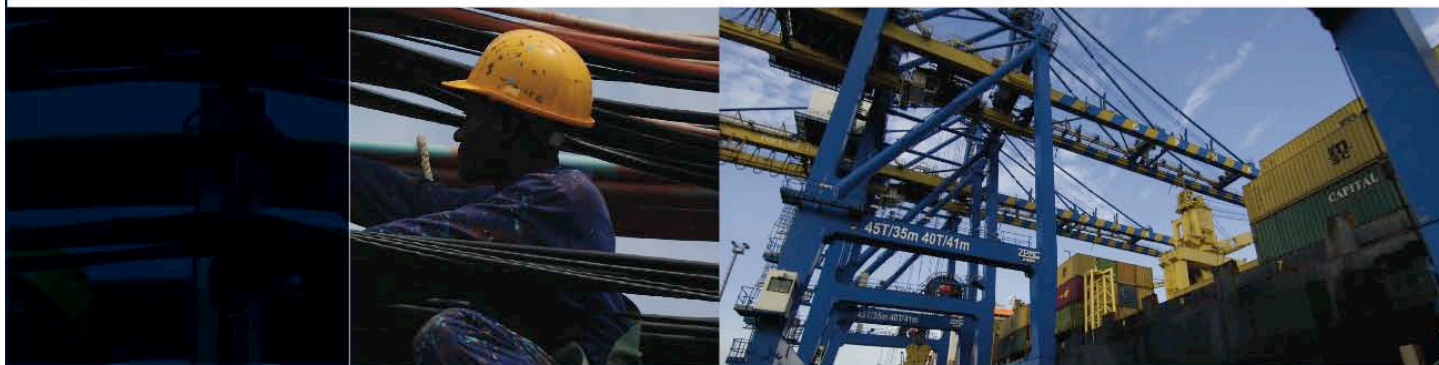


LEARNING TO COMPETE

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Industry Switching in Developing Countries

Carol Newman, John Rand, and Finn Tarp

Abstract

Firm turnover (i.e. firm entry and exit) is a well-recognized source of sector level productivity growth across developing and developed countries. In contrast, the role and importance of firms switching activities from one sector to another is little understood. Firm switchers are likely to be unique both from newly established entrants and exiting firms that close down. We build an empirical model that examines switching behaviour based on data from Vietnamese manufacturing firms during the period 2001–08. Our diagnostic shows that switching firms have different characteristics and behaviour as compared to entry and exit firms. They tend, inter alia, to be labour-intensive and seek out competitive opportunities in labour-intensive sectors in response to changes in the market environment. We also show that resource reallocations resulting from switching form an important component of productivity growth.

Keywords: Firm dynamics, sector switching, efficiency, Vietnam

JEL classification: D21, L6, O14

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1 Introduction

In the literature on firm turnover, any firms that leave a particular sector are, with one major exception covering US manufacturing plants (Bernard et al., 2006), classified as exit firms.¹ This is so, even if some firms in reality do not close down but switch production to a different sector. Similarly, new entrants include both genuinely new firms and firms previously operating in other sectors.²

This is surprising given that switchers are likely to be different both from other firms entering and those which exit. Moreover, if sector switchers are more productive than other firms, then new entrants may be accredited with contributing to productivity growth to a greater extent than they actually do. If switching firms do have different characteristics to ‘real’ entry and exit firms and are motivated by different factors, then understanding this dynamic is important for understanding the potential effect of changes in the external environment on productivity.³

We present a basic conceptual framework along the lines of Ericson and Pakes (1995), which outlines the process through which firms decide to enter, exit or switch sectors. This behavioural framework is used to make predictions about the potential drivers of firm dynamics, and in particular firm switching behaviour. We consider how firm turnover might be affected by the observed characteristics of sectors and exogenous shocks such as regulatory changes and trade liberalization and what this might mean for productivity.

Motivated by our theoretical predictions, we empirically explore the factors associated with the type of switching behaviour observed and compare them to those related to entry and exit in a case study for Vietnam, using census data for the period 2001–08. We also measure the importance of industry dynamics for productivity growth and identify the component of productivity growth that is due to the reallocation of activities across broadly defined sectors. Accordingly, a core aim of this paper is to diagnose the extent to which differences exist between entry, exit, and sector switching firms. We rely on estimations of firm level revenue productivity measures for sub-sectors of the manufacturing sector, and use these productivity measures to establish the contribution of (i) firm turnover, and (ii) sector switching versus ‘real’ entry and exit, to productivity growth. Throughout the analysis, particular focus is given to the role of trade liberalization and deregulation.⁴

Section 2 presents the conceptual framework used to organise our empirical model. Section 3 presents the empirical approach while Section 4 describes the data. Empirical results are put forward in Section 5 and Section 6 concludes.

