Lina's Analysis

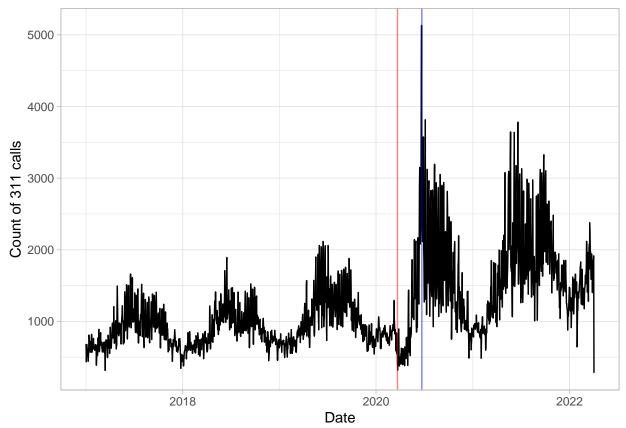
Lina Cook

4/21/2022

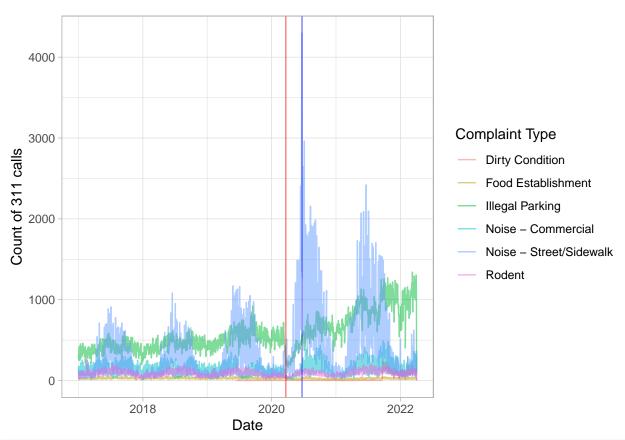
```
# load R libraries
library(janitor)
library(broom)
## Warning: package 'broom' was built under R version 4.0.5
library(tidyverse)
library(tidyr)
library(kableExtra)
library(reticulate)
## Warning: package 'reticulate' was built under R version 4.0.5
library(data.table)
library(XML)
## Warning: package 'XML' was built under R version 4.0.5
library(RSocrata)
library(nominatimlite)
library(spatialrisk)
library(maps)
library(ggmap)
library(mapdata)
# load Python libraries
#reticulate::py_install("pandas")
#reticulate::py_install("usaddress")
#reticulate::py_install("usaddress-scourgify", pip=TRUE)
# address objects
usaddress <- reticulate::import('usaddress')</pre>
scourgify <- reticulate::import('scourgify')</pre>
# FCN: normalize addresses
# function to usaddress-scourgify that normalizes addresses and returns
# a datatable of normalized addresses
normalize_address <- function(address_dat) {</pre>
  ## throw error if scourgify module is not imported
  if (! reticulate::py_module_available('scourgify')) {
    stop('The scourgify python module is not available in the default Python installation\n',
         'Install the usddress-scourgify module in R by calling:\n reticulate::py_install("usaddress
```

