A3

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2021/4/13

```
ppl_ori = read.csv('population.csv')
crm_ori = read.csv('crime_long.csv')
off_ori = read.csv('officers.csv')
summary(ppl_ori)
##
       month
                            period
                                            district
                                                            tot_pop
##
    Length: 4230
                        Min.
                               :1.000
                                         Min.
                                                : 1.0
                                                                : 37992
                                                         Min.
                        1st Qu.:1.000
    Class : character
                                         1st Qu.: 6.0
                                                         1st Qu.: 72356
    Mode :character
                        Median :1.000
                                         Median:12.0
                                                         Median :101879
##
                        Mean
                               :1.923
                                                :12.6
                                                                :113605
                                         Mean
                                                         Mean
##
                        3rd Qu.:3.000
                                         3rd Qu.:19.0
                                                         3rd Qu.:139915
##
                        Max.
                               :3.000
                                         Max.
                                                :25.0
                                                         Max.
                                                                :247373
##
                        tot_black
      tot_white
                                          tot_hisp
                                                            p50_inc
##
    Min.
           :
               265
                             : 2028
                                                  628
                                                                :23961
                      Min.
                                       Min.
                                                         Min.
    1st Qu.: 3217
                      1st Qu.:10470
##
                                       1st Qu.: 2543
                                                         1st Qu.:33147
    Median : 23750
                      Median :32850
                                       Median: 14123
                                                         Median :44900
    Mean
          : 35740
                      Mean
                             :36854
                                       Mean
                                              : 33125
                                                         Mean
                                                                :48803
    3rd Qu.: 51491
                      3rd Qu.:61918
                                       3rd Qu.: 55765
                                                         3rd Qu.:61849
   Max.
           :150564
                      Max.
                             :87288
                                       Max.
                                              :139854
                                                         Max.
                                                                :93098
head(ppl_ori)
          month period district tot_pop tot_white tot_black tot_hisp p50_inc
## 1 2005-01-01
                      1
                               1
                                    38472
                                              22608
                                                          4953
                                                                   2543 91084.91
## 2 2005-01-01
                               2
                                    37992
                                                630
                                                         35966
                                                                     628 29890.17
                      1
## 3 2005-01-01
                               3
                                   78629
                                               3217
                                                         71792
                                                                   1371 28047.56
## 4 2005-01-01
                               4
                                  124519
                                               9926
                                                         77314
                                                                  35387 39010.22
                      1
## 5 2005-01-01
                               5
                                    74384
                                                843
                                                         70053
                                                                   2524 33146.90
## 6 2005-01-01
                               6
                                                                     906 34672.25
                      1
                                    89570
                                                309
                                                         87288
summary(crm_ori)
                           district
    crime_month
##
                                          crime_type
                                                                 crimes
   Length: 36979
                               : 1.00
                                         Length: 36979
                                                             Min.
                                                                     :
                                                                         1.0
   Class : character
                        1st Qu.: 6.00
                                         Class : character
                                                             1st Qu.: 51.0
##
   Mode :character
                        Median :12.00
                                         Mode : character
                                                             Median :
                                                                       97.0
##
                        Mean
                               :12.61
                                                             Mean
                                                                     : 177.5
##
                                                             3rd Qu.: 206.0
                        3rd Qu.:19.00
##
                               :25.00
                        Max.
                                                             Max.
