

Bike Share Demand Forecasting Methods

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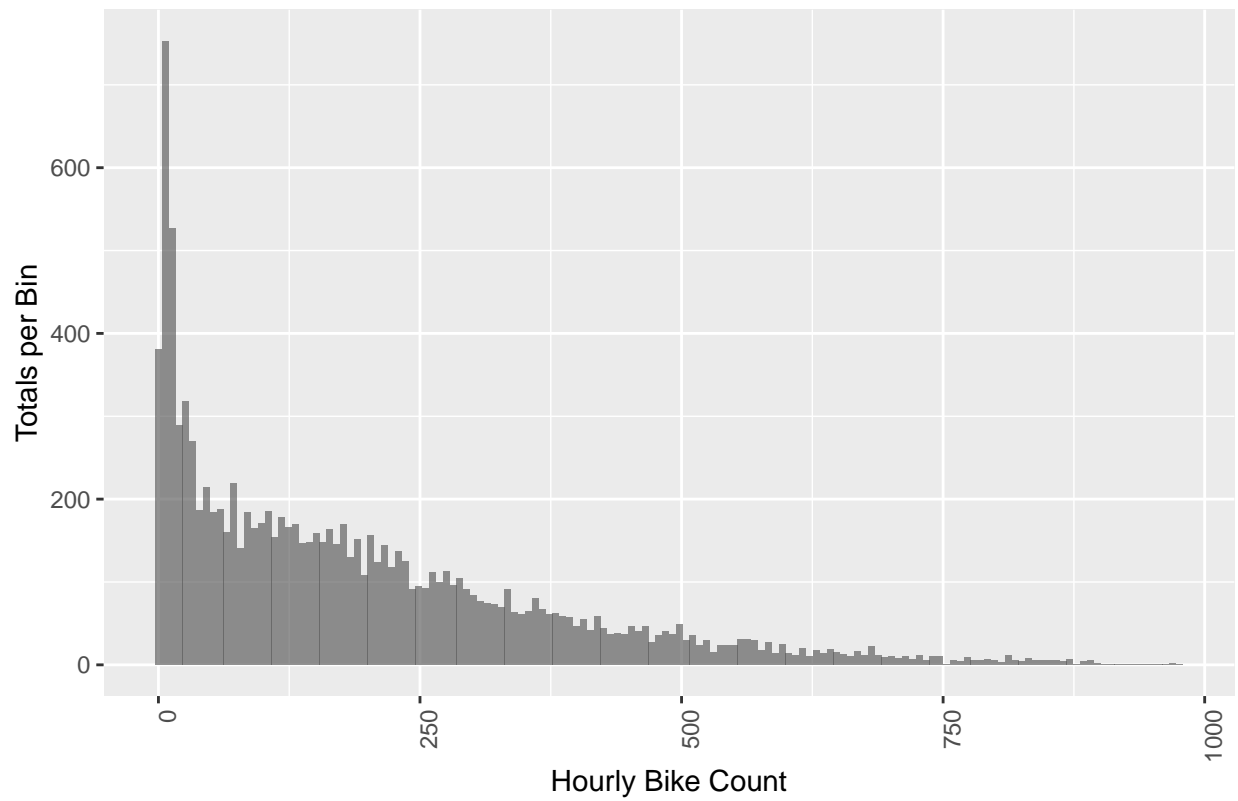
1 Introduction

Bike rentals where the customer can pick up and drop off a bike at their leisure at several locations has become popular. This dataset outlines attributes related to the travel of customers. Data gathered by the rental companies includes things like the date, temperature, count of users, humidity and more. The collection of attributes has the potential to assist researchers in developing an understanding of the mobility in a city.

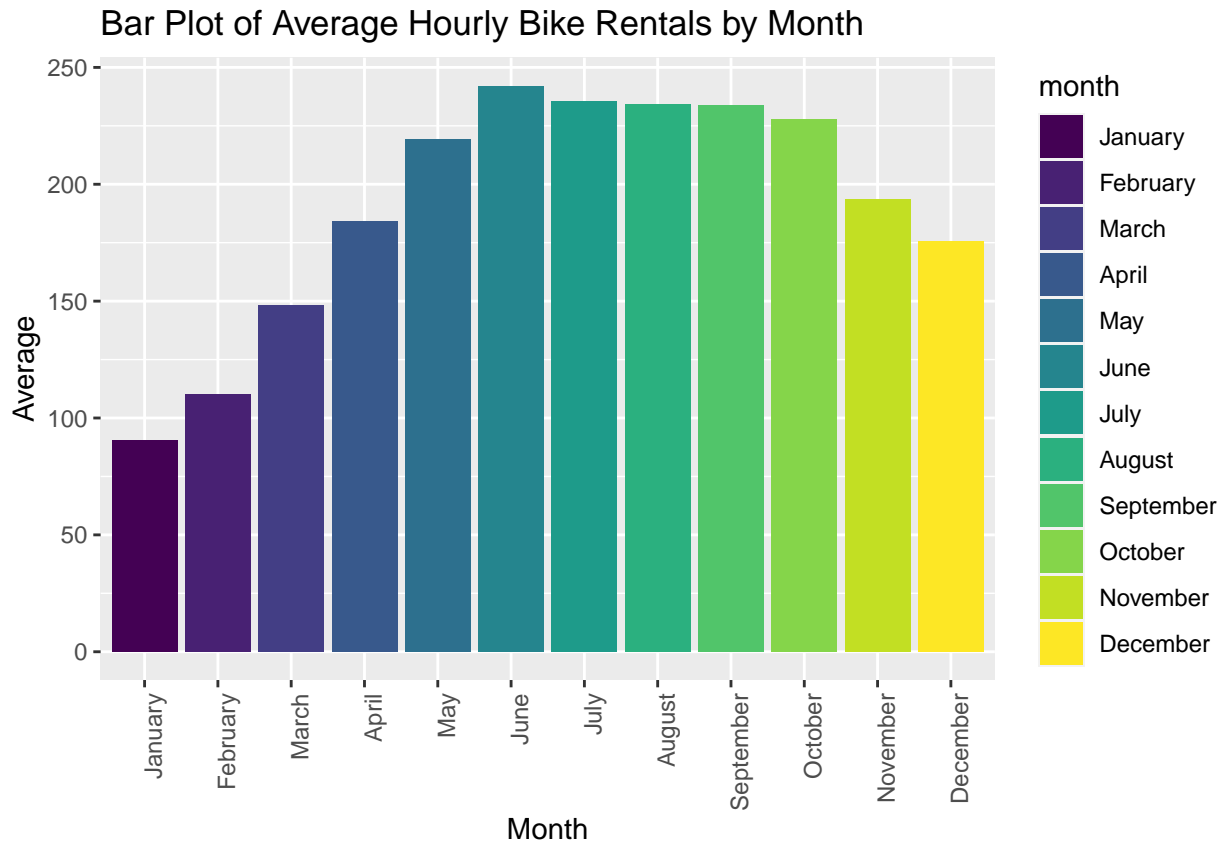
2 Data Analysis

| Column Name | Type | Description |
|-----------------------|-----------|---|
| 1. datetime | Character | YYYY-MM-DD HH24 (example: 2011-01-01 04:00:00) |
| 2. season | Integer | (1-4) |
| 3. holiday | Integer | (0 or 1) |
| 4. workingday | Integer | (0 or 1) |
| 5. weather | Integer | (1-4) |
| 6. temp | Float | temperature in Celsius |
| 7. atemp | Float | “feels like” temperature in Celsius |
| 8. humidity | Integer | relative humidity |
| 9. windspeed | Float | wind speed |
| 10. casual | Integer | count of casual users |
| 11. registered | Integer | count of registered users |
| 12. count | Integer | count of total users (<i>primary response variable</i>) |

