

Impact of the GST on Corporate Tax Evasion: Evidence from Indian Tax Records

Sumit Agarwal

NUS

Shashwat Alok

ISB

Shiv Dixit

ISB

Tejaswi Velayudhan

UC Irvine

[AEA Annual Meeting](#)

January 8, 2023

MOTIVATION

- Large literature shows third-party reporting (TPR) increases tax collections.
 - ▶ Primarily focused on developed countries which are capital intensive, where input costs are verifiable.

Does the conventional wisdom apply to developing economies where employment tends to be informal and hard to verify?

- In Ecuador, TPR increased reported costs by 96 cents per dollar of revenue adjustment (Carrillo et al., 2017).
 - ▶ Identification Challenge: Hard to know if this is due to evasion shifting or endogenous production responses.
- This paper: We propose a novel technique to detect cost overreporting and apply it to Indian data to show that firms overreport non-verifiable expenses (eg. wages of informal workers) in response to an increase in TPR.

Institutional Setting

PREDOMINANCE OF HIGH CORPORATE TAXATION

Statutory corporate tax rates in India are among the highest in the world.

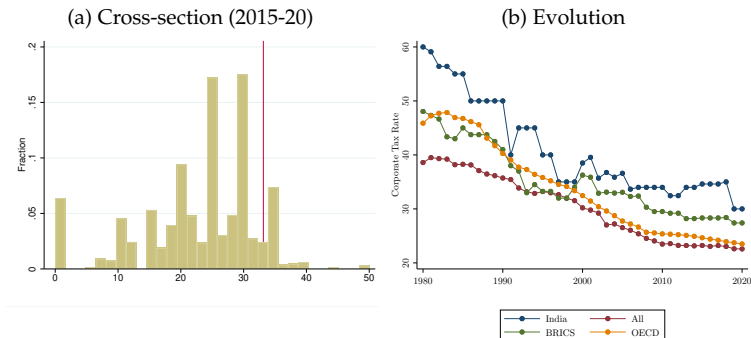


Figure: Statutory Corporate Tax Rates

Source: Tax Foundation Database.

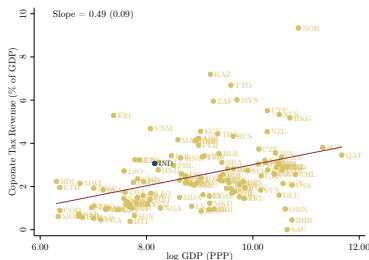
High corporate tax rate \implies high return on evasion

PREVALENCE OF FINANCIAL STATEMENT FRAUD

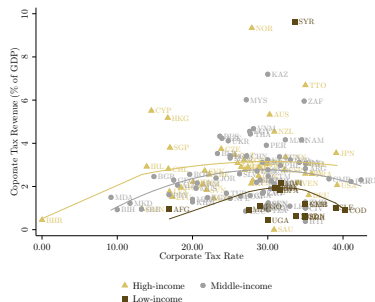
- Survey evidence suggests that financial statement fraud is pervasive in India, whereby a substantial amount of firms hide sales or inflate expenses, often via ghost employees and fictitious contracts.
- Deloitte India Fraud survey:
 - ▶ In their large companies survey, 10% of the respondents experienced financial misreporting over the last two years.
 - ▶ In the small and medium companies survey, 21% of survey respondents experienced financial misreporting over the previous two years.
 - ▶ In their working professionals survey, 40% of the respondents suspected their organization had experienced financial statement fraud.

PREVALENCE OF FINANCIAL STATEMENT FRAUD

(a) Tax Revenues on GDP



(b) Tax Revenues on Tax Rates



Source: Tax Foundation Database, UNU-WIDER Government Revenue Dataset, World Bank World Development Indicators Database.

Notes: Observations reflect averages over the period 2000-2015. Countries with less than one million in population are excluded. In panel (b), we estimate Laffer curves (across income groups according to the World Bank classification) by fitting a fractional polynomial of degree two.

RECENT DEVELOPMENTS IN THE INDIRECT TAX REGIME

- In 2017, India replaced its fragmented indirect tax structure with a nationwide Goods and Services Tax (GST).
- In the previous system:
 - ▶ Companies were paying taxes at different production stages and were also being taxed separately by various government authorities.
 - ▶ Did not permit input tax credits for several taxes.
- Under the new regime:
 - ▶ All state and central taxes were subsumed under a single system.
 - ▶ Taxpayer reports were verified against third-party information using invoice-matching.
 - ▶ Registered firms were required to routinely self-declare details of all outward supplies made, input tax credit claimed, tax liability ascertained, and taxes paid.

These changes made intermediate good transactions easier to verify.

