

Evaluación de Impacto: DiD

Francesco Bogliacino

Tabla de contenido

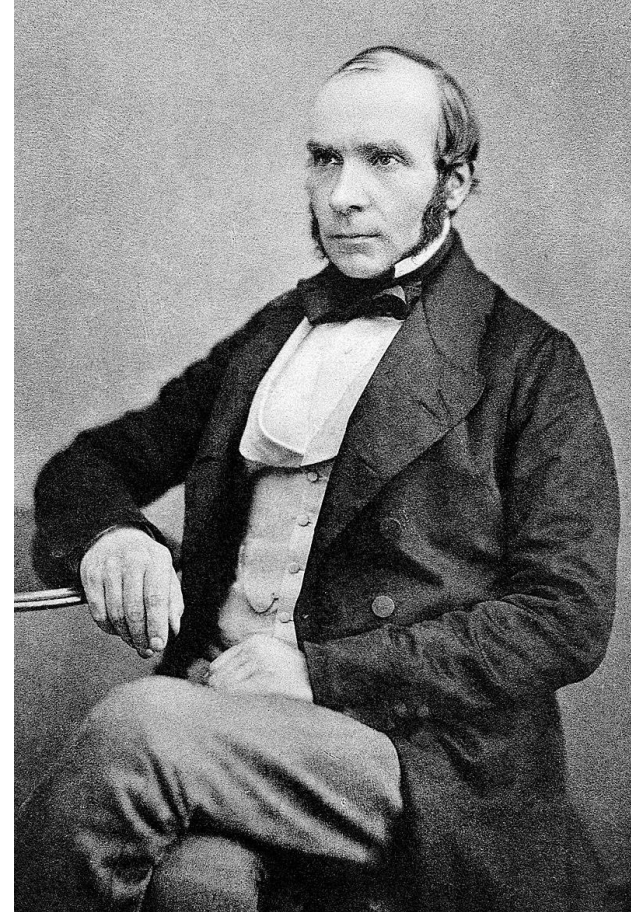
1. Jon Snow

2. Salario mínimo y empleo
3. Identificación en DiD
4. Estimación en DiD
5. Errores estándares
6. Presentación
7. Triple Difference

La historia de J Snow

- J Snow era un anesthesiólogo de Londres del 1800
- A mitad del siglo XIX escribe dos obras sobre el colera
- Su tesis fundamental era: la enfermedad tiene como causa el agua

Fuente: Cunningham (2018)



Fuente: Wikipedia

El colera

- Mortalidad alta (50%)
 - Sintomatología es muy dolorosa (diarrea y vómito) e induce deshidratación
 - Vibrio cholera
- 1831-1832, 1848-1849, 1853-1854 las tres epidemias en Londres
 - En esa época la teoría era la de los miasmas
 - No existía teoría de bacterios y microorganismos

Los mapas



“The most terrible outbreak of cholera which ever occurred in this kingdom, is probably that which took place in Broad Street, Golden Square, and the adjoining streets, a few weeks ago. Within two hundred and fifty yards of the spot where Cambridge Street [now Lexington St.] joins Broad Street [now Broadwick], there were upwards of five hundred fatal attacks of cholera in ten days.” (Snow 1855)

Agua vs miasmas

- Micro-organismo que entra en el intestino, se reproduce, infecta el agua e induce la expulsión
 - El agua contaminada es reciclada (Londres del 800 no era la de los oligarcas rusos de hoy)
 - La gente toma agua y se enferma
 - Sigue el proceso
- Miasmas transmiten el “virus” (nadie sabía que era un virus en esa época)
 - Más abajo, más transmisión
 - Más concentración más transmisión
- [la teoría es consistente con los hechos estilizados, hay correlación entre los fenómenos]

| Data | Summary | Statistical Testing | Theory | Refute? | Comment |
|---|---|---|--------|---------|--|
| Albion Terrace, 17 houses & 20-25 deaths, 1849 | 17 houses infected, surrounding not | None | Water | NO | Sewage leaked into shared water supply after storm. Crucial for developing theory |
| | | | Miasma | YES | |
| Broad St – Susannah Eley (Hampstead, 1 person) | Single Case, "Far from pump but died" | None | Water | NO | Water bottles shipped to Hampstead by sons |
| | | | Miasma | YES | |
| Broad St – St. James workhouse (535 people, 5 deaths) | Counterexample? "Close to pump but survived" | None | Water | NO | In-house well |
| | | | Miasma | YES | |
| Broad St 500 residents, categorized by drinking & illness | Infection rates differ by pump drinking | Contingency Table | Water | NO | |
| | | | Miasma | YES | |
| S London 480k people, 1849 vs 1854 diff-in-diffs, aggregate sub-district | Mortality rates differ by water supply, not other characteristics | Diff-in-diffs, linear & count regressions, error analysis | Water | NO | Lambeth Water Co changed to clean water 1852, \Rightarrow control / treatment DiD design |
| | | | Miasma | YES | |
| S London 480k people, direct District / sub-district comparison, quasi-randomized | Mortality rates differ by water supply company | RCT, Count regressions, detailed error analysis | Water | NO | Mixing of water co customers, control / treatment, effectively randomized |
| | | | Miasma | YES | |

