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Estimating bargaining-related tax advantages of multinational firms[☆]Peter H. Egger^a, Nora M. Strecker^{b,*}, Benedikt Zoller-Rydzek^c

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ABSTRACT

The effective corporate profit tax rates (ETRs) of multinational enterprises (MNEs) are in general lower than those of national enterprises (NEs). In this paper, we argue that the bargaining power of MNEs is an important factor in explaining these differences beyond profit shifting. First, larger and more profitable firms are more valuable for tax authorities through, e.g., higher tax revenues and employment. In threatening to move their operations to other jurisdictions, larger firms, and specifically MNEs, may be able to extract greater tax deductions. This results in a regressive ETR schedule for MNEs and NEs. Second, MNEs face arguably lower costs to relocate their business (or profits) to foreign countries with a lower tax rate than NEs. This improves MNEs' threat point in bargaining and enables them further to extract higher tax deductions than NEs. To empirically quantify the importance of bargaining on the tax gap between MNEs and NEs, it is elemental to rigorously condition on the determinants of MNE status, profit taxation, as well as possible profit-shifting activities. To that end, we use French firm-level data and entropy balancing on the joint determinants of MNE status (including the possibility of profit shifting) and a firm's ETR. We find that the empirical regressivity of the French tax schedule reduces French MNEs' ETRs by 2.52 percentage points on average due to their larger size, while the relocation threat of the same firms reduces their ETR by 3.58 percentage points relative to comparable NEs. The former is a tax advantage that any firm (MNE or NE) of the same size could obtain, while the latter is specific to MNEs and beyond the reach of NEs.

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1. Introduction

Multinational enterprises (MNEs) are an integral part of the world economy. They actively engage in innovation, investment, and trade, provide valuable employment, and generate extensive profits. This is why many countries run campaigns to lure them into their jurisdictions. However, in the public mind and debate, MNEs are frequently accused of avoiding, if not evading, taxation, thus reducing the tax base of their

host countries. Individual governments and international organizations – in particular the OECD through its Base Erosion and Profit Shifting (BEPS) initiative – have recently begun to try and limit the undesirable tax avoidance and evasion strategies of firms, primarily of MNEs. These internationally coordinated efforts mainly aim at profit shifting activities of MNEs related to transfer pricing, debt shifting, and royalty payments.

The reduction of MNEs' tax bills via profit shifting channels is well documented. However, this paper focuses on a less explored channel: bargaining. In nearly every European country and around the world, firms are able to bargain with local governments or tax authorities over possible deductions in order to reduce their tax bill. In this bargaining game, MNEs are favored to firms that only operate domestically, leading to relatively higher tax savings for MNEs. This directly undermines the efforts of international organizations, such as the OECD and the EU, to limit tax avoidance. Specifically, we think of the bargaining-related tax gap between MNEs and national enterprises (NEs) as a composite of three ingredients: one non-discriminatory element available to all firms and two discriminatory elements only available to MNEs. The two discriminatory elements relate to MNEs' operations of *foreign* affiliates: (i) foreign affiliates enable profit shifting

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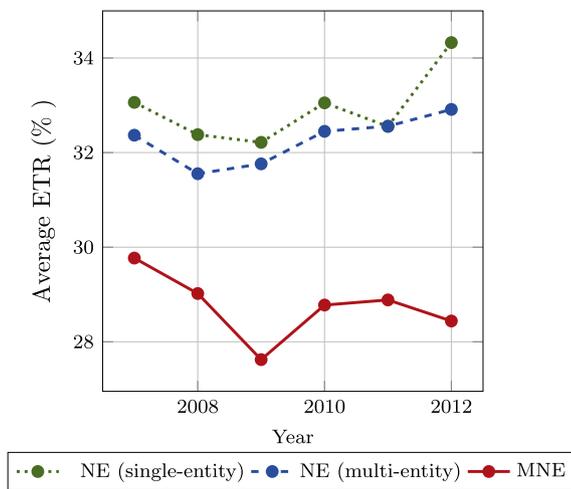


Fig. 1. Average ETR by firm type between 2007 and 2012.

to low-tax countries (tax avoidance and evasion); and (ii) MNEs are more credibly footloose than NEs which adds to their relative bargaining power at any given firm size and profitability. The non-discriminatory element flows from the empirical regressivity of tax schedules due to the greater bargaining power of larger and more profitable firms as such and leads to increased tax savings for MNEs (see Rego, 2003; Slemrod, 2004), solely rooted in their, on average, larger size and greater profitability relative to NEs (see Markusen, 2002; Helpman et al., 2004). These discriminatory and non-discriminatory elements have not been rigorously disentangled in earlier work on the tax gap between MNEs and NEs, which instead largely focused on analyzing and quantifying profit shifting. The goal of the present paper is to fill this gap and, by focusing on the bargaining-related aspects of tax savings, disentangle and quantify the discriminatory and non-discriminatory bargaining-related tax savings of MNEs using French firm-level data.

Fig. 1 documents the differences in the average effective tax rate (ETR), computed as the ratio of annual corporate profit taxes paid over annual before-tax profits between 2007 and 2012 from unconsolidated accounts, for three distinct firm types in France as recorded in Bureau van Dijk's ORBIS data set: MNEs, multi-entity NEs, and single-entity NEs, where an entity is an independent unit of operation. The figure suggests that MNEs face systematically lower ETRs than both types of NEs on average and that the average ETRs of multi-entity NEs were somewhat lower than those of single-entity NEs. Specifically, the ETR of MNEs is on average 3.42 percentage points lower than that of multi-entity NEs (with a standard error of 0.30).

We argue that the tax gap between MNEs and NEs does not only root in tax avoidance through profit shifting or (illegal) tax evasion, but also in the difference in the bargaining power between MNEs and NEs.¹ In this vein, Rego (2003) and Slemrod (2004) provide evidence that tax savings are positively correlated with firms' pre-tax profits, suggesting that the effective tax rate, ETR, declines with pre-tax profits, i.e., the ETR schedule of firms is regressive. Egger et al. (2010) show that MNEs have significant tax savings relative to comparable NEs even for a given pre-tax profit level. Consistent with these empirical findings we develop a stylized theoretical model in Section 3 that will guide our later estimation. Specifically, the model suggests that firms with higher pre-tax profits are in a better bargaining position and, hence, the empirically observable ETR schedule is regressive. In conjunction with the well-established fact of a greater profitability of MNEs relative to NEs, we are able to identify the non-discriminatory element, which

we refer to as the *size effect* on the tax gap between MNEs and NEs. The discriminatory element, the *footlooseness effect* of MNEs relative to NEs, arises from (everything else equal) lower fixed costs to relocate entities (and/or their profits) into countries with lower tax rates.

The aforementioned decomposition requires comparing MNEs to virtually identical NEs over an array of joint determinants of MNE status and profits. Doing so is potentially beyond the reach of linear regression and even of unconstrained, nonparametric econometric models, such as simple propensity score matching. This is because such unconstrained models do not ensure that the tax gap is computed from sets of treated (MNE) and control (NE) firms whose characteristics are *distributed identically*. To overcome this problem and ensure comparability, we apply entropy balancing, as suggested by Hainmueller (2012) and Hainmueller and Xu (2013), that permits an estimation of the causal effects of MNE status on ETRs through bargaining, conditional on profit-shifting-related tax avoidance and other attributes. To the best of our knowledge, this approach has not been previously applied in the context of self-selection into MNE status. The present paper employs this framework since the array of determinants of MNE status and firms' (including MNEs') tax payments are largely overlapping, if not the same, and observable. Further, we can show that the distributions of the respective observables vary widely between MNEs and NEs so that conditioning on a compact function of these characteristics (e.g., a linear index or a nonlinear index such as the propensity score of MNE status) does not sufficiently balance these moments as would be required to ensure identification of the average (causal) treatment effect of MNE status on profit tax payments in such frameworks (see Section C of the online appendix to this paper).

France, despite its recent crackdowns and raids on MNEs suspected of avoiding and evading taxes (most recently on the tax structures of Amazon, Apple, Google, and other well-known MNEs, see Brinded, 2013) and notwithstanding its reputation for difficult tax negotiations, is a prime location for such an analysis. France's tax system is based on two codes, the general tax code (Code Général des Impôts) and the tax procedure code (Livre des procédures fiscales), and taxes corporate profits under the territoriality principle. The corporate tax code does not provide for tax holidays. However, it explicitly provides for a host of tax deductions, such as the deduction of losses in foreign subsidiaries (starting from January 1, 2009), of 95% of dividends received from subsidiaries, or of research and development expenditures. Additionally, the corporate tax code allows for tax relief for domestic mergers and international mergers upon approval. France applies controlled foreign company legislation rules, anti-avoidance provisions, tax consolidation regimes, and regulations on payments made to subsidiaries in tax havens.²

Akin to the majority of European countries and the United States, the French tax authorities offer advance tax rulings, essentially allowing firms to negotiate their tax deductions before the first Euro is earned (see Van de Van de Velde, 2015 and Waerzeggers and Hillier, 2016, for an extensive overview of tax rulings within Europe).³ Huesecken and Overesch (2019) provide some evidence that these advance rulings lead to significantly lower tax payments. While few of these rulings enter the public awareness, there are several suspected cases of advance rulings that were discussed more widely (e.g., Amazon opened distribution centers in France, adding valuable jobs to the economy and revenue to state coffers after prolonged negotiations with the government, see Le Monde, 2012; Google opened its Paris office after a big push by the Sarkozy government, see Le Monde, 2010), with a handful of disclosed cases (e.g., Vivendi Universal SA, a mass media conglomerate headquartered in France, was permitted to offset the profits from its semi-owned subsidiaries with losses incurred in 2002, significantly

¹ MNEs may additionally be bargaining over employee-borne taxation. Egger et al. (2013) find evidence of a significant effect of both employee-borne and corporate profit taxes on the international location choice of headquarters.

² See Direction Générale des Finances Publiques (2016b) for an extensive overview of aspects of the French tax system.

³ In fact, with the exception of Slovakia, every EU and EFTA country has specific provisions for advance tax rulings.

reducing Vivendi's tax bill, see [ITRWeek, 2004](#)). These tax rulings are binding for the tax authorities, becoming law and being subsequently available to all firms in the same, often quite narrowly defined, situations. However, they are not binding for firms, who can elect to alter their ex-post tax optimization strategies. Given the size of the firms in question, we abstract from illegal tax evasion as the reputational losses and the massive increase in public, private, and governmental scrutiny make this option rather unattractive. Moreover, these firms can afford to design their tax structures in a way that remains within the legal space.⁴

While the number of tax audits remained largely constant in France between 2007 and 2012, coincidentally a time span which coincides with the Sarkozy presidency, the number of penalties imposed dropped at the beginning of the period and only increased after the beginning of the Hollande presidency (see [Direction Générale des Finances Publiques, 2016a](#)), after the passage of the Anti-tax Fraud Act in December, 2013, which expanded the investigative powers of the French tax authorities and increased penalties (see [Direction de l'Information Légale et Administrative, 2013](#)). In the last few decades, the French state's investment strategy in the private sector has been to opt for non-voting shares in private firms over voting stocks (see [Clift, 2012](#)).⁵ This suggests that French tax authorities are (at least indirectly) linked to French politics, a fact that might be viewed as an important ingredient in the making of French industrial policy.