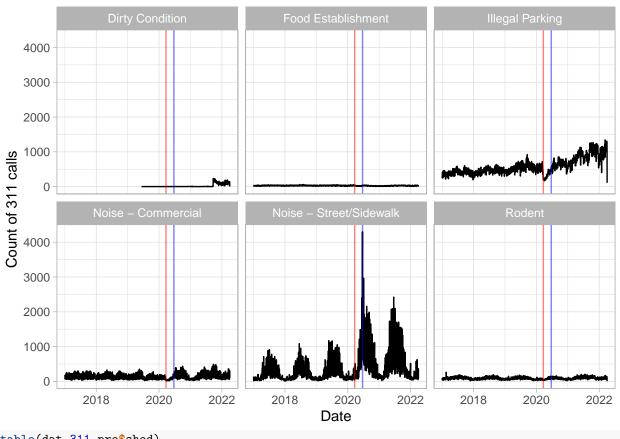
```
## create object using purrr to specify how errors will be treated
  ## in this case, errors will print "ERROR" across all address fields.
  poss_norm_addr <- purrr::possibly(.f = scourgify$normalize_address_record, otherwise = "ERROR")</pre>
  ## pass addresses to scourgify, which normalizes addresses
  ## according to US Post Office conventions.
  norm_addr <- furrr::future_map(address_dat, poss_norm_addr)</pre>
  ## bind list to dataframe for easier handling
  z_address_df <- as.data.frame(do.call(rbind, norm_addr))</pre>
  ## concatenate and edit output
  z_address_df <- z_address_df %>%
    ## trim postal codes
    mutate(postal_code = strtrim(z_address_df$postal_code, 5)) %>%
    ## concatenate
    unite(col = z_addr_cat, 1:5, sep = ", ", remove = FALSE, na.rm = TRUE) %>%
    ## move the concatenated, normalized address field to the first column
    dplyr::relocate(z_addr_cat, .before = address_line_1)
  ## remove NULL values
    ## from concatenated address field
    z_address_df$z_addr_cat <- gsub("NULL, ", "", z_address_df$z_addr_cat)
    ## from all other areas in dataframe
    z_address_df <- map_df(z_address_df, ~ gsub("NULL", "", .x))</pre>
  ## add raw address back on to results
  z_address_df <- cbind(address_dat, z_address_df) %>%
    rename(raw_addr = address_dat)
}
## Read in data
dat_311 <- read.csv("./data/dat_311_combined.csv")</pre>
## Make year variable, make created_date into date variable
dat_311 <- dat_311 %>%
 mutate(year = as.numeric(substr(created date, start = 1, stop = 4)),
         month = as.numeric(substr(created date, start = 6, stop = 7)),
         created_date = as.Date(created_date, format = "%Y-%m-%d"),
         latlong = paste0(round(latitude, 4), ", ",
                   round(longitude, 4)),
         after_2020 = case_when(
           year < 2020 \sim 0,
           year >= 2020 ~ 1))
## Read in Open Restaurant Applications
dat_or <- read.csv("./data/Open_Restaurant_Applications.csv")</pre>
## Make tibble of unique lat-longs from open restaurants
latlong_or <- tibble(</pre>
  latlong = pasteO(round(dat_or$Latitude, 4), ", ",
                   round(dat_or$Longitude, 4))) %>%
 filter(latlong != "NA, NA") %>%
```

```
unique()
## Evaluate if each 311 lat-long is in the unique O.R. lat-long's
dat_311$shed <- dat_311$latlong %in% latlong_or$latlong
## Create datasets of before or after 2020
dat_311_pre <- filter(dat_311, year < 2020)
dat_311_post \leftarrow filter(dat_311, year \ge 2020)
## Create datasets of illegal parking from 311
dat_311_parking <- filter(dat_311, complaint_type == "Illegal Parking")</pre>
dat_311_no_park <- filter(dat_311, complaint_type != "Illegal Parking")</pre>
## Create datasets of sheds
dat_311_shed <- dat_311 %>%
 filter(shed == TRUE)
dat_311_no_shed <- dat_311 %>%
 filter(shed == FALSE)
## Summary Table
# dat_311_pre %>%
  group_by(complaint_type) %>%
#
   summarise(
    count = n()
#
# dat_311_post %>%
# group_by(complaint_type) %>%
#
  summarise(
#
     count = n()
#
table(dat_311$complaint_type, dat_311$after_2020)
##
##
                                  0
                                         1
##
    Dirty Condition
                                  3 21971
##
    Food Establishment
                             31734 19303
##
     Illegal Parking
                             507982 605095
##
    Noise - Commercial
                            132673 110452
##
    Noise - Street/Sidewalk 245199 405919
##
    Rodent
                              99250 74940
## Plot of overall number of 311 calls by day
count <- dat_311 %>%
  count(created_date) %>%
  mutate(year = as.numeric(substr(created_date, 1, 4)),
         after_2020 = case_when(
           year < 2020 ~ 0,
           year >= 2020 ~ 1
         ))
ggplot(data = count, aes(x = created_date, y = n)) +
geom_line() +
```



```
## Plot of overall 311 calls per day by complaint type
count2 <- dat_311 %>%
  group_by(complaint_type) %>%
  count(created_date) %>%
 mutate(year = as.numeric(substr(created_date, 1, 4)),
         after_2020 = case_when(
           year < 2020 \sim 0,
          year >= 2020 ~ 1
         ))
ggplot(data = count2, aes(x = created_date, y = n, color = complaint_type)) +
  geom_line(alpha = 0.5) +
  geom_vline(xintercept = as.Date("03-22-2020", format = "%m-%d-%Y"),
             color = "red", alpha = 0.5) +
  geom_vline(xintercept = as.Date("06-22-2020", format = "%m-%d-%Y"),
             color = "blue", alpha = 0.5) +
 theme_light() +
 labs(x = "Date", y = "Count of 311 calls",
       color = "Complaint Type")
```





```
table(dat_311_pre$shed)
##
## FALSE
            TRUE
## 933929 82912
table(dat_311_pre$shed)/nrow(dat_311_pre)*100
##
##
     FALSE
                TRUE
## 91.84612 8.15388
table(dat_311_post$shed)
##
##
    FALSE
              TRUE
## 1150365
             87315
table(dat_311_post$shed)/nrow(dat_311_post)*100
##
##
       FALSE
                  TRUE
## 92.945269 7.054731
round(table(dat_311_post$complaint_type,
            dat_311_post$shed), 3)
```

