Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions References

Local-average games

- This paper considers a tax evasion game between n > 1 individuals and the tax authority, who seeks to maximize the aggregate fiscal revenues collected from individual tax payments.
- It is assumed that taxpayer communication happens truthfully and voluntarily (Andrei et al., 2014), and where individuals assimilate the **average** value of the new information received from their neighbors (Hokamp & Pickhardt, 2010).
- The presence of social interactions leads taxpayers to experience **peer effects** (Fortin et al., 2007; Alm et al., 2017).
- The **local-average** or linear-in-means model is the workhorse model in empirical work on peer effects (Blume et al., 2015; Kline & Tamer, 2019; Ushchev & Zenou, 2020).

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

Taxpayer network g

• Consider \mathcal{N} a set of n > 1 taxpayers which coexist in a connected network g, with a $n \times n$ adjacency matrix $\mathbf{H} = [h_{i,j}]$ with entries $\{0,1\}$, where $h_{i,j} = 1$ if and only if there is a direct connection between agents *i* and *j*; otherwise $h_{i,j} = 0$.

- The network is undirected and does not include any self-loops.
- We say two agents or taxpayers are 'neighbors' if they share a direct link between each other.
- Define $\mathbf{G} = [g_{i,j}]$ with entries $[g_{i,j}] \in [0,1]$ as the $n \times n$ rownormalized adjacency matrix obtained from diving each entry of matrix \mathbf{H} by the degree of node *i*. Hence, $[g_{i,j}] = [h_{i,j}]/N_i$, where N_i represents the node-degree of taxpayer *i*.
 - One can interpret the value of $[g_{i,j}]$ as the *influence* which agent *j* exerts on agent *i*, in the sense of Degroot (1974).

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

Local-average games: utility function

 Local-average games (Blume et al., 2015; Kline & Tamer, 2019) have a linear-quadratic utility function of the form:

$$U_i(x_i, \mathbf{x}_{-i}, \mathbf{g}) = \alpha_i x_i - \frac{1}{2} x_i^2 - \frac{\theta}{2} (x_i - \bar{x}_i)^2, \qquad (1)$$

- x_i is the outcome (e.g. tax payment) exerted by agent i,
- **x**_{-i} is the vector of outcomes exerted by all other players,
- g is the social network,
- *α_i* > 0 is an individual *productivity* parameter,
- θ is the social interaction effect which measures an agent's reaction to the average outcome of its neighbors (e.g. alla romana).
- x
 _i is the individual-specific social norm, defined as the average outcome exerted by agent i's neighbors weighted by the influence exerted by each player j ≠ i on taxpayer i. Namely:

$$\bar{x}_i = \sum_{j=1}^n g_{ij} x_j.$$
(2)

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Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

A quick look from the taxpayer's perspective

• Assume a taxpayer's value function (or expected utility) is:

$$V = \hat{p} \cdot \upsilon(audited) + (1 - \hat{p}) \cdot \upsilon(not_audited).$$
(3)

 The generalized taxpayer's problem is to maximize the value function V in terms of the payoffs v of being audited or not:

$$\max_{\substack{\{d\}}} V(\hat{p}, d, I, \tau, \phi, \cdot) \tag{4}$$

where agents optimize only over the declared income d. Notice that the subjective audit rate \hat{p} is endogenous; while income, taxes, penalties and most other parameters are exogenous.

- A higher perceived audit rate, *ceteris paribus*, would induce taxpayers to be more compliant (Casal & Mittone, 2016).
 - Optimal d is (weakly) increasing with respect to \hat{p} .
 - Hence, tax payments $(x_i) \propto$ declared income $(d_i) \propto \hat{p}_i$.

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

Mathematically equivalent problems

Define individual tax payments as $x_i := d_i l_t \tau$

- *d_i* is the individual fraction of income disclosed,
- *I_i* is the taxpayer's exogenous given income,
- *τ* is the societal tax rate (flat or stepped).