- Administrative tax records from the Ministry of Corporate Affairs (MCA), Government of India
 - ▶ Random sample of all registered companies in India.
 - ▶ Ranges from 2015 to 2020.
 - ▶ Covers 21,538 firms.
 - ▶ Stock Data: Breakdown of balance sheet positions.
 - ▶ Flow Data: Breakdown of profit & loss accounts.
- Supplement with data from the Annual Survey of Industries (ASI)

Part 1: Impact of the GST on Reported Revenues and Costs

IMPACT OF THE GST ON REPORTED REVENUES AND COSTS

Finding 1: Reported revenues and costs both increased due to GST

DD Strategy: Compare the response of firms who supplied goods that were exempt from GST to those that were not.

$$y_{i,t} = \beta \text{GST}_{i,t} + \phi_i + \psi_t + \epsilon_{i,t},$$

where

$$\text{GST}_{i,t} = \mathbb{1}_{p_i \in \text{Non-exempted goods}} \times \mathbb{1}_{r_{i,t} > \text{INR 20 lakhs}} \times \mathbb{1}_{t > 2017}$$

Here i denotes a firm; t denotes the tax filing year; p_i denotes the HSN code of the product supplied by firm i ; $r_{i,t}$ denotes the revenue of firm i in period t ; $y_{i,t}$ denotes outcome variables for firm i in period t ; ϕ_i denotes firm fixed effects; and ψ_t denotes year fixed effects.

► Parallel Trends Assumption

IMPACT OF THE GST ON REPORTED REVENUES AND COSTS

Table: Effect of Treatment on Firm Revenues and Costs

Sample of firms	Full sample		Truncated sample	
Outcome variable	log(Revenue)	log(Expenses)	log(Revenue)	log(Expenses)
GST	1.403*** (0.0701)	0.986*** (0.0525)	2.451*** (0.411)	1.944*** (0.352)
Firm FE	Y	Y	Y	Y
Year FE	Y	Y	Y	Y
Observations	85842	86866	81799	81793

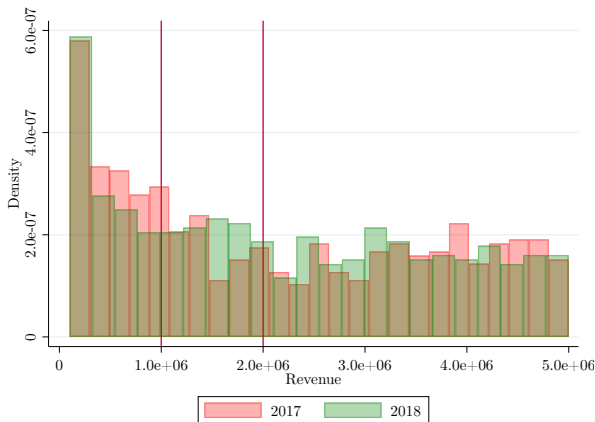
Notes: In the truncated sample, we exclude observations satisfying $r_{i,t} < \text{INR } 20 \text{ lakhs}$ and $p_i \in \text{Non-exempted goods}$ and observations satisfying $r_{i,t} \geq \text{INR } 20 \text{ lakhs}$ and $p_i \in \text{Exempted goods}$.

- GST increased reported revenues and expenses.
 - Is this due to increased production efficiency or greater tax compliance?
- To ascertain the effect of the GST on tax compliance, we focus on two margins of financial statement fraud: revenue underreporting and cost overreporting.

Part 2: Revenue Underreporting

REVENUE UNDERREPORTING

Finding 2: Revenue underreporting decreased after the GST was implemented



Notes: We restrict attention to firms with revenues above INR 1 lakhs and below INR 50 lakhs. The VAT exemption threshold was changed from INR 10 lakhs to INR 20 lakhs under the new tax regime.

REVENUE UNDERREPORTING

We follow Saez (2010), Kleven and Waseem (2013), and Chetty et al. (2011) to formally measure the extent of revenue underreporting.

We estimate the counterfactual density by fitting a p degree polynomial, excluding observations in a range $[r_L, r_U]$ around the exemption threshold T :

$$c_j = \sum_{i=0}^p \beta_i (r_j)^i + \sum_{i=r_L}^{r_U} \gamma_i \mathbb{1}[r_j = i] + \epsilon_j.$$

The excess number of firms who locate near the kink relative to the counterfactual density is given by $B = \sum_{j=r_L}^{r_H} (c_j - \hat{c}_j)$, where $\hat{c}_j = \sum_{i=0}^p \hat{\beta}_i (r_j)^i$ denotes the estimated counterfactual density.

The excess mass is $b = \frac{B}{\sum_{j=r_L}^{r_H} \hat{c}_j / (r_H - r_L)}$.

