

R Notebook

Introduction

Wildfires in Canada are a significant threat to ecosystems, human safety, and property, necessitating a comprehensive understanding of the factors that influence their behavior. Although the prevalence of forest fires varies year to year, there has been an observed trend over the past years indicating an overall increase in the occurrence of forest fires. There is also evidence of an increase in severe forest fires in recent years, compared to the last few decades¹.

Part of our motivation for our questions is aimed towards looking at predicting the size and spread rate of fires. The 2023 and 2024 fire seasons have been some of the worst on record in terms of area burned. Being able to predict wildfire sizes may help in allocations of resources to fight fires. As instances such as Fort McMurray and Jasper become more common with populated areas finding themselves in the way of these fires understanding spread rates of fires may be important to inform evacuation decisions and keep more people safe.

The main objective of our project is to examine multiple variables related to forest fires, to determine if they reduce or increase the severity of forest fires. Based on this information we can make suggestions to help decrease the increasing threats of forest fires.

Objective Questions

To answer our main objective, we examine four main questions:

1. Explore the relationship between wind speed and fire spread rate. Understanding this relationship can inform firefighting strategies and preparedness efforts.
2. Examine the relationship between temperature and fire spread rate. Analyzing this relationship will provide insights into how varying temperature levels affect wildfire behavior.
3. Examine the relationship between temperature and fire spread rate. Analyzing this relationship will provide insights into how varying temperature levels affect wildfire behavior.
4. Examine whether fire size relates to the weather conditions when the fire starts.

Before any analyses, we want to make sure to load all appropriate libraries, as well as the data set.

```
library(mosaic)

## Registered S3 method overwritten by 'mosaic':
##   method           from
##   fortify.SpatialPolygonsDataFrame ggplot2

##
## The 'mosaic' package masks several functions from core packages in order to add
## additional features. The original behavior of these functions should not be affected by this.
```

```

## 
## Attaching package: 'mosaic'

## The following objects are masked from 'package:dplyr':
## 
##     count, do, tally

## The following object is masked from 'package:Matrix':
## 
##     mean

## The following object is masked from 'package:ggplot2':
## 
##     stat

## The following objects are masked from 'package:stats':
## 
##     binom.test, cor, cor.test, cov, fivenum, IQR, median, prop.test,
##     quantile, sd, t.test, var

## The following objects are masked from 'package:base':
## 
##     max, mean, min, prod, range, sample, sum

library(dplyr)
library(ggplot2)
library(e1071)
library(leaflet)

```

```

fire_data<-read.csv("https://raw.githubusercontent.com/aaronngelf/data602-data/refs/heads/main/fp-historical-wildfire-data.csv")
#We have also include the dataset in our submission, in case there is an error accessing the URL.

```

Question 1 - What is the Relationship Between Wind Speed and Fire Spread Rate

To examine the relationship between wind speed and fire spread rate, we can perform a few visual functions, to get an idea of the dataset itself. It is also important to note that data dictionary provided should be used to help interpret the columns based on their names, as well as what the values represent. The data dictionary can be found at <https://open.alberta.ca/dataset/a221e7a0-4f46-4be7-9c5a-e29de9a3447e/resource/1b635b8b-a937-4be4-857e-8aeeff77365d2/download/fp-historical-wildfire-data-dictionary-2006-2023.pdf>.

```

head(fire_data)

##   fire_year fire_number fire_name current_size size_class
## 1      2006       PWF001      <NA>        0.10         A
## 2      2006       EWF002      <NA>        0.20         B
## 3      2006       EWF001      <NA>        0.50         B
## 4      2006       EWF003      <NA>        0.01         A
## 5      2006       PWF002      <NA>        0.10         A
## 6      2006       CWF001      <NA>        0.20         B
##   fire_location_latitude fire_location_longitude   fire_origin

```

```

## 1      56.24996      -117.1820      Private Land
## 2      53.60637      -115.9157      Provincial Land
## 3      53.61093      -115.5943      Provincial Land
## 4      53.60887      -115.6095      Provincial Land
## 5      56.24996      -117.0502      Provincial Land
## 6      51.15293      -115.0346      Indian Reservation
##   general_cause_desc industry_identifier_desc      responsible_group_desc
## 1      Resident          <NA>             Resident
## 2      Incendiary        <NA>            Others (explain in remarks)
## 3      Incendiary        <NA>            Others (explain in remarks)
## 4      Incendiary        <NA>            Others (explain in remarks)
## 5      Other Industry    Waste Disposal     Employees
## 6      Resident          <NA>             Resident
##   activity_class      true_cause  fire_start_date det_agent_type det_agent
## 1      Grass   Permit Related 2006-04-02 12:00      UNP      310
## 2      Lighting Fires Arson Suspected 2006-04-03 12:10      UNP      310
## 3      Lighting Fires Arson Suspected 2006-04-03 12:15      UNP      310
## 4      Lighting Fires Arson Suspected 2006-04-03 12:10      UNP      PUB
## 5      Refuse   Permit Related 2006-04-03 17:00      UNP      LFS
## 6      Unclassified      Unsafe Fire 2006-04-02 14:25      UNP      310
##   discovered_date discovered_size      reported_date dispatched_resource
## 1          <NA>           NA 2006-04-02 20:46      FPD Staff
## 2          <NA>           NA 2006-04-03 12:27      FPD Staff
## 3          <NA>           NA 2006-04-03 12:36      FPD Staff
## 4          <NA>           NA 2006-04-03 13:23      FPD Staff
## 5 2006-04-03 19:11          NA 2006-04-03 19:12      FPD Staff
## 6 2006-04-02 14:27          NA 2006-04-02 14:30      FPD Staff
##   dispatch_date start_for_fire_date assessment_resource assessment_datetime
## 1 2006-04-02 21:10      2006-04-02 21:20      IA Forces 2006-04-02 22:00
## 2 2006-04-03 12:33      2006-04-03 12:35      IA Forces 2006-04-03 13:20
## 3 2006-04-03 12:36      2006-04-03 12:42      IA Forces 2006-04-03 13:23
## 4 2006-04-03 13:50      2006-04-03 13:50      IA Forces 2006-04-03 14:08
## 5 2006-04-03 19:19      2006-04-03 19:22      Other   2006-04-03 19:57
## 6 2006-04-02 14:40      2006-04-02 14:45      IA Forces 2006-04-02 16:00
##   assessment_hectares fire_spread_rate fire_type fire_position_on_slope
## 1          0.01          0.0 Surface       Flat
## 2          0.20          0.0 Surface       Lower 1/3
## 3          0.50          0.0 Surface       Bottom
## 4          0.01          0.0 Surface       Flat
## 5          0.10          0.1 Surface       Flat
## 6          0.20          0.0 Surface       Flat
##   weather_conditions_over_fire temperature relative_humidity wind_direction
## 1          Clear          18          10          SW
## 2          Clear          12          22          SW
## 3          Clear          12          22          SW
## 4          Clear          12          22          SW
## 5          Clear          6           37          SW
## 6          Clear          11          32           S
##   wind_speed fuel_type initial_action_by ia_arrival_at_fire_date ia_access
## 1          2      01a Land Owner          <NA>      <NA>
## 2          10     01a Fire Department      <NA>      <NA>
## 3          10     01a Fire Department      <NA>      <NA>
## 4          10     01b Industry          <NA>      <NA>
## 5          2      <NA> Fire Department      <NA>      <NA>

```

```

## 6      20      01b   Fire Department          <NA>      <NA>
##   fire_fighting_start_date fire_fighting_start_size bucketing_on_fire
## 1             <NA>           NA           <NA>
## 2             <NA>           NA           <NA>
## 3             <NA>           NA           <NA>
## 4             <NA>           NA           <NA>
## 5             <NA>           NA           <NA>
## 6             <NA>           NA           <NA>
##   distance_from_water_source first_bucket_drop_date     bh_fs_date
## 1                   NA           <NA> 2006-04-02 22:00
## 2                   NA           <NA> 2006-04-03 13:20
## 3                   NA           <NA> 2006-04-03 13:23
## 4                   NA           <NA> 2006-04-03 14:08
## 5                   NA           <NA> 2006-04-03 19:57
## 6                   NA           <NA> 2006-04-02 16:00
##   bh_hectares      uc_fs_date uc_hectares      to_fs_date to_hectares
## 1    0.01 2006-04-02 22:00    0.01        <NA>       NA
## 2    0.20 2006-04-03 13:20    0.20        <NA>       NA
## 3    0.50 2006-04-03 13:23    0.50        <NA>       NA
## 4    0.01 2006-04-03 14:08    0.01        <NA>       NA
## 5    0.10 2006-04-03 20:19    0.10 2006-04-03 20:20    0.1
## 6    0.20 2006-04-02 16:00    0.20        <NA>       NA
##   ex_fs_date ex_hectares
## 1 2006-04-03 10:20    0.10
## 2 2006-04-03 14:00    0.20
## 3 2006-04-03 15:00    0.50
## 4 2006-04-03 15:05    0.01
## 5 2006-04-05 10:18    0.10
## 6 2006-04-03 18:00    0.20

```

```
colnames(fire_data)
```

## [1] "fire_year"	"fire_number"
## [3] "fire_name"	"current_size"
## [5] "size_class"	"fire_location_latitude"
## [7] "fire_location_longitude"	"fire_origin"
## [9] "general_cause_desc"	"industry_identifier_desc"
## [11] "responsible_group_desc"	"activity_class"
## [13] "true_cause"	"fire_start_date"
## [15] "det_agent_type"	"det_agent"
## [17] "discovered_date"	"discovered_size"
## [19] "reported_date"	"dispatched_resource"
## [21] "dispatch_date"	"start_for_fire_date"
## [23] "assessment_resource"	"assessment_datetime"
## [25] "assessment_hectares"	"fire_spread_rate"
## [27] "fire_type"	"fire_position_on_slope"
## [29] "weather_conditions_over_fire"	"temperature"
## [31] "relative_humidity"	"wind_direction"
## [33] "wind_speed"	"fuel_type"
## [35] "initial_action_by"	"ia_arrival_at_fire_date"
## [37] "ia_access"	"fire_fighting_start_date"
## [39] "fire_fighting_start_size"	"bucketing_on_fire"
## [41] "distance_from_water_source"	"first_bucket_drop_date"
## [43] "bh_fs_date"	"bh_hectares"

```

## [45] "uc_fs_date"                      "uc_hectares"
## [47] "to_fs_date"                       "to_hectares"
## [49] "ex_fs_date"                       "ex_hectares"

```

Based on initial inspection, we are only interested in a few columns, therefore we will create a new data frame, focusing on variables that will help examine the relationship between wind speed and fire spread rate.

```

fire_data_1=fire_data %>%
  select(wind_speed,fire_spread_rate)
sum(is.na(fire_data_1))

```

```
## [1] 5575
```

```
sum(sapply(fire_data_1[c("fire_spread_rate","wind_speed")],is.na))
```

```
## [1] 5575
```

#Remove rows with NA values. We won't include fuel_type for this part, as we are not initially concerned with fuel type.

```

fire_clean=na.omit(fire_data_1[,c("wind_speed","fire_spread_rate")])
sum(is.na(fire_clean))

```

```
## [1] 0
```

```
summary(fire_clean)
```

```

##      wind_speed    fire_spread_rate
##  Min.   : 0.000   Min.   :-1.0000
##  1st Qu.: 3.000   1st Qu.: 0.0000
##  Median : 6.000   Median : 0.0000
##  Mean   : 8.813   Mean   : 0.8962
##  3rd Qu.:12.000   3rd Qu.: 1.0000
##  Max.   :90.000   Max.   :100.0000

```

Based on our summary statistics, we can see that the minimum value for fire_spread_rate is -1. This seems peculiar, and warrants a bit of further investigation, therefore we will go back to the original data set and inspect any rows where fire_spread_rate is -1.

```

negative_fire_spread_data <- fire_data[!is.na(fire_data$fire_spread_rate) & fire_data$fire_spread_rate == -1]
head(negative_fire_spread_data)

```

	fire_year	fire_number	fire_name	current_size	size_class	
##	12962	2014	RWF022	<NA>	0.20	B
##	13717	2015	HWF100	<NA>	0.02	A
##	18213	2017	MWF091	<NA>	0.10	A
##	20474	2020	CWF038	<NA>	0.01	A
##	20778	2019	SWF063	<NA>	0.01	A
##	21355	2019	SWF092	<NA>	0.04	A
##			fire_location_latitude	fire_location_longitude		fire_origin
##	12962		52.37868	-115.6254		Provincial Land
##	13717		58.48312	-114.4696		Indian Reservation

```

## 18213      56.83563      -111.7322 Provincial Land
## 20474      51.10135      -115.3091 Provincial Land
## 20778      55.94107      -113.7807 Indian Reservation
## 21355      56.79307      -114.7125 Provincial Land
## general_cause_desc industry_identifier_desc responsible_group_desc
## 12962      Undetermined <NA> <NA>
## 13717      Incendiary <NA> <NA>
## 18213      Recreation <NA> Others (explain in remarks)
## 20474      Recreation <NA> Campers
## 20778      Incendiary <NA> <NA>
## 21355      Lightning <NA> <NA>
## activity_class true_cause fire_start_date det_agent_type
## 12962      <NA> <NA> 2014-05-24 4:00 LKT
## 13717      Unclassified <NA> 2015-05-18 10:48 LKT
## 18213      OHV Operation Burning Substance 2017-09-16 16:38 AIR
## 20474 Cooking and Warming Unsafe Fire 2020-06-27 18:00 UNP
## 20778      Arson <NA> 2019-05-22 7:00 UNP
## 21355      <NA> <NA> 2019-06-02 15:40 UNP
## det_agent discovered_date discovered_size reported_date
## 12962      RA 2014-05-24 7:28 NA 2014-05-24 7:32
## 13717      FG 2015-05-18 10:48 NA 2015-05-18 10:50
## 18213      HAC 2017-09-16 16:45 NA 2017-09-16 16:45
## 20474      310 <NA> NA 2020-06-28 10:09
## 20778      LFS <NA> NA 2019-05-22 7:14
## 21355      PUB 2019-06-02 15:50 NA 2019-06-02 15:50
## dispatched_resource dispatch_date start_for_fire_date
## 12962      HAC 2014-05-24 8:14 2014-05-24 8:29
## 13717      FPD Staff 2015-05-18 11:00 2015-05-18 11:00
## 18213      HAC 2017-09-16 16:45 2017-09-16 16:45
## 20474      HAC 2020-06-28 14:30 2020-06-28 15:15
## 20778      HAC 2019-05-22 9:27 2019-05-22 9:49
## 21355      HAC 2019-06-02 15:59 2019-06-02 16:00
## assessment_resource assessment_datetime assessment_hectares
## 12962      IA Forces 2014-05-24 10:35 0.20
## 13717      Other 2015-05-18 11:16 0.02
## 18213      IA Forces 2017-09-16 16:45 0.10
## 20474      IA Forces 2020-06-28 18:00 0.01
## 20778      IA Forces 2019-05-22 10:06 0.01
## 21355      IA Forces 2019-06-02 16:05 0.04
## fire_spread_rate fire_type fire_position_on_slope
## 12962      -1 Ground Flat
## 13717      -1 Surface Flat
## 18213      -1 Surface Bottom
## 20474      -1 Surface Bottom
## 20778      -1 Ground Flat
## 21355      -1 Surface Flat
## weather_conditions_over_fire temperature relative_humidity wind_direction
## 12962      Rainshowers 10.5 73 N
## 13717      Clear 20.0 22 SE
## 18213      Clear 15.6 32 S
## 20474      Cloudy 11.0 75 W
## 20778      Clear 17.0 30 E
## 21355      Cloudy 18.0 41 W
## wind_speed fuel_type initial_action_by ia_arrival_at_fire_date

```

```

## 12962      1      S1      Industry          <NA>
## 13717     10     D1      FPD Staff  2015-05-18 11:14
## 18213     20     01b      HAC   2017-09-16 16:51
## 20474      2     <NA>      HAC   2020-06-28 17:53
## 20778      5      M2      HAC   2019-05-22 10:06
## 21355     15     C2      HAC   2019-06-02 16:05
##           ia_access fire_fighting_start_date fire_fighting_start_size
## 12962          <NA>                  <NA>             NA
## 13717          <NA>  2015-05-18 11:16            0.02
## 18213 Conventional R/W  2017-09-16 16:57            0.10
## 20474      Ground  2020-06-28 18:00            0.01
## 20778      Ground  2019-05-22 10:13            0.01
## 21355 Conventional R/W  2019-06-02 16:10            1.00
##           bucketing_on_fire distance_from_water_source first_bucket_drop_date
## 12962          <NA>                      NA          <NA>
## 13717          Y                         0.2  2015-05-18 11:16
## 18213          N                         NA          <NA>
## 20474          N                         NA          <NA>
## 20778          N                         NA          <NA>
## 21355          Y                         0.1  2019-06-02 16:25
##           bh_fs_date bh_hectares      uc_fs_date uc_hectares to_fs_date
## 12962 2014-05-24 10:35        0.20 2014-05-24 11:40        0.20      <NA>
## 13717 2015-05-18 11:16        0.02 2015-05-18 11:50        0.02      <NA>
## 18213 2017-09-16 17:09        0.10 2017-09-16 17:55        0.20      <NA>
## 20474 2020-06-28 18:00        0.01 2020-06-28 18:00        0.01      <NA>
## 20778 2019-05-22 10:06        0.01 2019-05-22 10:06        0.01      <NA>
## 21355 2019-06-02 16:05        0.04 2019-06-02 19:21        0.04      <NA>
##           to_hectares ex_fs_date ex_hectares
## 12962          NA 2014-05-24 14:31        0.20
## 13717          NA 2015-05-18 13:00        0.02
## 18213          NA 2017-09-17 10:50        0.10
## 20474          NA 2020-06-28 19:56        0.01
## 20778          NA 2019-05-22 10:25        0.01
## 21355          NA 2019-06-02 19:50        0.04

```

Upon visual inspection there does not seem to be any pattern related to the fire_spread_rate being -1. Based on this, and the definition provided in the data dictionary, with fire_spread_rate being ‘The rate of spread of the wildfire at the time of initial assessment, capture in metres per minute’, we felt it was safe to remove these rows, as this is most likely an error with these entries. For the fire to have a negative spread rate, would mean that the fire is retreating instead of spreading, and given that this rate of spread is a measure of how fast the fire moves from a point of origin, this seems counter intuitive to how forest fires work. Given more time, we could reach out to the providers of the data, to try to clarify this area, but for the time being, and since there are only 6 data points, we will remove them.

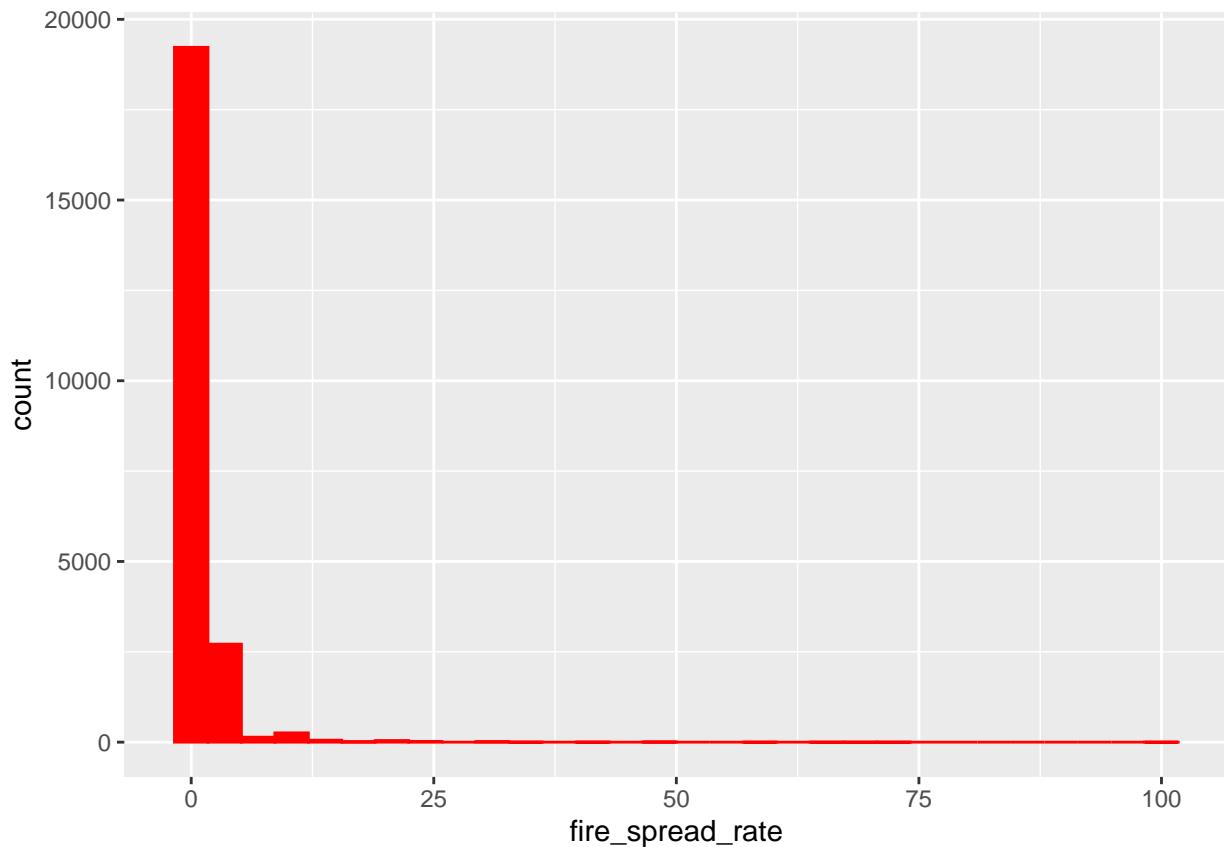
After we remove the rows with a fire spread rate of -1, we can plot the data for a preliminary visualization.

```

fire_clean_no_neg=fire_clean[fire_clean['fire_spread_rate']>=0,]
ggplot(fire_clean_no_neg, aes(x = fire_spread_rate)) +
  geom_histogram(color='red',fill='red')

```

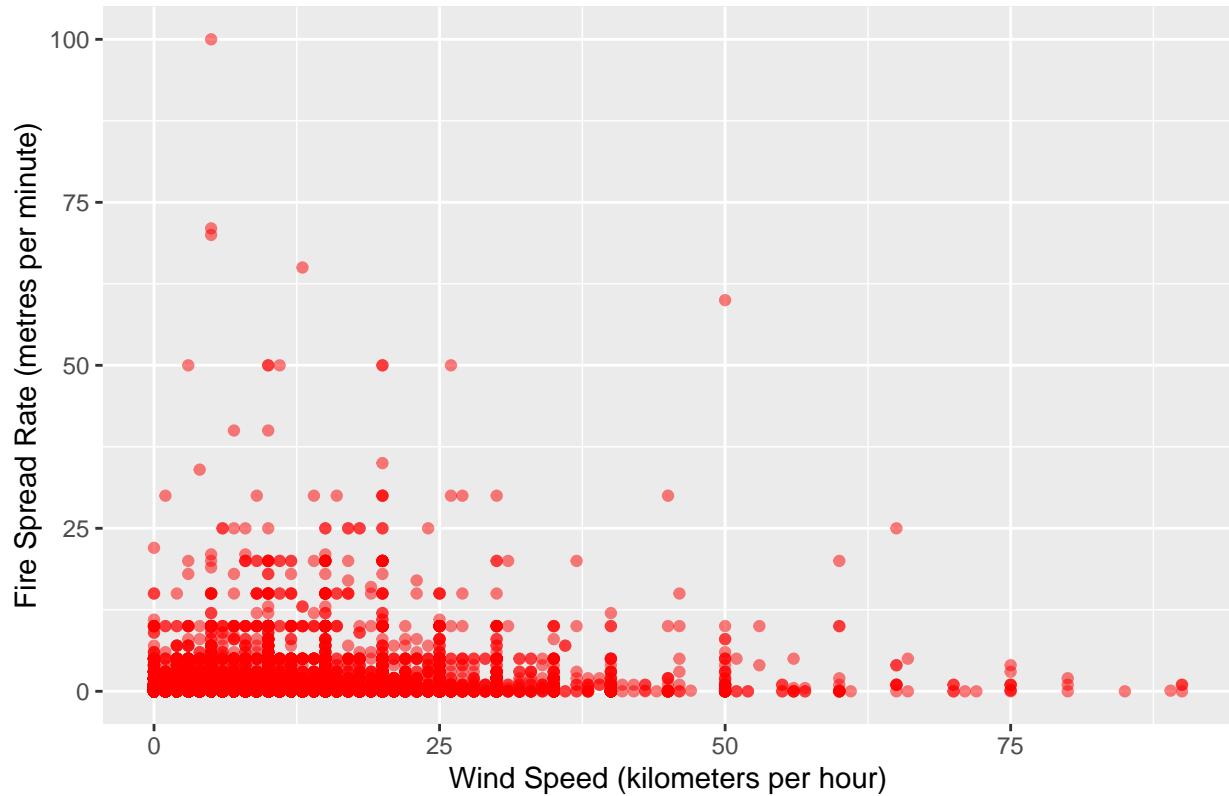
```
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```



Based on our histogram, we can see that the data for fire_spread_rate is heavily skewed.