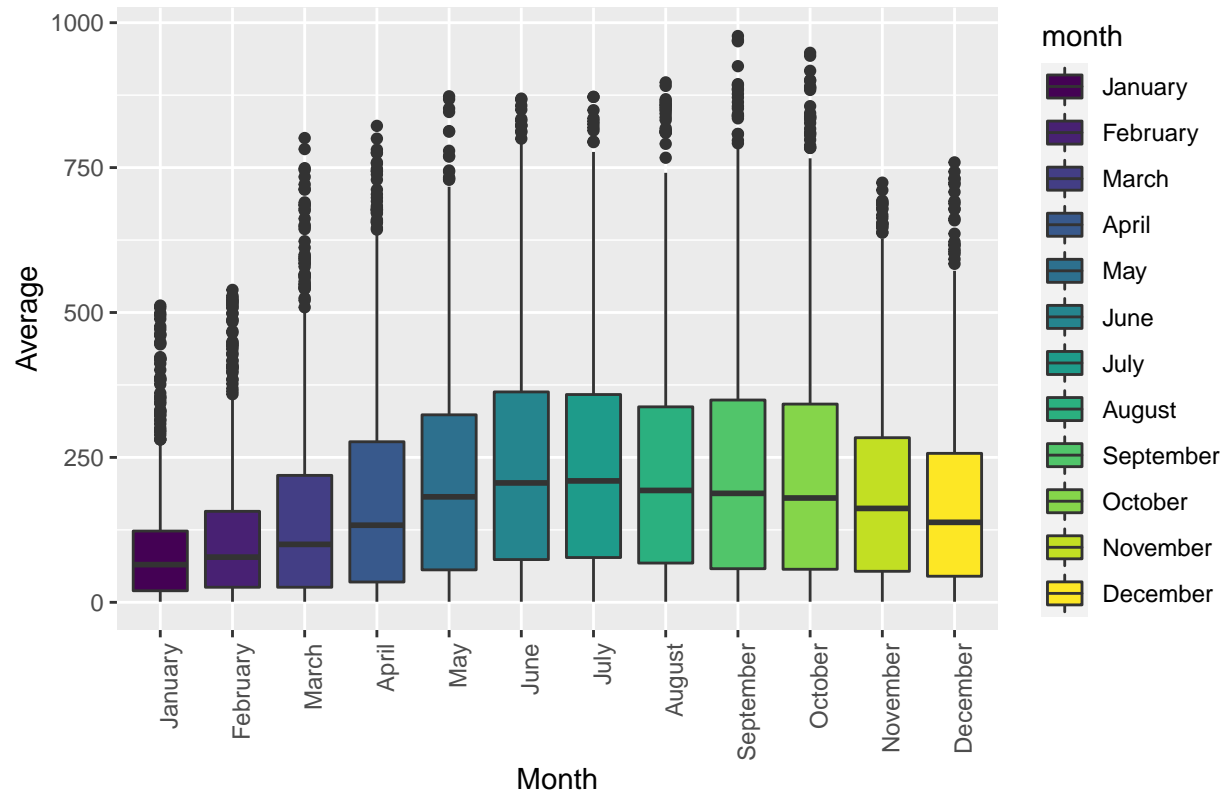
Histogram of Hourly Bike Count

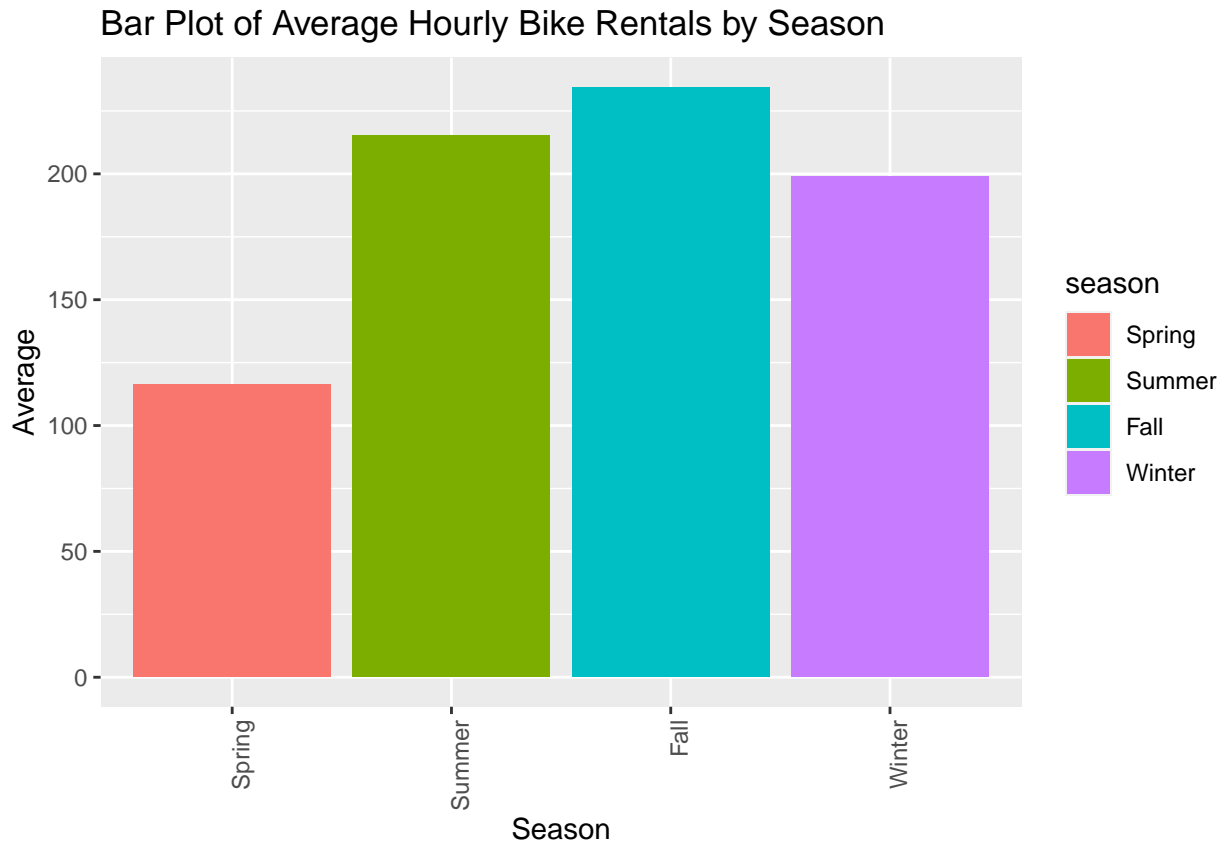


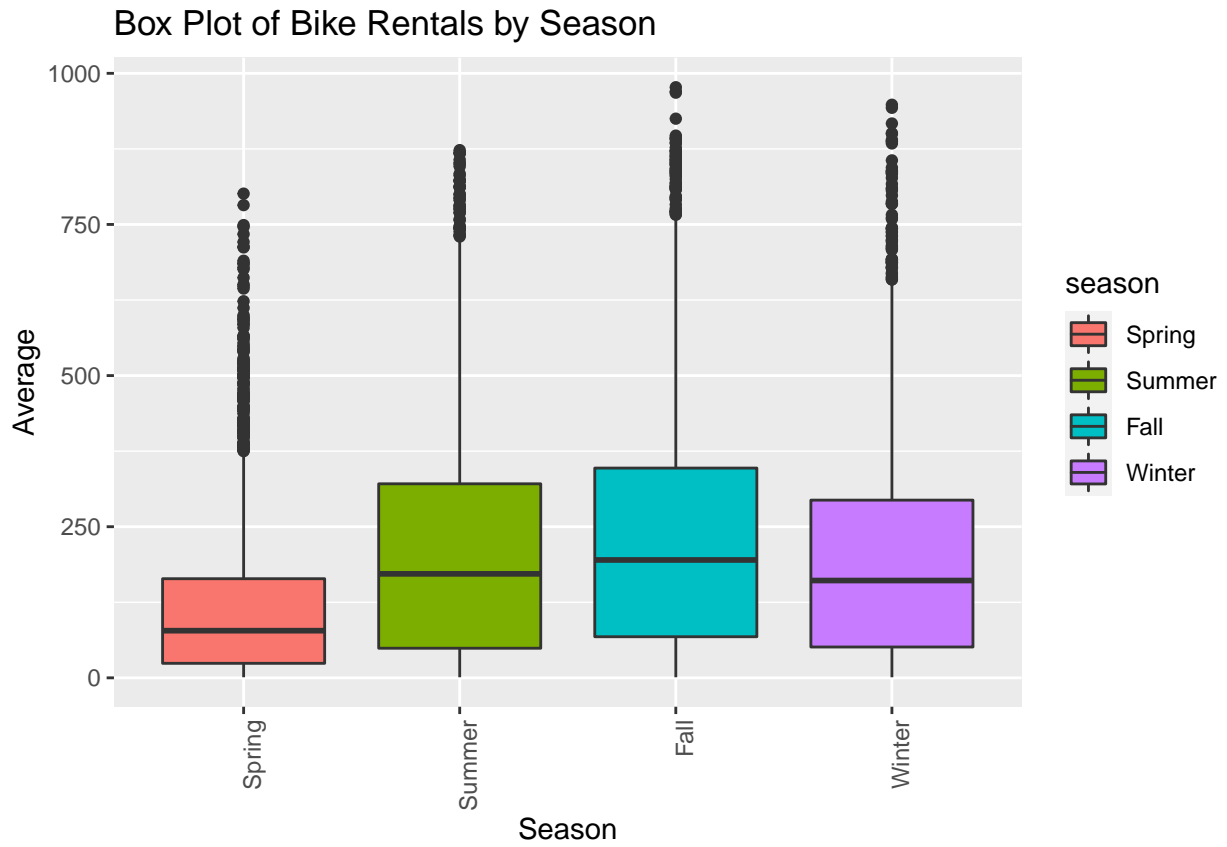
| Var1 | Freq |
|---------|----------|
| Min. | 1.0000 |
| 1st Qu. | 42.0000 |
| Median | 145.0000 |
| Mean | 191.5741 |
| 3rd Qu. | 284.0000 |
| Max. | 977.0000 |



