How did COVID-19 affect the crime rates in Chicago in 2020 compared to 2019

HaEun Choi 16/12/2020

Abstract

The purpose of this paper is to identify the differences in crime rates in Chicago between March 2019 and March 2020 using the dataset in Chicago Data Portal. It was found that the crime rates have significantly decreased after the COVID pandemic hit North America, compared to the previous year.

Introduction

Crimes-2019 dataset includes all the crime occurred in City of Chicago from 2001 to current year. This data is collected by the Chicago Police Department's CLEAR (Citizen Law Enforcement Analysis and Reporting) System. The main findings from this study is that some types of crime rate in 2020 has significantly decreased compared to the crime rate in 2019. In both years, the two most frequent crime types in 2019 are theft and battery. Another finding that was discovered was that there were high rates of crime committed in certain days of a week or month. These observations are interesting because by different types of crimes, the rates of that crime committed was different by the day.

Data

I examined the 2019 and 2020 crimes datasets provided by Chicago Police Department which includes the reported crime in Chicago. The data is available since 2001 and is constantly being updated. The crime data for 2019 and 2020 was downloaded as CSV files from the following locations: https://data.cityofchicago.org/Public-Safety/Crimes-2019/w98m-zvie https://data.cityofchicago.org/Public-Safety/Crimes-2020/qzdf-xmn8

I primarily focused on the crime type and the number of reported crimes in order to investigate the difference in numbers and categories of crimes. In order to properly categorize the types of crimes, I had to clean some types of crimes from the dataset. I also cleaned the categories that has low frequency and grouped it into "other offense". Additional variables were created to reflect the month, day of the week, and first of month indicator. I expect that seasonality exists in some types of crime and crime rates vary by day of the week. I removed months of January and February as there was no COVID in 2020 until 1-Mar-2020.

The combined dataset contains 376844 crime events in both years, 222433 in 2019 and 154411 in 2020. The following types of crime are most prevalent in Chicago: Theft (82603), battery (74322), criminal damage (42747), assault (31764).

```
## [1] 376844

##

## 2019 2020

## 222433 154411
```

Table 1. Total frequency of crime in Chicago in 2019-2020

d1[order(-d1\$Frequency),]

##		Crime Type	
##	28	THEFT	82603
##	3	BATTERY	74322
##	6	CRIMINAL DAMAGE	42747
##	2	ASSAULT	31764
##	9	DECEPTIVE PRACTICE	26666
##	21	OTHER OFFENSE	22683
##	18	NARCOTICS	16631
##	17	MOTOR VEHICLE THEFT	15271
##	4	BURGLARY	14963
##	25	ROBBERY	12763
##	29	WEAPONS VIOLATION	12219
##	8	CRIMINAL TRESPASS	8544
##	20	OFFENSE INVOLVING CHILDREN	3221
##	24	PUBLIC PEACE VIOLATION	2350
##	7	CRIMINAL SEXUAL ASSAULT	2173
##	26	SEX OFFENSE	1769
##	13	INTERFERENCE WITH PUBLIC OFFICER	1718
##	11	HOMICIDE	1113
##	1	ARSON	813
##	22	PROSTITUTION	786
##	27	STALKING	332
##	5	CONCEALED CARRY LICENSE VIOLATION	304
##	16	LIQUOR LAW VIOLATION	302
##	14	INTIMIDATION	266
##	15	KIDNAPPING	241
##	10	GAMBLING	159
##	19	OBSCENITY	90
##	23	PUBLIC INDECENCY	18
##	12	HUMAN TRAFFICKING	13

Table 2. Daily crime rates for year 2019 and 2020 by crime type

table1[,3:4]

##		Daily rate 2019 Da	aily rate 2020
##	ARSON	1.06	1.78
##	ASSAULT	58.15	51.19
##	BATTERY	139.77	115.66
##	BURGLARY	26.78	24.80
##	CONCEALED CARRY LICENSE VIOLATION	0.63	0.41
##	CRIMINAL DAMAGE	75.96	71.46
##	CRIMINAL SEXUAL ASSAULT	4.42	3.01
##	CRIMINAL TRESPASS	18.88	10.17
##	DECEPTIVE PRACTICE	51.30	40.21
##	GAMBLING	0.45	0.08

