# Lab 3: Reducing Crime

w203 Summer 2018

Madeleine Bulkow, Kim Darnell, Alla Hale, Emily Rapport
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#### 1. Introduction

Crime presents a problem in our society, and it is up to local government to implement policies to reduce it. This report examines the available crime data to pick out the determiniants of crime. Based on this analysis, we generate several policy suggestions applicable to local government in North Carolina for the late 1980s.

#### 2. The Data

The data from 1987 were collected and combined by Cornwell and Trumball. HERE IS WHERE WE DESCRIBE OUR DATA.

## 3. Exploratory Data Analysis

First, we must evaluate the available data, clean it by removing anomolous values, and perhaps transform the data.

```
# Import the data
df = read.csv("crime_v2.csv")
#summary(df)
```

Clean up the apostrophe.

It appears that probon is in percent, while the other two probability estimates (prbarr and prbpris) are fractions. To be able to compare coefficients more easily, let's get all percentage values in percent (0-100).

Remove the points where probabilities exceed 100 %.

```
# Clean the data

## NOTE FROM ALLA: This is just what I did to clean the data. I am sure this can be done in a more eff

df_calc <- df

df_calc$prbconv <- as.numeric(as.numeric(df$prbconv))

df_calc$prbarr <- df$prbarr * 100

df_calc$prbpris <- df$prbpris * 100

df_calc$pctymle <- df$pctymle * 100

#summary(df_calc)

df_clean <-df_calc[with(df_calc, prbarr <= 100 & wser <= 2000),]

summary(df_clean)</pre>
```

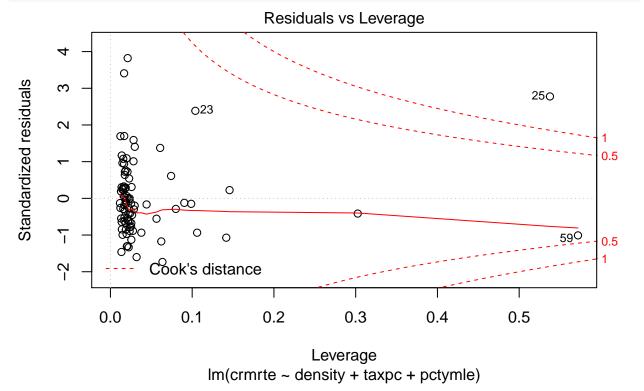
```
year
                                                        prbarr
##
        county
                                      crmrte
   Min.
          : 1.0
                    Min.
                           :87
                                 Min.
                                         :0.01062
                                                    Min.
                                                           : 9.277
   1st Qu.: 51.0
                                                    1st Qu.:20.714
                    1st Qu.:87
                                 1st Qu.:0.02216
## Median :101.0
                    Median:87
                                 Median :0.03002
                                                    Median :27.095
## Mean
          :100.5
                    Mean
                            :87
                                 Mean
                                         :0.03397
                                                    Mean
                                                           :28.709
## 3rd Qu.:151.0
                    3rd Qu.:87
                                 3rd Qu.:0.04086
                                                    3rd Qu.:34.339
## Max.
           :197.0
                    Max.
                            :87
                                 Max.
                                         :0.09897
                                                    Max.
                                                           :68.902
```

```
NA's :6
                              NA's :6
   NA's :6
                                              NA's :6
                                                polpc
##
      prbconv
                    prbpris
                                avgsen
   Min. : 3.00
                                                Min. :0.000746
                  Min. :15.00
                                Min. : 5.450
   1st Qu.:25.00
                  1st Qu.:36.36
                                1st Qu.: 7.360
                                                1st Qu.:0.001234
   Median :47.00
                  Median :42.11
                                Median : 9.100
                                                Median: 0.001485
##
   Mean :46.78
                 Mean :40.94
                                Mean : 9.571
                                                Mean :0.001625
   3rd Qu.:69.00
                  3rd Qu.:45.52
                                3rd Qu.:11.330
                                                3rd Qu.:0.001859
##
   Max. :91.00
                  Max. :60.00
                                Max. :17.410
                                                Max. :0.004459
##
   NA's :6
                  NA's :6
                                NA's :6
                                                NA's :6
##
      density
                      taxpc
                                       west
                                                    central
   Min. :0.00002
                    Min. : 25.69
                                   Min. :0.0000
                                                   Min. :0.0000
   1st Qu.:0.56397
                    1st Qu.: 30.70
                                   1st Qu.:0.0000
##
                                                  1st Qu.:0.0000
   Median :0.99623
                    Median : 34.87
                                   Median :0.0000
                                                   Median :0.0000
##
   Mean :1.45224
                    Mean : 38.13
                                   Mean :0.2472
                                                   Mean :0.3708
   3rd Qu.:1.57028
                    3rd Qu.: 41.07
                                   3rd Qu.:0.0000
                                                   3rd Qu.:1.0000
##
   Max. :8.82765
                    Max. :119.76
                                   Max. :1.0000
                                                   Max. :1.0000
##
   NA's
         :6
                    NA's :6
                                   NA's :6
                                                   NA's :6
##
       urban
                    pctmin80
                                   wcon
                                                   wtuc
##
   Min. :0.00000
                    Min. : 1.541
                                   Min. :193.6
                                                  Min. :187.6
##
   1st Qu.:0.00000
                    1st Qu.:10.005
                                   1st Qu.:253.2
                                                  1st Qu.:375.2
##
   Median :0.00000
                    Median :24.312
                                   Median :283.7
                                                  Median :406.5
   Mean :0.08989
                    Mean :25.331
                                   Mean :286.9
                                                  Mean :411.5
   3rd Qu.:0.00000
                    3rd Qu.:38.061
                                   3rd Qu.:315.2
##
                                                  3rd Qu.:441.6
##
   Max. :1.00000
                    Max. :61.942
                                   Max. :436.8
                                                  Max. :613.2
                                   NA's :6
                                                        :6
##
   NA's :6
                    NA's :6
                                                  NA's
      wtrd
                      wfir
                                    wser
                                                   wmfg
##
   Min. :154.2
                  Min. :170.9
                                Min. :133.0
                                               Min. :157.4
   1st Qu.:191.2
                  1st Qu.:288.5
                                1st Qu.:229.0
                                               1st Qu.:289.4
   Median :203.0
                  Median :317.3
                                Median :253.2
                                               Median :320.2
   Mean :212.0
                  Mean :322.5
                                Mean :254.5
                                               Mean :335.3
                                 3rd Qu.:278.1
   3rd Qu.:225.5
                  3rd Qu.:348.0
##
                                               3rd Qu.:358.9
                  Max. :509.5
##
   Max. :354.7
                                Max. :391.3
                                               Max. :646.9
##
   NA's :6
                  NA's :6
                                 NA's :6
                                               NA's :6
##
      wfed
                      wsta
                                 wloc
                                                   mix
                                Min. :239.2
   Min. :326.1
                  Min. :258.3
                                               Min. :0.01961
##
##
   1st Qu.:403.1
                  1st Qu.:329.2
                                1st Qu.:297.2
                                               1st Qu.:0.08101
   Median :450.3
                  Median :357.7
                                Median :308.1
                                               Median: 0.10230
##
   Mean :443.6
                  Mean :357.6
                                Mean :312.0
                                               Mean :0.13006
##
   3rd Qu.:478.5
                  3rd Qu.:383.7
                                3rd Qu.:329.2
                                               3rd Qu.:0.15237
   Max. :598.0
                        :499.6
                                Max. :388.1
##
                  Max.
                                               Max. :0.46512
##
   NA's :6
                  NA's
                        :6
                                NA's :6
                                               NA's :6
##
     pctymle
##
   Min. : 6.216
##
   1st Qu.: 7.463
   Median : 7.787
   Mean : 8.425
##
   3rd Qu.: 8.354
##
## Max. :24.871
## NA's :6
```