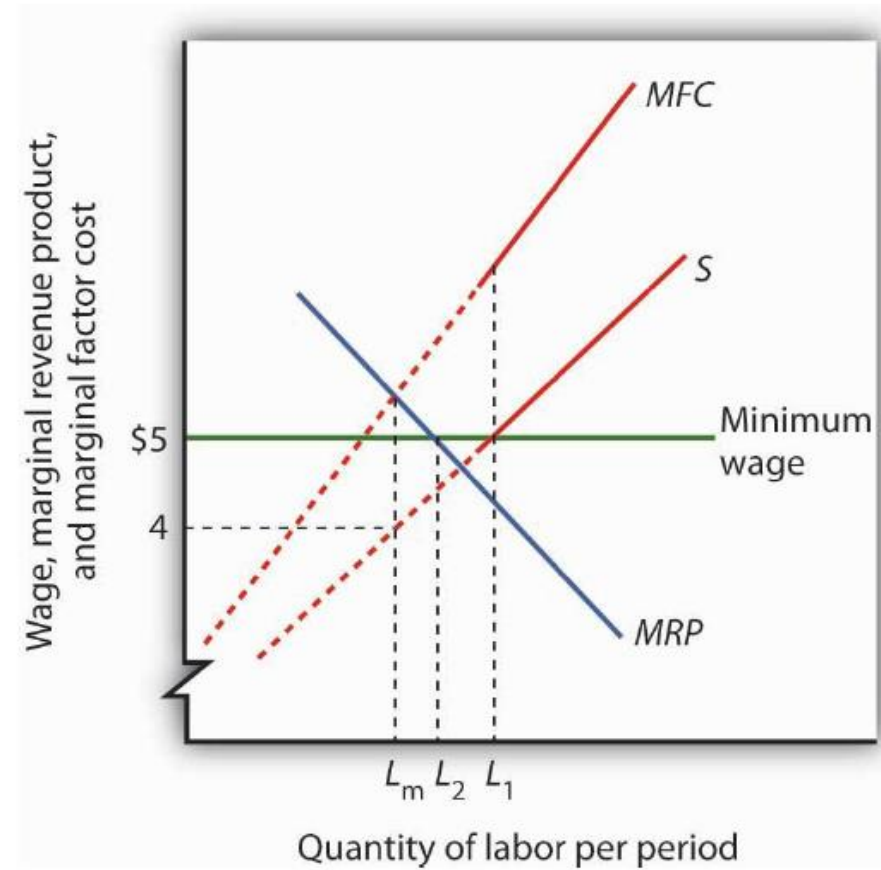
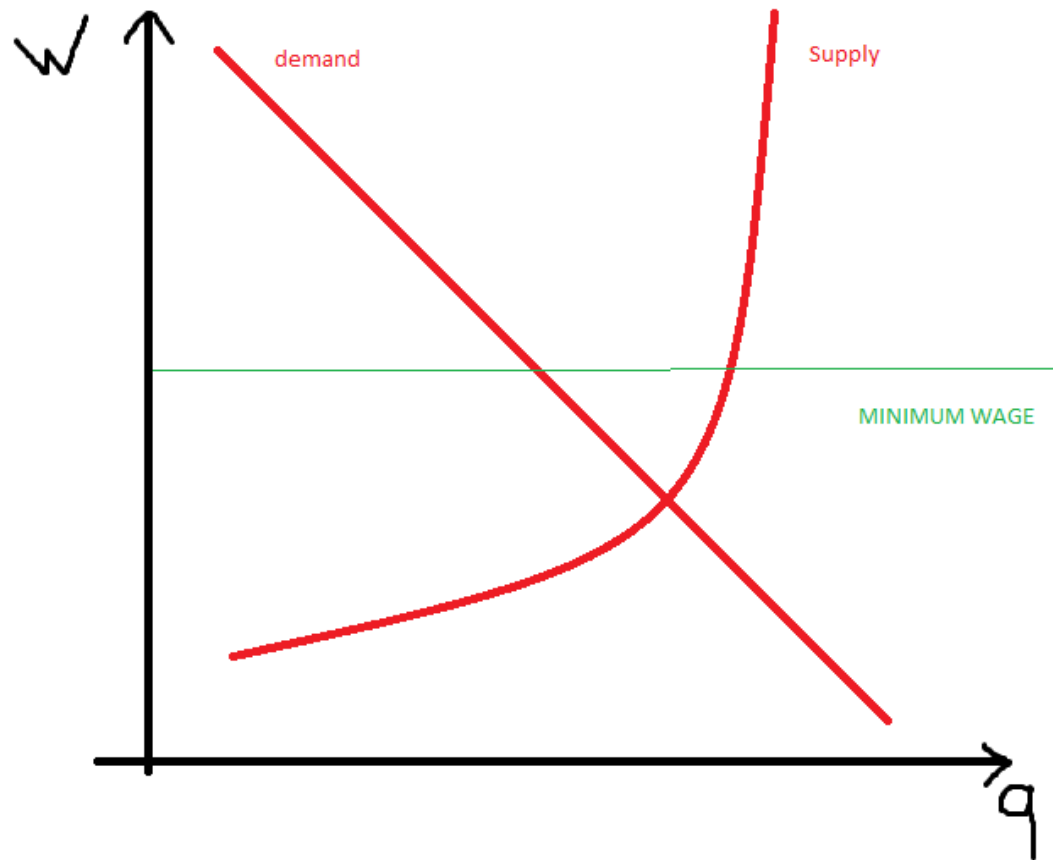
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Fuente: Coleman (2019)

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Predicción teórica



Source: Cunningham

El estudio de Card and Krueger (1994)

- New Jersey aumenta el salario mínimo de 4.25\$ a 5.05\$, mientras que Pennsylvania lo deja a 4.25\$
- Recolección de datos orientado hacia evaluar el efecto de la política:
 - Fast food: (a) contestan encuesta; (b) tienen muchos trabajadores al mínimo; (c) es difícil que violen la regulación por temas de franquicia; (d) el producto es homogéneo
- Datos: feb 1992, nov 1992
 - Response rate inicial: NJ 91%; PA 72.5%
 - 90% response rate in the second wave
 - Data completed with in site visit (6 cerrados, 2 cerrado temporáneamente, 2 en renovación)-> 99.8% of second wave

El estudio de Card and Krueger (1994)

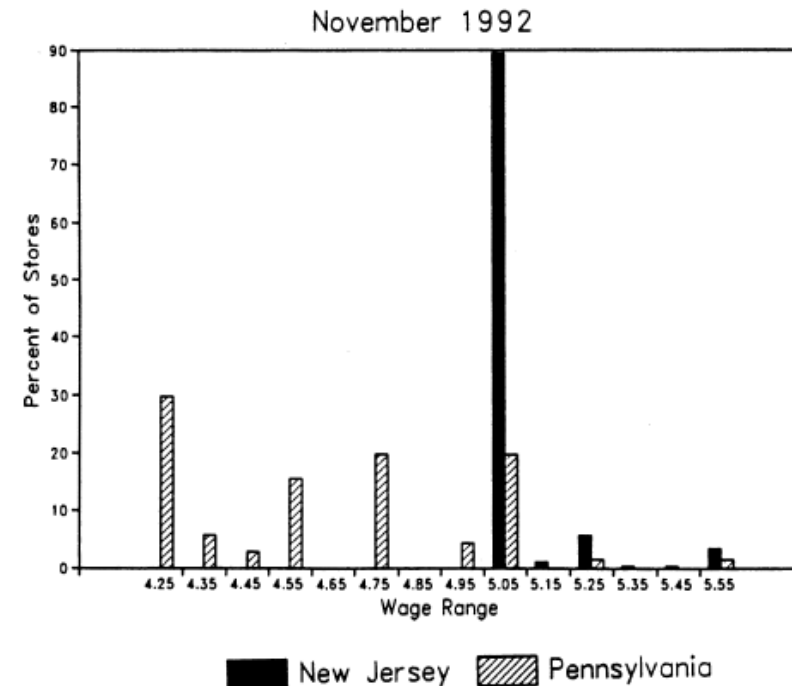
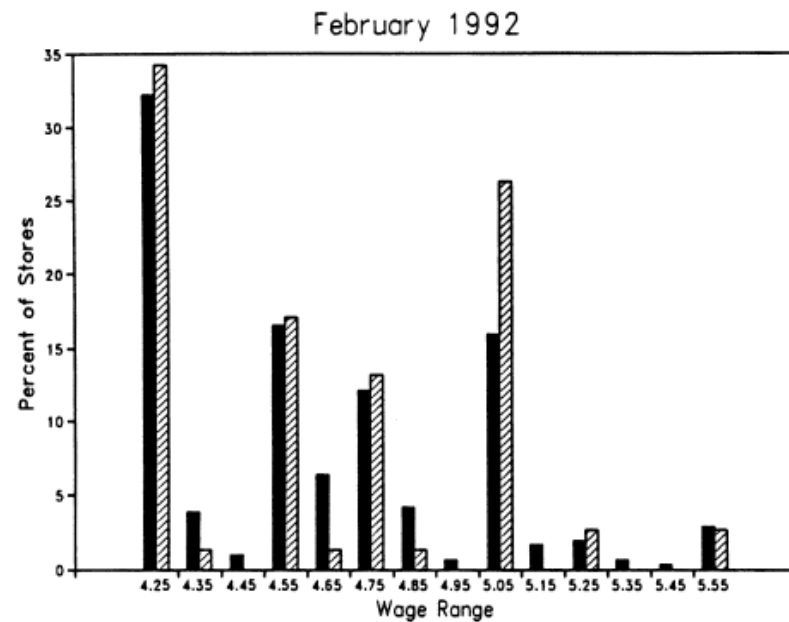