```
fire_clean_no_neg=fire_clean[fire_clean['fire_spread_rate']>=0,]
ggplot(fire_clean_no_neg, aes(x = wind_speed, y = fire_spread_rate)) +
  geom_point(color='red',alpha = 0.5) +
  labs(title = "Relationship between Fire Spread Rate and Wind Speed",
       x = "Wind Speed (kilometers per hour)", # Replace with actual units if known
       y = "Fire Spread Rate (metres per minute)")
```

Relationship between Fire Spread Rate and Wind Speed



Initial inspection of the scatterplot is difficult to arrive to any meaningful conclusion without further analysis.

Additionally, we will look at the correlation coefficient between fire_spread_rate and wind_speed.

```
fire_corr=cor(fire_clean_no_neg,use="pairwise.complete.obs")
print(fire_corr)
```

```
##                  wind_speed fire_spread_rate
## wind_speed      1.0000000   0.1346716
## fire_spread_rate 0.1346716   1.0000000
```

Based on our output we can see a very weak positive relationship between fire spread rate and wind speed.

```
fire_no_neg_model=lm(fire_spread_rate ~ wind_speed, data = fire_clean_no_neg)

summary(fire_no_neg_model)
```

```
##
## Call:
## lm(formula = fire_spread_rate ~ wind_speed, data = fire_clean_no_neg)
##
## Residuals:
##    Min     1Q Median     3Q    Max
## -4.263 -0.863 -0.597  0.054 99.261
##
```

```

## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.531266  0.024815 21.41   <2e-16 ***
## wind_speed  0.041468  0.002035 20.38   <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.571 on 22478 degrees of freedom
## Multiple R-squared:  0.01814,    Adjusted R-squared:  0.01809
## F-statistic: 415.2 on 1 and 22478 DF,  p-value: < 2.2e-16

```

Intercept: The expected value of fire_spread_rate when wind_speed is zero is 0.53130. As our p-value is <0.05 , this indicates that we can reject the H_0 that $\beta_0=0$. Therefore, we accept the H_1 that $\beta_0 \neq 0$ and conclude that the intercept is statistically significant.

Slope: For each additional kilometer per hour in wind_speed, the fire_spread_rate is expected to increase by approximately 0.04150 meters per minute. As our p-value is <0.05 , this indicates that we can reject the H_0 that $\beta_1=0$. Therefore, we accept the H_1 that $\beta_1 \neq 0$ and conclude that there is a significant relationship between wind_speed and fire_spread_rate.

Based on our output table, the equation for our model can be written out as, $fire_spread_rate = 0.53130 + (0.04150 * wind_speed)$

Our R-squared value indicates that approximately 1.81% of the variance in fire_spread_rate is explained by wind_speed. This low value suggests that there are other factors affecting fire spread that are not included in our model.

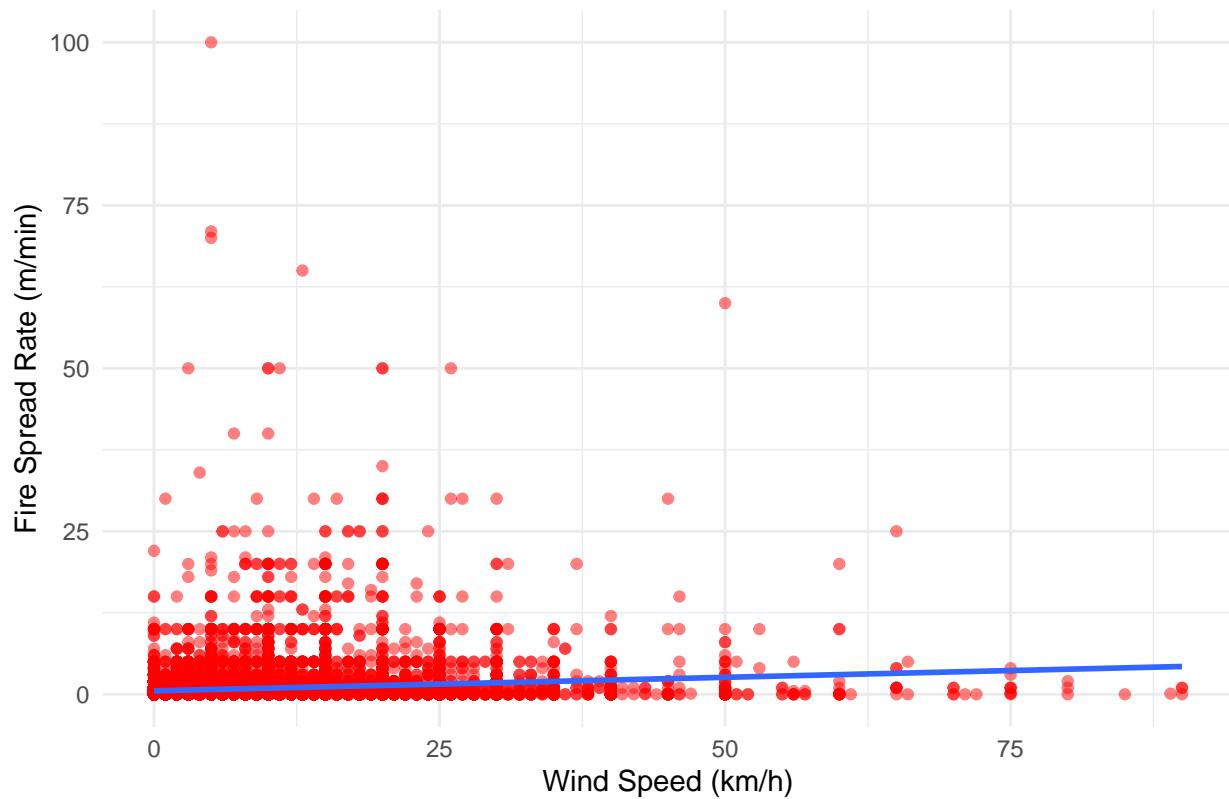
We can plot this model using the following code:

```

ggplot(fire_clean_no_neg, aes(x = wind_speed, y = fire_spread_rate)) +
  geom_point(alpha = 0.5,color='red') +
  stat_smooth(method = "lm", formula = y~x) + # Add regression line
  labs(title = "Relationship between Fire Spread Rate and Wind Speed",
       x = "Wind Speed (km/h)",
       y = "Fire Spread Rate (m/min)") +
  theme_minimal()

```

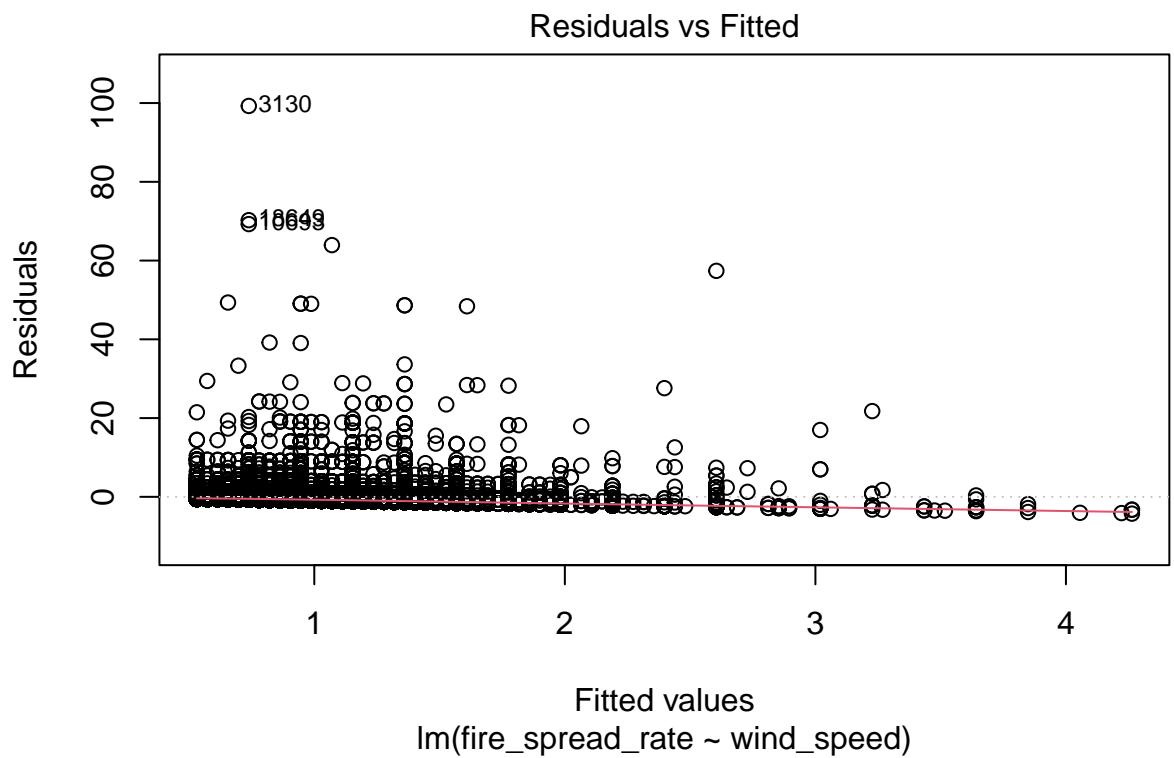
Relationship between Fire Spread Rate and Wind Speed



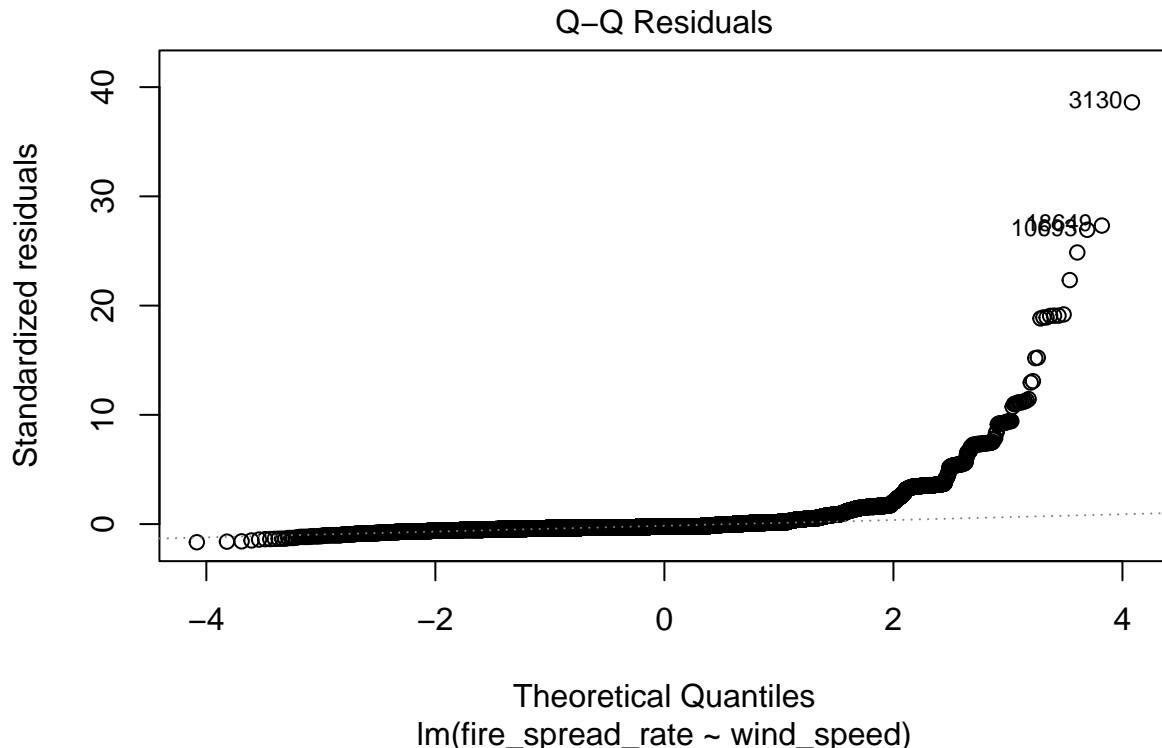
From our output, we can see a weak relationship between wind_speed and fire_spread_rate. as suggested by our correlation statistics.

To determine whether the assumptions of independency and normality are met, we can plot the residual and QQ plots.

```
#Residual plot  
plot(fire_no_neg_model, which =1)
```



```
#QQ-plot
plot(fire_no_neg_model, which =2)
```



For our residual plot we see a large cluster of points on the upper left side of the figure, as well as some outliers. For our QQ plot, we see that the points stray off far from the line towards the right side of the figure. Based on these observation, we can suggest that both assumptions of independency and normality of residuals fails.

By failing both of these assumptions, it suggests issues in our model that can lead to unreliable results. Some potential solutions are to transform the data, or to include interaction terms.

Question 2 - What is the Relationship Between Temperature and Fire Spread Rate

In this project, we explored the relationship between temperature and fire spread rate in Canada. We visualized the distribution of fire spread rate and temperature, calculated the correlation coefficient, performed a linear regression analysis, and conducted a hypothesis test to determine whether the observed relationship is statistically significant. Additionally, we created a geospatial representation of fire spread rate along with temperature to better understand the spatial patterns and relationships between these variables.

The results of the hypothesis test indicate whether there is a statistically significant relationship between temperature and fire spread rate.

```
data=fire_data

# Filter out rows where Fire Spread Rate is negative
data<- data %>%
  filter(fire_spread_rate >= 0)
# Create a scatter plot
ggplot(data, aes(x = temperature, y = fire_spread_rate)) +
  geom_point(color = "red", size = 2) +
```

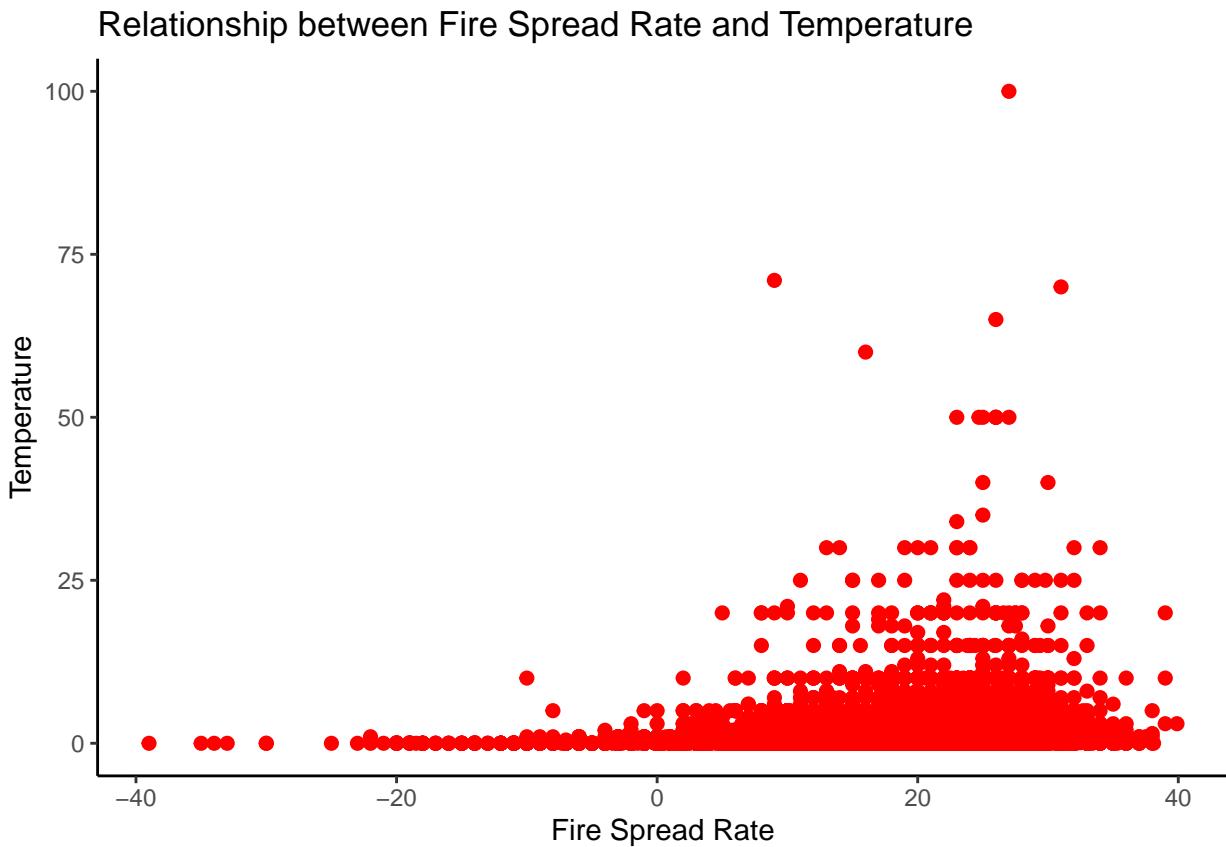
```

#geom_smooth(method = "lm", se = FALSE, color = "red")

labs(title = "Relationship between Fire Spread Rate and Temperature",
     x = "Fire Spread Rate",
     y = "Temperature") +
theme_classic()

## Warning: Removed 80 rows containing missing values or values outside the scale range
## ('geom_point()').

```



EDA

```

# Check the structure of the data
str(data)

## 'data.frame': 22562 obs. of 50 variables:
## $ fire_year           : int  2006 2006 2006 2006 2006 2006 2006 2006 2006 2006 ...
## $ fire_number         : chr  "PWF001" "EWF002" "EWF001" "EWF003" ...
## $ fire_name           : chr  NA NA NA NA ...
## $ current_size        : num  0.1 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ size_class          : chr  "A" "B" "B" "A" ...
## $ fire_location_latitude: num  56.2 53.6 53.6 53.6 56.2 ...

```

```

## $ fire_location_longitude : num -117 -116 -116 -116 -117 ...
## $ fire_origin : chr "Private Land" "Provincial Land" "Provincial Land" "Provincial ...
## $ general_cause_desc : chr "Resident" "Incendiary" "Incendiary" "Incendiary" ...
## $ industry_identifier_desc : chr NA NA NA NA ...
## $ responsible_group_desc : chr "Resident" "Others (explain in remarks)" "Others (explain in r ...
## $ activity_class : chr "Grass" "Lighting Fires" "Lighting Fires" "Lighting Fires" ...
## $ true_cause : chr "Permit Related" "Arson Suspected" "Arson Suspected" "Arson Su ...
## $ fire_start_date : chr "2006-04-02 12:00" "2006-04-03 12:10" "2006-04-03 12:15" "2006- ...
## $ det_agent_type : chr "UNP" "UNP" "UNP" "UNP" ...
## $ det_agent : chr "310" "310" "310" "PUB" ...
## $ discovered_date : chr NA NA NA NA ...
## $ discovered_size : num NA NA NA NA NA NA NA NA NA ...
## $ reported_date : chr "2006-04-02 20:46" "2006-04-03 12:27" "2006-04-03 12:36" "2006- ...
## $ dispatched_resource : chr "FPD Staff" "FPD Staff" "FPD Staff" "FPD Staff" ...
## $ dispatch_date : chr "2006-04-02 21:10" "2006-04-03 12:33" "2006-04-03 12:36" "2006- ...
## $ start_for_fire_date : chr "2006-04-02 21:20" "2006-04-03 12:35" "2006-04-03 12:42" "2006- ...
## $ assessment_resource : chr "IA Forces" "IA Forces" "IA Forces" "IA Forces" ...
## $ assessment_datetime : chr "2006-04-02 22:00" "2006-04-03 13:20" "2006-04-03 13:23" "2006- ...
## $ assessment_hectares : num 0.01 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ fire_spread_rate : num 0 0 0 0.1 0 0 0 0 0 ...
## $ fire_type : chr "Surface" "Surface" "Surface" "Surface" ...
## $ fire_position_on_slope : chr "Flat" "Lower 1/3" "Bottom" "Flat" ...
## $ weather_conditions_over_fire: chr "Clear" "Clear" "Clear" "Clear" ...
## $ temperature : num 18 12 12 12 6 11 11 16 11 11 ...
## $ relative_humidity : int 10 22 22 22 37 32 25 17 35 44 ...
## $ wind_direction : chr "SW" "SW" "SW" "SW" ...
## $ wind_speed : int 2 10 10 10 2 20 10 2 7 4 ...
## $ fuel_type : chr "01a" "01a" "01a" "01b" ...
## $ initial_action_by : chr "Land Owner" "Fire Department" "Fire Department" "Industry" ...
## $ ia_arrival_at_fire_date : chr NA NA NA NA ...
## $ ia_access : chr NA NA NA NA ...
## $ fire_fighting_start_date : chr NA NA NA NA ...
## $ fire_fighting_start_size : num NA NA NA NA NA NA NA NA 0.01 NA 0.6 ...
## $ bucketing_on_fire : chr NA NA NA NA ...
## $ distance_from_water_source : num NA NA NA NA NA NA NA NA NA ...
## $ first_bucket_drop_date : chr NA NA NA NA ...
## $ bh_fs_date : chr "2006-04-02 22:00" "2006-04-03 13:20" "2006-04-03 13:23" "2006- ...
## $ bh_hectares : num 0.01 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ uc_fs_date : chr "2006-04-02 22:00" "2006-04-03 13:20" "2006-04-03 13:23" "2006- ...
## $ uc_hectares : num 0.01 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ to_fs_date : chr NA NA NA NA ...
## $ to_hectares : num NA NA NA NA 0.1 NA NA 0.01 0.2 NA ...
## $ ex_fs_date : chr "2006-04-03 10:20" "2006-04-03 14:00" "2006-04-03 15:00" "2006- ...
## $ ex_hectares : num 0.1 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...

```

```

# View unique values in Temperature and FireSpreadRate
unique(data$temperature)

```

```

## [1] 18.0 12.0 6.0 11.0 16.0 28.0 26.0 25.0 35.0 15.0 10.0 13.2
## [13] 27.0 20.0 17.0 22.0 24.0 23.0 21.0 29.0 19.0 21.4 14.5 14.0
## [25] 33.0 31.0 32.0 4.0 24.5 30.0 27.5 22.5 21.5 6.5 9.0 13.0
## [37] 25.5 2.0 30.6 17.5 5.0 12.5 22.4 36.0 26.4 18.7 16.1 21.6
## [49] 16.5 19.5 7.0 24.6 -0.6 20.5 23.5 24.3 22.1 18.4 23.7 26.5
## [61] 8.0 15.6 22.8 12.8 13.5 29.5 14.2 8.3 11.5 8.5 13.3 17.6

```

```

## [73] 26.2 19.6 9.4 7.5 16.7 21.2 5.4 3.0 1.0 18.5 23.2 16.3
## [85] 24.8 26.7 19.8 31.5 25.6 28.2 28.7 20.2 22.7 17.3 30.8 24.7
## [97] 23.6 17.4 22.3 28.6 -18.0 0.1 -1.0 30.9 -8.0 -7.0 11.2 0.0
## [109] 19.4 -10.0 -5.0 6.2 11.7 -2.0 14.4 21.1 25.7 26.6 10.8 15.3
## [121] 0.2 -7.3 -4.0 7.6 8.9 -11.0 28.5 13.6 30.7 -6.0 -15.0 -3.0
## [133] 5.5 26.1 9.5 14.9 15.5 13.4 16.9 24.4 17.8 19.9 15.4 26.8
## [145] 25.4 21.8 18.2 27.2 -3.5 -12.0 -14.0 -13.0 20.9 2.5 14.6 12.1
## [157] 16.2 12.2 19.2 19.1 10.6 -9.0 8.2 6.6 20.6 17.7 3.2 20.7
## [169] 18.6 8.6 20.1 15.2 11.8 22.6 28.3 3.5 -2.7 6.1 4.8 13.8
## [181] 10.5 2.4 14.3 28.9 34.0 -21.0 26.3 -18.5 7.4 22.2 11.9 24.1
## [193] 14.8 20.3 18.3 29.1 8.7 7.2 5.1 27.8 15.7 -20.0 31.6 2.6
## [205] 5.7 13.7 12.4 27.4 -33.0 8.1 9.1 NA -25.0 8.8 30.5 14.1
## [217] 19.7 6.4 4.5 10.4 24.9 24.2 -17.0 10.2 13.9 18.1 23.9 -22.0
## [229] 10.3 -19.0 8.4 -16.0 -30.0 14.7 23.4 20.4 19.3 32.1 16.6 12.3
## [241] 18.8 25.8 37.0 1.5 16.4 -1.5 25.2 5.6 29.4 21.3 27.6 28.1
## [253] 27.1 9.3 18.9 12.7 6.3 27.7 32.5 23.8 33.2 25.3 20.8 17.9
## [265] 23.3 27.9 29.3 15.9 21.9 17.1 21.7 28.4 17.2 15.1 16.8 0.5
## [277] 32.4 29.8 30.4 39.0 -35.0 -34.0 2.3 13.1 28.8 3.3 6.7 23.1
## [289] 2.2 29.2 11.6 5.3 -2.5 29.6 33.4 27.3 11.1 1.7 31.8 22.9
## [301] 15.8 9.7 29.7 9.2 31.7 -3.4 35.4 31.2 7.3 30.1 1.3 12.6
## [313] 5.8 25.9 1.9 31.3 6.8 0.7 3.6 3.7 26.9 -23.0 25.1 38.0
## [325] 0.3 34.5 35.3 29.9 39.9 9.9 38.1 1.6 11.3 32.6 5.9 32.7
## [337] 37.5 4.7 12.9 -39.0 -0.2 10.1 7.9 9.8
```