2 Behavioural framework

The seminal literature on the evolution of industry and industry dynamics does not consider the possibility that firms may choose to reallocate resources into new sectors to maximise

¹ For an overview of this literature see Caves (1998), Bartelsman and Doms (2000) and Tybout (2000).

² It may also happen that firms, which change ownership form or location in one year are classified as exit firms and as entry firms the next year, see for example Aw et al. (2001).

³ Another recent area of literature analysing firm dynamics and productivity growth has focused on changes in the product mix by surviving firms as the main channel of productivity growth, see for example Bernard et al. (2009; 2010), Goldberg et al. (2008) and Eckel and Neary (2006).

⁴ A large literature points to a variety of relevant mechanisms through which trade liberalization can impact positively on productivity growth, see for example Melitz (2003) and Pavcnik (2002). For analyses of the extent to which deregulation induces resource reallocations within an industry see Eslava et al. (2004), Olley and Pakes (1996), and Stiroh and Strahan (2003).

profits or to avoid exiting the industry. Yet, the general line of thinking in the contributions by Dunne et al. (1988; 1989), Jovanovic, (1982), Dixit (1989), Hopenhayn (1992), Ericson and Pakes (1995), and Olley and Pakes (1996) can be relied on to predict the probability of a firm switching its main production activity. Such extension is a key aim of this paper, and to motivate and organise our empirical investigation, we set out a behavioural framework departing from Ericson and Pakes (1995).⁵

Accordingly, we assume that there are two sectors in an industry and that in each sector there are a large number of price-taking firms, facing the same market structure and producing a homogenous output. Firms differ both in terms of their productivity (ω) and their expectations about future market conditions (Ω), both in their sector and in the other sector in the industry. We assume that the objective of each firm is to maximise the expected value of current and future profits. Profits (π) will depend on the firm's choice of inputs, their productivity, and market conditions.

Firms pay a sunk cost of entry into sector j (C_j) and will enter if $E(\pi_{ij}|\omega_{ij}) \geq C_j$.⁶ Each period, a firm decides to exit or switch production to a different sector, before deciding how much to invest. Firms continue to produce if the expected value of future profits exceeds the termination valuation of the firm (T_i). In evaluating future profits the enterprise considers the profit that is attainable in its sector (sector j) relative to the profit that could be achieved in the alternative sector (sector s).

The firm will switch to sector s if the expected profits from producing in this sector, less the sunk cost of switching (C_s), are greater than the expected profits from continuing to produce in sector j plus the termination value of the firm, that is $E(\pi_{is}|\omega_{is}) - C_s > E(\pi_{ij}|\omega_{ij}) \geq T_i$. Given that switching firms have incurred sunk costs when initially setting up production, we expect the sunk costs of switching to a different sector to be less than the sunk cost facing new entrants into that sector.⁷

Firms may also face a shock to productivity as a result of switching activities which they will take into account in making their decision. Profit will depend not only on the firm's productivity relative to other firms in the sector, but also on market conditions in that sector. We assume that market conditions are not fully observed by the firm but are anticipated with varying degrees of success depending on the characteristics of the firm and on the observed (by all firms) sector characteristics. Conditional on continuing production, the firm chooses inputs. We assume that labour is fully flexible and so the firm's only input choice at the beginning of each period is how much to invest in accumulating capital (k).

In sum, the firm's choice of (i) whether to produce; (ii) which sector to produce in; and (iii) what level of inputs to use will depend on the firm's expected profit. This depends on productivity relative to firms in both the same and other sectors, and the firm's level of uncertainty about future market conditions in its own sector versus alternative sectors in the industry.⁸

⁵ Olley and Pakes (1996) and Pavcnik (2002) use a similar conceptual framework to help inform their empirical investigations without deriving a full theoretical model.

⁶ A class of models on the evolution of industry assume that prior to commencing production firms are unaware of what their individual productivity draw will be but will learn this information upon entry (Jovanovic, 1982). Firms will 'learn-by-doing' and will improve their productivity and profitability in each period. In this way the evolution of the firm and the industry depends on the initial unobserved productivity draw. In what follows, we assume that productivity evolves as a first order Markov process, which is consistent with this idea.