FIGURE 1. DISTRIBUTION OF STARTING WAGE RATES

El estudio de Card and Krueger (1994)

TABLE 2—MEANS OF KEY VARIABLES

| Variable | Stores in: | | <i>t</i> ^a |
|--|----------------|----------------|-----------------------|
| | NJ | PA | |
| 1. <i>Distribution of Store Types (percentages):</i> | | | |
| a. Burger King | 41.1 | 44.3 | −0.5 |
| b. KFC | 20.5 | 15.2 | 1.2 |
| c. Roy Rogers | 24.8 | 21.5 | 0.6 |
| d. Wendy's | 13.6 | 19.0 | −1.1 |
| e. Company-owned | 34.1 | 35.4 | −0.2 |
| 2. <i>Means in Wave 1:</i> | | | |
| a. FTE employment | 20.4 (0.51) | 23.3 (1.35) | −2.0 |
| b. Percentage full-time employees | 32.8 (1.3) | 35.0 (2.7) | −0.7 |
| c. Starting wage | 4.61 (0.02) | 4.63 (0.04) | −0.4 |
| d. Wage = \$4.25 (percentage) | 30.5 (2.5) | 32.9 (5.3) | −0.4 |
| e. Price of full meal | 3.35 (0.04) | 3.04 (0.07) | 4.0 |
| f. Hours open (weekday) | 14.4 (0.2) | 14.5 (0.3) | −0.3 |
| g. Recruiting bonus | 23.6 (2.3) | 29.1 (5.1) | −1.0 |

TABLE 3—AVERAGE EMPLOYMENT PER STORE BEFORE AND AFTER THE RISE IN NEW JERSEY MINIMUM WAGE

| Variable | Stores by state | | | Stores in New Jersey ^a | | | Differences within NJ ^b | |
|--|-----------------|-----------------|---------------------------------|-----------------------------------|--------------------------------|--------------------------|------------------------------------|-----------------------------|
| | PA (i) | NJ (ii) | Difference, NJ − PA (iii) | Wage = \$4.25 (iv) | Wage = \$4.26–\$4.99 (v) | Wage ≥ \$5.00 (vi) | Low– high (vii) | Midrange– high (viii) |
| 1. FTE employment before, all available observations | 23.33 (1.35) | 20.44 (0.51) | −2.89 (1.44) | 19.56 (0.77) | 20.08 (0.84) | 22.25 (1.14) | −2.69 (1.37) | −2.17 (1.41) |
| 2. FTE employment after, all available observations | 21.17 (0.94) | 21.03 (0.52) | −0.14 (1.07) | 20.88 (1.01) | 20.96 (0.76) | 20.21 (1.03) | 0.67 (1.44) | 0.75 (1.27) |
| 3. Change in mean FTE employment | −2.16 (1.25) | 0.59 (0.54) | 2.76 (1.36) | 1.32 (0.95) | 0.87 (0.84) | −2.04 (1.14) | 3.36 (1.48) | 2.91 (1.41) |
| 4. Change in mean FTE employment, balanced sample of stores ^c | −2.28 (1.25) | 0.47 (0.48) | 2.75 (1.34) | 1.21 (0.82) | 0.71 (0.69) | −2.16 (1.01) | 3.36 (1.30) | 2.87 (1.22) |
| 5. Change in mean FTE employment, setting FTE at temporarily closed stores to 0 ^d | −2.28 (1.25) | 0.23 (0.49) | 2.51 (1.35) | 0.90 (0.87) | 0.49 (0.69) | −2.39 (1.02) | 3.29 (1.34) | 2.88 (1.23) |

El estudio de Card and Krueger (1994)

TABLE 4—REDUCED-FORM MODELS FOR CHANGE IN EMPLOYMENT

| Independent variable | Model | | | | |
|--|----------------|----------------|-----------------|-----------------|-----------------|
| | (i) | (ii) | (iii) | (iv) | (v) |
| 1. New Jersey dummy | 2.33 (1.19) | 2.30 (1.20) | — | — | — |
| 2. Initial wage gap ^a | — | — | 15.65 (6.08) | 14.92 (6.21) | 11.91 (7.39) |
| 3. Controls for chain and ownership ^b | no | yes | no | yes | yes |
| 4. Controls for region ^c | no | no | no | no | yes |
| 5. Standard error of regression | 8.79 | 8.78 | 8.76 | 8.76 | 8.75 |
| 6. Probability value for controls ^d | — | 0.34 | — | 0.44 | 0.40 |

TABLE 6—EFFECTS OF MINIMUM-WAGE INCREASE ON OTHER OUTCOMES

| Outcome measure | Mean change in outcome | | | Regression of change in outcome variable on: | | |
|---|------------------------|-----------------|------------------|--|------------------------------|-------------------------------|
| | NJ (i) | PA (ii) | NJ – PA (iii) | NJ dummy (iv) | Wage gap ^a (v) | Wage gap ^b (vi) |
| <i>Store Characteristics:</i> | | | | | | |
| 1. Fraction full-time workers ^c (percentage) | 2.64 (1.71) | –4.65 (3.80) | 7.29 (4.17) | 7.30 (3.96) | 33.64 (20.95) | 20.28 (24.34) |
| 2. Number of hours open per weekday | –0.00 (0.06) | 0.11 (0.08) | –0.11 (0.10) | –0.11 (0.12) | –0.24 (0.65) | 0.04 (0.76) |
| 3. Number of cash registers | –0.04 (0.04) | 0.13 (0.10) | –0.17 (0.11) | –0.18 (0.10) | –0.31 (0.53) | 0.29 (0.62) |
| 4. Number of cash registers open at 11:00 A.M. | –0.03 (0.05) | –0.20 (0.08) | 0.17 (0.10) | 0.17 (0.12) | 0.15 (0.62) | –0.47 (0.74) |
| <i>Employee Meal Programs:</i> | | | | | | |
| 5. Low-price meal program (percentage) | –4.67 (2.65) | –1.28 (3.86) | –3.39 (4.68) | –2.01 (5.63) | –30.31 (29.80) | –33.15 (35.04) |
| 6. Free meal program (percentage) | 8.41 (2.17) | 6.41 (3.33) | 2.00 (3.97) | 0.49 (4.50) | 29.90 (23.75) | 36.91 (27.90) |
| 7. Combination of low-price and free meals (percentage) | –4.04 (1.98) | –5.13 (3.11) | 1.09 (3.69) | 1.20 (4.32) | –11.87 (22.87) | –19.19 (26.81) |
| <i>Wage Profile:</i> | | | | | | |
| 8. Time to first raise (weeks) | 3.77 (0.89) | 1.26 (1.97) | 2.51 (2.16) | 2.21 (2.03) | 4.02 (10.81) | –5.10 (12.74) |
| 9. Usual amount of first raise (cents) | –0.01 (0.01) | –0.02 (0.02) | 0.01 (0.02) | 0.01 (0.02) | 0.03 (0.11) | 0.03 (0.11) |
| 10. Slope of wage profile (percent per week) | –0.10 (0.04) | –0.11 (0.09) | 0.01 (0.10) | 0.01 (0.10) | –0.09 (0.56) | –0.08 (0.57) |

