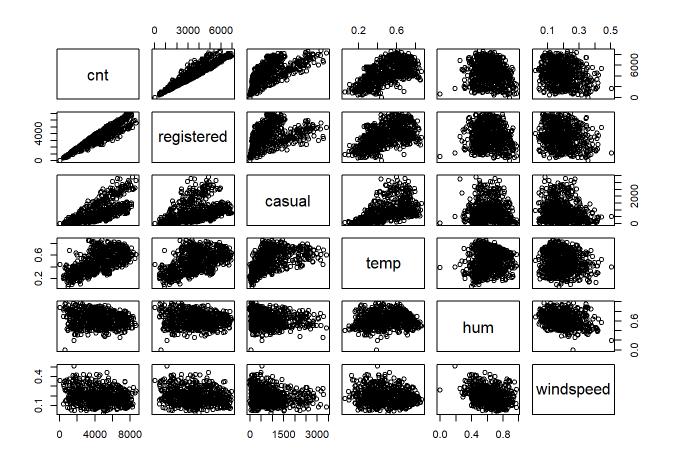
Year

Registered Riders vs Total Count



Pairs plot of all numerical variables

```
day_data_2 = day[, c('cnt','registered', 'casual', 'temp', 'hum', 'windspeed')]
pairs(day_data_2)
```

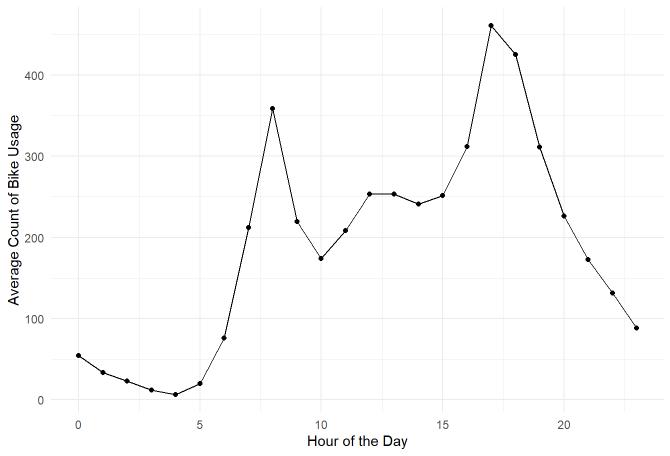


Average bike usage per hour of the day

```
# Calculate average counts per hour
avg_counts <- hour %>%
  group_by(hr) %>%
  summarise(avg_count = mean(cnt, na.rm = TRUE))

# Create the line plot
ggplot(avg_counts, aes(x = hr, y = avg_count)) +
  geom_point() +
  geom_line() +
  labs(x = "Hour of the Day", y = "Average Count of Bike Usage", title = "Average Count of Bike
Usage per Hour") +
  theme_minimal()
```

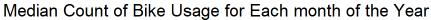
Average Count of Bike Usage per Hour

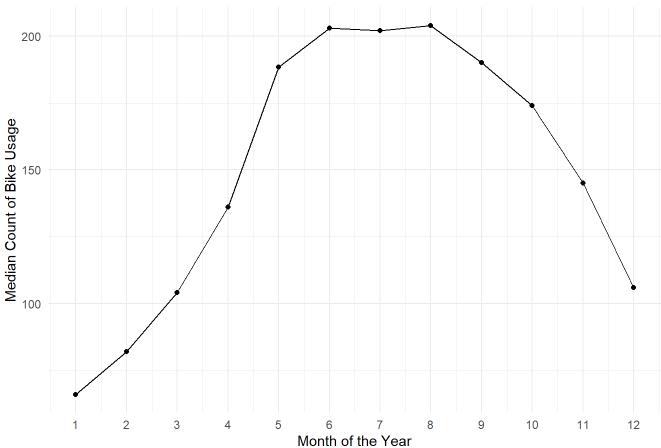


Median bike usage per month of the Year

```
# Calculate average counts per hour
median_count <- hour %>%
  group_by(mnth) %>%
  summarise(avg_count = median(cnt, na.rm = TRUE))

# Create the line plot
ggplot(median_count, aes(x = mnth, y = avg_count)) +
  geom_point() +
  geom_line() +
  scale_x_continuous(breaks = 1:12, labels = 1:12) +
  labs(x = "Month of the Year", y = "Median Count of Bike Usage", title = "Median Count of Bike
Usage for Each month of the Year") +
  theme_minimal()
```





ONE HOT ENCODING

```
# Create binary columns for each season
data <- hour
# Create binary columns for each season
data <- data %>%
 mutate(
    Season1 = ifelse(season == 1, 1, 0),
    Season2 = ifelse(season == 2, 1, 0),
   Season3 = ifelse(season == 3, 1, 0),
    Season4 = ifelse(season == 4, 1, 0)
 )
# Create binary columns for each season
data <- data %>%
  mutate(
   Weather1 = ifelse(weathersit == 1, 1, 0),
   Weather2 = ifelse(weathersit == 2, 1, 0),
   Weather3 = ifelse(weathersit == 3, 1, 0),
   Weather4 = ifelse(weathersit == 4, 1, 0)
 )
data <- data %>%
 mutate(
   Weekday0 = ifelse(weekday == 0, 1, 0),
   Weekday1 = ifelse(weekday == 1, 1, 0),
    Weekday2 = ifelse(weekday == 2, 1, 0),
    Weekday3 = ifelse(weekday == 3, 1, 0),
   Weekday4 = ifelse(weekday == 4, 1, 0),
    Weekday5 = ifelse(weekday == 5, 1, 0),
    Weekday6 = ifelse(weekday == 6, 1, 0)
data <- data %>%
 mutate(
    hr0 = ifelse(hr == 0, 1, 0),
    hr1 = ifelse(hr == 1, 1, 0),
    hr2 = ifelse(hr == 2, 1, 0),
    hr3 = ifelse(hr == 3, 1, 0),
    hr4 = ifelse(hr == 4, 1, 0),
    hr5 = ifelse(hr == 5, 1, 0),
    hr6 = ifelse(hr == 6, 1, 0),
    hr7 = ifelse(hr == 7, 1, 0),
    hr8 = ifelse(hr == 8, 1, 0),
    hr9 = ifelse(hr == 9, 1, 0),
    hr10 = ifelse(hr == 10, 1, 0),
    hr11= ifelse(hr == 11, 1, 0),
    hr12 = ifelse(hr == 12, 1, 0),
    hr13 = ifelse(hr == 13, 1, 0),
    hr14 = ifelse(hr == 14, 1, 0),
    hr15 = ifelse(hr == 15, 1, 0),
```

```
hr16 = ifelse(hr == 16, 1, 0),
   hr17 = ifelse(hr == 17, 1, 0),
    hr18 = ifelse(hr == 18, 1, 0),
    hr19 = ifelse(hr == 19, 1, 0),
    hr20 = ifelse(hr == 20, 1, 0),
    hr21 = ifelse(hr == 21, 1, 0),
   hr22 = ifelse(hr == 22, 1, 0),
   hr23 = ifelse(hr == 23, 1, 0)
 )
data <- data %>%
 mutate(
   month1 = ifelse(mnth == 1, 1, 0),
   month2 = ifelse(mnth == 2, 1, 0),
   month3 = ifelse(mnth == 3, 1, 0),
    month4 = ifelse(mnth == 4, 1, 0),
    month5 = ifelse(mnth == 5, 1, 0),
   month6 = ifelse(mnth == 6, 1, 0),
    month7 = ifelse(mnth == 7, 1, 0),
    month8 = ifelse(mnth == 8, 1, 0),
   month9 = ifelse(mnth == 9, 1, 0),
   month10 = ifelse(mnth == 10, 1, 0),
    month11 = ifelse(mnth == 11, 1, 0),
   month12 = ifelse(mnth == 12, 1, 0)
 )
```

##OHE for DAY

```
# Create binary columns for each season
data1<- day
# Create binary columns for each season
data1 <- data1 %>%
 mutate(
    Season1 = ifelse(season == 1, 1, 0),
    Season2 = ifelse(season == 2, 1, 0),
    Season3 = ifelse(season == 3, 1, 0),
    Season4 = ifelse(season == 4, 1, 0)
  )
# Create binary columns for each season
data1 <- data1 %>%
 mutate(
   Weather1 = ifelse(weathersit == 1, 1, 0),
    Weather2 = ifelse(weathersit == 2, 1, 0),
   Weather3 = ifelse(weathersit == 3, 1, 0),
   Weather4 = ifelse(weathersit == 4, 1, 0)
  )
data1 <- data1 %>%
 mutate(
    Weekday0 = ifelse(weekday == 0, 1, 0),
    Weekday1 = ifelse(weekday == 1, 1, 0),
    Weekday2 = ifelse(weekday == 2, 1, 0),
    Weekday3 = ifelse(weekday == 3, 1, 0),
    Weekday4 = ifelse(weekday == 4, 1, 0),
    Weekday5 = ifelse(weekday == 5, 1, 0),
    Weekday6 = ifelse(weekday == 6, 1, 0)
  )
data1 <- data1 %>%
 mutate(
    month1 = ifelse(mnth == 1, 1, 0),
    month2 = ifelse(mnth == 2, 1, 0),
    month3 = ifelse(mnth == 3, 1, 0),
    month4 = ifelse(mnth == 4, 1, 0),
    month5 = ifelse(mnth == 5, 1, 0),
    month6 = ifelse(mnth == 6, 1, 0),
    month7 = ifelse(mnth == 7, 1, 0),
    month8 = ifelse(mnth == 8, 1, 0),
    month9 = ifelse(mnth == 9, 1, 0),
    month10 = ifelse(mnth == 10, 1, 0),
    month11 = ifelse(mnth == 11, 1, 0),
    month12 = ifelse(mnth == 12, 1, 0)
  )
```

-Testing the best subset for our model on all categorical variables

```
names(data)
```

```
##
    [1] "instant"
                      "dteday"
                                    "season"
                                                                "mnth"
  [6] "hr"
##
                      "holiday"
                                    "weekday"
                                                  "workingday" "weathersit"
                                    "hum"
## [11] "temp"
                      "atemp"
                                                  "windspeed"
                                                               "casual"
                      "cnt"
                                    "Season1"
                                                  "Season2"
                                                               "Season3"
## [16] "registered"
## [21] "Season4"
                      "Weather1"
                                    "Weather2"
                                                  "Weather3"
                                                               "Weather4"
## [26] "Weekday0"
                                                  "Weekday3"
                      "Weekday1"
                                    "Weekday2"
                                                               "Weekday4"
## [31] "Weekday5"
                      "Weekday6"
                                    "hr0"
                                                  "hr1"
                                                               "hr2"
## [36] "hr3"
                      "hr4"
                                    "hr5"
                                                  "hr6"
                                                               "hr7"
## [41] "hr8"
                      "hr9"
                                    "hr10"
                                                  "hr11"
                                                               "hr12"
## [46] "hr13"
                      "hr14"
                                    "hr15"
                                                  "hr16"
                                                               "hr17"
## [51] "hr18"
                      "hr19"
                                    "hr20"
                                                  "hr21"
                                                               "hr22"
## [56] "hr23"
                      "month1"
                                    "month2"
                                                  "month3"
                                                                "month4"
                      "month6"
                                    "month7"
                                                  "month8"
                                                               "month9"
## [61] "month5"
## [66] "month10"
                      "month11"
                                    "month12"
```

library(leaps)

```
## Warning: package 'leaps' was built under R version 4.3.2
```

```
data$hrssn= data$season * data$workingday
data$weathersitwork= data$hr8 * data$weathersit
```

bhour <- regsubsets(cnt~registered+Season1+Season2+Season3+Season4+Weekday0+Weekday1+Weekday2+Weekday3+Weekday4+Weekday5+Weekday6+Weather1+Weather2+Weather3+Weather4

