## ANALYSIS OF PANEL DATA

An Introduction

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## Exploratory Panel Data Analysis: A Two-Period Panel

#### Exploring Panel Data

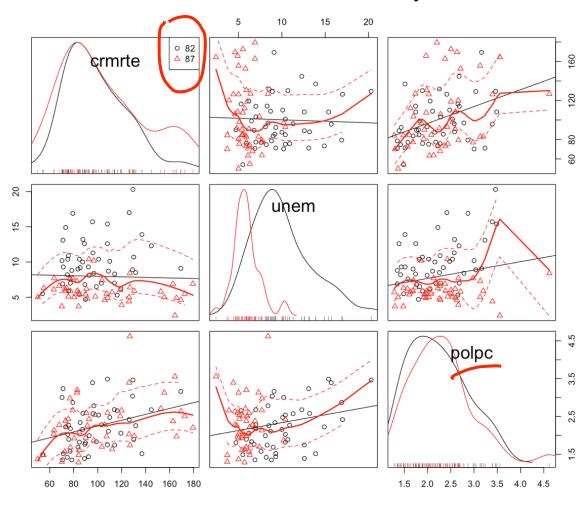
- The exploratory data analysis techniques studied in w203 and earlier in this course can be applied.
- However, with panel data, we first need to find out how many panels there are in the dataset.
- Then, not only do we need to explore patterns of each feature (as well as the combinations of the features) in each panel, we will have to explore the "dynamic" temporal dependence" of the features.
- A subset of an example data (crime4) is shown here.

```
630 obs. of 59 variables:
'data.frame':
$ county : int 1111111333...
         : int 81 82 83 84 85 86 87 81 82 83 ...
$ crmrte : num 0.0399 0.0383 0.0303 0.0347 0.0366 ...
$ prbarr : num 0.29 0.338 0.33 0.363 0.325 ...
$ prbconv : num 0.402 0.433 0.526 0.605 0.579 ...
$ prbpris : num  0.472  0.507  0.48  0.52  0.497 ...
$ avgsen : num 5.61 5.59 5.8 6.89 6.55 ...
       : num 0.00179 0.00177 0.00184 0.00189 0.00192 ...
$ density : num 2.31 2.33 2.34 2.35 2.36 ...
$ taxpc : num 25.7 24.9 26.5 26.8 28.1 ...
         : int 00000000000...
$ central : int 1111111111...
$ urban : int 0000000000...
$ pctmin80: num 20.2 20.2 20.2 20.2 20.2 ...
         : num 206 213 220 223 244 ...
$ wcon
$ wtuc
         : num 334 369 1395 399 359 ...
$ wtrd
        : num 182 190 197 201 207 ...
$ wfir
        : num 272 301 310 350 383 ...
$ wser
        : num 216 232 240 252 261 ...
$ wmfg
        : num 229 240 270 282 299 ...
$ wfed
         : num 409 420 439 459 490 ...
$ wsta
         : num 236 254 250 262 281 ...
$ wloc
         : num 231 237 249 264 289 ...
$ mix
         : num 0.0999 0.103 0.0807 0.0785 0.0932 ...
$ pctymle : num  0.0877  0.0864  0.0851  0.0838  0.0823 ...
$ d82
         : int 0100000010...
$ d83
         : int 0010000001...
$ d84
         : int 0001000000 ...
         : int 0000100000 ...
$ d85
$ d86
         : int 0000010000 ...
```

```
> table(crime4$year)
81 82 83 84 85 86 87
90 90 90 90 90 90
```

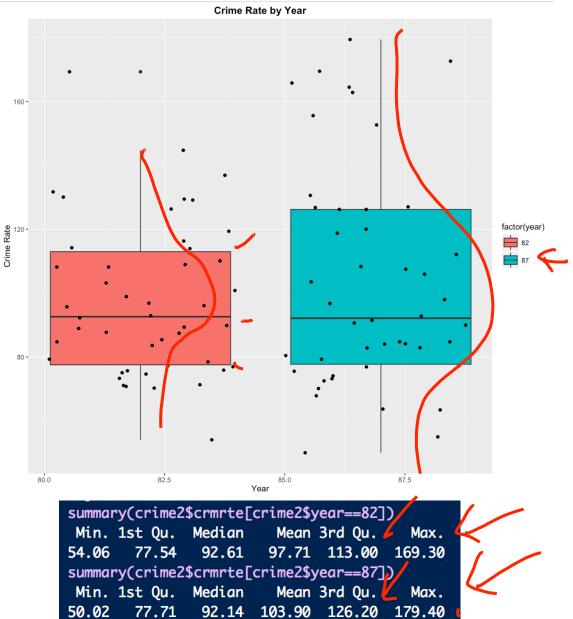
#### Distributions and Dependence Over Time