REVENUE UNDERREPORTING

(a) $t \leq 2017, \bar{r} = \text{INR } 10\text{L}$ (b) $t \leq 2017, \bar{r} = \text{INR } 20\text{L}$ (c) $t > 2017, \bar{r} = \text{INR } 20\text{L}$

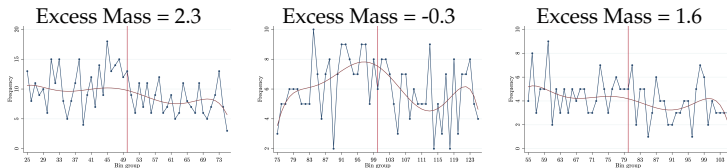


Figure: Revenue Bunching at GST Exemption Thresholds

Notes: These figures show the revenue distribution around the GST exemption (demarcated by the vertical red lines) for firms between 2015-2019. The series shown in dots is a histogram of revenues. Each point shows the number of observations in a INR 20,000 bin for panels (a) and (b), and a INR 25,000 bin for panel (c). The solid line beneath the empirical distribution is a sixth-degree polynomial fitted to the empirical distribution excluding 25 bins above and below the cutoff. Leftmost (rightmost) bin in bunching windows is 6 (1) bins below (above) the bunch point. Firms with revenues below INR 1 lakh and above INR 50 lakhs are discarded. In panel (a), we consider observations on or before 2017 around the threshold of INR 10 lakhs. In panel (b), we consider observations on or before 2017 around the threshold of INR 20 lakhs. In panel (c), we consider observations after 2017 around the threshold of INR 20 lakhs.

Part 3: Cost Overreporting

COST OVERREPORTING

Finding 3: Cost overreporting increased after the implementation of GST.

Constant Input Shares under Full Verification

There is a continuum of firms, indexed by i . Firm i can access the following technology

$$F_i(\{x_{ij}\}) \equiv z_i \prod_j (x_{ij})^{\alpha_{ij}},$$

where x_{ij} denotes input j of firm i , $\alpha_{ij} > 0 \forall j$ and $\sum_j \alpha_{ij} \leq 1$.

We focus on equilibrium outcomes where there is free entry and exit due to which firms earn zero profits:

$$z_i \prod_j (x_{ij})^{\alpha_{ij}} - \sum_j w_j x_{ij} = 0 \quad \forall i.$$

Proposition

If $\alpha_{ij} = \alpha_j \forall i$ and inputs are verifiable, then reported expenditure shares of inputs are independent of revenues.

Discontinuities in Reported Input Shares under Partial Verification

The optimal cost reporting decision of a firm can be derived as the solution to the following problem:

$$\min_{\hat{c}^n} \mathbb{1}(r \geq c^v + \hat{c}^n) \tau (r - c^v - \hat{c}^n) + \chi \mathbb{P}(r \geq T) (\hat{c}^n - c^n)^2 / 2,$$

where r denotes the revenue of the firm; \hat{c}^n denotes reported non-verifiable costs; c^v and c^n denote verifiable and non-verifiable input costs, respectively; τ captures the corporate tax rate; and T denotes the GST exemption threshold.

Proposition

Suppose a positive fraction of inputs is non-verifiable, and the fraud detection probability is sufficiently high and increasing in revenues. Then the reported expenditure share of non-verifiable inputs is

- (i) increasing in revenues below the GST exemption threshold,
- (ii) exhibits a negative jump at the threshold, and
- (iii) decreasing in revenues above the threshold.

COST OVERREPORTING

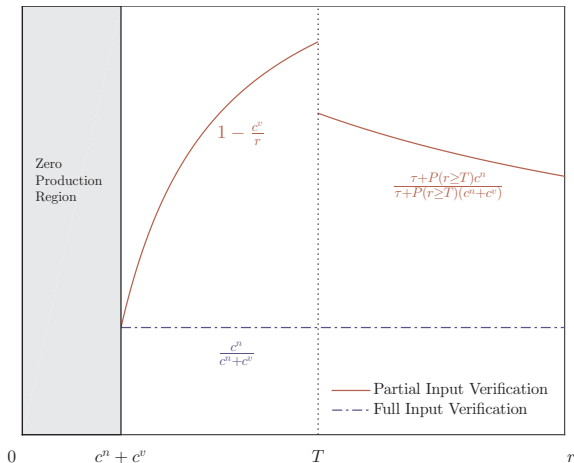


Figure: Reported Input Shares as a Function of Revenues

Notes: We assume $P(r \geq T) = r/\bar{r}$ and use the following parameterization for the numerical illustration: $(c^n, c^v, T, \tau, \bar{r}) = (0.1, 0.4, 1.5, 0.5, 3)$.

COST OVERREPORTING

Empirical Strategy (Sharp RD Design)

We construct a score for the treatment as follows:

$$s_{i,t} \equiv \begin{cases} r_{i,t} - \text{INR 10 lakhs} & t \leq 2017 \\ r_{i,t} - \text{INR 20 lakhs} & t > 2017 \end{cases}.$$

We consider the following specification for estimating the RD treatment effect:

$$y_{i,t} = \alpha + \beta \mathbb{1}(s_{i,t} \geq 0) + f(r_{i,t}) + \epsilon_{i,t} \quad \forall r_{i,t} \in (0, \text{INR 50 lakhs}),$$

where $y_{i,t}$ is the outcome variable (i.e., non-verifiable expense ratio) and f is continuous function.