The actual and possible connections and interactions between MNEs and tax authorities imply that the tax bargaining can be considered a government-assisted form of tax avoidance, among the many other forms of tax avoidance. In fact, France has been investigated and sued by the European Commission for providing French firms (e.g., France Telecom and the operators of France's *grands ports maritime* and the Port of Paris) with illegal state aid in the form of tax exemptions, see [Cullen \(2006\)](#) and [European Commission \(2016\)](#). However, it must be noted that the other, more conventional, forms of tax avoidance generally flow through profit shifting, widening the gap between realized and declared profits, while tax bargaining leads to a reduction of the tax rate on declared profits.⁶ The results presented below indicate that, on average and after conventional profit shifting, French MNEs earn €1.65 million more in pre-tax profits than comparable NEs on average. Due to the effectively regressive French corporate tax schedule, this translates into a merely size-related average reduction of an MNE's ETR by 2.52 percentage points relative to a comparable NE.⁷ The direct, bargaining-related effect of being an MNE on the ETR due to MNEs' greater mobility, controlling for pre-tax profits, amounts to a 3.58 percentage-point reduction of the ETR on average. Thus, on average, MNE status reduces the ETR by 6.1 percentage points, conditional on (i.e., after) profit shifting. This effect is mainly driven by firms in the highest quintile of the pre-tax profit distribution.

The remainder of the paper is structured as follows. [Section 2](#) discusses the related literature. [Section 3](#) outlines a stylized model of bargaining over a representative firm's tax deductions. [Section 4](#) describes the data and the estimation strategy and presents the empirical

results. [Section 5](#) is devoted to a range of robustness tests. The last section concludes.

2. Related literature

2.1. Sources of MNEs' tax savings

The public finance literature largely places the difference in ETRs between MNEs and NEs at the door of profit shifting (see [Huizinga and Laeven, 2008](#); [Schindler and Schjelderup, 2013](#)) and its channels through which MNEs reduce their corporate tax payments, namely transfer pricing (see [Davies et al., 2018](#)), debt shifting (see [Egger et al., 2014](#)), and royalty payments (see [Karkinsky and Riedel, 2012](#); [Griffith et al., 2014](#), among others). [Konrad and Stolper \(2016\)](#) show under which conditions the tax havens opposed by the OECD and the G20 are able to exist, which makes the aforementioned profit shifting methods possible. [Kopczuk \(2006\)](#) argues that the complexity of the tax law actually makes tax avoidance and shifting more likely. However, while interesting in itself, profit shifting is not the focus of the present paper, as it has been and still is at the heart of a sizable literature on tax avoidance. In the present paper, we take these profit-shifting channels into consideration by controlling for observables that capture them, namely cross-border trading, debt, and intangible asset holdings, without putting them to the fore of the analysis.

One strand of earlier work addresses aspects of tax savings that are related to firm size. For instance, [Grubert and Slemrod \(1998\)](#), [Rego \(2003\)](#), [Slemrod \(2004\)](#), and [Habu \(2017\)](#) argue that economies of scale make it more profitable for MNEs to seek out loop holes in the tax code to reduce their ETRs. Alternatively, [Richter et al. \(2009\)](#) find that increased lobbying expenditures lead to lowered ETRs in a panel of U.S. firms. These arguments suggest that the larger size of MNEs matters for the affordability of some fixed costs associated with tax planning or lobbying. Along this line of thinking, there have been analyses of negotiation- and lobbying-related tax savings of MNEs relative to NEs. The results in [Riedel and Simmler \(2018\)](#) regarding the tax setting in German municipalities suggest that a larger business tax base (i.e., many or large firms present in a particular location) and a high concentration of firms are associated with lower business tax rates at the regional level. A further reason for the profit tax savings of MNEs relates to their greater credibility of threatening footlooseness than is the case with NEs. [Vandenbussche and Tan \(2005\)](#) explore the differences in ETRs between Belgian foreign-owned MNEs and Belgian NEs using simple OLS estimation techniques and a Heckman selection model. Although their analysis does not fully control for firm fundamentals and possible profit shifting channels, they find that MNEs have better outside options than NEs, which leads to a higher bargaining power and lower taxes relative to NEs. [Huesecken and Overesch \(2019\)](#) show that advance tax rulings (which are tailor-made for MNEs) significantly decrease the tax payments of MNEs relative to NEs. As such, advance tax rulings are essentially a non-statutory instrument of tax competition, which itself has been well studied (see [Devereux et al., 2002](#); [Hines, 1999](#) among others), given the importance of MNEs in the global economy. All of these results suggest that larger firms – in particular, larger MNEs – benefit from their size and economic power in terms of reduced ETRs, beyond mere profit shifting.

Overall, while there is much documentation of the effective tax savings of MNEs, their magnitude is heavily debated and may depend on the setting and respective tax authorities. For instance, the results in [Egger et al. \(2010\)](#), using propensity score matching, suggest that, among European firms, the absolute tax payments of MNEs are lower than those of comparable NEs. While [Egger et al. \(2010\)](#) do not make any claims regarding ETRs and the fact that profits are an endogenous function of the MNE status, the results in [Dyregang et al. \(2017\)](#) suggest that U.S. MNEs indeed face a higher ETR than U.S. NEs.

⁴ There is also a steady flow of personnel between the private sector and the public sector, a phenomenon which is often referred to as the *revolving door* in the United States or as *pantouflage* in France. This exchange means that MNEs with their higher profits are willing and able to hire former government members and officials and gain access to their expertise and network to aid their negotiating positions.

⁵ Between the end of World War II and the mid 1970s, the French government pursued so-called *dirigiste* policies, where the state was intricately linked and heavily invested in the private sector and directed the decisions of firms through the creation of *national champions*, what might today be considered a public-private partnership.

⁶ Several studies have analyzed conventional profit shifting across the globe. E.g., [Tørsløv et al. \(2018\)](#) estimates that, at the aggregate level, French MNEs shifted approximately 32 billion USD in profits into tax havens in 2015, which involved an estimated loss in forgone French corporate tax revenues of 21%.

⁷ While the statutory tax rate on corporate profits is not regressive in France, French tax law does provide for numerous deductions and allowances resulting in an empirically regressive ETR, absent of any profit shifting activities.

2.2. Econometric approach towards estimating the tax savings effect of being an MNE

In quantifying the effect of the previously noted tax competition on MNE performance, on foreign direct investment, and on location choice, previous work such as in Hines (1999), Gresik (2001), and Devereux and Maffini (2007) relied on panel data to compare firms or aggregate outcomes just prior to and immediately after a tax or law change and across locations (e.g., Dharmapala and Riedel, 2013). Alternatively, other work compared the outcomes of MNEs and NEs within a given location (see Jog and Tang, 2001; Buettner et al., 2009; Egger et al., 2010).

In either case, the prevailing framework is based on a selection on (location- and/or firm-level) observables and either a linear (see Becker and Riedel, 2012) or nonlinear, even nonparametric, (see Egger et al., 2010) index of comparability in regression frameworks. Either econometric approach rests on the idea that, upon conditioning on the (linear or nonlinear) index of observables, any further difference between MNEs and NEs in terms of their (normalized or unnormalized) profit tax payments accrues to a quasi-random assignment of the MNE-versus-NE status. However, for this to hold, either approach requires that the distribution of observables behind the index is the same among MNEs (the treated) and NEs (the controls). Otherwise, some of the differences in the profit-tax outcomes that in fact accrue to differences in the distribution of observable joint determinants of MNE status and tax outcome may be misascribed to MNE status only, which may in turn lead to biased estimates of the average treatment effect of being an MNE on tax outcomes. Econometrically, one would generically refer to such a case as one of a *lack of covariate balancing*.

One approach to overcome this lack of covariate balancing in a selection-on-observables framework has been proposed by Hainmueller (2012) and Hainmueller and Xu (2013). Rather than assuming such balancing (as in regression approaches or propensity score matching) and testing against it ex post, Hainmueller's entropy balancing enforces covariate balancing in a constrained, nonlinear estimation approach. In a first step, weights are obtained for each targeted moment of the observables when considering treated and control (in our case, MNE and NE, respectively) observations subject to balancing constraints. In a second step, these weights are used in a weighting regression approach, where the outcome is regressed on the treatment indicator (here, MNE status) to estimate the average treatment effect on outcome. Notice that linear regression, propensity score matching, and other approaches based on the idea of selection on observables can be portrayed as special cases of weighting regression approaches towards the estimation of average treatment effects on outcome (see Wooldridge, 2007; Wooldridge, 2010, Chapter 21).

3. A stylized model of tax bargaining

We are interested in isolating the advantages of being an MNE above and beyond the effects of profit shifting. In spite of being at odds with many supranational agreements and the desire for policy transparency, advance tax rulings provide opportunities for unequal treatment of firms by national tax authorities and open the door to tax bargaining by firms. In this section, we develop a stylized theoretical model of tax bargaining that serves to inform our estimation. We focus on the simplest possible bargaining model to derive clear and testable predictions. We assume that firms are able to directly negotiate their possible tax deductions and, by this, their ETRs. For simplicity, we do not differentiate between negotiations over the fraction of profits that is subject to the domestic tax from those over the ETR, as the outcome would be isomorphic.⁸

Formally, we assume that national tax authorities and a generic firm *i* bargain over the firm's deductions from its tax base, D_i , taking the

⁸ In France and elsewhere, MNEs can negotiate the portion of their profits which will be subject to domestic taxes (see Bergin, 2012).

statutory tax rate, τ , as given. Firm *i*'s net profits are then determined as

$$\pi_i^n = (1 - \tau)\pi_i + \tau D_i, \tag{1}$$

where π_i are pre-tax profits. The government's tax revenues per firm, T_i , are then

$$T_i = \tau(\pi_i - D_i). \tag{2}$$

The firm and the government engage in Nash bargaining over the amount of deductions, D_i , where $\alpha \in (0, 1)$ is the bargaining power of the government and $(1 - \alpha)$ is the bargaining power of the firm. For simplicity we assume that α is not firm- or country-specific. Let us denote the outside option of the firm, i.e., the net profits a firm can generate by relocating its operations to a foreign country with effective tax rate ETR_i' , by $(1 - ETR_i')\pi_i - F_i$. For simplicity, we assume that the foreign country is passive. Thus, before-tax profits would be the same as at the outset after relocating, and ETR_i' will be the firm's effective tax rate abroad. Relocating would come at a fixed cost, F_i , which we assume to depend on the firm's MNE status. Since MNEs have already established operations abroad, we assume that MNEs' fixed costs of relocating their operations are significantly lower than those of NEs, $F_{MNE} < F_{NE}$.⁹ By this token, the threat point of an MNE is, ceteris paribus, higher than that of an NE, raising its bargaining power. Note that in our setup the effective (average) tax rates are relevant and not the marginal ones, as fixed costs of relocating suggest a lumpy investment decision of firms. A firm will only relocate to a foreign country if tax savings are high enough to cover the fixed costs. Once a firm decides to relocate, it will do so with all its profits to maximize (worldwide) net profits.

The solution to the Nash bargaining problem is then given by

$$D_i^* = \operatorname{argmax}_{D_i} [(\tau(\pi_i - D_i))^\alpha ((1 - \tau)\pi_i + \tau D_i - (1 - ETR_i')\pi_i + F_i)^{1 - \alpha}]. \tag{3}$$

The term $((1 - \tau)\pi_i + \tau D_i - (1 - ETR_i')\pi_i + F_i)$ actually reflects the investment decision and optimization problem of the firm. Assuming that gross profits are the same in both countries and that the foreign effective tax rate is lower than the French statutory tax rate, $ETR_i' < \tau$, all that prevents a firm to relocate are the fixed costs, F_i , and possible deductions granted by French tax authorities, D_i . Without any deductions firms, with profits above a certain threshold would relocate, while low-profit firms would remain in France. Setting $D_i > 0$ can mitigate differences between the foreign effective tax rate and the French statutory tax rate, but does not imply that effective marginal tax rates equalize in both countries as long as fixed costs are strictly positive.

