# OPTIMAL ASSIGNMENT OF BUREAUCRATS: EVIDENCE FROM RANDOMLY ASSIGNED TAX COLLECTORS IN THE DRC

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 Assignment of workers to tasks and teams: important determinant of firm productivity (Mas-Moretti 2009, Bandiera et al 2010)

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#### Assignment: costless tool to increase performance?

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# Optimal Assignment of Tax Collectors in DRC

- Setting: 2018 property tax campaign in Kananga, DRC
- **Experiment**: two-stage random assignment
  - 1. 34 tax collectors to new two-person teams each month
  - 2. Collector teams to 180 neighborhoods (19,600 properties)

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  - 1. 34 tax collectors to new two-person teams each month
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#### Roadmap: we estimate

- 1. Household and collector type: local chief knowledge, observed performance
- 2. Expected tax compliance for each combination
  - Mechanism analysis using survey data
- 3. Optimal assignment: max compliance s.t. status quo constraints
- 4. Impact of optimal assignment compared to status quo assignment
- 5. Benchmarks: counterfactual selection policies

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# Kananga, D.R. Congo



- Fourth most populous city in the DRC
  - ▶ Population  $\approx$  1.6 million
- Median HH income:  $\approx$  \$106 (PPP \$168) per month



## A Weak State with Very Low Tax Revenue



Provincial tax revenue extremely low: <\$1 per person</p>



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  - Potentially easy to tax, efficient, rapid urbanization



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- Provincial tax revenue extremely low: <\$1 per person</p>
- Trying to raise revenue with property tax ( $\approx 29\%$  tax revenue  $\bigcirc$ ):
  - Potentially easy to tax, efficient, rapid urbanization
- First systematic property tax collection in 2016:
  - Door-to-door campaign by state agents
  - Low tax compliance: pprox 10% (Weigel 2020) Comparisons

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# Property Tax Details

Fixed annual fee – common in LICs w/o valuation roll Examples

- "Low value band" (90% of prop.): 3,000 FC ( $\approx$  2 USD)
- "High value band" (10% of prop.): 13,200 FC ( $\approx$  9 USD)



Low band (\$1,000 value)



High band (\$8,134 value)



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Delinquency: tax + fine (1.5x), court summons Sanctions
 Enforcement uncommon, but 52% think sanctions likely

# 2018 Property Tax Campaign Mechanics

- Two stages of door-to-door tax collection by teams of 2 collectors
  - 1. Property register of full neighborhood (no valuation roll)
    - Assess tax liability based on building material
    - Property owners receive a unique tax ID and a tax letter
  - 2. Tax visits: door-to-door tax appeals
    - Collectors use handheld printers to issue receipts to payers
    - Effort (number/timing of visits) and tactics to convince taxpayers at discretion of collectors

# Status Quo Collector Assignment

- Two-stage random assignment:
  - 1. Each month, teams of 2 randomly formed
  - 2. Teams randomly assigned to two neighborhoods for rest of month
  - Balance Tests: Chars. of prop., owner, and neighborhood Balance Tests

#### Median assignment load:

- 6 different teammates
- 12 different neighborhoods
- 1,524 properties

 Rationale: Avoid collusion (collector-collector, collector-household) (Brewer 1990, Bertrand et al 2020, Chu et al 2020)

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# Expected Tax Compliance by Type Combinations

- Collector type: "high" or "low" effectiveness
- Household type: "high" or "low" ability to pay
- "Match" is combination of types: e.g.,  $(c_1, c_2, hh) = (L, H, h)$
- Expected Tax Compliance: compliance one would expect to observe for a particular combination
  - Experiment provides estimate for each combination
  - Randomization ensures unbiased by other factors

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# **Optimal Assignment**

- Assignment function f: distribution of assignments across type combinations
- Optimal assignment function (f\*):
  - Distribution that maximizes compliance
  - I.e., how can we reshuffle assignments to achieve the highest compliance possible?
- Status quo constraints:
  - 1. Non-overlapping assignment: one team of coll. per household
  - 2. Workload constraint: nb of assignments by coll. type same as  $f^{SQ}$

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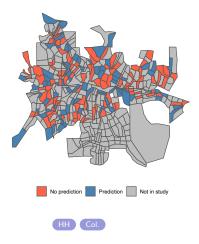
**Optimal Assignment** 

Conclusion



# Defining Household and Collector Types

- Household Types: Local Chief Predictions
  - Chief predicted ability to pay of each property owner
  - Low-type = "unlikely", High-type = "likely/very likely" to pay
- Collector Types: FE model + sample splitting
  - Collector's effectiveness across random assignments
  - Estimate in holdout sample to avoid overfitting



Estimating Compliance Function and Optimal Assignment

#### Average Compliance Function:

- Use observed data in analysis sample to estimate average compliance for each combination
- ▶ Five combinations: (*H*, *H*, *h*), (*L*, *H*, *h*), (*L*, *L*, *h*), (*H*, *H*, *l*), (*L*, *H*, *l*)