##	HOMICIDE	1.50	2.40
##	HUMAN TRAFFICKING	0.04	0.01
##	INTERFERENCE WITH PUBLIC OFFICER	4.40	1.37
##	INTIMIDATION	0.44	0.49
##	KIDNAPPING	0.49	0.33
##	LIQUOR LAW VIOLATION	0.66	0.36
##	MOTOR VEHICLE THEFT	24.98	27.93
##	NARCOTICS	40.82	15.26
##	OBSCENITY	0.17	0.14
##	OFFENSE INVOLVING CHILDREN	6.37	4.66
##	OTHER OFFENSE	45.61	32.01
##	PROSTITUTION	1.90	0.76
##	PUBLIC INDECENCY	0.04	0.03
##	PUBLIC PEACE VIOLATION	4.34	3.75
##	ROBBERY	22.41	21.64
##	SEX OFFENSE	3.65	2.40
##	STALKING	0.60	0.54
##	THEFT	175.39	106.24
##	WEAPONS VIOLATION	18.08	24.47

In the above table, I observed a decrease in the following four crime types: battery, theft, deceptive practice and narcotics. For example, narcotics daily rates decreased from 40.82 in 2019 to 15.26 in 2020, a decline of 63%.

Model

The primary analysis is performed to determine if daily crime rates have decreased significantly during the pandemic. Linear regression model was built for each type of crime with dependent variable being daily frequency of crime. Models include the following predictors: - Pandemic = binary indicator with 0 = year 2019 (pre-pandemic) and 1 = year 2020 (during pandemic) - Month = categorical variable with March being chosen as reference category - Day of the week = categorical variable with SUnday being selected as reference category - First day of the money = binary indicator with 0 = not first day of the month and 1 = first day of the month

Linear regression model equation can be written as following:

```
[DailyCrimeRate] = \beta_0 + \beta_1 [Pandemic] + \beta_2 [Apr] + \ldots + \beta_{10} [Dec] + \beta_{11} [Mon] + \ldots + \beta_{16} [Sat] + \beta_{17} [FirstDayOfMonth]
```

Data was reorganized so each row represents a particular day and crime type. Each row has a count of how many crimes of this type were reported to police, with zero indicating no crime being reported that day. The sample below shows first 10 records in this re-organized file.

data1[1:10,]

##		Date			Pa	rimaryType	${\tt Pandemic}$	${\tt Month}$	DayOfWeek
##	1	2019-03-01				ARSON	0	${\tt March}$	Friday
##	2	2019-03-01				ASSAULT	0	March	Friday
##	3	2019-03-01				BATTERY	0	March	Friday
##	4	2019-03-01				BURGLARY	0	March	Friday
##	5	2019-03-01	CONCEALED	CARRY	LICENSE	VIOLATION	0	March	Friday
##	6	2019-03-01			CRIMII	NAL DAMAGE	0	March	Friday
##	7	2019-03-01		CRIMII	NAL SEXU	AL ASSAULT	0	March	Friday

```
## 8
      2019-03-01
                                   CRIMINAL TRESPASS
                                                               0 March
                                                                           Friday
## 9
      2019-03-01
                                  DECEPTIVE PRACTICE
                                                               0 March
                                                                          Friday
## 10 2019-03-01
                                             GAMBLING
                                                               0 March
                                                                           Friday
##
      FirstDayOfMonth NumOfEvents
## 1
                     1
## 2
                     1
                                 47
## 3
                     1
                                 97
## 4
                     1
                                 23
## 5
                     1
                                  1
## 6
                     1
                                 63
## 7
                     1
                                  5
## 8
                                 12
                     1
## 9
                     1
                                105
## 10
                     1
                                  0
```

Results

Four regression models were constructed for the following crime types: narcotics, theft, battery and deceptive practice.