TRUE

1311

FALSE

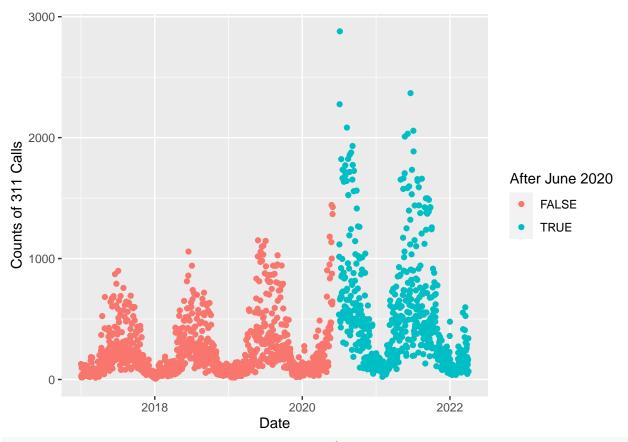
20660

##

##

Dirty Condition

```
5994
##
     Food Establishment
                            13309
##
     Illegal Parking
                            588415 16680
##
    Noise - Commercial
                             69082 41370
    Noise - Street/Sidewalk 387047 18872
##
     Rodent
                             71852
                                    3088
18872/(387047+18872)
## [1] 0.04649203
round(table(dat_311_pre$complaint_type,
            dat_311_pre$shed)/nrow(dat_311_pre)*100, 3)
##
##
                             FALSE
                                    TRUE
##
    Dirty Condition
                             0.000 0.000
    Food Establishment
                             2.310 0.810
##
                            48.499 1.458
##
    Illegal Parking
##
    Noise - Commercial
                             8.411 4.636
##
    Noise - Street/Sidewalk 23.130 0.983
##
    Rodent
                             9.495 0.266
test <- dat_311_no_shed %>%
  filter(complaint_type == "Noise - Street/Sidewalk",
         created_date < as.Date("06-01-2020", format = "m-d-Y")
           created_date > as.Date("06-30-2020", format = "%m-%d-%Y")) %>%
  count(created_date) %>%
  mutate(year = as.numeric(substr(created_date, 1, 4)),
         after_june2020 = case_when(
          created_date < as.Date("06-01-2020", format = "%m-%d-%Y") ~ FALSE,
          created_date > as.Date("06-30-2020", format = "%m-%d-%Y") ~ TRUE
        ))
ggplot(data = test,
       aes(x = created_date, y = n, color = as.factor(after_june2020))) +
  geom_point() +
  \#geom\_segment(aes(x=x1, y=y1, xend=x2, yend=y2), color="black") +
  \#geom\_segment(aes(x = x3, y = y3, xend = x4, yend = y4), color = "black") +
  labs(x = "Date", y = "Counts of 311 Calls", color = "After June 2020")#,
```

