One size does not fit all: A field experiment on the drivers of tax compliance and delivery methods in Rwanda

Giulia Mascagni

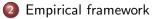
International Centre for Tax and Development (ICTD)

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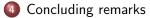
Maputo, 6<sup>th</sup> July 2017

## Outline









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# Background

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## Motivation

- Administrative data still under-utilised in LIC
- Few rigorous evaluations of tax policies and initiatives in LIC
- Very large literature on tax compliance, including field TE
- No large scale field tax experiment in Africa or in any LIC

Many questions remain unanswered:

- Do the standard results of this literature hold in low-income countries?
- Can simple nudges work to increase tax compliance in these contexts?
- How effective is deterrence when enforcement is severely limited?
- What is the best way to reach out to taxpayers?

## Main experiment: two research questions

## 1. Is deterrence as effective in LIC as in HIC and MIC?

 $\Rightarrow$  HP1: Friendly approaches are generally more effective than deterrence in nudging taxpayers to comply more  $\Rightarrow$  HP1b: Small taxpayers are more responsive to deterrence than large TE

 $\Rightarrow$  HP1b: Small taxpayers are more responsive to deterrence than large TP

## 2. What is the most effective way to reach taxpayers?

 $\Rightarrow$  HP2: Physical letters are more effective than SMS and emails to increase compliance

## What this paper does

- Implement a large scale field experiment (Feb-March 2016)
- Intervention: messages sent to TP by the RRA
- Outcome: tax liability as declared by TP
- Data: administrative data from taxpayer records
- Close collaboration with RRA

## What this paper does

- Implement a large scale field experiment (Feb-March 2016)
- Intervention: messages sent to TP by the RRA
- Outcome: tax liability as declared by TP
- Data: administrative data from taxpayer records
- Close collaboration with RRA

Part of a set of papers, also including:

- Review of TE literature (ICTD WP 46)
- ② Descriptive paper (ICTD WP 56)
- O Pilot experiment (ICTD WP 57)
- This paper (ICTD WP 58)
- Feedback paper on taxpayer reactions (ICTD WP 59)

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## Preview of key results

- Simple nudges increase tax compliance by about 20%
- Friendly approaches work better than deterrence
- Non-traditional methods of communication are highly effective
- One size does not fit all!
  - Small taxpayers react more to deterrence
  - Public service SMS is particularly effective

## **Empirical framework**

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## Research design

- Context: 15% tax ratio, public services, self-reliance
- 9 treatments interact contents and delivery methods
  - 3 contents: deterrence, public services, reminder
  - 3 delivery methods: letter, email, SMS
  - 1 no message control group
- All messages personalised, simple and translated in two languages
- Confidentiality of research project
- Letters and emails are identical
  - Sent through RRA official channels
  - Picture to make message clearer and more salient
  - Treatment changes two sentences in otherwise identical messages
- SMS
  - More concise, but same message
  - No picture
  - Sent twice during the filing period



#### TAXES FOR GROWTH AND DEVELOPMEN

Our Ref	003/PR/DCG/15
Your Ref	

Kigali, on 8 January 2016

### RE: Tax filing period open until 31st March 2016

#### Torte Database and the second

RRA would like to inform you that your CIT tax return is due by 31" March 2016. For more information about the filing process and payment methods, contact the call centre (3004) or visit the RRA website (http://www.ra.gov.rw).

We would like to thank you for your collaboration and wish you a prosperous year 2016.

## IMPAMVU: Itariki ntarengwa yo kumenyekanisha umusoro kunyungu ni 31 Werurwe 2016

## Kurl-

Higo cy<sup>1</sup> Imioro n<sup>3</sup> Armboo kirifuza kuhumenyesha ko kumoryekanisha umuzoro ku nyungo bikorona Niarazea Imirki ya 31 Weruwe 2016. Ku bishoanoo himnuye biyerekeye uhuryo bio kumoryekanisha na kwishyara umusoro ku nyungu, mwahamagara umurongo utishyurwa 3004 cyangwa mugasara urubuga rw<sup>3</sup> Ikigo cy<sup>3</sup> Imisoro n<sup>3</sup> Amaboo (RKA) (www.rm.gov.rw).