El estudio de Card and Krueger (1994)

- Ejemplo de estudio que es transparente, bien diseñado desde la recolección
- Todo el ejercicio es informado por la teoría
- Fue muy influyente y generó debates muy encendidos

TABLE 7—REDUCED-FORM MODELS FOR CHANGE IN THE PRICE OF A FULL MEAL

| Independent variable | Dependent variable: change in the log price of a full meal | | | | |
|---|--|------------------|------------------|------------------|------------------|
| | (i) | (ii) | (iii) | (iv) | (v) |
| 1. New Jersey dummy | 0.033 (0.014) | 0.037 (0.014) | — | — | — |
| 2. Initial wage gap ^a | — | — | 0.077 (0.075) | 0.146 (0.074) | 0.063 (0.089) |
| 3. Controls for chain and ^b ownership | no | yes | no | yes | yes |
| 4. Controls for region ^c | no | no | no | no | yes |
| 5. Standard error of regression | 0.101 | 0.097 | 0.102 | 0.098 | 0.097 |

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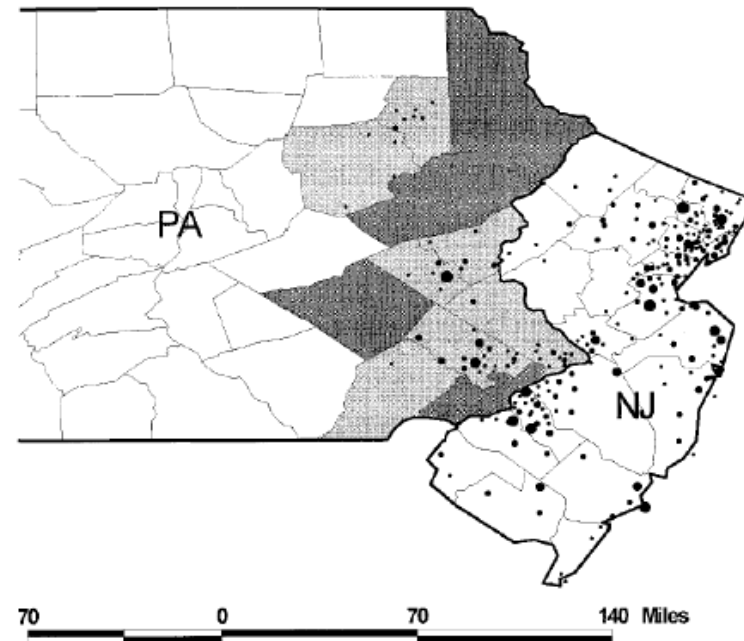
El salario mínimo y el empleo

- New Jersey aumenta el salario mínimo de 4.25\$ a 5.05\$, mientras que Pennsylvania lo deja a 4.25\$
- Para el estado s al tiempo t el empleo con salario mínimo (k) bajo/alto [$k=0,1$] es

$$E[Y_{ist}^k | s, t] = \gamma_s + \tau_t$$

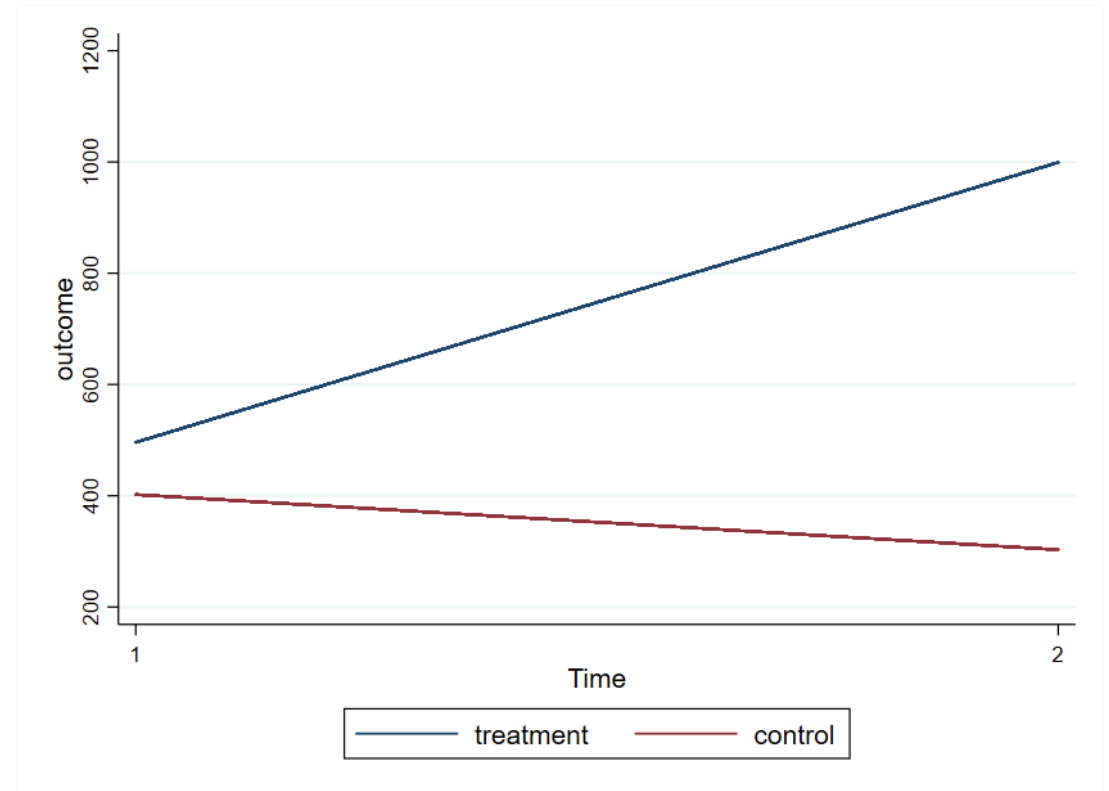
Y

$$E[Y_{ist}^1 - Y_{ist}^0 | s, t] = \delta$$



The switching regression

$$\begin{aligned} Y_{it} &= D_i^{treat} [D_i^{t1} (Y_{i,T,t1}^1) + (1 \\ &\quad - D_i^{t1}) (Y_{i,T,t0}^0)] \\ &\quad + (1 - D_i^{treat}) [D_i^{t1} (Y_{i,C,t1}^0) \\ &\quad + (1 - D_i^{t1}) (Y_{i,C,t0}^0)] = \\ &\quad Y_{i,t0}^0 + D_i^{t1} (Y_{i,C,t1}^0 - Y_{i,C,t0}^0) \\ &\quad + D_i^{treat} (Y_{i,T,t0}^0 - Y_{i,C,t0}^0) + \\ &\quad + D_i^{treat} D_i^{t1} [(Y_{i,T,t1}^1 - Y_{i,T,t0}^0) \\ &\quad - (Y_{i,C,t0}^0 - Y_{i,C,t0}^0)] \end{aligned}$$