```
unique(data$fire_spread_rate)
```

```

## [1] 0.0 0.1 1.0 12.0 0.5 1.5 3.0 2.0 5.0 10.0 0.2 35.0
## [13] 4.0 30.0 0.4 50.0 0.9 8.0 20.0 3.5 7.0 0.3 6.0 11.0
## [25] 17.0 9.0 25.0 18.0 40.0 2.5 100.0 0.7 15.0 0.8 1.2 1.1
## [37] 1.8 1.9 13.0 4.5 1.7 8.5 70.0 0.6 2.2 4.9 16.0 65.0
## [49] 21.0 5.7 34.0 71.0 19.0 60.0 22.0 5.5
```

We will also look at a summary of the data

```
summary(data$temperature)
```

```

##      Min. 1st Qu. Median     Mean 3rd Qu.     Max.    NA's
## -39.00  14.00  19.00  17.85  23.00  39.90     80
```

```
summary(data$fire_spread_rate)
```

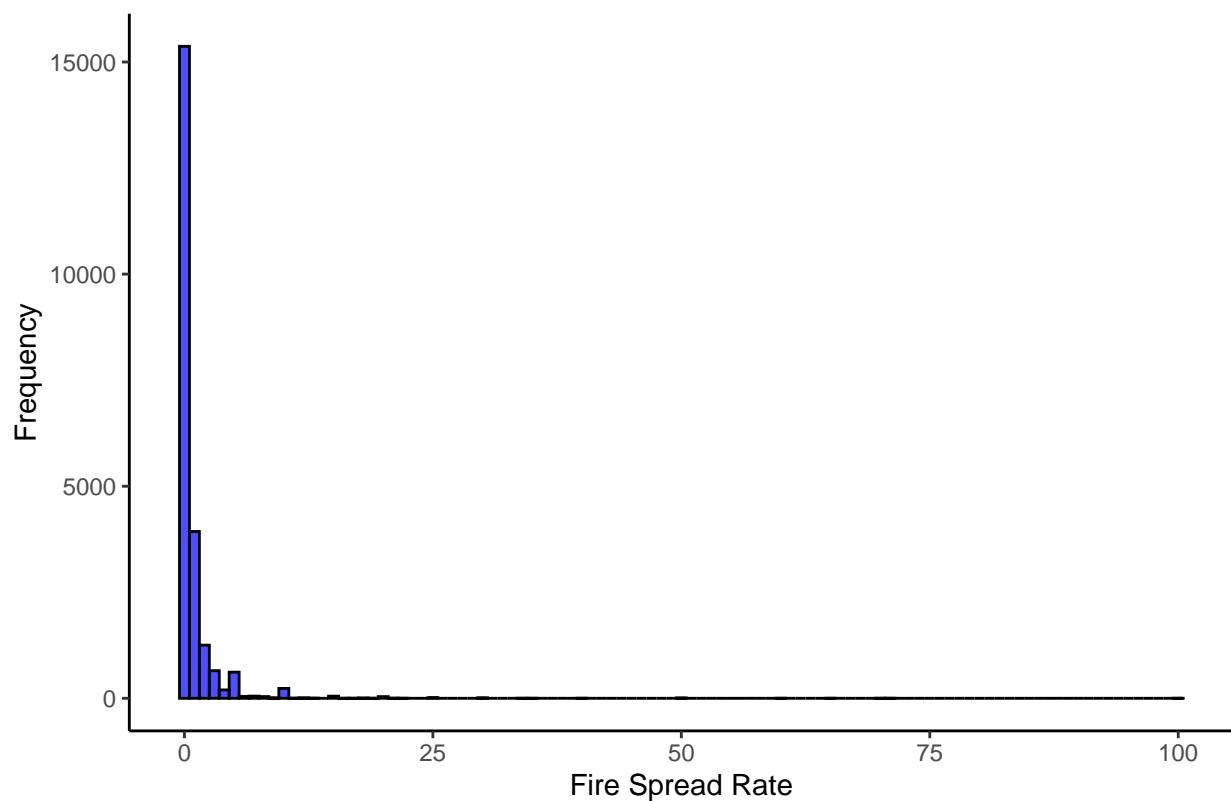
```

##      Min. 1st Qu. Median     Mean 3rd Qu.     Max.
## 0.0000 0.0000 0.0000 0.8962 1.0000 100.0000
```

```

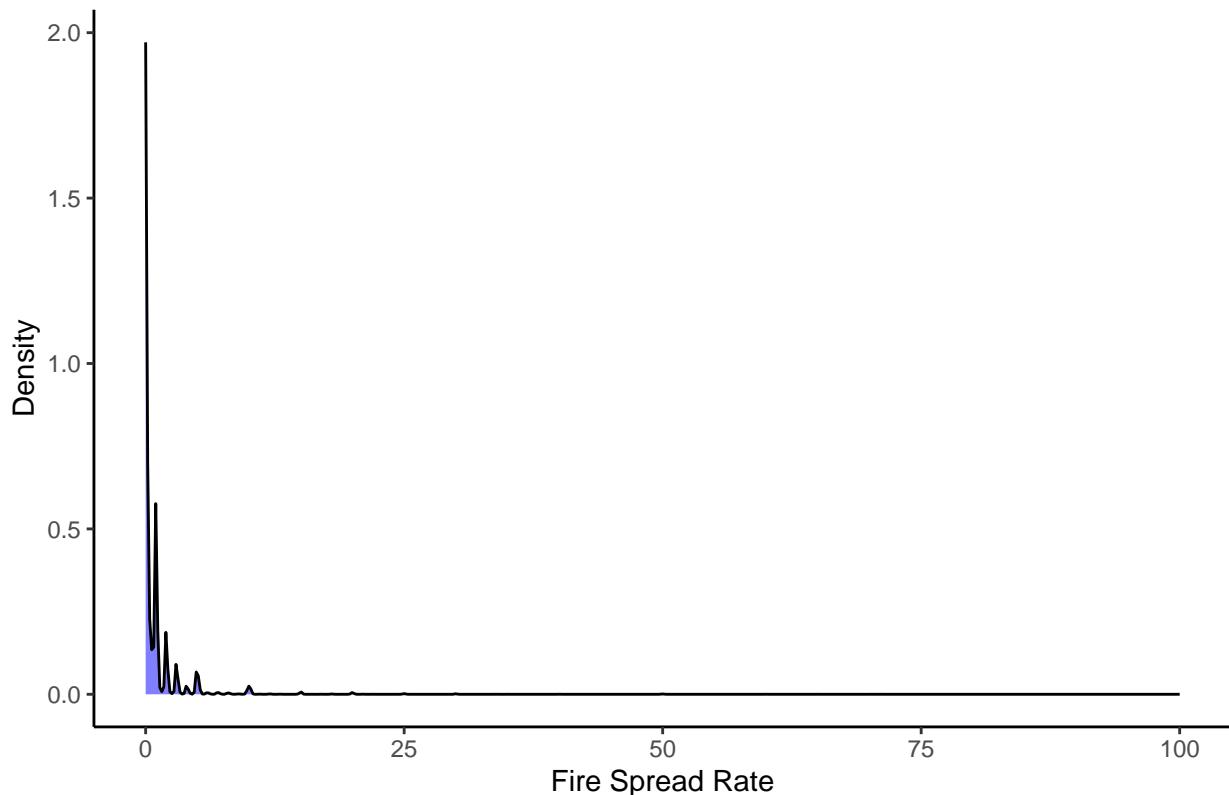
# Plot a histogram
ggplot(data, aes(x = fire_spread_rate)) +
  geom_histogram(binwidth = 1, fill = "blue", color = "black", alpha = 0.7) +
  labs(title = "Distribution of Fire Spread Rate",
       x = "Fire Spread Rate",
       y = "Frequency") +
  theme_classic()
```

Distribution of Fire Spread Rate



```
# Alternatively, plot a density plot
ggplot(data, aes(x = fire_spread_rate)) +
  geom_density(fill = "blue", alpha = 0.5) +
  labs(title = "Density Plot of Fire Spread Rate",
       x = "Fire Spread Rate",
       y = "Density") +
  theme_classic()
```

Density Plot of Fire Spread Rate



```
# Calculate skewness
spread_rate_skewness <- skewness(data$fire_spread_rate)
print(paste("Skewness of Fire Spread Rate:", spread_rate_skewness))
```

```
## [1] "Skewness of Fire Spread Rate: 11.2632058482397"
```

The value 11.22 suggests that the distribution of fire spread rates is heavily skewed to the right, meaning that most of the fire spread rates are relatively low, but there are a few extremely high values (outliers) that pull the tail of the distribution to the right.

Before performing a regression analysis, it is important to investigate the correlation between both variables. To normalize the distribution of the fire spread rate we can attempt a log transformation

```
# Log Transformation
data$log_fire_spread_rate <- log(data$fire_spread_rate + 1)

log_spread_rate_skewness <- skewness(data$log_fire_spread_rate)
print(paste("Skewness of Log Transformed Fire Spread Rate:", log_spread_rate_skewness))
```

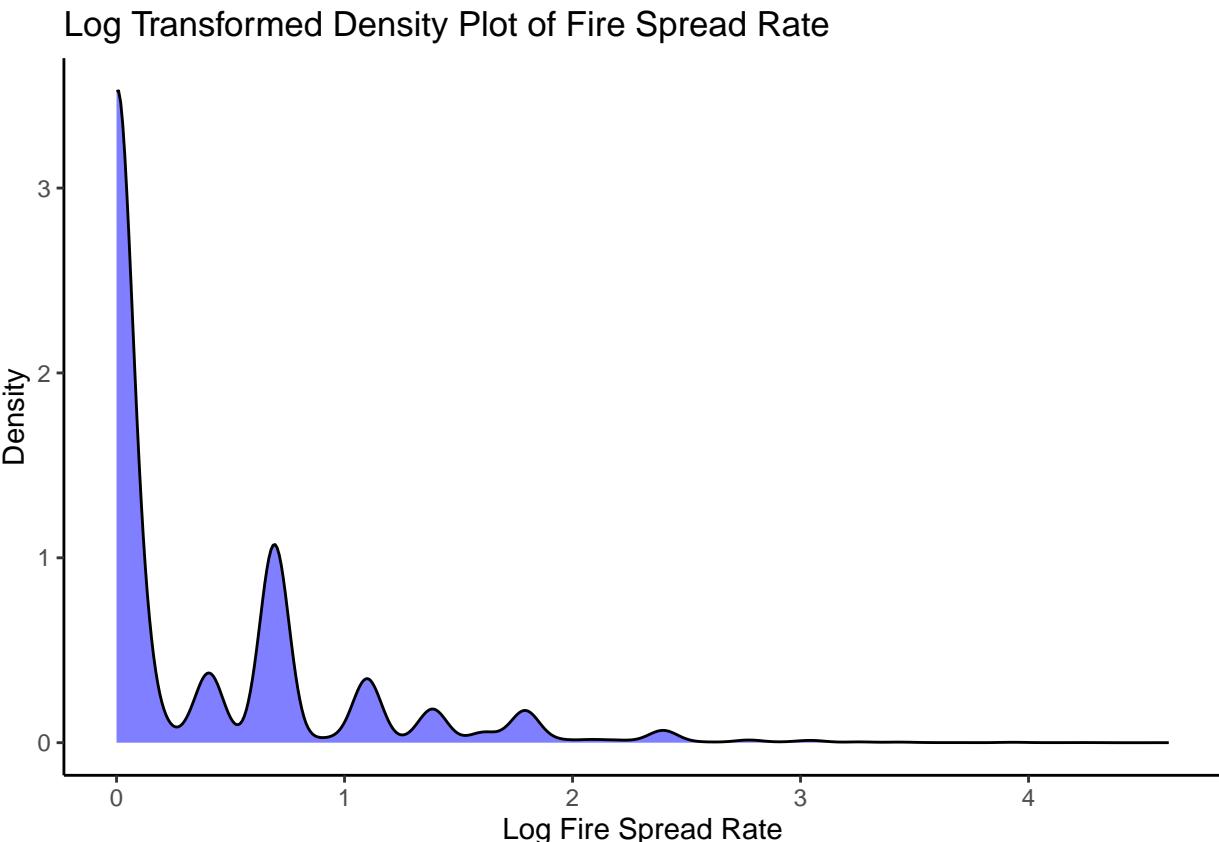
```
## [1] "Skewness of Log Transformed Fire Spread Rate: 1.92868885555048"
```

```
ggplot(data, aes(x = log_fire_spread_rate)) +
  geom_density(fill = "blue", alpha = 0.5) +
  labs(title = "Log Transformed Density Plot of Fire Spread Rate",
```

```

x = "Log Fire Spread Rate",
y = "Density") +
theme_classic()

```



Following this, we will calculate Pearson correlation between log-transformed fire spread rate and temperature

```

correlation_log <- cor(data$log_fire_spread_rate, data$temperature, use = "complete.obs")
print(paste("Pearson correlation coefficient (Log Fire Spread Rate and Temperature):", correlation_log))

```

```
## [1] "Pearson correlation coefficient (Log Fire Spread Rate and Temperature): 0.250089700065433"
```

We will now rechecking correlation fire spread rate and temperature to see if the relationship has improved now.

The regression model can be coded as:

```

# Fit a linear regression model
log_model <- lm(log_fire_spread_rate ~ temperature, data = data)
summary(log_model)

```

```

##
## Call:
## lm(formula = log_fire_spread_rate ~ temperature, data = data)
##
## Residuals:
##
```

```

##      Min     1Q   Median     3Q    Max
## -0.7690 -0.3839 -0.2119  0.2326  4.0652
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.0389989  0.0096034   4.061  4.9e-05 ***
## temperature 0.0191612  0.0004948  38.727 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.5651 on 22480 degrees of freedom
##   (80 observations deleted due to missingness)
## Multiple R-squared:  0.06254,   Adjusted R-squared:  0.0625
## F-statistic:  1500 on 1 and 22480 DF,  p-value: < 2.2e-16

ggplot(data, aes(x = temperature, y = log_fire_spread_rate)) +
  geom_point(color = "red") +
  geom_smooth(method = "lm", se = FALSE, color = "blue") +
  labs(title = "Log Fire Spread Rate vs Temperature",
       x = "Temperature",
       y = "Log Fire Spread Rate")

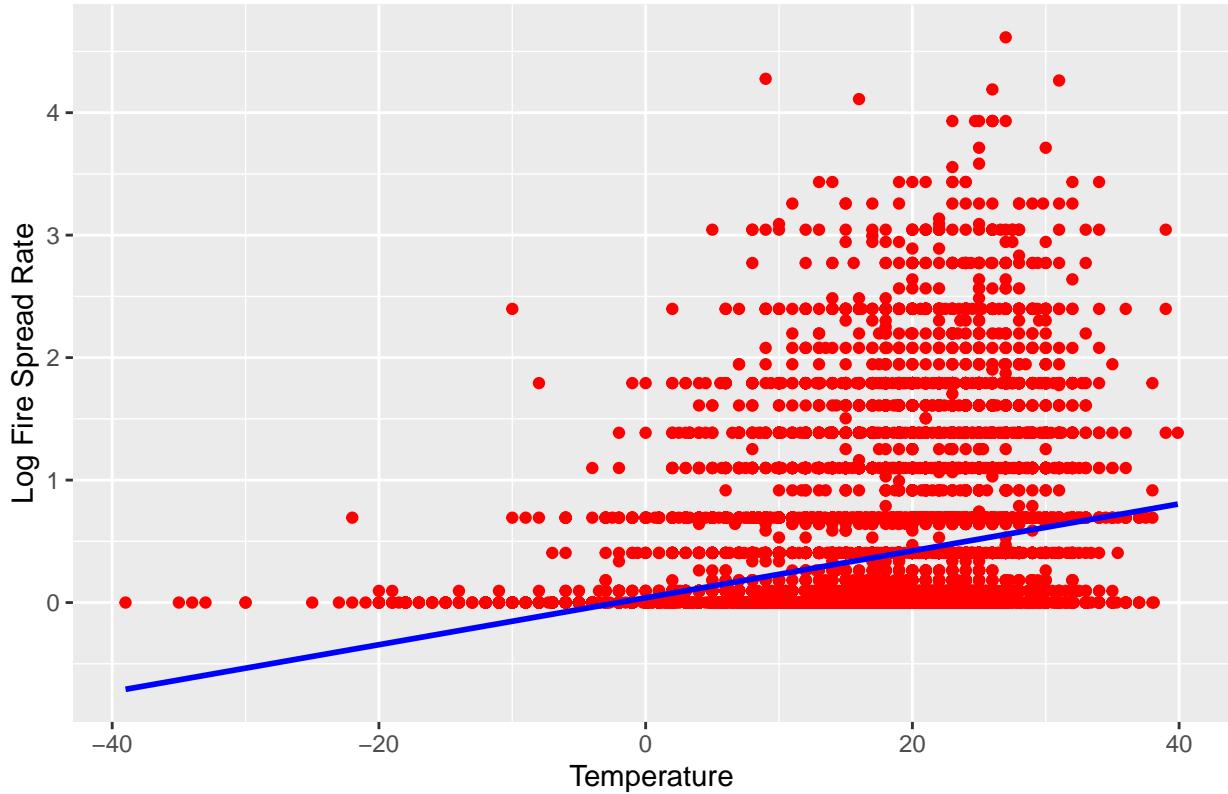
## `geom_smooth()` using formula = 'y ~ x'

## Warning: Removed 80 rows containing non-finite outside the scale range
## ('stat_smooth()').

## Warning: Removed 80 rows containing missing values or values outside the scale range
## ('geom_point()').

```

Log Fire Spread Rate vs Temperature

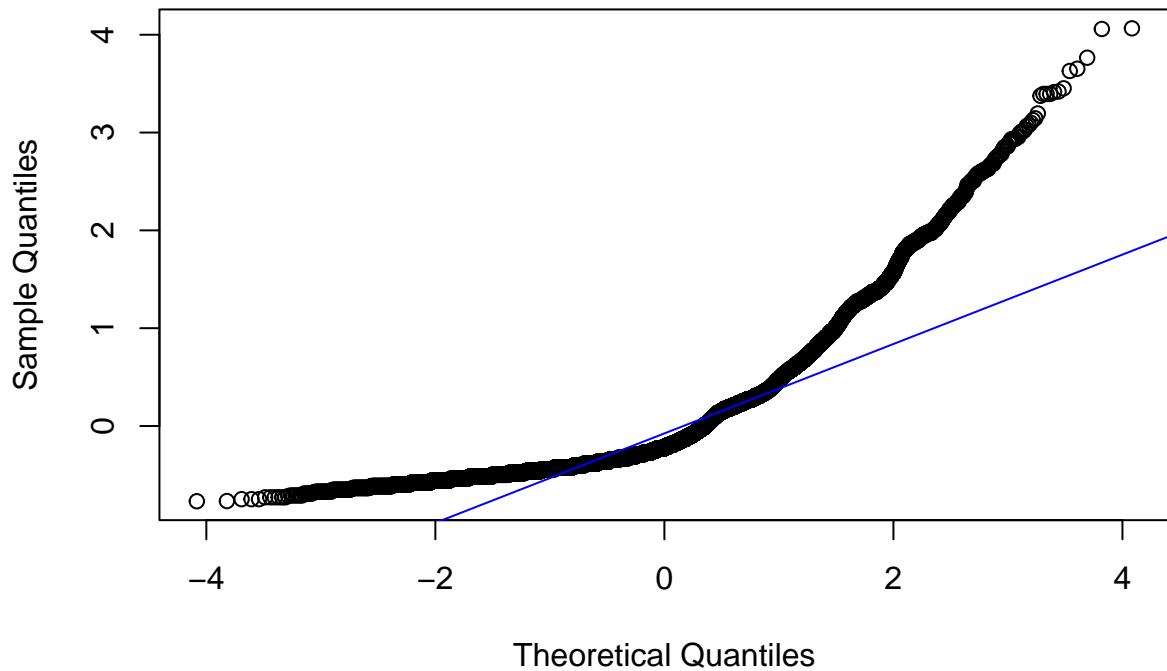


The graph shows the relationship between temperature and the rate of fire spread. The red dots represent data points where the x-axis represents the temperature and the y-axis represents the log of the fire spread rate. The blue line represents a line of best fit, indicating that there is a positive correlation between the two variables. This means that as temperature increases, the fire spread rate also increases, and this is illustrated by the upward trend of the blue line.

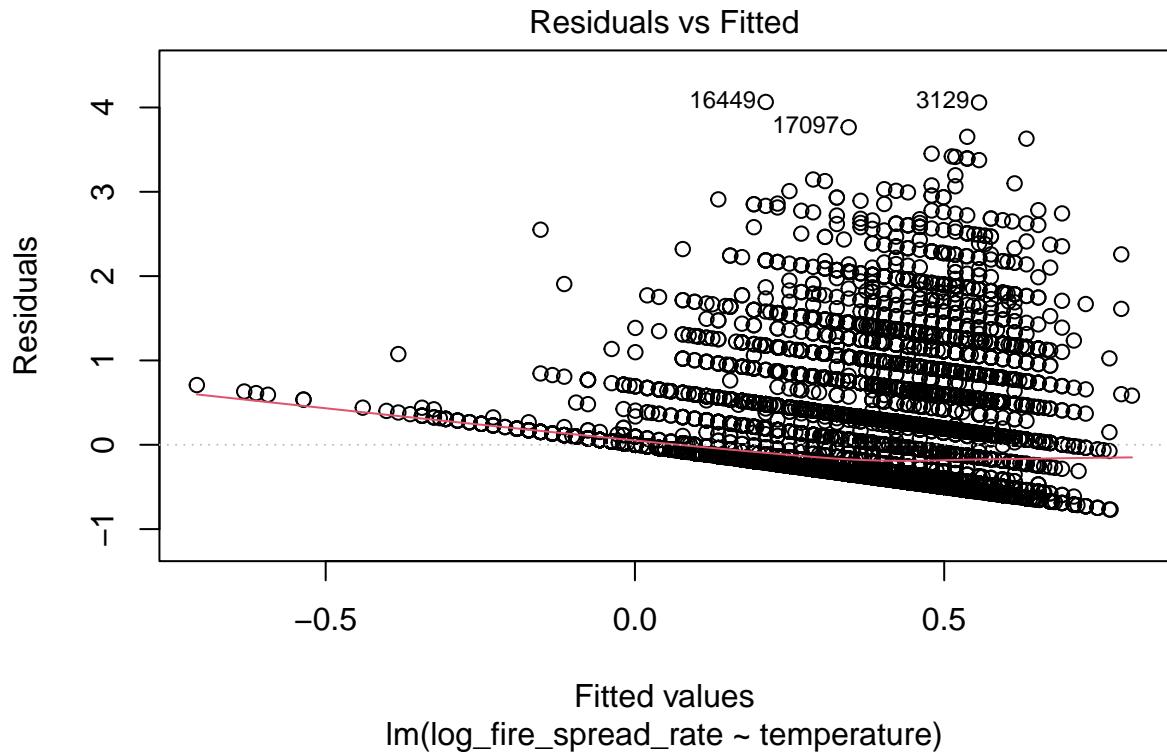
Q-Q Plot and Residuals Plot to check the normality

```
# Q-Q plot to check normality of residuals
qqnorm(residuals(log_model))
qqline(residuals(log_model), col = "blue")
```

Normal Q-Q Plot

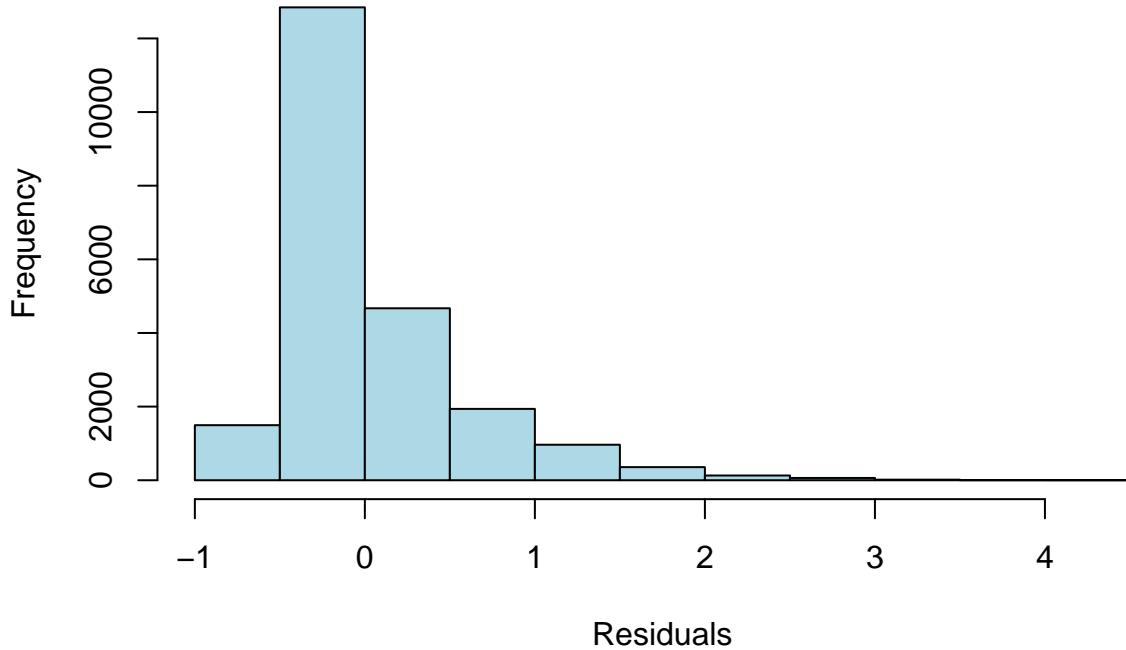


```
# Residuals vs Fitted plot  
plot(log_model, which = 1)
```



```
# Histogram of residuals
hist(residuals(log_model), main = "Histogram of Residuals", xlab = "Residuals", col = "lightblue")
```

Histogram of Residuals



Residual plot: This plot suggests that the linear model is not a good fit for the data, and alternative models might be considered.

Q-Q Residual: This plot indicates that the data is not normally distributed because it deviates from a straight line. The points are curved and have a few outliers. The data is skewed to the right as it deviates from the straight line on the right-hand side.