Tubashimiye ubufatanye mudahwema kutugaragariza, tuboneyeho no kubifuriza umwaka mushya muhire wa 2016, uzababere uw'uburumbuke.

Kind Regards/Murakoze

G. Mascagni (ICTD)

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BIZIMANA ISCCANINT WALI Pascal The Deputy Commissioner General & Commissioner for Corporate Services Komiseri mükust wangirife akaba na Komiseri w'imirimo rusange

> Telephone : +(250) 595 501 , 5 Fax: +(250) 595 750, 518 535 Website: www.rra.gov.rw

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Our size data



#### TAXES FOR GROWTH AND DEVELOPMEN

Our Ref .001/PR/DCG/15

Kigali, on 8 January 2016

Tottle

Your Ref :

Spending of tax of RWF 100 Uko Leta ikoresha amafaranga 100 y'umusoro



## RE: Pay taxes. Build Rwanda. Be proud

RRA would like to inform you that your CIT tax return is due by 31" March 2016. For more information about the filing process and payment methods, contact the call centre (3004) or visit the RRA webite (http://www.razov.rw).

By paying your taxes you make it possible to educate our children, fund our healthcare, and keep us safe.

Pay taxes, Build Rwanda, Be proud.

We would like to thank you for your collaboration and wish you a prosperous year 2016.

## IMPAMVU: Ishyura imisoro. Ubaka u Rwanda. Gira ishema

#### Kuri tana ang kana a

Higo cy<sup>2</sup> Imiaron n<sup>4</sup> Armboro kirifuza kubunenyesha ko kumenyekanisha umusero ku nyungu bikorna biteneze linstiki ya 31 Weruwe 2016. Ku kibabano bitenunye biyerekeye ukuryo bwo kumenyekanisha na kwishyara umuseoro ku nyungu, mwakamagara umuranga utishyurwa 3004 cyangwa mugasura umbuga rw<sup>3</sup> Kigo cy<sup>3</sup> Imiaro n<sup>4</sup> Amaboro (RKA) (www.rm.gov.rw).

Iyo wishyuye imisoro yawe, ushoboza abana kwiga, uba ushyigikiye ubuvuzi n'umutekano byacu.

Ishyura imisoro. Ubaka u Rwanda. Gira Ishema.

Tubashimiye ubufatanye mudahwema kutugaragariza, tuboneyeho no kubifuriza umwaka mushya muhire wa 2016, uzababere uw'uburumbuke.

Kind Regards/Murakoze

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Kimihurura, Avenue du lac Muha P.O Box 3587 Kigali, Rwanda HOTLINES 3004/3005 Telephone : +(250) 595 501 , 595712, 595541, 595600, 595665 Fax: +(250) 595 750, 518 535 Website: www.ma.gov.rw

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## **RWANDA REVENUE AUTHORITY** OFFICE RWANDAIS DES RECETTES

#### TAXES FOR GROWTH AND DEVELOPMEN

002/PR/DCG/15 Our Ref

Your Ref :.....



Kigali, on 8 January 2016

## RE: Pay your taxes on time and avoid fines and penalties

## To TRUNKING

RRA would like to inform you that your CIT tax return is due by 31<sup>st</sup> March 2016. For more information about the filing process and payment methods, contact the call centre (3004) or visit the RRA website (http://www.ma.gov.nw).

Do you know that if you do not declare and pay your taxes on time, RRA can fine and possibly prosecute you?

Pay your taxes on time and avoid fines and penalties.

We would like to thank you for your collaboration and wish you a prosperous year 2016.

#### IMPAMVU: Ishyura imisoro ku gihe, wirinde ibihano by'ubukererwe

## Kuri TETER

Bidgo cy<sup>2</sup> Imiono n' Anauhore kirifazus kubamanyetha ko kumoryekanisha umuzore ku nyungu bikorwa Naternae Jianki ka zi Jiwenze 2016. Ku kubahanuro hisminanye hyreckeye humoryo lwo kameryekanisha no kwishiyara umuzore ku nyungu, mwahamagara umurongo utishiyawa 3004 cyangwa magasura urubuga rw<sup>2</sup> Ikigo cy<sup>2</sup> Imiono n<sup>4</sup> Anahoro (RKA) (www.rm.gov.rw).