NARCOTICS crime

summary(model1)

```
##
## Call:
## lm(formula = NumOfEvents ~ Pandemic + Month + DayOfWeek + FirstDayOfMonth,
##
       data = data1[which(data1$PrimaryType == "NARCOTICS"), ])
##
## Residuals:
##
        Min
                  1Q
                       Median
                                     3Q
                                             Max
                                 4.5005
## -27.2647 -4.7158 -0.4507
                                         28.9227
##
## Coefficients:
##
                      Estimate Std. Error t value
                                                                Pr(>|t|)
## (Intercept)
                                    1.3097
                                            33.107 < 0.000000000000000 ***
                       43.3614
## Pandemic
                      -26.1058
                                    0.6686 -39.047 < 0.0000000000000000 ***
                                           -7.041
## MonthApril
                       -9.9996
                                    1.4202
                                                     0.000000000055841 ***
## MonthMay
                       -7.7569
                                    1.4084
                                            -5.508
                                                     0.0000000554054719 ***
## MonthJune
                       -8.2648
                                    1.4198
                                            -5.821
                                                     0.0000000098230831 ***
## MonthJuly
                                            -4.615
                                                     0.0000048722449878 ***
                       -6.5011
                                    1.4087
## MonthAugust
                       -2.8425
                                    1.4083 -2.018
                                                                0.044018 *
## MonthSeptember
                       -5.7462
                                    1.4199
                                           -4.047
                                                     0.0000591822928668 ***
                                                     0.0000460217277144 ***
## MonthOctober
                       -5.7856
                                    1.4087
                                            -4.107
## MonthNovember
                       -7.7053
                                    1.4198
                                            -5.427
                                                     0.0000000852479574 ***
## MonthDecember
                                    1.7568 -7.000
                                                     0.000000000073157 ***
                      -12.2975
## DayOfWeekMonday
                        2.6889
                                    1.2101
                                             2.222
                                                                0.026675 *
## DayOfWeekTuesday
                        4.0661
                                    1.2145
                                             3.348
                                                                0.000868 ***
## DayOfWeekWednesday
                                             4.089
                                                     0.0000496211037259 ***
                        4.9807
                                    1.2181
## DayOfWeekThursday
                        3.2064
                                    1.2186
                                             2.631
                                                                0.008743 **
```

```
## DayOfWeekFriday
                        9.4954
                                             7.822
                                                     0.000000000000258 ***
                                   1.2140
## DayOfWeekSaturday
                                             2.551
                        3.0974
                                    1.2144
                                                               0.011019 *
## FirstDayOfMonth
                        2.1238
                                    1.8306
                                             1.160
                                                               0.246472
## ---
## Signif. codes:
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 7.839 on 563 degrees of freedom
## Multiple R-squared: 0.7503, Adjusted R-squared: 0.7428
## F-statistic: 99.51 on 17 and 563 DF, p-value: < 0.000000000000000022
```

Model overall is statistically significant (p < .001) with R-square being 0.7503. The model explains 75.03% of variability in daily narcotics crime rates. During the COVID pandemic, daily narcotics crime has decreased significantly by 26.1058 events (p < .001), controlling for other factors. The lowest daily rates are reported in December (12.2975 lower than March). Friday appears to have significantly higher daily rates compared to Sunday, 9.4954 higher.