Claim (1)

From the point of view of the tax authority, in a local-average game, the two problems are mathematically equivalent:

$$\operatorname{argmax}_{\{\mathcal{A}\}} \mathbf{e}^{ op} \mathbf{x} = \operatorname{argmax}_{\{\mathcal{A}\}} rac{1}{n} \mathbf{e}^{ op} \hat{\mathbf{p}},$$

where A is the set of possible actions of the tax authority (e.g. audit probabilities, sequence of audits, targeted audits, etc.).

 $\mathbf{x} := (x_1, x_2, ..., x_n)^\top \in \mathbb{R}^n_+$ is the vector of tax payments and $\hat{\mathbf{p}} := (\hat{p}_1, \hat{p}_2, ..., \hat{p}_n)^\top$ is the vector of subjective audit rates of all players in network g, and $\mathbf{e} \in \mathbb{R}^n$ is a column-vector of ones.

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions References

Local-average games: Nash Equilibrium

• We redefine the local-average game in terms of \hat{p}_i as:

$$U_i(\hat{p}_i, \hat{\mathbf{p}}_{-i}, \mathbf{g}) = \alpha_i \hat{p}_i - \frac{1}{2} \hat{p}_i^2 - \frac{1}{2} \left(\frac{\lambda}{1-\lambda} \right) (\hat{p}_i - \bar{\hat{p}}_i)^2, \quad (5)$$

• where
$$heta=rac{\lambda}{1-\lambda}$$
 and $0<\lambda<1$

• The best-reply function for each taxpayer *i* is given by:

$$\hat{p}_i = (1 - \lambda)\alpha_i + \lambda \bar{\hat{p}}_i,$$
 (6)

Proposition (1)

Solving for $\hat{\mathbf{p}}$ the Nash Equilibrium ($\hat{\mathbf{p}}^*$) is defined by:

$$\hat{\mathbf{p}}^* = (1 - \lambda) [\mathbf{I} - \lambda \mathbf{G}]^{-1} \boldsymbol{\alpha}.$$

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Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

Local-average games: Heterogeneity

Proposition (2)

The matrix $\mathbf{M} := (1 - \lambda)[\mathbf{I} - \lambda \mathbf{G}]^{-1}$ is well-defined and rownormalized for any $\lambda \in (0, 1)$. Hence one has: $\hat{\mathbf{p}}^* = \mathbf{M}\alpha$.

Proposition (3)

Since **G** is a row-normalized adjacency matrix, the Nash Equilibrium exists, is unique and is interior for any $\lambda \in (0, 1)$.

Claim (2)

If individuals are ex ante homogeneous, that is if $\alpha_i = \alpha_j$ for all $\{i, j\} \in \{1, 2, ..., n\}$, then the aggregate and individual Nash Equilibrium outcome levels will be independent of the network structure, rendering network-based policies useless.

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation

Conclusions

References

Threat-to-audit message

• Threat-to-audit messages can affect taxpayer behavior (Boning et al., 2018; Lopez-Luzuriaga & Scartascini, 2019).

Tax authority's message:

Dear citizen,

A new audit regime is in place. Last year the societal audit probability was of p and equal for all taxpayers. As of now, the probability of being audited will be proportional to the income level of each taxpayer. Hence, the individual-specific audit rate for each taxpayer i is now defined as:

$$p_i = p \cdot \frac{l_i}{\sum_{j=1}^n l_j} \cdot n, \tag{7}$$

where p is the homogeneous true audit rate from last year, l_i denotes the gross earned income of taxpayer i, n is the total number of individuals in the society, and $p_i \in [0, 1]$ for all $i \in \{1, 2, ..., n\}$.