Wari uzi ko iyo utamenyekanishije ngo unishyure imisoro yawe ku gihe, RRA iguca ibihano by'ubukererwe ikaba yanagukurikirana mu nkiko?

Ishyura imisoro yawe ku gihe, wirinde ibihano by'ubukererwe.

Tubashimiye ubufatanye mudahwema kutugaragariza, tuboneyeho no kubifuriza umwaka mushya muhire wa 2016, uzibubere uw'uburumbuke.

Kind Regardy Murakoze

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Kimihurura, Avenue du lac Muhazi, P.O.Box 3987 Kigeli, Rwanda HOTLINES 3004/3005 Felephone - +(250) 595 501 , 595712, 595541, 595600, 595665 Fax: +(250) 595 750, 518 535 Metsile: www.rts.cov.cv.

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## Data and sample

Taxpayer-level administrative data from tax returns

- Unbalanced panel 2012-2015
- Focus on business taxes: CIT and PIT
- Financial variables: turnover, gross profits, tax liability
- Some firm characteristics: location, sector

Sample randomly allocated to 9 treatment groups:

- Registered in one of Kigali's tax centres
- Recently registered or using e-tax
- Contact information available

 $\Rightarrow$  Final sample: 3,000 PIT and 10,800 CIT taxpayers

## Randomisation

Stratified randomisation based on:

- Zero-tax taxpayers
- Regime
- No stratification on size, but balance OK for sub-group analysis

Balance on all variables: randomsation successful! (balance checks)

Implementation: more details

- Reduced sample due to early or late filers
- Delivery reports (LATE)

## Empirical strategy

$$\mathit{Tax}_i = lpha + \sum_{j=1}^9 eta_j \mathit{Treatment}_{ji} + \gamma \mathit{X}_i + \mu_i$$

- i = individual TP; j = treatment
- X = controls for Large (LTO), geographical location, zero-tax taxpayers in the previous year, lagged gross profit, interaction variable between the latter two
- Censoring of tax due at zero, many zero-tax TP  $\rightarrow$  two solutions:
  - 1 Tobit on full sample
  - OLS on restricted sample, excluding zero-tax TP
- Estimates of both ITT and LATE
- Spillovers

# Results

# ITT

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## ITT all 9 treatments

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
SMS public service	1,407,199.26***	-0.04***	3,544,368.63**	4,550,480.08***
	(153,442)	(0)	(1,292,235)	(1,036,797)
SMS deterrence	379,518.08	-0.03	-245,033.48	324,137.34
	(500,337)	(0)	(1,860,993)	(1,781,739)
SMS reminder	-15,902.13	0.00	1,241,134.24	2,331,515.56
	(240,477)	(0)	(2,763,019)	(2,840,454)
Letter public service	707,583.03	0.00	3,796,213.90	4,388,817.55
	(1,266,081)	(0)	(3,355,908)	(3,113,822)
Letter deterrence	634,482.54	-0.03*	1,231,126.13	903,638.99
	(739,065)	(0)	(1,959,400)	(2,053,014)
Letter reminder	1,119,430.64***	-0.02	5,809,435.63*	5,602,792.51*
	(426,378)	(0)	(2,817,386)	(3,089,071)
Email public service	345,458.48	-0.01	1,967,733.51	-783,095.80
	(1,126,076)	(0)	(1,723,669)	(2,332,100)
Email deterrence	430,401.07	-0.00	2,993,798.13**	3,697,592.20***
	(485,345)	(0)	(1,339,807)	(1,208,896)
Email reminder	2,664,015.28***	-0.04***	10,639,216.85**	9,308,465.76
	(898,269)	(0)	(4,964,584)	(5,432,401)
Observations	9096	9096	4053	4002
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## ITT Pooled treatments by content

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
Public service	823,187.26	-0.02	3,096,329.43	2,714,466.70
	(625,114)	(0)	(1,810,455)	(1,962,408)
Deterrence	481,613.28	-0.02	1,300,026.49	1,643,254.83*
	(529,090)	(0)	(843,973)	(928,069)
Reminder	1,273,011.31***	-0.02**	5,967,428.97**	5,726,421.86**
	(457,644)	(0)	(2,234,761)	(2,101,499)
Observations	9096	9096	4053	4002