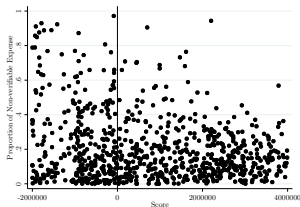
Main identifying assumption: production technologies of firms with revenues around the exemption thresholds are similar, barring differences in productivity, i.e.,

$$\alpha_{ij} = \alpha_j \quad \forall i : r_{i,t} \in (0, \text{INR 50 lakhs}) \quad \forall t.$$

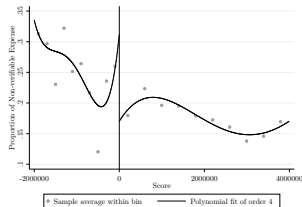
COST OVERREPORTING

RD Results

(a) Scatterplot








(b) RD Plot



Sample of firms Sample period	Full sample		Non-exempted firms	
	2017-18	2015-20	2017-18	2015-20
Panel A: Excluding covariates				
RD estimate	-0.11784** (0.05407)	-0.04573 (0.03104)	-0.1185** (0.05438)	-0.0486 (0.03133)
Panel B: Including covariates				
RD estimate	-0.11225** (0.0523)	-0.02982 (0.03405)	-0.11411** (0.05257)	-.03578 (0.03324)

Notes: To compute the RD estimates, we use a linear estimator with a triangular kernel and MSE-optimal bandwidth. Standard errors are reported in parenthesis and are clustered at the firm level. * $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

Validity of the RD Design

- No discontinuity of the score density was detected using tests of Cattaneo et al. (2017) and McCrary (2008). 
- No evidence of discontinuous jumps in covariates at the cutoff. 
- Results not sensitive to observations near exemption threshold. 
- Placebo Tests:
 - ▶ Alternative exemption thresholds render insignificant RD estimates. 
 - ▶ No discontinuity in verifiable expense ratios at the exemption threshold. 

COST OVERREPORTING

Evidence on the Mechanism

- Exploit variation in the visibility of intermediate inputs relative to labor inputs.
- Inputs of firms procuring from out-of-state were being monitored at state borders prior to GST, but not immediately after.
 - ⇒ Net increase in the monitoring of intermediate goods was smaller for these firms
 - ⇒ These firms have a lower incentive to inflate labor costs than other firms

Table: Heterogeneity in RD Estimates (by Out-of-state Input Procurement)

Sample period	<u>Post-GST</u>		<u>Pre-GST</u>	
Sample of firms	High OPR	Low OPR	High OPR	Low OPR
RD estimate	0.10754	-0.28084**	-0.00281	0.84957
	(0.14725)	(0.14217)	(0.05847)	(0.58084)
	[122]	[153]	[126]	[186]

Notes: High (low) out-of-state input procurement ratio (OPR) refers to the subsample of firms with OPR greater than or equal to (less than) mean values. To compute the RD estimates, we use a linear estimator with a triangular kernel and MSE-optimal bandwidth. Standard errors are clustered at the firm level. Observations are reported in square brackets. * $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

COST OVERREPORTING

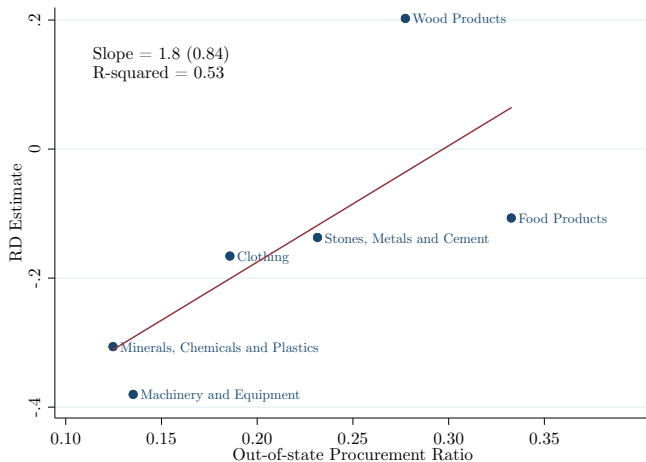


Figure: Variation in RD estimates by Out-of-state Input Procurement

Heterogeneity

Our baseline results are driven by labor-intensive firms, which seems natural since wages comprise a substantial share of such firms' expenses, so there is more room to evade.

Table: Heterogeneity in RD Estimates (by Industry and Factor Intensity)

Sample of firms	All	<u>by industry</u>		<u>by factor intensity</u>	
		Service providers	Non-service providers	Labor-int. firms	Capital-int. firms
RD estimate	-0.11784** (0.05407) [804]	-0.12772** (0.06012) [672]	0.17855 (0.29219) [132]	-0.14471* (0.07836) [514]	-0.02016 (0.05398) [290]

Notes: Service providers are classified under heading numbers above 9900 as per the NPCS. Capital-intensive firms are firms that a ratio of the cost of materials to total expenses above average; labor-intensive firms are the residual. To compute the RD estimates, we use a linear estimator with a triangular kernel and MSE-optimal bandwidth. Standard errors are reported in parenthesis and are clustered at the firm level. Observations are reported in square brackets. * $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

Implications for large firms?