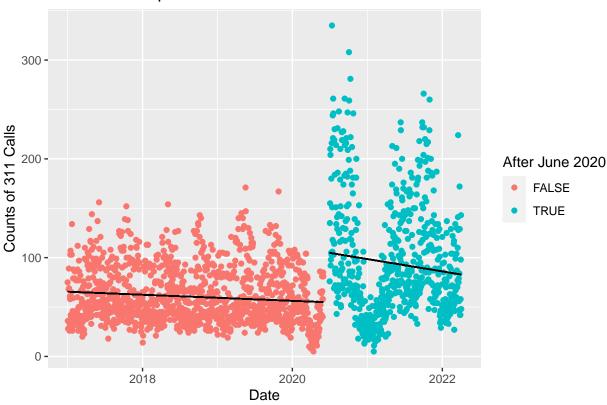


#title = "RD of Street Noise Complaints")

```
##
## Call:
## lm(formula = n ~ created_date * after_june2020, data = counts_shed)
##
## Residuals:
## Min    1Q Median    3Q Max
## -92.241 -25.232    -8.932    22.073    230.815
##
## Coefficients:
```

```
Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                                  210.686615 57.190997 3.684 0.000236 ***
## created date
                                  ## after_june2020TRUE
                                  521.705625 173.001136 3.016 0.002599 **
## created_date:after_june2020TRUE -0.025585
                                             0.009276 -2.758 0.005865 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 40.86 on 1885 degrees of freedom
## Multiple R-squared: 0.1392, Adjusted R-squared: 0.1379
## F-statistic: 101.6 on 3 and 1885 DF, p-value: < 2.2e-16
lm1$coefficients[1] + (as.Date("2017-01-01") - as.Date("1970-01-01"))*lm1$coefficients[2]
## Time difference of 65.54707 days
## plot lm1
hold <- as.Date("2017-01-01") - as.Date("1970-01-01")
n_prior <- length(which(counts_shed$after_june2020 == FALSE))</pre>
n_post <- length(which(counts_shed$after_june2020 == TRUE))</pre>
x1 \leftarrow as.Date("01-01-2017", format = "%m-%d-%Y")
x2 \leftarrow as.Date("05-31-2020", format = "%m-%d-%Y")
y1 <- lm1$coefficients[1] + hold*lm1$coefficients[2]
y2 <- y1 + n_prior*lm1$coefficients[2]</pre>
x3 = as.Date("07-01-2020", format = "%m-%d-%Y")
x4 = as.Date("04-03-2022", format = "%m-%d-%Y")
y3 = y2 + (hold+n_prior+30)*lm1$coefficients[4] + lm1$coefficients[3]
y4 = y3 + n_post*(lm1$coefficients[2] + lm1$coefficients[4])
ggplot(data = counts_shed, aes(x = created_date, y = n, color = as.factor(after_june2020))) +
  geom point() +
  geom_segment(aes(x = x1, y = y1, xend = x2, yend = y2), color = "black") +
 geom_segment(aes(x = x3, y = y3, xend = x4, yend = y4), color = "black") +
 labs(x = "Date", y = "Counts of 311 Calls", color = "After June 2020",
      title = "RD of All Complaints")
```

RD of All Complaints



lm(formula = n ~ created_date * after_june2020, data = counts_shed_food)

Max

3Q

1Q Median

-7.4275 -2.4408 -0.4234 1.8816 19.4959

Residuals:

Min

Coefficients:

(Intercept)

##

##

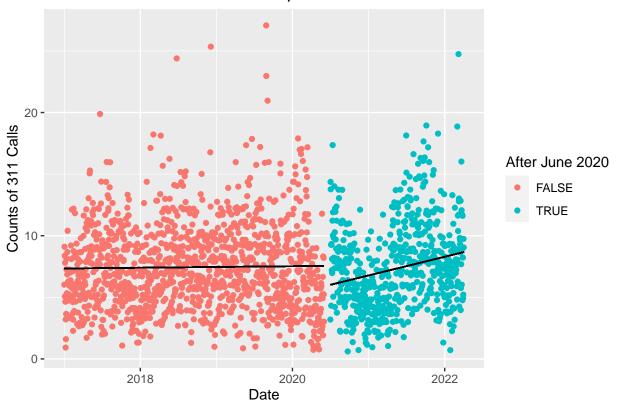
Estimate Std. Error t value Pr(>|t|)