+hr1+hr2+hr3+hr4+hr5+hr6+hr7+hr8+hr9+hr10+hr11+hr12+hr13+hr14+hr15+hr16+hr17
+hr18+hr19+hr20+hr21+hr22+hr23+month1+month2

+month3+month4+month5+month6+month7+month8+month9+month10+month11+month12+ho liday+workingday+yr+temp+windspeed+atemp+hum+weathersitwork+hrssn, data,really.big=T)

```
## Warning in leaps.setup(x, y, wt = wt, nbest = nbest, nvmax = nvmax, force.in =
## force.in, : 5 linear dependencies found
```

Reordering variables and trying again:

summary(bhour)

```
## Subset selection object
## Call: regsubsets.formula(cnt ~ registered + Season1 + Season2 + Season3 +
##
       Season4 + Weekday0 + Weekday1 + Weekday2 + Weekday3 + Weekday4 +
       Weekday5 + Weekday6 + Weather1 + Weather2 + Weather3 + Weather4 +
##
##
       hr1 + hr2 + hr3 + hr4 + hr5 + hr6 + hr7 + hr8 + hr9 + hr10 +
##
       hr11 + hr12 + hr13 + hr14 + hr15 + hr16 + hr17 + hr18 + hr19 +
       hr20 + hr21 + hr22 + hr23 + month1 + month2 + month3 + month4 +
##
       month5 + month6 + month7 + month8 + month9 + month10 + month11 +
##
##
       month12 + holiday + workingday + yr + temp + windspeed +
##
       atemp + hum + weathersitwork + hrssn, data, really.big = T)
## 60 Variables (and intercept)
##
                  Forced in Forced out
## registered
                       FALSE
                                  FALSE
## Season1
                       FALSE
                                  FALSE
## Season2
                       FALSE
                                  FALSE
## Season3
                       FALSE
                                  FALSE
## Weekday0
                       FALSE
                                  FALSE
## Weekday1
                       FALSE
                                  FALSE
## Weekday2
                       FALSE
                                  FALSE
## Weekday3
                       FALSE
                                  FALSE
## Weekday4
                       FALSE
                                  FALSE
## Weekday5
                       FALSE
                                  FALSE
## Weather1
                       FALSE
                                  FALSE
## Weather2
                       FALSE
                                  FALSE
## Weather3
                       FALSE
                                  FALSE
## hr1
                       FALSE
                                  FALSE
## hr2
                       FALSE
                                  FALSE
## hr3
                                  FALSE
                       FALSE
## hr4
                       FALSE
                                  FALSE
## hr5
                       FALSE
                                  FALSE
## hr6
                       FALSE
                                  FALSE
## hr7
                       FALSE
                                  FALSE
## hr8
                       FALSE
                                  FALSE
## hr9
                       FALSE
                                  FALSE
## hr10
                       FALSE
                                  FALSE
## hr11
                       FALSE
                                  FALSE
## hr12
                       FALSE
                                  FALSE
## hr13
                       FALSE
                                  FALSE
## hr14
                       FALSE
                                  FALSE
## hr15
                       FALSE
                                  FALSE
## hr16
                       FALSE
                                  FALSE
## hr17
                       FALSE
                                  FALSE
## hr18
                       FALSE
                                  FALSE
## hr19
                       FALSE
                                  FALSE
## hr20
                       FALSE
                                  FALSE
## hr21
                       FALSE
                                  FALSE
## hr22
                      FALSE
                                  FALSE
## hr23
                       FALSE
                                  FALSE
## month1
                       FALSE
                                  FALSE
## month2
                       FALSE
                                  FALSE
## month3
                       FALSE
                                  FALSE
## month4
                       FALSE
                                  FALSE
```

```
## month5
                      FALSE
                                 FALSE
## month6
                      FALSE
                                 FALSE
## month7
                      FALSE
                                 FALSE
## month8
                      FALSE
                                 FALSE
## month9
                      FALSE
                                 FALSE
## month10
                      FALSE
                                 FALSE
## month11
                      FALSE
                                 FALSE
## holiday
                      FALSE
                                 FALSE
## yr
                      FALSE
                                 FALSE
                      FALSE
                                 FALSE
## temp
                      FALSE
                                 FALSE
## windspeed
## atemp
                      FALSE
                                 FALSE
## hum
                      FALSE
                                 FALSE
                      FALSE
## weathersitwork
                                 FALSE
## hrssn
                      FALSE
                                 FALSE
## Season4
                      FALSE
                                 FALSE
## Weekday6
                      FALSE
                                 FALSE
## Weather4
                      FALSE
                                 FALSE
## month12
                      FALSE
                                 FALSE
## workingday
                      FALSE
                                 FALSE
## 1 subsets of each size up to 9
## Selection Algorithm: exhaustive
            registered Season1 Season2 Season3 Season4 Weekday0 Weekday1 Weekday2
                               .. ..
                                       .. ..
                                               .. ..
## 1 ( 1 ) "*"
     (1)"*"
## 2
     (1)"*"
## 3
      (1)
            "*"
## 4
     (1)
           "*"
## 5
      (1)
            "*"
## 6
            "*"
## 7
      (1)
     (1)"*"
## 8
                       ......
           "*"
## 9
      (1)
            Weekday3 Weekday4 Weekday5 Weekday6 Weather1 Weather2 Weather3
##
           .......
## 1
     (1)
     (1)
## 2
      (1)""
## 3
      (1)""
                              . .
                                       .. ..
## 5
      (1)
## 6
     (1)""
      (1)""
                                       . .
## 7
     (1)""
## 8
      (1)""
## 9
##
            Weather4 hr1 hr2 hr3 hr4 hr5 hr6 hr7 hr8 hr9 hr10 hr11 hr12 hr13 hr14
     (1)""
## 1
      (1)""
## 2
      (1)
## 3
     (1)""
## 4
      (1)""
## 5
## 6
      (1)
     (1)""
## 7
      (1)""
## 8
      (1)""
## 9
```

```
##
           hr15 hr16 hr17 hr18 hr19 hr20 hr21 hr22 hr23 month1 month2 month3
## 1
     (1)
## 2
       1)
## 3
## 4
       1
## 5
## 6
## 7
## 8
       1
## 9
     (1)
##
           month4 month5 month6 month7 month8 month9 month10 month11 month12
## 1
## 2
     (1)
## 3
     (1)
## 4
     (1)
## 5
     (1)
## 6
     (1)
     (1)
## 7
## 8
     (1)
     (1)""
## 9
##
           holiday workingday yr
                                  temp windspeed atemp hum weathersitwork hrssn
## 1
     (1)
     (1)""
## 2
                   11 * 11
     (1)
## 3
     (1)
## 4
## 5
     (1)
                   11 * 11
     (1)
## 6
## 7
     (1)
     (1)
## 8
     (1)""
## 9
```

```
summary(bhour)$adjr2
```

```
## [1] 0.9450739 0.9553170 0.9624928 0.9655591 0.9668426 0.9676995 0.9685001
## [8] 0.9693260 0.9700993
```

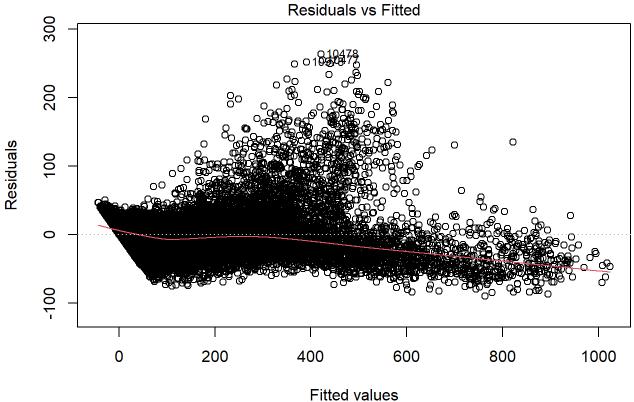
```
which.max(summary(bhour)$adjr2)
```

```
## [1] 9
```

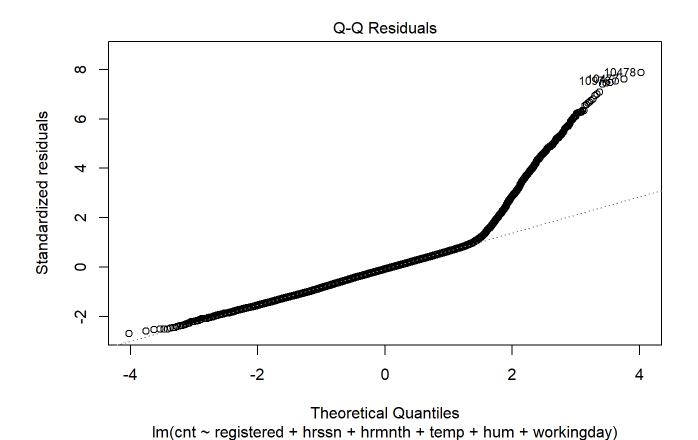
```
day1 = subset(day, yr == 1)
hour$hrssn= hour$season * hour$workingday
hour$hrmnth= hour$workingday * hour$weathersit
big_model = lm(cnt ~registered+ hrssn +hrmnth+temp +hum+workingday, data = hour)
summary(big_model)
```

```
##
## Call:
## lm(formula = cnt ~ registered + hrssn + hrmnth + temp + hum +
##
      workingday, data = hour)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                     Max
## -90.165 -19.584 -2.762 13.401 263.433
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 34.266900
                          1.265089 27.087
                                             <2e-16 ***
## registered 1.127499
                           0.001874 601.627
                                            <2e-16 ***
## hrssn
                           0.294990 -9.466
                                            <2e-16 ***
               -2.792263
## hrmnth
                           0.504587 12.118 <2e-16 ***
               6.114442
## temp
               90.075603 1.436433 62.708 <2e-16 ***
                                            <2e-16 ***
              -57.785052 1.475828 -39.154
## hum
## workingday -40.957645 1.179222 -34.733 <2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.01 '* 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 33.43 on 17372 degrees of freedom
## Multiple R-squared: 0.966, Adjusted R-squared: 0.966
## F-statistic: 8.237e+04 on 6 and 17372 DF, p-value: < 2.2e-16
```