⁷ Switching costs could be interpreted as a depletion of capital stock due to, for example, certain machinery or equipment becoming obsolete. Investment in new machinery or equipment, however, would be considered an investment that adds to the firm's capital stock.

⁸ Pavcnik (2002) notes this is consistent with an imperfectly competitive market structure where firm choices are dependent on the actions of other firms in the industry.

The incumbent firm has three options: (i) exit and accept the termination value; (ii) invest in sector j ; or (iii) invest in sector s for a sunk cost C_s . The Bellman equation for the firm's problem is given by equation (1).

$$V_{it}(\omega_{it}, k_{it}) = \max \left\{ \begin{array}{l} T_{it}, \\ \left[\sup_{\Omega_{ijt}, \Omega_{ist}} \left[\begin{array}{l} \pi_{ijt}(\omega_{ijt}, k_{ijt}) - c(i_{ijt}) + \delta E(V_{ijt+1}(\omega_{ijt+1}, k_{ijt+1})) \\ \pi_{ist}(\omega_{ist}, k_{ist}) - c(i_{ist}) - C_s + \delta E(V_{ist+1}(\omega_{ist+1}, k_{ist+1})) \end{array} \right] \right] \end{array} \right\} \quad (1)$$

where c is the cost of investment in capital. Capital accumulates in equation (2) as follows:

$$k_{ijt+1} = (1 - d)k_{ijt} + (1 - S_{ijt})(i_{ijt}) + (S_{ijt})(i_{ist}) - (S_{ijt})(C_s) \quad (2)$$

where $S_{ijt} = 1$ if the firm switches from sector j to sector s in period $t+1$.

As in Olley and Pakes (1996) and Hopenhayn and Rogerson (1993) we assume that productivity evolves according to an exogenous Markov process. The solution to this problem generates an equilibrium strategy for firm decisions to exit, switch and invest, which defines the market structure of the industry.⁹

In addition, the following key predictions emerge:

- i. Switchers will be less productive than incumbents. They face a sunk cost of switching and the information they have regarding their productivity and market conditions will be more specifically related to the sector in which they produce prior to switching.
- ii. Switchers will be more productive than exits. They too would have exited if their expectations about future profitability (which depends on productivity) were less than that of exit firms.
- iii. The extent to which switchers will be more or less productive than entrants is ambiguous. Switchers will have greater knowledge of both their productivity potential and general market conditions and so are likely to have a higher level of productivity than entry firms. However, this will depend on the productivity draw of the entry firm which is assumed to be unknown *a priori*. The sunk costs of switching will be below those of entrants.
- iv. Firm switching depends on observed sector characteristics relative to those of other sectors. This is so given that expectations about future market conditions play an important role in the decision to switch and exit.

3 Empirical approach

3.1 Empirical model

The empirical model for our diagnosis of how firms differ in their probability of switching is given in equation (3), which is followed by a set of general observations and information on how we estimate productivity. We turn to detailed discussions of the various firm-specific, sector-specific, and industry-specific characteristics associated with firm entry, exit and switching in subsequent sub-sections.

⁹ Ericson and Pakes (1995) prove the existence of a Markov Perfect Nash Equilibrium for the case where there is one sector in the industry. We assume that an equilibrium exists within the framework sketched here and use the theoretical predictions to help inform our empirical analysis.

$$Pr(\text{switch_OUT}_{ijt}) = f \left(\begin{array}{c} (\omega_{ijt}, k_{it}/l_{it}, \log(l_{it}), SOE_{it}, FOE_{it}, \text{multiprod}_{it}, \\ \sigma_{\omega_{jt}}, k_{jt}/l_{jt}, \log(l_{jt}), CR_{jt}, FR_{jt}, SR_{jt}, TR_{jt}, EX_{jt}, \\ \gamma_i, \theta_j, \tau_t, \vartheta_p) \end{array} \right) \quad (3)$$