0.357

4.445e+00 4.824e+00 0.921

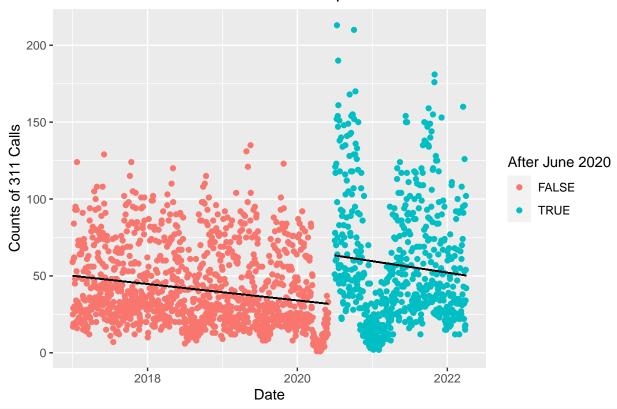
```
## created date
                                    1.687e-04 2.711e-04
                                                          0.622
## after_june2020TRUE
                                   -7.525e+01 1.463e+01 -5.145 2.95e-07 ***
## created_date:after_june2020TRUE 3.997e-03 7.842e-04 5.098 3.79e-07 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.443 on 1880 degrees of freedom
## Multiple R-squared: 0.01709,
                                  Adjusted R-squared: 0.01552
## F-statistic: 10.9 on 3 and 1880 DF, p-value: 4.28e-07
## plot lm2
n_prior <- length(which(counts_shed_food$after_june2020 == FALSE))</pre>
n_post <- length(which(counts_shed_food$after_june2020 == TRUE))</pre>
y1 <- lm2$coefficients[1] + hold*lm2$coefficients[2]</pre>
y2 <- y1 + n_prior*lm2$coefficients[2]</pre>
y3 = y2 + (hold+n_prior+30)*lm2$coefficients[4] + lm2$coefficients[3]
y4 = y3 + n_post*(lm2$coefficients[2] + lm2$coefficients[4])
ggplot(data = counts_shed_food,
       aes(x = created_date, y = n, color = as.factor(after_june2020))) +
  geom_jitter() +
  geom_segment(aes(x = x1, y = y1, xend = x2, yend = y2), color = "black") +
  geom_segment(aes(x = x3, y = y3, xend = x4, yend = y4), color = "black") +
  labs(x = "Date", y = "Counts of 311 Calls", color = "After June 2020",
       title = "RD of Food Establishment Complaints")
```