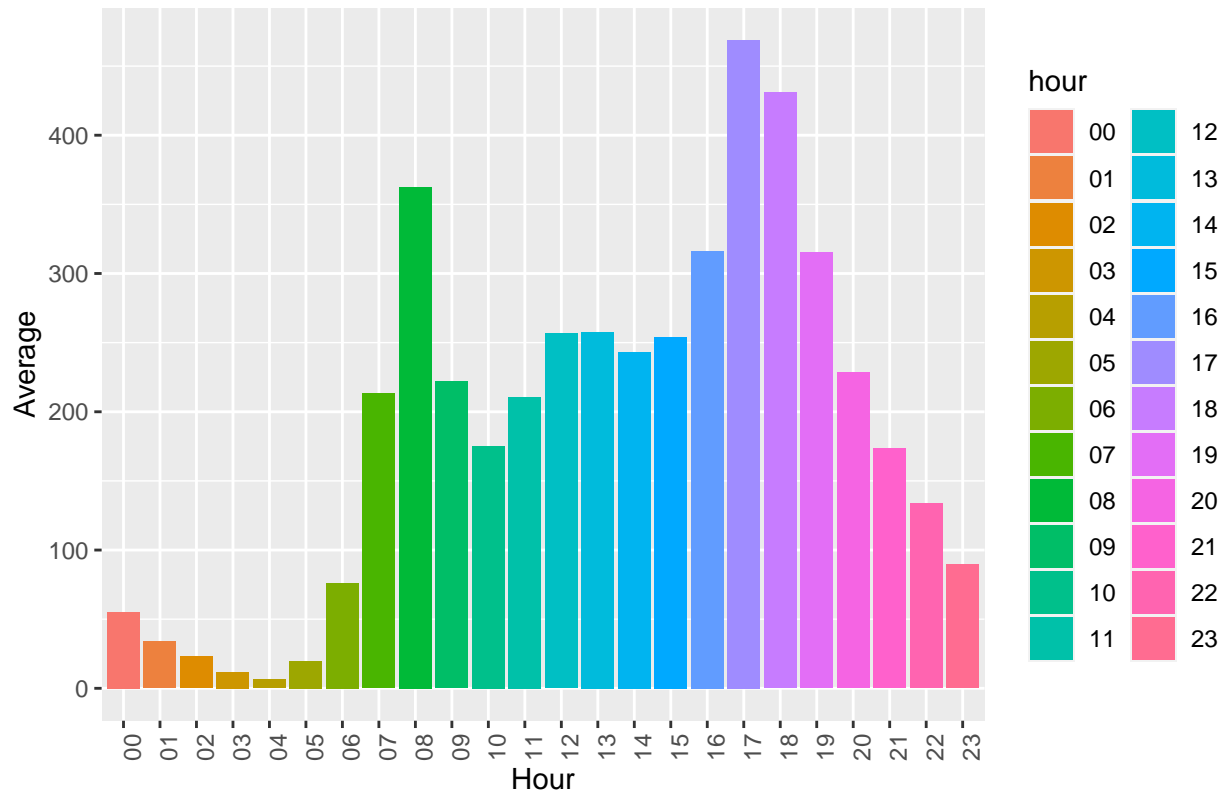
Box Plot of Bike Rentals by Month



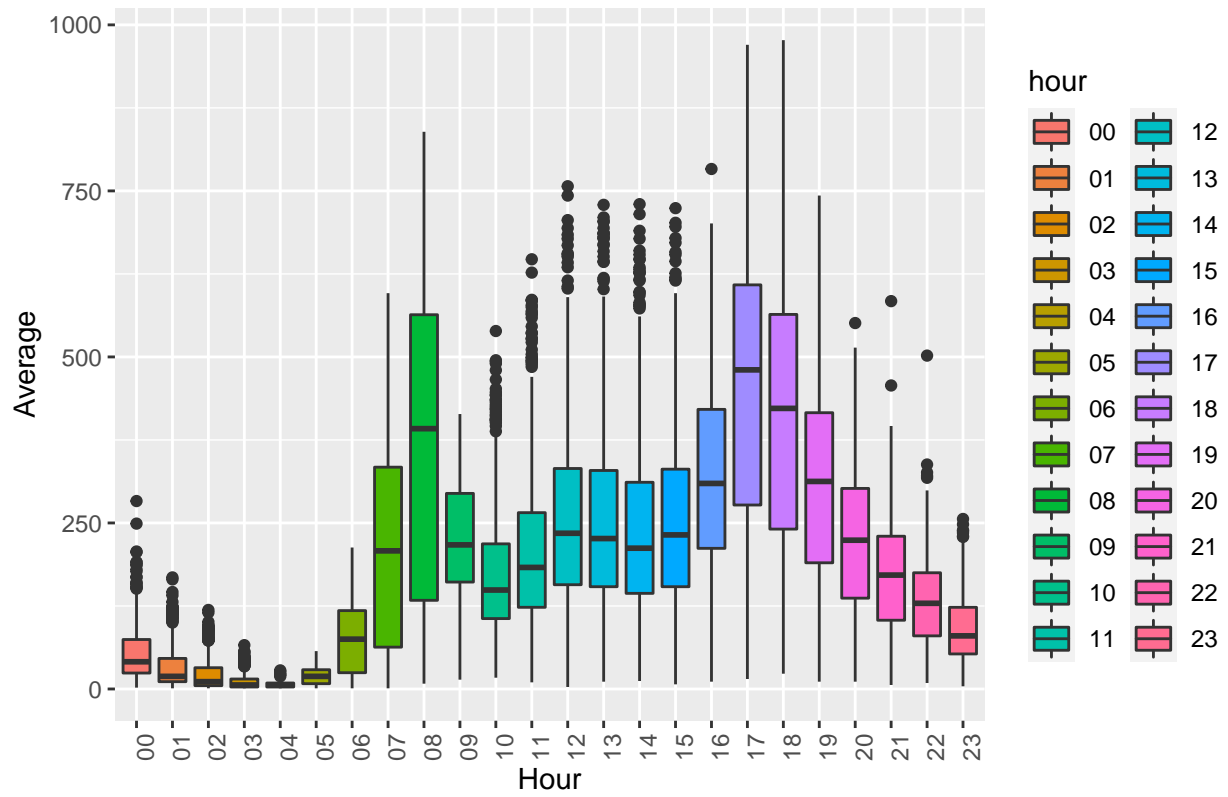


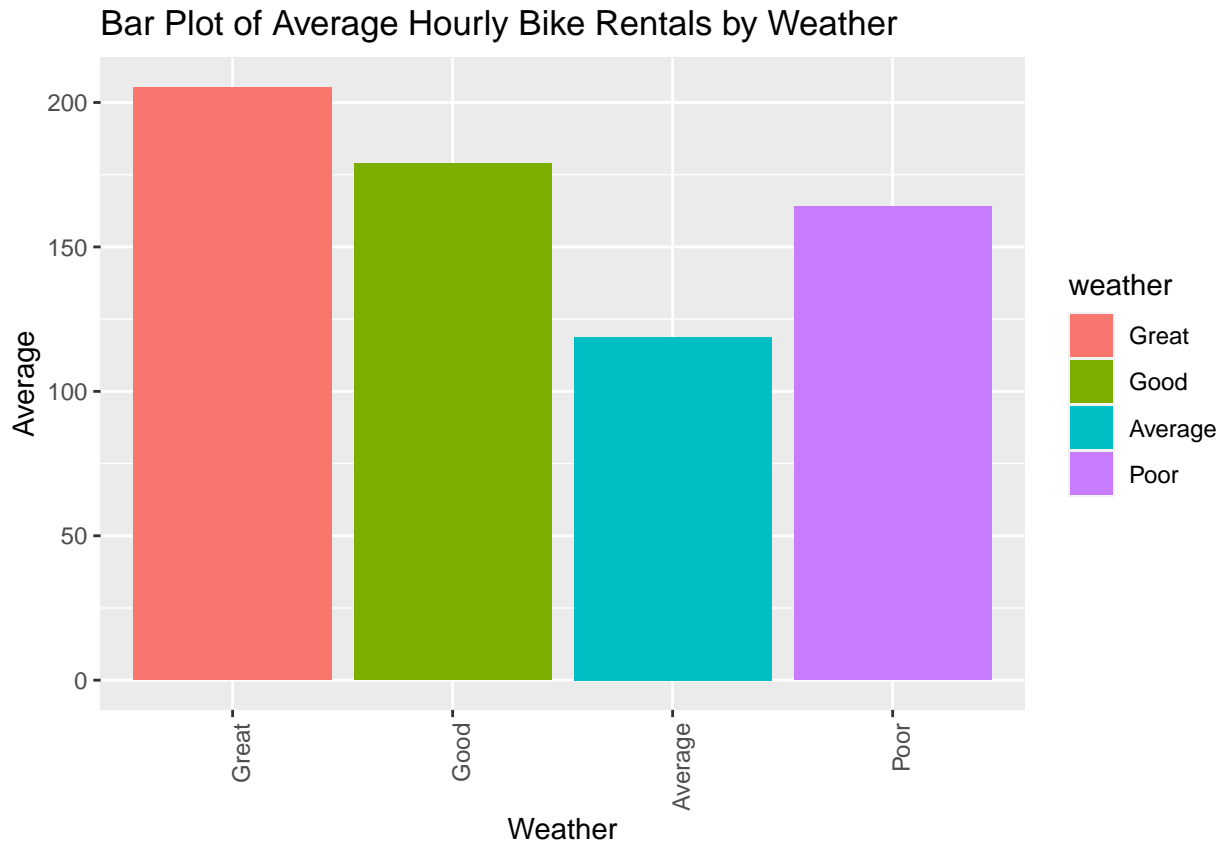


Bar Plot of Average Bike Rentals by Hour

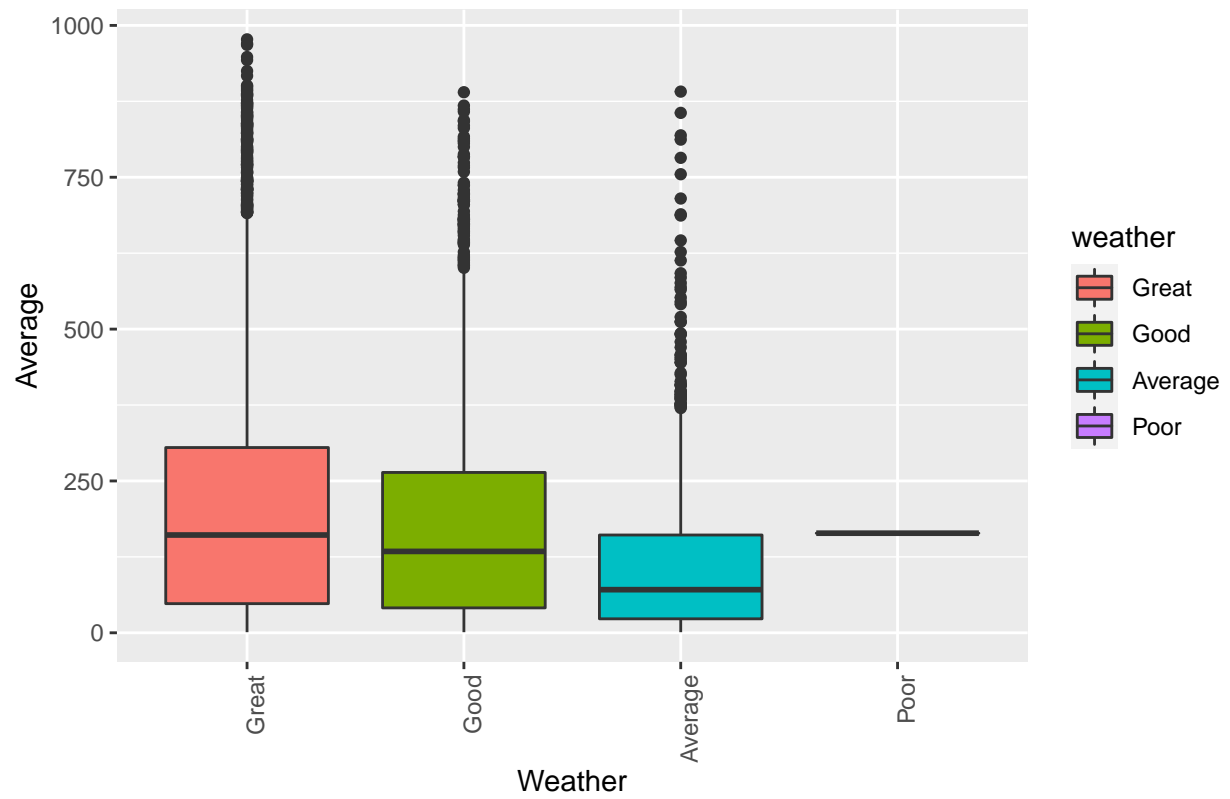


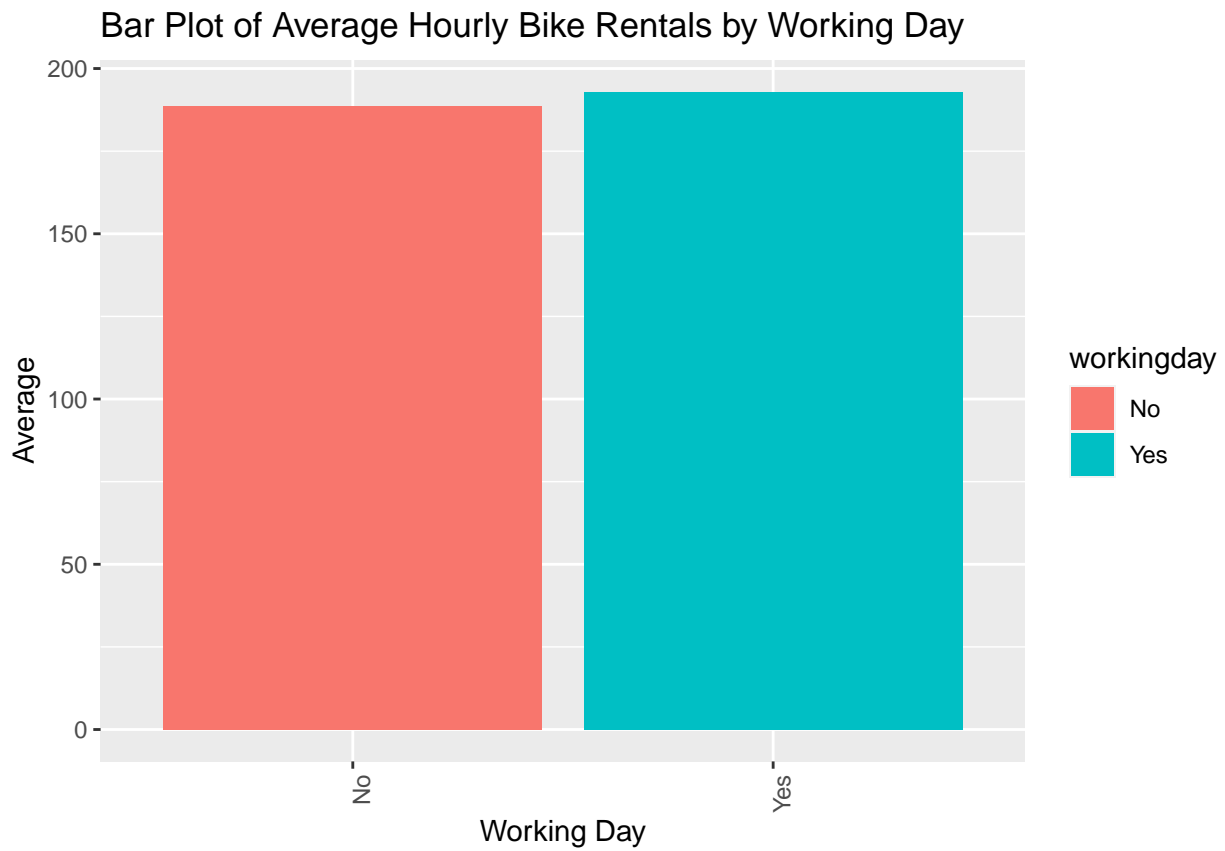
Box Plot of Bike Rentals by Hour

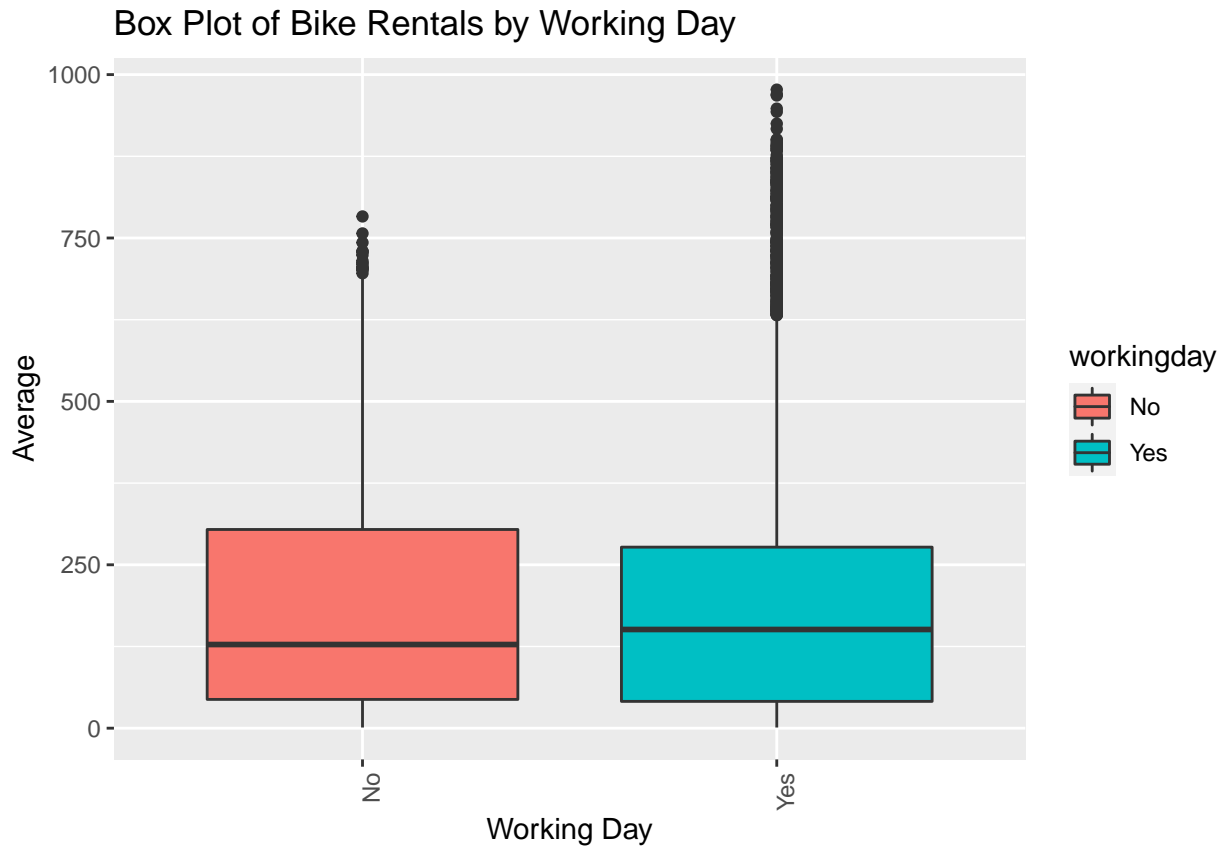


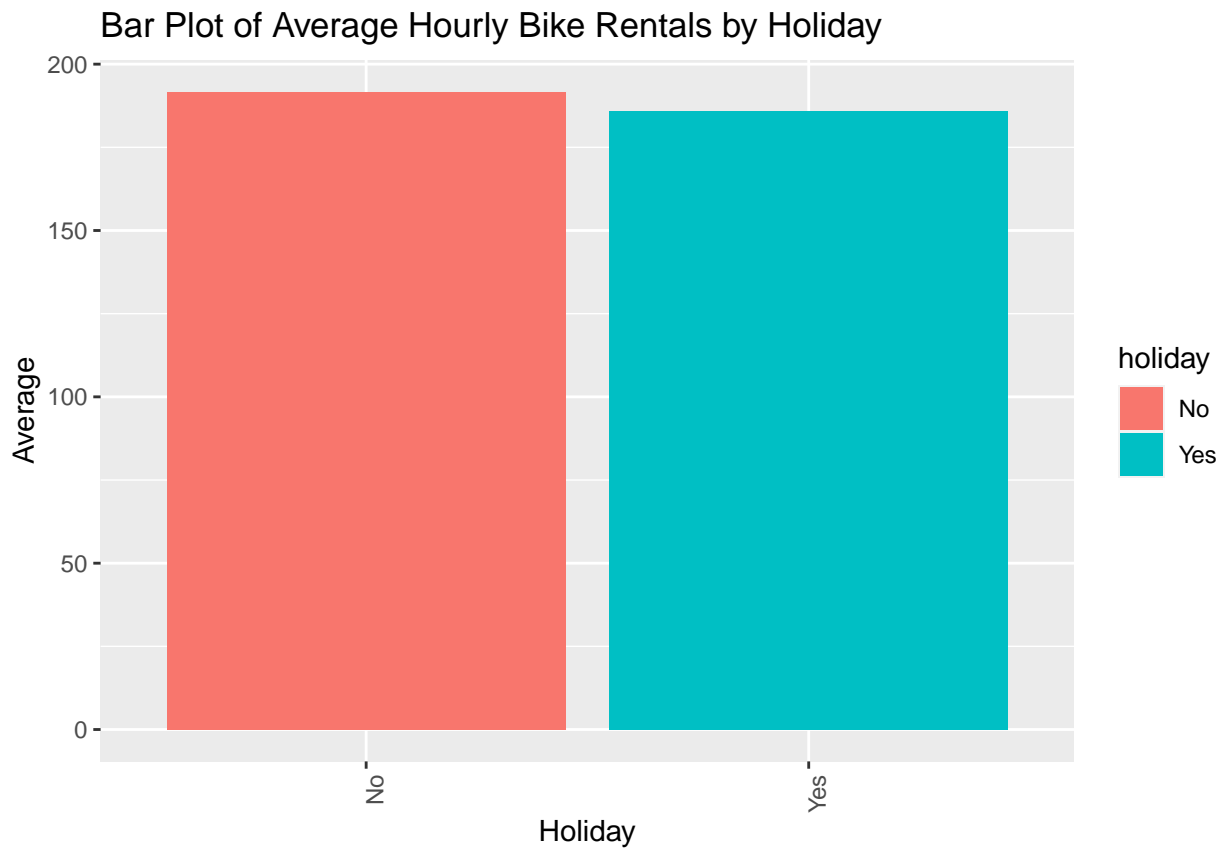


Box Plot of Bike Rentals by Weather

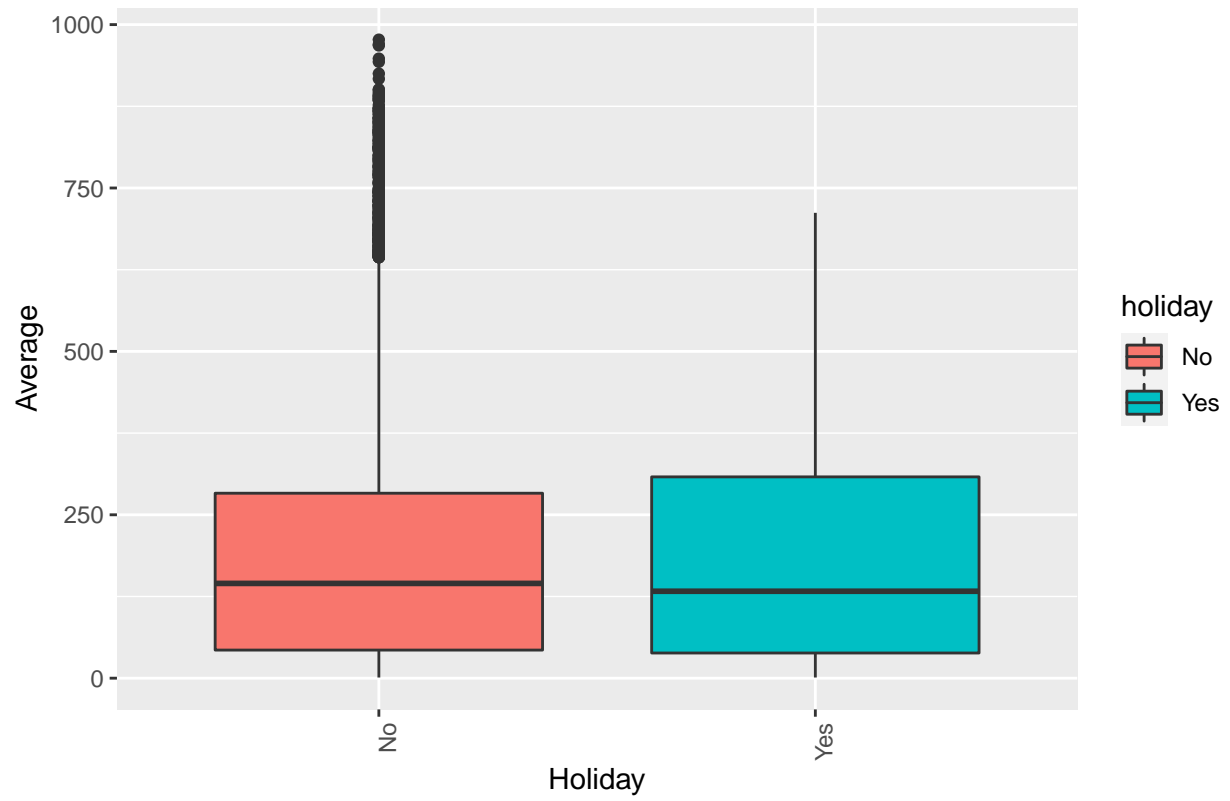




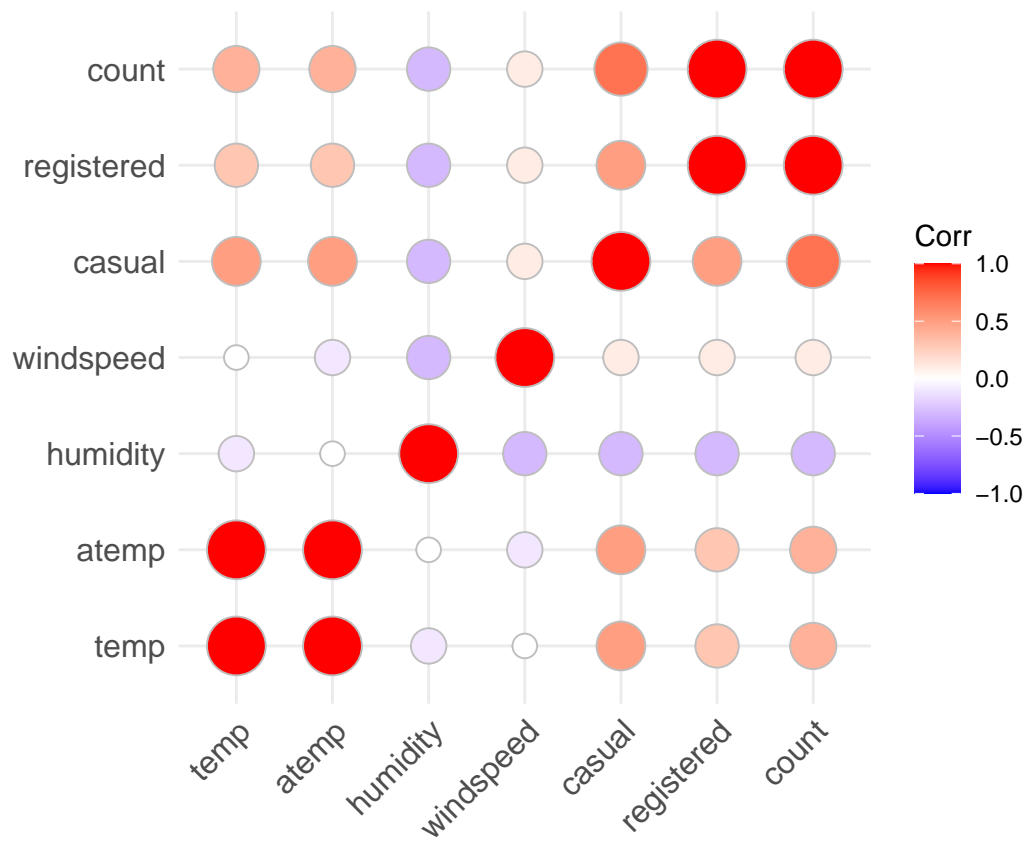




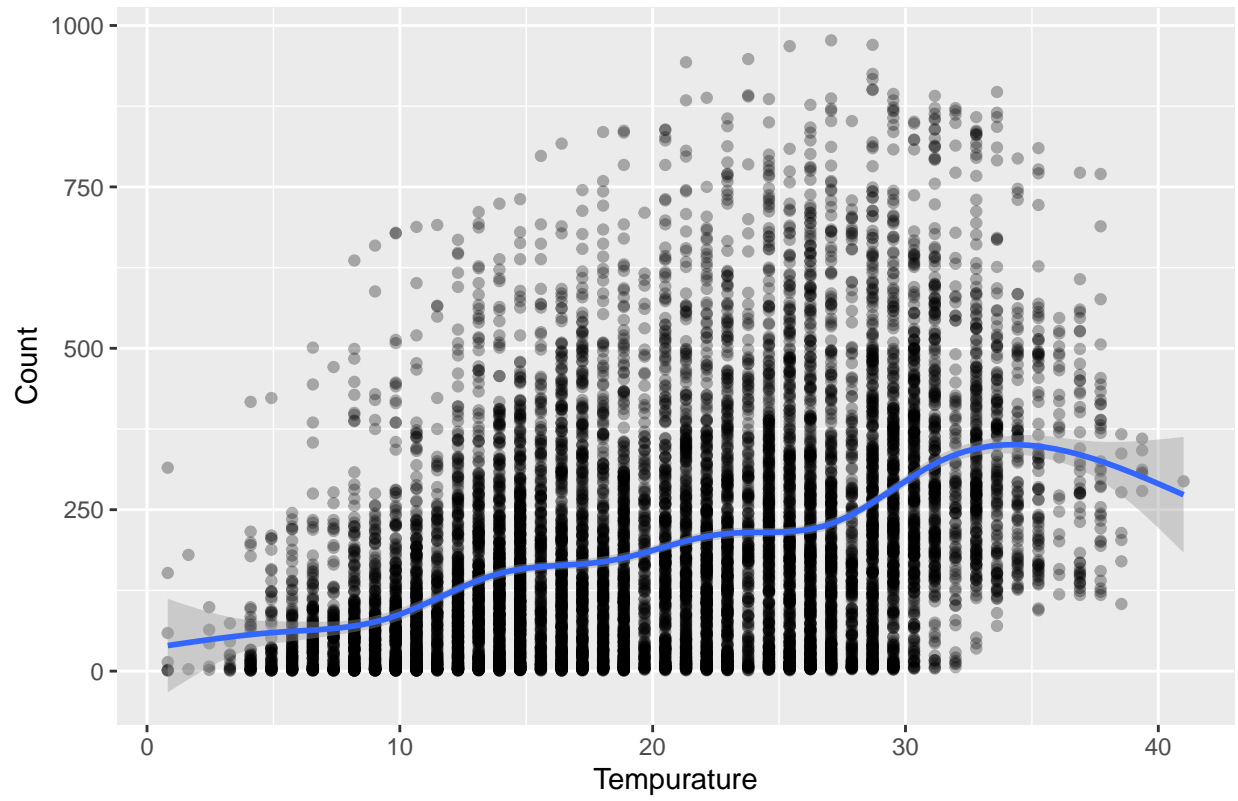
Box Plot of Bike Rentals by Holiday