Under the present assumptions, Eq. (3) simplifies to

$$D_i^* = \left(1 - \alpha \frac{ETR_i'}{\tau}\right) \pi_i - \frac{\alpha}{\tau} F_i. \tag{4}$$

Firm *i*'s ETR in the domestic country (where it bargains with tax authorities) is thus given by

$$ETR_i = \frac{\tau(\pi_i - D_i^*)}{\pi_i} = \alpha \left(ETR_i' + \frac{F_i}{\pi_i}\right). \tag{5}$$

Obviously, the ETR_i increases with the bargaining power of the government, α , and the foreign effective tax rate, ETR_i' . The ETR_i decreases with pre-tax profits, π_i , and is therefore regressive. This regressivity arises from the opportunity costs of the government. As pre-tax profits rise, domestic tax revenues increase, while the outside option – no tax

⁹ While MNEs do already have at least one foreign production site in place, NEs would need to setup one from scratch. We assume that the latter requires higher investment costs than expanding operations at an existing production site. Moreover, MNEs already have knowledge about the foreign country, e.g., its legal environment, local suppliers, etc., which could be an additional source of lower fixed relocation costs in comparison to NEs.

revenues from firm i at all – becomes increasingly unattractive. Thus, the government is willing to grant more tax deductions to a highly profitable firm in order to ensure that it does not relocate. On the other hand, the ETR_i also increases with the fixed costs of relocating, F_i . Higher fixed costs reduce a firm's ability to credibly threaten relocation as well as its ability to extract higher tax deductions. We therefore posit the following:

Proposition. (i) The effective profit tax schedule of firms is downward sloping with their pre-tax profits, i.e., the ETR is regressive. (ii) A firm's ETR increases with the fixed costs of relocating. If $F_{MNE} < F_{NE}$, MNEs face lower ETRs than NEs with the same level of pre-tax profits in equilibrium. (iii) The ETR of a firm increases with the foreign (effective) tax rate. (iv) The ETR schedule is less regressive when the fixed costs of relocation are higher.

The effect in (iv) can be obtained by taking the cross-derivative of Eq. (5) with respect to profits, π_i , and fixed costs, F_i . Graphically speaking, the ETR schedules of MNEs and NEs are both downward sloping. However, with $F_{MNE} < F_{NE}$, the ETR schedule of NEs is above the one of MNEs, but MNEs' ETR slope is steeper (more negative). While the ETR schedule is downward sloping due to the size effect and is thereby independent of MNE status, the difference in slope and intercept of the ETR schedule can be explained by the greater footlooseness of MNEs.

In Section A of the online appendix we provide and derive four model extensions. First, we allow for tax competition between the domestic country and a generic foreign country. Second, we alter the government objective function to account for the government's trade-off between tax revenue maximization and employment maximization in the domestic country. Third, we use a constrained Nash bargaining setting in which the government considers the negative effects of high taxes on profits, and thereby employment, in a firm. In the benchmark model version and these three model extensions the aforementioned proposition holds and the functional form of the ETR schedule is very similar. Lastly, we provide a counterfactual model that omits tax bargaining. In this last modeling approach only points (i) to (iii) of the above-mentioned proposition hold, which helps to identify the bargaining channel.

4. Empirical analysis

This section is devoted to assessing and quantifying some of the core insights from the stylized model above based on firm-level data. We do so in two parts. First, we demonstrate that some of the key model predictions are consistent with simple correlations found in the data. Second, we establish a causal relationship between MNE status and the effects of size and footlooseness on MNEs' ETRs, above and beyond the effects of profit shifting.

The stylized model does not include profit shifting activities or illegal tax evasion (to the extent that pre-tax profits do not depend on statutory tax rates and deductions). Hence, any gap in ETRs between MNEs and NEs is assumed to solely accrue to bargaining between tax authorities and firms. This is not generally the case in the data. In the empirical framework we must control for profit shifting activities, such as debt shifting, royalty payments, and transfer pricing, in order to not misattribute the difference in ETRs between MNEs and NEs to bargaining. Only the residual or conditional difference in ETRs (above and beyond profit shifting) between MNEs and NEs can and will be attributed to the bargaining of high-profit firms relative to low-profit firms in general and of mobile MNEs relative to less mobile NEs in particular. We will demonstrate later that this remaining difference can be attributed to firm size independent of MNE status and the greater footlooseness of MNEs relative to identical NEs given their declared profits and must not necessarily be due to evasion.

In what follows, it is useful to distinguish between an *entity* – i.e., an independent unit of operation within a firm (such as an affiliate or the

headquarters) – and a *firm*. The latter is the conglomerate of all affiliates and the headquarters, while the former is an individual component of that very conglomerate.

4.1. Data description

Data that would permit an assessment of bargaining above and beyond profit shifting on MNEs' relative to NEs' ETRs must contain information on firms' MNE status, profits, tax payments, and observable variables that capture profit shifting (such as information on debt levels, trade activities, and intangibles). Large collections of unconsolidated firm- (or, better, entity-) level data such as Bureau van Dijk's ORBIS database provide these ingredients for a limited set of countries – foremost France, parts of south-eastern Europe, and China. Of those countries, France is a prime candidate: it hosts and headquarters a large number NEs as well as domestic and foreign-owned MNEs, its central government levies relatively high profit tax rates, and its economic and political institutions are representative of an industrial economy, including the use of advance tax rulings. We therefore extract the relevant information on French NEs, French MNEs with entities abroad (foreign affiliates), and foreign MNEs with affiliates in France between the years 2007 and 2012. For the sake of better comparability of French NEs with MNEs in the sample, we only include NEs with at least two entities. Every firm in the estimation sample is thus a multi-entity enterprise.¹⁰ We define MNEs as having at least one independent operational unit in a country other than France where the respective ownership share exceeds 50%.

We only use firms with unconsolidated accounts, which allows us to calculate firms' local profit tax payments and their respective ETRs.¹¹ We compute the ETR from the ratio of total local profit tax payments (which in France only includes corporate profit taxes) over local pre-tax profits (which in France account for operating and financial profits/losses). We clean the data by deleting firms with abnormal returns, negative revenues, and data errors showing excessive ETRs outside the interval of [0%, 100%]. Moreover, we restrict the sample to firms with (i) profit tax payments of at least €763,000 and (ii) operating revenues that do not exceed €250 million. The first restriction ensures that all firms in the sample are subject to the 3.3% social contribution surtax, while the second restriction ensures that firms in the sample are not subject to the 5% surtax added after 2011 (raised to 10.7% after 2014). The applicable statutory tax rate between 2007 and 2012 is thus 34.43% for all firms in the data. Restricting our sample in this way has two advantages. First, having the same statutory tax rate for all firms eliminates a confounding factor. Second, excluding very big firms, mainly MNEs, makes the two samples of MNEs and NEs in the data more comparable. Only a small share of the firms in our sample are classified as small and medium sized entities by the French government.¹² Most of the firms we consider are larger firms from the perspective of the French government and we have reason to believe that these firms are able to negotiate tax deductions. Moreover, we are interested in heterogeneous effects due to size differences of firms, thus not focusing exclusively on very large firms helps us to identify the bargaining channel.¹³

¹⁰ The results below, however, are insensitive to the inclusion of single-entity NEs.

¹¹ The share of firms for which unconsolidated accounts are reported in the ORBIS data for France over the covered time span is nearly 70%. In general, ORBIS has a larger share of bigger firms than firm censuses. However, ORBIS's coverage of large firms and MNEs tends to be almost complete for most developed countries. As we intend to find comparable – hence, also large – firms to MNEs in the present context, the selection of larger NEs, and specifically multi-entity domestic-only firms, in ORBIS is a minor issue here.

¹² Small and medium sized firms are defined by a total revenues below €50 million and less than 200 employees.

¹³ We do not differentiated manufacturing and service firms and neither excluded public private partnerships from our sample. Our final sample only includes 39 entity-year observations with a service sector Nace Rev. 2 classification, 437 entity-year observations in the unconstrained sample. Only 6 firm-year observations can be classified as public-private-partnerships (PPPs). The model is robust to the exclusion of service firms and PPPs.

Table 1
Entities in France by type.

	Entities	Obs.	Percent
Domestic multi-entity	1758	3246	69.64
Multinational	632	1415	30.36
Total	2390	4661	

Imposing these restrictions yields a sample of 2390 entities (4661 entity-year observations) located in France. 632 of these entities (1415, or 30.36% of the entity-year observations) are MNEs. Table 1 reports the composition of the sample and Table 2 summarizes the entities' observable characteristics. Of the 632 MNE entities in France, 289 are the French subsidiaries of foreign owners, 273 are the French owners of foreign subsidiaries, and 70 are foreign-owned French subsidiaries which themselves own foreign subsidiaries. For this last category of entities, the host country of the foreign owner of the French entity always charges a higher tax rate than the lowest-tax host country of the foreign subsidiary of the same French entity in the data.

The upper part of Table 2 summarizes the entity-level variables pertaining to all sample entities located in France. According to the table, the average ETR is 31.29% for all entities in the sample.

We use the procedure of Levinsohn and Petrin (2003) and Petrin et al. (2004) to estimate firm-level productivity in order to control for the correlation between unobservable productivity shocks and input levels.¹⁴ Note that total revenues and productivity using the procedure of Levinsohn and Petrin (2003) and Petrin et al. (2004) shown in Table 2 are very dispersed, indicating a large degree of heterogeneity in size as well as productivity across the firms in our sample. For robustness, we repeat the analysis using (i) a Solow-residual-type total factor productivity and (ii) estimates based on the procedure of Olley and Pakes (1996). The presentation of these results is relegated to Section B of the online appendix. However, the main findings are not sensitive to the choice of productivity estimation.

In the lower part of Table 2, we present statistics on the effective average tax rate (EATR) on foreign corporate profits,¹⁵ and foreign country-size measures of population and real per-capita income from the World Bank's World Development Indicators for those foreign countries in which the multinational entities in the sample either have foreign affiliates or foreign owners. Overall, the aforementioned 1415 entity-year MNE observations are nested in 307 country-year observations involving 72 countries. In the case of multiple foreign affiliates (entities) per firm, we use country-level data for the lowest-taxing foreign location.¹⁶

4.2. Stylized correlations

The stylized model in Section 3 predicts corporate tax systems to be regressive, whereby firms with higher profits face lower ETRs,

¹⁴ Specifically, we estimate a log-linear production function of the following form

$$y_{it} = s_0 + s_1 l_{it} + s_2 k_{it} + s_3 m_{it} + \chi_{it} + o_{it},$$

where y_{it} , l_{it} , k_{it} , and m_{it} are the firm's gross revenues, employed labor, capital, and material costs of firm i at time t in logs, respectively. The remainder term consists of a transmitted productivity term $\chi_{it} = \chi_{it}(k_{it}, m_{it})$ that follows a first-order Markov process (known to the firm) and a term that is uncorrelated with the input choice, o_{it} . Using the interaction of capital and material costs as a proxy for the unobservable productivity term allows to identify the productivity level.

¹⁵ In contrast to statutory rates, EATRs account for deductions, credits, and other adjustments available to firms and is therefore a relatively close approximation of the lowest-taxed affiliate's ETR. The respective data are taken from Boesenberg and Egger (2016) and Boesenberg et al. (2018), which apply the Devereux and Griffith (1998, 2003) model.

¹⁶ Egger et al. (2018) show that most multi-entity firms have only one affiliate entity. Since we bound our sample both from above in terms of pre-tax profits and from below in terms of taxes paid, our sample does not include superstar MNEs and the majority of firms in our sample are likely to be single-foreign-entity firms by construction and would not be affected the selection of its lowest-taxing foreign location.

irrespective of the entity type. In order to gain preliminary insights into this relationship, we estimate a simple regression of ETR as the dependent variable on log pre-tax profits, $\ln(\pi_{it})$, log pre-tax profits squared, $\ln(\pi_{it})^2$, and cubic log pre-tax profits, $\ln(\pi_{it})^3$, for all 4661 entity-year observations as well as for observations pertaining to NEs and MNEs separately. Specifically, we estimate:

$$ETR_{it} = \kappa + \sum_{z=1}^3 \gamma_z \ln(\pi_{it})^z + \xi_i + \Xi_t + \eta_{it}, \quad (6)$$

where ETR_{it} is the effective (average) tax rate of an entity i located in France at time t , γ_z are regression parameters of interest, ξ_i are firm-fixed effects and Ξ_t are time-fixed effects, κ is a constant from which the fixed effects measure deviations, and η_{it} is an error term. The parameter estimates can be found in Table 3. Most importantly, the associated predictions are plotted for the average firm and year in Fig. 2, the inspection of which is key as log before-tax profits enter cubically in the econometric model.