where ω_{ijt} is the productivity of firm i in sector j in period t ; k_{it}/l_{it} is the capital stock of firm i in period t ; $\log(l_{it})$ is the log number of employees of firm i in period t ; SOE_{it} is a dummy indicator for whether the firm i is state-owned in period t ; FOE_{it} is a dummy indicator for whether the firm i is foreign-owned in period t ; multiprod_{it} is a dummy indicator for whether firm i produces more than one product in period t ; $\sigma_{\omega_{jt}}$ is the dispersion in productivity in sector j in period t ; k_{jt}/l_{jt} is the average capital/labour ratio of sector j in period t ; $\log(l_{jt})$ is the average size of firms in sector j in period t ; CR_{jt} is the concentration ratio in sector j in period t ; FR_{jt} is the concentration of foreign-owned firms in sector j in period t ; SR_{jt} is the concentration of state-owned firms in sector j in period t ; TR_{jt} is the tariff rate in sector j in period t ; EX_{jt} is the level of exports of goods from sector j in period t ; γ_i are firm-specific fixed effects; θ_j are sector-specific fixed effects; τ_t are time dummies; and ϑ_p are province fixed effects to control for differences in the location of firms. The inclusion of sector-specific effects controls for any time invariant unobserved differences across sectors that may influence the decision of firms within those sectors, while the inclusion of time dummies controls for general shocks that affect all sectors equally.

We note that the decision to switch into a sector, the decision to exit and the decision to enter are all modelled in a similar fashion, and highlight that the inclusion of firm-specific fixed effects eliminates any time invariant unobserved heterogeneity influencing firms' decisions to enter, exit or switch sectors. As such the identification of the effect of the firm-specific effects (included in the model) comes from the within-firm variation in firm characteristics. It is possible that some time varying factors remain unobserved and so the (i,t) indexed variables are endogenous to firm behaviour, and hence to the switching, entry and exit outcomes. Consequently, we are careful not to claim that our results are causal.

We use an index number approach to estimate total factor productivity for firms in each sub-sector of the manufacturing sector. This approach is similar to that of Aw et al. (2001) who estimated productivity differentials for Taiwanese manufacturing firms.¹⁰ Productivity is measured relative to a reference point which we take as the mean level of productivity in a given sector and year.¹¹ In order to analyse changes in productivity over time we chain link this productivity differential to changes in the reference level of productivity from year to year.

The index is given in equation (4), and we highlight that the TFP measure is sector-specific. This means that the productivity of a firm is compared—in any given time period—relative to the average productivity of the sector.¹²

¹⁰ We only have access to data on the value of inputs and output, so cannot pursue estimating physical productivity measures as suggested in Foster et al. (2008). We acknowledge that our revenue based productivity measure may—as is the case in most previous studies of enterprise dynamics and productivity—confound true efficiency with prices, elasticities and scale economies.

¹¹ We also perform a robustness check where we use the maximum productivity in the sector as the reference point.

¹² We consider both 2-digit and 4-digit levels of aggregation. The 4-digit level of aggregation is complicated by the fact that new 4-digit sectors emerge over the course of the sample period, which prevents linking to the reference productivity level year-on-year. Where this occurs we use the reference productivity level for the 2-digit sector as a whole. The reduced sample which does not use this correction yields very similar results (available on request).

$$\begin{aligned}
\omega_{ijt} = & \left(\ln Y_{ijt} - \overline{\ln Y_{jt}} \right) + \sum_{\tau=2}^t \left(\overline{\ln Y_{jt}} - \overline{\ln Y_{jt-1}} \right) \\
& - \sum_{m=1}^k \frac{1}{2} \left(s_{mijt} + \overline{s_{mjt}} \right) \left(\ln X_{mijt} - \overline{\ln X_{mjt}} \right) \\
& + \sum_{\tau=2}^t \sum_{m=1}^k \frac{1}{2} \left(\overline{s_{mjt}} + \overline{s_{mjt-1}} \right) \left(\overline{\ln X_{mjt}} - \overline{\ln X_{mjt-1}} \right)
\end{aligned} \tag{4}$$

where Y_{ijt} measures output of firm i in sector j year t ; X_{mijt} measures the amount of input m used by the firm; and s_{mijt} measures the expenditure of the firm on input m as a share of the total expenditure of the firm.

We use firm-specific productivity scores to compute a measure of productivity for each sub-sector in each year in equation (5).

$$wpr_{jt} = \sum_{i=1}^n w_{ijt} \omega_{ijt} \tag{5}$$

where $w_{ijt} = \sum_{i=1}^n \left(y_{ijt} / \sum_{i=1}^n y_{ijt} \right)$.