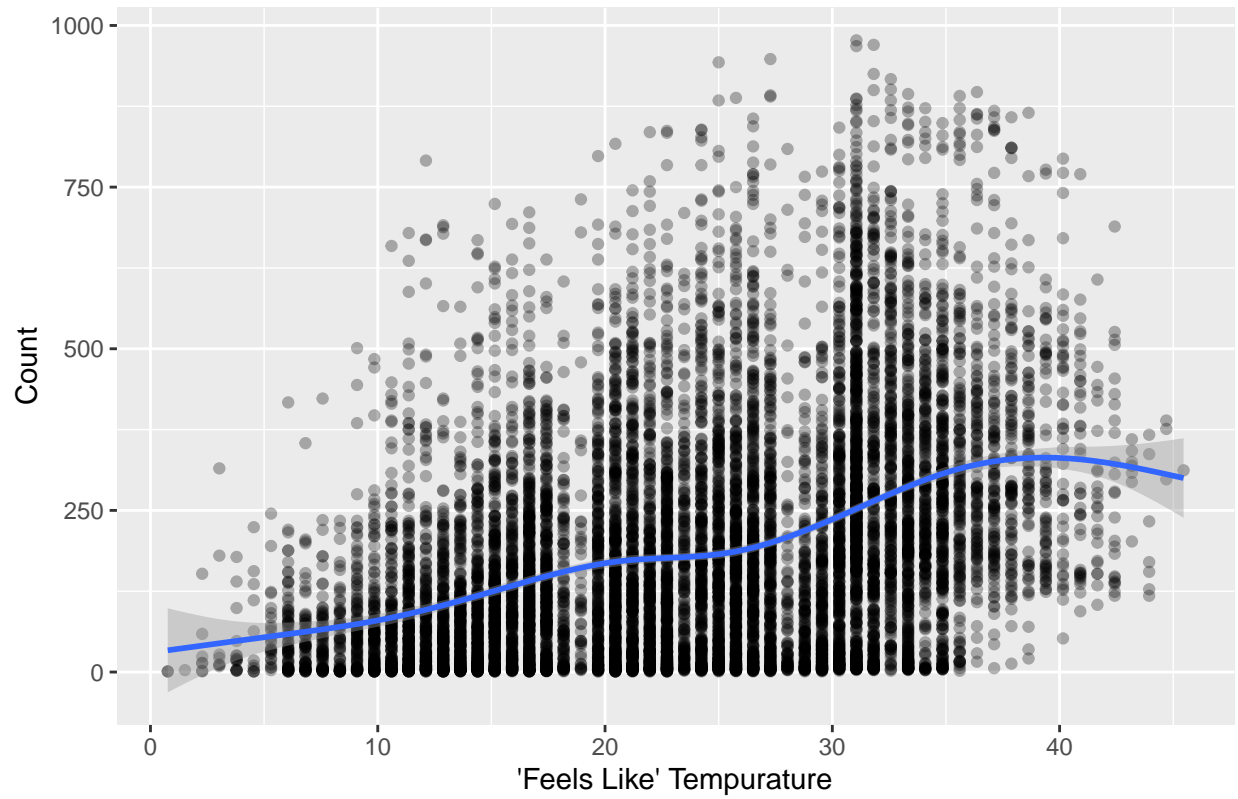

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## Warning: 'guides(<scale> = FALSE)' is deprecated. Please use 'guides(<scale> =  
## "none")' instead.
```



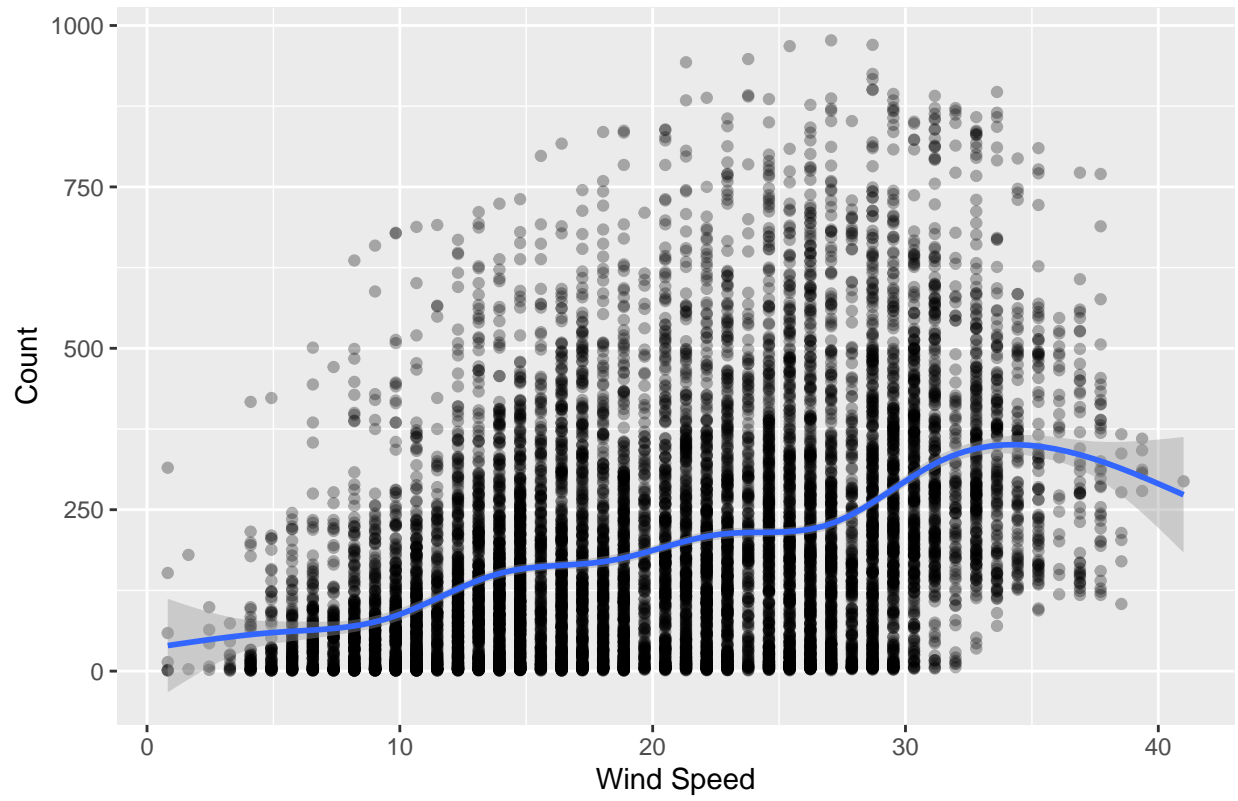
Line Chart of Counts by Temperature



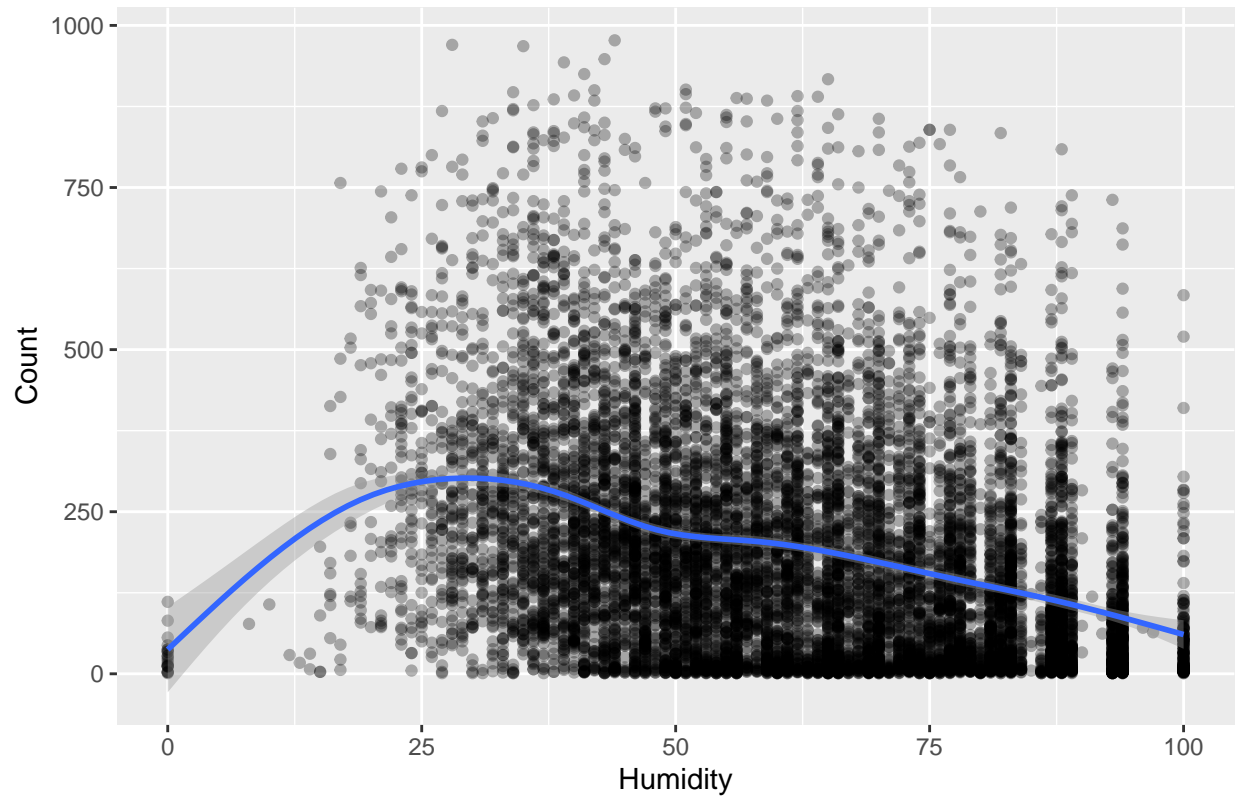
Line Chart of Counts by 'Feels Like' Temperature



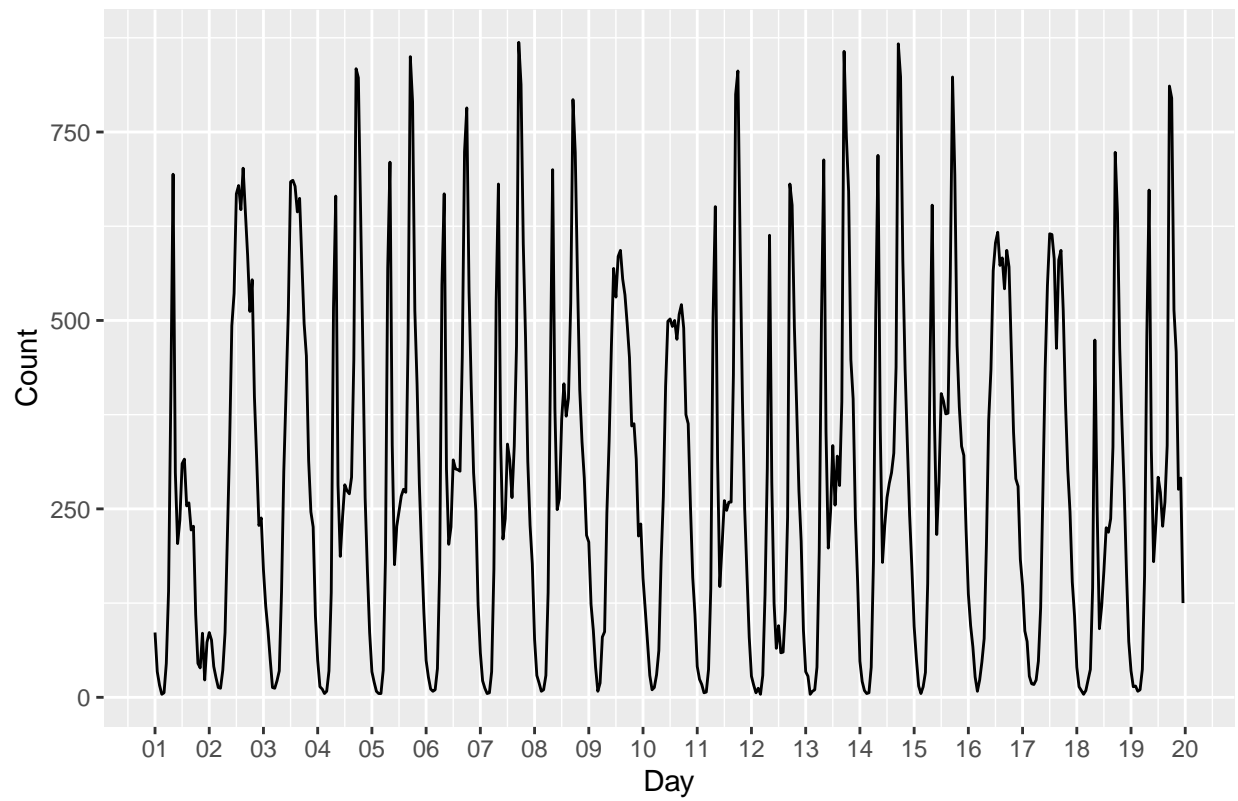
Line Chart of Counts by Wind Speed



Line Chart of Counts by Humidity



Hourly Rental Trends for June 1st – June 19th, 2012

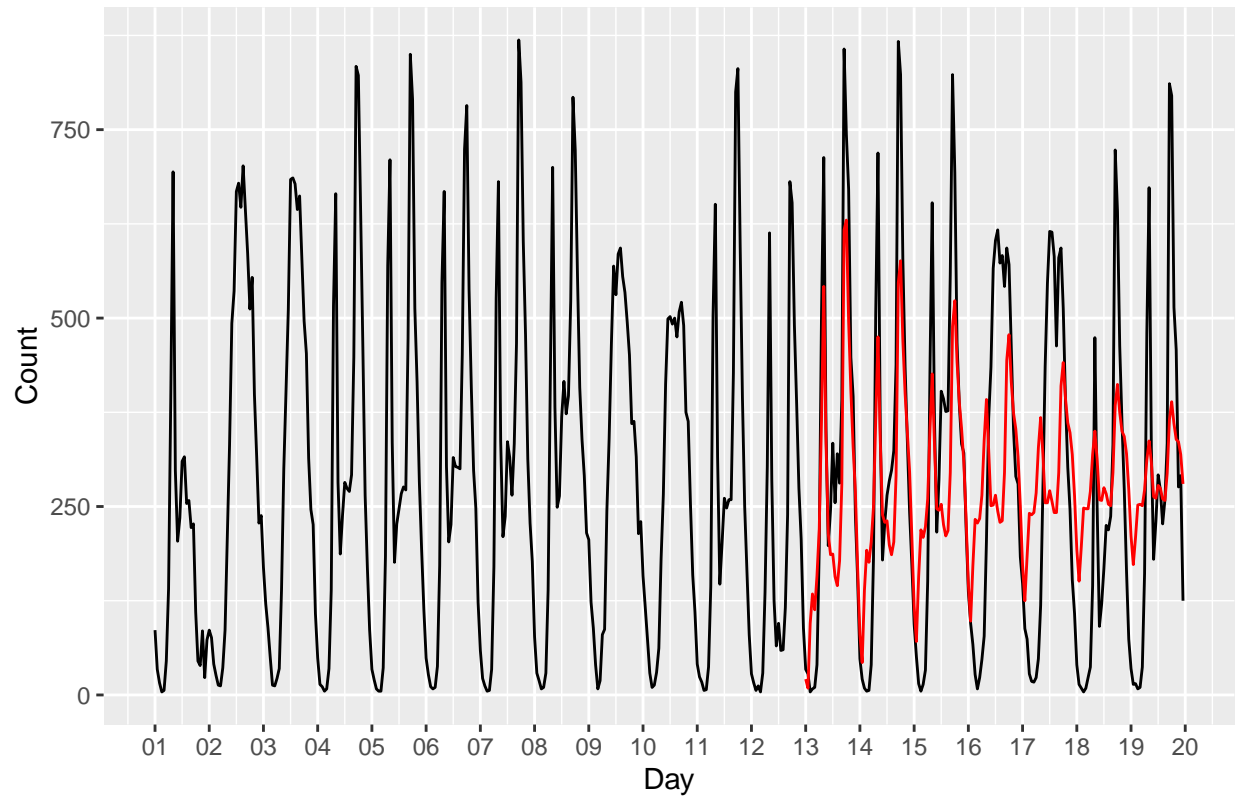


3 Methods