Estimating the Level of Cost Overreporting

We compute the level of cost overreporting by

$$\Omega(c^v, c^n, \chi, \tau, T; P) \equiv \int_{c^n+c^v}^T (r - c^v) dr + \int_T^{\bar{r}} \left\{ \frac{\tau}{\chi \mathbb{P}(r \geq T)} + c^n \right\} dr - (\bar{r} - c^n - c^v) c^n,$$

To estimate Ω , we use Generalized Method of Moments (GMM). Specifically, we first estimate firm expenses, $\{c^n, c^v\}$, and the penalty parameter, χ , using

$$(c^{n*}, c^{v*}, \chi^*) \in \operatorname{argmin}_{(c^n, c^v, \chi) \in \mathbb{R}_+^3} \mathcal{D}(c^n, c^v, \chi \mid \tau, T)' W \mathcal{D}(c^n, c^v, \chi \mid \tau, T),$$

where W is a weighting matrix, and the i^{th} entry of \mathcal{D} is given by

$$\mathcal{D}_i(c^n, c^v, \chi \mid \tau, T) \equiv \begin{cases} 1 - \frac{c^v}{\hat{r}_i} - \frac{\hat{c}_i^n}{\hat{c}_i^n + \hat{c}_i^v} & \text{if } \hat{r}_i < T \\ \frac{\tau + \chi \mathbb{P}(\hat{r}_i \geq T) c^n}{\tau + \chi \mathbb{P}(\hat{r}_i \geq T)(c^n + c^v)} - \frac{\hat{c}_i^n}{\hat{c}_i^n + \hat{c}_i^v} & \text{if } \hat{r}_i \geq T \end{cases},$$

COST OVERREPORTING

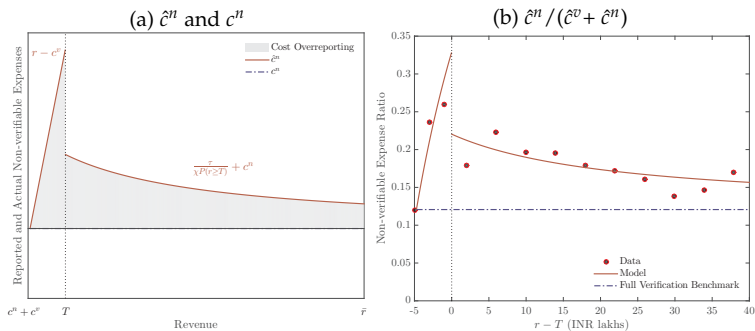


Figure: Estimating the Level of Cost Overreporting

The above procedure suggests costs were overreported by 7.9% during 2017-18.

Endogenous Production Responses

In our baseline model of cost overreporting, firms' production decisions are divorced from their evasion decisions.

Relaxing this assumption and assuming $\mathbb{P}(r \geq T) = r/\bar{r}$, the problem of a firm with productivity $z \in \mathcal{Z}$ is to choose verifiable and non-verifiable inputs, $\{x_v, x_n\}$, and report non-verifiable costs, $\{\hat{c}^n\}$, to maximize:

$$\underbrace{zx_v^{\alpha_v} x_n^{\alpha_n} - w_v x_v - w_n x_n}_{\text{Profits}} - \underbrace{\tau [zx_v^{\alpha_v} x_n^{\alpha_n} - w_v x_v - \hat{c}^n]}_{\text{Tax Liability}} - \underbrace{\mathbb{1}(r \geq T) \chi z x_v^{\alpha_v} x_n^{\alpha_n} (\hat{c}^n - w_n x_n)^2 / (2\bar{r})}_{\text{Evasion Costs}}.$$

COST OVERREPORTING

Assuming that z is uniformly distributed, the model endogenously generates a revenue distribution.

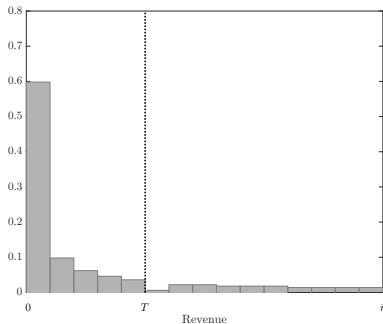


Figure: Simulated Distribution of Revenues

This relaxes the uniformity assumption we made in our baseline model of cost overreporting.