RD of Food Establishment Complaints



```
## RD 3: Noise - Commercial
counts shed comm <- dat 311 shed %>%
  filter(complaint_type == "Noise - Commercial",
         created date < as.Date("06-01-2020", format = "\%m-\%d-\%Y") |
           created_date > as.Date("06-30-2020", format = "%m-%d-%Y")) %>%
  count(created_date) %>%
  mutate(year = as.numeric(substr(created_date, 1, 4)),
         after_june2020 = case_when(
           created_date < as.Date("06-01-2020", format = "%m-%d-%Y") ~ FALSE,</pre>
           created_date > as.Date("06-30-2020", format = "%m-%d-%Y") ~ TRUE
         ))
lm3 <- lm(n ~ created_date * after_june2020, data = counts_shed_comm)</pre>
summary(lm3)
##
## Call:
## lm(formula = n ~ created_date * after_june2020, data = counts_shed_comm)
## Residuals:
##
       Min
                1Q Median
                                30
## -56.975 -21.891 -9.346 17.224 150.408
## Coefficients:
##
                                     Estimate Std. Error t value Pr(>|t|)
                                   301.318166 43.660846 6.901 7.01e-12 ***
## (Intercept)
## created date
                                    -0.014636
                                               0.002454 -5.964 2.93e-09 ***
## after_june2020TRUE
                                                          1.035
                                                                     0.301
                                   136.346187 131.733523
## created_date:after_june2020TRUE -0.005688
                                               0.007063 -0.805
                                                                     0.421
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 31.1 on 1882 degrees of freedom
## Multiple R-squared: 0.0729, Adjusted R-squared: 0.07143
## F-statistic: 49.33 on 3 and 1882 DF, p-value: < 2.2e-16
## plot lm3
n_prior <- length(which(counts_shed_comm$after_june2020 == FALSE))</pre>
n_post <- length(which(counts_shed_comm$after_june2020 == TRUE))</pre>
y1 <- lm3$coefficients[1] + hold*lm3$coefficients[2]
y2 <- y1 + n_prior*lm3$coefficients[2]
y3 = y2 + (hold+n_prior+30)*lm3$coefficients[4] + lm3$coefficients[3]
y4 = y3 + n_post*(lm3$coefficients[2] + lm3$coefficients[4])
ggplot(data = counts_shed_comm,
       aes(x = created_date, y = n, color = as.factor(after_june2020))) +
  geom_point() +
  geom_segment(aes(x = x1, y = y1, xend = x2, yend = y2), color = "black") +
  geom_segment(aes(x = x3, y = y3, xend = x4, yend = y4), color = "black") +
  labs(x = "Date", y = "Counts of 311 Calls", color = "After June 2020",
```

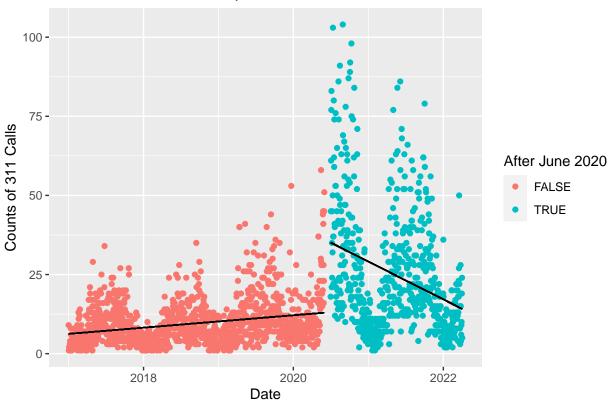
RD of Commercial Street Noise Complaints



```
##
## Call:
## lm(formula = n ~ created_date * after_june2020, data = counts_shed_street)
##
## Residuals:
## Min    1Q Median    3Q Max
## -27.982 -5.885 -2.087    3.856    71.395
##
## Coefficients:
```

```
Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                                  -8.741e+01 1.714e+01 -5.099 3.76e-07 ***
## created date
                                   5.457e-03 9.633e-04 5.665 1.70e-08 ***
## after_june2020TRUE
                                   7.268e+02 5.166e+01 14.068 < 2e-16 ***
## created_date:after_june2020TRUE -3.825e-02 2.770e-03 -13.808 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 12.16 on 1860 degrees of freedom
## Multiple R-squared: 0.2951, Adjusted R-squared: 0.294
## F-statistic: 259.6 on 3 and 1860 DF, p-value: < 2.2e-16
## plot lm4
n_prior <- length(which(counts_shed_street$after_june2020 == FALSE))</pre>
n_post <- length(which(counts_shed_street$after_june2020 == TRUE))</pre>
y1 <- lm4$coefficients[1] + hold*lm4$coefficients[2]
y2 <- y1 + n_prior*lm4$coefficients[2]
y3 = y2 + (hold+n_prior+30)*lm4$coefficients[4] + lm4$coefficients[3]
y4 = y3 + n_post*(lm4$coefficients[2] + lm4$coefficients[4])
ggplot(data = counts_shed_street,
       aes(x = created_date, y = n, color = as.factor(after_june2020))) +
  geom_point() +
  geom_segment(aes(x = x1, y = y1, xend = x2, yend = y2), color = "black") +
  geom_segment(aes(x = x3, y = y3, xend = x4, yend = y4), color = "black") +
  labs(x = "Date", y = "Counts of 311 Calls", color = "After June 2020",
       title = "RD of Street Noise Complaints")
```