3.1 ARMA Model

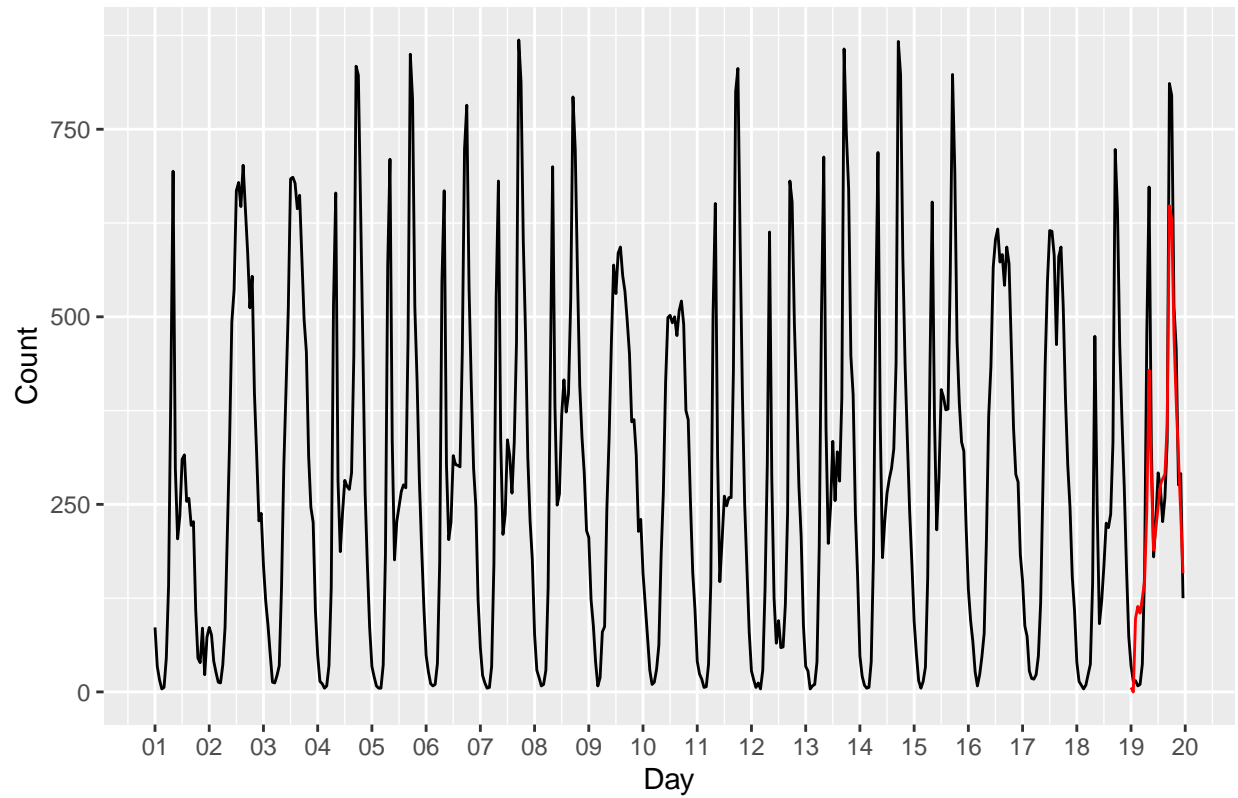
Warning: Removed 288 row(s) containing missing values (geom_path).

7 Day Forecast (ARMA)



Warning: Removed 432 row(s) containing missing values (geom_path).

1 Day Forecast (ARMA)

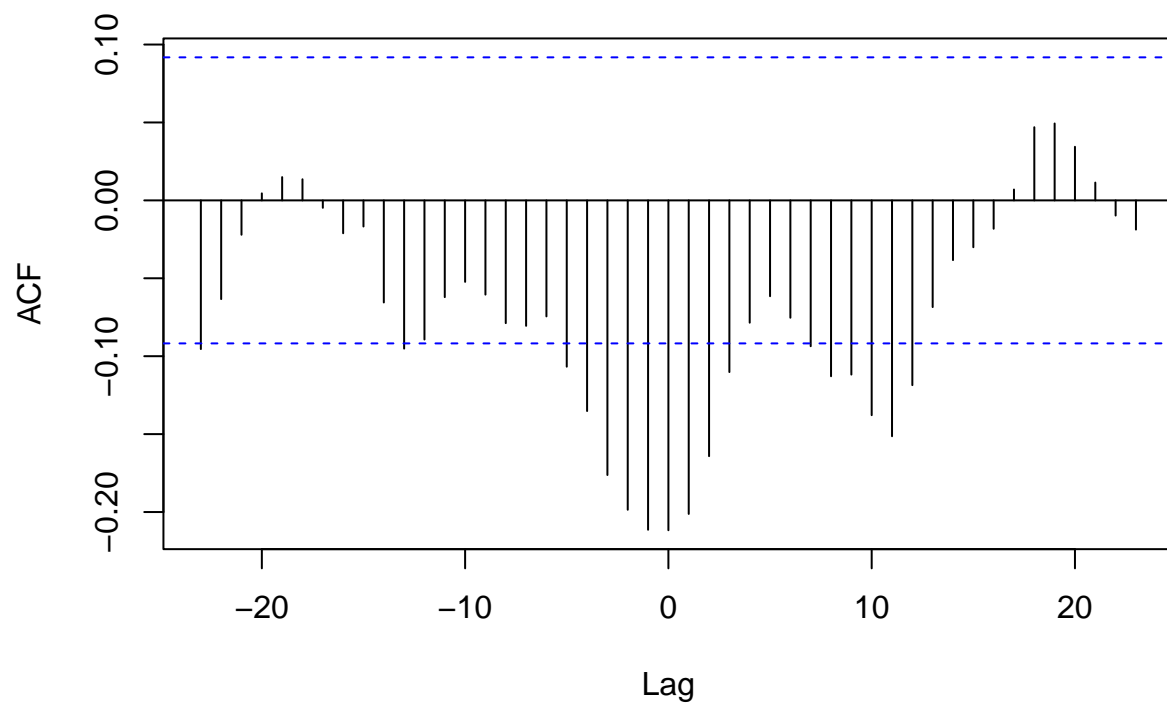


| Feature 1 | Feature 2 | Correlation Coefficient |
|------------|------------|-------------------------|
| temp | atemp | 0.9849481 |
| registered | count | 0.9709481 |
| casual | count | 0.6904136 |
| casual | registered | 0.4972497 |
| temp | casual | 0.4670971 |
| atemp | casual | 0.4620665 |
| temp | count | 0.3944536 |