## 4. The Models

#### 4.1 Model 1

```
# Build Model 1
# model 1: things that totally make sense and have good r2. density, taxpc, pctymle.
(model_1 = lm(crmrte ~ density + taxpc + pctymle, data = df_clean))
##
## Call:
## lm(formula = crmrte ~ density + taxpc + pctymle, data = df_clean)
## Coefficients:
## (Intercept)
                    density
                                   taxpc
                                               pctymle
  -0.0079797
                  0.0074778
                                0.0003933
                                             0.0019095
summary(model_1)$r.square
## [1] 0.638322
plot(model_1, which = 5)
```



 $\#(model_1 = lm(crmrte \sim prbarr + log(prbconv) + log(polpc) + density + taxpc + pctmin80 + pctymle$ , dat

#### 4.2 Model 2

```
# Build Model 2
# model 2: other things that are explanatory but maybe questionable: west, polpc, arrest/conviction, pp
(model_2 = lm(crmrte ~ density + taxpc + pctymle + west + log(polpc) + prbarr + prbconv, data = df_clea
```

```
##
## Call:
## lm(formula = crmrte ~ density + taxpc + pctymle + west + log(polpc) +
       prbarr + prbconv, data = df_clean)
##
##
## Coefficients:
   (Intercept)
##
                    density
                                    taxpc
                                                pctymle
                                                                west
     0.1052374
                  0.0054699
                                0.0001426
                                              0.0009244
##
                                                          -0.0105045
                                  prbconv
##
    log(polpc)
                     prbarr
     0.0113736
                 -0.0003576
                               -0.0001260
summary(model_2)$r.square
## [1] 0.7423581
plot(model_2, which = 5)
```

#### Residuals vs Leverage 082 က 0 Standardized residuals 0 $\alpha$ 0 0 0 0 0 7 O8 000 -2 090 Cook'S distance 0.0 0.1 0.2 0.3 0.4 0.5 0.6

Leverage Im(crmrte ~ density + taxpc + pctymle + west + log(polpc) + prbarr + prbcon ...