La lógica de Dif in Dif

$$E[Y_{ist}^k | s, t] = \gamma_s + \tau_t$$

Y

$$E[Y_{ist}^1 - Y_{ist}^0 | s, t] = \delta$$

$$Y_{ist} = \gamma_s + \tau_t + \delta D_{st} + \varepsilon_{ist}$$

$$E[Y_{ist} | NJ, post] = \gamma_{NJ} + \tau_t + \delta$$

$$E[Y_{ist} | NJ, pre] = \gamma_{NJ}$$

$$E[Y_{ist} | PA, post] = \gamma_{PA} + \tau_t$$

$$E[Y_{ist} | PA, pre] = \gamma_{PA}$$

$$E[Y_{ist} | NJ, post] - E[Y_{ist} | NJ, pre] = \tau_t + \delta$$

No es suficiente

$$E[Y_{ist} | PA, post] - E[Y_{ist} | PA, pre] = \tau_t$$

No es suficiente

$$E[Y_{ist} | NJ, post] - E[Y_{ist} | NJ, pre] - [E[Y_{ist} | PA, post] - E[Y_{ist} | PA, pre]] = \delta$$

Si las tendencias son paralelas

Potential Outcome & Switching Equation

$$\begin{aligned} & [E(Y_{T,post}^1 - Y_{T,pre}^0) - E(Y_{C,post}^0 - Y_{C,pre}^0)] = \\ & [E(Y_{T,post}^1 - Y_{T,pre}^0) - E(Y_{C,post}^0 - Y_{C,pre}^0)] + E[Y_{T,post}^0] - E[Y_{T,post}^0] = \end{aligned}$$

$$E(Y_{T,post}^1 - Y_{T,post}^0) = \text{ATT}$$

$$E[Y_{T,post}^0 - Y_{T,pre}^0] - E(Y_{C,post}^0 - Y_{C,pre}^0)$$

La diferencia entre “trends”: si las tendencias son paralelas es igual a cero

Parallel trends

- El DiD se puede usar con *repeated cross section*, por eso es tal vez el más común de los diseños de investigación
- Sin parallel trends estoy violando identif
- Si cambia la composición de los grupos puede ser muy común la variación de tendencias paralelas

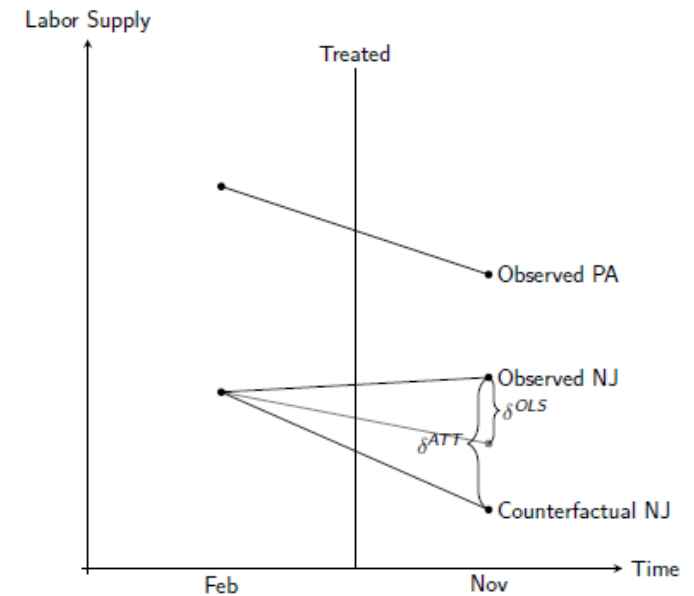


Figure: DD regression diagram without parallel trends

Table 1: Descriptive Statistics for Internet User and Non-user Groups^a

| Year | 1997 | | 1998 | | 1999 | |
|---------------------|---------------|----------|---------------|----------|---------------|----------|
| | Internet User | Non-user | Internet User | Non-user | Internet User | Non-user |
| Average Expenditure | | | | | | |
| Recorded Music | \$25.73 | \$10.90 | \$24.18 | \$9.97 | \$20.92 | \$9.37 |
| Entertainment | \$195.03 | \$96.71 | \$193.38 | \$84.92 | \$182.42 | \$80.19 |
| Zero Expenditure | | | | | | |
| Recorded Music | .56 | .79 | .60 | .80 | .64 | .81 |
| Entertainment | .08 | .32 | .09 | .35 | .14 | .39 |
| Demographics | | | | | | |
| Age | 40.2 | 49.0 | 42.3 | 49.0 | 44.1 | 49.4 |
| Income | \$52,887 | \$30,459 | \$51,995 | \$28,169 | \$49,970 | \$26,649 |
| High School Grad. | .18 | .31 | .17 | .32 | .21 | .32 |
| Some College | .37 | .28 | .35 | .27 | .34 | .27 |
| College Grad. | .43 | .21 | .45 | .21 | .42 | .20 |
| Manager | .16 | .08 | .16 | .08 | .14 | .08 |