                                                                     :1500.0
#Ex2 data manipulate
ppl = ppl_ori
crm = crm_ori
tot_crm_mon = aggregate(crimes~crime_month,crm,sum)
```

```
head(tot_crm_mon)
##
     crime_month crimes
## 1
     2002-01-01
                  38405
     2002-02-01
                  33909
## 3
     2002-03-01
                  38583
## 4
      2002-04-01
                  40032
     2002-05-01
                  42913
## 5
## 6 2002-06-01
                  42834
tot_crm_mon$crime_month = ymd(tot_crm_mon$crime_month)
plot1 = ggplot(tot_crm_mon, aes(x = crime_month, y = crimes)) + geom_line()+ scale_x_date(date_breaks =
plot1
   40000
   30000 -
```

merge
ppl_crm = left_join(ppl, crm, by = c('district'='district', 'month'='crime_month'))
head(ppl_crm,10)

02 2003 02 2005 02 2007 02 2009 02 2011 02 2013 02 2015 02 2017 02 2019 crime_month

```
##
           month period district tot_pop tot_white tot_black tot_hisp p50_inc
                                                                   2543 91084.91
## 1
     2005-01-01
                                    38472
                                              22608
                                                         4953
                      1
                               1
## 2
      2005-01-01
                      1
                               1
                                    38472
                                              22608
                                                         4953
                                                                   2543 91084.91
     2005-01-01
                      1
                               1
                                   38472
                                              22608
                                                         4953
                                                                  2543 91084.91
## 3
     2005-01-01
                      1
                               1
                                    38472
                                              22608
                                                         4953
                                                                  2543 91084.91
     2005-01-01
                      1
                               1
                                   38472
                                              22608
                                                         4953
                                                                  2543 91084.91
## 5
     2005-01-01
                      1
                                              22608
                                                                  2543 91084.91
## 6
                               1
                                   38472
                                                         4953
     2005-01-01
                      1
                               1
                                   38472
                                              22608
                                                         4953
                                                                  2543 91084.91
## 7
## 8 2005-01-01
                                    38472
                                              22608
                                                         4953
                                                                  2543 91084.91
```

20000 -

```
## 9 2005-01-01
                                                                         37992
                                                                                                  630
                                                                                                                   35966
                                                                                                                                          628 29890.17
## 10 2005-01-01
                                                                         37992
                                                                                                  630
                                                                                                                   35966
                                                                                                                                          628 29890.17
                                              1
            crime_type crimes
## 1
                         drug
## 2
                        drug
                                         188
## 3
                                           62
                      other
## 4
                      other
                                         302
## 5
                property
                                         624
## 6
                                         160
                property
## 7
                  violent
                                         150
## 8
                  violent
                                           62
## 9
                         drug
                                             1
## 10
                        drug
                                         208
# panel data of unit
# sum up the crime_type
a <- ppl_crm %>%group_by( , month, period, district, tot_pop, tot_white, tot_black, tot_hisp, p50_inc,
## `summarise()` has grouped output by 'month', 'period', 'district', 'tot_pop', 'tot_white', 'tot_blac
b <- spread(a, crime_type,crimes) %>% mutate(, tot_crimes = drug + other + property + violent, tot_crm_
panel 5 = b[,c(1:3,15:17,8,\ 18:20)] \# district, tot\_crm\_p\_res, vio\_crm\_p\_res,\ pro\_crm\_p\_res,\ p50\_inc, ro\_blace, ro\_blace,
head(panel5,15)
## # A tibble: 15 x 10
## # Groups: month, period, district, p50_inc [15]
##
            month
                                   period district tot_crm_p_res vio_crm_p_res pro_crm_p_res p50_inc
##
            <chr>>
                                     <int>
                                                        <int>
                                                                                      <dbl>
                                                                                                                   <dbl>
                                                                                                                                                <dbl>
                                                                                                                                                                 <dbl>
                                                                                 0.0403
## 1 2005-01-01
                                             1
                                                                                                               0.00551
                                                                                                                                            0.0204
                                                                                                                                                               91085.
                                                                 1
## 2 2005-01-01
                                              1
                                                                 2
                                                                                 0.0356
                                                                                                               0.00961
                                                                                                                                            0.0134
                                                                                                                                                               29890.
## 3 2005-01-01
                                              1
                                                                 3
                                                                                 0.0217
                                                                                                               0.00678
                                                                                                                                            0.00771 28048.