COST OVERREPORTING

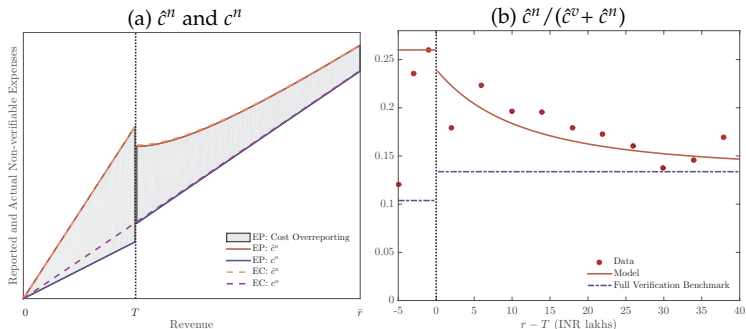


Figure: Estimating the Level of Cost Overreporting under Endogenous Production

Notes: Panel (a) contrasts non-verifiable costs in the model featuring endogenous production responses (EP) with those in the model where only the cost structure is endogenous (EC).

The estimated level of cost overreporting here is 9.2%, which is larger than our baseline estimate.

Counterfactual Experiments

PARTIAL TAX DEDUCTIBILITY OF COSTS

Note that firms overreport costs precisely because they are tax deductible.

Can a reduction in the tax deductibility of costs reduce evasion?

Following Best et al. (2015) and Basri et al. (2021), we assume that proportion μ of costs are deductible from taxes. The firms' objective is given by

$$\mathbb{1}(r \geq c^v + \hat{c}^n) \tau(r - \mu[c^v + \hat{c}^n]) + \chi \mathbb{P}(r \geq T)(\hat{c}^n - c^n)^2/2.$$

- Our benchmark estimation assumes $\mu = 1$, a pure, nondistortionary profit tax akin to that implemented in India.
- A pure output tax can be captured by $\mu = 0$.
- When $0 < \mu < 1$, costs are only partially tax deductible.

PARTIAL TAX DEDUCTIBILITY OF COSTS

We can express the non-verifiable expense ratio as

$$\frac{\hat{c}^n}{\hat{c}^n + c^v} = \begin{cases} 1 - \frac{\mu c^v}{r} & \text{if } r < T \\ \frac{\mu\tau + \chi\mathbb{P}(r \geq T)c^v}{\mu\tau + \chi\mathbb{P}(r \geq T)(c^n + c^v)} & \text{if } r \geq T \end{cases}.$$

Reducing the tax deductibility of costs induces firms to inflate non-verifiable expenses by more below the tax exemption threshold, i.e.,

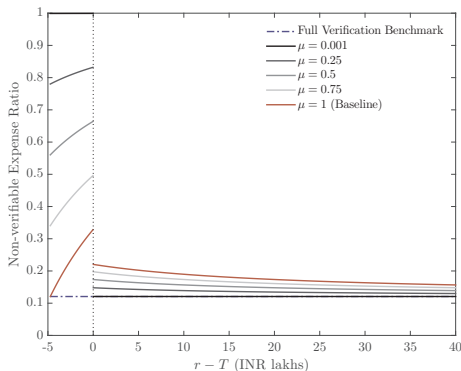
$$\frac{\partial \left\{ \frac{\hat{c}^n}{\hat{c}^n + c^v} \mid r < T \right\}}{\partial \mu} < 0,$$

and by less above the tax exemption threshold. i.e.,

$$\frac{\partial \left\{ \frac{\hat{c}^n}{\hat{c}^n + c^v} \mid r \geq T \right\}}{\partial \mu} > 0.$$

PARTIAL TAX DEDUCTIBILITY OF COSTS

The estimated rise in cost overreporting by firms below the exemption threshold outweighs the reduction in cost overreporting by firms above the threshold.



μ	0.001	0.25	0.5	0.75	1
$\frac{\Omega(c^{V*}, c^{H*}, \chi^*, \tau, T, \mu; P)}{(\bar{r} - c^{H*} - c^{V*})(c^{H*} + c^{V*})}$	122.2216	0.3990	0.1701	0.1042	0.0791

PARTIAL TAX DEDUCTIBILITY OF COSTS

Policy Implications:

- Diamond and Mirrlees (1971) show that when tax enforcement is perfect, production efficiency can be achieved while taxing profits but not turnover.
- Best et al. (2015) argue that Diamond and Mirrlees' prescription is ill-suited to settings with limited tax capacity.
 - ▶ In economies with large informal sectors, moving toward a turnover tax may be desirable because it lowers evasion.
 - ▶ An implicit assumption in Best et al. (2015): All firms are audited with positive probability.
- In our setting, which features an enforcement notch, moving toward a turnover tax can increase aggregate evasion.

TAX RATES VS. ENFORCEMENT INTENSITY

Corporate tax revenue (CTR) raised from firms generating revenue below \bar{r} is given by

$$\text{CTR} = \int_0^{\bar{r}} \tau(r - \hat{c}^n - c^v) dr.$$

Two ways of increasing CTR:

1. Increase the tax rate (τ)
2. Increase enforcement intensity (χ), i.e., higher staff-to-taxpayer ratio

The optimal policy depends on difference between $\mathcal{E}_{\text{CTR},\tau}$ and $\mathcal{E}_{\text{CTR},\chi}$.