THEFT crime

summary(model2)

```
##
## Call:
  lm(formula = NumOfEvents ~ Pandemic + Month + DayOfWeek + FirstDayOfMonth,
##
       data = data1[which(data1$PrimaryType == "THEFT"), ])
##
##
  Residuals:
##
      Min
              1Q Median
                             3Q
                                   Max
##
  -86.64 -12.57 -0.66 10.84
                                 73.48
##
##
  Coefficients:
                      Estimate Std. Error t value
                                                                Pr(>|t|)
## (Intercept)
                        147.231
                                     3.229
                                            45.601 < 0.0000000000000000 ***
## Pandemic
                        -68.739
                                     1.648 -41.707 < 0.0000000000000000 ***
## MonthApril
                       -10.230
                                     3.501
                                            -2.922
                                                                 0.00362 **
## MonthMay
                         4.426
                                     3.472
                                             1.275
                                                                 0.20292
## MonthJune
                         16.108
                                     3.500
                                             4.602
                                                       0.000005169657036 ***
                                             7.437
                                                       0.00000000000387 ***
## MonthJuly
                         25.825
                                     3.473
## MonthAugust
                         32.555
                                     3.472
                                             9.378 < 0.0000000000000000 ***
                         21.219
                                             6.062
                                                       0.00000002465564 ***
## MonthSeptember
                                     3.500
## MonthOctober
                         11.430
                                     3.473
                                             3.291
                                                                 0.00106 **
## MonthNovember
                         -2.395
                                     3.500
                                            -0.684
                                                                 0.49405
## MonthDecember
                                             2.966
                         12.846
                                     4.331
                                                                 0.00314 **
## DayOfWeekMonday
                                             6.056
                                                       0.000000002552292 ***
                         18.065
                                     2.983
## DayOfWeekTuesday
                                             5.201
                         15.570
                                     2.994
                                                       0.000000278278099 ***
## DayOfWeekWednesday
                                             6.184
                                                       0.00000001201331 ***
                         18.569
                                     3.003
## DayOfWeekThursday
                         15.931
                                     3.004
                                             5.303
                                                       0.00000163895343 ***
## DayOfWeekFriday
                                             8.932 < 0.000000000000000 ***
                         26.730
                                     2.993
## DayOfWeekSaturday
                         16.227
                                     2.994
                                             5.420
                                                       0.000000088347917 ***
## FirstDayOfMonth
                                                                 0.00126 **
                         14.631
                                     4.513
                                             3.242
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

```
##
## Residual standard error: 19.33 on 563 degrees of freedom
## Multiple R-squared: 0.7965, Adjusted R-squared: 0.7903
## F-statistic: 129.6 on 17 and 563 DF, p-value: < 0.000000000000000022</pre>
```

Model overall is statistically significant (p < .001) with R-square being 0.7965. The model explains 79.65% of variability in daily theft crime rates. During the COVID pandemic, daily theft crime has decreased significantly by 68.739 events (p < .001), controlling for other factors. The lowest daily rates are reported in April (10.230 lower than March), while the highest are in August (32.555 higher than March). Friday appears to have significantly higher daily rates compared to Sunday, 26.730 higher. First day of the month is associated with 14.631 more thefts compared to other days of the month.

BATTERY crime

summary(model3)

```
##
##
  Call:
  lm(formula = NumOfEvents ~ Pandemic + Month + DayOfWeek + FirstDayOfMonth,
       data = data1[which(data1$PrimaryType == "BATTERY"), ])
##
##
##
  Residuals:
##
       Min
                1Q
                    Median
                                 30
                                        Max
##
  -47.568 -12.455
                     0.297
                            11.119
                                     63.188
##
## Coefficients:
                      Estimate Std. Error t value
##
                                                                Pr(>|t|)
## (Intercept)
                       160.322
                                     2.947 54.400 < 0.0000000000000000 ***
## Pandemic
                       -25.919
                                     1.504 -17.229 < 0.0000000000000000 ***
                                           -3.231
## MonthApril
                       -10.324
                                     3.196
                                                                0.001307 **
## MonthMay
                        10.911
                                     3.169
                                             3.443
                                                                0.000618 ***
## MonthJune
                                             6.880
                                                     0.000000000159579 ***
                        21.980
                                     3.195
## MonthJuly
                                     3.170
                                             7.632
                                                     0.000000000000996 ***
                        24.191
## MonthAugust
                        16.165
                                     3.169
                                             5.101
                                                     0.0000004621431728 ***
## MonthSeptember
                         7.279
                                     3.195
                                             2.278
                                                                0.023095 *
## MonthOctober
                        -4.383
                                     3.170
                                            -1.383
                                                                0.167305
## MonthNovember
                       -11.852
                                     3.195
                                            -3.710
                                                                0.000228 ***
## MonthDecember
                       -12.117
                                     3.953
                                            -3.065
                                                                0.002279 **
                                     2.723 -11.570 < 0.0000000000000000 ***
## DayOfWeekMonday
                       -31.502
## DayOfWeekTuesday
                       -37.859
                                     2.733 -13.854 < 0.0000000000000000 ***
## DayOfWeekWednesday
                                     2.741 -13.544 < 0.0000000000000000 ***
                       -37.122
## DayOfWeekThursday
                                     2.742 -12.700 < 0.0000000000000000 ***
                       -34.824
                                     2.732 -10.213 < 0.0000000000000000 ***
## DayOfWeekFriday
                       -27.896
## DayOfWeekSaturday
                         -8.237
                                     2.733
                                            -3.014
                                                                0.002692 **
## FirstDayOfMonth
                                     4.119
                                             0.431
                                                               0.666533
                         1.776
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 17.64 on 563 degrees of freedom
## Multiple R-squared: 0.6271, Adjusted R-squared: 0.6159
## F-statistic: 55.7 on 17 and 563 DF, p-value: < 0.000000000000000022
```

Model overall is statistically significant (p < .001) with R-square being 0.6271. The model explains 62.71% of variability in daily battery crime rates. During the COVID pandemic, daily battery crime has decreased significantly by 25.919 events (p < .001), controlling for other factors. The lowest daily rates are reported in December (12.117 lower than March), while the highest are in July (24.191 higher than March). Sunday has the highest daily rates of battery crime compared to all other days of the week, the lost rate are in Tuesday and Wednesday.

DECEPTIVE PRACTICE

summary(model4)