• The average and aggregate probabilities have not changed, just shifted.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions
- References

Ensuring taxpayer productivity heterogeneity

- Following the threat-to-audit message, taxpayers compute their income heterogeneity with respect to society.
- Let α_i be determined by an agent's income divided by the average income of all the agents in the network. The value of such individual-specific heterogeneity level α_i is defined as:

$$\alpha_i = \frac{I_i}{\sum_{j=1}^n I_j} \cdot n \tag{8}$$

- The interpretation of α_i would be a taxpayer's exogenous-given income productivity with respect to society.
 - E.g. if j's income is twice the average income level, then $a_j = 2$.
- Averaging on both sides, it is easy to see that the average and aggregate productivity in the network have not been modified.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions References

Subjective probability of being audited

- Individual belief dynamics in tax compliance are strongly path-dependent with respect to the average past behavior of other players (Alm et al., 2017; Gächter & Renner, 2018).
- In general, subjective audit rates may be affected by **three channels**: prior beliefs, empirical audit rates and the sociallylearned value of the audit rate in its neighborhood.
- In a dynamic framework, the endogenous and *post-message* heterogeneous subjective audit rates can be formulated as:

$$\hat{p}_{i,t+1} = \frac{1-\omega}{2}\hat{p}_{i,t} + \frac{1-\omega}{2}\frac{1}{m}\sum_{s=1}^{m}A_{i,t-s} + \omega(\alpha_i\bar{\hat{p}}_{i,t}), \quad (9)$$

where $\omega \in (0, 1)$ is the weight given to the newly acquired information, $A_{i,t-s} = 1$ if agent *i* was audited at time t-s and zero otherwise, and $\alpha_i > 0$ is the income productivity level.

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

First-best outcomes and restorations

• Local-average game first-best outcomes and restorations are well-defined (Ushchev & Zenou, 2020).

Proposition (4)

Given a local-average game as previously characterized, the first-best outcome, \hat{p}° , is a solution to:

$$\hat{\mathbf{p}} = (1 - \lambda)\boldsymbol{\alpha} + \lambda \mathbf{G} \hat{\mathbf{p}} + \lambda \mathbf{G}^{\top} (\mathbf{I} - \mathbf{G}) \hat{\mathbf{p}},$$

whose solution is unique, and it is given by:

$$\hat{\mathbf{p}}^{o} = \left[\mathbf{I} + rac{\lambda}{1-\lambda} (\mathbf{I} - \mathbf{G})^{ op} (\mathbf{I} - \mathbf{G})
ight]^{-1} lpha.$$

 The first-best outcome is expressed in function of the productivity (α), taste for conformity (λ) and network structure (G).

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

First-best outcomes and restorations

• When the players in a local-average game do not reach the firstbest equilibrium, the social planner (tax authority) may try to restore it by *subsidizing* or *taxing* specific individuals.

Proposition (5)

The first-best outcome is restored when the social planner endows agents with the following subsidy/tax per unit of effort:

$$\mathbf{S}^{o} = rac{\lambda}{1-\lambda} \mathbf{G}^{ op} (\mathbf{I} - \mathbf{G}) \hat{\mathbf{p}}^{o},$$

where the optimal per-effort subsidy for each agent i is:

$$S^o_i = rac{\lambda}{1-\lambda} \sum_{j
eq i} g_{ji} (\hat{p}^o_j - ar{\hat{p}}^o_j).$$

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Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusion

References

Maximizing the aggregate outcome

The objective of the tax authority is to audit the set of taxpayers, M ⊂ N, such that the global subjective audit probability is maximized, and constrained by a finite number of audits [np].

$$\max_{\{\mathcal{M}\subset\mathcal{N}\}} \quad \frac{1}{n} \sum_{i=1}^{n} \hat{p}_{i,t+1}(A_{i,t}, \mathbf{A}_{-i,t}, \cdot)$$

s.t. $A_{i,t} = 1 \iff i \in \mathcal{M},$
 $A_{i,t} = 0 \iff i \notin \mathcal{M},$
 $|\mathcal{M}| \leq \lfloor np \rfloor,$ (10)

where the individual subjective probability for all taxpayers at time t + 1 is dependent on whether they have been audited or not $(A_{i,t})$, and on who else was audited or not $(\mathbf{A}_{-i,t})$.