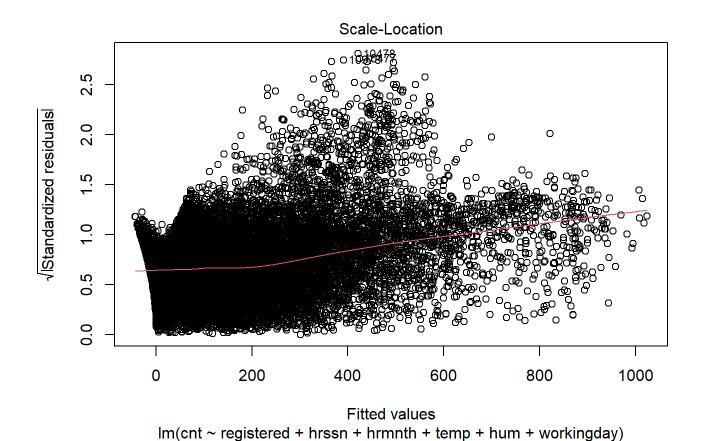
```
plot(big_model)
```

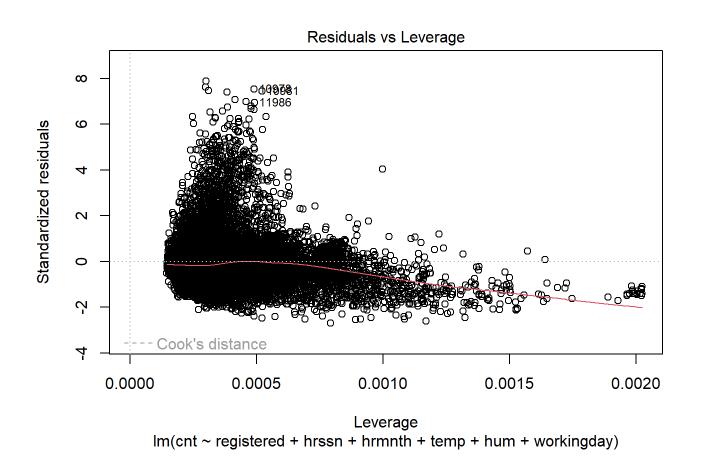


Im(cnt ~ registered + hrssn + hrmnth + temp + hum + workingday)



file:///C:/Users/Marti/OneDrive/Documents/Examining-Trends-in-Bike-Data.html





```
library(caret)
```

```
## Warning: package 'caret' was built under R version 4.3.2
```

```
## Loading required package: lattice
```

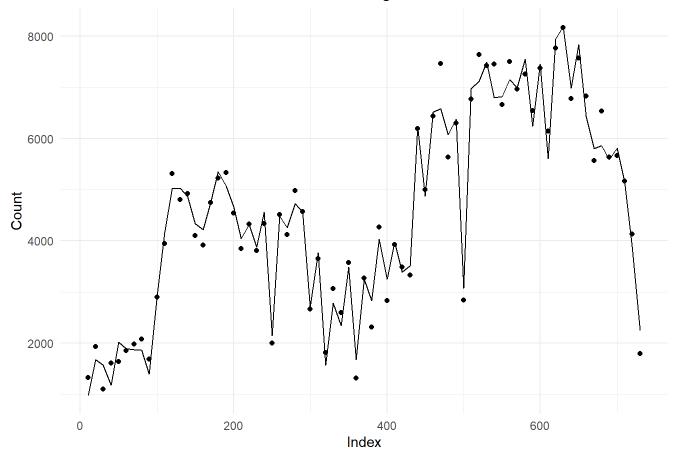
```
day_model = lm(cnt ~registered+ mnth +weathersit+temp +hum+workingday+season, data = day)
predicted_values <- predict(day_model, newdata = day)
RMSE(predicted_values, day$cnt)</pre>
```

[1] 353.8768

```
comparison_data <- data.frame(
    Instant = day$instant,
    Observed = day$cnt,
    Predicted = predicted_values
)
filtered_data <- comparison_data %>% filter(row_number() %% 10 == 0)

ggplot(filtered_data, aes(x = Instant, y = Observed)) +
    geom_point() +
    geom_line(aes(x = Instant, y = Predicted)) +
    labs(x = "Index", y = "Count", title = "Observed vs. Predicted Count of Bike Usage") +
    theme_minimal()
```

Observed vs. Predicted Count of Bike Usage



subset(comparison_data, Predicted < 0)</pre>

```
##
       Instant Observed
                          Predicted
## 26
            26
                     506
                          -98.19399
            27
## 27
                     431
                         -26.45746
## 668
           668
                      22 -195.19768
## 726
           726
                    441
                         -84.37476
```

comparison_data

##	Instant	Observed	Predicted
## 1	1	985	1275.97945
## 2	2	801	1338.83443
## 3	3	1349	975.89997
## 4	4	1562	1208.90400
## 5	5	1600	1345.24015
## 6	6	1606	1303.62844
## 7	7	1510	1056.12777
## 8	8	959	1419.10817
## 9	9	822	1330.92227
## 10	10	1321	
## 11	11	1263	821.06660
## 12	12	1162	
## 13	13	1406	
## 14	14	1421	
## 15	15	1248	
## 16	16	1204	1635.28229
## 17	17	1000	
## 18	18	683	198.04751
## 19	19	1650	1350.43777
## 20	20	1927	
## 20	21	1543	
## 22	22	981	1393.59915
## 23	23	986	1365.03863
## 24	24	1416	976.28240
## 25	25	1985	
## 26	26	506	
## 27	27	431	
## 28	28	1167	
## 29	29	1098	1587.26964
## 30	30	1096	1571.30360
## 31	31	1501	
## 32	32	1360	
## 33	33	1526	
## 34	34		1232.36897
## 35	35		1317.55712
## 36	36		1387.37254
## 37	37	1623	2006.69069
## 38	38	1712	
## 39	39	1530	
## 40	40		1176.20993
## 41	41	1538	1189.35378
## 42	42		1345.69737
## 43	43		1845.33981
## 44	44	1589	
## 45	45	1913	
## 46	46	1815	
## 47	47		1850.74822
## 48	48		2330.17335
## 49	49	2927	2572.95888
## 50	50	1635	2016.06986
## 51	51	1812	1928.75656

##	52	52	1107	
##	53	53	1450	1065.56346
##	54	54	1917	1609.29046
##	55	55	1807	1484.70391
##	56	56	1461	1128.43716
##	57	57	1969	2331.18784
##	58	58	2402	2555.50470
##	59	59	1446	1166.82647
##	60	60	1851	1886.95047
##	61	61	2134	2198.36846
##	62	62	1685	1683.65745
##	63	63	1944	1822.37559
##	64	64	2077	2526.46991
	65	65	605	1382.10367
##	66	66	1872	1778.00680
##	67	67	2133	2059.05593
	68	68	1891	1788.34688
			_	
##	69	69 70	623	684.91614
##	70	70	1977	1872.44649
	71	71	2132	2537.56860
	72	72		2642.32913
##	73	73	2046	1926.12619
##	74	74	2056	1915.16313
##	75	75	2192	2061.29350
##	76	76	2744	2736.42575
##	77	77	3239	2927.22270
##	78	78	3117	3068.77800
##	79	79	2471	2585.77107
##	80	80	2077	1860.81896
##	81	81	2703	2619.20782
##	82	82	2121	2031.70228
##	83	83	1865	1717.78530
##	84	84	2210	2069.91230
##	85	85	2496	2586.51386
##	86	86	1693	2147.28485
##	87	87	2028	1990.46604
	88	88		2380.36091
##	89	89	1536	
	90	90		1389.32834
	91	91		2121.43277
	92	92		2438.35179
##		93		2889.16665
		94		3067.53611
	94			
	95	95	1795	
##		96 07	2808	
	97	97		3104.81434
	98	98	1471	
##		99		2678.11536
##	100	100		2924.77488
##	101	101		3097.57941
##	102	102	2034	2159.41311
##	103	103	2162	2251.23300

,			
## 104	104	3267	3345.95839
## 105	105	3126	3952.94572
## 106	106	795	1657.62271
## 107	107	3744	3657.73618
## 108	108	3429	3419.12551
## 109	109	3204	3364.59119
## 110	110	3944	4156.81828
## 111	111	4189	4188.17164
## 112	112	1683	1668.95066
## 113	113	4036	3963.71658
## 114	114	4191	4001.72319
## 115	115	4073	4098.16974
## 116	116	4400	4626.62996
## 117	117	3872	4067.21685
## 118	118	4058	4284.55978
## 119	119	4595	4549.62709
## 120	120	5312	5021.92276
## 121	121	3351	3566.26524
## 122	122	4401	4285.99362
## 123	123	4451	4707.53367
## 124	124	2633	2770.61633
## 125	125	4433	4621.88195
## 126	126	4608	4489.50707
## 127	127	4714	4783.88850
## 128	128	4333	4575.28398
## 129	129	4362	4528.01295
## 130	130	4803	5028.21066
## 131	131	4182	
## 132	132	4864	5045.16079
## 133	133	4105	4053.94399
## 134	134	3409	3947.96533
## 135	135	4553	4544.82813
## 136	136	3958	3935.55061
## 137	137	4123	4149.12291
## 138	138		3983.00135
## 139	139		4578.15904
## 140	140		4865.40370
## 141	141		5371.84782
## 142	142		4807.83194
## 143	143		4221.62670
## 144	144		4726.85375
## 145	145		5270.75809
## 146	146		4953.85489
## 147	147		4801.22981
## 148	148		4486.32151
## 149	149		4102.15142
## 150	150		4336.27190
## 151	151		4323.16778
## 151	152		4278.10978
## 152	153		5265.53311
## 153	153 154		5365.64721
			5216.76983
## 155	155	5342	JZ10./0983

,		
## 156	156	4906 4833.54994
## 157	157	4548 4747.07145
## 158	158	4833 5005.77347
## 159	159	4401 4671.56212
## 160	160	3915 4221.64713
## 161	161	4586 4706.60693
## 162	162	4966 4995.14447
## 163	163	4460 4656.16700
## 164	164	5020 5052.04604
## 165	165	4891 5024.62886
## 166	166	5180 5343.96958
## 167	167	3767 3852.42967
## 168	168	4844 4810.20579
## 169	169	5119 5048.88682
## 170	170	4744 4749.58520
## 171	171	4010 3950.74581
## 172	172	4835 4816.77609
## 173	173	4507 4697.50542
## 174	174	4790 4862.06800
## 175	175	4991 4921.62836
## 176	176	5202 5161.88932
## 177	177	5305 5098.66501
## 178	178	4708 4601.55255
## 179	179	4648 4806.38528
## 180	180	5225 5355.83386
## 181	181	5515 5465.08827
## 182	182	5362 5043.05315
## 183	183	5119 4603.76788
## 184	184	4649 3829.45401
## 185	185	6043 4561.45072
## 186	186	4665 4465.56160
## 187	187	4629 4649.99504
## 188	188	4592 4693.65473
## 189	189	4040 3994.71606
## 190	190	5336 5067.39677
## 191	191	4881 4844.51905
## 192	192	4086 4156.99003
## 193	193	4258 4478.67769
## 194	194	4342 4410.08741
## 195	195	5084 5074.58816
## 196	196	5538 5059.12830
## 197	197	5923 5205.71856
## 198	198	5302 4992.79307
## 199	199	4458 4432.66404
## 200	200	4541 4665.19329
## 200	201	4332 4526.45616
## 202	201	3784 3893.61317
## 202	202	3387 3633.75146
## 204	204	3285 3991.30818
## 204	205	3606 4260.46271
## 205	205	3840 4004.44701
## 207	207	4590 4742.85842