#### Crime Rates and Selected Variables by Year

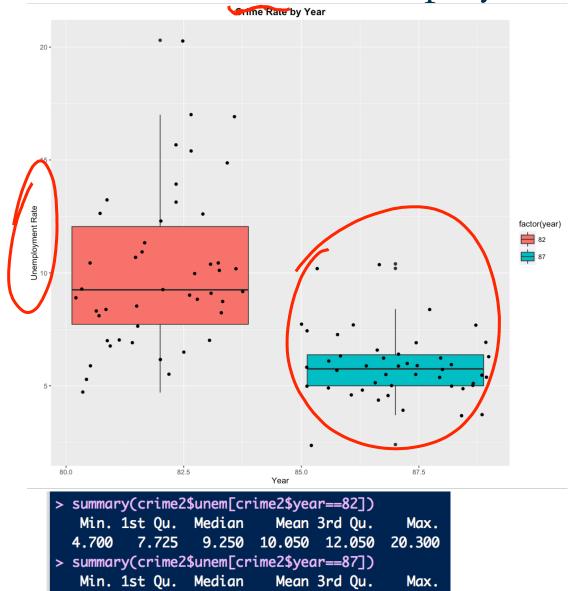


- Recognize that relationship between variable of interest and predictors may change over time.
- The distribution of each of the variables may also change over time.

#### Distribution of Crime Rate Over Time



### Distribution of Unemployment Rate Over Time



5.889

6.375

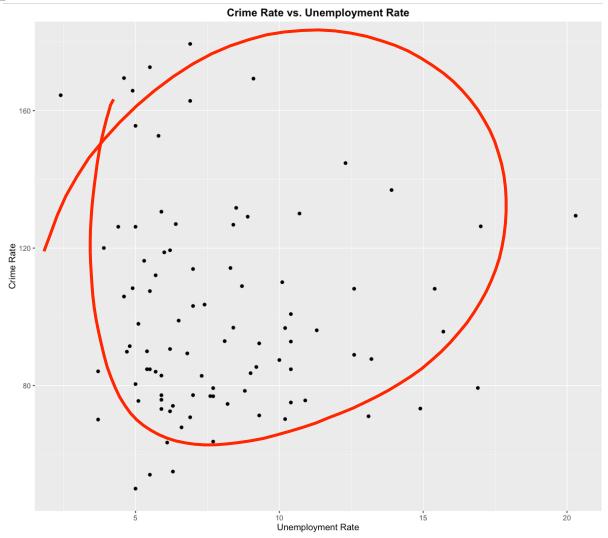
10.400

2.400

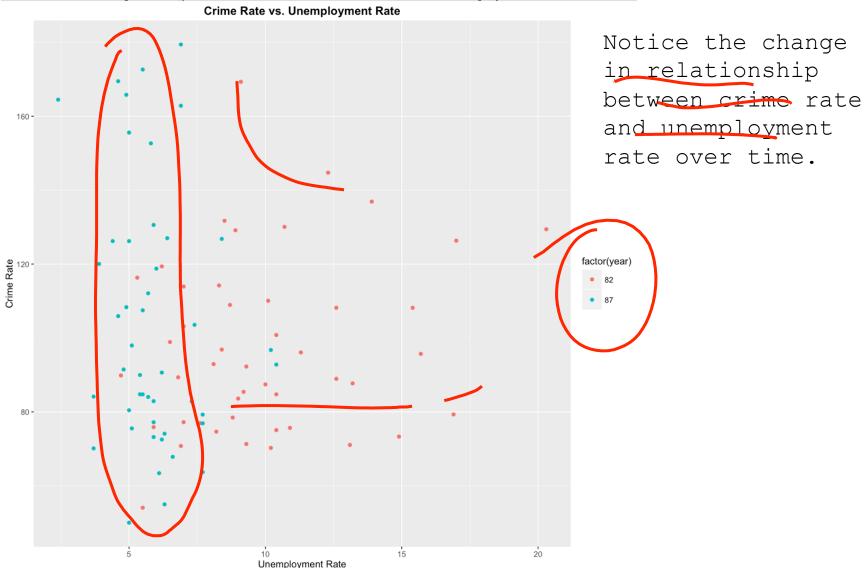
5.000

5.750

## Relationship Between Crime Rate and Unemployment Rate



### Relationship Between Crime Rate and Unemployment Rate Changed Over Time



### Naïve OLS Regression 1 : Using Only the 1982 Panel

```
> ols.fit1<-lm(crmrte ~ unem, data=crimes.82)</pre>
> summary(ols.fit1)
Call:
lm(formula = crmrte ~ unem, data = crimes.82)
Residuals:
   Min
            1Q Median 3Q
                                  Max
-37.693 -17.292 -3.671 16.994 72.854
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
                       10.904 7.756 9.07e-10 ***
             84.569
(Intercept)
              1.307 1.027 1.272
                                         0.21
unem
Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' '1
Residual standard error: 23.74 on 44 degrees of freedom
Multiple R-squared: 0.03549, Adjusted R-squared: 0.01357
F-statistic: 1.619 on 1 and 44 DF, p-value: 0.2099
```

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