 The solution of the tax authority's problem is to compute the vector of optimal individual subsidies (S^o_i) and to audit the [np] taxpayers with the maximal individual subsidy values.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing
- Taxpayer simulation Strategical outcomes
- Conclusions
- References

Taxpayer simulation

- Let us define a **dynamic game** in a taxpayer network with social interactions. First, agents and society are characterized and the social network is built. Then, the tax authority emits a message to incentive tax compliance.
- Each period, agents disclose a share of their income, may or may not be audited, and then exchange information with their neighbors and update their subjective audit rates.

Step	Description
Step 1	Agents (taxpayers) are parameterized.
Step 2	The social network is built.
Step 3	The tax authority emits a threat-to-audit message.
Step 4	Agents hold social interactions and share information.
Step 5	Agents choose their optimal declared income.
Step 6	The tax authority applies its optimal audit strategy.
Loop	Go back to <i>Step 4</i> .

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message

Model testing

- Taxpayer simulation Strategical outcomes
- Conclusions
- References

Taxpayer characterization

 Social networks of tax evasion consider homophily behavior and cohesive relations among individuals (Andrei et al., 2014; Gamannossi degl'Innocenti & Rablen, 2020). That is, taxpayers tend to form links with peers who are akin to them and with whom they share similar traits and characteristics.

Parameter	Exog.	Endog.	Societal	Individual
<i>I</i> : Earned income	Х			Х
au: Tax rate	X		Х	
ϕ : Penalty rate	X		Х	
<i>m</i> : Fiscal memory length	X		Х	
n: Number of taxpayers	X		Х	
ω : Weighting parameter	X		Х	
θ : Taste for conformity	Х		Х	
<i>p</i> : True audit rate	X		Х	
\hat{p} : Subjective audit rate		Х		Х
d: Declared income		Х		X
q: Global subjective audit rate		Х	Х	

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Taxpayer simulatio

Strategical outcomes

Conclusions

References

Comparing audit strategies: convergence levels

• The proposed *Subsidy* strategy secured the highest average **convergence level** over 100 simulations per audit scheme.

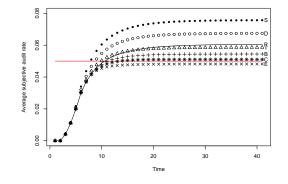


Figure: Convergence level of the global subjective audit rate for different audit schemes: *Subsidy* (S), *Degree* (D), *Random* (R), *Intercentrality* (I), *Betweenness* (B), *Closeness* (C) and *Eigencentrality* (E).

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation

Strategical outcomes

Conclusion

References

Comparing audit strategies: outcome distributions

• The proposed *Subsidy* strategy obtained the highest convergence level **distribution** of the global (average) subjective audit rate at a 0.001% confidence level.

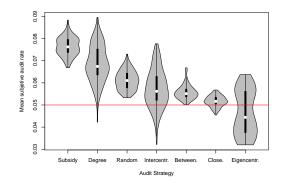
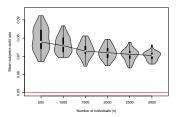


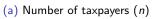
Figure: Distributions of the convergence levels of the global subjective audit rate for diverse audit strategies.

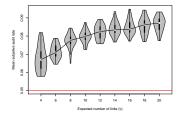
Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Constant and
- References

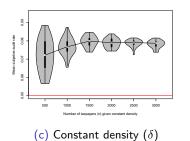
Testing parameter effects

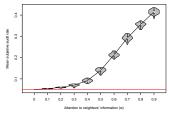






(b) Expected node-degree (μ)





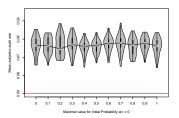
(d) Attention to neighbors (ω)

26

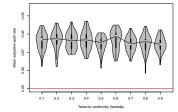
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- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Constructions
- References

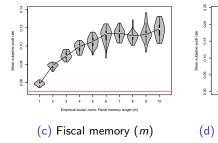
Assessing robustness

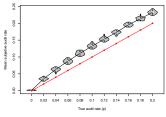


(a) Initial subjective audit rate



(b) Taste for conformity (λ)





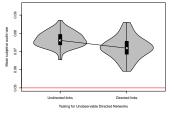
(d) Societal true audit rate (p)

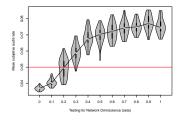
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- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions References

Model extensions

- The proposed audit scheme would outperform random auditing and most policies if at least **35%** of the links would be known.
- The tax authority could fully enforce the proposed optimal audit strategy if at least **70%** of the links would be known.