According to Table 3 and Fig. 2, the estimation results suggest the following insights.¹⁷ First, the ETR declines with log pre-tax profits and the applied ETR is generally regressive for both types of firms. Second, the MNEs' ETR schedule is situated below the NEs' ETR schedule.¹⁸ Third, the ETR schedule of MNEs has a steeper slope and is thus more regressive over most of the range of pre-tax profits we consider in our sample. The (OLS-based) results from this simple empirical exercise are in line with the hypotheses of the stylized model summarized by the proposition in Section 3.

Moreover, we can use Fig. 2 to visualize the two bargaining effects of being an MNE on the ETR. A movement along the NEs' ETR schedule (from point A to B) corresponds to the size effect, higher profits due to the MNE status translate to a lower ETR given the regressivity of the ETR schedule. Switching from the NEs' ETR schedule to the MNEs' ETR schedule (from point B to C) gives us the footlooseness effect of being an MNE. The vertical distance (in terms of the expected ETR) between points A to C is the overall effect, which can be decomposed into the size and the footlooseness effect.¹⁹

Next, we focus on a theory-guided estimation of the determinants of the ETR based on Eq. (5). Specifically, we emphasize the role of fixed costs, F_i , and foreign ETRs as a measure of the attractiveness of possible outside options for MNEs. In doing so, we focus entirely on MNEs – either ones whose parent firms are located in France or ones whose parent firms are located abroad with at least one affiliate in France. Following the aforementioned proposition, the ETR of a French MNE entity should increase with the foreign (effective) tax rate, according to Eq. (5), at any level of fixed costs of relocating. In addressing the role of foreign (effective) profit tax rates on the ETR, we amend the specification in Eq. (6) by including the foreign effective tax rate of the country in which the French entity has an affiliate. Because we cannot precisely estimate the foreign effective tax rate, ETR_{it}' , of the affiliated entities of firm i , we use the effective average tax rate in the foreign country, $EATR_{it}'$ as a proxy. The latter is, however, a good measure of effective foreign taxation a firm could expect after relocating.

¹⁷ We use the variation of profits and ETR within a firm over time to estimate the ETR schedule. It should be noted that the data at hand vary both across firms as well as time. The relative importance of the across-firm variation is largely dominant (with more than 99% of the overall model variation being contributed by the firm fixed effects) in the data underlying the estimates of Eq. (6).

¹⁸ If properly weighted in unbalanced panels, the constant corresponds to the average of the fixed effects (see Baltagi, 2013). In Column (3), the intercept therefore represents the weighted average fixed effect for MNEs plus the treatment effect of being an MNE, while the intercept in Column (2) only represents the weighted average fixed effect of NEs. Given intercepts of 76.26 for MNEs and 83.27 for NEs, the MNEs' tax schedule is therefore situated below the NEs' tax schedule.

¹⁹ Note that the gap between MNEs' and NEs' ETR tax schedule in general increases, we take this as evidence that bargaining is an important factor and the lower ETR of MNEs does not arise from selection effects. We formalize this argument based on the fourth stylized model in Section A of the online appendix.

Table 2
Summary statistics.

Variable	Firm-year obs.	Mean	Std. dev.	Minimum	Maximum
ETR (%)	4661	31.29	9.64	1.19	99.97
Profit pre-tax (€mn.)	4661	8.27	9.13	0.88	102.67
Profit post-tax (€mn.)	4661	5.73	7.29	0.00	76.13
Tax payments (€mn.)	4661	2.26	2.37	0.76	26.54
Revenue (€mn.)	4661	75.53	55.96	0.26	249.52
Productivity	4661	0.77	1.10	0.04	59.00
Workers	4661	248.12	711.68	1	43,300
Labor costs (€mn.)	4661	12.64	13.55	0.03	134.28
Capital (€mn.)	4661	8.35	27.23	0.00	793.08
Debt (€mn.)	4661	3.09	16.16	0.00	400.18
Export revenue (€mn.)	4661	20.23	33.29	0.00	272.40
Intangibles (€mn.)	4661	4.30	17.61	0.00	395.62
Variable	Country-year obs.	Mean	Std. dev.	Minimum	Maximum
Foreign EATR (%)	307	24.15	7.18	0.00	38.73
Foreign population ('000s)	307	89,300	245,000	311.57	1,350,000
Foreign GDP per capita (constant USD)	307	22,893.48	15,320.27	744.42	74,021.46

Foreign affiliate or owner hosts: Angola, Australia, Austria, Belgium, Bosnia and Herzegovina, Brazil, Bulgaria, Cameroon, Canada, Chile, China, Colombia, Congo, Cote d'Ivoire, Cyprus, Czech Republic, Denmark, Egypt, Estonia, Finland, Gabon, Germany, Ghana, Greece, Guinea, Hong Kong, Hungary, Iceland, India, Indonesia, Ireland, Israel, Italy, Japan, Kenya, Latvia, Lithuania, Luxembourg, Madagascar, Malaysia, Mauritius, Mexico, Morocco, Mozambique, Netherlands, New Zealand, Norway, Panama, Peru, Poland, Portugal, Qatar, Russian Federation, Saudi Arabia, Senegal, Serbia, Singapore, Slovakia, South Africa, South Korea, Spain, Sweden, Switzerland, Thailand, Tunisia, Turkey, Ukraine, United Arab Emirates, United Kingdom, United States, Venezuela, and Viet Nam.

Table 3
OLS: Estimation of the French ETR schedule.

Variable		All obs.	NE obs.	MNE obs.
		(1)	(2)	(3)
$\ln(\pi_{it})$	(γ_1)	-62.64 *** (3.64)	-65.45 *** (4.17)	-63.28 *** (7.11)
$\ln(\pi_{it})^2$	(γ_2)	27.34 *** (1.96)	30.08 *** (2.32)	24.42 *** (3.70)
$\ln(\pi_{it})^3$	(γ_3)	-3.97 *** (0.33)	-4.44 *** (0.40)	-3.26 *** (0.59)
Constant	(v)	71.99 *** (3.70)	83.27 *** (5.28)	76.26 *** (5.58)
R^2		0.80	0.85	0.78
Observations		4661	3246	1415

Pre-tax profits in €mn. Year and firm fixed effects are included. Standard errors in parentheses. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively.

For these tax rates, we use the lowest EATR within the foreign network of each MNE as a measure of $EATR_{it}'$. We estimate the following equation after defining indices $f(i)t$ for the foreign country f which $EATR_{it}'$ belongs to and $s(i)$ for the sector of firm i 's main operations:

$$ETR_{it} = \alpha + \sum_{z=1}^3 \beta_z \ln(\pi_{it})^z + \varphi EATR_{it}' + A_t + B_{f(i)} + H_{s(i)} + \epsilon_{it}, \quad (7)$$

where ETR_{it} is the effective tax rate of a French entity i at time t , and $\ln(\pi_{it})$ are the log pre-tax profits of this entity. A_t is a time-fixed effect, $B_{f(i)t}$ is a fixed time effect for the lowest-tax foreign country in i 's MNE network at time t , $H_{s(i)}$ is a sector fixed effect for firm i at time t , and ϵ_{it} is an error term. The parameters A_t are estimated on a binary indicator matrix with as many columns as there are years in the data, the parameters $B_{f(i)}$ are estimated on a matrix of binary, time-variant indicators with as many columns as there are foreign countries in the data, and the parameters $H_{s(i)}$ are estimated on a binary indicator matrix with as many columns as there are sectors in the data. As there is very little variation in $EATR_{it}'$ or the affiliate structure of firms over time, we cannot include firm fixed effects and instead resort to sector-fixed effects to identify the impact of the foreign EATR on the firm's ETR. Of course, as with any higher-dimensional fixed effects design, an appropriate set of restrictions has to be implemented.

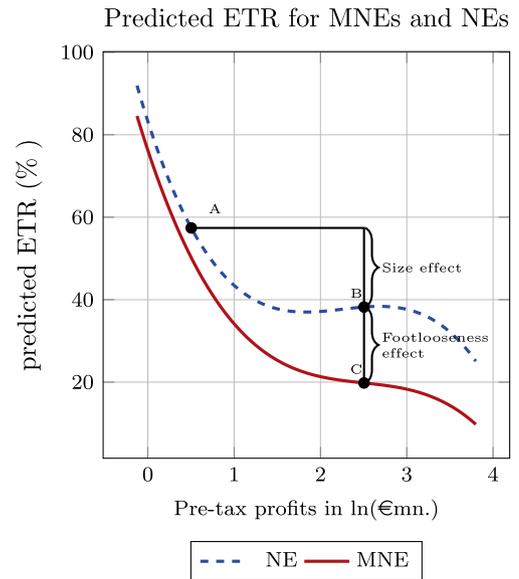


Fig. 2. Predicted ETR schedule based on OLS.

In the estimation, we restrict our sample to MNEs, where the foreign (effective average) tax rate is observable. We also distinguish between foreign-owned entities (designated foreign parents), which includes all foreign-owned entities in France, irrespective of whether they themselves hold foreign entities or not, and foreign-affiliate-owning French entities (designated French parents), which includes all French entities that own affiliates abroad, irrespective of whether the French entities are headquarters or are themselves foreign-owned. Hence, there is some small overlap in the samples.²⁰ Overall, we suspect that the costs of relocating a headquarters are higher than those of relocating any other entity. Thus, the ETR schedule should be more regressive for the latter, while for both subgroups a higher foreign effective tax rate would increase an MNE entity's ETR in France.

Table 4 summarizes the key regression results corresponding to Eq. (7). Column (1) presents the result for all MNE entities located in

²⁰ For that reason, the number of observations in Columns (2) and (3) add to slightly more than the observations in Column (1) of Table 4.

Table 4
Effect of foreign taxes on a firm's ETR by ownership structure.

Variable		All MNEs (1)	Foreign parents (2)	French parents (3)
$\ln(\pi_{it})$	(β_1)	-54.87 *** (7.86)	-57.59 *** (11.08)	-42.57 *** (7.99)
$\ln(\pi_{it})^2$	(β_2)	21.77 *** (3.70)	23.07 *** (5.32)	15.64 *** (3.87)
$\ln(\pi_{it})^3$	(β_3)	-2.81 *** (0.54)	-2.96 *** (0.80)	-1.93 *** (0.57)
$EATR'_{it}$	(φ)	0.32 ** (0.16)	0.30 ** (0.15)	0.14 (0.22)
Constant	(v)	69.81 *** (5.44)	65.46 *** (9.16)	63.08 *** (5.42)
R^2		0.32	0.31	0.32
Observations		1415	612	985

Only those foreign markets with an affiliate with the lowest foreign EATR' are considered. The sample for foreign headquarters uses French MNE units which are headquartered abroad, irrespective of whether they hold foreign affiliates themselves or not. The sample for French parents uses French MNE units which hold affiliates abroad, irrespective of whether they themselves are headquartered in France or abroad. Hence, there is some overlap between these samples. Standard errors in parentheses clustered at firm level. We suppress estimates of the lowest-tax-country-in-*i*'s-network, time-, and sector-fixed effects. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively.