Figure 1: Internet Diffusion and Average Quarterly Music Expenditure in the CEX

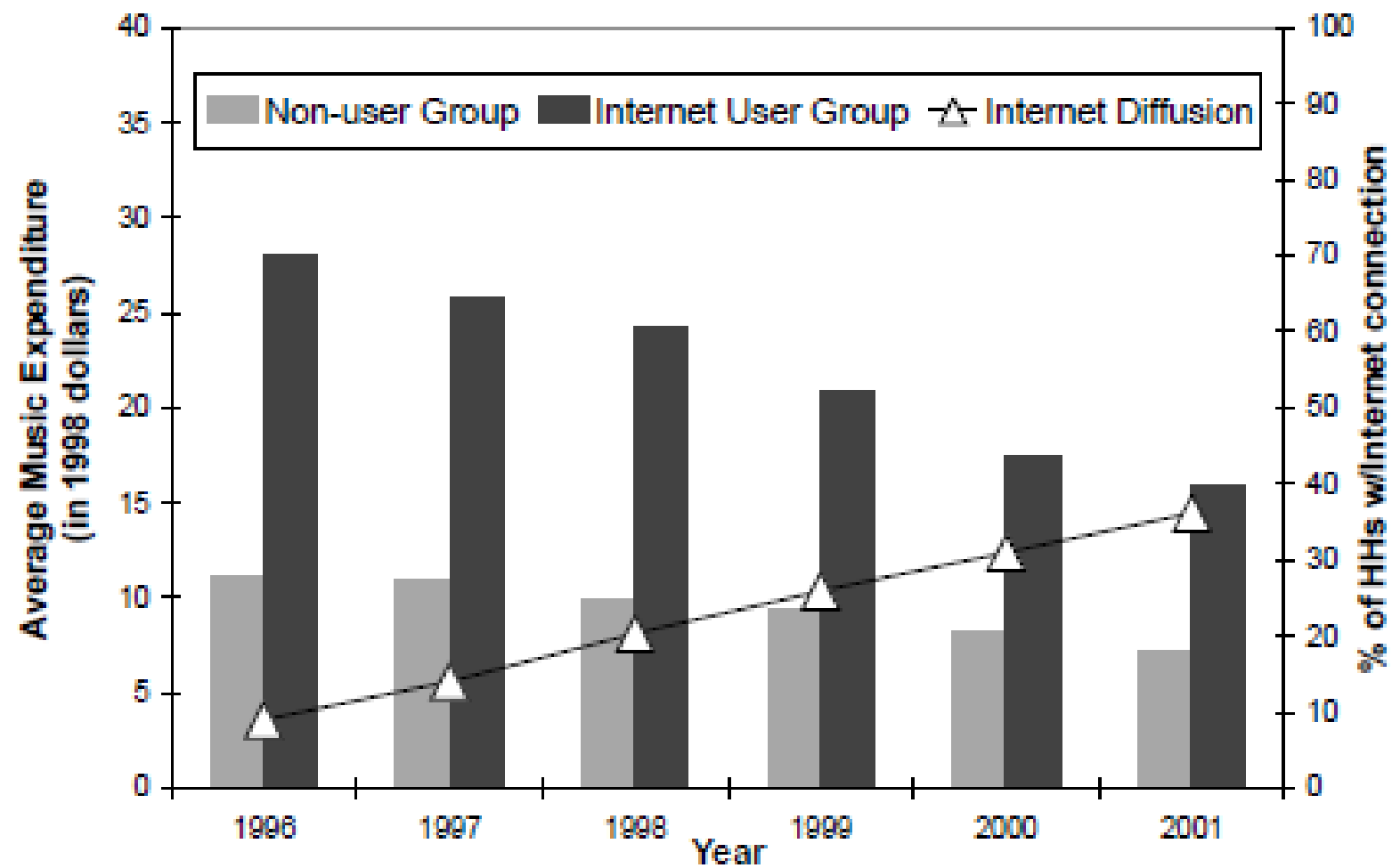


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| | | | | | | | |
|-----|-----|---|----|----------|---|---|---|
| 649 | 325 | 0 | NJ | 19.16265 | 1 | 0 | 0 |
| 650 | 325 | 1 | NJ | 19.83828 | 1 | 1 | 1 |
| 651 | 326 | 0 | NJ | 21.34171 | 1 | 0 | 0 |
| 652 | 326 | 1 | NJ | 20.64373 | 1 | 1 | 1 |
| 653 | 327 | 0 | NJ | 20.80775 | 1 | 0 | 0 |
| 654 | 327 | 1 | NJ | 20.96773 | 1 | 1 | 1 |
| 655 | 328 | 0 | NJ | 19.56505 | 1 | 0 | 0 |
| 656 | 328 | 1 | NJ | 20.39766 | 1 | 1 | 1 |
| 657 | 329 | 0 | NJ | 20.68392 | 1 | 0 | 0 |
| 658 | 329 | 1 | NJ | 22.0185 | 1 | 1 | 1 |
| 659 | 330 | 0 | NJ | 20.36015 | 1 | 0 | 0 |
| 660 | 330 | 1 | NJ | 21.88702 | 1 | 1 | 1 |
| 661 | 331 | 0 | NJ | 21.43298 | 1 | 0 | 0 |
| 662 | 331 | 1 | NJ | 21.13688 | 1 | 1 | 1 |
| 663 | 332 | 0 | PA | 23.62994 | 0 | 0 | 0 |
| 664 | 332 | 1 | PA | 19.59755 | 0 | 1 | 0 |
| 665 | 333 | 0 | PA | 23.68527 | 0 | 0 | 0 |
| 666 | 333 | 1 | PA | 20.46726 | 0 | 1 | 0 |
| 667 | 334 | 0 | PA | 21.45385 | 0 | 0 | 0 |
| 668 | 334 | 1 | PA | 22.15355 | 0 | 1 | 0 |

La estructura
de la base de
datos

OLS

$$y_{ist} = \alpha + \beta NJ_i + \gamma d_t + \delta(NJ_i d_t) + \varepsilon_{ist}$$

- NJ es igual a uno para NJ y 0 para PA

- Bajo parallel trends

- Para PA, pre= α
- Para PA, post= $\alpha + \gamma$
- Para NJ, pre= $\alpha + \beta$
- Para NJ, post= $\alpha + \beta + \gamma + \delta$

```
. reg empl NJ expost NJ_expost, rob
```

Linear regression

Number of obs = 820
F(3, 816) = 164.53
Prob > F = 0.0000
R-squared = 0.5734
Root MSE = .6812

| empl | Coef. | Robust Std. Err. | t | P> t | [95% Conf. Interval] | |
|-----------|-----------|---------------------|--------|-------|----------------------|-----------|
| NJ | -2.822551 | .159201 | -17.73 | 0.000 | -3.135043 | -2.510059 |
| expost | -2.252137 | .1825651 | -12.34 | 0.000 | -2.61049 | -1.893785 |
| NJ_expost | 2.861982 | .1868274 | 15.32 | 0.000 | 2.495263 | 3.228701 |
| _cons | 23.23443 | .1566275 | 148.34 | 0.000 | 22.92699 | 23.54187 |

- DiD Estimate: (NJ, post-NJ, pre)-(NJ, post-NJ, pre)=

$$\alpha + \beta + \gamma + \delta - \alpha - \beta - (\alpha + \gamma - \alpha) = \delta$$

TWFE

$$y_{ist} = \alpha + \gamma d_t + \delta(NJ_i d_t) + \mu_i + \varepsilon_{ist}$$

```
. xtreg empl expost NJ_expost, fe vce(rob)

Fixed-effects (within) regression              Number of obs   =          820
Group variable: iid                          Number of groups  =          410

R-sq:                                         Obs per group:
    within = 0.5741                           min =              2
    between = 0.5726                           avg =             2.0
    overall = 0.0001                           max =              2

                                         F(2,409)         =       190.01
corr(u_i, Xb)  = -0.6501                     Prob > F          =       0.0000
```

(Std. Err. adjusted for 410 clusters in iid)

| empl | Robust | | | | | |
|-----------|-----------|-----------------------------------|--------|-------|----------------------|-----------|
| | Coef. | Std. Err. | t | P> t | [95% Conf. Interval] | |
| expost | -2.252137 | .186049 | -12.11 | 0.000 | -2.617869 | -1.886406 |
| NJ_expost | 2.861982 | .1902816 | 15.04 | 0.000 | 2.48793 | 3.236034 |
| _cons | 20.95573 | .0241002 | 869.53 | 0.000 | 20.90836 | 21.00311 |
| sigma_u | 1.2114728 | | | | | |
| sigma_e | .69012486 | | | | | |
| rho | .75499622 | (fraction of variance due to u_i) | | | | |

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Los diseños DiD-> State level variation



BDM

TABLE II
DD REJECTION RATES FOR PLACEBO LAWS

| A. CPS DATA | | | | |
|---------------------------------|--|-----------------------------|----------------|----------------|
| Data | $\hat{\rho}_1, \hat{\rho}_2, \hat{\rho}_3$ | Modifications | Rejection rate | |
| | | | No effect | 2% effect |
| 1) CPS micro, log wage | | | .675 (.027) | .855 (.020) |
| 2) CPS micro, log wage | | Cluster at state-year level | .44 (.029) | .74 (.025) |
| 3) CPS agg, log wage | .509, .440, .332 | | .435 (.029) | .72 (.026) |
| 4) CPS agg, log wage | .509, .440, .332 | Sampling w/replacement | .49 (.025) | .663 (.024) |
| 5) CPS agg, log wage | .509, .440, .332 | Serially uncorrelated laws | .05 (.011) | .988 (.006) |
| 6) CPS agg, employment | .470, .418, .367 | | .46 (.025) | .88 (.016) |
| 7) CPS agg, hours worked | .151, .114, .063 | | .265 (.022) | .280 (.022) |
| 8) CPS agg, changes in log wage | -.046, .032, .002 | | 0 | .978 (.007) |