To focus on evasion responses, we assume for this exercise that the revenue distribution is uniform and inelastic to the tax rate.

TAX RATES VS. ENFORCEMENT INTENSITY

Elasticity of CTR with respect to the tax rate:

$$\mathcal{E}_{\text{CTR},\tau} = \frac{\partial \text{CTR}}{\partial \tau} \times \frac{\tau}{\text{CTR}} = \frac{\tau[(\bar{r} + T)/2 - 2\tau/(\mathbb{P}(r \geq T)\chi) - c^n - c^v]}{(\bar{r} + T)/2 - \tau/(\mathbb{P}(r \geq T)\chi) - c^n - c^v}.$$

Since $\tau \in [0, 1]$, $\mathcal{E}_{\text{CTR},\tau} \leq 1$.

- As the tax rate increase, so does the return to evasion, and the tax base endogenously falls.

Elasticity of CTR with respect to enforcement intensity:

$$\mathcal{E}_{\text{CTR},\chi} = \frac{\partial \text{CTR}}{\partial \chi} \times \frac{\chi}{\text{CTR}} = \frac{\tau}{[(\bar{r} + T)/2 - c^n - c^v]\chi\mathbb{P}(r \geq T) - \tau}.$$

- If $\chi \in \left\{ \frac{\tau}{\mathbb{P}(r \geq T)[(\bar{r} + T)/2 - c^n - c^v]}, \frac{2\tau}{\mathbb{P}(r \geq T)[(\bar{r} + T)/2 - c^n - c^v]} \right\}$, then

$$\mathcal{E}_{\text{CTR},\chi} > 1 > \mathcal{E}_{\text{CTR},\tau} > 0.$$

- If χ is large enough, then $\mathcal{E}_{\text{CTR},\chi} < \mathcal{E}_{\text{CTR},\tau}$.

TAX RATES VS. ENFORCEMENT INTENSITY

As our GMM estimate for the enforcement intensity parameter (χ) is large \implies increasing the tax rate by 1% has a larger impact on CTR than increasing the enforcement intensity by 1%.

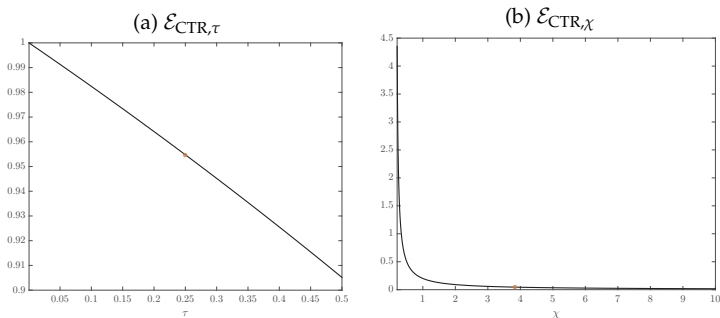


Figure: Elasticities of Corporate Tax Revenue

CONCLUSION

- This paper highlights the limitations of TPR in curbing corporate tax evasion in developing countries.
- Using an administrative dataset of corporate tax returns of Indian firms over the period 2015-2020, we obtain three main results:
 1. Firms reported higher revenues and costs after the implementation of GST.
 2. Much of the increase in reported revenue was due to reduced income underreporting.
 3. The regime change prompted labor-intensive firms to shift toward overreporting their wage bills that were relatively harder to verify.
- Our methodological innovation is to use variation in the relative visibility of specific inputs to detect the presence of cost overreporting.

Appendix

PARALLEL TRENDS ASSUMPTION FOR DD DESIGN

$$y_{i,t} = \sum_{l=-3}^0 \beta_l \text{GST}_{i,t}(t = 2018 + l) + \phi_i + \psi_t + \epsilon_{i,t}.$$

A test of the parallel trends assumption is $\beta_l = 0 \forall l < 0$.