France in our sample. Considering the distribution of $\ln(\pi_{it})$ in conjunction with the coefficient estimates ($\hat{\beta}_2$), higher pre-tax profits reduce a firm's ETR as before, which squares with the insights of the theoretical model discussed above. Notice that the estimates $\hat{\beta}_2$ are not statistically different from their counterparts $\hat{\gamma}_2$ in Table 3. A higher foreign tax rate is expected to raise a firm's French ETR. The foreign EATR clearly increases the ETR of French entities with foreign parents, see Column (2). In general, the effect of foreign tax rates is stronger for French entities that are owned by foreign MNEs than for French parent entities, where the effect is not significant, see Column (3). Implicitly, this means that foreign-owned affiliates in France are gaining more from bargaining and, in the context of the theoretical model, the bargaining power, $1 - \alpha$, of foreign-owned affiliates is higher than that of French-owned entities or relocation costs are lower. We undertake a similar analysis using foreign statutory tax rates, and the associated results confirm the assumption that effective tax rates are the relevant indicator of foreign taxation over statutory tax rates.²¹ Furthermore, we test the assumption that the coefficient on $EATR'_{it}$ in Column (2) is higher than and significantly different from the coefficient on $EATR'_{it}$ in Column (3). To that end, we run the following two models using ρ_{it} to denote the error term:

$$ETR_{it} = \sum_z^3 (\rho_z \ln(\pi_{it})^z + \phi_z (\text{ForeignParent}_{it} \times \ln(\pi_{it})^z)) + \psi EATR'_{it} + \varpi (\text{ForeignParent}_{it} \times EATR'_{it}) + \rho_{it}, \quad (8)$$

where the test on joint significance of ϕ_z and ϖ results in an F-statistic of 3.13, which is significant at the 95% level, while the one-sided *t*-test for ϖ is not significant.²² Additionally, we run the following regression:

$$ETR_{it} = \sum_z^3 \rho_z \ln(\pi_{it})^z + \psi EATR'_{it} + \varpi (\text{ForeignParent}_{it} \times EATR'_{it}) + \rho_{it}, \quad (9)$$

where we force the coefficient ρ_z to be the same for foreign-owned and French-owned firms, which results in a significant coefficient for ϖ of -0.04 with a standard error of 0.02.

²¹ Statutory tax rates are only somewhat significant in similar regressions.

²² Compared to Eq. (6), the cross-main-sector variation in Eq. (8) is less important in the underlying data, with only about 75% of the variation contributed by main-sector fixed effects.

4.3. Entropy balancing to establish causal relationships

Even though we can measure firms' profits in France and estimate the shape of the nexus of profits and the ETR, we cannot straightforwardly compare MNEs and NEs in terms of profits and the associated ETR to gauge the bargaining component in ETRs, since MNEs can manipulate their profits in a way that is beyond the reach of NEs. This leads to an endogeneity of profits, $\ln(\pi_{it})$, in the above estimations. We address this by using entropy balancing, which is a generalized weighting procedure. In doing so, we allow profits and MNE status to be simultaneously determined by a set of observables.

Being an MNE affects the tax rate in two ways. (i) All else equal (meaning in the absence of or beyond profit shifting), MNEs have higher profits on average (see Helpman et al., 2004), which mechanically reduces their effective tax rate if the ETR schedule is regressive. (ii) MNEs are in a better bargaining position relative to NEs and can thus reduce their tax burden even further. The first, the *size effect*, is related to the better bargaining position of larger firms, while the latter, the *footlooseness effect*, arises from the reduced perceived or expected costs of MNEs to relocate. Thus, we first need to estimate profits that are free of profit shifting aspects to arrive at comparable units between NEs and MNEs. For this, we use a procedure capable of retrieving the average difference between NEs and MNEs in terms of their (log) profits after conditioning on a broad set of controls, including variables that are typically indicative of profit shifting, i.e., export volumes, debt, and intangible assets. The remaining control variables are joint determinants of (revealed) profitability and MNE status such that the obtained conditional mean is characterized by the same targeted moments of the distribution of each and every such joint determinant between MNEs and NEs.

We apply entropy balancing as proposed by Hainmueller (2012) and Hainmueller and Xu (2013). Akin to other approaches invoking a selection (into treatment; here, MNE status) on observables which jointly determine treatment status as well as outcome (in this case, (log) pre-tax profits or the French ETR), entropy balancing lends itself to a weighting regression framework. With traditional approaches (such as linear regression or propensity score matching), the weights are obtained in a way that is unconditional on the distribution of the observables between the treated and the untreated. This is true for linear regression, where all weights are identical, as well as for propensity score matching, which is analogous to an inverse propensity-score-weighting regression (see Wooldridge, 2007). Differences in the covariate distributions between the treated and the untreated observations may confound any identification of the parametric or nonparametric link between treatment status and outcome. Entropy balancing avoids this problem by determining the weights subject to constraints which enforce the balancing of targeted moments of the distribution of observables - captured by the respective entropy in the covariates - between the samples of MNE and NE data points.

Specifically, we are interested in the average treatment effect on the treated (ATT) - the effect of being an MNE on the MNEs in the data. After subsuming all observables into the vector X_{it} , we can drop entity-time indices *it* and write the ATT as

$$ATT = E[ETR|MNE = 1] - \int E[ETR|X = x, MNE = 0] f_{X|MNE=1}(x) dx, \quad (10)$$

wherein *ETR* denotes the ETR outcome associated with MNE status, *MNE*, and *X* are the observable joint determinants of MNE status and the ETR. The ATT is identified by selecting on a range of observables, such that the ETR is independent of the MNE treatment status given the observables. This holds as long as there is some overlap between the treated and the untreated in the values that the observables (*x*) may take within the support of the observables among the treated, $f_{X|MNE=1}$. In order to estimate this last term, the covariate distribution of the control group's observables must be adjusted to match the

covariate distribution of the treated. This enforces the orthogonality of the treatment indicator, *MNE*, and the observables which is required for a causal inference of the treatment effect (see Hainmueller and Xu, 2013). Moreover, this procedure automatically closes the gap between the ATT and the average treatment effect (ATE), which is not the case when the balancing of the distribution of observables is not enforced. In drawing a random entity from the data of MNEs and NEs, the predicted effect of being an MNE relative to being an NE on either outcome (profits or the ETR) is the same under entropy balancing regression but not under a propensity score weighting regression, which does not constrain the distribution of the observables to be the same between treated and untreated units. Accordingly, entropy balancing generalizes the unconstrained weighting approaches of treatment effects under a selection on observables, including propensity score matching. Relative to unconstrained weighting approaches, entropy balancing gives greater weight to observations in the control group that are similar to observations in the treatment group in terms of the observables. Specifically, entropy balancing weights minimize the entropy distance metric subject to moments constraints (mean, variance, and skewness) for each covariate and balancing constraints that ensure that all weights are positive and sum up to unity. Entropy balancing aims to match the specified moments of the covariates in the control and treatment group as closely as possible, while at the same time preferring sets of weights that are closer to a uniform distribution. This leads to a unique (preferred) set of weights.

In the subsequent analysis, we denote the weight (of an entity *i* in year *t*) generated through entropy balancing by λ_{it} . Table 5 summarizes the targeted (balanced) moments of the observables in the determination of the balancing weights λ_{it} .

While we would ideally balance on direct measures of actual profit shifting, e.g., internal debt payments, internal royalty payments (R&D expenditures), or internal pricing of exports and imports, these data are not available for French firms in the ORBIS database. We thus turn to candidate measures mentioned in the literature on profit shifting (see Egger et al., 2014; Lassmann and Zoller-Rydzek, 2018; among others)

for suitable proxy measures. Specifically, we use $\ln\left(\frac{\text{Exports}}{\text{Revenues}}\right)$, $\ln\left(\frac{\text{Debt}}{\text{Revenues}}\right)$, and $\ln\left(\frac{\text{Intangibles}}{\text{Revenues}}\right)$ to approximate firms' profit shifting in our sample. In order to determine whether profit-shifting is happening, tax authorities and accounting firms take these variables, e.g., from the ORBIS database in order to identify abnormally high or abnormally low pre-tax profits. Thus, these variables are assumed to be indicative of profit shifting activities. During auditing procedures, tax authorities and firms' tax accountants generally argue about the appropriate

comparison (what we would consider the correct construction of the control group) with respect to pre-tax profits, revenues, exports, debt, and intangible assets; see Escaut et al. (2012).

In addition to the entity-level variables, the interactions thereof, and time-fixed effects in Table 5, we balance on three moments of the entity-specific variable means (see Mundlak, 1978) of $\ln(\text{Revenues})$, $\ln(\text{Productivity})$, $\ln(\text{Employees})$, $\ln(\text{Capital})$, $\ln(\text{Labor costs})$, $\ln\left(\frac{\text{Exports}}{\text{Revenues}}\right)$, $\ln\left(\frac{\text{Debt}}{\text{Revenues}}\right)$, and $\ln\left(\frac{\text{Intangibles}}{\text{Revenues}}\right)$.

4.4. Determining the ETR effect of being an MNE

To apply entropy balancing as described in the previous subsection, we target the entity and firm fundamentals and moments listed in Table 5 and obtain the balancing statistics presented in Table 6. The table reports the moments of interest of the main observables and is organized in three horizontal blocks: the first one focuses on the control units (i.e., NEs) before balancing the observables; the second block reports the same moments among the treated units (i.e., MNEs); and the third block summarizes the moments of the control units after balancing. In comparing the first with the second and third horizontal block in the table, we see that some of the moments of the main variables differ significantly between MNEs and NEs prior to balancing. However, this difference vanishes after balancing.²³ In particular, the covariate balancing vastly improves the comparability of the higher moments in the data.

Given the balancing summarized above, we use the balancing weights, λ_{it} , to obtain an estimate of the ETR schedule considering the endogeneity of (log) pre-tax profits, $\ln(\tilde{\pi}_{it})$, and the binary MNE status, *MNE_{it}*. For this, we weight the outcome variable of interest, *ETR_{it}*, (log) pre-tax profits, and the binary MNE indicator by λ_{it} to obtain $\widetilde{\text{ETR}}_{it}$, $\ln(\tilde{\pi}_{it})$, and $\widetilde{\text{MNE}}_{it}$, respectively, and estimate the specification below.

$$\widetilde{\text{ETR}}_{it} = v + \sum_{z=1}^3 \omega_z \ln(\tilde{\pi}_{it})^z + \mu \widetilde{\text{MNE}}_{it} + \sum_{z=1}^3 \vartheta_z \widetilde{\text{MNE}}_{it} \ln(\tilde{\pi}_{it})^z + \rho_{it}, \quad (11)$$

where ω_z gives the coefficients of the ETR schedule for NEs and where μ and ϑ_z are components of the conditional ATT and ATE of MNE status on the ETR beyond profit shifting, i.e., the change of the ETR intercept and slope due to being an MNE, respectively. The parameter *v* is a constant and ρ_{it} is an error term. Since we condition on domestic-versus-foreign average tax- and profit-shifting-related differences in the pre-tax profits when estimating ω_z in Eq. (11), any remaining ATT (and ATE) of being an MNE on the ETR is attributable to the footlooseness effect of being an MNE.

Otherwise identical firms will only differ in their MNE status. Moreover, by including firm-specific Mundlak-type variable means in the balancing weights, we can compare the results of (11) to the firm-fixed effects regression estimated from Eq. (6). In Column (1) of Table 7 we present the estimated coefficients using OLS, while Column (2) shows the estimated coefficients using the balancing weights, λ_{it} . The coefficients of this estimation will next be used to quantify the size and footlooseness effect.

To determine the size effect, we need to know the additional profits an MNE is able to generate relative to an NE. We do so by estimating

$$\ln(\tilde{\pi}_{it}) = \iota + \delta \widetilde{\text{MNE}}_{it} + \nu_{it}, \quad (12)$$

where δ gives the additional profits of being an MNE. Note that by this strategy, we consider conditional (on profits) direct treatment effects in Eq. (11) and indirect ones through profits in Eq. (12). The latter are

Table 5

Targeted moments of observable variables in the entropy balancing of MNEs (λ_{it}).