| atemp | count | 0.3897844 |
| temp | registered | 0.3185713 |
| atemp | registered | 0.3146354 |
| windspeed | count | 0.1013695 |
| humidity | registered | -0.2654579 |
| humidity | count | -0.3173715 |
| humidity | windspeed | -0.3186070 |
| humidity | casual | -0.3481869 |

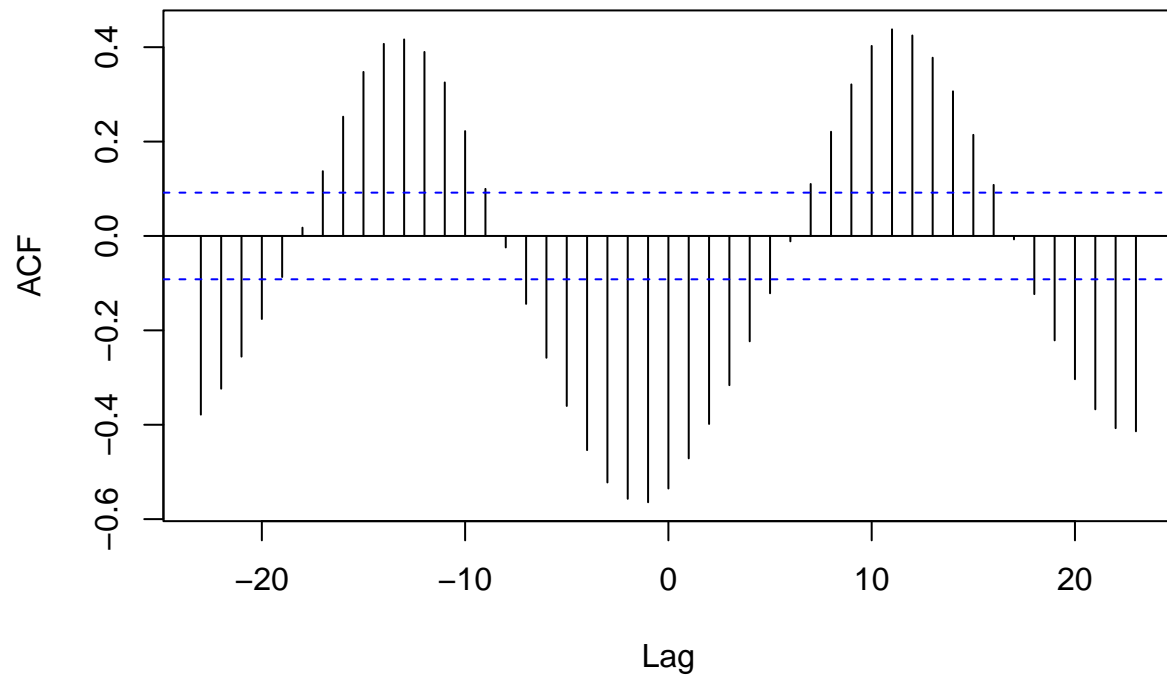
3.2 Vector Auto-Regressive (VAR) Model



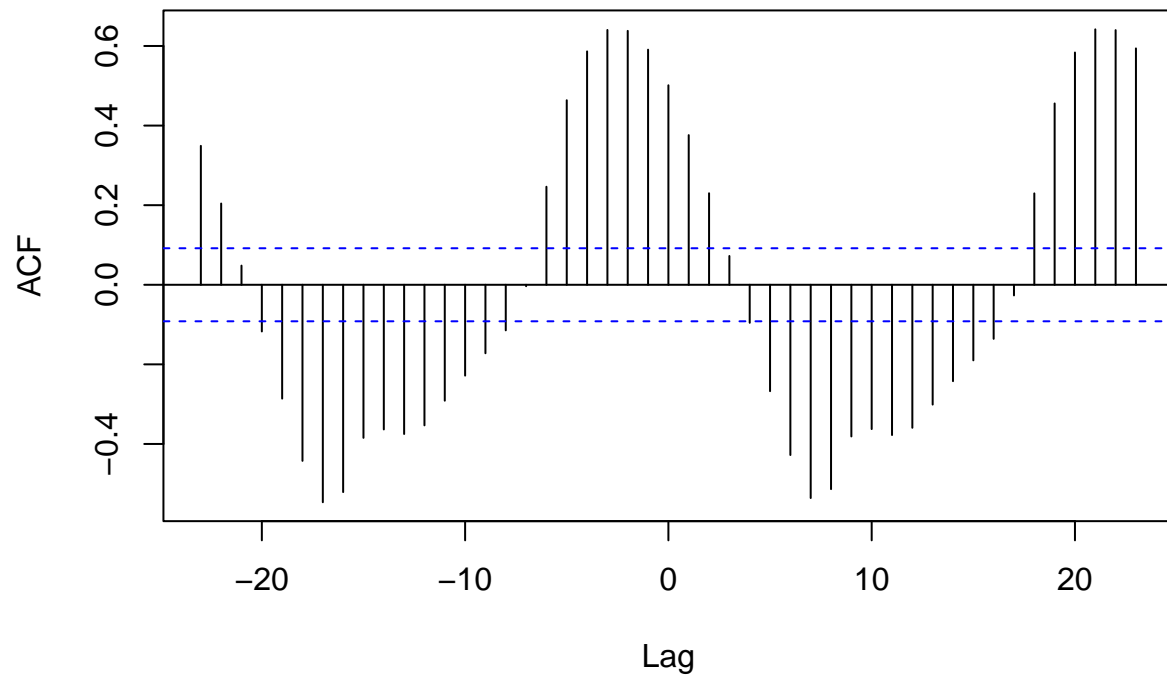
train.2012.june\$count & train.2012.june\$weather



train.2012.june\$count & train.2012.june\$humidity



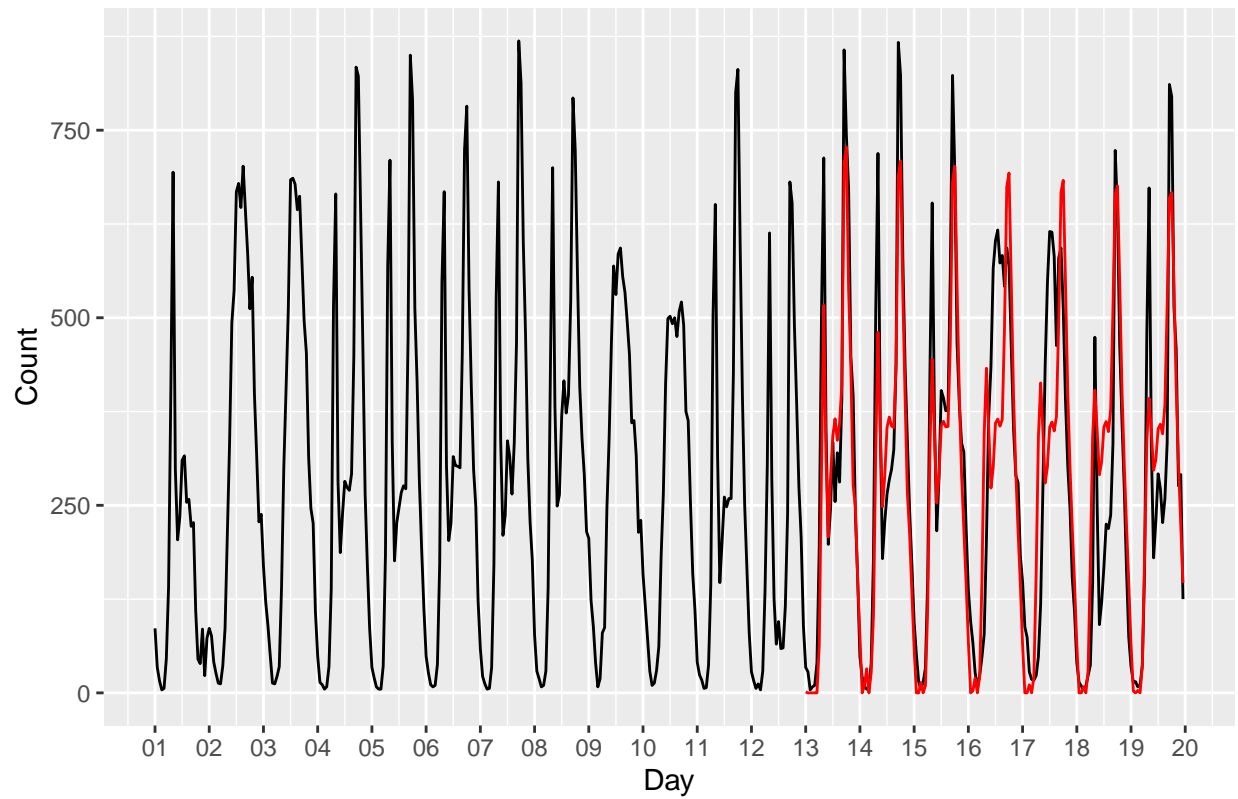
train.2012.june\$count & train.2012.june\$hour



3.2.1 7 Day Forecast

