

# Additional Panel Data Methods

- 1 Fixed Effects Estimation
- 2 Random Effects Models

# Fixed Effects Estimation

- Alternative to first differencing *to eliminate time-inv. unobs.  $a_i$*
- Model

$$y_{it} = \beta_0 + \beta_1 x_{it} + a_i + u_{it}$$

- Averaging over each  $i$   *$i$ : indiv. units  $t=1, \dots, T$*

$$\bar{y}_i = \beta_0 + \beta_1 \bar{x}_i + a_i + \bar{u}_i$$

$$\bar{y}_i = \frac{1}{T} \sum_{t=1}^T y_{it}$$

- Subtracting

$$y_{it} - \bar{y}_i = \beta_1 (x_{it} - \bar{x}_i) + u_{it} - \bar{u}_i$$

$$\ddot{y}_{it} = \beta_1 \ddot{x}_{it} + \ddot{u}_{it}$$

## Fixed Effects Estimation (cont.)

- Example

$$crime_{it} = \beta_0 + \beta_1 unem_{it} + city_i + u_{it}$$

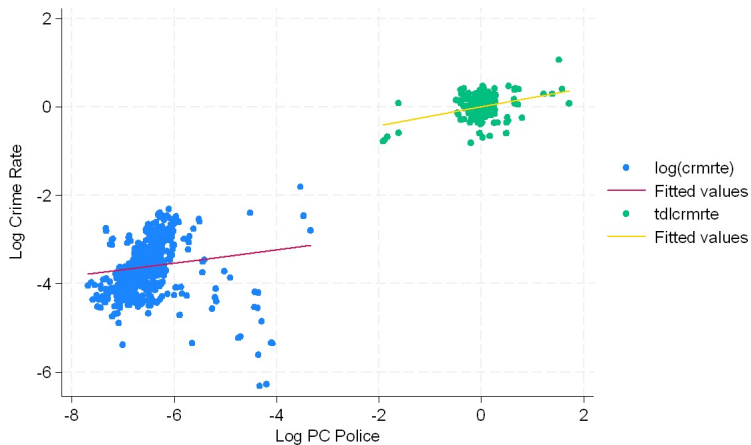
- Averaging over time

$$\overline{crime}_i = \beta_0 + \beta_1 \overline{unem}_i + city_i + \bar{u}_i$$

- Subtracting

$$crime_{it} - \overline{crime}_i = \beta_1 (unem_{it} - \overline{unem}_i) + u_{it} - \bar{u}_i$$
$$\dot{crime}_{it} = \beta_1 \dot{unem}_{it} + \dot{u}_{it}$$

## Fixed Effects Estimation (cont.)



## Fixed Effects Estimation (cont.)

- Time-demeaned variables:  $\bar{y}_{it}$ ,  $\bar{x}_{it}$ , and  $\bar{u}_{it}$ 
  - ▶ Also called the **fixed effects/ within transformation**
- OLS estimator based on the time-demeaned variables: **-ion**  
**fixed effects estimator**

Relies on time variation in  $y$  and  $x$  within each cross-sectional unit

## Fixed Effects Estimation (cont.)

arbitrary correl<sup>n</sup> b/w any  $x_{ijt}$  &  $a_i$

### Note

- ▶ Fixed effects estimator allows for
- ▶ Fixed effects transformation eliminates → any explanatory var. that is
- ▶ Strict exogeneity  $\Rightarrow u_{it}$  should be uncorrelated with each  $x_{ijt}$  across all time periods

★ Example

$$crime_{it} = \beta_0 + \beta_1 unem_{it} + city_i + u_{it}$$

constant over time

Under strict

exog.  $\rightarrow$  fixed effects estimator is unbiased

such vars. are controlled for nonetheless

# Fixed Effects Estimation (cont.)

- Note (cont.)
  - ▶ Dummy variable regression

$$y_{it} = \beta_0 + \beta_1 x_{it} + a_i + u_{it}$$

- ★ Include a dummy variable for *each cross-sectional unit*
- ★ Results in the same estimates of

$\beta_1$

*(instead of FE/within)*

# Fixed Effects Estimation (cont.)

- Note (cont.)

- ▶ Fixed effects versus first-differenced estimators

- ★ For  $T = 2$ , both are identical

- ★ For  $T \geq 3$ , the two are not identical, but both

- ★ Inference (standard errors)

depends on

ass<sup>n</sup>:s related to  
 $u_{it}$  and

$\Delta u_{it}$

unbiased/consis-  
-tent

under  
ass<sup>n</sup>:s such  
as  
strict  
exog.



## Fixed Effects Estimation (cont.)

- Note (cont.)

- ▶ Balanced versus unbalanced panel

- ★ Unbalanced:

- ★ Balanced:

- ▶ Unbalanced panel:

all yrs. or pds. of data  
are observed for all  
cross-sectional units

certain yrs. or pds. of  
data are missing  
for some cross-  
-sectional units

↓  
unbiased &  
consistent

provided reason

for missing data not correl.  
with it

# Random Effects Models

- Model

$$y_{it} = \beta_0 + \beta_1 x_{it1} + \dots + \beta_k x_{itk} + a_i + u_{it}$$

- $a_i$  assumed to be **uncorr.** w/ each  $x_{ijt}$  in all
- Composite error:  $v_{it} = a_i + u_{it}$  - **corr. across time** time  
pds.
- Estimation via feasible generalized least squares (FGLS)
- Note: allows **time-invariant explanatory vars.**