,		
## 208	208	4656 4847.15730
## 209	209	4390 4676.47529
## 210	210	3846 4040.11880
## 211	211	4475 4670.56442
## 212	212	4302 4508.36008
## 213	213	4266 4398.61042
## 214	214	4845 5014.46611
## 215	215	3574 3770.45229
## 216	216	4576 4506.28383
## 217	217	4866 4672.96630
## 218	218	4294 4297.64552
## 219	219	3785 4054.13618
## 220	220	4326 4316.22370
## 221	221	4602 4581.99868
## 222	222	4780 4838.73266
## 223	223	4792 4884.23946
## 224	224	4905 4729.57353
## 225	225	4150 4122.29656
## 226	226	3820 3902.55833
## 227	227	4338 4281.32457
## 228	228	4725 4861.14738
## 229	229	4694 4911.39639
## 230	230	3805 3880.12608
## 231	231	4153 3996.65746
## 232	232	5191 4943.34695
## 233	233	3873 4176.27624
## 234	234	4758 4782.66741
## 235	235	5895 5534.19243
## 236	236	5130 5032.26294
## 237	237	3542 3695.22261
## 238	238	4661 4691.58419
## 239	239	1115 2043.47829
## 240	240	4334 4560.71252
## 241	241	4634 4682.51045
## 242	242	5204 5296.91390
## 243	243	5058 5236.17536
## 244	244	5115 5244.86656
## 245	245	4727 4592.71573
## 246	246	4484 4119.57168
## 247	247	4940 4005.32386
## 248	248	3351 3540.93867
## 249	249	2710 2818.54431
## 250	250	1996 2143.61702
## 251	251	1842 1955.67051
## 252	252	3544 3718.52115
## 252	253	5345 5320.26795
## 254	254	5046 5109.76210
## 255	255	4713 4862.15208
## 256	256	4763 4910.12236
## 250	257	4785 5025.96531
## 257	257 258	3659 3802.98295
## 259	259	4760 4629.77061

,, ,, ,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,		
## 260	260	4511 4483.33054
## 261	261	4274 4385.16449
## 262	262	4539 4495.61928
## 263	263	3641 3716.43999
## 264	264	4352 4458.52142
## 265	265	4795 4991.01926
## 266	266	2395 2454.40325
## 267	267	5423 5187.61349
## 268	268	5010 5009.86518
## 269	269	4630 4631.03796
## 270	270	4120 4256.76953
## 271	271	3907 4011.27267
## 272	272	4839 4969.70438
## 273	273	5202 5141.50557
## 274	274	2429 3061.91165
## 275	275	2918 3408.07425
## 276	276	3570 3583.44246
## 277	277	4456 4613.02750
## 278	278	4826 5030.12088
## 279	279	4765 4824.60522
## 280	280	4985 4723.90652
## 281	281	5409 4680.90814
## 282	282	5511 4625.80418
## 283	283	5117 5226.07267
## 284	284	4563 4531.90237
## 285	285	2416 2447.59948
## 286	286	2913 3054.09176
## 287	287	3644 3625.16442
## 288	288	5217 4879.56162
## 289	289	5041 4855.05423
## 290	290	4570 4562.79077
## 291	291	4748 4768.96396
## 292	292	2424 2414.49332
## 293	293	4195 4333.45718
## 294	294	4304 4183.45077
## 295	295	4308 4165.49439
## 296	296	4381 4085.73046
## 297	297	4187 4015.97860
## 298	298	4687 4644.06981
## 299	299	3894 3990.00069
## 300	300	2659 2707.40539
## 301	301	3747 3623.64512
## 302	302	627 1200.01278
## 303	303	3331 3633.61737
## 304	304	3669 3688.41274
## 305	305	4068 3996.35838
## 306	306	4186 4147.99140
## 307	307	3974 3998.08039
## 308	308	4046 3855.04286
## 309	309	3926 3871.53367
## 310	310	3649 3763.23302
## 311	311	4035 3978.65320

,		
## 312	312	4205 4195.38736
## 313	313	4109 4149.48659
## 314	314	2933 2818.74511
## 315	315	3368 4068.61310
## 316	316	4067 3921.88812
## 317	317	3717 3939.97855
## 318	318	4486 4426.32618
## 319	319	4195 4173.88870
## 320	320	1817 1566.16709
## 321	321	3053 3028.18299
## 322	322	3392 3324.95875
## 323	323	3663 3819.63363
## 324	324	3520 3876.92144
## 325	325	2765 2577.62832
## 326	326	1607 1360.42228
## 327	327	2566 2558.89907
## 328	328	1495 1777.30379
## 329	329	2792 1693.10936
## 330	330	3068 2781.19361
## 331	331	3071 3381.34686
## 332	332	3867 4041.80226
## 333	333	2914 2985.87831
## 334	334	3613 3659.23247
## 335	335	3727 3649.33739
## 336	336	3940 3777.25881
## 337	337	3614 3827.32565
## 338	338	3485 3759.62802
## 339	339	3811 3639.21892
## 340	340	2594 2339.95535
## 341	341	705 167.57427
## 342	342	3322 3153.14576
## 343	343	3620 3372.70280
## 344	344	3190 3567.97409
## 345	345	2743 3138.88872
## 346	346	3310 3098.44271
## 347	347	3523 3397.08160
## 348	348	3740 3582.86880
## 349	349	3709 3661.60399
## 350	350	3577 3489.47203
## 351	351	2739 3216.14229
## 352	352	2431 2956.27742
## 353	353	3403 3118.54068
## 354	354	3750 3637.83246
## 355	355	2660 2637.71344
## 356	356	3068 2989.56912
## 357	357	2209 2087.16057
## 358	358	1011 1609.61488
## 359	359	754 1078.40615
## 360	360	1317 1673.89338
## 361	361	1162 807.83074
## 362	362	2302 2048.44419
## 363	363	2423 2121.26535
"" 505	505	Z-Z-5 Z1Z1,ZUJJJ

,		
## 364	364	2999 2570.24269
## 365	365	2485 2831.40329
## 366	366	2294 2500.85678
## 367	367	1951 2579.77051
## 368	368	2236 1994.95197
## 369	369	2368 2040.49688
## 370	370	3272 3248.02600
## 371	371	4098 4084.69094
## 372	372	4521 4707.21588
## 373	373	3425 3933.98172
## 374	374	2376 2099.61989
## 375	375	3598 3608.70463
## 376	376	2177 1906.04762
## 377	377	4097 4061.54067
## 378	378	3214 3153.33307
## 379	379	2493 2991.83325
## 380	380	2311 2830.93854
## 381	381	2298 2896.48083
## 382	382	2935 2881.97868
## 383	383	3376 3462.67392
## 384	384	3292 3207.84348
		3163 3052.95251
## 385 ## 386	385 386	
	387	
## 388	388	2432 2068.08695
## 389	389	4339 4157.31630
## 390	390	4270 4034.12849
## 391	391	4075 4028.66604
## 392	392	3456 3373.45538
## 393	393	4023 4385.58940
## 394	394	3243 3744.17841 3624 3704.47253
## 395	395	
## 396	396	4509 4630.18735
## 397	397	4579 4763.56119
## 398	398	3761 3771.67972
## 399	399	4151 4087.78877
## 400	400	2832 3249.84823
## 401	401	2947 3482.19820
## 402	402	3784 3728.10495
## 403	403	4375 4528.11353
## 404	404	2802 2586.19753
## 405	405	3830 3825.93507
## 406	406	3831 3712.53951
## 407	407	2169 2607.29532
## 408	408	1529 2078.00686
## 409	409	3422 3418.18961
## 410	410	3922 3973.31727
## 411	411	4169 4341.95728
## 412	412	3005 2920.96343
## 413	413	4154 4054.61594
## 414	414	4318 3958.93027
## 415	415	2689 2884.35070

,			
## 416	416	3129	3595.38889
## 417	417	3777	3781.59348
## 418	418	4773	4793.58830
## 419	419	5062	5053.19974
## 420	420	3487	3382.25689
## 421	421	2732	3384.09610
## 422	422	3389	3903.28133
## 423	423	4322	4417.96854
## 424	424	4363	4506.13652
## 425	425	1834	1585.73874
## 426	426	4990	5540.89293
## 427	427	3194	3328.89584
## 428	428	4066	4543.43568
## 429	429	3423	4095.33703
## 430	430	3333	3517.71201
## 431	431	3956	4249.12782
## 432	432	4916	5264.93647
## 433	433	5382	5864.72649
## 434	434	4569	4811.58649
## 435	435	4118	4574.89734
## 436	436	4911	4746.80936
## 437	437	5298	5308.83199
## 438	438	5847	6114.11441
## 439	439	6312	6413.80075
## 440	440		6233.09505
## 441	441		4404.46752
## 442	442	7836	6451.11783
## 443	443	5892	
## 444	444	6153	6169.01771
## 445	445	6093	6018.59258
## 446	446	6230	
## 447	447	6871	6531.77510
## 448	448		6964.98478
## 449	449	3372	
## 450	450		4873.50806
## 451	451		5590.69478
## 452	452		5276.85525
## 453	453	5698	5934.88817
## 454	454	6133	
## 455	455		5309.53870
## 456	456		5437.45292
## 457	457		5277.49836
## 458	458	5936	
## 459	459		6504.85517
## 460	460	6436	6515.55601
## 461	461	6457	6290.71414
## 461	462		5543.41584
## 462	463		5338.76989
## 464	464	5169	
## 465 ## 466	465 466	5585 5019	
## 466	466 467	5918	
## 467	467	4862	5147.23346

,		
## 468	468	5409 5626.33456
## 469	469	6398 6152.73813
## 470	470	7460 6581.30564
## 471	471	7132 6257.82605
## 472	472	6370 7339.64956
## 473	473	6691 6981.10823
## 474	474	4367 4767.04315
## 475	475	6565 6835.80113
## 476	476	7290 7117.43281
## 477	477	6624 5944.58532
## 478	478	1027 1903.99318
## 479	479	3214 3407.42081
## 480	480	5633 6075.65712
## 481	481	6196 6645.08229
## 482	482	5026 5382.55281
## 483	483	6233 6255.38422
## 484	484	4220 4573.31582
## 485	485	6304 5836.81278
## 486	486	5572 5800.99325
## 487	487	5740 6155.32482
## 488	488	6169 6618.36381
## 489	489	6421 6739.01696
## 490	490	6296 6378.83733
## 491	491	6883 6281.14861
## 492	492	6359 6031.76628
## 493	493	6273 6280.81610
## 494	494	5728 6002.91302
## 494	494	4717 4943.01720
## 496	496	6572 6660.14835
## 497	497	7030 6922.93573
## 498	498	7429 6830.18729
## 499	499	6118 5858.14781
## 500	500	2843 3072.33024
## 501	501	5115 5429.06081
## 502	502	7424 7801.51892
## 503	503	7384 7454.62789
## 504	504	7639 7394.85070
## 505	505	8294 6963.29703
## 506	506	7129 6434.87299
	507	4359 4524.78727
## 507 ## 508		
	508	6073 6328.76477 5260 5448.68952
## 509	509	
## 510	510	6770 6975.99688
## 511	511	6734 6537.15088
## 512	512 513	6536 5601.13580
## 513	513	6591 5171.59691
## 514	514 515	6043 5407.42247
## 515	515	5743 6067.07565
## 516	516	6855 7390.95660
## 517	517	7338 7664.70763
## 518	518	4127 4298.87070
## 519	519	8120 7299.01060