```
## Warning: Removed 288 row(s) containing missing values (geom_path).
```

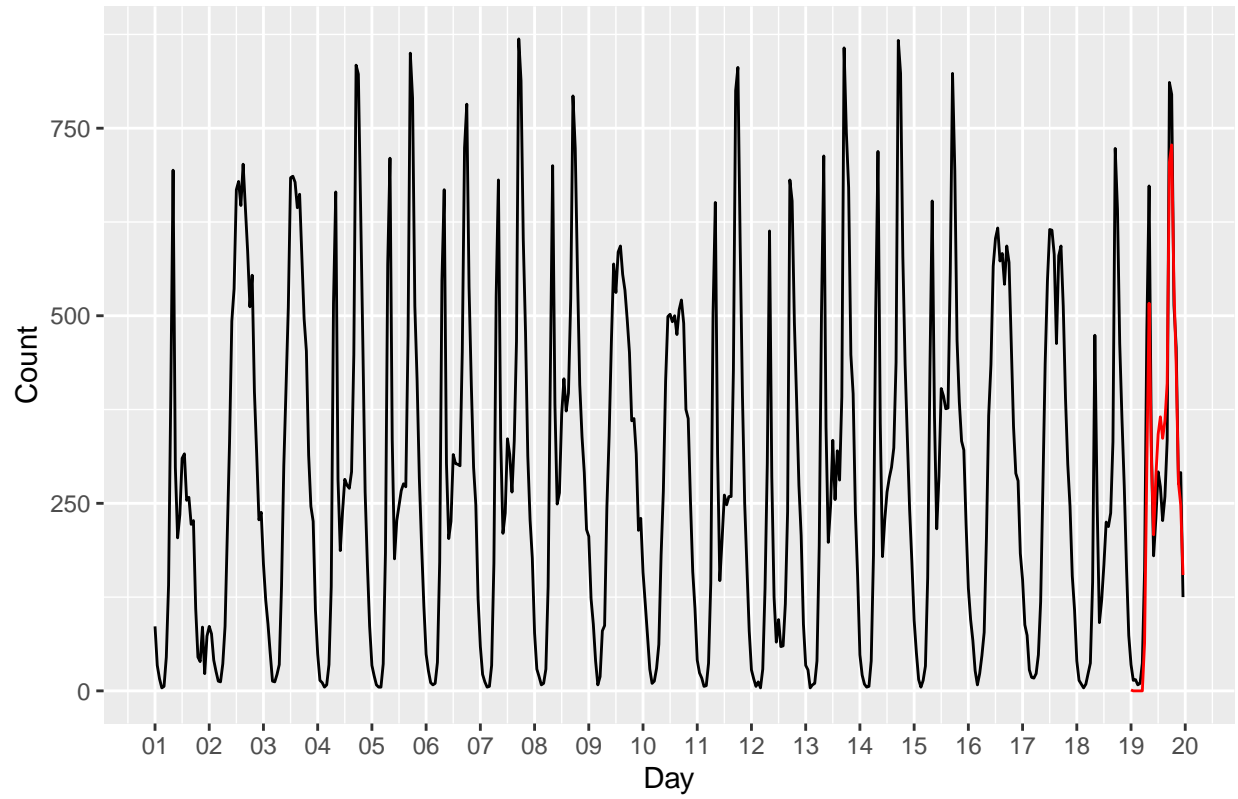
7 Day Forecast (VAR)



3.2.2 1 Day Forecast

