# **README file for the Replication Package**

## "Design of Partial Population Experiments with an Application to Spillovers in Tax Compliance"

#### Data Availability Statement:

#### For confidentiality reasons, we cannot post any tax microdata used in the analysis.

How to access proprietary data. To access proprietary data, please contact the following employee:

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[A] README file lists all the **replication files** with a brief description of each  $\rightarrow$  we clearly indicate which programs correspond to what results in the paper.

[B] README file also contains a **data dictionary** that defines each variable and gives the data's provenance. "Dictionary.xlsx" defines each variable in the different databases used in the paper.

[C] README file identifies the **version of the software** used (by version number and/or release date) and similarly for the operating system on which the software runs.

- Stata 17 MP Parallel Edition for Windows (64-bit x86-64)
- R version 4.4.2 (2024-10-31 ucrt) -- "Pile of Leaves"
- RStudio 2024.09.1 Build 394 "Cranberry Hibiscus" Release (a1fe401f, 2024-11-03) for windows

### Replication files with a brief description of each:

Each line of the do-file is fully commented. We clearly indicate which programs correspond to what results in the paper.

- 1. **0\_master.do** main program that sets the working directory and executes the rest of the Stata codes described below.
  - This do-file sets the Stata command interpreter to **version 16**.
    - The R scripts must be manually run in R.
- 2. **1\_data\_baseline.do** Build baseline datasets for Power calculation and Randomization. Input file:
  - "Base 1 Cuenta Corriente por Cuenta 2019.dta" dataset with baseline monthly payments in the year 2019.

Output files:

- "data\_illustration.csv" used in R for Table 1. Restricted to street-blocks with more than 7 accounts per street-block.
- "data\_baseline.dta" dataset with baseline payments in the year 2019 restricted to blockstreets with 8-50 properties (requested by municipality).
- 3. **1\_assignment.do** randomization code with group-level and individual-level assignment. Input files:
  - "data\_baseline.dta" dataset with baseline payments in the year 2019.
  - Output file:
    - "randomization\_final.dta" data with the randomized Treatment and Control groups.
    - **Table A1** with sample sizes for the field experiment. Manually put into "tex" table.
    - **Table A2** with descriptive statistics in 2019 (baseline year). Manually put into "tex" table.
- 4. **1\_prepare\_db.do** prepares the working database to estimate the spillover and total effects. Input files:
  - "Base 1 Cuenta Corriente por Cuenta al 10Mar.dta" is the Main Data (with outcomes and covariates).
  - "randomization\_final.dta" data with the randomized Treatment and Control groups.
  - "Base total con datos imprenta.dta" data provided by the municipality with additional variables.
  - "BOLETAS DIGITALES (3).xlsx" flags a few Undelivered Letters.

Output file:

- "working\_data.dta" is the clean data we use for the regression analysis.
- 5. **1\_balance\_checks.do** balance check regression analysis comparing treatment and control. Input file:
  - o "working\_data.dta"

Output file:

- "saturated\_regressions\_balance.tex" (Table A3 in the appendix).
- 6. **1\_Figure\_1.do** Creates **Figure 1** of the paper: Distribution of cluster sizes in six partial population experiments.
- 7. **1\_Table\_A6.R** (note: script must be run in R) Creates **Table A6** of the paper. Standard errors and MDEs using the cluster size distribution of four studies. The code considers three values for the intraclass correlation (rho\_00). It must be manually changed to 0.1, 0.5, or 0.8.
- 8. **1\_Figure\_2.R** (note: script must be run in R) Creates **Figure 2** of the paper: Power functions numerical illustration.
- 9. **1\_Table\_1.R** (note: script must be run in R) Produces **Table 1** of the paper: Constrained and optimal cluster assignment probabilities and MDEs for our binary outcome of interest. Input file:
  - "data\_illustration.csv"

Output:

- Matrix "Results\_R": MDEs and restricted cluster probabilities (**Table 1**).
- Matrix "Results": MDEs and optimal cluster probabilities (**Table 1**).
- 10. **2\_analysis\_cuota10\_rawgraphs.do** Distribution of payment date by T vs C; Cumulative payment rate by calendar date.

Input file:

"working\_data.dta"

Output files:

- **Figure A5:** "payments-density1.pdf" and "payments-density2.pdf" Distribution of payment date for treated, untreated, and pure control.
- **Figure B6**. Payment rates: Treated groups vs Pure control blocks. Breaks treated units into subgroups.
  - Top panel "payment-rate-Oct2020-levels-treated-subgroups.pdf"
  - Bottom panel "payment-rate-Oct2020-TE-subgroups.pdf"
- **Figure B7**. Payment rates: Untreated groups vs Pure control blocks. Breaks untreated units into subgroups; pools treated units:
  - Top panel "payment-rate-Oct2020-levels-untreated123.pdf"
  - Bottom panel "payment-rate-Oct2020-TE.pdf"
- 11. **2\_analysis\_cuota10.do** estimates total and spillover effects for the intervention bill (October 2020) and a pre-intervention bill (September 2020).