RD of Street Noise Complaints



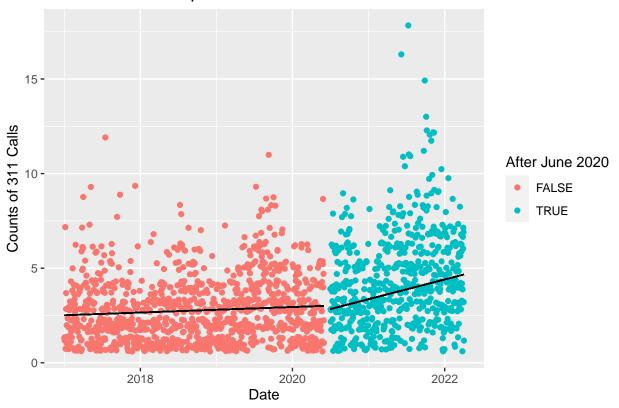
```
## RD 5: Rodent
counts_shed_rodent <- dat_311_shed %>%
  filter(complaint_type == "Rodent",
         created_date < as.Date("06-01-2020", format = "%m-%d-%Y") |</pre>
           created_date > as.Date("06-30-2020", format = "%m-%d-%Y")) %>%
  count(created_date) %>%
  mutate(year = as.numeric(substr(created_date, 1, 4)),
         after_june2020 = case_when(
           created_date < as.Date("06-01-2020", format = "%m-%d-%Y") ~ FALSE,</pre>
           created_date > as.Date("06-30-2020", format = "%m-%d-%Y") ~ TRUE
         ))
lm5 <- lm(n ~ created_date * after_june2020, data = counts_shed_rodent)</pre>
summary(lm5)
##
## Call:
## lm(formula = n ~ created_date * after_june2020, data = counts_shed_rodent)
## Residuals:
                1Q Median
                                 ЗQ
##
       Min
                                        Max
## -4.2002 -1.5862 -0.4863 1.1191 13.5991
##
## Coefficients:
                                      Estimate Std. Error t value Pr(>|t|)
```

(Intercept)

-5.196e+00 2.937e+00 -1.769 0.07705.

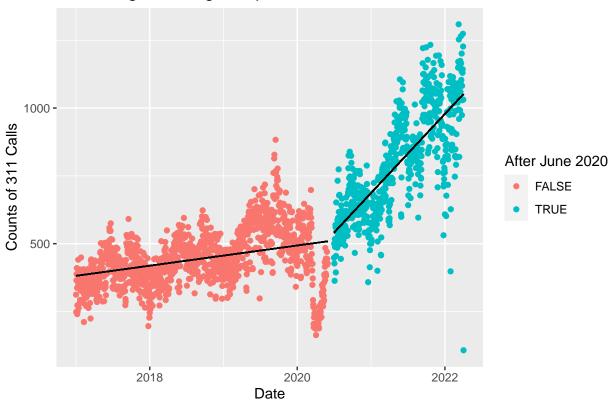
```
## created date
                                  4.490e-04 1.649e-04
                                                       2.723 0.00654 **
## after_june2020TRUE
                                 -4.674e+01 8.603e+00 -5.433 6.35e-08 ***
                                                       5.516 4.00e-08 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.981 on 1710 degrees of freedom
## Multiple R-squared: 0.135, Adjusted R-squared: 0.1334
## F-statistic: 88.93 on 3 and 1710 DF, p-value: < 2.2e-16
## plot lm5
n_prior <- length(which(counts_shed_rodent$after_june2020 == FALSE))</pre>
n_post <- length(which(counts_shed_rodent$after_june2020 == TRUE))</pre>
y1 <- lm5$coefficients[1] + hold*lm5$coefficients[2]
y2 <- y1 + n_prior*lm5$coefficients[2]</pre>
y3 = y2 + (hold+n_prior+30)*lm5$coefficients[4] + lm5$coefficients[3]
y4 = y3 + n_post*(lm5$coefficients[2] + lm5$coefficients[4])
ggplot(data = counts_shed_rodent,
      aes(x = created_date, y = n, color = as.factor(after_june2020))) +
  geom_jitter() +
  geom_segment(aes(x = x1, y = y1, xend = x2, yend = y2), color = "black") +
  geom_segment(aes(x = x3, y = y3, xend = x4, yend = y4), color = "black") +
  labs(x = "Date", y = "Counts of 311 Calls", color = "After June 2020",
      title = "RD of Rodent Complaints")
```