```
## Warning: Removed 432 row(s) containing missing values (geom_path).
```

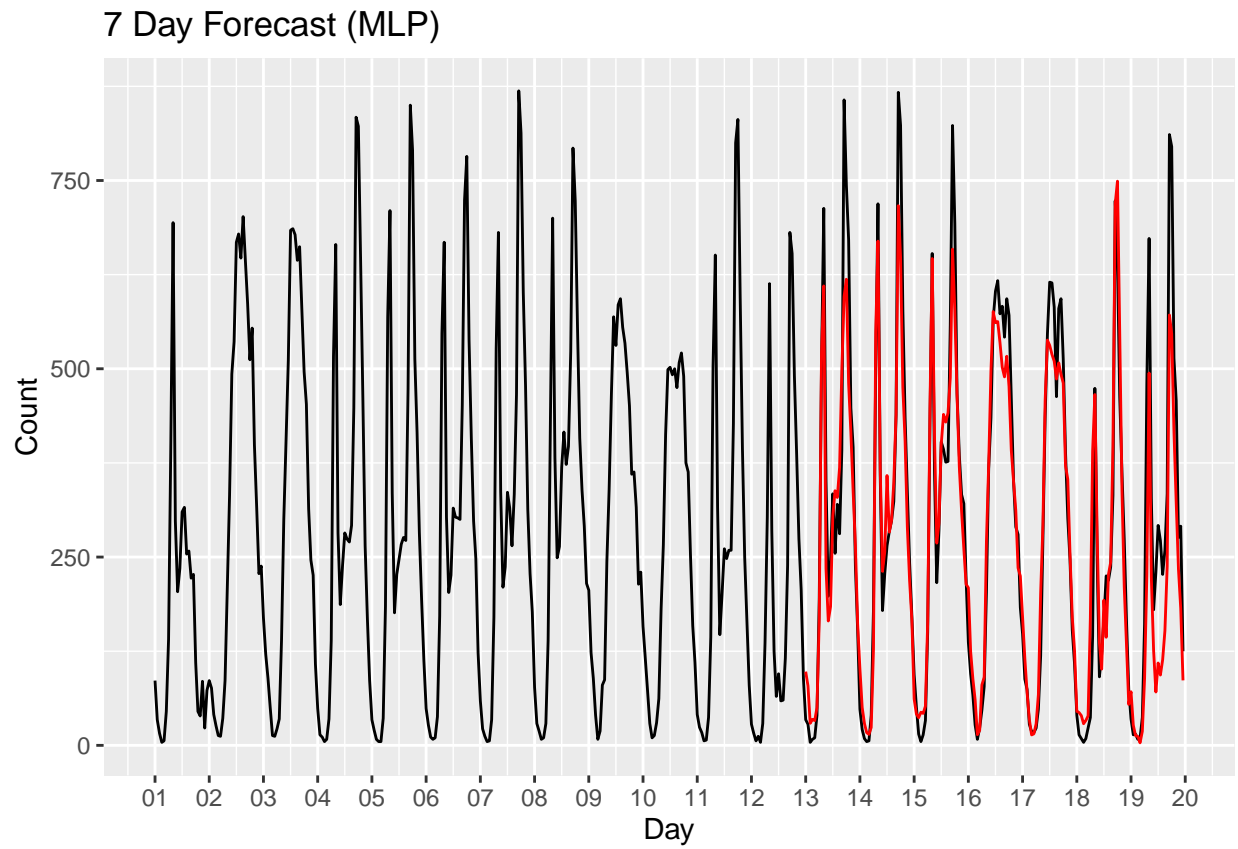
1 Day Forecast (VAR)



3.3 Neural Network Model

3.3.1 7 Day Forecast

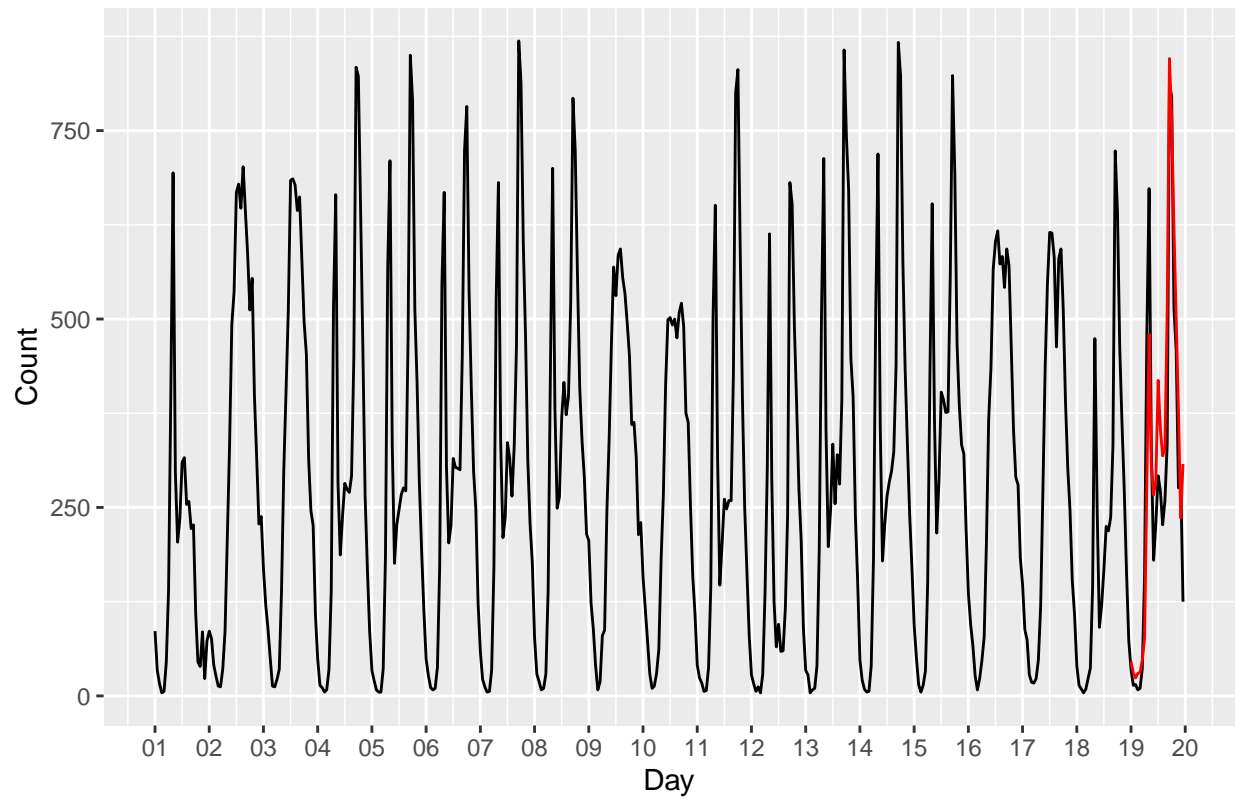
Warning: Removed 288 row(s) containing missing values (geom_path).



3.3.2 1 Day Forecast

```
## Warning: Removed 432 row(s) containing missing values (geom_path).
```

1 Day Forecast (MLP)



3.4 Ensemble Model

3.4.1 7 Day Forecast

| | Actual | Predicted (ARMA) | Predicted (VAR) | Predicted (MLP) | Predicted (Ensemble) |
|-----|--------|------------------|-----------------|-----------------|----------------------|
| 289 | 34 | 21 | 1 | 98 | 50 |
| 290 | 28 | 9 | 0 | 79 | 40 |
| 291 | 4 | 95 | 0 | 29 | 15 |
| 292 | 8 | 134 | 0 | 35 | 17 |
| 293 | 10 | 113 | 0 | 33 | 16 |
| 294 | 40 | 158 | 0 | 50 | 25 |

3.4.2 1 Day Forecast

| | Actual | Predicted (ARMA) | Predicted (VAR) | Predicted (MLP) | Predicted (Ensemble) |
|-----|--------|------------------|-----------------|-----------------|----------------------|
| 433 | 35 | 6 | 1 | 46 | 23 |
| 434 | 14 | 0 | 0 | 31 | 15 |
| 435 | 15 | 98 | 0 | 24 | 12 |
| 436 | 8 | 114 | 0 | 30 | 15 |
| 437 | 10 | 105 | 0 | 31 | 16 |
| 438 | 37 | 125 | 0 | 48 | 24 |

4 Results

4.1 7 Day Forecast

4.1.1 ASE

[Make a Table]

4.1.2 RMSE

[Make a table]

4.2 1 Day Forecast

4.2.1 ASE

[Make a Table]

4.2.2 RMSE

[Make a table]

5 Appendix

5.1 Solution One

5.2 Solution Two