# 4.3 Model 3

## (Intercept)

density

```
# Build Model 3
#model 3: not necessarily explanatory, but not problematic: central, avgsen, prison.
(model_3 = lm(crmrte ~ density + taxpc + pctymle + west + log(polpc) + prbarr + prbconv + central + avg
##
## Call:
## lm(formula = crmrte ~ density + taxpc + pctymle + west + log(polpc) +
## prbarr + prbconv + central + avgsen + prbpris, data = df_clean)
##
## Coefficients:
```

pctymle

west

taxpc

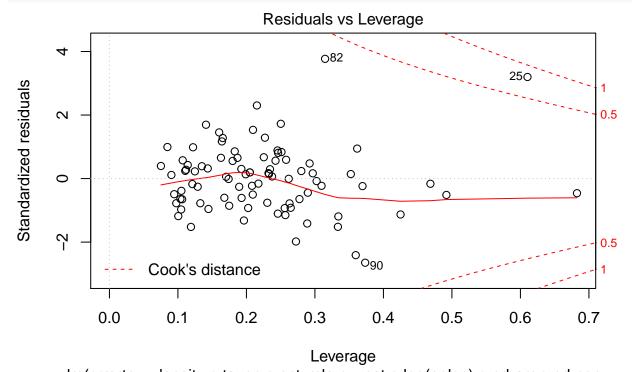
```
##
     1.336e-01
                   6.235e-03
                                8.738e-05
                                              6.509e-04
                                                           -1.378e-02
##
    log(polpc)
                      prbarr
                                  prbconv
                                                central
                                                               avgsen
     1.402e-02
                                             -7.990e-03
##
                  -3.917e-04
                               -1.307e-04
                                                           -7.654e-04
##
       prbpris
##
     1.075e-04
summary(model_3)$r.square
## [1] 0.7792778
plot(model_3, which = 5)
```

#### Residuals vs Leverage 4 082 Standardized residuals 00 $\alpha$ 0 0 0 0 0 oO 0 0 0 0 0 7 00 090 Cook's distance 0.2 0.3 0.5 0.0 0.1 0.4 0.6

Leverage Im(crmrte ~ density + taxpc + pctymle + west + log(polpc) + prbarr + prbcon ...

```
### 4.4 Model 4
# Build Model 4
# model 4: kitchen sink. urban, wage.
(model_4 = lm(crmrte ~ density + taxpc + pctymle + west + log(polpc) + prbarr + prbconv + central + avg
##
## Call:
## lm(formula = crmrte ~ density + taxpc + pctymle + west + log(polpc) +
##
       prbarr + prbconv + central + avgsen + prbpris + wcon + wtuc +
##
       wtrd + wfir + wser + wmfg + wfed + wsta + wloc, data = df_clean)
##
  Coefficients:
##
   (Intercept)
                    density
                                    taxpc
                                                pctymle
                                                                 west
##
     9.385e-02
                  5.512e-03
                                1.693e-04
                                              1.229e-03
                                                          -1.124e-02
##
    log(polpc)
                     prbarr
                                  prbconv
                                                               avgsen
                                                central
     1.275e-02
                  -3.949e-04
                                                          -1.035e-03
##
                               -1.273e-04
                                             -8.832e-03
##
       prbpris
                        wcon
                                     wtuc
                                                   wtrd
                                                                 wfir
##
     5.379e-05
                  2.458e-05
                                1.742e-05
                                              3.242e-05
                                                           -2.449e-05
##
          wser
                        wmfg
                                     wfed
                                                   wsta
                                                                 wloc
##
    -1.095e-04
                  8.497e-07
                                6.575e-05
                                             -3.460e-07
                                                           4.584e-05
```

# summary(model\_4)\$r.square ## [1] 0.8248468 plot(model\_4, which = 5)



# Im(crmrte ~ density + taxpc + pctymle + west + log(polpc) + prbarr + prbcon ...

#### 4.5 Model 5

```
# Build Model 5
# model 5: the model 1 version of a model for this dependent variable - crmrate*mix
```

## 4.2 Model Summary

This is where we put our model summary table.

% Table created by stargazer v.5.2.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu % Date and time: Sun, Jul 15, 2018 - 19:42:12

Table 1: Linear Models Predicting Crime Rate

	Dependent variable:			
	crmrte			
	(1)	(2)	(3)	(4)
density	0.007	0.005	0.006	0.006
taxpc	0.0004	0.0001	0.0001	0.0002
pctymle	0.002	0.001	0.001	0.001
west		-0.011	-0.014	-0.011
$\log(\mathrm{polpc})$		0.011	0.014	0.013
prbarr		-0.0004	-0.0004	-0.0004
prbconv		-0.0001	-0.0001	-0.0001
central			-0.008	-0.009
avgsen			-0.001	-0.001
prbpris			0.0001	0.0001
wcon				0.00002
wtuc				0.00002
wtrd				0.00003
wfir				-0.00002
wser				-0.0001
wmfg				0.00000
wfed				0.0001
wsta				-0.00000
wloc				0.00005
Constant	-0.008	0.105	0.134	0.094
Observations R <sup>2</sup>	89 0.638	89 0.742	89 0.779	89 0.825

- 5. Omitted Variables
- 6. Conclusion