(a) What if the tax authority can- (not observe link directions?

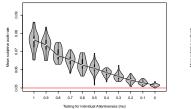
(b) What if the tax authority's omniscience is limited?

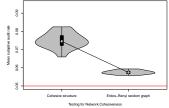
Figure: Which would be the cost of discovering all taxpayer links?

- Fernando Garcia Alvarado
- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions
- References

Limitations of network-based strategies

- If taxpayers do not pay attention to the *threat-to-audit message* they will not be *post-message* heterogeneous (α_i = α_j).
- If the taxpayer network lacks all cohesiveness, the strategy would be useless. Fortunately, social networks are cohesive (McPherson et al., 2001; Moody, 2001; Currarini et al., 2009).





(a) Attention placed to the threat-to-audit message

(b) Cohesive and non-cohesive taxpayer networks

Figure: Graphical representation of the two model limitations.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

Policy implications and concluding remarks

- This paper proposes a two-step game-theoretic optimal audit strategy from the point of view of the tax authority.
 - First step: Credible threat-to-audit message.
 - Second step: Network-based audit policy.
- **1** The proposed enforcement regime targets taxpayers in function of their *productivity* and their position in the network.
- 2 To the best of my knowledge, it is the first audit strategy that is robust to individual and societal parameters, such as:
 - Number of taxpayers, network density, true audit rates...
 - Taxpayer heterogeneity: attentiveness, memory, endogenous *p*.
 - Expected and Non-expected utility theories.
 - Invariant to any plausible utility and payoff functions.
- Otwithstanding, the costs and plausibility of observing a given fraction of taxpayer links remain open questions.

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

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Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions
- References

References I

- Allingham, M. G., & Sandmo, A. (1972). Income tax evasion: A theoretical analysis. Journal of Public Economics, 1(3-4), 323–338.
- Alm, J., Bloomquist, K. M., & McKee, M. (2017). When you know your neighbour pays taxes: Information, peer effects and tax compliance. *Fiscal Studies*, 38, 587–613.
- Alm, J., Jackson, B., & McKee, M. (1992). Estimating the determinants of taxpayer compliance with experimental data. *National Tax Journal*, 45(1), 107–14.
- Alm, J., Jackson, B. R., & McKee, M. (2009). Getting the word out: Enforcement information dissemination and compliance behavior. *Journal of Public Economics*, 93(3-4), 392–402.
- Alm, J., Mcclelland, G., & Schulze, W. (1992). Why do people pay taxes? Journal of Public Economics, 48, 21–38.
- Andrei, A. L., Comer, K., & Koehler, M. (2014). An agent-based model of network effects on tax compliance and evasion. *Journal of Economic Psychology*, 40(C), 119–133.
- Andreoni, J., Feinstein, J., & Erard, B. (1998). Tax compliance. Journal of Economic Literature, 36, 818–860.
- Ashby, J., Webley, P., & Haslam, S. (2009). The role of occupational taxpaying cultures in taxpaying behaviour and attitudes. *Journal of Economic Psychology*, 30, 216–227.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Taxpayer simulation Strategical outcomes
- Conclusions
- References