Input file:

o "working\_data.dta"

Output files:

- Figures B.15, B.16 and B.17 "share\_Nbills\_indiv\_2019.pdf" "share\_compliance\_2019.pdf"
  "share\_compliance\_2018\_2019.pdf" "share\_compliance\_2018\_2020.pdf" and
  "share\_compliance\_transition.pdf"
- **Table 2** "saturated\_regressions\_REStat.tex"
- **Table A4** "saturated\_regressions\_REStat\_placebo.tex" Direct and spillover effects for the pre-intervention September 2020 bill. Pooling observations and splitting below and above median compliance in 2019.
- o Figure 3
  - Top panel: "payment-rate-diff-treated3-notitle.pdf" and "payment-rate-diffuntreated3-notitle.pdf"
  - Middle panel: "payment-rate-diff-treated3-abovep50-notitle.pdf" and "payment-rate-diff-untreated3-abovep50-notitle.pdf"
  - Bottom panel: "payment-rate-diff-treated3-belowp50-notitle.pdf" and "payment-rate-diff-untreated3-belowp50-notitle.pdf"
- **Figure B8**. Six figures in top, bottom, and middle panels: payment-rate-diff-treated1.pdf payment-rate-diff-treated2.pdf payment-rate-diff-treated3.pdf payment-rate-diffuntreated1.pdf payment-rate-diff-untreated2.pdf payment-rate-diff-untreated3.pdf
- 12. **2\_analysis\_cuota9.do** Produces the figures with the point estimates of total and spillover effects for the pre-intervention bill (September 2020). For Table A.4 see **2\_analysis\_cuota10.do.** Input file:
  - "working\_data.dta"

Output files:

- **Figure B.9** payment-rate-cuota9-diff-treated1.pdf payment-rate-cuota9-diff-treated2.pdf payment-rate-cuota9-diff-treated3.pdf payment-rate-cuota9-diff-untreated1.pdf payment-rate-cuota9-diff-untreated3.pdf
- 13. **3\_analysis\_paperless.do** Results for Section B.2.1 on subscription to electronic billing. Input files:

- o "suscripciones\_20210308.xlsx" Subscriptions to paperless electronic billing
- "randomization\_final.dta" data with the randomized Treatment and Control groups.
- "Base 1 Cuenta Corriente por Cuenta al 10Mar.dta" Merge with main data to get block-id for standard errors

Output files:

- **Figure B.10** subscription-rate-DiD-treated1.pdf subscription-rate-DiD-treated2.pdf subscription-rate-DiD-treated3.pdf subscription-rate-DiD-untreated1.pdf subscriptionrate-DiD-untreated2.pdf subscription-rate-DiD-untreated3.pdf
- **Table A.5** "saturated\_regressions\_ebill\_2.tex"
- 14. **3\_analysis\_bills.do** Results for Section B.2.2 on backward and forward payments (cancel past-due debt and improve payment likelihood of subsequent bills).

Input file:

"working\_data.dta"

Output files:

- **Figure B.11** Level-probpay.pdf Level-probpay-timely.pdf DinD-probpay.pdf DinD-probpay-timely.pdf
- 15. **4\_analysis\_cuota10\_buffer.do** Robustness check to analyze whether untreated blocks are affected by the intervention.

Input files:

- o "working\_data.dta"
- "cuadras\_buffers.dta" street-block-level database containing treatment intensity for buffers of 100, 200, 300 meters around the centroid of each street-block. Built by staff from the *Tres de Febrero* municipality using GIS tools.

Output files:

- Figure B.12.
  - Top panel: is an illustration.
  - Middle panel: Exposure distribution (share of treated units around pure control blocks). buffer\_share\_T100.pdf buffer\_share\_T200.pdf buffer\_share\_T300.pdf
  - Bottom panel: payment rates for pure controls as a function of exposure. buffer\_T0\_100.pdf buffer\_T0\_200.pdf buffer\_T0\_300.pdf
- Figure B.13. Payment rates and exposure of untreated blocks above and below median 2019 compliance, 100 meters buffer. buffer\_T0\_100\_pool.pdf buffer\_T0\_100\_abovep50.pdf buffer\_T0\_100\_belowp50.pdf
- Figure B.14. Payment rates and exposure of untreated blocks and blocks with 80% treated units, 100 meters buffer. buffer\_T0T3\_100.pdf buffer\_T0T3\_100\_aug.pdf
  buffer\_T0T3\_100\_jul.pdf buffer\_T0T3\_100\_jul.pdf

**Figure A.2. (map)** constructed by municipality employees using GIS tools and the data with randomized assignment "randomization\_final.dta".