In line with for example Olley and Pakes (1996), this weighted productivity measure can be decomposed as shown in equation (6) into the average unweighted productivity level of each sub-sector $\bar{\omega}_{jt} = \frac{1}{n} \sum_{i=1}^n \omega_{ijt}$ and a term which captures how the allocation of resources within a sub-sector in any given year contributes to productivity.

$$wpr_{jt} = \omega_{jt} + \sum_{i=1}^n (w_{ijt} - \bar{w}_{jt}) (\omega_{ijt} - \bar{\omega}_{jt}) \tag{6}$$

3.2 Firm-specific factors

Our behavioural framework suggests that productivity is critical to firm decision-making since firms evaluate their expected current and future profits on the basis of their own observed productivity level. As such we expect the firm's productivity level to be a first significant factor affecting its decision to stay in production, switch sectors or exit production altogether.¹³ Arguably, entry firms are—as already suggested—likely to be less productive than switchers and incumbents, since they face higher sunk costs than switchers and have less knowledge and expertise, and we expect incumbents to be more productive than switchers for similar reasons.

Second, capital accumulation is a key mechanism for increasing profitability. This suggests that capital-intensive firms should increase profitability over time and so should be less likely to exit and more likely to enter as the industry evolves. Bernard et al. (2006) find that US firms' capital labour ratios are an important determinant in the decision to switch sectors with capital-intensive firms switching to more capital-intensive sectors in response to exposure to competition from labour-intensive countries. In the case of Vietnam where labour-intensive firms arguably have a comparative advantage, we do not expect firms in labour-intensive sectors to have a higher probability of exit.

¹³ Given that there are difficulties in comparing productivity levels across sectors we also consider where the firm ranks in the productivity distribution as an alternative measure.

Third, the link between firm size and probability of survival has long been established as important,¹⁴ and this link could impact the firm's decision to switch sector, with larger firms potentially finding it more difficult to retrain employees. To capture this possibility we include the size of the firm in terms of the number of employees.

Fourth, we believe that ownership structure influences firm decision-making in Vietnam, even when firm productivity, capital intensity and size are controlled for.¹⁵ The political hierarchy still present in Vietnamese state-owned enterprise (SOE) management structures is likely to limit inter-sector dynamics. SOEs are expected to switch sector less frequently as a result. At the same time, the ongoing reform/privatization process has led to the dismantling of many SOEs, so we might expect a positive association between state ownership and firm closure. Foreign-owned enterprises, or enterprises with some foreign participation, are also expected to be more 'locked into' specific sectors due to legal constraints.¹⁶ With further reform of the investment law-making it easier for foreign firms to enter the Vietnamese market it is likely that a positive association between foreign ownership and entry and potentially switching behaviour will emerge.

Fifth, the recent attempts by Bernard et al. (2010) and Goldberg et al. (2008) at explaining productivity-enhancing reallocations through changes in the product mix suggest that multi-product firms will be in a better position to product churn (drop inefficient products to produce more efficient products) in response to changes in the economic environment.¹⁷ These firms may be in a better position to seek productivity-enhancing reallocations from within their product mix rather than through sector switching.¹⁸

3.3 Sector-specific factors

A range of sector-specific measures are considered in establishing the competitiveness of the sector relative to other sectors in the industry.

First, higher levels of average productivity would make it more difficult for firms to compete. Due to difficulties comparing productivity across sectors we also consider a unit-neutral measure of productivity namely the dispersion in the productivity distribution. It is easier to survive in sectors with a larger dispersion in productivity given that low productivity levels

¹⁴ The age of the firm is also an important predictor of firm survival, but our data do not identify this characteristic. In any case, the inclusion of firm-specific fixed effects controls for any initial differences in the survival or switching probability of firms attributable to differences in age at the start of the sample period.

¹⁵ Choices are involved in classifying firms by ownership type and there are 'grey' areas involved in distinguishing between state and foreign-owned firms. This is unavoidable in the type of analysis pursued here. As regards mergers these are very limited in number as this process is just starting in Vietnam. As such merging is of no quantitative significance to our results. In most mergers and acquisitions firms kept at least one business registration licence and one tax code registration. This means that one firm stays in our data as an incumbent and the rest of the merger firms exit. Note also that mergers and acquisitions are often followed by sector switch.

¹⁶ Until recently, foreign and domestic investors were governed by two separate laws: the Law of Foreign Investment and the Law of Domestic Investment. A new investment law came into effect in July 2006 (CIEM, 2006). This law aims at equalizing opportunities for domestic and foreign investors.