Omitted category is (L, L, I)

- Optimal Assignment Function:
  - ▶ Plug in estimates  $\hat{y}_{hnt}$  in optimal assignment pb and solve for  $f^*$

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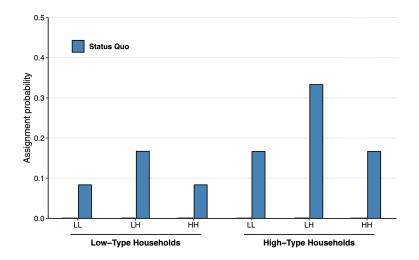
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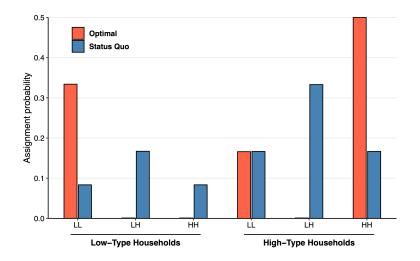
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# Characterizing the Optimal Assignment



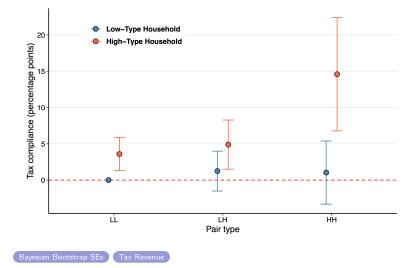
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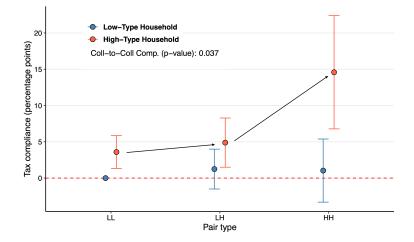
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# Tax Compliance by Collector and Household Type





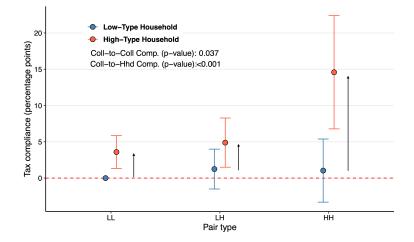
## Complementarities in Collector Type



Convex in collector type: H<sub>1</sub>: [Y(H, H, h) - Y(L, H, h)] - [Y(H, L, h) - Y(L, L, h)] > 0 (p=0.037)

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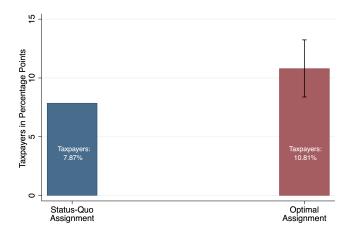
## Complementarities in Collector-Household Type



Convex in collector-household type: H<sub>1</sub>: [Y(H, H, h) - Y(L, L, h)] - [Y(H, H, l) - Y(L, L, l)] > 0 (p < 0.001)</p>

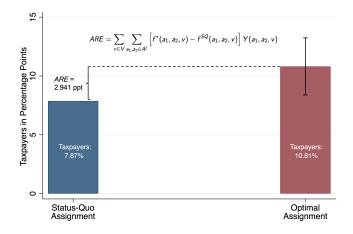
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Impacts of the Optimal Assignment



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Impacts of the Optimal Assignment



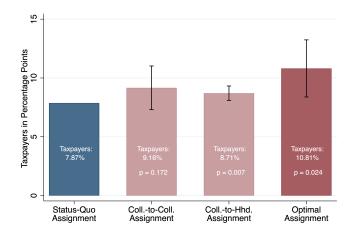
Implementing the optimal assignment would 

compliance by 37% 

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Impacts of the Optimal Assignment



Collector-household and collector-collector would contribute equally Table

# Mechanisms and Benchmarks

#### 1. What explains complementarities?

- × Collector skills: No compl. persuasion techniques
- $\checkmark\,$  Collector effort: Compl. in number of days hours spent collecting
  - Consistent with coordination problem: if either collector is late, both don't collect (e.g., O-Ring properties (Kremer 1993))

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#### 2. Benchmark policies Detail

- Reallocate 62% of  $c_L$  assignments to  $c_H$  to = optimal assignment
- Replacing c<sub>L</sub> cannot yield same gains
- Increase wages by 69%, but net revenue loss



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# Taking Stock on the Optimal Assignment of Collectors

- Field experiment studying the random assignment of tax collectors to neighborhoods and teammates
- Optimal assignment:
  - Assortative matching on collector type and collector-household type
  - Complementarities reflect c<sup>H</sup> exerting higher effort when matched with other c<sup>H</sup>, especially for h-type properties

#### Impact:

- ▶ Implementing the optimal assignment would ↑ compliance by 37%
- $\Rightarrow\,$  Bureaucrat assignment as a resource neutral policy to  $\uparrow$  fiscal capacity

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# Thank you!

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