```
# Get model summary and extract statistics
log_model_summary <- summary(log_model)
r_squared_log <- log_model_summary$r.squared
adj_r_squared_log <- log_model_summary$adj.r.squared
p_value_log <- log_model_summary$coefficients[2, 4]

print(paste("R-squared (log model):", r_squared_log))

## [1] "R-squared (log model): 0.0625448580788178"

print(paste("Adjusted R-squared (log model):", adj_r_squared_log))

## [1] "Adjusted R-squared (log model): 0.062503156337629"

print(paste("p-value for temperature (log model):", p_value_log))

## [1] "p-value for temperature (log model): 1.1251791730511e-317"
```

To avoid the complexity by temperature variable Adjusted R-squared -the relationship between the temperature and fire spread rate is weak, meaning temperature does not explain much of the variation in fire spread rate.P Value suggests that the temperature is likely statistically significant, meaning it has a real effect on the dependent variable.

To check this since the p-value only reflects the significance of the relationship, it's also worth considering if other variables (like humidity , wind speed , vegetation_type

```
# Extra work--Consider including other relevant features
data$humidity <- data$relative_humidity
data$wind_speed <- data$wind_speed
data$vegetation_type <- data$fuel_type

# Update the model to include additional features
model <- lm(fire_spread_rate ~ temperature + humidity + wind_speed + vegetation_type, data = data)

# Summarize the updated model
summary(model)

## 
## Call:
## lm(formula = fire_spread_rate ~ temperature + humidity + wind_speed +
##     vegetation_type, data = data)
## 
## Residuals:
##      Min      1Q Median      3Q      Max 
## -4.849 -1.028 -0.475  0.221 98.075 
## 
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) 1.241233  0.161542  7.684 1.63e-14 ***
## temperature  0.031667  0.003164 10.009 < 2e-16 ***
## humidity    -0.017181  0.001239 -13.866 < 2e-16 ***
## wind_speed   0.044757  0.002431 18.413 < 2e-16 ***
## vegetation_typeC2  0.223939  0.121777  1.839 0.065942 .  
## vegetation_typeC3 -0.246459  0.156810 -1.572 0.116036  
## vegetation_typeC4 -0.443133  0.259062 -1.711 0.087185 .  
## vegetation_typeC7 -0.845929  0.621074 -1.362 0.173202  
## vegetation_typeD1 -0.759180  0.176130 -4.310 1.64e-05 ***
## vegetation_typeM1 -0.559852  0.160891 -3.480 0.000503 *** 
## vegetation_typeM2 -0.699145  0.130445 -5.360 8.44e-08 *** 
## vegetation_typeM3 -1.718422  1.577507 -1.089 0.276024  
## vegetation_typeM4 -0.739332  2.726585 -0.271 0.786274  
## vegetation_type01a -0.760666  0.127503 -5.966 2.48e-09 *** 
## vegetation_type01b -0.719319  0.134277 -5.357 8.57e-08 *** 
## vegetation_typeS1 -0.892669  0.173143 -5.156 2.55e-07 *** 
## vegetation_typeS2 -1.039302  0.174980 -5.940 2.91e-09 *** 
## --- 
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## 
## Residual standard error: 2.724 on 17918 degrees of freedom
##     (4627 observations deleted due to missingness)
```

```

## Multiple R-squared:  0.07169,   Adjusted R-squared:  0.07086
## F-statistic: 86.48 on 16 and 17918 DF,  p-value: < 2.2e-16

```

This thing concludes that not only one factor is responsible for the fire spread these other factors combinely also affect that.

Creating a new column according to the size_class to represnt that in the visualization as HIgh or low spread in the particular area.

```
str(data)
```

```

## 'data.frame':  22562 obs. of  53 variables:
## $ fire_year          : int  2006 2006 2006 2006 2006 2006 2006 2006 2006 ...
## $ fire_number        : chr  "PWF001" "EWF002" "EWF001" "EWF003" ...
## $ fire_name          : chr  NA NA NA NA ...
## $ current_size       : num  0.1 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ size_class         : chr  "A" "B" "B" "A" ...
## $ fire_location_latitude: num  56.2 53.6 53.6 53.6 56.2 ...
## $ fire_location_longitude: num  -117 -116 -116 -116 -117 ...
## $ fire_origin         : chr  "Private Land" "Provincial Land" "Provincial Land" "Provincial ...
## $ general_cause_desc: chr  "Resident" "Incendiary" "Incendiary" "Incendiary" ...
## $ industry_identifier_desc: chr  NA NA NA NA ...
## $ responsible_group_desc: chr  "Resident" "Others (explain in remarks)" "Others (explain in re ...
## $ activity_class      : chr  "Grass" "Lighting Fires" "Lighting Fires" "Lighting Fires" ...
## $ true_cause          : chr  "Permit Related" "Arson Suspected" "Arson Suspected" "Arson Su ...
## $ fire_start_date     : chr  "2006-04-02 12:00" "2006-04-03 12:10" "2006-04-03 12:15" "2006-04-03 12:15" ...
## $ det_agent_type      : chr  "UNP" "UNP" "UNP" "UNP" ...
## $ det_agent           : chr  "310" "310" "310" "PUB" ...
## $ discovered_date     : chr  NA NA NA NA ...
## $ discovered_size      : num  NA NA NA NA NA NA NA NA NA ...
## $ reported_date        : chr  "2006-04-02 20:46" "2006-04-03 12:27" "2006-04-03 12:36" "2006-04-03 12:36" ...
## $ dispatched_resource: chr  "FPD Staff" "FPD Staff" "FPD Staff" "FPD Staff" ...
## $ dispatch_date        : chr  "2006-04-02 21:10" "2006-04-03 12:33" "2006-04-03 12:36" "2006-04-03 12:36" ...
## $ start_for_fire_date: chr  "2006-04-02 21:20" "2006-04-03 12:35" "2006-04-03 12:42" "2006-04-03 12:42" ...
## $ assessment_resource: chr  "IA Forces" "IA Forces" "IA Forces" "IA Forces" ...
## $ assessment_datetime: chr  "2006-04-02 22:00" "2006-04-03 13:20" "2006-04-03 13:23" "2006-04-03 13:23" ...
## $ assessment_hectares: num  0.01 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ fire_spread_rate     : num  0 0 0 0 0.1 0 0 0 0 0 ...
## $ fire_type            : chr  "Surface" "Surface" "Surface" "Surface" ...
## $ fire_position_on_slope: chr  "Flat" "Lower 1/3" "Bottom" "Flat" ...
## $ weather_conditions_over_fire: chr  "Clear" "Clear" "Clear" "Clear" ...
## $ temperature          : num  18 12 12 12 6 11 11 16 11 11 ...
## $ relative_humidity    : int  10 22 22 22 37 32 25 17 35 44 ...
## $ wind_direction       : chr  "SW" "SW" "SW" "SW" ...
## $ wind_speed           : int  2 10 10 10 2 20 10 2 7 4 ...
## $ fuel_type             : chr  "01a" "01a" "01a" "01b" ...
## $ initial_action_by    : chr  "Land Owner" "Fire Department" "Fire Department" "Industry" ...
## $ ia_arrival_at_fire_date: chr  NA NA NA NA ...
## $ ia_access             : chr  NA NA NA NA ...
## $ fire_fighting_start_date: chr  NA NA NA NA ...
## $ fire_fighting_start_size: num  NA NA NA NA NA NA 0.01 NA 0.6 ...
## $ bucketing_on_fire     : chr  NA NA NA NA ...
## $ distance_from_water_source: num  NA NA NA NA NA NA NA NA NA ...
## $ first_bucket_drop_date: chr  NA NA NA NA ...

```

```

## $ bh_fs_date : chr "2006-04-02 22:00" "2006-04-03 13:20" "2006-04-03 13:23" "2006-
## $ bh_hectares : num 0.01 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ uc_fs_date : chr "2006-04-02 22:00" "2006-04-03 13:20" "2006-04-03 13:23" "2006-
## $ uc_hectares : num 0.01 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ to_fs_date : chr NA NA NA NA ...
## $ to_hectares : num NA NA NA NA 0.1 NA NA 0.01 0.2 NA ...
## $ ex_fs_date : chr "2006-04-03 10:20" "2006-04-03 14:00" "2006-04-03 15:00" "2006-
## $ ex_hectares : num 0.1 0.2 0.5 0.01 0.1 0.2 0.01 0.01 0.2 0.6 ...
## $ log_fire_spread_rate : num 0 0 0 0.0953 ...
## $ humidity : int 10 22 22 22 37 32 25 17 35 44 ...
## $ vegetation_type : chr "01a" "01a" "01a" "01b" ...

```

Create SpreadCategory based on size_class

```

data$SpreadCategory <- ifelse(data$size_class %in% c("D", "E"), "High", "Low")

head(data)

```

```

##   fire_year fire_number fire_name current_size size_class
## 1      2006       PWF001     <NA>        0.10      A
## 2      2006       EWF002     <NA>        0.20      B
## 3      2006       EWF001     <NA>        0.50      B
## 4      2006       EWF003     <NA>        0.01      A
## 5      2006       PWF002     <NA>        0.10      A
## 6      2006       CWF001     <NA>        0.20      B
##   fire_location_latitude fire_location_longitude   fire_origin
## 1           56.24996            -117.1820 Private Land
## 2           53.60637            -115.9157 Provincial Land
## 3           53.61093            -115.5943 Provincial Land
## 4           53.60887            -115.6095 Provincial Land
## 5           56.24996            -117.0502 Provincial Land
## 6           51.15293            -115.0346 Indian Reservation
##   general_cause_desc industry_identifier_desc responsible_group_desc
## 1             Resident           <NA>                   Resident
## 2           Incendiary           <NA>  Others (explain in remarks)
## 3           Incendiary           <NA>  Others (explain in remarks)
## 4           Incendiary           <NA>  Others (explain in remarks)
## 5      Other Industry          Waste Disposal            Employees
## 6             Resident           <NA>                   Resident
##   activity_class true_cause fire_start_date det_agent_type det_agent
## 1      Grass Permit Related 2006-04-02 12:00        UNP    310
## 2 Lighting Fires Arson Suspected 2006-04-03 12:10        UNP    310
## 3 Lighting Fires Arson Suspected 2006-04-03 12:15        UNP    310
## 4 Lighting Fires Arson Suspected 2006-04-03 12:10        UNP    PUB
## 5      Refuse Permit Related 2006-04-03 17:00        UNP    LFS
## 6 Unclassified      Unsafe Fire 2006-04-02 14:25        UNP    310
##   discovered_date discovered_size reported_date dispatched_resource
## 1           <NA>              NA 2006-04-02 20:46      FPD Staff
## 2           <NA>              NA 2006-04-03 12:27      FPD Staff
## 3           <NA>              NA 2006-04-03 12:36      FPD Staff
## 4           <NA>              NA 2006-04-03 13:23      FPD Staff
## 5 2006-04-03 19:11                  NA 2006-04-03 19:12      FPD Staff
## 6 2006-04-02 14:27                  NA 2006-04-02 14:30      FPD Staff
##   dispatch_date start_for_fire_date assessment_resource assessment_datetime
## 1 2006-04-02 21:10      2006-04-02 21:20      IA Forces 2006-04-02 22:00

```

```

## 2 2006-04-03 12:33 2006-04-03 12:35 IA Forces 2006-04-03 13:20
## 3 2006-04-03 12:36 2006-04-03 12:42 IA Forces 2006-04-03 13:23
## 4 2006-04-03 13:50 2006-04-03 13:50 IA Forces 2006-04-03 14:08
## 5 2006-04-03 19:19 2006-04-03 19:22 Other 2006-04-03 19:57
## 6 2006-04-02 14:40 2006-04-02 14:45 IA Forces 2006-04-02 16:00
## assessment_hectares fire_spread_rate fire_type fire_position_on_slope
## 1 0.01 0.0 Surface Flat
## 2 0.20 0.0 Surface Lower 1/3
## 3 0.50 0.0 Surface Bottom
## 4 0.01 0.0 Surface Flat
## 5 0.10 0.1 Surface Flat
## 6 0.20 0.0 Surface Flat
## weather_conditions_over_fire temperature relative_humidity wind_direction
## 1 Clear 18 10 SW
## 2 Clear 12 22 SW
## 3 Clear 12 22 SW
## 4 Clear 12 22 SW
## 5 Clear 6 37 SW
## 6 Clear 11 32 S
## wind_speed fuel_type initial_action_by ia_arrival_at_fire_date ia_access
## 1 2 01a Land Owner <NA> <NA>
## 2 10 01a Fire Department <NA> <NA>
## 3 10 01a Fire Department <NA> <NA>
## 4 10 01b Industry <NA> <NA>
## 5 2 <NA> Fire Department <NA> <NA>
## 6 20 01b Fire Department <NA> <NA>
## fire_fighting_start_date fire_fighting_start_size bucketing_on_fire
## 1 <NA> NA <NA>
## 2 <NA> NA <NA>
## 3 <NA> NA <NA>
## 4 <NA> NA <NA>
## 5 <NA> NA <NA>
## 6 <NA> NA <NA>
## distance_from_water_source first_bucket_drop_date bh_fs_date
## 1 NA <NA> 2006-04-02 22:00
## 2 NA <NA> 2006-04-03 13:20
## 3 NA <NA> 2006-04-03 13:23
## 4 NA <NA> 2006-04-03 14:08
## 5 NA <NA> 2006-04-03 19:57
## 6 NA <NA> 2006-04-02 16:00
## bh_hectares uc_fs_date uc_hectares to_fs_date to_hectares
## 1 0.01 2006-04-02 22:00 0.01 <NA> NA
## 2 0.20 2006-04-03 13:20 0.20 <NA> NA
## 3 0.50 2006-04-03 13:23 0.50 <NA> NA
## 4 0.01 2006-04-03 14:08 0.01 <NA> NA
## 5 0.10 2006-04-03 20:19 0.10 2006-04-03 20:20 0.1
## 6 0.20 2006-04-02 16:00 0.20 <NA> NA
## ex_fs_date ex_hectares log_fire_spread_rate humidity vegetation_type
## 1 2006-04-03 10:20 0.10 0.00000000 10 01a
## 2 2006-04-03 14:00 0.20 0.00000000 22 01a
## 3 2006-04-03 15:00 0.50 0.00000000 22 01a
## 4 2006-04-03 15:05 0.01 0.00000000 22 01b
## 5 2006-04-05 10:18 0.10 0.09531018 37 <NA>
## 6 2006-04-03 18:00 0.20 0.00000000 32 01b

```

```

##   SpreadCategory
## 1      Low
## 2      Low
## 3      Low
## 4      Low
## 5      Low
## 6      Low

```

Geospatial Visualization: Map the fire occurrences geographically with spread rate and temperature as visual layers

```

#For the following code, the output is an HTML output, therefore exporting it in a PDF format is not possible

#data <- data[!is.na(data$fire_location_longitude) & !is.na(data$fire_location_latitude), ]
# Ensure data is not NULL and has the required columns
#if (!is.null(data) && all(c("fire_location_longitude", "fire_location_latitude", "fire_spread_rate", "temperature") %in% names(data)))
#{
# Print debugging information

# Filter out rows with missing lat/long
#data <- data[!is.na(data$fire_location_longitude) & !is.na(data$fire_location_latitude), ]

#leaflet(data) %>%
#  addTiles() %>%
#  addCircleMarkers(~fire_location_longitude, ~fire_location_latitude,
#    radius = ~fire_spread_rate * 0.1,
#    color = ~ifelse(SpreadCategory == "High", "red", "green"),
#    fillOpacity = 0.5,
#    popup = ~paste("Spread Rate:", fire_spread_rate, "<br>",
#                  #Temperature:", temperature)) %>%
#  setView(lng = mean(data$fire_location_longitude, na.rm = TRUE),
#         #lat = mean(data$fire_location_latitude, na.rm = TRUE),
#         #zoom = 6) %>%
#  addLegend("bottomright",
#            colors = c("red", "green"),
#            labels = c("High Spread Rate", "Low Spread Rate"),
#            title = "Spread Rate Category")
#} else {
#  print("Data is NULL or required columns are missing.")
#}

```

Added clustering Points for Better Performance on this geospatial visualization. This will interactively shows the area where the fire spread rate and temperature is high or low.

Hypothesis testing:

```

# Extract the p-value for temperature in the transformed model
p_value_log <- summary(log_model)$coefficients[2, 4]

# Hypothesis testing
if (p_value_log < 0.05) {
  print("Reject the null hypothesis. There is a statistically significant relationship between temperature and fire spread rate")
} else {
  print("Fail to reject the null hypothesis. There is no statistically significant relationship between temperature and fire spread rate")
}

```

```

## [1] "Reject the null hypothesis. There is a statistically significant relationship between temperature and fire spread rate (log-transformed)."

# Print p-value for confirmation
print(paste("P-value:", p_value_log))

## [1] "P-value: 1.1251791730511e-317"

```

There is a statistically significant relationship between temperature and fire spread rate (log-transformed).

The analysis of the residual plot and Q-Q residual plot suggests that the linear regression model is not an appropriate fit for the data. The residual plot indicates a poor linear relationship, and the Q-Q residual plot reveals that the data is not normally distributed, with a right-skew and the presence of outliers. Given these observations, alternative modeling approaches, such as non-linear regression or robust regression techniques, should be considered to better capture the underlying patterns in the data and avoid the reliance on normality assumptions.

Question 3 - What is the Relationship Between Fire Size to Response and Extinguished Time

Introduction

Analyze the relationship between the Fire Size against the Response /Extinguished Time

Response Time

Duration between the detection of a forest fire and the arrival of firefighting resources at the scene.

Extinguished Time

Duration between the detection of a forest fire the moment when the fire is completely put out and no longer poses a threat.

Data Cleaning and Transformation

Reading the file and converting the blank into NA

```
data1=fire_data
```

Step 1: Identifying the targetted Variable:

Below are the list of variables which we are focusing to continue our statistical analysis for this problem statement

- Fire_Size (in Hectares)
- fire_start_date
- discovered date
- ex_fs_date -(Extinguished time)
- assessment_datetime-(Actual Response Starts)

Step 2: Mapping the NA assessment_datetime,ex_fs_date

Identified the blank dates with the next earliest date for fire_start_date with Discovered_date, assessment date with the arrival date in the fire control date,bh_fs_date. Main Objective of this transformation is not to eliminate the data which will be really supporting our regression

```
data2 <- data1 %>%
  mutate(discovered_date = ifelse(discovered_date == 'NA', reported_date, discovered_date),
         ex_fs_date = ifelse(ex_fs_date == 'NA', bh_fs_date, ex_fs_date),
         fire_start_date = ifelse(fire_start_date == 'NA', discovered_date, fire_start_date),
         assessment_datetime = ifelse(assessment_datetime == 'NA', ia_arrival_at_fire_date, assessment_datetime),
         discovered_date = ifelse(is.na(discovered_date), reported_date, discovered_date),
         ex_fs_date = ifelse(is.na(ex_fs_date), bh_fs_date, ex_fs_date),
         fire_start_date = ifelse(is.na(fire_start_date), discovered_date, fire_start_date),
         assessment_datetime = ifelse(is.na(assessment_datetime), ia_arrival_at_fire_date, assessment_datetime))
```

Step 3: Converting the date variables into date format

```
data2$ex_fs_date <- as.POSIXct(data2$ex_fs_date, format = "%Y-%m-%d %H:%M", tz = "America/Edmonton")
data2$discovered_date <- as.POSIXct(data2$discovered_date, format = "%Y-%m-%d %H:%M", tz = "America/Edmonton")
data2$fire_start_date <- as.POSIXct(data2$fire_start_date, format = "%Y-%m-%d %H:%M", tz = "America/Edmonton")
data2$assessment_datetime <- as.POSIXct(data2$assessment_datetime, format = "%Y-%m-%d %H:%M", tz = "America/Edmonton")
# Check the classes after conversion
class(data2$ex_fs_date)

## [1] "POSIXct" "POSIXt"

class(data2$fire_start_date)

## [1] "POSIXct" "POSIXt"
```

Step 4: Calculating the response and extinguished time in minutes

- ResponseTime = assessment_datetime - fire_start_date
- ExtTime = ex_fs_date - fire_start_date

```
# Calculate response time and ext time in minutes
data2$ResponseTime <- as.numeric(difftime(data2$assessment_datetime, data2$fire_start_date, units = "mins"))
data2$ExtTime <- as.numeric(difftime(data2$ex_fs_date, data2$fire_start_date, units = "mins"))
```

Step 5: Logarithmic Transformation

- Performed a log linear transformation on the dependent variables(current_size,ResponseTime,ExtTime)

```
data2$current_size=log10(data2$current_size)
data2$ResponseTime=log10(data2$ResponseTime)
data2$ExtTime=log10(data2$ExtTime)
```

Step 6: Filtering Variables

-Filtering Out the required variables to continue with the further regression analysis of the size and the times which we are targetting to produce the correlation.