Control	Targeted moment		
	Mean	Variance	Skewness
$\ln(\text{Revenues})$	YES	YES	YES
$\ln(\text{Productivity})$	YES	YES	YES
$\ln(\text{Employees})$	YES	YES	NO
$\ln(\text{Capital})$	YES	YES	NO
$\ln(\text{Labor costs})$	YES	YES	NO
$\ln\left(\frac{\text{Exports}}{\text{Revenues}}\right)$	YES	YES	NO
$\ln\left(\frac{\text{Debt}}{\text{Revenues}}\right)$	YES	YES	NO
$\ln\left(\frac{\text{Intangibles}}{\text{Revenues}}\right)$	YES	YES	NO
Mundlak-type means	YES	YES	YES
$\ln(\text{Revenues}) \times \ln(\text{Productivity})$	YES	YES	NO
$\ln(\text{Revenues}) \times \ln(\text{Employees})$	YES	YES	NO
$\ln(\text{Revenues}) \times \ln(\text{Capital})$	YES	YES	NO
Time-fixed effects	YES	NO	NO

²³ We are able to balance on different moments with varying degrees of precision. The degree of precision used is indicated by the number of digits reported in Table 6.

Table 6
Balanced: French MNEs and domestic multi-entirety firms.

	Control			Treatment			Balanced Control		
	Mean	Variance	Skewness	Mean	Variance	Skewness	Mean	Variance	Skewness
ln(Revenues)	17.81	0.679	-0.4084	17.93	0.639	-0.9671	17.93	0.639	-0.9671
ln(Productivity)	6.490	0.151	1.136	6.563	0.256	2.109	6.564	0.256	2.109
ln(Employees)	4.85	1.37		4.99	1.38		4.99	1.38	
ln(Capital)	14.42	3.03		14.97	2.76		14.97	2.76	
ln(Labor costs)	16	1.153		16	1.072		16	1.072	
ln($\frac{\text{Exports}}{\text{Revenues}}$)	0.225	0.082		0.359	0.087		0.359	0.087	
ln($\frac{\text{Debt}}{\text{Revenues}}$)	0.03263	0.029		0.07544	0.199		0.07544	0.199	
ln($\frac{\text{Intangibles}}{\text{Revenues}}$)	0.05729	0.056		0.07284	0.091		0.07284	0.091	

Table 7
Balanced: Estimation of the French ETR schedule.

Variable		OLS	Entropy balancing
		(1)	(2)
ln($\bar{\pi}$)	(ω_1)	-59.73 *** (2.79)	-48.65 *** (6.00)
ln($\bar{\pi}$) ²	(ω_2)	25.00 *** (1.46)	20.52 *** (3.29)
ln($\bar{\pi}$) ³	(ω_3)	-3.25 *** (0.23)	-2.76 *** (0.56)
$\widehat{\text{MNE}}$	(μ)	-2.59 (3.72)	-9.31 ** (4.51)
$\widehat{\text{MNE}} \times \ln(\bar{\pi})$	(ϑ_1)	9.00 (5.51)	15.75 ** (7.62)
$\widehat{\text{MNE}} \times \ln(\bar{\pi})^2$	(ϑ_2)	-6.22 ** (2.54)	-8.45 ** (3.98)
$\widehat{\text{MNE}} \times \ln(\bar{\pi})^3$	(ϑ_3)	0.93 ** (0.37)	1.23 * (0.64)
Constant	(ν)	74.27 *** (1.64)	66.25 *** (3.40)
F-statistic		44.45	20.43
Observations		4661	4661

Standard errors in parentheses obtained through bootstrapping. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively. F-statistic is for the joint significance of all MNE effects.

Table 8
The ATE of MNE status on profits.

Variable		OLS	Entropy balancing
		(1)	(2)
MNE	(δ)	0.38 *** (0.03)	0.18 *** (0.03)
Observations		4661	4661

The ATE of MNE status in the balanced regression is the effect beyond profit shifting activities. Standard errors in parentheses obtained through bootstrapping. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively.

referred to as mediation effects in the econometrics literature as, e.g., discussed in Heckman and Pinto (2015). Table 8 shows the estimated additional profits using the balancing weights, λ_{it} . Without balancing, the pre-tax profits of MNEs are 46% higher than those of NEs, while conditioning on entity and firm fundamentals reduces this difference to 20%. The average firm in our sample has about €8.27 million in pre-tax profits, random assignment of the MNE status under balancing would therefore imply a pre-tax profit increase of about €1.65 million.

We can then translate these additional pre-tax profits into changes of the ETR (size effect) by using the estimated additional (log) pre-tax profits, $\hat{\delta}$, in conjunction with the estimated parameters from Eq. (11).

The change of the ETR for a given level of pre-tax profits, π , can be written as

$$\Delta \text{ETR}_{it}(\pi_{it}) = \left(\sum_{z=1}^3 \hat{\omega}_z \ln(\pi_{it}^z) \right) - \left(\sum_{z=1}^3 \hat{\omega}_z (\ln(\pi_{it}) + \hat{\delta}_{it})^z \right), \quad (13)$$

where $\hat{\omega}_z$ are the estimated coefficients from Eq. (11) and $\hat{\delta}$ are the estimated (log) additional profits from Eq. (12). Note that we use the ETR schedule for NEs, i.e., $\text{MNE} = 0$.²⁴ In our sample, the €1.65 million in average, additional profits reduce the ETR over the support of pre-tax profits on average by around 2.52 percentage points. Similarly, we can compute the distance between the ETR schedules of MNEs and NEs (the distance between points B and C in Fig. 2), which gives us the footlooseness effect and is about 3.58 percentage points on average.²⁵ Adding both effects produces an average overall effect of 6.10 percentage points, where the footlooseness effect contributes about 58%.

We use the estimated coefficients from Table 7 to plot the ETR schedules for MNEs and NEs and the treatment effects of MNE status. However, we focus on the results using entropy balancing in Column (2). The left panel of Fig. 3 now plots the ETR schedules with 95% confidence bounds.²⁶ The right panel of the figure, in addition to the footlooseness effect (dotted line, the difference in the MNEs' and NEs' ETR schedules from the left-hand panel), plots the estimated size effect (dashed line) with 95% confidence bounds and the overall effect. Clearly, the footlooseness effect is dominant in the right tail of the pre-tax profit distribution, indicating that bigger, footloose firms are gaining more from threatening to relocate. Due to differences in the slope of the ETR schedule, the size effect is most prominent in the left tail.

4.5. Quintile regressions

In Eq. (11), we estimate a cubic relationship between ETRs and pre-tax profits, while establishing a linear relationship between the MNE status and pre-tax profits in Eq. (12). However, this omits an array of possible nonlinearities in δ , which we account for by applying quintile regressions for the size effect. Thus, we further constrain our sample and balance individual quintiles of the (log) pre-tax profit distribution.

Fig. 4 presents quintile-specific results, estimated and balanced along pre-tax profit quintiles, and is comparable to the right-hand panel in Fig. 3. Quintiles are visually separated by thin vertical bars. In terms of pre-tax profits, the overall effect seems to be driven by the lowest and highest quintiles. MNEs in the top quintile have over 18.3% higher profits on average, which corresponds to €3.84 million in

²⁴ The results are qualitatively similar when using the MNEs' ETR schedule instead.

²⁵ We use Eq. (13) to calculate the average change in the ETR over the whole support of profits in our sample. The footlooseness effect can then be computed from the Eq. (11) and is $\hat{\mu}$ plus the average of $\sum_{z=1}^3 \hat{\vartheta}_z \widehat{\text{MNE}}_{it} \ln(\bar{\pi}_{it})^z$ over the whole support of the sample.

²⁶ This left-hand panel of Fig. 3 is similar to Fig. 2 but relies on the balanced sample to estimate the ETR schedule, which explains the minor deviations.

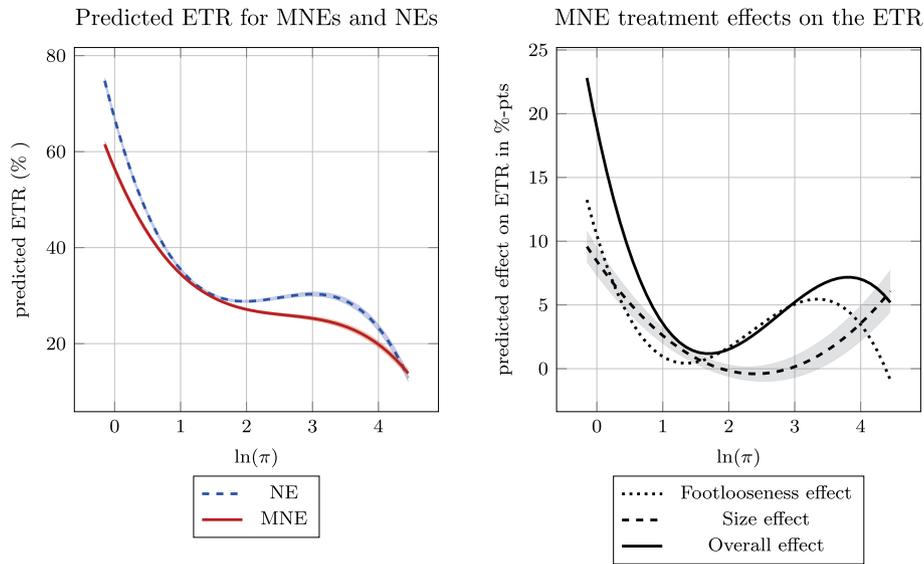


Fig. 3. Balanced: Predicted ETR and treatment effect on the ETR.

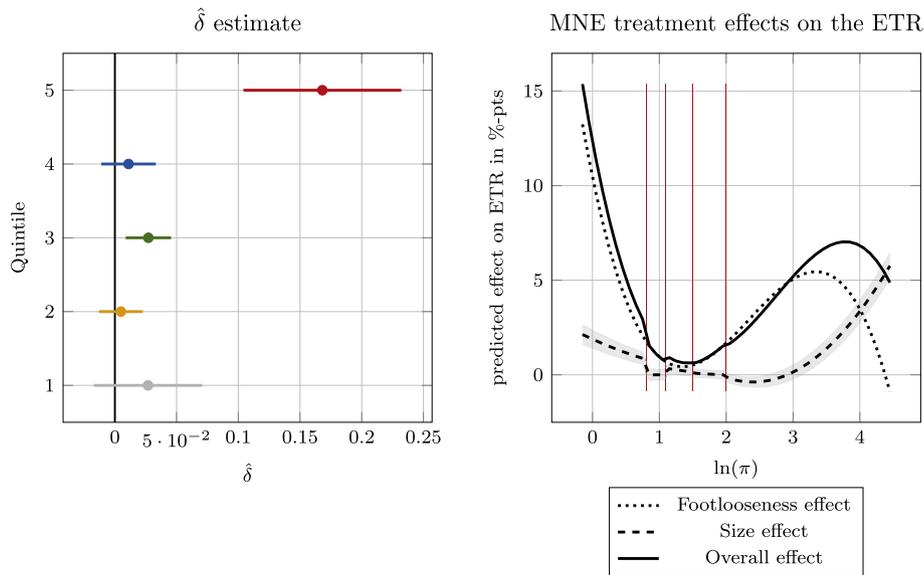


Fig. 4. Balanced: additional MNE profits and treatment effects on ETR by pre-tax profit quintiles.

additional profits relative to NEs in the same quintile.²⁷ In Fig. 4, we derive the size effect (dashed line) using the additional profits specific to the respective quintile. In contrast to the size effect based on the whole sample, the quintile-specific size effect is now much smaller for firms in the left tail of the pre-tax profit distribution. While the slope of the ETR schedule in the left tail is very steep, small firms do not gain sufficient additional profits from being an MNE. The greater pre-tax profit gains in the right tail of the pre-tax profit distribution significantly decrease the ETR, although the slope is much smaller than in the left tail. MNEs in the highest quintile are able to reduce their ETR by 5.06 percentage points on average relative to NEs. In the top quintile, the average size effect contributes about 1.43 percentage points (or 28% percent) to the average overall effect (Table 9).