## 4 2005-01-01
                                              1
                                                                 4
                                                                                 0.0148
                                                                                                               0.00495
                                                                                                                                            0.00573 39010.
## 5 2005-01-01
                                              1
                                                                5
                                                                                 0.0190
                                                                                                               0.00585
                                                                                                                                            0.00628 33147.
## 6 2005-01-01
                                             1
                                                                 6
                                                                                 0.0194
                                                                                                               0.00660
                                                                                                                                            0.00819 34672.
## 7 2005-01-01
                                                                7
                                             1
                                                                                 0.0275
                                                                                                               0.00994
                                                                                                                                            0.00891 23961.
## 8 2005-01-01
                                             1
                                                                8
                                                                                 0.00963
                                                                                                               0.00255
                                                                                                                                            0.00474
                                                                                                                                                              49069.
## 9 2005-01-01
                                                                9
                                                                                                                                            0.00437 36324.
                                             1
                                                                                 0.00993
                                                                                                               0.00294
## 10 2005-01-01
                                                              10
                                                                                                               0.00376
                                                                                                                                            0.00392 29147.
                                             1
                                                                                 0.0119
## 11 2005-01-01
                                             1
                                                                                                                                            0.00771 26338.
                                                              11
                                                                                 0.0319
                                                                                                               0.00865
## 12 2005-01-01
                                             1
                                                              12
                                                                                                               0.00491
                                                                                                                                            0.00864 52561.
                                                                                 0.0188
                                                              13
## 13 2005-01-01
                                             1
                                                                                 0.00746
                                                                                                               0.00193
                                                                                                                                            0.00406 61950.
## 14 2005-01-01
                                             1
                                                              14
                                                                                 0.0103
                                                                                                               0.00250
                                                                                                                                            0.00558 61849.
## 15 2005-01-01
                                                              15
                                                                                                                                            0.00649 27940.
                                             1
                                                                                 0.0269
                                                                                                               0.00806
## # ... with 3 more variables: ro_black <dbl>, ro_hisp <dbl>, ro_white <dbl>
#Ex3
#pool estimation
off = off_ori
panel5_3 = cbind(panel5, b$tot_crimes) %% rename(,c("tot_crimes" = "...11"))
## New names:
## * NA -> ...11
offcri= left_join(off, panel5_3, by=c("unit"="district", "month"="month"))
tot_crimes = unlist(offcri$tot_crimes)
```

```
offcri = data.frame(offcri[,1:13], tot_crimes)
reg1 <- plm(arrest ~ tenure + p50_inc + tot_crimes + ro_black + ro_hisp + ro_white, data = offcri, mode
summary(reg1)
## Pooling Model
##
## Call:
## plm(formula = arrest ~ tenure + p50_inc + tot_crimes + ro_black +
      ro_hisp + ro_white, data = offcri, model = "pooling")
##
## Unbalanced Panel: n = 13028, T = 1-132, N = 1077905
##
## Residuals:
##
      Min. 1st Qu.
                      Median 3rd Qu.
## -0.50168 -0.49929 -0.49808 0.50082 5.50249
##
## Coefficients:
##
                  Estimate Std. Error t-value Pr(>|t|)
## (Intercept) 5.0671e-01 1.2781e-02 39.6438
                                                 <2e-16 ***
              -4.1607e-06 8.3541e-06 -0.4980
## tenure
                                                0.6185
## p50_inc
               1.6175e-08 9.1862e-08 0.1761
                                                 0.8602
## tot_crimes 2.2296e-07 1.8046e-06 0.1236 0.9017
## ro_black
              -8.1016e-03 1.3403e-02 -0.6045 0.5455
              -5.3626e-03 1.3911e-02 -0.3855
## ro_hisp
                                               0.6999
## ro_white
              -1.2073e-02 1.6323e-02 -0.7397
                                                0.4595
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Total Sum of Squares:
                            538530
## Residual Sum of Squares: 538530
## R-Squared:
                  2.0317e-06
## Adj. R-Squared: -3.5347e-06
## F-statistic: 0.364999 on 6 and 1077898 DF, p-value: 0.90142
As the result shown above, when using the pooling method and does not use the fixed effect or random effect
model, The result is not significant.