,		
## 520	520	7641 7124.12220
## 521	521	6998 7075.49075
## 522	522	7001 7049.71393
## 523	523	7055 7120.20413
## 524	524	7494 7679.81862
## 525	525	7736 7508.63786
## 526	526	7498 6835.89887
## 527	527	6598 6346.40347
## 528	528	6664 6797.49835
## 529	529	4972 5330.75752
## 530	530	7421 7491.17145
## 531	531	7363 7410.14753
## 532	532	7665 7301.71319
## 533	533	7702 6677.62690
## 534	534	6978 6155.37541
## 535	535	
## 536	536	6825 7047.13544
## 537	537	6211 6565.23038
## 538	538	5905 6297.06523
## 539	539	5823 5953.40983
## 540	540	7458 6798.64534
## 541	541	6891 6286.00952
## 542	542	6779 6812.38969
## 543	543	7442 7594.43905
## 544	544	7335 7543.76216
## 545	545	6879 7235.94554
## 546	546	5463 5770.04102
## 547	547	5687 6157.03009
## 548	548	5531 6062.46959
## 549	549	6227 6501.20566
## 550	550	6660 6822.61774
## 551	551	7403 6881.24785
## 552	552	6241 5980.45836
## 553	553	6207 5988.69591
## 554	554	4840 5280.71066
## 555	555	4672 5311.05825
## 556	556	6569 6602.05431
## 557	557	6290 6342.38202
## 558	558	7264 7517.06223
## 559	559	7446 7684.11460
## 560	560	7499 7152.53615
## 561	561	6969 6429.11057
## 562	562	6031 5946.11372
## 563	563	6830 6927.13171
## 564	564	6786 7159.01993
## 565	565	5713 6009.23091
## 566	566	6591 6898.40833
## 567	567	5870 5997.58330
		4459 4564.08742
	568 560	
## 569	569	7410 6670.81241
## 570	570 571	6966 6997.11681
## 571	571	7592 7738.70700

,		
## 572	572	8173 8148.12415
## 573	573	6861 7048.43947
## 574	574	6904 6844.54344
## 575	575	6685 6375.34621
## 576	576	6597 6328.51489
## 577	577	7105 7263.61422
## 578	578	7216 7450.49959
## 579	579	7580 7772.08044
## 580	580	7261 7547.67103
## 581	581	7175 7001.86087
## 582	582	6824 6458.81318
## 583	583	5464 5583.57497
## 584	584	7013 6907.08473
## 585	585	7273 7129.08493
## 586	586	7534 7472.33399
## 587	587	7334 7472.33333
	588	
## 589	589	6299 5766.49638
## 590	590	6544 6241.72891
## 591	591	6883 6837.22422
## 592	592	6784 6789.74311
## 593	593	7347 7357.13639
## 594	594	7605 7529.53648
## 595	595	7148 6821.60568
## 596	596	7865 6989.49140
## 597	597	4549 4882.41764
## 598	598	6530 6443.94530
## 599	599	7006 7023.22712
## 600	600	7375 7456.75397
## 601	601	7765 7636.79719
## 602	602	7582 7417.83850
## 603	603	6053 5938.27869
## 604	604	5255 5374.25867
## 605	605	6917 7072.28678
## 606	606	7040 7328.89712
## 607	607	7697 7780.72732
## 608	608	7713 7820.04377
## 609	609	7350 7155.11102
## 610	610	6140 5607.81665
## 611	611	5810 4820.92030
## 612	612	6034 5915.08848
## 613	613	6864 7234.97868
## 614	614	7112 7579.15025
## 615	615	6203 6658.52771
## 616	616	7504 7753.19070
## 617	617	5976 6207.80978
## 618	618	8227 7713.30713
## 619	619	7525 7614.69587
## 620	620	7767 7942.78998
## 621	621	7870 8096.88736
## 621	622	7804 8016.64940
## 623	623	8009 7891.45765
## 023	023	0005 /051.45/05

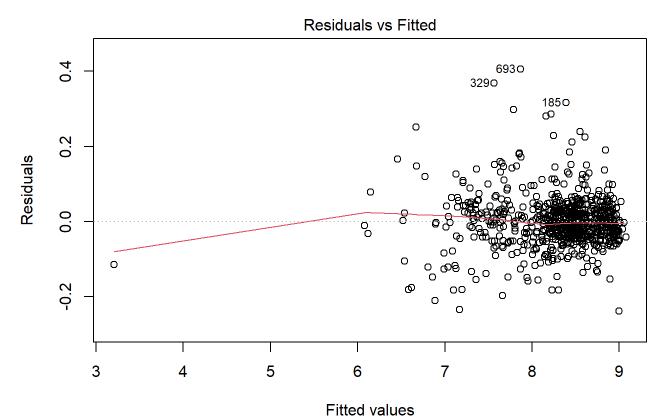
,				
##	624	624	8714	7601.41368
##	625	625	7333	7105.68512
##	626	626	6869	6848.36721
##	627	627	4073	4365.35492
##	628	628	7591	8036.01835
##	629	629	7720	7986.59163
##	630	630	8167	8190.14777
##	631	631	8395	7997.87771
##	632	632	7907	7355.48595
##	633	633	7436	7524.58792
##	634	634	7538	7846.74437
##	635	635	7733	8219.00649
##	636	636	7393	7806.31987
##	637	637	7415	7456.77388
##	638	638	8555	7950.95903
##	639	639	6889	6653.33630
##	640	640	6778	6985.73639
##	641	641	4639	4981.04765
##	642	642	7572	8066.03412
##	643	643	7328	7607.17921
##	644	644	8156	7880.51148
##	645	645	7965	6773.72065
##	646	646	3510	3986.50725
##	647	647	5478	6135.71188
##	648	648	6392	6621.49776
##	649	649	7691	8087.94480
##	650	650	7570	7835.72381
##	651	651	7282	7223.32261
##	652	652	7109	6549.01522
##	653	653	6639	6307.34837
##	654	654	5875	5968.34214
##	655	655	7534	
##	656	656	7461	7512.64353
##	657	657	7509	
##	658	658	5424	5429.77614
##	659	659	8090	7126.41898
##	660	660	6824	6429.03091
##	661	661	7058	7277.35403
##	662	662	7466	7784.45201
##	663	663	7693	
##	664	664	7359	
##	665	665	7444	7266.12697
##	666	666	7852	6994.62296
##	667	667	4459	
##	668	668		-195.19768
##	669	669	1096	
##	670	670	5566	
##	671	671	5986	6088.35019
##	672	672	5847	5812.29311
##	673	673	5138	
##	674	674	5107	
##	675	675	5259	5374.71475

## 676	676		5713.03042
## 677	677	5035	5076.34647
## 678	678	5315	5554.00100
## 679	679	5992	5878.26977
## 680	680	6536	5863.33066
## 681	681	6852	6029.26470
## 682	682	6269	6790.50508
## 683	683	4094	4004.84857
## 684	684	5495	5610.98943
## 685	685	5445	5572.78620
## 686	686	5698	5783.61783
## 687	687	5629	5664.99506
## 688	688	4669	4989.09548
## 689	689	5499	5547.88831
## 690	690	5634	5585.74887
## 691	691	5146	4977.70387
## 692	692	2425	2358.23608
## 693	693	3910	2412.71486
## 694	694	2277	2650.66284
## 695	695	2424	3033.28396
## 696	696	5087	5207.01594
## 697	697	3959	4003.48949
## 698	698		5558.96116
		5260	
## 699	699	5323	5552.44863
## 700	700	5668	5814.11266
## 701	701	5191	5274.69078
## 702	702	4649	4760.90298
## 703	703	6234	6232.17817
## 704	704	6606	6702.31687
## 705	705	5729	5950.55204
## 706	706	5375	5327.97229
## 707	707	5008	4842.67043
## 708	708	5582	5561.20704
## 709	709	3228	3652.41150
## 710	710	5170	5142.69323
## 711	711	5501	5565.71172
## 712	712	5319	5274.10503
## 713	713	5532	5459.43233
## 714	714	5611	5497.87737
## 715	715	5047	5444.11585
## 716	716	3786	4180.66145
## 717	717	4585	4556.06833
## 718	718	5557	5563.03592
## 719	719	5267	5266.96523
## 720	720	4128	3888.84925
## 721	721	3623	3583.20684
## 722	722	1749	2393.73855
## 723	723		2164.24178
## 724	724	920	
## 725	725	1013	
## 726	726	441	-84.37476
## 727	727		1697.09770
1111 / / / /	121	Z114	1007.00770

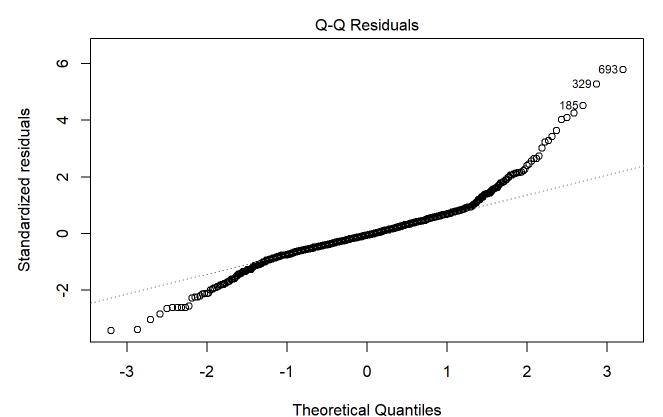
##	728	728	3095 2390.03598
##	729	729	1341 1829.99003
##	730	730	1796 2243.55031
##	731	731	2729 2165.19227

##log t

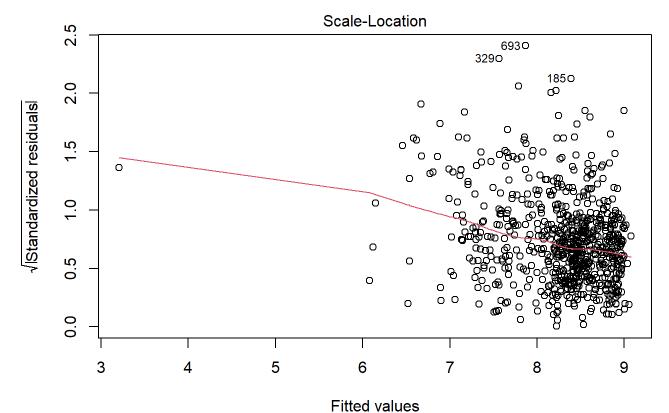
```
day_model_logged = lm(log(cnt) ~log(registered)+ mnth +weathersit + log(temp) +hum+workingday+se
ason, data = day)
plot(day_model_logged)
```



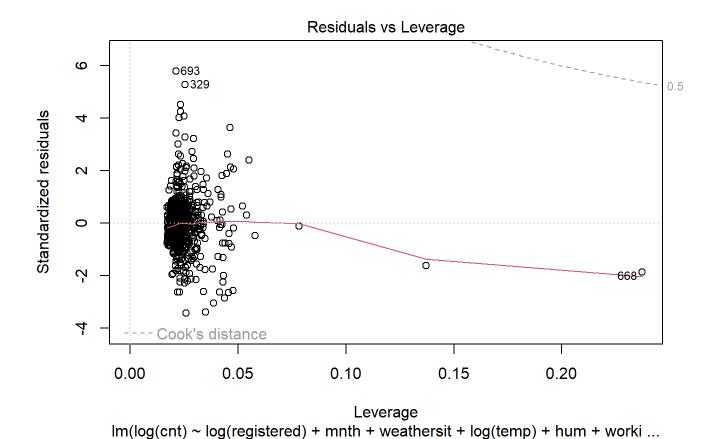
Im(log(cnt) ~ log(registered) + mnth + weathersit + log(temp) + hum + worki ...