```
data_filtered<- data2 %>%
  select(fire_number, fire_year, current_size, Responsetime, Exttime)
head(data_filtered)

##   fire_number fire_year current_size Responsetime   Exttime
## 1      PWF001     2006      -1.00000  2.778151 3.127105
## 2      EWF002     2006      -0.69897  1.845098 2.041393
## 3      EWF001     2006      -0.30103  1.832509 2.217484
## 4      EWF003     2006      -2.00000  2.071882 2.243038
## 5      PWF002     2006      -1.00000  2.247973 3.394101
## 6      CWF001     2006      -0.69897  1.977724 3.218798
```

Step 6: Calculating the mean response time and extinguished time

- To continue analysis of the newly derived variables and conducting analysis, we performed grouping the time with respect to the affected size and storing it into different data frames
- result1 - (Response Time)
- result2 - (Extinguished Time)

Below are the cleaned data set which are going to be in our further regression Analysis

```
result1 <- data2 %>%
  group_by(current_size) %>%
  summarise(
    meanresponsetime = mean(Responsetime),
  )

result1 <- result1 %>%
  filter(!is.na(meanresponsetime), !is.infinite(meanresponsetime),
        !is.na(current_size), !is.infinite(current_size))

result2 <- data2 %>%
  group_by(current_size) %>%
  summarise(
    meanExttime = mean(Exttime),
  )%>%
  arrange(meanExttime)

result2 <- result2 %>%
  filter(!is.na(meanExttime), !is.infinite(meanExttime),
        !is.na(current_size), !is.infinite(current_size))
cat("Data Frame for Response Time")

## Data Frame for Response Time
```

```

head(result1)

## # A tibble: 6 x 2
##   current_size meanresponsetime
##       <dbl>           <dbl>
## 1      -1.52          2.34
## 2      -1.40          2.41
## 3      -1.22          2.57
## 4      -1.10          2.38
## 5      -1.05          2.45
## 6     -0.959         2.25

```

```

summary(result1)

##    current_size      meanresponsetime
##  Min.   : -1.5229  Min.   :0.4771
##  1st Qu.:  0.7846  1st Qu.:1.7482
##  Median :  1.5428  Median :2.1533
##  Mean   :  1.7219  Mean   :2.3599
##  3rd Qu.:  2.5152  3rd Qu.:2.9807
##  Max.   :  5.7617  Max.   :6.0263

```

```

cat(".\n")

```

```

## .

```

```

cat("Data Frame for Extinguished Time")

```

```

## Data Frame for Extinguished Time

```

```

head(result2)

```

```

## # A tibble: 6 x 2
##   current_size meanExttime
##       <dbl>        <dbl>
## 1      4.08        1.99
## 2      0.420       2.05
## 3      0.897       2.06
## 4      0.185       2.11
## 5      0.246       2.13
## 6      0.117       2.14

```

```

summary(result2)

```

```

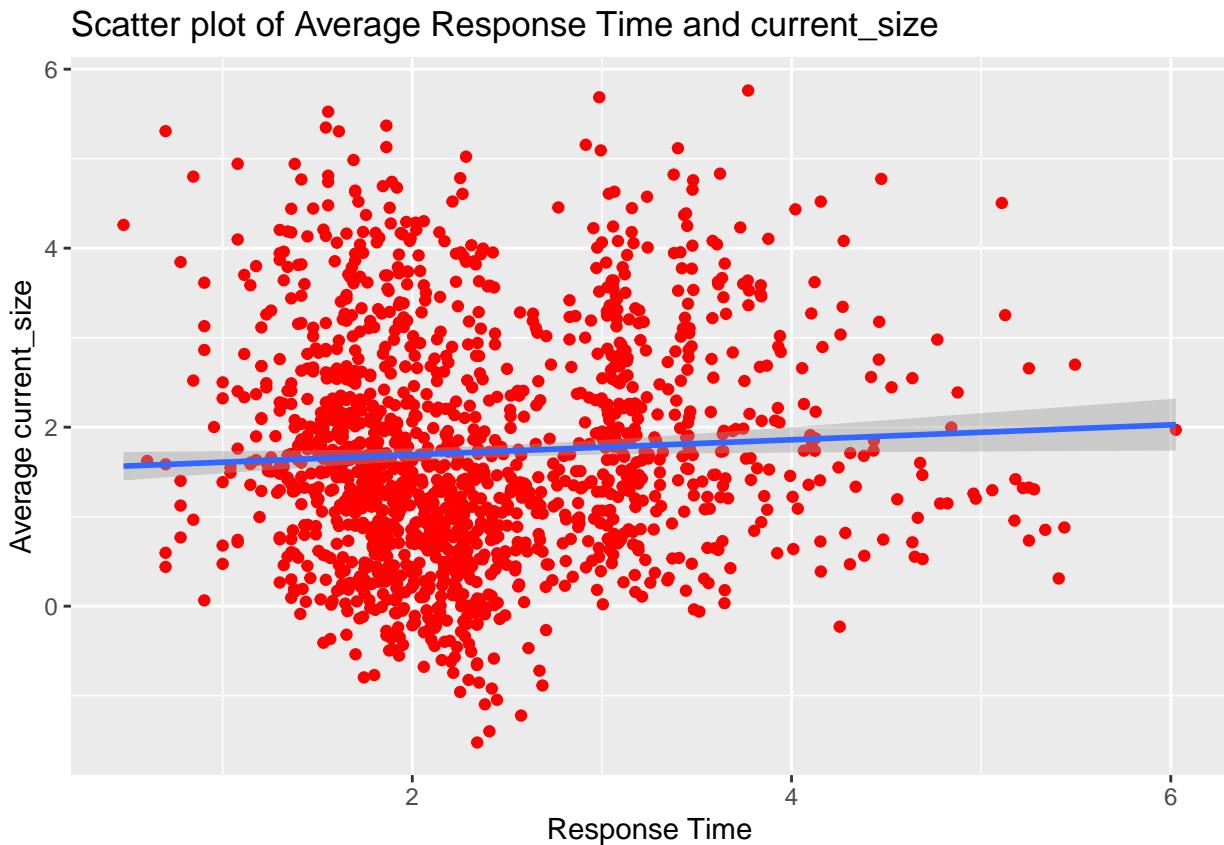
##    current_size      meanExttime
##  Min.   : -1.6990  Min.   :1.987
##  1st Qu.:  0.7645  1st Qu.:3.650
##  Median :  1.5358  Median :4.191
##  Mean   :  1.7056  Mean   :4.200
##  3rd Qu.:  2.5110  3rd Qu.:4.759
##  Max.   :  5.7617  Max.   :6.031

```

Regression Analysis

Plotted the scattered plots to validate the density of the variables being analyzed

```
ggplot1= (ggplot(result1, aes(x=meanresponsetime, y = current_size))+
  geom_point (color = "red") +
  stat_smooth(method = "lm", formula = y ~ x, geom = "smooth")+
  labs (title = "Scatter plot of Average Response Time and current_size",
        x = "Response Time", y ="Average current_size"))
ggplot1
```

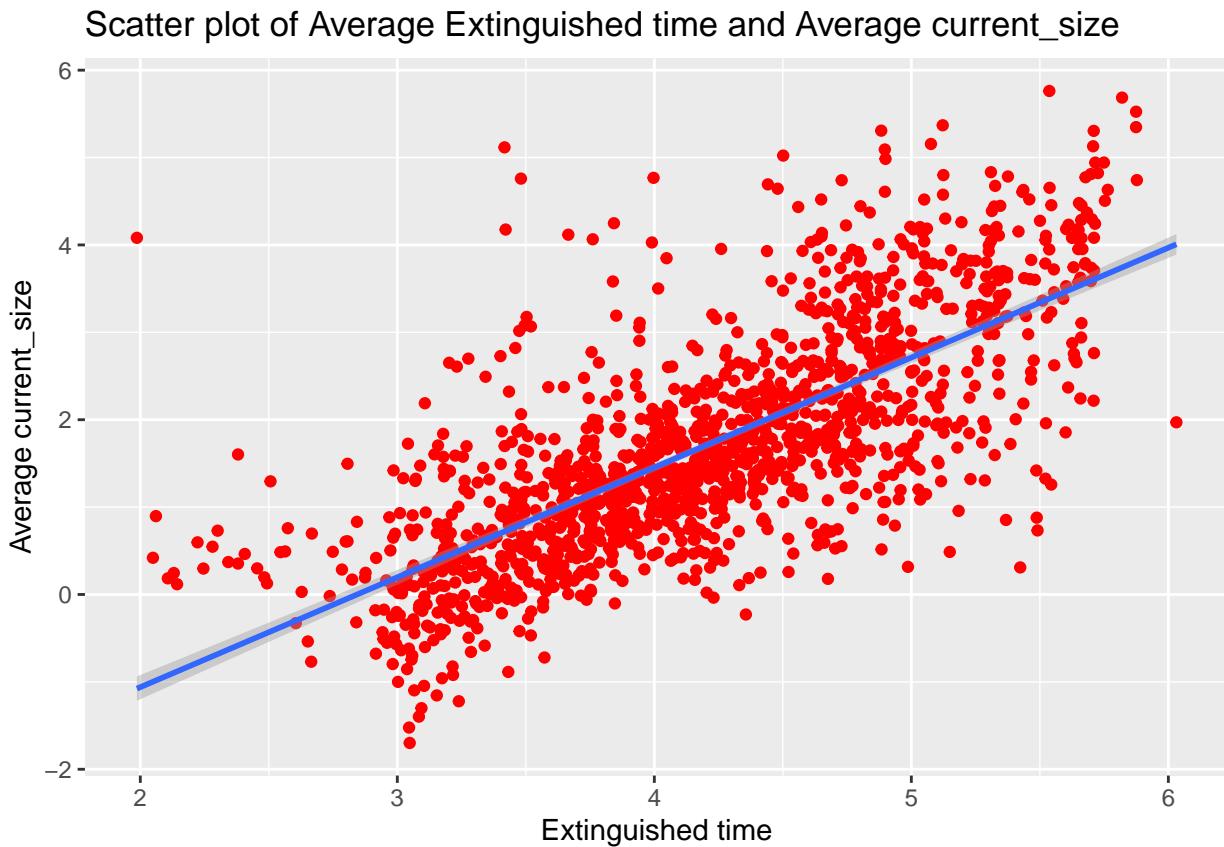


Inference:

- Positive linear trend. Response time increases, the current size also slightly increases, though the relationship seems weak (the slope of the line is small).
- Data points (in red) are densely scattered, with many points clustering around lower response times and a current size. However, there are a few points that deviate significantly from this dense cluster, especially for higher response times and current sizes.

```
ggplot2 =(ggplot(result2, aes(x=meanExttime, y = current_size))+
  geom_point (color = "red") +
  stat_smooth(method = "lm", formula = y ~ x, geom = "smooth")+
  labs (title = "Scatter plot of Average Extinguished time and Average current_size",
```

```
x = "Extinguished_time", y ="Average_current_size"))
ggplot2
```



Inference:

-Strong Positive Trend -Slope of the line is noticeably steeper compared to the response time plot, indicating that changes in extinguished time have a more pronounced effect on the average current size.

Generating Models and Intrepreting the Model Summary with Hypothesis Test

Mean Response Time

-Null Hypothesis (H_0): There is no relationship between the Response time and Average current_size.
-Alternative Hypothesis (H_a): There is a relationship between the Response time and Average current_size.

```
model_clean1 = lm(current_size ~ meanresponsetime, data = result1)
summary(model_clean1)
```

```
##
## Call:
## lm(formula = current_size ~ meanresponsetime, data = result1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max 
## -3.2433 -0.9376 -0.1591  0.7704  3.9218
```

```

## 
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) 1.52463   0.09867 15.451 <2e-16 ***
## meanresponsetime 0.08359   0.03937  2.123  0.0339 *  
## ---      
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## 
## Residual standard error: 1.274 on 1465 degrees of freedom
## Multiple R-squared:  0.003068, Adjusted R-squared:  0.002388 
## F-statistic: 4.509 on 1 and 1465 DF, p-value: 0.03388

```

Interpretation:

p-value of 0.03388 relationship between meanresponsetime and current_size is statistically significant at the 5% significance level ($p < 0.05$)

Model Fit:

R-squared value of 0.002388 indicates a Low Fit.

Extinguished Time

-Null Hypothesis (H0): There is no relationship between the Extinguished time and Average current_size.
 -Alternative Hypothesis (Ha): There is a relationship between the Extinguished time and Average current_size.

```

model_clean2 = lm(current_size ~ meanExttime, data = result2)
summary(model_clean2)

```

```

## 
## Call:
## lm(formula = current_size ~ meanExttime, data = result2)
## 
## Residuals:
##      Min       1Q   Median       3Q      Max
## -2.9340 -0.5563 -0.0782  0.4719  5.1584
## 
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) -3.57474   0.12930 -27.65 <2e-16 ***
## meanExttime  1.25715   0.03031  41.48 <2e-16 ***
## ---      
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## 
## Residual standard error: 0.8741 on 1480 degrees of freedom
## Multiple R-squared:  0.5376, Adjusted R-squared:  0.5373 
## F-statistic: 1721 on 1 and 1480 DF, p-value: < 2.2e-16

```

Interpretation:

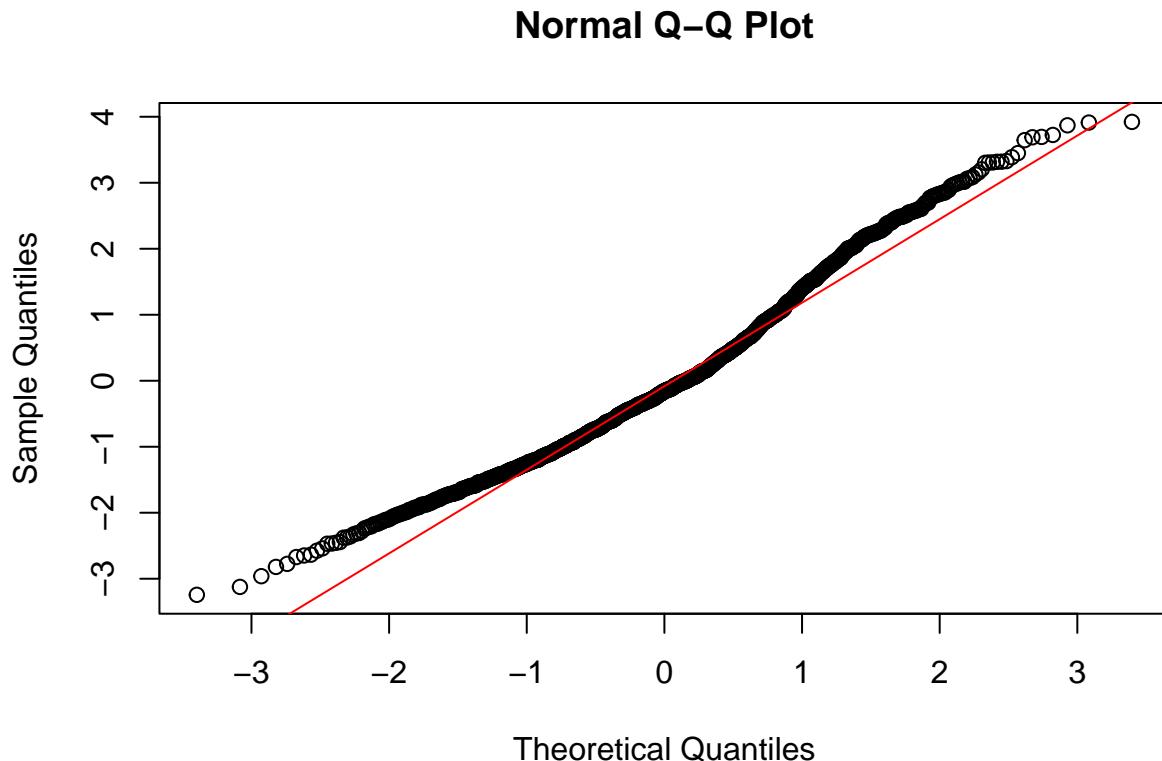
p-value of 2.2e-16 is extremely low, indicating strong evidence against the null hypothesis means that Response time has significant effect on the Size of the forest impact

Model Fit:

R-squared: 0.5373 of the variance in current_size which indicates a moderate fit

Analyzing the Normal Distribution - QQ Plot for Response Time

```
qqnorm(model_clean1$residuals)
qqline(model_clean1$residuals, col = "red")
```

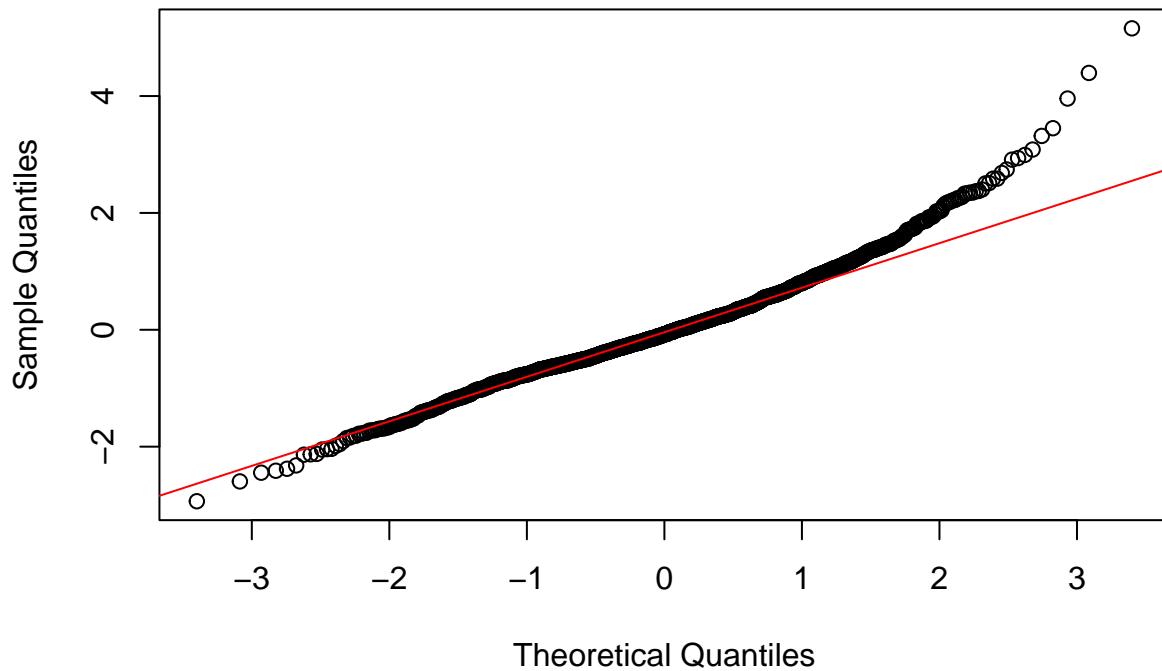


```
### Interpretation: - Model appears to follow a normal distribution reasonably well. - Some deviations at the extreme ends (in the tails) may indicate slight departures from normality, possibly showing mild outliers or heavier tails than a normal distribution
```

Analyzing the Normal Distribution - QQ Plot for Extinguished Time

```
qqnorm(model_clean2$residuals)
qqline(model_clean2$residuals, col = "red")
```

Normal Q-Q Plot

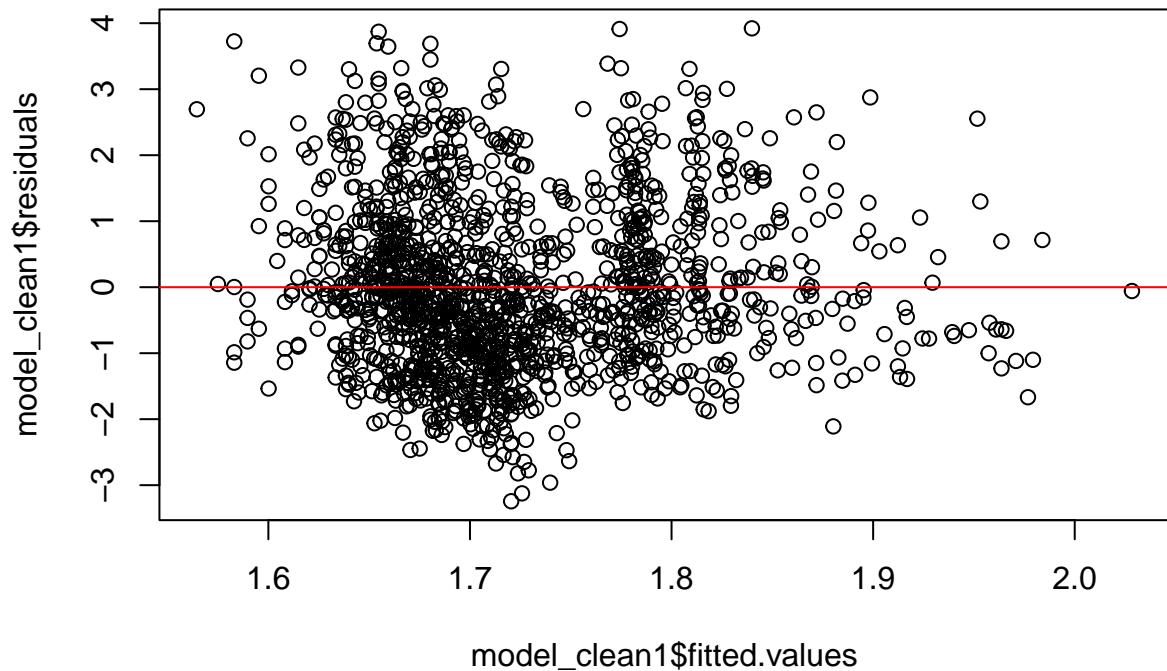


Interpretation:

- Model is approximately normal
- Model may have heavier tails or more extreme values than would be expected in a normal distribution- When the extinguished time increases there will be huge impact on the affected area

Analyzing the Normal Distribution - Residual Plot for Response Time

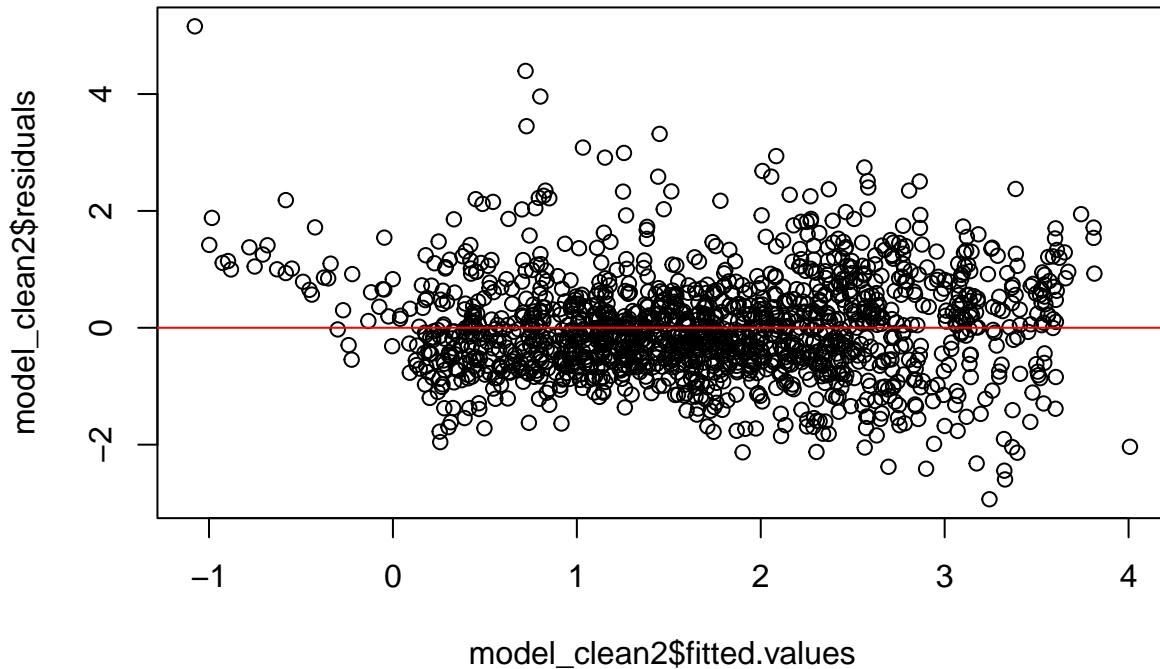
```
plot(model_clean1$fitted.values, model_clean1$residuals)
abline(h = 0, col = "red")
```



```
### Inference: -Residuals seem to be randomly scattered around the horizontal line at zero though there
are many outliers in the data set
```

Analyzing the Normal Distribution - Residual Plot for Extinguished Time

```
plot(model_clean2$fitted.values, model_clean2$residuals)
abline(h = 0, col = "red")
```



Inference:
 -Residuals are centered around zero, which is a good sign for a well-fitted model and shows the strong relationship between time and size

Conclusion

- Overall, Models of Response and Extinguished time has a significant relationship between the affected area - size.
- However, the Extinguished Time Model which shows the strong relationship with the relatively low p-value
- Hence improving the Response and extinguished time of a forest fire involving with following strategies ideally impact the size of the forest being affected
- Early detection,Rapid response,Effective firefighting techniques,Training and Coordination & Public awareness

Question 4 - Does Fire Size Relate To The Weather Conditions When The Fire Starts

The relationship I will be investigating is if there a potential relationship between the recorded fires size once under control and the weather that was present during the fires start. I will have uc_hectares as my dependent variable and I will use a multivariable regression with the temperature, relative humidity, and wind speed as the independent variables.