#Ex4
#using within estimator
reg2 = plm(arrest ~ tenure + p50_inc + tot_crimes + ro_black + ro_hisp + ro_white, data = offcri, model
summary(reg2)
## Oneway (individual) effect Within Model
##
## plm(formula = arrest ~ tenure + p50_inc + tot_crimes + ro_black +
      ro_hisp + ro_white, data = offcri, model = "within", index = c("month"))
##
## Unbalanced Panel: n = 132, T = 7656-8829, N = 1077905
##
## Residuals:
##
      Min. 1st Qu.
                     Median 3rd Qu.
                                           Max.
```

```
## -0.52161 -0.49999 -0.49260 0.50107 5.51664
##
## Coefficients:
##
                Estimate Std. Error t-value Pr(>|t|)
## tenure
            -5.0030e-06 8.4332e-06 -0.5933 0.5530
## p50 inc
             2.5222e-08 9.3348e-08 0.2702 0.7870
## tot crimes -4.5860e-07 2.1593e-06 -0.2124 0.8318
## ro black -6.5442e-03 1.3802e-02 -0.4741 0.6354
## ro_hisp
             -3.6415e-03 1.4363e-02 -0.2535 0.7999
## ro_white -1.1387e-02 1.6382e-02 -0.6951 0.4870
## Total Sum of Squares:
                           538470
## Residual Sum of Squares: 538470
## R-Squared:
                  2.099e-06
## Adj. R-Squared: -0.00012502
## F-statistic: 0.377042 on 6 and 1077767 DF, p-value: 0.89407
#Ex5
#Q1
reg5_1 = plm(arrest ~ tenure + p50_inc + tot_crimes + ro_black + ro_hisp + ro_white, data = offcri, mod
reg5_2 = plm(arrest ~ tenure + p50_inc + tot_crimes + ro_black + ro_hisp + ro_white, data = offcri, mod
reg5_3 = plm(arrest ~ tenure + p50_inc + tot_crimes + ro_black + ro_hisp + ro_white, data = offcri, mod
summary(reg5_1)
## Oneway (individual) effect Within Model
##
## Call:
## plm(formula = arrest ~ tenure + p50_inc + tot_crimes + ro_black +
      ro_hisp + ro_white, data = offcri, model = "within", index = c("NUID",
##
      "month", "unit"))
##
## Unbalanced Panel: n = 13028, T = 1-132, N = 1077905
##
## Residuals:
      Min. 1st Qu. Median 3rd Qu.
## -1.75002 -0.50739 -0.42829 0.49287 5.51161
##
## Coefficients:
              Estimate Std. Error t-value Pr(>|t|)
##
## tenure
             2.3791e-05 2.4074e-05 0.9883 0.3230
## p50_inc -2.7719e-07 2.4407e-07 -1.1357
                                              0.2561
## tot_crimes 3.3373e-06 2.8896e-06 1.1549 0.2481
## ro black -4.6214e-02 3.1990e-02 -1.4446 0.1486
## ro_hisp
             -5.2359e-02 3.4092e-02 -1.5358 0.1246
## ro_white -3.2526e-02 4.2254e-02 -0.7698 0.4414
##
## Total Sum of Squares:
                           531920
## Residual Sum of Squares: 531920
## R-Squared:
                  4.275e-06
## Adj. R-Squared: -0.012235
## F-statistic: 0.75872 on 6 and 1064871 DF, p-value: 0.60237
summary(reg5_2)
```

5

Oneway (individual) effect Between Model

```
##
## Call:
## plm(formula = arrest ~ tenure + p50_inc + tot_crimes + ro_black +
      ro_hisp + ro_white, data = offcri, model = "between", index = c("NUID",
       "month", "unit"))
##
## Unbalanced Panel: n = 13028, T = 1-132, N = 1077905
## Observations used in estimation: 13028
##
## Residuals:
        Min.