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## ITT Pooled treatments by method

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
Email	1,166,352.28*	-0.02*	5,288,674.58*	4,072,925.37
	(676,493)	(0)	(2,623,881)	(2,855,417)
SMS	594,526.72***	-0.02***	1,521,214.71	2,400,533.44*
	(176,020)	(0)	(1,341,336)	(1,324,915)
Letter	823,157.22	-0.02	3,608,689.17*	3,645,078.22**
	(681,655)	(0)	(1,997,274)	(1,662,965)
Observations	9096	9096	4053	4002

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# LATE

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# LATE all 9 treatments

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
SMS public service	5,363,942.83***	-0.10***	3,569,631.66***	4,623,205.09***
	(322,324)	(0)	(858,448)	(970,625)
SMS deterrence	1,461,515.06	-0.07	-248,942.20	316,401.84
	(1,299,268)	(0)	(2,653,145)	(2,114,499)
SMS reminder	-94,180.98	0.00	1,228,229.79	2,319,468.48
	(1,092,264)	(0)	(1,764,621)	(2,400,879)
Letter public service	3,466,679.15	0.01	5,724,642.38	6,929,320.36
	(10,212,368)	(0)	(4,958,903)	(4,939,256)
Letter deterrence	4,834,456.11	-0.16	2,276,954.08	1,675,666.59
	(5,730,935)	(0)	(3,449,282)	(3,436,177)
Letter reminder	7,421,150.33***	-0.06	9,371,466.70***	9,326,503.16***
	(453,880)	(0)	(1,937,233)	(2,284,360)
Email public service	1,449,387.58	-0.04	2,218,042.05	-961,520.75
	(2,484,610)	(0)	(1,820,440)	(2,670,881)
Email deterrence	1,648,146.34	-0.00	3,027,511.72*	3,727,109.56***
	(2,113,767)	(0)	(1,642,372)	(1,198,950)
Email reminder	12,183,058.93***	-0.13***	12,695,332.35*	11,088,858.82*
	(4,278,392)	(0)	(6,954,886)	(6,303,194)
Observations	9096	9096	4053	4002

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## LATE Pooled treatments by content

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
Public service	3,592,740.45	-0.05	3,649,319.31	3,249,755.25
	(3,019,863)	(0)	(2,116,150)	(2,562,327)
Deterrence	2,231,539.12	-0.06	1,553,364.09**	1,954,857.40***
	(2,504,690)	(0)	(552,263)	(672,286)
Reminder	6,060,000.12***	-0.06***	7,306,421.44**	7,046,330.51**
	(2,131,204)	(0)	(2,825,984)	(2,619,055)
Observations	9096	9096	4053	4002

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## LATE Pooled treatments by method

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
SMS	2,267,910.69***	-0.06***	1,527,920.10***	2,414,571.87***
	(670,466)	(0)	(300,191)	(583,228)
Letter	5,376,106.00	-0.07	5,941,759.64**	6,173,069.90**
	(5,409,949)	(0)	(2,245,117)	(2,267,034)
Email	4,937,561.22	-0.06*	5,868,725.26*	4,488,731.19
	(2,892,354)	(0)	(3,353,987)	(3,197,734)
Observations	9096	9096	4053	4002

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## Recap of results so far

## Nudges work to increase compliance in Rwanda

- Overall revenue gain: about 9 million USD extra revenue
- About 20% increase in compliance
- Is Friendly approaches seem to be more effective than deterrence (HP1)
  - Simple reminders are highly effective
  - Public service SMS highly effective . . .
  - ... but public service letters and emails are not. Why?
- Less traditional delivery methods are a cost-effective and efficient way to reach out to a large number of TP (HP2)

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## Sub-group analysis

By size (CIT):

- Smaller taxpayers react more to deterrence ITT LATE
- SMS and emails are particularly effective for small taxpayers

By taxpayer type:

- PIT: deterrence effective in some specifications (but = reminder)
- Increase in compliance: CIT vs PIT
  - Proportionally more for PIT (25% vs 20%)
  - Larger revenue gains for CIT