B. MONTE CARLO SIMULATIONS WITH SAMPLING FROM AR(1) DISTRIBUTION

| Data | ρ | Modifications | Rejection rate | |
|-----------|--------|---------------|----------------|----------------|
| | | | No effect | 2% effect |
| 9) AR(1) | .8 | | .373 (.028) | .725 (.026) |
| 10) AR(1) | 0 | | .053 (.013) | .783 (.024) |
| 11) AR(1) | .2 | | .123 (.019) | .738 (.025) |
| 12) AR(1) | .4 | | .19 (.023) | .713 (.026) |
| 13) AR(1) | .6 | | .333 (.027) | .700 (.026) |
| 14) AR(1) | -.4 | | .008 (.005) | .7 (.026) |

BDM

- <DiD.do>
- BDM no sugieren modelar el término de error
- Sugieren:
 - Hacer block randomization a nivel de estado
 - Clustering a nivel de estado
 - Collapsar la info a nivel de estado antes y después y correr la regresión

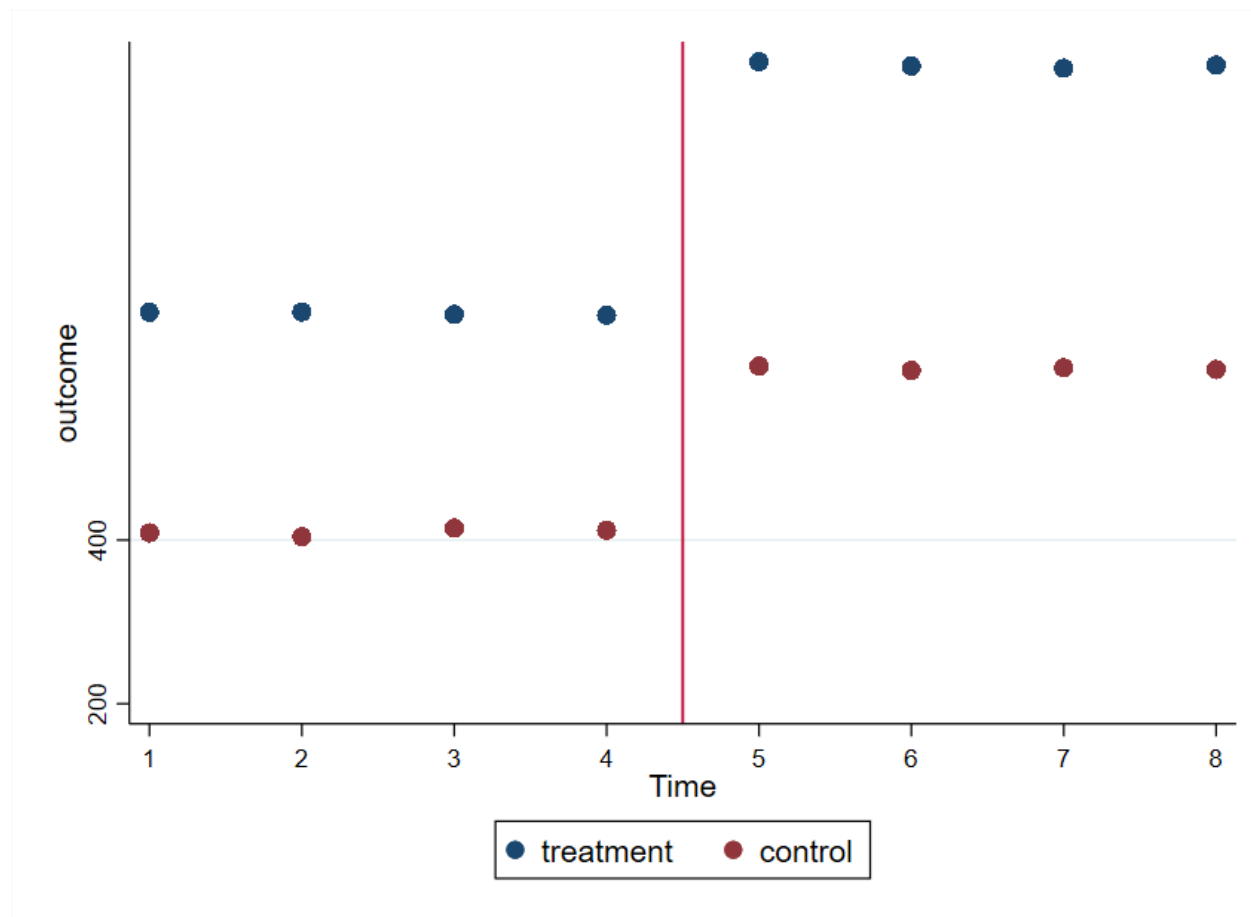
Tabla de contenido

1. Jon Snow
2. Salario mínimo y empleo
3. Identificación en DiD
4. Estimación en DiD
5. Errores estándares
- 6. Presentación**
7. Triple Difference

Ejemplo

- 50 estados
- La ley se pasa entre $t=4$ y $t=5$
- $T=1, \dots, 8$
- Queremos ver el impacto sobre ingresos