```
#assign initial dataset to a new dataset, to prevent errors with preexisting code for the other question
data1=fire_data
```

EDA

```
head(data1)
```

```
##   fire_year fire_number fire_name current_size size_class
## 1      2006     PWF001      <NA>       0.10       A
## 2      2006     EWF002      <NA>       0.20       B
## 3      2006     EWF001      <NA>       0.50       B
## 4      2006     EWF003      <NA>       0.01       A
## 5      2006     PWF002      <NA>       0.10       A
## 6      2006     CWF001      <NA>       0.20       B
##   fire_location_latitude fire_location_longitude      fire_origin
## 1             56.24996           -117.1820    Private Land
## 2             53.60637           -115.9157  Provincial Land
## 3             53.61093           -115.5943  Provincial Land
## 4             53.60887           -115.6095  Provincial Land
## 5             56.24996           -117.0502  Provincial Land
## 6             51.15293           -115.0346 Indian Reservation
##   general_cause_desc industry_identifier_desc responsible_group_desc
## 1        Resident                  <NA>             Resident
## 2     Incendiary                  <NA> Others (explain in remarks)
## 3     Incendiary                  <NA> Others (explain in remarks)
## 4     Incendiary                  <NA> Others (explain in remarks)
## 5 Other Industry            Waste Disposal             Employees
## 6        Resident                  <NA>             Resident
##   activity_class true_cause fire_start_date det_agent_type det_agent
## 1      Grass Permit Related 2006-04-02 12:00          UNP     310
## 2 Lighting Fires Arson Suspected 2006-04-03 12:10          UNP     310
## 3 Lighting Fires Arson Suspected 2006-04-03 12:15          UNP     310
## 4 Lighting Fires Arson Suspected 2006-04-03 12:10          UNP     PUB
## 5      Refuse Permit Related 2006-04-03 17:00          UNP     LFS
## 6  Unclassified     Unsafe Fire 2006-04-02 14:25          UNP     310
##   discovered_date discovered_size reported_date dispatched_resource
## 1              <NA>            NA 2006-04-02 20:46      FPD Staff
## 2              <NA>            NA 2006-04-03 12:27      FPD Staff
## 3              <NA>            NA 2006-04-03 12:36      FPD Staff
## 4              <NA>            NA 2006-04-03 13:23      FPD Staff
## 5 2006-04-03 19:11            NA 2006-04-03 19:12      FPD Staff
## 6 2006-04-02 14:27            NA 2006-04-02 14:30      FPD Staff
##   dispatch_date start_for_fire_date assessment_resource assessment_datetime
## 1 2006-04-02 21:10    2006-04-02 21:20      IA Forces 2006-04-02 22:00
## 2 2006-04-03 12:33    2006-04-03 12:35      IA Forces 2006-04-03 13:20
## 3 2006-04-03 12:36    2006-04-03 12:42      IA Forces 2006-04-03 13:23
## 4 2006-04-03 13:50    2006-04-03 13:50      IA Forces 2006-04-03 14:08
## 5 2006-04-03 19:19    2006-04-03 19:22          Other 2006-04-03 19:57
## 6 2006-04-02 14:40    2006-04-02 14:45      IA Forces 2006-04-02 16:00
##   assessment_hectares fire_spread_rate fire_type fire_position_on_slope
## 1                 0.01           0.0 Surface           Flat
## 2                 0.20           0.0 Surface      Lower 1/3
## 3                 0.50           0.0 Surface           Bottom
## 4                 0.01           0.0 Surface           Flat
## 5                 0.10           0.1 Surface           Flat
## 6                 0.20           0.0 Surface           Flat
```

```

##   weather_conditions_over_fire temperature relative_humidity wind_direction
## 1                         Clear      18            10          SW
## 2                         Clear      12            22          SW
## 3                         Clear      12            22          SW
## 4                         Clear      12            22          SW
## 5                         Clear       6            37          SW
## 6                         Clear     11            32           S
##   wind_speed fuel_type initial_action_by ia_arrival_at_fire_date ia_access
## 1        2       01a      Land Owner             <NA>      <NA>
## 2       10       01a    Fire Department           <NA>      <NA>
## 3       10       01a    Fire Department           <NA>      <NA>
## 4       10       01b      Industry             <NA>      <NA>
## 5        2      <NA>    Fire Department           <NA>      <NA>
## 6       20       01b    Fire Department           <NA>      <NA>
##   fire_fighting_start_date fire_fighting_start_size bucketing_on_fire
## 1                  <NA>                 NA      <NA>
## 2                  <NA>                 NA      <NA>
## 3                  <NA>                 NA      <NA>
## 4                  <NA>                 NA      <NA>
## 5                  <NA>                 NA      <NA>
## 6                  <NA>                 NA      <NA>
##   distance_from_water_source first_bucket_drop_date      bh_fs_date
## 1                      NA             <NA> 2006-04-02 22:00
## 2                      NA             <NA> 2006-04-03 13:20
## 3                      NA             <NA> 2006-04-03 13:23
## 4                      NA             <NA> 2006-04-03 14:08
## 5                      NA             <NA> 2006-04-03 19:57
## 6                      NA             <NA> 2006-04-02 16:00
##   bh_hectares      uc_fs_date uc_hectares      to_fs_date to_hectares
## 1     0.01 2006-04-02 22:00      0.01      <NA>      NA
## 2     0.20 2006-04-03 13:20      0.20      <NA>      NA
## 3     0.50 2006-04-03 13:23      0.50      <NA>      NA
## 4     0.01 2006-04-03 14:08      0.01      <NA>      NA
## 5     0.10 2006-04-03 20:19      0.10 2006-04-03 20:20      0.1
## 6     0.20 2006-04-02 16:00      0.20      <NA>      NA
##   ex_fs_date ex_hectares
## 1 2006-04-03 10:20      0.10
## 2 2006-04-03 14:00      0.20
## 3 2006-04-03 15:00      0.50
## 4 2006-04-03 15:05      0.01
## 5 2006-04-05 10:18      0.10
## 6 2006-04-03 18:00      0.20

```

Based off of the potential relationship I wish to investigate I will create a new data frame with the columns of interest.

```

reg_df=data.frame(uc_hectares=data1$uc_hectares,temperature=data1$temperature,relative_humidity=data1$relative_humidity)
summary(reg_df)

```

```

##   uc_hectares      temperature      relative_humidity      wind_speed
## Min.   : 0.0   Min.   :-39.00   Min.   : 0.00   Min.   : 0.000
## 1st Qu.: 0.0   1st Qu.: 14.00   1st Qu.: 31.00   1st Qu.: 3.000
## Median : 0.0   Median : 19.00   Median : 40.00   Median : 6.000

```

```

##  Mean    : 245.6   Mean    : 17.85   Mean    : 45.38   Mean    : 8.813
##  3rd Qu.: 0.3     3rd Qu.: 23.00   3rd Qu.: 56.00   3rd Qu.: 12.000
##  Max.    : 707648.0 Max.    : 39.90   Max.    : 100.00  Max.    : 90.000
##                NA's    : 2820     NA's    : 2822     NA's    : 2823

```

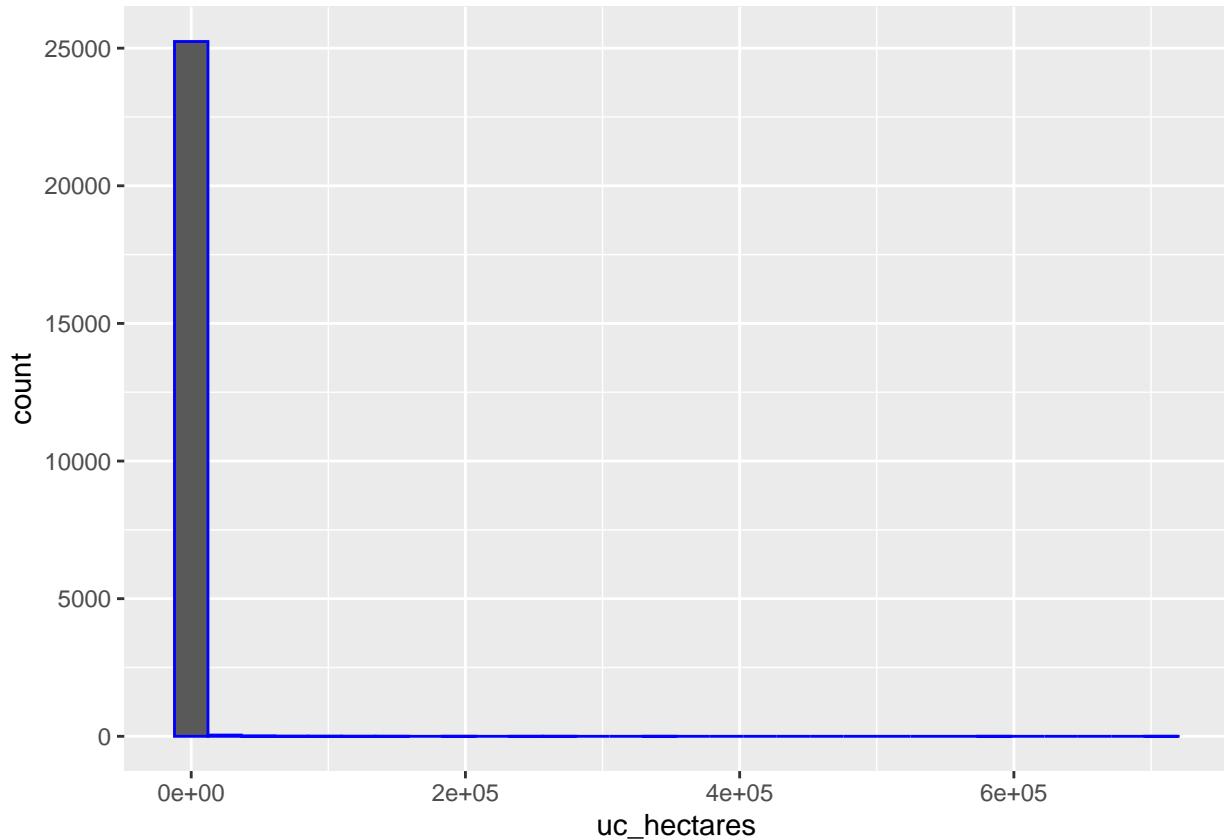
Based off of the summary stats the dependent variable uc_hectares seems to be strongly skewed. To explore the data I will create histograms to display the data's distribution.

```

ggplot(data = reg_df, aes(x = uc_hectares)) +
  geom_histogram(color='blue')

## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

```



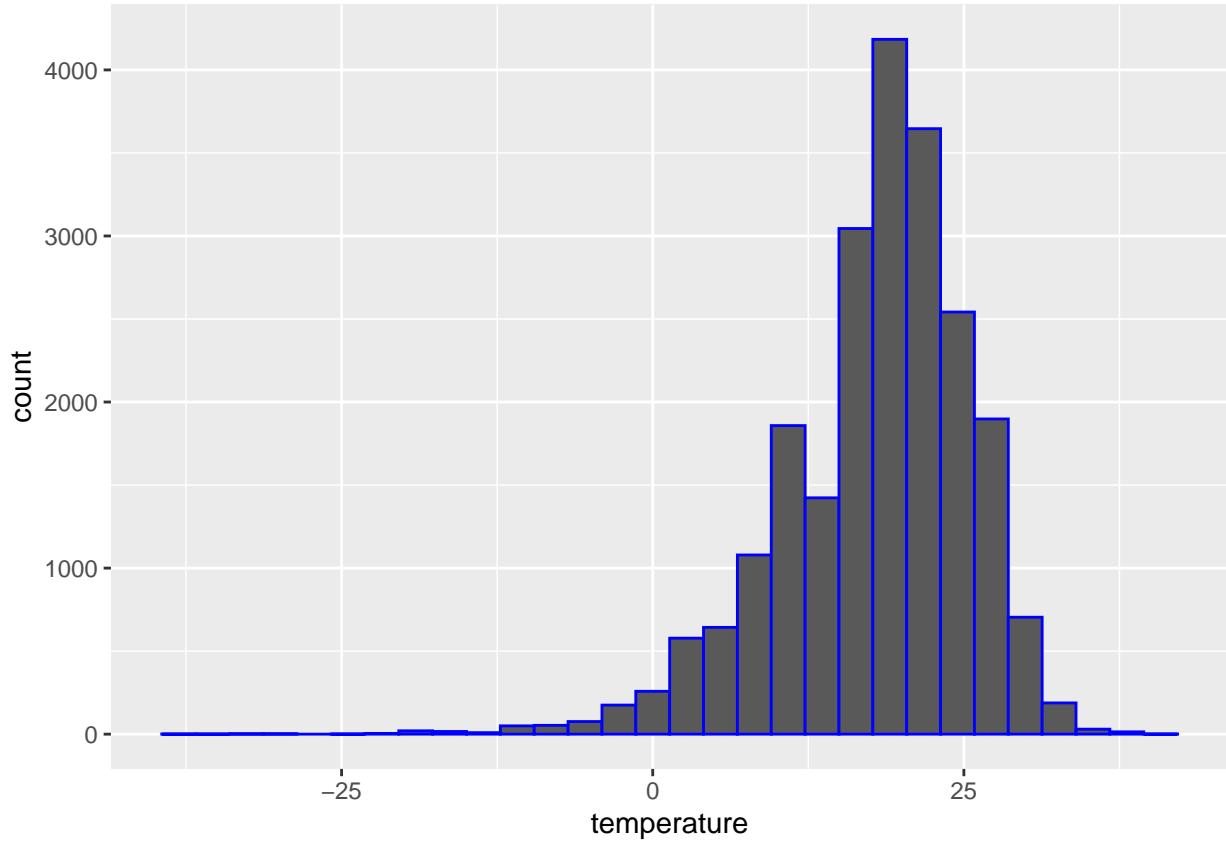
```

ggplot(data = reg_df, aes(x = temperature)) +
  geom_histogram(color='blue')

## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

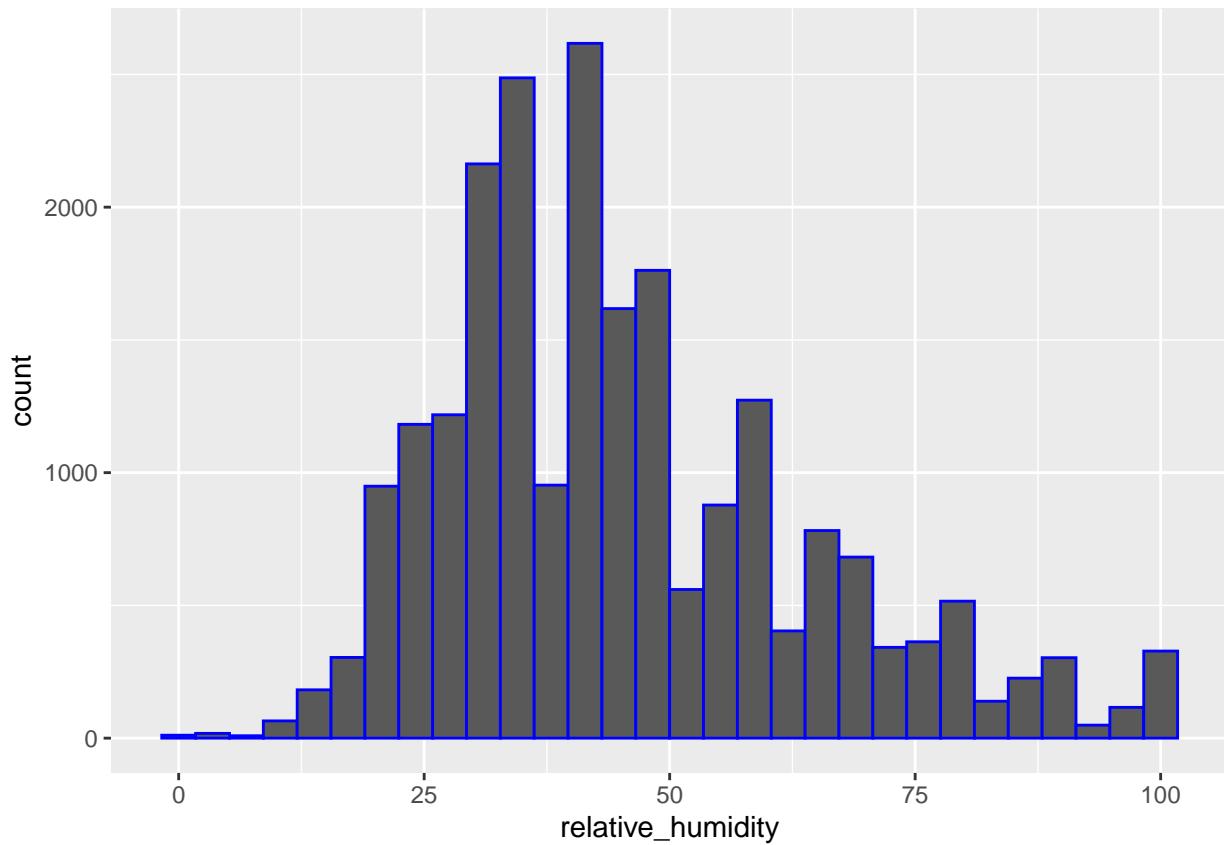
## Warning: Removed 2820 rows containing non-finite outside the scale range
## (`stat_bin()`).

```

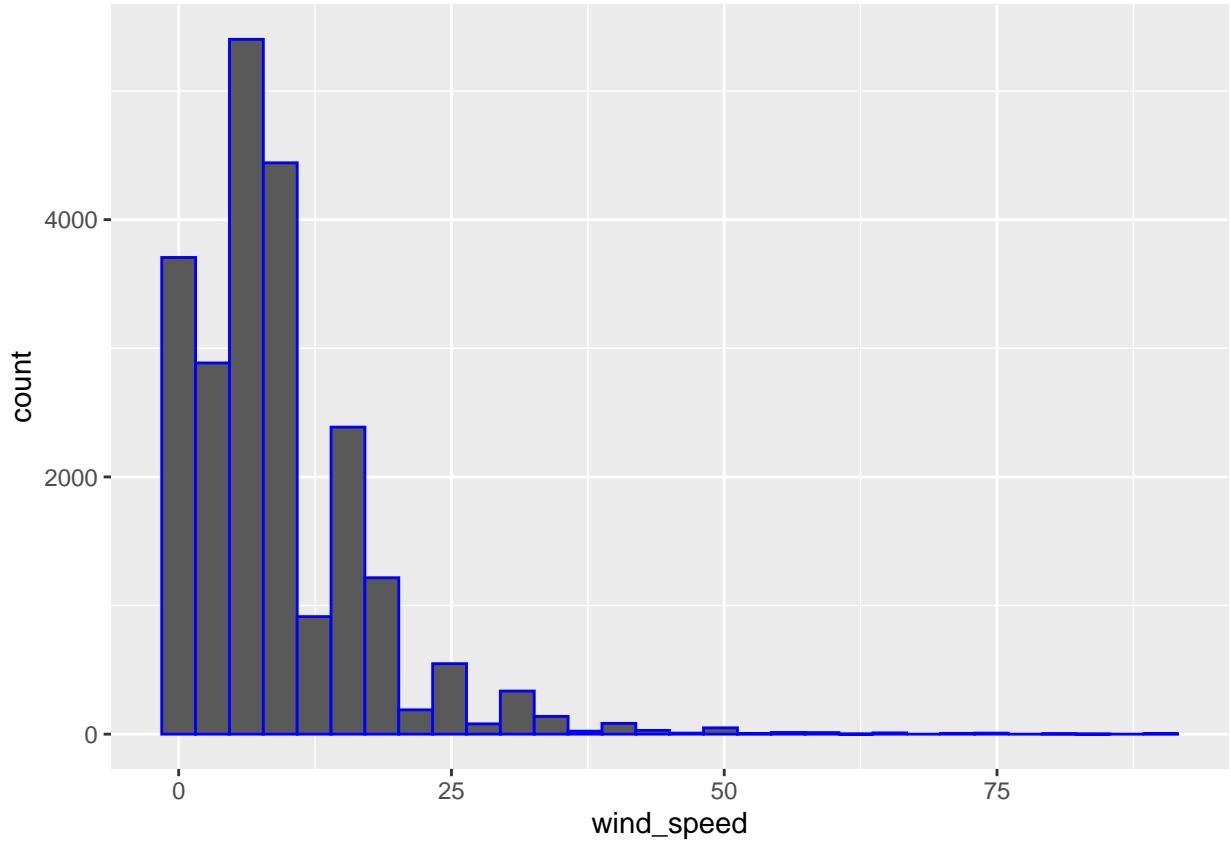


```
ggplot(data = reg_df, aes(x = relative_humidity)) +
  geom_histogram(color='blue')

## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
## Warning: Removed 2822 rows containing non-finite outside the scale range
## (`stat_bin()`).
```



```
ggplot(data = reg_df, aes(x = wind_speed)) +  
  geom_histogram(color='blue')  
  
## `stat_bin()` using `bins = 30`. Pick better value with `binwidth`.  
  
## Warning: Removed 2823 rows containing non-finite outside the scale range  
## (`stat_bin()`).
```



Unsurprisingly the distribution of the uc_hectares variable is greatly skewed confirming what could be seen in the summary statistics.

Regression Analysis

```
reglarge=lm(formula=reg_df$uc_hectares~reg_df$temperature+reg_df$relative_humidity+reg_df$wind_speed)
summary(reglarge)

##
## Call:
## lm(formula = reg_df$uc_hectares ~ reg_df$temperature + reg_df$relative_humidity +
##     reg_df$wind_speed)
##
## Residuals:
##      Min      1Q Median      3Q      Max 
## -3902   -479   -220      29  705357 
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)    
## (Intercept)             -279.842    229.400  -1.220 0.222521    
## reg_df$temperature       23.514     7.070   3.326 0.000883 ***  
## reg_df$relative_humidity -5.442     2.927  -1.860 0.062956 .    
## reg_df$wind_speed        42.551     6.231   6.829 8.76e-12 ***  
## ---                        
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```

## 
## Residual standard error: 7734 on 22492 degrees of freedom
##   (2825 observations deleted due to missingness)
## Multiple R-squared:  0.003188, Adjusted R-squared:  0.003055
## F-statistic: 23.98 on 3 and 22492 DF, p-value: 1.733e-15

```

To start I'll state the hypothesis test for all coefficients, H0: B=0 The coefficient in question is not statistically significant from 0 H1: B!=0 The coefficient is statistically significant from 0

The intercept is -279.8 hectares if all other variables are 0 which does not make sense and it is unsurprisingly not significant with a P value of 0.22 so we cannot reject the null hypothesis. The coefficient for temperature, 23.5 hectares per degree increase in temperature has a P value of 0.00088 allowing us to state that is significant and we can reject the null hypothesis. The coefficient for relative humidity is -5.44 hectares per %increase in humidity, with a P value of 0.062 the coefficient is not significant at the 5% level but is close. Under the stated hypothesis test we cannot reject the null hypothesis. Lastly The coefficient for wind speed is 42.5 hectares burned per 1 kilometer per hour increase. With a P value of near 0 the coefficient is significant and we can reject the null hypothesis.

With an adj R-squared of 0.003055 indicating the regression only explains 0.32% of variation in uc_hectares is explained by this model, this indicates that the estimated model is likely a very poor fit for the data.