By zero-tax status (CIT):

- Zero-tax: messages not particularly effective
- Non-zerotax: effect both on probability of tax>0 and amount

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## Robustness

- Include late filers, up to 15th April
- Include lagged tax due as a control
   ⇒ Results are qualitatively the same

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# Concluding remarks

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# Conclusions

- HP1: Friendly messages are generally more effective than deterrence in nudging taxpayers to comply more
- HP1b: Small taxpayers are more responsive to deterrence than large TP
- $\times\,$  HP2: Physical letters are more effective than SMS and emails to increase compliance

# Policy implications

- Illustrate the importance of rigorous evaluation in tax administration
- Effectiveness of 'modern' approach of customer orientation ...
   ... while a mix of strategies is still needed (STO vs LTO)
- Cheap delivery methods are highly effective and scaleable
- Not 'only' research
  - Collaboration and capacity building
  - $\bullet~$  Behavioural insights: personalisation of messages  $\rightarrow~$  new SMS platform
  - Recommendations on taxpayer registry, zero-tax TP, streamline communications

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## Open questions and next steps

- Learning or nudging? Long-term vs short-term effects
- Why are there so many nil filers? Avoidance vs de-registration
- Fiscal exchange or self-reliance? 'Public service' only works via SMS
- Would these results be replicable in other countries?

# Thank you

# Comments welcome!

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# Appendix

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## Balance tests: CIT

Variable:	(1) Real regime	(2) Zero tax due lagged	(3) Large and top-medium	(4) Gross profit lagged (in RWF)	(5) Tax due lagged (in RWF)
Public service SMS,	582	554	50	107,068,598	3,103,129
n=1059	(0.80)	(0.51)	(0.35)	(0.43)	(0.40)
Deterrence SMS, n=1060	584	569	60	81,875,720	1,123,349
	(0.77)	(1.00)	(1.00)	(0.93)	(0.48)
Control SMS, n=1060	579	561	52	119,193,622	5,765,544
	(0.93)	(0.74)	(0.46)	(0.30)	(0.42)
Public service letter,	575	551	64	156,819,023	13,758,779
n=1061	(0.93)	(0.41)	(0.73)	(0.21)	(0.46)
Deterrence letter, n=1060	580	562	55	64,544,598	1,187,699
	(0.90)	(0.77)	(0.65)	(0.90)	(0.75)
Control letter, n=1060	584	582	50	46,117,467	1,864,978
	(0.77)	(0.59)	(0.35)	(0.41)	(0.97)
Public service email,	585	558	56	64,118,771	3,807,057
n=1060	(0.74)	(0.62)	(0.72)	(0.98)	(0.55)
Deterrence email, n=1060	577	559	49	57,649,104	2,774,061
	(1.00)	(0.65)	(0.26)	(0.54)	(0.72)
Control email, n=1060	578	552	60	90,947,172	4,274,751
	(0.97)	(0.45)	(1.00)	(0.95)	(0.36)
Control group, n=1270	691	682	72	78,615,632	3,543,558

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## Balance tests: PIT

Variable:	(1) Real regime	(2) Zero tax due lagged	(3) Large and top-medium	(4) Gross profit lagged (in RWF)	(5) Tax due lagged (in RWF)
Public service SMS, n=1059	153 (0.90)	200	11 (0.69)	19,812,249 (0.88)	711,457
Deterrence SMS, n=1060	(0.90) 151 (1.00)	(0.99) 193 (0.91)	(0.09) 14 (1.00)	14,677,833	457,015 (0.78)
Control SMS, n=1060	151 (1.00)	193 (0.95)	16 (0.85)	23,327,287 (0.62)	782,983 (0.32)
Control group, n=699	151	191	14	18,594,594	523,102

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## Implementation

- RRA staff briefing: delivery and reactions
- Delivery reports for all methods ( $\Rightarrow$  LATE)
  - Letters: 53%
  - SMS: 97%
  - $\bullet\,$  Some uncertainty for emails, assume  $90\%\,$
- All messages sent in the first week of February
- Second round of SMS in mid-March
- Early filers: 3% CIT, 10% PIT
- Late / non filers: 13% CIT, 21% PIT
  - $\Rightarrow$  Reduced sample, but still balanced