Im(log(cnt) ~ log(registered) + mnth + weathersit + log(temp) + hum + worki ...



Im(log(cnt) ~ log(registered) + mnth + weathersit + log(temp) + hum + worki ...



file:///C:/Users/Marti/OneDrive/Documents/Examining-Trends-in-Bike-Data.html

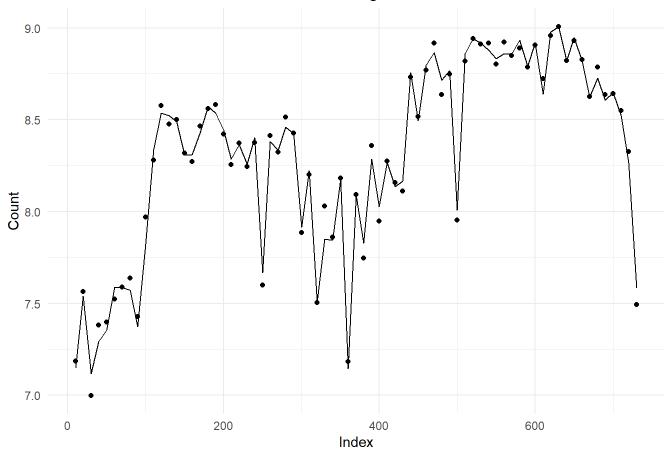
```
predicted_values <- predict(day_model_logged, newdata = day)
RMSE(predicted_values, log(day$cnt))</pre>
```

[1] 0.06987392

```
comparison_data <- data.frame(
    Instant = day$instant,
    Observed = log(day$cnt),
    Predicted = predicted_values
)
filtered_data <- comparison_data %>% filter(row_number() %% 10 == 0)

ggplot(filtered_data, aes(x = Instant, y = Observed)) +
    geom_point() +
    geom_line(aes(x = Instant, y = Predicted)) +
    labs(x = "Index", y = "Count", title = "Observed vs. Predicted Count of Bike Usage") +
    theme_minimal()
```

Observed vs. Predicted Count of Bike Usage



```
selected_years <- c(1, 448, 185, 463, 668, 669, 693)
subset(day, instant %in% selected_years , select = c('dteday', 'workingday', 'weathersit', 'tem
p', 'hum', 'windspeed', 'holiday', 'registered', 'cnt') )</pre>
```

```
dteday workingday weathersit
##
                                             temp
                                                        hum windspeed holiday
## 1
       2011-01-01
                            0
                                       2 0.344167 0.805833 0.1604460
## 185 2011-07-04
                            0
                                       2 0.726667 0.637917 0.0814792
                                                                             1
## 448 2012-03-23
                            1
                                       2 0.601667 0.694167 0.1163000
                                                                             0
## 463 2012-04-07
                            0
                                       1 0.437500 0.254167 0.2748710
                                                                             0
## 668 2012-10-29
                            1
                                       3 0.440000 0.880000 0.3582000
                                                                             0
## 669 2012-10-30
                            1
                                       2 0.318182 0.825455 0.2130090
                                                                             0
## 693 2012-11-23
                            1
                                       1 0.368333 0.568750 0.1480210
                                                                             0
##
       registered cnt
## 1
              654 985
## 185
             2978 6043
## 448
             5893 8362
## 463
             3605 6857
## 668
               20
                    22
## 669
             1009 1096
## 693
             2307 3910
```

```
smallest_cnt <- day[which.min(day$cnt), ]
largest_cnt <- day[which.max(day$cnt), ]
largest_cnt</pre>
```

```
dteday season yr mnth holiday weekday workingday weathersit
##
       instant
## 624
           624 2012-09-15
                                3
                                 1
                                        9
                                                0
                                                        6
##
           temp
                   atemp
                              hum windspeed casual registered cnt
## 624 0.608333 0.585867 0.501667 0.247521
                                               3160
                                                           5554 8714
```

```
smallest_cnt
```

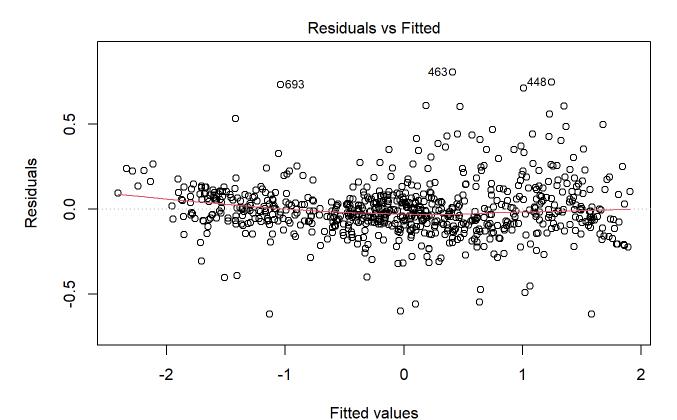
##standardize

```
data1$tempstd = (day$temp - mean(day$temp))/sd(day$temp)
data1$humstd = (day$hum - mean(day$hum))/sd(day$hum)
data1$registeredstd = (day$registered - mean(day$registered))/sd(day$registered)
data1$cntstd = (day$cnt - mean(day$cnt))/sd(day$cnt)

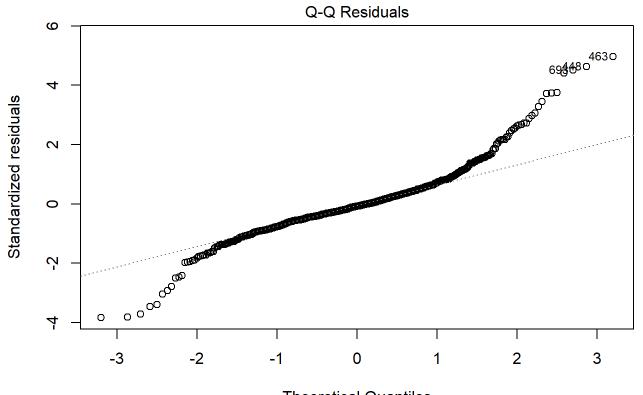
day_model_standardized = lm(cntstd ~registeredstd+ mnth +weathersit + tempstd +humstd+workingday + (workingday * tempstd), data = data1)
summary(day_model_standardized)
```

```
##
## Call:
## lm(formula = cntstd ~ registeredstd + mnth + weathersit + tempstd +
##
      humstd + workingday + (workingday * tempstd), data = data1)
##
## Residuals:
##
       Min
                      Median
                 10
                                   3Q
                                          Max
## -0.61938 -0.08355 -0.01261 0.06718 0.80573
##
## Coefficients:
##
                      Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                      0.314295
                                 0.036060
                                            8.716 < 2e-16 ***
## registeredstd
                      0.940779
                                0.008584 109.596 < 2e-16 ***
                                0.030666 -0.740 0.45944
## mnth2
                     -0.022698
                                 0.032356 4.085 4.91e-05 ***
## mnth3
                      0.132168
## mnth4
                      0.176715
                                0.035853 4.929 1.03e-06 ***
## mnth5
                      0.179839
                                0.041988 4.283 2.10e-05 ***
                                0.048166 2.279 0.02297 *
## mnth6
                      0.109763
## mnth7
                      0.070107
                                 0.052699 1.330 0.18384
## mnth8
                      0.094685
                                0.049255 1.922 0.05496 .
                                 0.043786 2.245 0.02505 *
## mnth9
                      0.098312
## mnth10
                      0.108243
                                 0.036785 2.943 0.00336 **
## mnth11
                      0.008736
                                 0.032246 0.271 0.78654
## mnth12
                     -0.036053
                                0.030845 -1.169 0.24286
## weathersit
                     -0.031297
                                0.014754 -2.121 0.03425 *
                                0.018343 11.834 < 2e-16 ***
## tempstd
                      0.217065
## humstd
                     -0.018486
                                0.008445 -2.189 0.02893 *
                                 0.014252 -35.214 < 2e-16 ***
## workingday
                     -0.501883
## tempstd:workingday -0.181194
                                 0.013012 -13.925 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1644 on 713 degrees of freedom
## Multiple R-squared: 0.9736, Adjusted R-squared: 0.973
## F-statistic: 1547 on 17 and 713 DF, p-value: < 2.2e-16
```

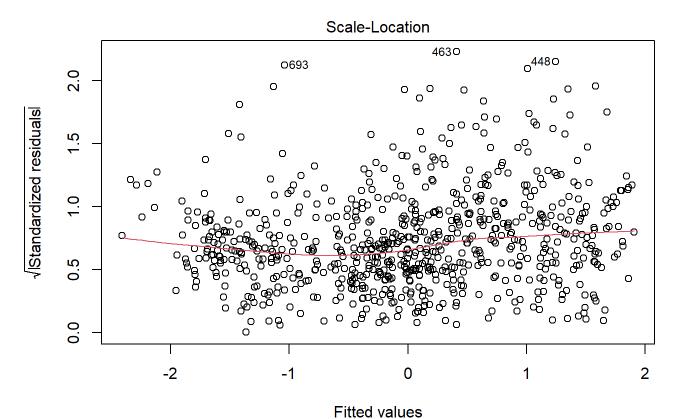
```
plot(day_model_standardized)
```



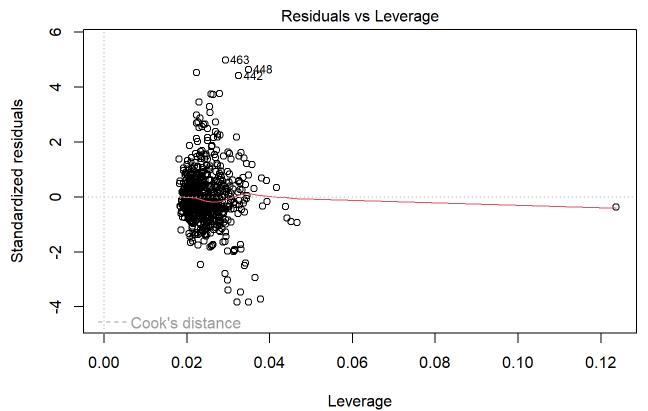
Im(cntstd ~ registeredstd + mnth + weathersit + tempstd + humstd + workingd ...