```

reg_cor= round(cor(reg_df,use = "complete.obs"), 2)
reg_cor

```

	uc_hectares	temperature	relative_humidity	wind_speed
## uc_hectares	1.00	0.03	-0.03	0.05
## temperature	0.03	1.00	-0.28	-0.02
## relative_humidity	-0.03	-0.28	1.00	-0.17
## wind_speed	0.05	-0.02	-0.17	1.00

From the correlation matrix we can see that there is very little correlation between uc_hectares and any of the independent variables. To better visualize this I will create scatter plots with estimated models for each independent variable and uc_hectares as visualizing a multivariate regression model is difficult.

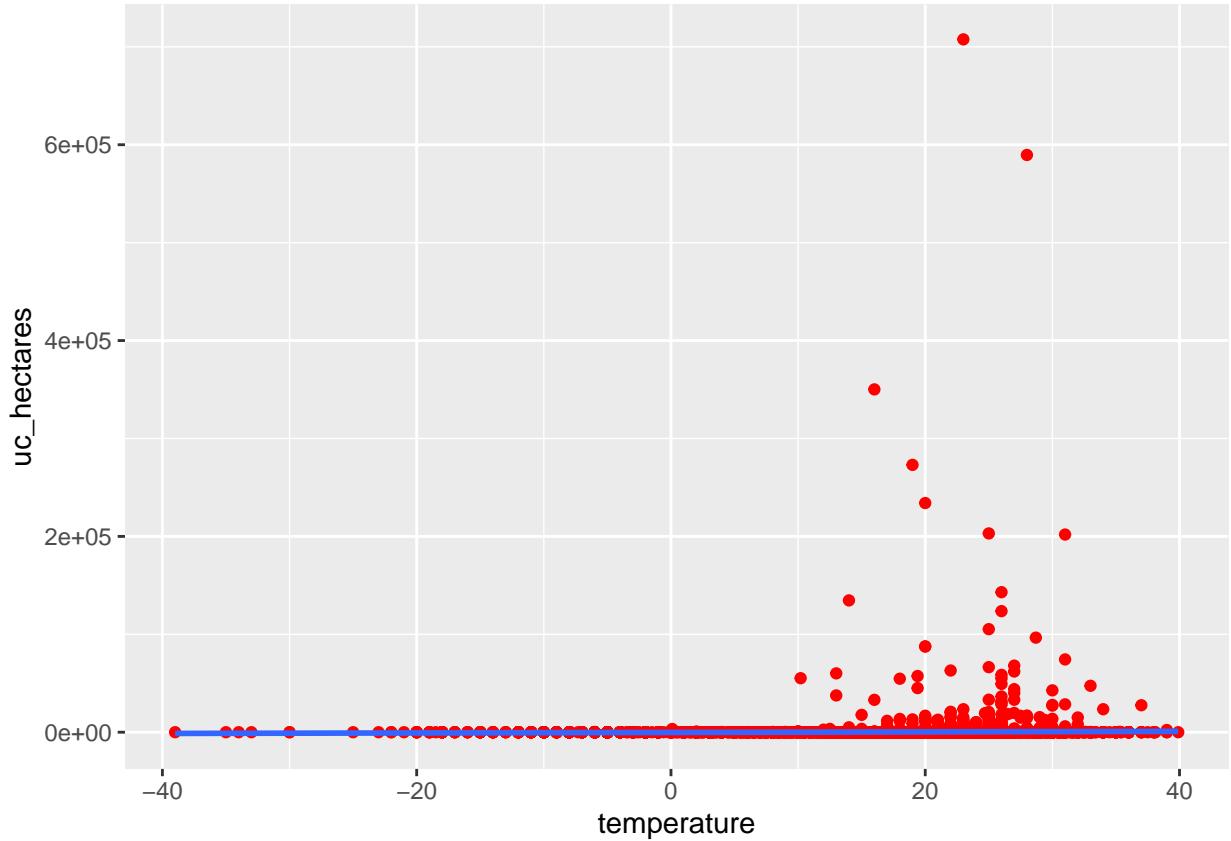
```

ggplot(reg_df, aes(x=temperature, y=uc_hectares )) +
  geom_point(color = "red") + stat_smooth(method = "lm",
                                             formula = y ~ x, geom = "smooth")

## Warning: Removed 2820 rows containing non-finite outside the scale range
## ('stat_smooth()').

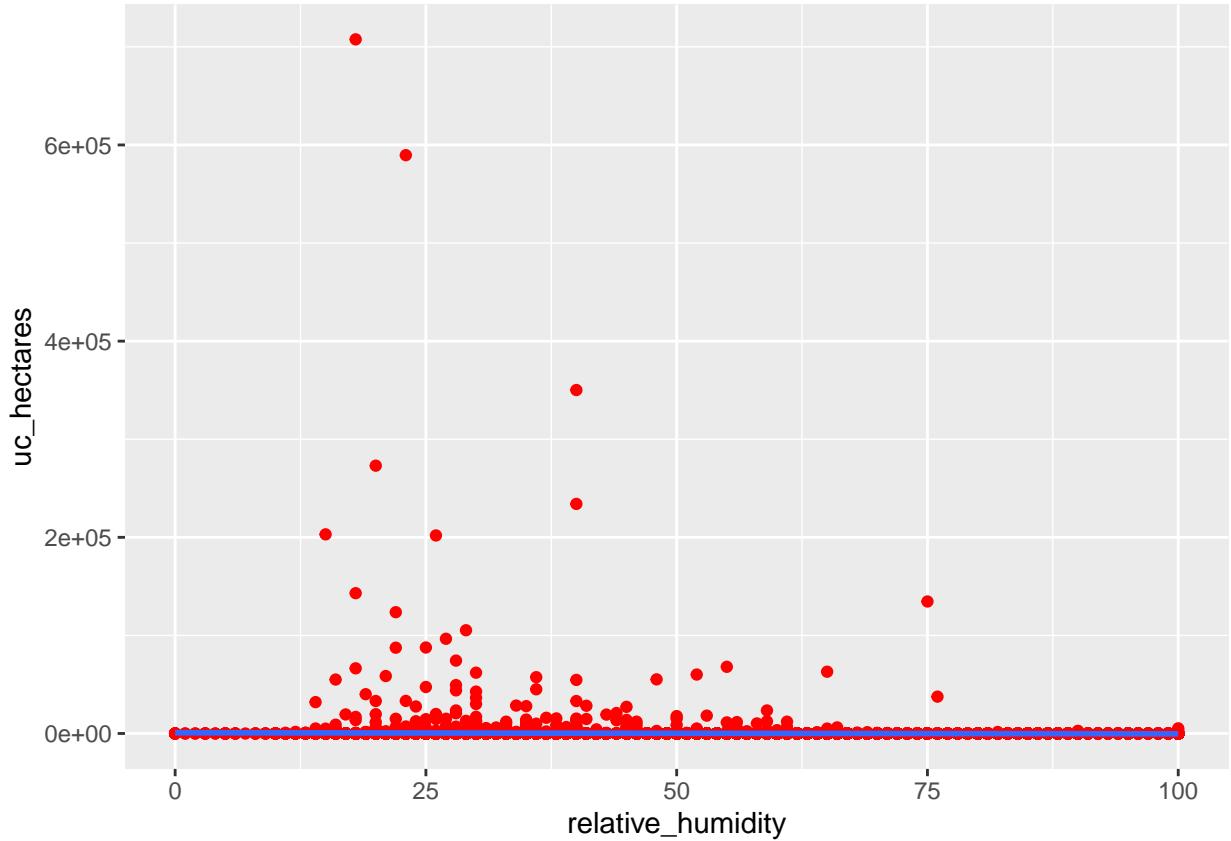
## Warning: Removed 2820 rows containing missing values or values outside the scale range
## ('geom_point()').

```



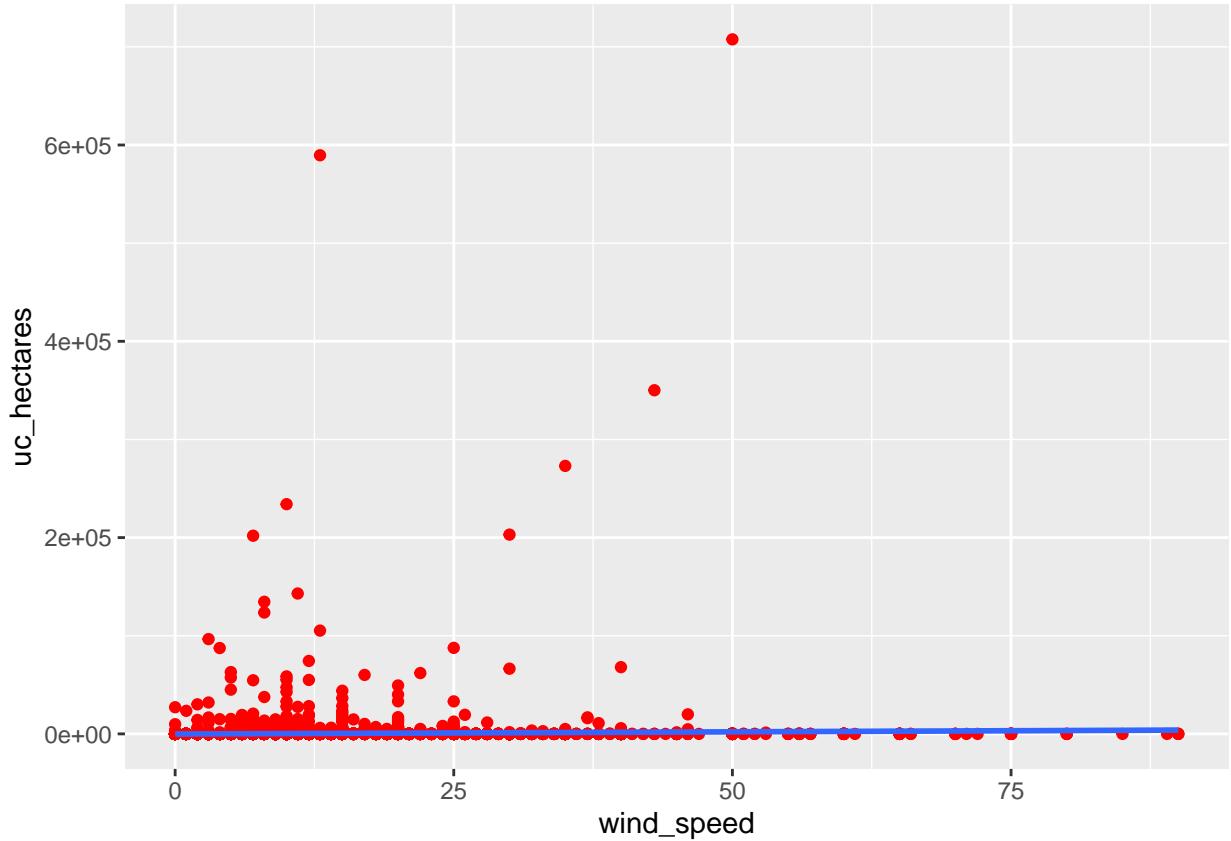
```
ggplot(reg_df, aes(x=relative_humidity, y=uc_hectares )) +  
  geom_point(color = "red") + stat_smooth(method = "lm",  
    formula = y ~ x, geom = "smooth")
```

```
## Warning: Removed 2822 rows containing non-finite outside the scale range  
## ('stat_smooth()').  
  
## Warning: Removed 2822 rows containing missing values or values outside the scale range  
## ('geom_point()').
```

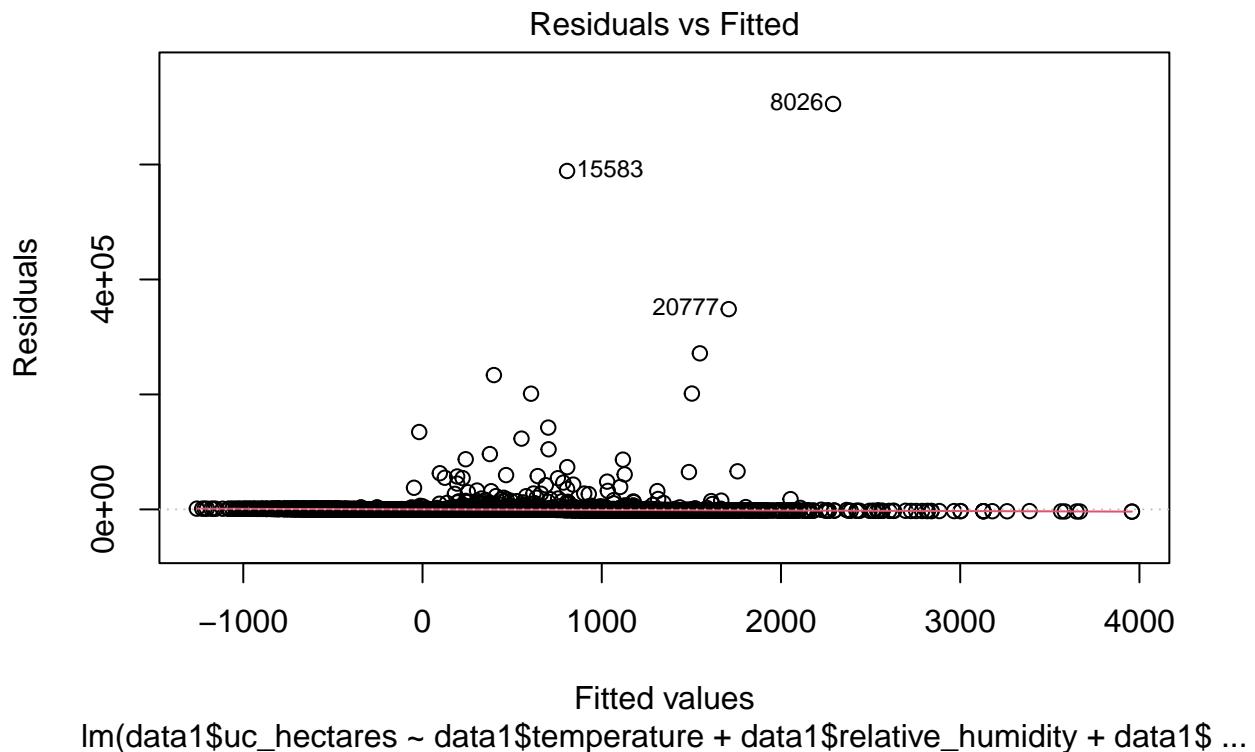


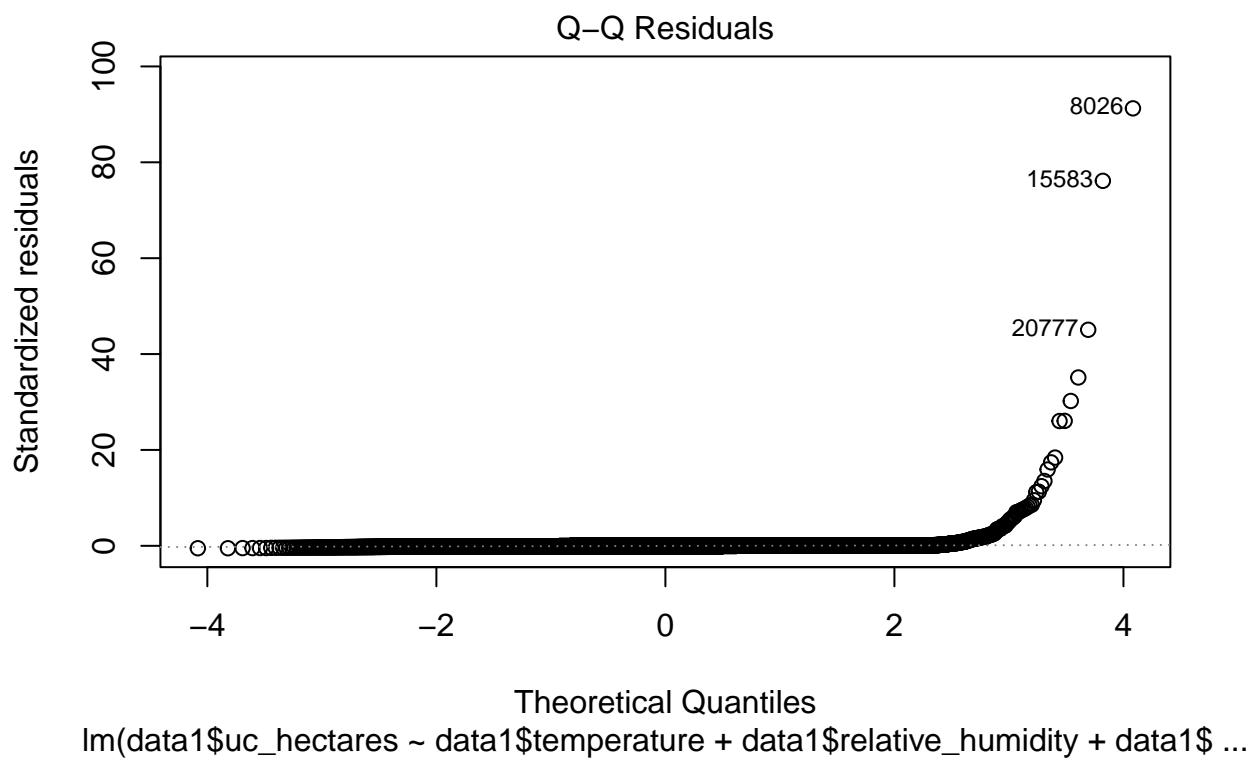
```
ggplot(reg_df, aes(x=wind_speed, y=uc_hectares)) +  
  geom_point(color = "red") + stat_smooth(method = "lm",  
    formula = y ~ x, geom = "smooth")
```

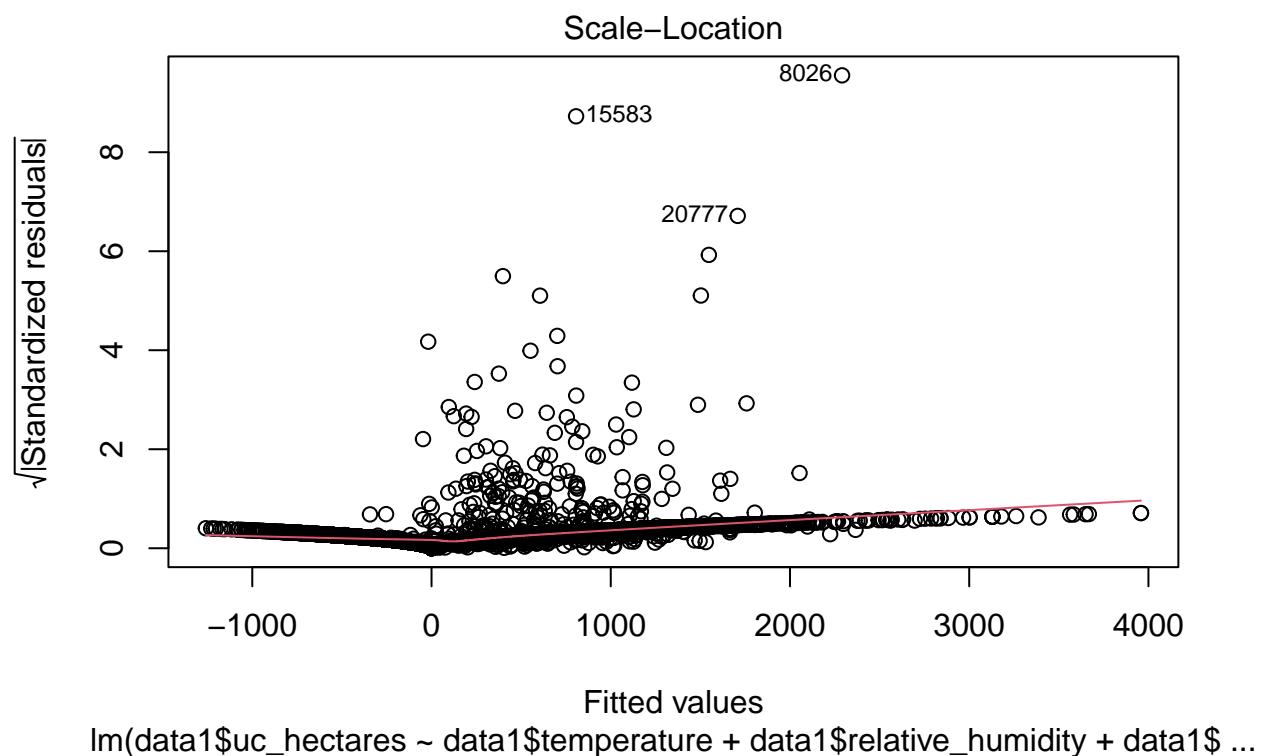
```
## Warning: Removed 2823 rows containing non-finite outside the scale range  
## ('stat_smooth()').  
  
## Warning: Removed 2823 rows containing missing values or values outside the scale range  
## ('geom_point()').
```

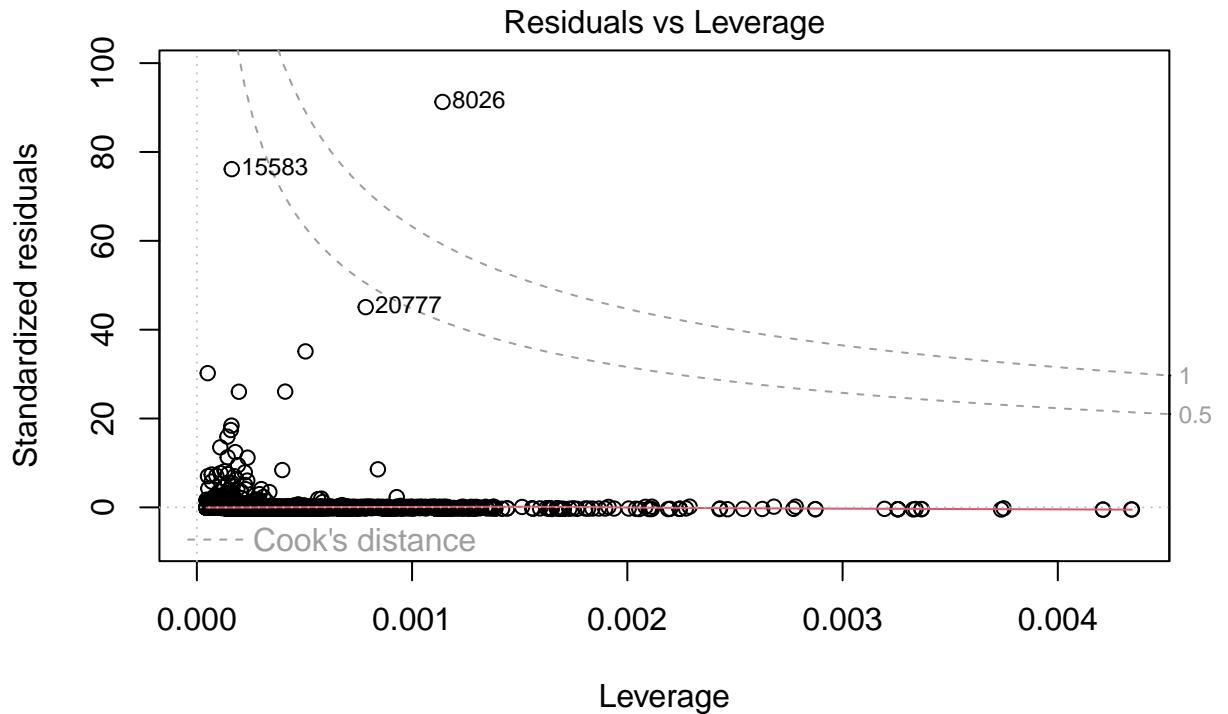


```
plot(lm(formula=uc_hectares~temperature+relative_humidity+wind_speed))
```









The plots above show that the residuals are not independent or normally distributed. The first plot shows that there are some large outliers in the data and the normality plot also shows that the the residuals are not normally distributed. This indicates that the model is likely unreliable. A log log transformation could perhaps improve this somewhat.

```

reg_dflog=data.frame(uc_hectares=log10(data1$uc_hectares),temperature=data1$temperature,relative_humidi

reglog=lm(formula=reg_dflog$uc_hectares~reg_dflog$temperature+reg_dflog$relative_humidity+reg_dflog$wind
summary(reglog)

## 
## Call:
## lm(formula = reg_dflog$uc_hectares ~ reg_dflog$temperature +
##     reg_dflog$relative_humidity + reg_dflog$wind_speed)
## 
## Residuals:
##      Min       1Q   Median       3Q      Max 
## -3.1129 -0.8514 -0.2214  0.6036  6.4842 
## 
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)    
## (Intercept)             -1.2367098  0.0328594 -37.64   <2e-16 ***
## reg_dflog$temperature    0.0193262  0.0010127  19.08   <2e-16 ***
## reg_dflog$relative_humidity -0.0079249  0.0004192 -18.91   <2e-16 ***
## reg_dflog$wind_speed      0.0256644  0.0008925  28.76   <2e-16 ***
## ---
```

```

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.108 on 22492 degrees of freedom
##   (2825 observations deleted due to missingness)
## Multiple R-squared:  0.08394,   Adjusted R-squared:  0.08382
## F-statistic:    687 on 3 and 22492 DF,  p-value: < 2.2e-16

```

Transforming the data in log format did improve the regression and the P values of all coefficients are below 0.05 allowing us to state that all 3 coefficients significant along with the intercept but still does not make sense in the context of the data. With an adj R-squared of 0.083 the fit of the model does improve in this case drastically from the first model.