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# Heterogeneous effects: Size

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## Small TP: ITT with pooled treatments

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
Public service	71,379.87	-0.02	203,365.12	172,870.61
	(59,433)	(0)	(177,688)	(120,017)
Deterrence	83,668.79***	-0.02	407,569.38**	357,160.02**
	(20,040)	(0)	(186,688)	(157,132)
Reminder	43,290.04**	-0.03***	52,280.38	131,003.18
	(18,589)	(0)	(97,069)	(97,238)
SMS	54,887.48***	-0.03**	118,409.71	111,039.64*
	(8,301)	(0)	(177,726)	(56,947)
Letter	46,600.14	-0.02	114,368.56*	183,386.51*
	(66,606)	(0)	(56,997)	(99,649)
Email	95,928.08***	-0.02	419,158.44***	356,433.71***
	(30,942)	(0)	(39,111)	(61,113)
Observations	7235	7235	2868	2676

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# Small TP: LATE with pooled treatments

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
Public service	355,797.54	-0.08	239,755.00	207,804.37
	(351,975)	(0)	(193,401)	(131,457)
Deterrence	432,246.03***	-0.06	493,886.59**	429,379.11***
	(142,495)	(0)	(226,570)	(60,142)
Reminder	220,853.18*	-0.09**	62.457.33***	159,859.57
	(116,540)	(0)	(10,577)	(123,960)
SMS	227.928.72***	-0.07**	119.255.32	111.100.10*
51015	(26,502)	(0)	(79,566)	(54,485)
Letter	327,406.42	-0.09	192,946.12***	319,229.06*
	(596,536)	(0)	(42,099)	(171,969)
Email	450,071.88**	-0.06	466,759.97***	392,770.36***
	(174,580)	(0)	(29,252)	(6,207)
Observations	7235	7235	2868	2676

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# Large TP: ITT with pooled treatments

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
Public service	3,749,856.48	0.01	12,578,287.45	11,410,608.19
	(2,930,759)	(0)	(7,739,032)	(8,512,742)
Deterrence	2,944,920.02*	-0.03	5,170,221.06	7,087,552.47
	(1,485,843)	(0)	(3,472,578)	(4,303,277)
Reminder	7,547,035.33**	0.01	26,220,209.94**	24,261,006.39**
	(3,033,921)	(0)	(10,744,791)	(10,095,785)
SMS	2.073.840.87	0.01	6.604.484.69	10.719.783.03
	(1,482,930)	(0)	(5,384,828)	(6,152,219)
Letter	4,499,963.34	-0.00	14,731,055.07	15,032,905.95**
	(3,409,729)	(0)	(8,687,894)	(6,912,178)
Email	7,722,691.94*	-0.01	22,151,693.86*	17,162,693.93
	(4,009,348)	(0)	(12,373,178)	(13,156,189)
Observations	1446	1446	913	949

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# Large TP: LATE with pooled treatments

	(1)	(2)	(3)	(4)
	Tobit	Part 1: probit	Part 2: OLS	Baseline tax>0
Public service	9,653,244.56	0.03	14,620,783.06	13,443,256.04
	(6,137,954)	(0)	(8,238,727)	(10,010,063)
Deterrence	8,048,031.68**	-0.09***	5,943,613.05*	8,335,491.97**
	(3,390,568)	(0)	(3,204,003)	(3,513,177)
Reminder	22,467,762.63***	0.04	32,299,017.73**	29,779,091.59**
	(5,880,489)	(0)	(13,150,904)	(10,714,815)
SMS	4,931,374.78**	0.02	6,685,501.76***	10,952,616.67***
	(2,026,196)	(0)	(1,887,814)	(3,314,231)
Letter	16,671,489.49***	0.00	22,675,553.20**	23,871,587.45***
	(4,651,086)	(0)	(9,093,498)	(8,201,630)
Email	20,157,511.72**	-0.05	24,440,671.27	19,036,376.94
	(8,677,631)	(0)	(14,088,796)	(13,136,948)
Observations	1446	1446	913	949

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