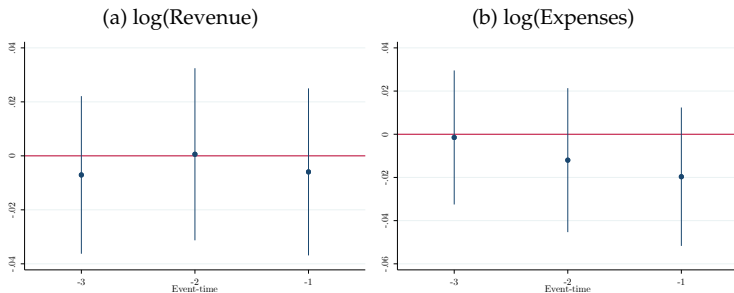


Figure: Testing the Parallel Trend Assumption

CONTINUITY OF THE SCORE DENSITY

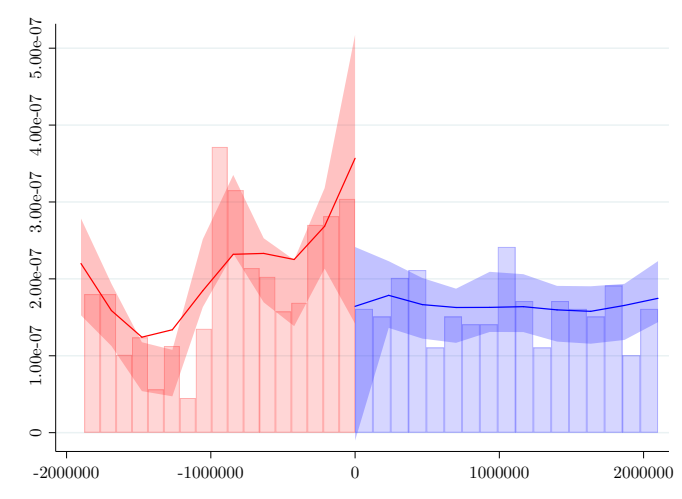


Figure: Estimated Density of Running Variable

COVARIATE BALANCE

Table: Testing Balance of Covariates around GST Exemption Thresholds

Variable	Optimal Bandwidth	RD Estimator	p-value	Confidence Interval
Panel A: MSE-optimal bandwidth				
Total assets	7.91×10^5	67.82	0.354	[-92.98, 259.90]
Borrowings	3.88×10^5	-111.72	0.846	[-1110.22, 1354.81]
Equity	6.52×10^5	-51.89	0.561	[-213.03, 115.52]
Cash	3.73×10^5	404.79	0.346	[-2405.13, 6857.65]
Panel B: CER-optimal bandwidth				
Total assets	2.71×10^5	181.28	0.438	[-1761.30, 4068.60]
Borrowings	2.81×10^5	-460.03	0.424	[-1162.55, 489.21]
Equity	4.73×10^5	-60.41	0.569	[-260.92, 143.54]
Cash	5.74×10^5	93.41	0.348	[-110.63, 314.20]

Notes: All variables are denominated in INR Crore. To compute the RD estimates, we use a linear estimator with a triangular kernel. Standard errors are reported in parenthesis and are clustered at the firm level.

SENSITIVITY TO OBSERVATIONS NEAR THE EXEMPTION THRESHOLD

We exclude observations with $|r_{i,t}| < \Lambda$ and recompute MSE-optimal bandwidths for $\Lambda \in \{5000, 10000, 15000\}$.

Table: RD Estimation for the Donut-Hole Approach

Donut Hole Radius (in INR)	0	5000	10000	15000
RD estimate	-0.11784** (0.05407) [804]	-0.11844** (0.05906) [803]	-0.12252* (0.06646) [800]	-0.13009* (0.06905) [799]

Notes: To compute the RD estimates, we use a linear estimator with a triangular kernel and MSE-optimal bandwidth. Standard errors are reported in parenthesis and are clustered at the firm level. Observations are reported in square brackets. * $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

PLACEBO TEST 1: ALTERNATIVE EXEMPTION THRESHOLDS

- Examine discontinuity in the non-verifiable expense ratio at the INR 20 lakhs cutoff for the pre-GST period, and at the INR 10 lakhs cutoff for the post-GST period.
- Since the tax exemption thresholds were revised from INR 10 lakhs to INR 20 lakhs under the GST, we should not see any discontinuous pattern at the respective cutoffs for these placebo outcomes.

Table: Placebo Tests: Alternative Exemption Thresholds

Sample period	Pre-GST	Post-GST
Running variable	$r_{i,t} - \text{INR 20 lakhs}$	$r_{i,t} - \text{INR 10 lakhs}$
RD estimate	-0.04156 (0.06463) [1451]	0.11846 (0.17682) [643]

Notes: To compute the RD estimates, we use a linear estimator with a triangular kernel and MSE-optimal bandwidth. Standard errors are clustered at the firm level. Observations are reported in square brackets. * $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$

PLACEBO TEST 2: VERIFIABLE EXPENSE RATIOS

No discontinuity in the share of verifiable expenses at the tax exemption thresholds.

Table: Placebo Tests: Share of Verifiable Expenses

	Cost of Materials	Power and Fuel Costs	Finance Cost	Insurance Expenses	Auditing Expenses
RD estimate	0.04216 (0.10593) [788]	0.06197 (0.04357) [755]	-0.03953 (0.03769) [805]	0.00309 (0.00277) [755]	0.00027 (0.00254) [755]

Notes: To compute the RD estimates, we use a linear estimator with a triangular kernel and MSE-optimal bandwidth.

Standard errors are clustered at the firm level. Observations are reported in square brackets.* $p < 0.10$, ** $p < 0.05$,

*** $p < 0.01$

► Back