```

ggplot(reg_dflog, aes(x=temperature, y=uc_hectares )) +
  geom_point(color = "red") + stat_smooth(method = "lm",
                                           formula = y ~ x, geom = "smooth")

```

```

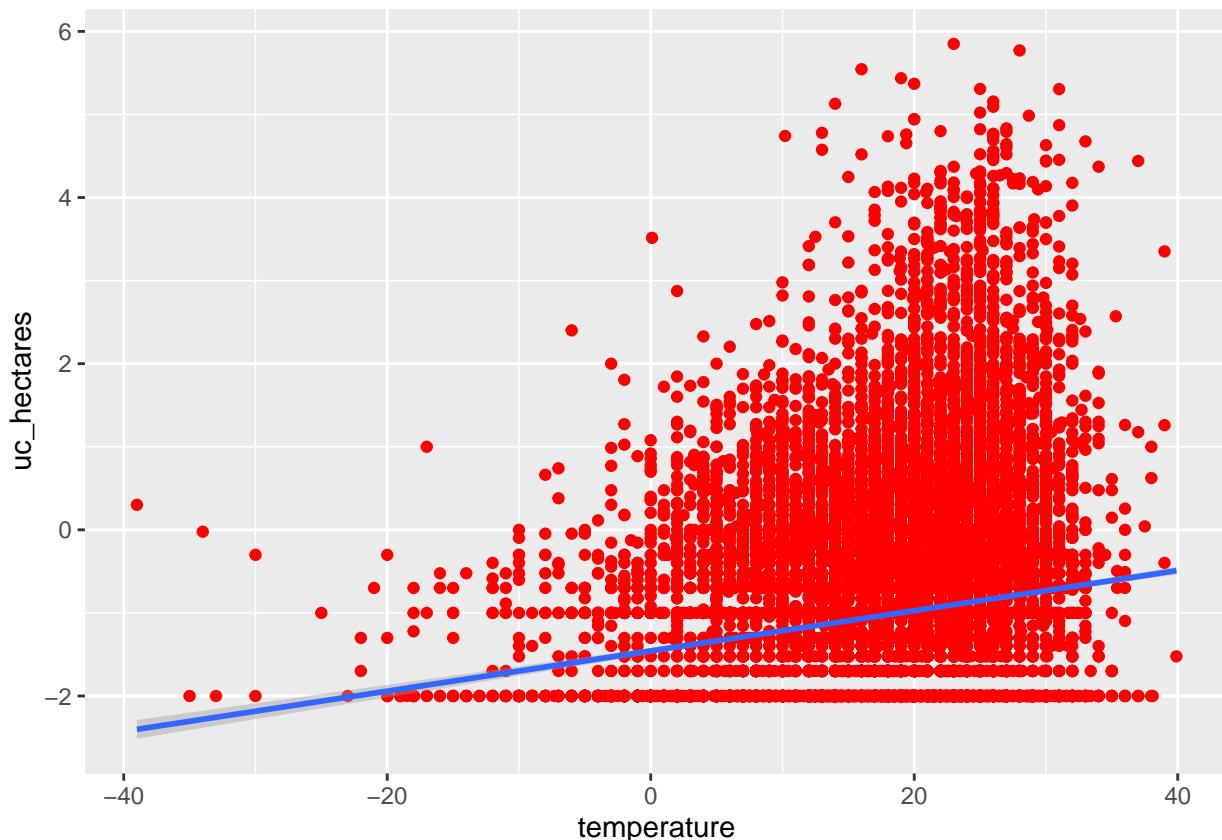
## Warning: Removed 2820 rows containing non-finite outside the scale range
## ('stat_smooth()').

```

```

## Warning: Removed 2820 rows containing missing values or values outside the scale range
## ('geom_point()').

```



```

ggplot(reg_dflog, aes(x=relative_humidity, y=uc_hectares )) +
  geom_point(color = "red") + stat_smooth(method = "lm",
                                           formula = y ~ x, geom = "smooth")

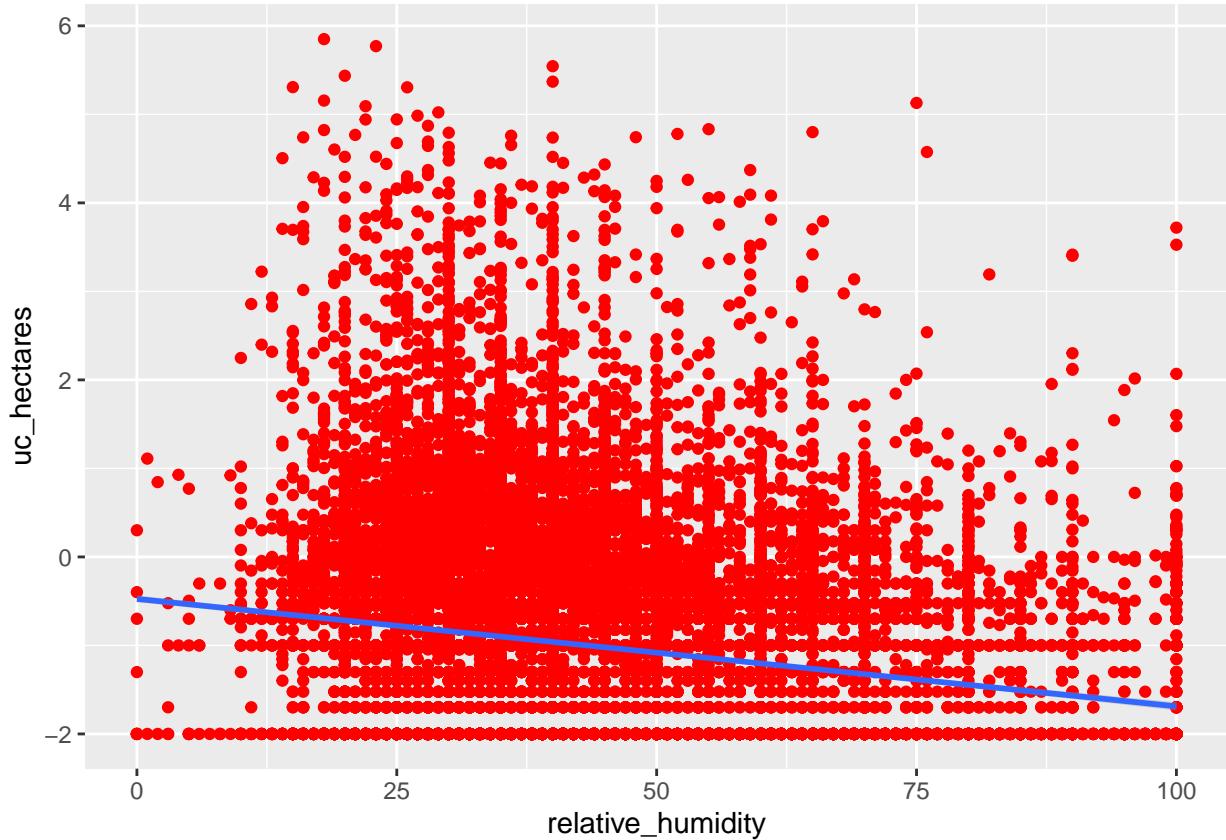
```

```

## Warning: Removed 2822 rows containing non-finite outside the scale range
## ('stat_smooth()').

## Warning: Removed 2822 rows containing missing values or values outside the scale range
## ('geom_point()').

```



```

ggplot(reg_dflog, aes(x=wind_speed, y=uc_hectares)) +
  geom_point(color = "red") + stat_smooth(method = "lm",
                                           formula = y ~ x, geom = "smooth")

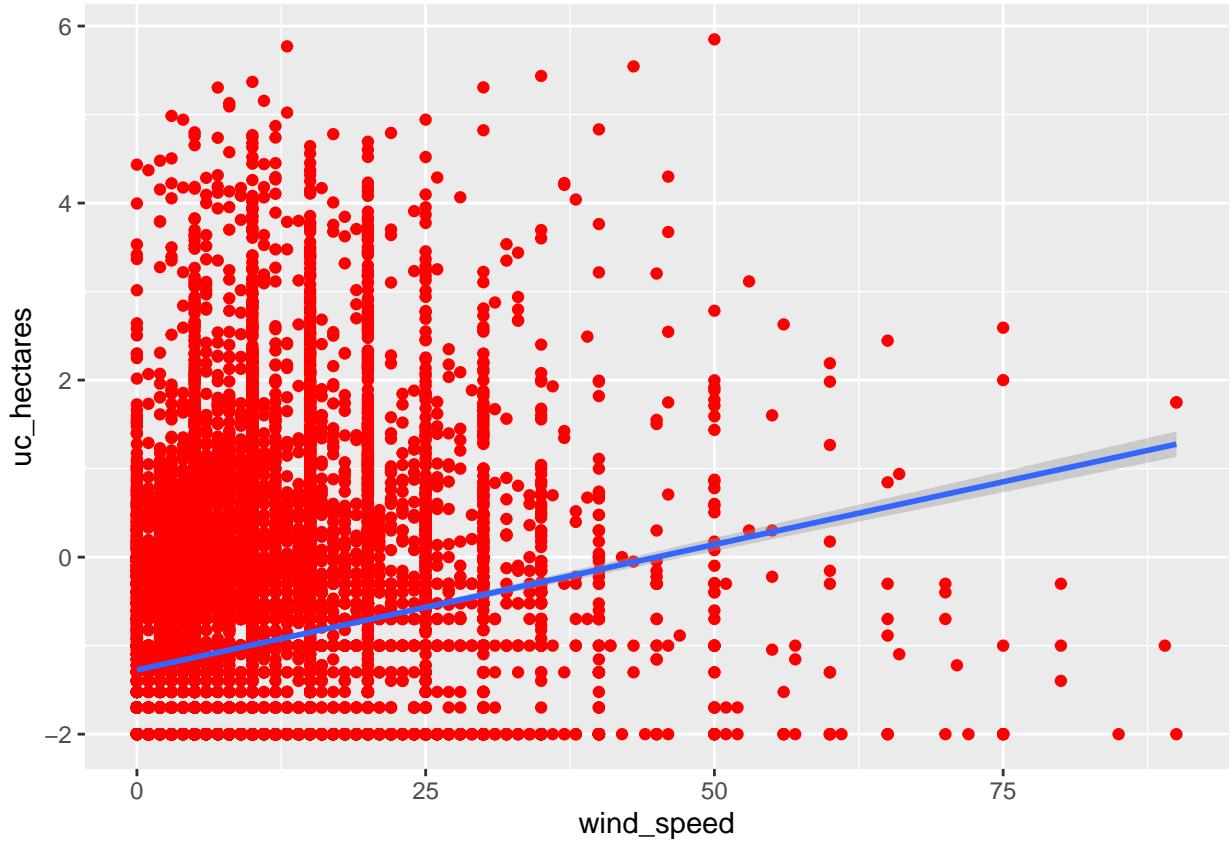
```

```

## Warning: Removed 2823 rows containing non-finite outside the scale range
## ('stat_smooth()').

## Warning: Removed 2823 rows containing missing values or values outside the scale range
## ('geom_point()').

```

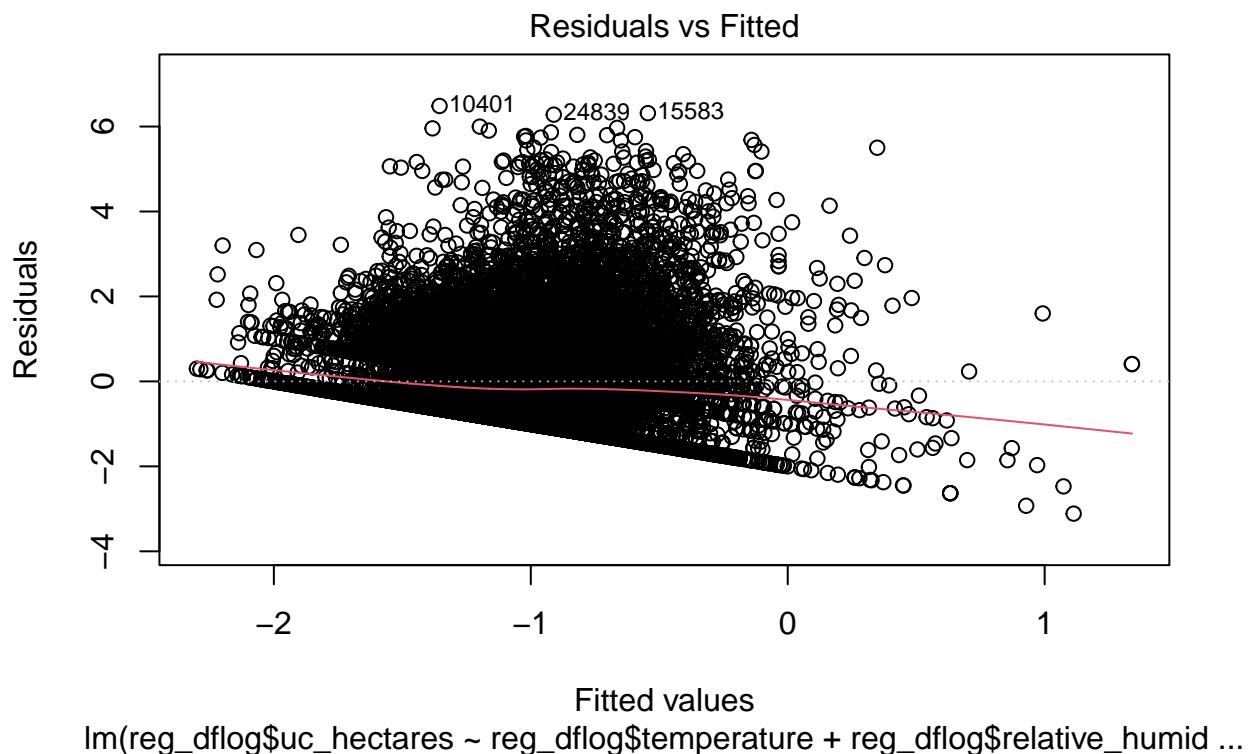


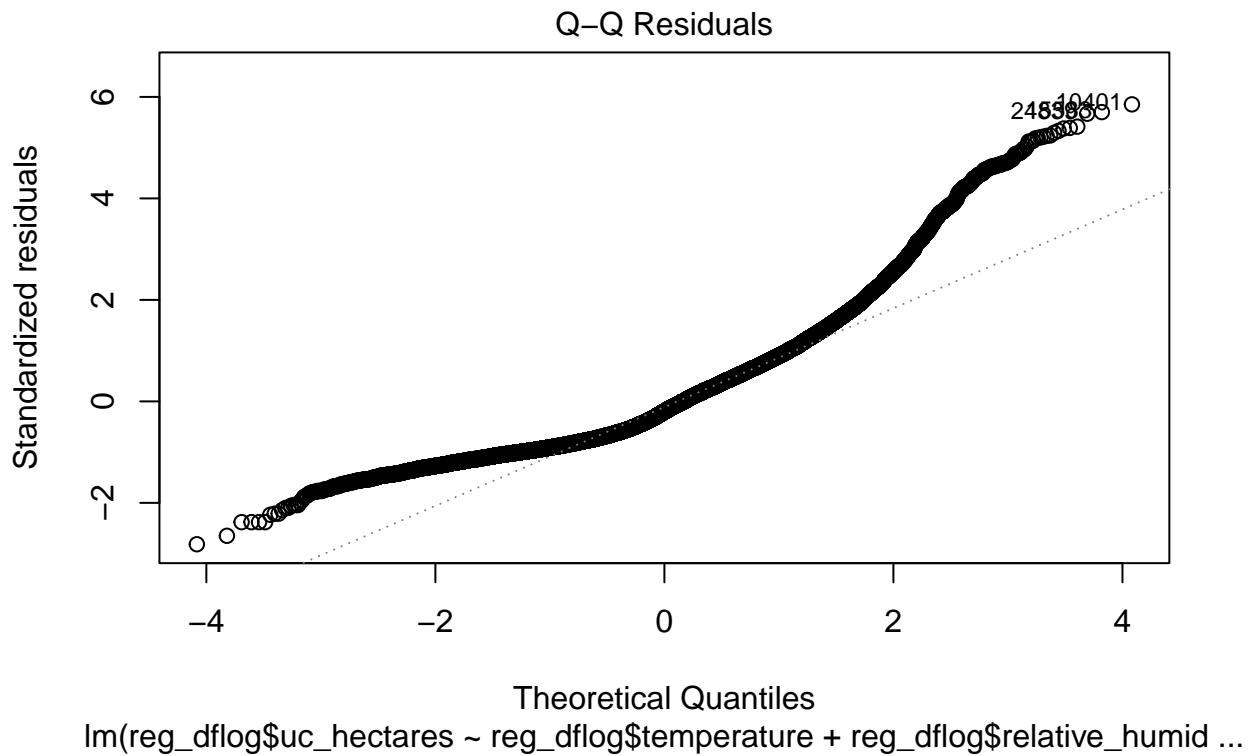
```
reg_corlog= round(cor(reg_dflog,use = "complete.obs"), 2)
reg_corlog
```

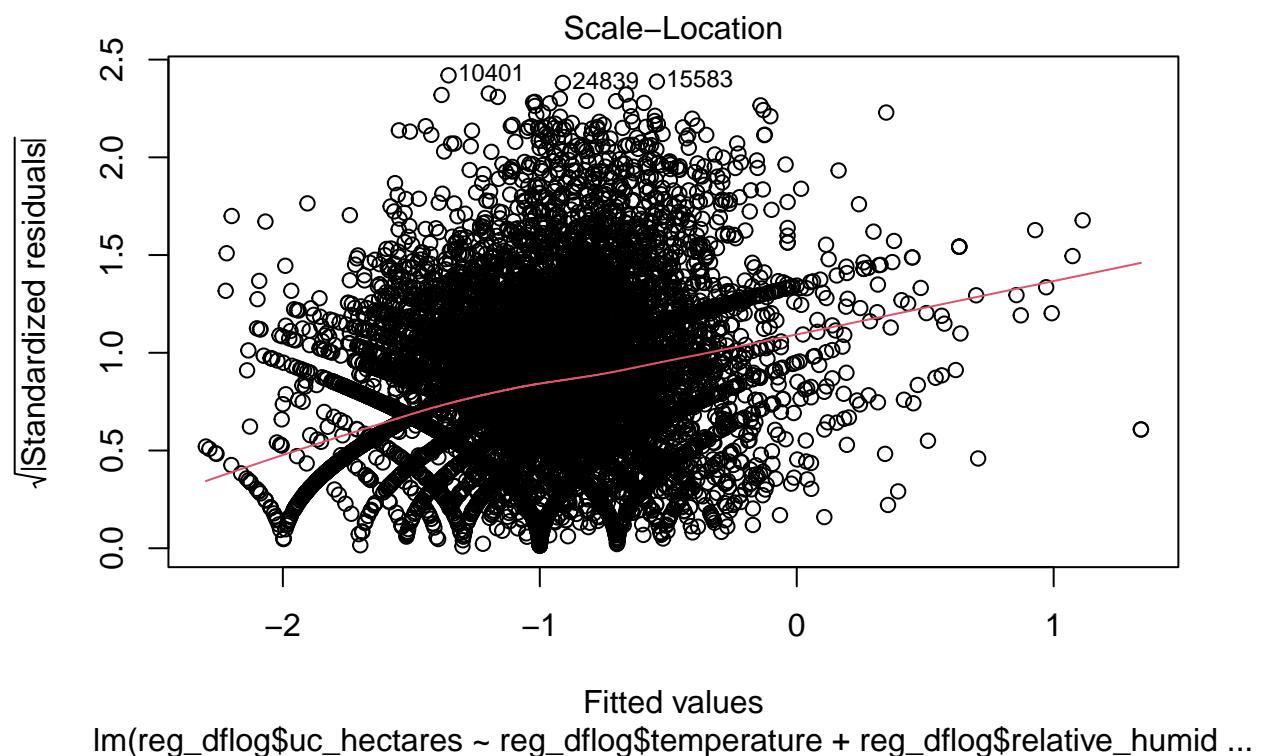
	uc_hectares	temperature	relative_humidity	wind_speed
## uc_hectares	1.00	0.16	-0.20	0.21
## temperature	0.16	1.00	-0.28	-0.02
## relative_humidity	-0.20	-0.28	1.00	-0.17
## wind_speed	0.21	-0.02	-0.17	1.00

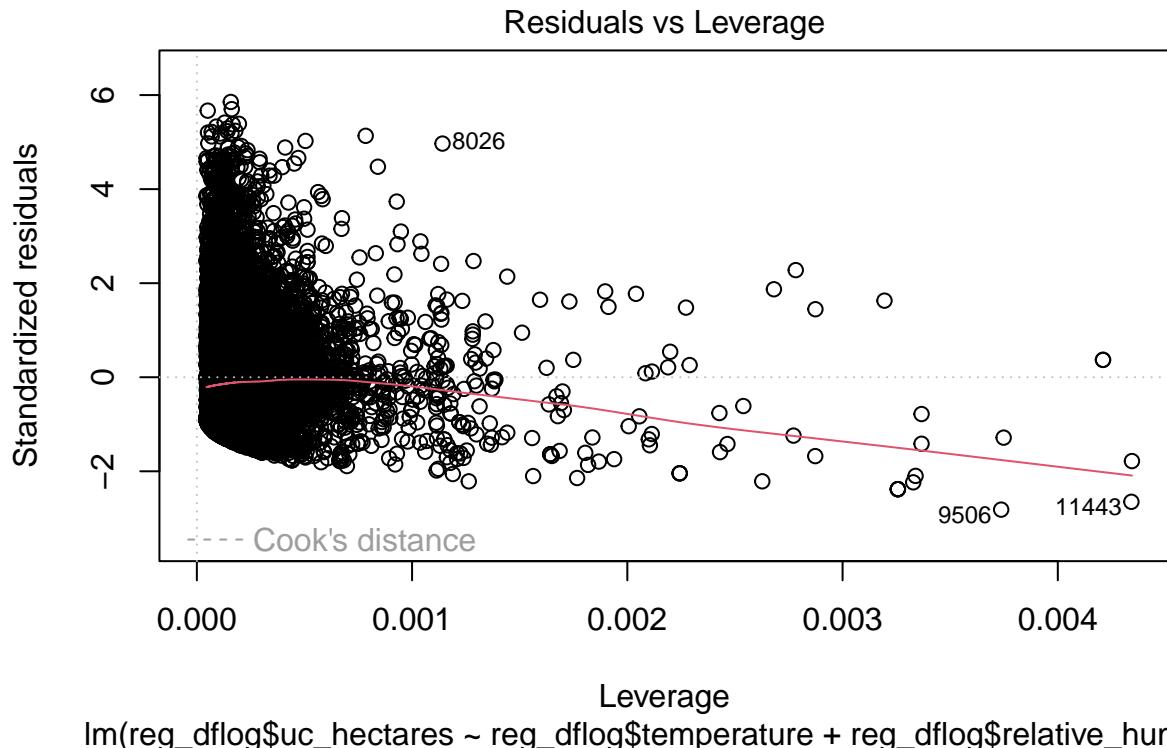
With the fire size transformed into log form the data shows slightly more of a linear relationship. Additionally, the correlation matrix shows an improved correlation between the independent and dependent variables.

```
plot(lm(formula=reg_dflog$uc_hectares~reg_dflog$temperature+reg_dflog$relative_humidity+reg_dflog$wind_
```









While still not independent or normally distributed it is still a large improvement on the original model with the untransformed data.

Overall the model with the total dataset does not fit the data well and the visualizations showed that there was almost no linear relationship between the variables and the fire size. However, once the fire size data is transformed so the model is in log linear format the model and the visualizations showed a much better relationship between the weather and fire size. With the size of the dataset and other variables available perhaps a larger or non linear model could be built to better fit the fire size data but given the regressions above temperature, wind speed, and relative humidity alone are not enough to sufficiently explain the data while there is at least something of a relationship between them.

Conclusion

Both questions investigating potential determinants of fire spread rates did have significant coefficients their R-squared values were low. The model looking at the relationship between fire size, response, and extinguished time did have significant coefficients and did show a good linear relationship between fire size and time to extinguishment time. The multivariable model looking at if weather conditions can predict fire size did show a linear relationship in the variables that were all significant, but the R-squared value was also low.

Overall, many of our results came down to the fact that the skewed nature of much of the data affected our linear model's ability to fit the data. Even with transformations and slightly larger multivariable models they were not sufficient. Perhaps a more comprehensive model containing more of the dataset's variables or perhaps a non-linear model may fit the data better.

References

1. Friedman, E. S., Kauffman, M. J., Burch, J. W., & Cottam, R. (2019). Trends in conifer regeneration following disturbance in a high-elevation forest: Implications for forest management and restoration. Canadian Journal of Forest Research, 49(5), 502-511. <https://doi.org/10.1139/cjfr-2018-0293>
2. Government of Alberta. (n.d.). Wildfire data [Data set]. Open Alberta. <https://open.alberta.ca/opendata/wildfire-data#summary>