Table 9
Decomposition of treatment effects by pre-tax profit quintile.

Quintile	$\hat{\delta}$	Size effect	Footlooseness	Overall
1	0.04	1.46	6.71	8.17
2	0.00	0.00	1.15	1.15
3	0.03	0.24	0.48	0.72
4	0.02	0.04	1.00	1.04
5	0.17	1.43	3.63	5.06

Decomposition of the overall effect into the size and footlooseness effects. Point estimates of $\hat{\delta}$ are the average for each quintile.

5. Robustness checks

We perform various robustness checks. First, we repeat the entropy balancing estimation using a much larger sample, which includes firms

²⁷ The average firm in the highest quintile earns about €21 million in pre-tax profits.

with revenues over €250 million and tax payments below €763,000, in Section 5.1. This robustness check stands apart from the previous estimations in that the applicable French statutory tax rate that the firms in the sample face is no longer constant across and within firms, while all previous and subsequent samples and were and are constrained to firms with a French statutory tax rate of 34.43%. We additionally use the bacon procedure by Weber (2010) to eliminate outliers, showing that the results are not driven by a few superstar firms.

Next, we account for a finding in Habu (2017), who argues that unconditional tax differentials of English MNEs and NEs arise from the incomplete consideration of MNEs with negative profits and the possibility to carry losses forward. We approach this argument in two ways. (i) We follow Habu (2017) directly and include firms with negative profits. To allow for negative profits in our estimation strategy, we use all variables in levels and set the ETR equal to zero for all firms with negative profits. Specifically, we use the same set of variables in our entropy balancing procedure, only in levels. Analogously, we estimate Eqs. (11) and (12) in levels to determine the ETR schedule and the absolute additional profits of MNEs. (ii) We follow Dyreng et al. (2017) and repeat the estimation after excluding all firms that had negative profits at any point in our sample, as well as the year 2007, as we do not observe profits before that year. This mitigates the possibility of loss carryforward but reduces the number of observations. These two checks are presented in Section 5.2.²⁸

Given the prominence of tax havens in the popular consciousness and the policy debate around profit shifting, we analyze the impact of tax havens on the benchmark results in Section 5.3. We once more approach this analysis in two ways: (i) accounting for the presence of tax havens among the parent or subsidiaries of an entity using a dummy variable and (ii) excluding firms where this same tax haven indicator is equal to 1.

Lastly, we consider that the difference in the ETRs between MNEs and NEs may be due to the use of large tax consulting firms by MNEs to handle their tax negotiations with the French tax authorities. We therefore rely on the declared auditor in Bureau van Dijk's ORBIS data to construct and include an indicator variable in the balancing model. We repeat the balancing estimation and present the corresponding results in Section 5.4.

We generally present the regression results of the robustness checks in tables and only present graphical results in those cases where these differ significantly from the benchmark estimates.

5.1. Reducing the restrictions in sample selection

In the main analysis of the paper, we work with a subsample of entities whose statutory tax rate in France is equal over the entire sample period and across all observations. However, we now maintain the complete sample of French NEs and MNEs and take their different statutory tax rates into consideration using binary indicators.²⁹ The sample used in this section is summarized in Table 10 and is roughly 2.5 times the size of the benchmark sample.

To ensure that the results in this section are not driven by outliers, we also perform the bacon procedure developed by Weber (2010) with a generous p -value of 25%. This procedure reduces the estimation sample to 11,120 firm-year observations, relative to the 12,100 observations in the fully unrestrained sample. We rerun the entropy balancing and produce the pre-tax profit balancing results both on the full

²⁸ We also use tax payments over total assets as an alternative measure to the ETR and repeat the analysis from Section 4.4 in Section D of the online appendix. There are two advantages of using taxes over assets: (i) assets are always positive, unlike profits; and (ii) total assets fluctuate less than pre-tax profits, which reduces business-cycle effects in our estimations. However, tax payments over total assets are difficult to interpret economically, as the numerator of this ratio is a flow, while the denominator is a stock. Nevertheless, the results are robust to this specification.

²⁹ The respective indicators are equal to unity if the entity's statutory tax rate is equal to (i) 33.1%, (ii) 34.43%, or (iii) 36.1%.

Table 10
Entities in France by type: fewer restrictions.

	Entities	Obs	Percent
Domestic multi-entity	2674	5123	42.34
Multinational	3461	6977	57.66
Total	6135	12,100	

Table 11
Balanced: Estimation of the French ETR schedule – fewer restrictions.

Variable		Full sample	Post-bacon
		(1)	(2)
$\ln(\bar{\pi})$	(ω_1)	0.33 * (0.19)	0.28 (0.19)
$\ln(\bar{\pi})^2$	(ω_2)	-0.18 *** (0.05)	-0.15 *** (0.05)
$\ln(\bar{\pi})^3$	(ω_3)	-0.03 *** (0.01)	-0.02 ** (0.01)
\widehat{MNE}	(μ)	-3.12 *** (1.30)	-3.05 *** (0.51)
$\widehat{MNE} \times \ln(\bar{\pi})$	(ϑ_1)	-1.04 *** (0.27)	-0.93 *** (0.30)
$\widehat{MNE} \times \ln(\bar{\pi})^2$	(ϑ_2)	0.13 ** (0.07)	0.03 (0.07)
$\widehat{MNE} \times \ln(\bar{\pi})^3$	(ϑ_3)	0.03 *** (0.01)	0.02 (0.02)
Constant	(v)	28.14 *** (0.37)	28.08 *** (0.37)
F-statistic		4.50	13.18
Observations		12,100	11,120

Standard errors in parentheses obtained through bootstrapping. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively. F-statistic is for the joint significance of all MNE effects.

unrestrained and the post-bacon procedure sample, the results of which are presented in the respective columns of Table 11. Compared to Table 7 the coefficients are much lower due to the fact that we now include many firms with substantially higher profits.

We also re-estimate the additional MNE profits, $\hat{\delta}$, based on these two new samples of firms. Without balancing, $\hat{\delta}$ is 2.17 (with a standard error of 0.03) in the full sample and 2.15 (with a standard error of 0.03) in the post-bacon sample. However, after applying entropy balancing on firm fundamentals, $\hat{\delta}$ amounts to 0.63 (and a standard error of 0.04) in the full sample and 0.64 (with a standard error of 0.04) in the post-bacon procedure sample. Comparing the results for the full sample and the results after applying Weber's bacon procedure leaves us confident that outliers in the full sample do not drive the results.

Recall that we still use the log of profits in the unrestrained sample and hence we only consider firms with positive profits. We observe that MNEs with very low (yet still positive) pre-tax profits face higher ETRs (statistically significant) than comparable NEs. Fig. 5 presents the estimated size and overall effect for this unrestrained sample, based on Column (1) in Table 11. The estimated size effect is insignificant for the majority of firms in the sample.³⁰

The results above indicate that the benchmark results are not an artifact of our sample selection on the French statutory tax rate. Permitting firms to be positioned at any point on the statutory tax schedule results in qualitatively similar, while quantitatively smaller, effects. Similarly, applying the bacon procedure in the unrestrained sample leaves the main findings intact.

³⁰ A plot based on the bacon-procedure results in Column (2) is very similar, with an insignificant size effect throughout; we therefore forgo presenting these results in the interest of space.

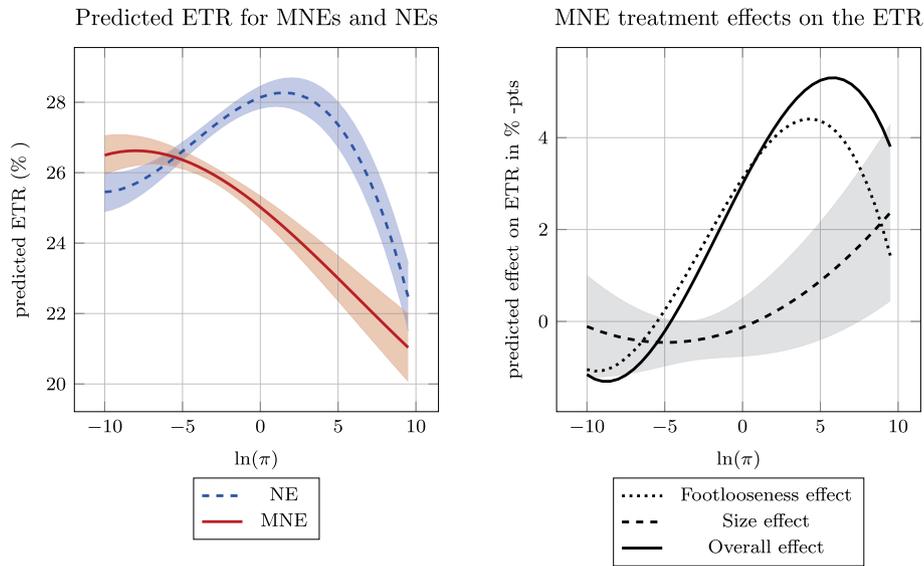


Fig. 5. Balanced: Predicted ETR and treatment effect on the ETR – fewer restrictions.

5.2. Negative profits

For the first part of this robustness check we include firms with negative profits in the estimation sample. This requires an estimation in levels and not logs. Moreover, as negative ETRs are not possible, we set instances of negative ETRs equal to zero. This results in different estimated ETR schedules of NEs and MNEs. The great mass of firms with an ETR of zero in the data leads to an upward sloping ETR schedule in the left tail. However, the right tail of the ETR schedules looks very similar to the benchmark case. Even when including MNEs with negative pre-tax profits, MNEs are (on average) still more profitable than similar NEs and their additional pre-tax profits are about €300,000. This result is once again mainly driven by firms in the top quintile of the pre-tax profit distribution which have €500,000 in additional profits relative to comparable NEs.

For the second part of this robustness check we deal with tax loss carryforwards (or net operating loss carryforwards) by eliminating data from the year 2007 as well as all firms that made losses at any point in the sample period. This reduces our sample by about 17% to 2037 entities (3792 firm-year observations), of which 1530 entities (2617 firm-year observations) are domestic multi-entity firms and 537 entities (1106 firm-year observations) are multinational firms, or 70.3 and 29.7%, respectively. We rerun the entropy balancing based on this reduced sample and produce the pre-tax profit balancing results presented in Table 12.

The new sample is then also used for a new estimation of additional MNE profits, $\hat{\delta}$. Without balancing, pre-tax profits are about 51% (coefficient of 0.41 with a standard error of 0.03) higher for MNEs, while entropy balancing reduces this difference to about 27% (coefficient of 0.24 with a standard error of 0.03). The overall results for the predicted ETR schedules for MNEs and NEs and the MNE treatment effects on the ETR are consistent with the benchmark results. We are therefore confident that the results are not an artifact of insufficiently accounting for loss-making firms and that loss carryforward does not exacerbate the tax differences found in the benchmark results.

Taken together, the robustness checks permitting negative profits and eliminating negative profits lead us to conclude that MNEs have systematically higher profits than comparable domestic firms and thus lower ETRs. Our main results are therefore unchanged. In fact, domestic firms have systematically higher losses and more frequently carry losses forward than comparable MNEs, which biases the ETR in favor of domestic firms and would suggest that our results are the lower bound.³¹

Table 12

Balanced: estimation of the French ETR schedule – no loss carryforward.

Variable		Coef.
$\ln(\bar{\pi})$	(ω_1)	-47.37 *** (6.15)
$\ln(\bar{\pi})^2$	(ω_2)	20.34 *** (3.32)
$\ln(\bar{\pi})^3$	(ω_3)	-2.78 *** (0.55)
\widehat{MNE}	(μ)	-8.84 ** (5.72)
$\widehat{MNE} \times \ln(\bar{\pi})$	(ϑ_1)	15.91 ** (9.10)
$\widehat{MNE} \times \ln(\bar{\pi})^2$	(ϑ_2)	-9.05 ** (4.46)
$\widehat{MNE} \times \ln(\bar{\pi})^3$	(ϑ_3)	1.36 * (0.68)
Constant	(ν)	64.93 *** (3.46)
F-statistic		24.25
Observations		3722

Standard errors in parentheses obtained through bootstrapping. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively. F-statistic is for the joint significance of all MNE effects.