Theoretical Quantiles
Im(cntstd ~ registeredstd + mnth + weathersit + tempstd + humstd + workingd ...



Im(cntstd ~ registeredstd + mnth + weathersit + tempstd + humstd + workingd ...



Im(cntstd ~ registeredstd + mnth + weathersit + tempstd + humstd + workingd ...

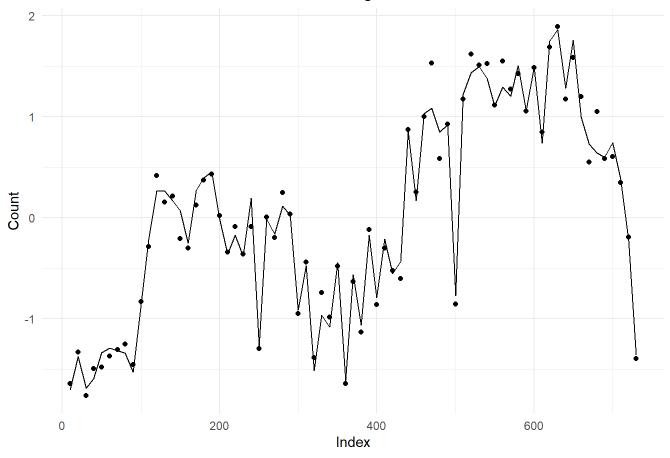
```
predicted_values <- predict(day_model_standardized, newdata = data1)
RMSE(predicted_values, data1$cntstd)</pre>
```

[1] 0.1623359

```
comparison_data <- data.frame(
    Instant = day$instant,
    Observed = data1$cntstd,
    Predicted = predicted_values
)
filtered_data <- comparison_data %>% filter(row_number() %% 10 == 0)

ggplot(filtered_data, aes(x = Instant, y = Observed)) +
    geom_point() +
    geom_line(aes(x = Instant, y = Predicted)) +
    labs(x = "Index", y = "Count", title = "Observed vs. Predicted Count of Bike Usage") +
    theme_minimal()
```

Observed vs. Predicted Count of Bike Usage



names(day)

```
## [1] "instant" "dteday" "season" "yr" "mnth"
## [6] "holiday" "weekday" "weathersit" "temp"
## [11] "atemp" "hum" "windspeed" "casual" "registered"
## [16] "cnt"
```

bday <- regsubsets(cntstd~registeredstd+season+Weather1+Weather2+Weather3+Weather4+holiday+yr+month1+month2+month3+month4+month5+month6+month7+month8+month9+month10+month11+month12+Weekday1+Weekday2+Weekday3+Weekday4+Weekday5+Weekday6+Weekday0+tempstd+windspeed+humstd+workingday + Season1+Season3+Season3+Season4+(workingday * tempstd)+(humstd * tempstd), data1)

```
## Warning in leaps.setup(x, y, wt = wt, nbest = nbest, nvmax = nvmax, force.in =
## force.in, : 7 linear dependencies found
```

Reordering variables and trying again:

summary(bday)

```
## Subset selection object
## Call: regsubsets.formula(cntstd ~ registeredstd + season + Weather1 +
##
       Weather2 + Weather3 + Weather4 + holiday + yr + month1 +
       month2 + month3 + month4 + month5 + month6 + month7 + month8 +
##
##
       month9 + month10 + month11 + month12 + Weekday1 + Weekday2 +
##
       Weekday3 + Weekday4 + Weekday5 + Weekday6 + Weekday0 + tempstd +
##
       windspeed + humstd + workingday + Season1 + Season2 + Season3 +
       Season4 + (workingday * tempstd) + (humstd * tempstd), data1)
##
## 37 Variables (and intercept)
                      Forced in Forced out
##
                          FALSE
## registeredstd
                                      FALSE
## season
                          FALSE
                                      FALSE
## Weather1
                          FALSE
                                      FALSE
## Weather2
                          FALSE
                                      FALSE
## holiday
                          FALSE
                                      FALSE
## yr
                          FALSE
                                      FALSE
## month1
                          FALSE
                                      FALSE
## month2
                          FALSE
                                      FALSE
## month3
                          FALSE
                                      FALSE
## month4
                          FALSE
                                      FALSE
## month5
                          FALSE
                                      FALSE
## month6
                          FALSE
                                      FALSE
## month7
                          FALSE
                                      FALSE
## month8
                          FALSE
                                      FALSE
## month9
                          FALSE
                                      FALSE
## month10
                          FALSE
                                      FALSE
## month11
                          FALSE
                                      FALSE
## Weekday1
                          FALSE
                                      FALSE
## Weekday2
                          FALSE
                                      FALSE
## Weekday3
                          FALSE
                                      FALSE
## Weekday4
                          FALSE
                                      FALSE
## Weekday5
                          FALSE
                                      FALSE
## Weekday6
                          FALSE
                                      FALSE
## tempstd
                          FALSE
                                      FALSE
## windspeed
                          FALSE
                                      FALSE
## humstd
                          FALSE
                                      FALSE
## Season1
                          FALSE
                                      FALSE
## Season2
                          FALSE
                                      FALSE
## tempstd:workingday
                          FALSE
                                      FALSE
## tempstd:humstd
                          FALSE
                                      FALSE
## Weather3
                          FALSE
                                      FALSE
## Weather4
                          FALSE
                                      FALSE
## month12
                          FALSE
                                      FALSE
## Weekday0
                          FALSE
                                      FALSE
## workingday
                          FALSE
                                      FALSE
## Season3
                          FALSE
                                      FALSE
## Season4
                          FALSE
                                      FALSE
## 1 subsets of each size up to 9
## Selection Algorithm: exhaustive
##
            registeredstd season Weather1 Weather2 Weather3 Weather4 holiday yr
## 1 ( 1 ) "*"
                                                    . .
     (1)"*"
```

```
(1)"*"
## 3
## 4
       1)
       1)
## 5
      (1)
           "*"
## 6
## 7
      (1)
## 8
      (1)
      (1)
## 9
##
           month1 month2 month3
                                month4
                                       month5 month6 month7 month8
                                                                   month9 month10
## 1
      (1)
## 2
      (1)
## 3
      (1)
## 5
      (1)
      (1)
## 6
## 7
      (1)
## 8
      (1)
## 9
      (1)
##
           month11 month12 Weekday1 Weekday2 Weekday3 Weekday4 Weekday5 Weekday6
## 1
      (1)
## 2
## 3
      (1)
      (1)
## 4
## 5
      (1)
                                                               11 * 11
## 6
      (1)
      (1)
## 7
      (1)""
## 8
      (1)""
                                                               11 * 11
## 9
##
           Weekday0 tempstd windspeed humstd workingday Season1 Season2 Season3
                                      . .
## 1
      (1)
## 2
      (1)
      (1)
## 3
      (1)
## 4
## 5
      (1)
## 6
      (1)
                    "*"
      (1)
                                      11 * 11
## 7
      (1)""
                                      "*"
## 8
## 9
      (1)
##
           Season4 tempstd:workingday tempstd:humstd
      (1)""
## 1
## 2
      (1)
## 3
       1)
## 4
      (1)
## 5
      (1)
## 6
      (1)
## 7
      (1)
## 8
      (1)
## 9
      (1)
```

```
summary(bday)$adjr2
```

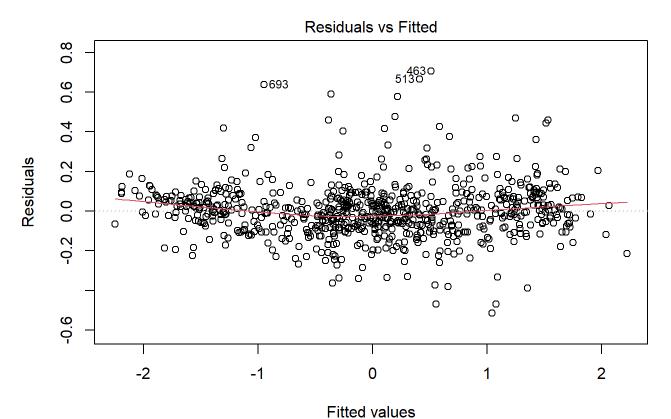
```
## [1] 0.8938568 0.9502356 0.9616492 0.9690085 0.9711947 0.9721365 0.9727133
## [8] 0.9732158 0.9736021
```

which.max(summary(bday)\$adjr2)

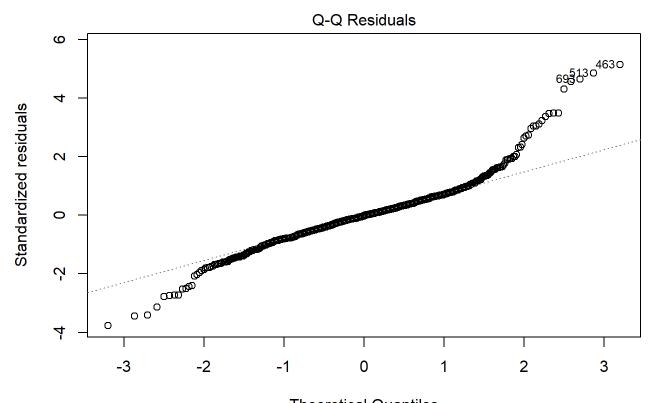
```
## [1] 9
```

```
##
## Call:
## lm(formula = cntstd ~ registeredstd + holiday + month3 + month10 +
##
      Weekday5 + tempstd + humstd + workingday + Season2 + (workingday *
##
      tempstd) + (registeredstd * workingday) + (month3 * tempstd) +
##
       (holiday * registeredstd) + (holiday * tempstd) + (registeredstd *
##
      Season3), data = data1)
##
## Residuals:
##
       Min
                 10
                      Median
                                           Max
                                   3Q
## -0.51560 -0.07435 -0.00300 0.06582 0.70515
##
## Coefficients:
                            Estimate Std. Error t value Pr(>|t|)
##
                                       0.015403 23.292 < 2e-16 ***
## (Intercept)
                            0.358767
## registeredstd
                            1.114425
                                       0.014985 74.368 < 2e-16 ***
## holiday
                           -0.261909
                                       0.039513 -6.628 6.69e-11 ***
                                       0.026345 5.908 5.35e-09 ***
## month3
                            0.155656
## month10
                            0.115184
                                       0.021329 5.400 9.07e-08 ***
## Weekday5
                            0.093957
                                       0.015214 6.176 1.10e-09 ***
## tempstd
                                       0.015039 9.916 < 2e-16 ***
                            0.149124
## humstd
                           -0.029513
                                       0.005466 -5.399 9.12e-08 ***
## workingday
                           -0.603933
                                       0.013272 -45.505 < 2e-16 ***
## Season2
                                       0.016972 9.239 < 2e-16 ***
                            0.156803
## Season3
                                       0.024956 2.429
                                                         0.0154 *
                            0.060629
                                       0.014055 -5.784 1.09e-08 ***
## tempstd:workingday
                           -0.081297
## registeredstd:workingday -0.236702
                                       0.016001 -14.793 < 2e-16 ***
## month3:tempstd
                                       0.033120 4.510 7.57e-06 ***
                            0.149379
## registeredstd:holiday
                                       0.043478 -7.431 3.09e-13 ***
                           -0.323088
## holiday:tempstd
                            0.193468
                                       0.037358 5.179 2.91e-07 ***
## registeredstd:Season3
                            0.063085
                                       0.014827 4.255 2.37e-05 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.1384 on 714 degrees of freedom
## Multiple R-squared: 0.9813, Adjusted R-squared: 0.9809
## F-statistic: 2339 on 16 and 714 DF, p-value: < 2.2e-16
```