```
##
##
  Call:
  lm(formula = NumOfEvents ~ Pandemic + Month + DayOfWeek + FirstDayOfMonth,
       data = data1[which(data1$PrimaryType == "DECEPTIVE PRACTICE"),
##
##
##
##
  Residuals:
##
       Min
                1Q
                   Median
                                3Q
                                       Max
##
   -34.175
           -6.555
                    -0.532
                             5.921
                                    57.881
##
##
  Coefficients:
                                                                Pr(>|t|)
##
                       Estimate Std. Error t value
## (Intercept)
                       34.74605
                                   1.87838
                                            18.498 < 0.0000000000000000 ***
## Pandemic
                                   0.95885 -11.785 < 0.000000000000000 ***
                      -11.29961
## MonthApril
                       -0.78095
                                   2.03682
                                            -0.383
                                                                  0.7016
                                            -0.784
## MonthMay
                       -1.58267
                                   2.01990
                                                                  0.4336
## MonthJune
                       -0.21346
                                   2.03621
                                            -0.105
                                                                  0.9165
## MonthJuly
                        3.92034
                                   2.02029
                                             1.940
                                                                  0.0528
## MonthAugust
                        0.84557
                                   2.01970
                                             0.419
                                                                  0.6756
## MonthSeptember
                        0.02959
                                   2.03641
                                             0.015
                                                                  0.9884
## MonthOctober
                       11.67277
                                   2.02029
                                             5.778
                                                            0.000000125 ***
## MonthNovember
                        9.09538
                                   2.03621
                                             4.467
                                                            0.0000095985 ***
## MonthDecember
                        0.23851
                                   2.51955
                                             0.095
                                                                  0.9246
## DayOfWeekMonday
                       17.86657
                                   1.73546
                                            10.295 < 0.000000000000000 ***
## DayOfWeekTuesday
                       17.53037
                                   1.74175
                                            10.065 < 0.0000000000000000 ***
## DayOfWeekWednesday
                       15.88951
                                   1.74688
                                             ## DayOfWeekThursday
                                             9.517 < 0.000000000000000 ***
                       16.63276
                                   1.74771
## DayOfWeekFriday
                       19.00006
                                   1.74102
                                            10.913 < 0.000000000000000 ***
## DayOfWeekSaturday
                        4.47259
                                   1.74169
                                             2.568
                                                                  0.0105 *
## FirstDayOfMonth
                                   2.62541
                                            12.004 < 0.0000000000000000 ***
                       31.51421
##
                     '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 11.24 on 563 degrees of freedom
## Multiple R-squared: 0.5143, Adjusted R-squared: 0.4997
## F-statistic: 35.07 on 17 and 563 DF, p-value: < 0.000000000000000022
```

Model overall is statistically significant (p < .001) with R-square being 0.5143. The model explains 51.43% of variability in daily deceptive practice crime rates. During the COVID pandemic, daily deceptive practice crime has decreased significantly by 11.29961 events (p < .001), controlling for other factors. The highest

daily rates are reported in October (11.67277 higher than March). Friday has the highest daily rates of deceptive practice compared to Sunday (19.00006 higher). First day of the month is associated with 31.51421 higher number of deceptive practice crimes.