5.3. The effect of tax havens

To account for the significance of tax havens among the foreign subsidiary/parent countries, we address their presence in two alternative ways: (i) we condition on a tax haven indicator and (ii) exclude firms with tax haven subsidiaries/parents. In both cases, we define a tax haven indicator, based on the list of countries in Dharmapala and Hines Jr. (2009), which is unity if the parent or an affiliated firm of a company is located in a tax haven country on that list.

When pursuing the first strategy and conditioning on the tax haven indicator, the sample size is unaffected relative to the benchmark analysis in Section 4.4. In the re-estimation of Eq. (7), the tax haven indicator

³¹ This may also suggest that French domestic-only firms were more severely affected by the financial crisis of 2008.

Table 13
Effect of foreign taxes on a firm's ETR by ownership structure: tax havens.

Variable		Indicator approach			Tax haven exclusion		
		All MNEs	Foreign parents	French parents	All MNEs	Foreign parents	French parents
		(1)	(2)	(3)	(4)	(5)	(6)
$\ln(\pi_{it})$	(β_1)	-54.87 *** (7.86)	-57.59 *** (11.08)	-42.57 *** (7.99)	-54.39 *** (8.79)	-58.25 *** (12.49)	-39.77 *** (8.47)
$\ln(\pi_{it})^2$	(β_2)	21.77 *** (3.70)	23.07 *** (5.32)	15.64 *** (3.87)	21.64 *** (4.11)	23.44 *** (5.89)	14.51 *** (4.10)
$\ln(\pi_{it})^3$	(β_3)	-2.81 *** (0.54)	-2.96 *** (0.80)	-1.93 *** (0.57)	-2.78 *** (0.60)	-3.00 *** (0.87)	-1.78 *** (0.61)
$EATR_{it}$	(φ)	0.32 ** (0.16)	0.30 ** (0.15)	0.14 (0.22)	0.25 (0.16)	0.29 (0.19)	0.04 (0.22)
Tax haven		9.52 (6.03)	1.87 (3.15)	-8.77 (8.99)			
Constant	(ν)	69.81 *** (5.45)	65.46 *** (9.16)	63.08 *** (5.42)	69.47 *** (6.10)	66.29 *** (10.24)	61.72 *** (5.69)
R^2		0.32	0.31	0.32	0.31	0.25	0.31
Observations		1415	612	985	952	535	560

Only those foreign markets with an affiliate with the lowest foreign $EATR'$ considered. Columns (1)–(3) account for the presence of tax haven affiliates through Tax haven, an indicator for affiliates or parents in a tax haven country. Columns (4)–(6) excludes firms with parents/affiliates in tax haven countries. The sample for foreign headquarters uses French MNE units which are headquartered abroad, irrespective of whether they hold foreign affiliates themselves or not. The sample for French parents uses French MNE units which hold affiliates abroad, irrespective of whether they themselves are headquartered in France or abroad. Hence, there is some overlap between these samples. Standard errors in parentheses clustered at firm level. We suppress estimates of the lowest-tax-country-in- t 's-network, time-, and sector-fixed effects. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively.

carries a statistically insignificant coefficient and the $EATR'_{it}$ variable loses some of its significance (see the results in Columns (1)–(3) in Table 13).

However, when following the second approach and dropping firms with entities (affiliates or parents) in tax havens, the number of observations is reduced to 4095 (compared to 4661 in the benchmark analysis) and the parameter on $EATR'_{it}$ loses in significance (see the results in Columns (4)–(6) in Table 13). This should not come as a surprise, as conditioning on a tax haven indicator or, more so, eliminating tax-haven-affiliated units inevitably leads to a reduction in the conditional variance of $EATR'_{it}$.

Since the tax haven indicator is not statistically significant, we perform the entropy balancing and estimate the French ETR schedule after excluding firms with parents or subsidiaries in tax haven countries. The results in Table 14 are largely unaffected relative the benchmark analysis in Table 7. In the estimation of the ATE of MNE status on

firms' profits, $\hat{\delta}$ amounts to 37% (coefficient of 0.32 with a standard error of 0.02) before balancing and to 15% (coefficient of 0.14 with a standard error of 0.03) after balancing. By extension, the results of the predicted ETR and treatment effects on the ETR are robust to the exclusion of tax haven entities.

5.4. Firms which use the big-four consulting firms

One of the reasons for the large difference in ETRs between MNEs and NEs may be MNEs' disproportionate use of large tax consulting firms, the Big-Four: Deloitte, Ernst & Young, KPMG, and Pricewaterhouse-Coopers, to handle their tax negotiations and auditing. Given their extensive network and expertise, the Big-Four could enable, facilitate, or improve the bargaining of firms with the local tax authorities. To test this hypothesis, we constructed a Big-Four dummy variable (based on the declared auditor in the ORBIS data) and re-estimated both the entropy balancing and the subsequent regressions based on an

Table 14
Balanced: estimation of the French ETR schedule – exclusion of firms with parents/affiliates in tax havens.

Variable		Coef.
$\ln(\tilde{\pi}_{it})$	(ω_1)	-47.78 *** (4.42)
$\ln(\tilde{\pi}_{it})^2$	(ω_2)	19.92 *** (2.31)
$\ln(\tilde{\pi}_{it})^3$	(ω_3)	-2.63 *** (0.37)
\widetilde{MNE}_{it}	(μ)	-9.10 * (5.29)
$\widetilde{MNE}_{it} \times \ln(\tilde{\pi}_{it})$	(θ_1)	15.08 * (8.53)
$\widetilde{MNE}_{it} \times \ln(\tilde{\pi}_{it})^2$	(θ_2)	-8.06 * (4.22)
$\widetilde{MNE}_{it} \times \ln(\tilde{\pi}_{it})^3$	(θ_3)	1.17 * (0.64)
Constant	(ν)	65.79 *** (2.58)
F-statistic		16.17
Observations		4095

Standard errors in parentheses obtained through bootstrapping. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively. F-statistic is for the joint significance of all MNE effects. See Dharmapala and Hines Jr. (2009) for a list of tax havens that were used in the exclusion.

Table 15
Balanced: estimation of the French ETR schedule – controlling for usage of Big-Four.

Variable		Coef.
$\ln(\tilde{\pi}_{it})$	(ω_1)	-69.73 *** (3.73)
$\ln(\tilde{\pi}_{it})^2$	(ω_2)	29.91 *** (1.87)
$\ln(\tilde{\pi}_{it})^3$	(ω_3)	-4.07 *** (0.29)
\widetilde{MNE}_{it}	(μ)	-8.16 ** (3.38)
$\widetilde{MNE}_{it} \times \ln(\tilde{\pi}_{it})$	(θ_1)	16.69 *** (3.38)
$\widetilde{MNE}_{it} \times \ln(\tilde{\pi}_{it})^2$	(θ_2)	-9.86 *** (2.48)
$\widetilde{MNE}_{it} \times \ln(\tilde{\pi}_{it})^3$	(θ_3)	1.55 *** (0.37)
Constant	(ν)	80.87 *** (2.30)
F-statistic		15.24
Observations		2904

Standard errors in parentheses obtained through bootstrapping. ***, **, and * indicate levels of statistical significance at 1, 5, and 10%, respectively. F-statistic is for the joint significance of all MNE effects.

augmented model that accounts for the use of a Big-Four firm. In 44% of the firm-year observations in our sample, one of the Big-Four auditors is used. The usage between MNEs and NEs is remarkably similar at 43% and 44.5%, respectively. Hence, MNEs do not disproportionately rely on Big-Four accounting firms. Still, we present the results for the estimated French tax schedule in Table 15. We also re-estimated the (OLS-based) unbalanced and (entropy-) balanced ATE of the MNE status on pre-tax profits: the parameter amounts to 48% (coefficient of 0.39 with a standard error of 0.02) without covariate balancing and to 18% (coefficient of 0.17 with a standard error of 0.03) with covariate balancing. The results in Table 15 are quite striking. The findings after conditioning on the Big-Four indicator variable are very similar to the previous benchmark findings. However, while the Big-Four-controlled sample is much smaller than the benchmark sample (2904 versus 4661 firm-year observations), the statistical significance appears to increase in spite of the reduction in the degrees of freedom. The results of the predicted ETR and the treatment effects on the ETR are also robust to accounting for the use of firms relying on the Big-Four consultants only.

6. Conclusions

This paper investigates the differences in the effective tax rates (ETRs) of French multinational enterprises (MNEs) vis-à-vis French domestic-only, national enterprises (NEs). MNEs are in a better bargaining position in their negotiations with tax authorities due to both their size and their reduced relocation costs relative to NEs. We formalize this idea in a simple stylized model, where firms and tax authorities negotiate over tax deductions. Firms with higher pre-tax profits and lower fixed costs of relocating have a better bargaining position and hence have lower ETRs. Moreover, the stylized model implies that the ETR schedule is regressive, specifically due to the increased bargaining power of more profitable firms. As MNEs have, on average, higher pre-tax profits, their bargaining power is higher and hence their ETRs are lower. We refer to this as the size effect. On the other hand, the footlooseness effect accounts for how much the effective tax rate of MNEs decreases due to their lower fixed relocation costs and, thus, their higher credibility in threatening to move their operations abroad relative to NEs.

In this paper, we argue that the unequal treatment of MNEs by French tax authorities, manifested in the aforementioned bargaining channel, reduces MNEs' ETRs relative to comparable NEs – even after controlling for possible profit shifting through the usual channels: debt shifting, patent trading, and transfer pricing. Advance tax rulings (especially undisclosed ones) are an obvious candidate in the more favorable treatment of MNEs relative to NEs. On the other hand, it appears implausible that tax authorities acting on good faith systematically err on the side of MNEs as both MNEs and NEs are able to obtain advance tax ruling and appeal unfavorable ones. Given that the footlooseness effect is increasing with firm size, it is furthermore implausible that the difference in the ETR between MNEs and NEs can be exclusively attributed to a selection of MNEs into France due to favorable advance tax rulings and non-selection in the case of unfavorable rulings. If the tax authorities act on good faith with a random error, we would expect that the footlooseness effect is constant over the firm size distribution. The stylized model suggests that footlooseness interacts with pre-tax profits and, hence, we would expect that the footlooseness effect is greater for (everything else being equal) more profitable firms. This is consistent with the empirical findings and clearly suggests the existence and relevance of the bargaining channel.

Empirically, we find that an average (French or foreign) MNE in France faces a 3.42 percentage point lower (pre-balancing) effective tax rate than a French firm with purely domestic operations. In order to decompose the overall effect into its footlooseness- and size-related components, we compare MNEs and NEs that are otherwise identical

using entropy balancing. While the footlooseness effect amounts to, on average, 3.58 percentage points, the size effect corresponds to a 2.52 percentage point reduction in the ETR of MNEs. In total, the conditional difference in the ETR between comparable MNE and NE entities amounts to 6.1 percentage points. Moreover, we find that the total bargaining effect of being an MNE on the ETR is mainly driven by high-productivity (high-profit) firms.

Beginning in 2015, the European Commission ramped up its efforts to investigate and overrule its member states' tax rulings if these are found to provide "selective, unfair competitive advantage" and therefore constitute "prohibited state aid" (see Bloomberg Tax, 2018). These efforts limit countries' ability to set and determine their own tax policy. However, the establishment and enforcement of global tax avoidance agreements appears to call for constraining individual governments in their freedom to circumvent global rules they agreed to by negotiating local deals.

Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.jinteco.2019.103258>.

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