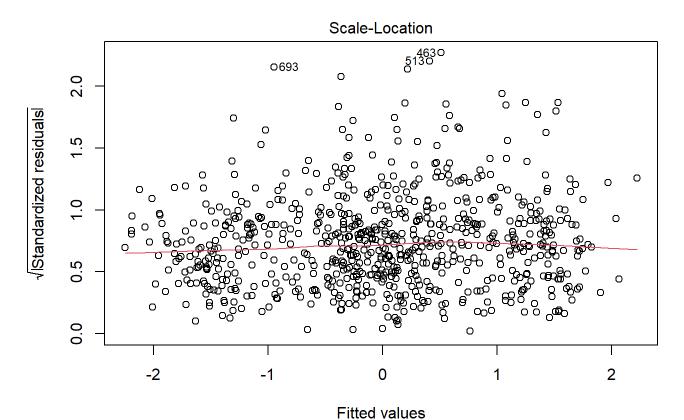
```
plot(big_std_model)
```



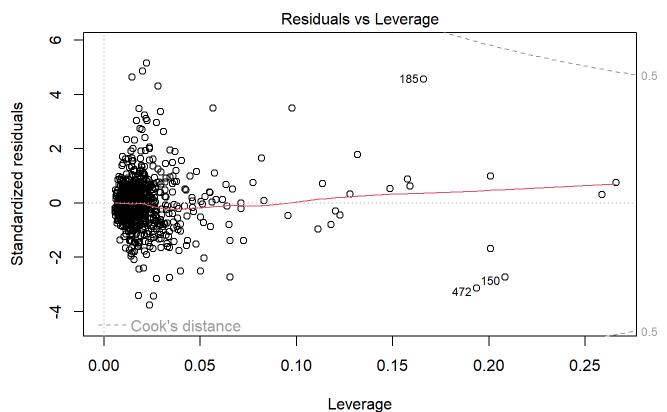
Im(cntstd ~ registeredstd + holiday + month3 + month10 + Weekday5 + tempstd ...



Theoretical Quantiles Im(cntstd ~ registeredstd + holiday + month3 + month10 + Weekday5 + tempstd ...



Im(cntstd ~ registeredstd + holiday + month3 + month10 + Weekday5 + tempstd ...



Im(cntstd ~ registeredstd + holiday + month3 + month10 + Weekday5 + tempstd ...

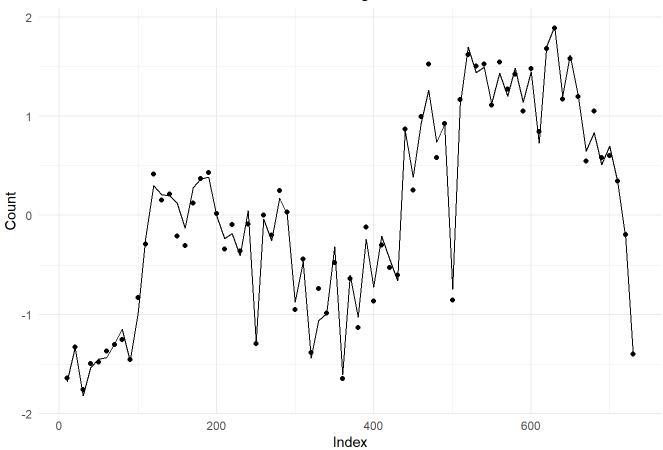
```
predicted_values <- predict(big_std_model, newdata = data1)
RMSE(predicted_values, data1$cntstd)</pre>
```

[1] 0.1367364

```
comparison_data <- data.frame(
    Instant = data1$instant,
    Observed = data1$cntstd,
    Predicted = predicted_values
)
filtered_data <- comparison_data %>% filter(row_number() %% 10 == 0)

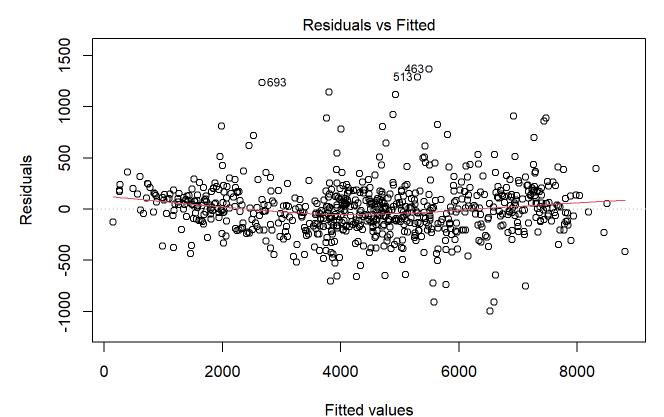
ggplot(filtered_data, aes(x = Instant, y = Observed)) +
    geom_point() +
    geom_line(aes(x = Instant, y = Predicted)) +
    labs(x = "Index", y = "Count", title = "Observed vs. Predicted Count of Bike Usage") +
    theme_minimal()
```

Observed vs. Predicted Count of Bike Usage

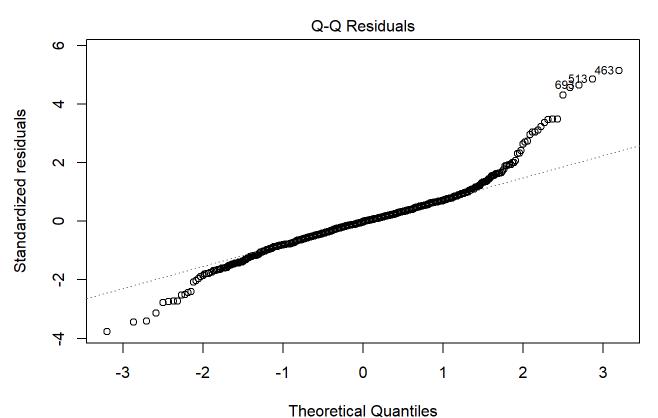


```
##
## Call:
## lm(formula = cnt ~ registered + month3 + month10 + Weekday5 +
##
      hum + workingday + Season2 + (workingday * temp) + (registered *
##
      workingday) + (month3 * temp) + (holiday * registered) +
##
      (holiday * temp) + (registered * Season3), data = data1)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -998.83 -144.02 -5.82 127.52 1366.02
##
## Coefficients:
##
                          Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                    73.49446 -5.297 1.57e-07 ***
                        -389.32798
                                     0.01861 74.368 < 2e-16 ***
## registered
                           1.38367
## month3
                        -481.59763 143.10463 -3.365 0.000805 ***
## month10
                         223.13493
                                   41.31972 5.400 9.07e-08 ***
## Weekday5
                                    29.47196
                                               6.176 1.10e-09 ***
                         182.01523
                        -401.41153 74.34748 -5.399 9.12e-08 ***
## hum
## workingday
                         330.77292
                                   69.36812 4.768 2.25e-06 ***
## Season2
                                               9.239 < 2e-16 ***
                         303.75970 32.87878
                                               9.916 < 2e-16 ***
## temp
                        1578.16939 159.15753
## holidav
                         -54.99294 162.71864 -0.338 0.735490
## Season3
                        -168.91984
                                   95.73855 -1.764 0.078094 .
## workingday:temp
                        -860.36298 148.73902 -5.784 1.09e-08 ***
                                     0.01987 -14.793 < 2e-16 ***
## registered:workingday
                         -0.29389
## month3:temp
                        1580.86401 350.50587 4.510 7.57e-06 ***
                                     0.05398 -7.431 3.09e-13 ***
## registered:holiday
                          -0.40115
## temp:holiday
                        2047.45442 395.35829
                                               5.179 2.91e-07 ***
## registered:Season3
                           0.07833
                                     0.01841 4.255 2.37e-05 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 268 on 714 degrees of freedom
## Multiple R-squared: 0.9813, Adjusted R-squared: 0.9809
## F-statistic: 2339 on 16 and 714 DF, p-value: < 2.2e-16
```

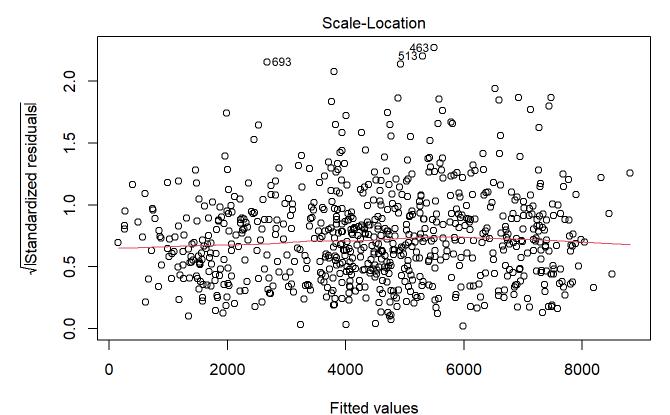
```
plot(day_model_unstd)
```



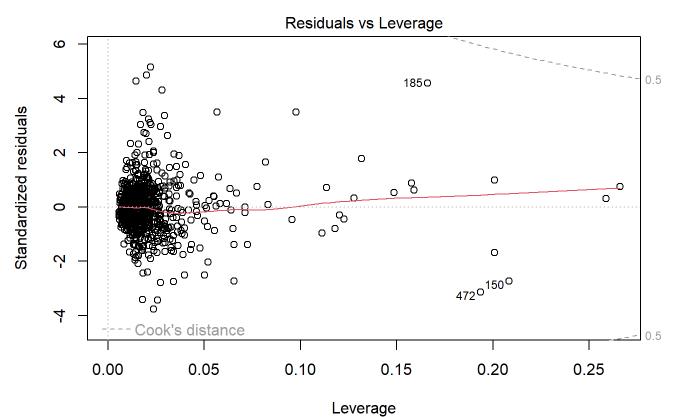
Im(cnt ~ registered + month3 + month10 + Weekday5 + hum + workingday + Seas ...



Im(cnt ~ registered + month3 + month10 + Weekday5 + hum + workingday + Seas ...



Im(cnt ~ registered + month3 + month10 + Weekday5 + hum + workingday + Seas ...



lm(cnt ~ registered + month3 + month10 + Weekday5 + hum + workingday + Seas ...

```
predicted_values <- predict(day_model_unstd, newdata = data1)
RMSE(predicted_values, data1$cnt)</pre>
```

```
## [1] 264.8874
```

```
comparison_data <- data.frame(
    Instant = data1$instant,
    Observed = data1$cnt,
    Predicted = predicted_values
)
filtered_data <- comparison_data %>% filter(row_number() %% 10 == 0)

ggplot(filtered_data, aes(x = Instant, y = Observed)) +
    geom_point() +
    geom_line(aes(x = Instant, y = Predicted)) +
    labs(x = "Index", y = "Count", title = "Observed vs. Predicted Count of Bike Usage") +
    theme_minimal()
```

Observed vs. Predicted Count of Bike Usage