RD of Rodent Complaints



```
## RD 6: Only Parking, shed = FALSE
counts shed parking <- dat 311 parking %>%
  filter(shed == FALSE,
         created date < as.Date("06-01-2020", format = "\%m-\%d-\%Y") |
           created_date > as.Date("06-30-2020", format = "%m-%d-%Y")) %>%
  count(created_date) %>%
  mutate(year = as.numeric(substr(created_date, 1, 4)),
         after_june2020 = case_when(
           created_date < as.Date("06-01-2020", format = "%m-%d-%Y") ~ FALSE,</pre>
           created_date > as.Date("06-30-2020", format = "%m-%d-%Y") ~ TRUE
         ))
lm6 <- lm(n ~ created_date * after_june2020, data = counts_shed_parking)</pre>
summary(lm6)
##
## Call:
## lm(formula = n ~ created_date * after_june2020, data = counts_shed_parking)
## Residuals:
##
       Min
                1Q Median
                                30
                                       Max
## -947.11 -60.36 1.02 68.73 400.71
## Coefficients:
##
                                     Estimate Std. Error t value Pr(>|t|)
                                   -1.371e+03 1.533e+02 -8.944 <2e-16 ***
## (Intercept)
## created date
                                   1.021e-01 8.615e-03 11.849 <2e-16 ***
                                   -1.277e+04 4.637e+02 -27.541 <2e-16 ***
## after_june2020TRUE
## created_date:after_june2020TRUE 6.941e-01 2.486e-02 27.921 <2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 109.5 on 1885 degrees of freedom
## Multiple R-squared: 0.7525, Adjusted R-squared: 0.7521
## F-statistic: 1911 on 3 and 1885 DF, p-value: < 2.2e-16
## plot lm6
n_prior <- length(which(counts_shed_parking$after_june2020 == FALSE))</pre>
n_post <- length(which(counts_shed_parking$after_june2020 == TRUE))</pre>
y1 <- lm6$coefficients[1] + hold*lm6$coefficients[2]
y2 <- y1 + n_prior*lm6$coefficients[2]
y3 = y2 + (hold+n_prior+30)*lm6$coefficients[4] + lm6$coefficients[3]
y4 = y3 + n_post*(lm6$coefficients[2] + lm6$coefficients[4])
ggplot(data = counts_shed_parking,
       aes(x = created_date, y = n, color = as.factor(after_june2020))) +
  geom_point() +
  geom_segment(aes(x = x1, y = y1, xend = x2, yend = y2), color = "black") +
  geom_segment(aes(x = x3, y = y3, xend = x4, yend = y4), color = "black") +
  labs(x = "Date", y = "Counts of 311 Calls", color = "After June 2020",
```

RD of Illegal Parking Complaints



```
## Make map of NYC using lat-long: not great
\# x = rows = latitude, from = 40.49912, to = 40.91346
\# y = columns = longitude, from = -74.25453, to = -73.7006
states <- map_data("state")</pre>
NY <- subset(states, region %in% c("new york"))</pre>
NYC <- filter(NY, long <= -73.7006 & long >= -74.25453 &
                lat <= 40.91346 & lat >= 40.49912)
counties <- map_data("county")</pre>
NY_county <- subset(counties, region == "new york")</pre>
remove(states, counties)
## Map plot, not looking the best if I'm honest
ggplot(data = NYC, mapping = aes(x = long, y = lat, group = group)) +
  coord fixed(1.3) +
  geom_polygon(color = "black", fill = NA) +
  theme_void() +
  geom_polygon(data = NY_county, #aes(fill = sqrt(residence_count)),
               color = "black")
```