                1st Qu.
                            Median
                                      3rd Qu.
                                                    Max.
## -0.5094400 -0.0621304 -0.0036527 0.0534082 2.4986345
## Coefficients:
##
                 Estimate Std. Error t-value Pr(>|t|)
## (Intercept) 4.6690e-01 2.6859e-02 17.3835 < 2e-16 ***
              1.2027e-05 1.4395e-05 0.8355 0.40345
## tenure
## p50 inc
               1.4290e-07 1.9008e-07 0.7518 0.45219
## tot_crimes -7.8368e-06 4.4254e-06 -1.7709 0.07661
## ro black
               4.0418e-02 2.8372e-02 1.4245 0.15431
## ro_hisp
               4.9050e-02 2.9404e-02 1.6681 0.09531
## ro white
               2.2170e-02 3.3474e-02 0.6623 0.50779
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Total Sum of Squares:
                           280.08
## Residual Sum of Squares: 279.93
## R-Squared:
                  0.00053308
## Adj. R-Squared: 7.2527e-05
## F-statistic: 1.15748 on 6 and 13021 DF, p-value: 0.32605
summary(reg5_3)
## Oneway (individual) effect First-Difference Model
##
## Call:
## plm(formula = arrest ~ tenure + p50_inc + tot_crimes + ro_black +
      ro_hisp + ro_white, data = offcri, model = "fd", index = c("NUID",
      "month", "unit"))
##
## Unbalanced Panel: n = 13028, T = 1-132, N = 1077905
## Observations used in estimation: 1059380
##
## Residuals:
         Min.
                  1st Qu.
                               Median
                                          3rd Qu.
                                                         Max.
## -6.00070240 -0.99901908 0.00019606 0.99943717 6.00061040
## Coefficients:
                 Estimate Std. Error t-value Pr(>|t|)
## (Intercept) -1.2211e-04 1.2958e-03 -0.0942 0.9249
              -9.5753e-05 8.4693e-04 -0.1131
## tenure
                                                0.9100
## p50_inc
              -1.6188e-06 4.4146e-06 -0.3667
                                                0.7139
## tot_crimes -4.3614e-06 7.2379e-06 -0.6026
                                                0.5468
## ro_black
              5.0587e-01 8.1091e-01 0.6238 0.5327
## ro_hisp
              9.8436e-03 1.5247e+00 0.0065 0.9948
```

```
1.1685e+00 1.4531e+00 0.8041
## ro_white
                                                 0.4213
##
## Total Sum of Squares:
                            1058500
## Residual Sum of Squares: 1058500
## R-Squared:
                   2.5775e-06
## Adj. R-Squared: -3.0863e-06
## F-statistic: 0.455082 on 6 and 1059373 DF, p-value: 0.84183
rmarkdown::render('A3.Rmd', 'pdf_document')
## Warning in has_crop_tools():
## Tool(s) not installed or not in PATH: ghostcript
## -> As a result, figure cropping will be disabled.
##
##
## processing file: A3.Rmd
## Error in parse_block(g[-1], g[1], params.src, markdown_mode): Duplicate chunk label 'setup', which h
## knitr::opts_chunk$set(echo = TRUE)
## chooseCRANmirror(graphics=FALSE, ind=1)
## knitr::opts_chunk$set(error = TRUE)
## library(pastecs)
## library(tidyverse)
## library(data.table)
## library(stringr)
## library(mfx)
## library(MASS)
## library(bayesm)
## library(rmarkdown)
## library(ggplot2)
## library(dplyr)
## library(lubridate)
## library(plm)
## setwd('C:/Users/sophi/Desktop/Econ613/A3')
## options(knitr.purl.inline = TRUE)
```