References II

- Bernasconi, M., & Zanardi, A. (2004). Tax evasion, tax rates, and reference dependence. *FinanzArchiv*, 60(3), 422–445.
- Bloomquist, K. (2004). Multi-agent based simulation of the deterrent effects of taxpayer audits. *Proceedings. Annual Conference on Taxation and Minutes of the Annual Meeting of the National Tax Association, 97.*
- Blume, L. E., Brock, W. A., Durlauf, S. N., & Jayaraman, R. (2015). Linear social interactions models. *Journal of Political Economy*, 123(2), 444–496.
- Boning, W. C., Guyton, J., Hodge, R. H., Slemrod, J., & Troiano, U. (2018). Heard it through the grapevine: Direct and network effects of a tax enforcement field experiment (NBER Working Papers). National Bureau of Economic Research, Inc.
- Calimani, S., & Pellizzari, P. (2014). Tax enforcement in an agent-based model with endogenous audits (Lecture Notes in Economics and Mathematical Systems: Artificial Economics and Self Organization No. 669). Springer, Cham.
- Casal, S., & Mittone, L. (2016). Social esteem versus social stigma: The role of anonymity in an income reporting game. *Journal of Economic Behavior & Organization*, 124(C), 55–66.
- Currarini, S., Jackson, M., & Pin, P. (2009). An economic model of friendship: Homophily, minorities, and segregation. *Econometrica*, 77(4), 1003–1045.
- Davis, J., Hecht, G., & Perkins, J. (2003). Social behaviors, enforcement, and tax compliance dynamics. *The Accounting Review*, *78*, 39–69.

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Model testing Taxpayer simulation Strategical outcomes

Conclusions

References

References III

- Degroot, M. H. (1974). Reaching a consensus. Journal of the American Statistical Association, 69(345), 118–121.
- Drago, F., Mengel, F., & Traxler, C. (2020). Compliance behavior in networks: Evidence from a field experiment. American Economic Journal: Applied Economics, 12(2), 96–133.
- Fortin, B., Lacroix, G., & Villeval, M. C. (2007). Tax evasion and social interactions. *Journal of Public Economics*, 91(11-12), 2089–2112.
- Galbiati, R., & Zanella, G. (2012). The tax evasion social multiplier: Evidence from Italy. *Journal of Public Economics*, 96(5), 485–494.
- Gamannossi degl'Innocenti, D., & Rablen, M. D. (2020). Tax evasion on a social network. *Journal of Economic Behavior & Organization*, 169(C), 79–91.
- Gächter, S., & Renner, E. (2018). Leaders as role models and 'belief managers' in social dilemmas. *Journal of Economic Behavior & Organization*, 154.
- Hashimzade, N., Myles, G., Page, F., & Rablen, M. (2015). The use of agentbased modelling to investigate tax compliance. *Economics of Governance*, 16(2), 143–164.
- Hashimzade, N., Myles, G., & Rablen, M. (2016). Predictive analytics and the targeting of audits. *Journal of Economic Behavior and Organization*, 124(C), 130–145.
- Hashimzade, N., Myles, G. D., Page, F., & Rablen, M. D. (2014). Social networks and occupational choice: The endogenous formation of attitudes and beliefs about tax compliance. *Journal of Economic Psychology*, 40(C), 134–146.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions
- References

References IV

- Hokamp, S., & Pickhardt, M. (2010). Income tax evasion in a society of heterogeneous agents - Evidence from an agent-based model. *International Economic Journal*, 24(4), 541–553.
- Kleven, H. J., Knudsen, M. B., Kreiner, C., Pedersen, S., & Saez, E. (2011). Unwilling or unable to cheat? Evidence from a tax audit experiment in Denmark. *Econometrica*, 79(3), 651–692.
- Kline, B., & Tamer, E. (2019). Econometric analysis of models with social interactions. In B. Graham & A. De Paula (Eds.), *The econometric analysis of network data* (p. Forthcoming). Elsevier, Amsterdam.
- Korobow, A., Johnson, C., & Axtell, R. (2007). An agent–based model of tax compliance with social networks. *National Tax Journal*, *60*(3), 589–610.
- Kukk, M., Paulus, A., & Staehr, K. (2020). Cheating in Europe: Underreporting of self-employment income in comparative perspective. *International Tax and Public Finance*, 27(2), 363–390.
- Lopez-Luzuriaga, A., & Scartascini, C. (2019). Compliance spillovers across taxes: The role of penalties and detection. *Journal of Economic Behavior & Organization*, 164(C), 518–534.
- McPherson, M., Smith-Lovin, L., & Cook, J. (2001, 01). Birds of a feather: Homophily in social networks. *Annual Review of Sociology*, *27*, 415–444.
- Mittone, L. (2006). Dynamic behaviour in tax evasion: An experimental approach. Journal of Behavioral and Experimental Economics (formerly The Journal of Socio-Economics), 35(5), 813–835.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions

References

References V

- Mittone, L., & Patelli, P. (2000). Imitative behaviour in tax evasion (Economic simulations in swarm: Agent-based modelling and object oriented programming).
- Moody, J. (2001, 11). Race, school integration, and friendship segregation in America. *American Journal of Sociology*, 107, 679–716.
- Myles, G., & Naylor, R. (1996). A model of tax evasion with group conformity and social customs. *European Journal of Political Economy*, 12(1), 49–66.
- Onu, D., & Oats, L. (2015). "Paying tax is part of life": Social norms and social influence in tax communications. *Journal of Economic Behavior & Organization*, 124.
- Ostrom, E. (2000). Collective action and the evolution of social norms. *Journal of Economic Perspectives*, 14, 137–158.
- Pellizzari, P., & Rizzi, D. (2014). Citizenship and power in an agent-based model of tax compliance with public expenditure. *Journal of Economic Psychology*, 40(C), 35–48.
- Phillips, M. D. (2014). Deterrence vs. gamesmanship: Taxpayer response to targeted audits and endogenous penalties. *Journal of Economic Behavior & Organization*, 100(C), 81–98.
- Pomeranz, D. (2015). No taxation without information: Deterrence and selfenforcement in the Value Added Tax. American Economic Review, 105(8), 2539–2569.

Fernando Garcia Alvarado

- Background Introduction Literature review
- Theoretic model Local-average games Threat-to-audit message
- Model testing Taxpayer simulation Strategical outcomes
- Conclusions
- References

References VI

- Prinz, A., Muehlbacher, S., & Kirchler, E. (2014). The slippery slope framework on tax compliance: An attempt to formalization. *Journal of Economic Psychology*, 40(C), 20–34.
- Riedel, N., Strohmaier, K., & Lediga, C. (2019). Spatial tax enforcement spillovers: Evidence from South Africa (Annual Conference 2019 (Leipzig): 30 Years after the Fall of the Berlin Wall Democracy and Market Economy). Verein für Socialpolitik / German Economic Association.
- Scartascini, C., & Castro, L. (2015). Tax compliance and enforcement in the pampas evidence from a field experiment. *Journal of Economic Behavior & Organization*, 116, 65—82.
- Slemrod, J., Blumenthal, M., & Christian, C. (2001). Taxpayer response to an increased probability of audit: Evidence from a controlled experiment in Minnesota. *Journal of Public Economics*, 79(3), 455–483.
- Srinivasan, T. (1973). Tax evasion: A model. *Journal of Public Economics*, 2(4), 339–346.
- Stalans, L., Kinsey, K., & Smith, K. (2006). Listening to different voices: Formation of sanction beliefs and taxpaying norms. *Journal of Applied Social Psychology*, 21, 119–138.
- Ushchev, P., & Zenou, Y. (2020). Social norms in networks. *Journal of Economic Theory*, 185.
- Yaniv, G. (1999). Tax compliance and advance tax payments: A prospect theory analysis. *National Tax Journal*, *52*(4), 753–764.

Fernando Garcia Alvarado

Background Introduction Literature review

Theoretic model Local-average games Threat-to-audit message

Taxpayer simulation Strategical outcomes

Conclusions

References

References VII

Yitzhaki, S. (1974). Income tax evasion: A theoretical analysis. *Journal of Public Economics*, *3*(2), 201–202.

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