(1) Plot the data to see parallel trend

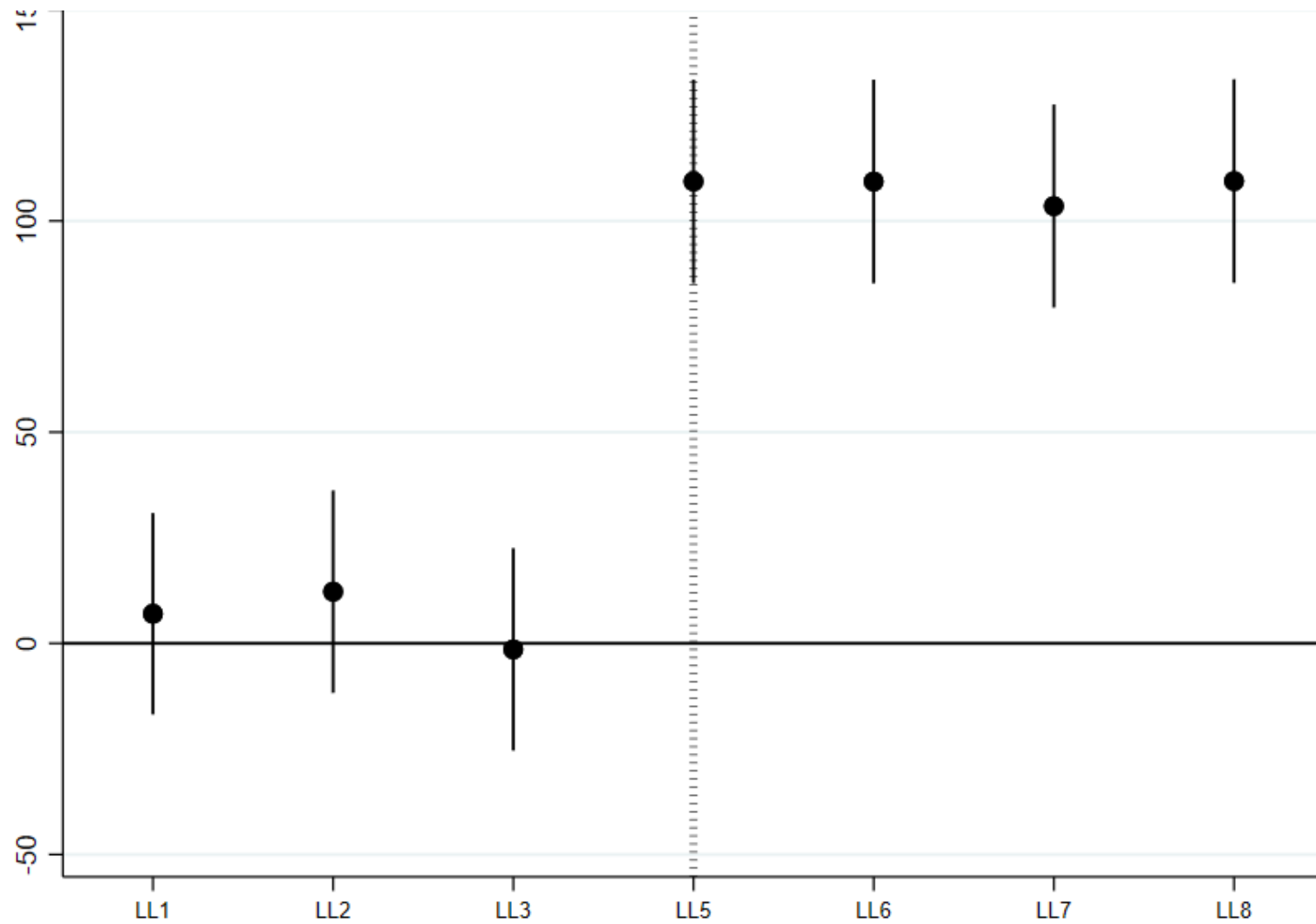


(2) Baseline Results

| Dependent Variable: Outcome | (1) OLS | (2) OLS | (3) FE |
|-----------------------------|---------------------|----------------------|---------------------|
| DiD | 96.37*** (7.38) | 96.37*** (6.05) | 96.37*** (5.10) |
| Constant | 366.67*** (3.73) | 379.71*** (11.50) | 514.68*** (2.77) |
| Observations | 80,000 | 80,000 | 80,000 |
| R-squared | 0.14 | 0.42 | 0.18 |
| Treatment Dummy | Yes | | |
| Expost Dummy | Yes | | |
| Standard errors | Rob | Rob | Cluster(iid) |
| Year FE | | Yes | Yes |
| State FE | | Yes | |
| Number of iid | | | 10,000 |
| Individual FE | | | Yes |

(3) BDM

| Outcome | (1) FE | (2) FE | (3) OLS |
|-----------------|---------------------|---------------------|-----------------------|
| DiD | 95.34*** (4.82) | 95.34*** (4.02) | 95.34*** (0.24) |
| Constant | 548.88*** (2.61) | 548.88*** (4.38) | 289.77*** (0.43) |
| Observations | 80,000 | 80,000 | 20,000 |
| R-squared | 0.18 | 0.18 | 1.00 |
| Number of iid | 10,000 | 10,000 | |
| Year FE | Yes | Yes | Yes |
| Individual FE | Yes | Yes | |
| Standard errors | Cluster(state) | Block Boots | Averaged Pre and Post |
| State FE | | | Yes |



$$y_{ist} = \sum_{\tau=-2}^{-q} \gamma_{\tau} D_i + \sum_{\tau=0}^m \delta_{\tau} D_i$$

$$\mu_s + \lambda_t + \zeta_i + \varepsilon_{ist}$$

(4) Event study

(5) Placebo

| | (1) | (2) |
|-----------------|---------------------|-----------------------|
| | FE | FE |
| | Outcome | Placebo Outcome |
| DiD (placebo) | 2.13 (10.29) | |
| DiD | | -6.70 (5.73) |
| Constant | 525.01*** (4.60) | 1,624.22*** (3.80) |
| Observations | 80,000 | 80,000 |
| R-squared | 0.17 | 0.21 |
| Number of iid | 10,000 | 10,000 |
| Year FE | Yes | Yes |
| Individual FE | Yes | Yes |
| Standard errors | Cluster state | Cluster state |

Doleac & Hansen: BTB

- Caso interesante
- La presentación es un poco diferente pero hay una discusión muy a fondo de la calidad de los datos
- Mucha discusión de mecanismos (-> ver en el paper)

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TABLE 3—DDD ESTIMATES OF THE IMPACT OF STATE MANDATES
ON HOURLY WAGES

| Location/year | Before law change | After law change | Time difference for location |
|--|-----------------------------|-----------------------------|---------------------------------|
| <i>A. Treatment Individuals: Married Women, 20–40 Years Old:</i> | | | |
| Experimental states | 1.547 (0.012) [1,400] | 1.513 (0.012) [1,496] | –0.034 (0.017) |
| Nonexperimental states | 1.369 (0.010) [1,480] | 1.397 (0.010) [1,640] | 0.028 (0.014) |
| Location difference at a point in time: | 0.178 (0.016) | 0.116 (0.015) | |
| Difference-in-difference: | –0.062 (0.022) | | |
| <i>B. Control Group: Over 40 and Single Males 20–40:</i> | | | |
| Experimental states | 1.759 (0.007) [5,624] | 1.748 (0.007) [5,407] | –0.011 (0.010) |
| Nonexperimental states | 1.630 (0.007) [4,959] | 1.627 (0.007) [4,928] | –0.003 (0.010) |
| Location difference at a point in time: | 0.129 (0.010) | 0.121 (0.010) | |
| Difference-in-difference: | –0.008: (0.014) | | |
| DDD: | –0.054 (0.026) | | |

Impacto de
cobertura
obligatoria
para
maternidad

Difference in Difference in Difference

$$\begin{aligned} y_{ijt} &= \alpha + \beta_1 \tau_t + \beta_2 \delta_j + \beta_3 Treat_i + \beta_4 (\tau_t \delta_j) + \beta_5 (TREAT_i \delta_j) \\ &+ \beta_6 (\tau_t TREAT_i) + \beta_7 (TREAT_i \tau_t \delta_j) + \gamma_1 X_{ijt} + \varepsilon_{ijt} \end{aligned}$$

En término de la switching equation

$$\begin{aligned} y_{ijt} &= \alpha + \beta_1 Post_t + \beta_2 B_j + \beta_3 T_i + \beta_4 (Post_t B_j) + \beta_5 (T_i B_j) \\ &+ \beta_6 (Post_t T_i) + \beta_7 (T_i Post_t B_j) + \varepsilon_{ijt} \end{aligned}$$

$$\begin{aligned} \beta_7 = & \{E[Y|T = 1, B = 1, Post = 1] - E[Y|T = 1, B = 1, Post = 0] - \\ & E[Y|T = 0, B = 1, Post = 1] - E[Y|T = 0, B = 1, Post = 0]\} \\ - & \{E[Y|T = 1, B = 0, Post = 1] - E[Y|T = 1, B = 0, Post = 0] - \\ & E[Y|T = 0, B = 0, Post = 1] - E[Y|T = 0, B = 0, Post = 0]\} \end{aligned}$$

El sentido de la DDD

DDD as control

- Lo Podemos ver como un placebo DD
- El estimador DDD es la diferencia entre el DD verdadero y el placebo
- Sirve para convencer que 'las tendencias paralelas se cumplen

DDD to identify

- Agregamos una diferencia para poder cumplir con tendencias paralelas
- Ejemplo asesinado lideres sociales