¹⁷ Bernard et al. (2010) find that changes in product mix are a potentially important channel for resource reallocation in the US with firms exhibiting a large degree of product churning (dropping inefficient products to produce more efficient products) in response to changes in the economic environment. In a developing country context, Goldberg et al. (2008) find that changes in firms' product mixes in response to regulatory reforms had an important effect on productivity growth in India during the period 1989 to 2003.

¹⁸ The difficulties in measuring the productivity of multi-product firms are highlighted by Bernard et al. (2009). As a robustness check we exclude these firms from our analysis. Our results do not change.

are tolerated. Accordingly, we expect that firms are less likely to leave and more likely to enter sectors with a wider dispersion in the productivity distribution.

Second, the average capital intensity of the sector, as measured by the capital/labour ratio, may be influential. While Audretsch (1991) found that firm survival is much less likely where there is a high capital-labour ratio, Bernard et al. (2006) found that firms switched into more capital intensive sectors when exposed to competitive pressures from imports into labour intensive sectors.

Third, the average size of firms within the sector may affect the firm switching-in decisions. The larger the size of the firms in a sector the more difficult it is for entry and switching firms to compete given the economies of scale already enjoyed by incumbents. As such we expect firms to enter or switch into sectors where firms are smaller on average.

Fourth, the sector concentration ratio (CR), measured here as the ratio of the accumulated revenue of the four largest firms to total revenue in the sector, is likely to be influential given that it is a proxy for the degree of sector competition. Siegfried and Evans (1994) document that a high CR may strengthen collusion efforts among incumbent firms and increase the likelihood of behaviour to prevent entry and maintain higher expected profits. In contrast, Audretsch (1991) has shown that a high CR helps the survival rates of new entrants in the short run. On balance we expect that a high CR reduces firm incentives to move out of (i.e. exit or switch out of) a given sector and is indicative of barriers to entry that prevent firms from entering or switching into a sector.

3.4 Industry-specific factors

Changes in exogenous conditions may 'shock' the behaviour of enterprises leading to different productivity outcomes. Examples include sudden shifts in consumer preferences affecting demand, supply shocks driven by changes in industry structure due to policy reform, new or refined production technologies and trade liberalization. All of these events affect product profitability and are thus likely to affect firm allocation decisions in accordance with our behavioural framework.

We consider explicitly the possibility that trade liberalization, in the form of a tariff reduction (TR), leads to the exit of low productivity firms or the switching of firms to sectors that remain protected. Given that trade liberalization may lead to more opportunities on export markets we also hypothesise that more productive firms will switch to sectors where these opportunities emerge (EX).

It is in the case of Vietnam also of interest to explore the impact that deregulation in the form of privatization of SOEs and the opening up of the market to entry by foreign-owned enterprises may have had on the manufacturing industry.¹⁹ Where an entire industry is undergoing deregulation as is the case in Vietnam, a significant amount of productivity-enhancing reallocations are likely to take place. We expect the dominance of state enterprises (SR) (state-owned enterprise share of total sector output) to play a role in exit and switching decisions. Preferential treatment of SOEs makes it difficult for non-state enterprises to compete and may force more efficient non-state firms to exit (or decide not to enter highly SOE concentrated industries).

At the same time, during the ongoing transition from a planning to a market economy the SOE share of material inputs bought at market conditions may, as suggested by Jefferson and

¹⁹ Olley and Pakes (1996) found that the restructuring of the telecom industry in the USA involved significant entry and exit with post-deregulation productivity improvements being mostly attributable to the reallocation of capital toward more productive firms. Similar results have been found for other sectors such as the US banking sector, for example (Stiroh and Strahan, 2003). Elsava et al. (2004) find that market reforms lead to reallocations away from low productivity firms to high productivity firms resulting in aggregate productivity gains.

Rawski (1994) in the case of China, increase the attractiveness of highly SOE concentrated industries for smaller (private) enterprises acting as producers of intermediates for SOEs. Another dimension is that the deregulation of SOEs may increase competition in a sector due to the decline in the level of protection and barriers to entry and may induce firms to switch to other sectors.

Similar arguments apply when considering the dominance of foreign enterprises (FR) (foreign enterprise share of total sector output). Aitkin and Harrison (1999) emphasise that preferential treatment of foreign-owned firms may distort competition and force (equally efficient) domestically owned counterparts out.²⁰ However, one reason why governments grant special treatment is to promote technology transfer, and new products and/or production processes introduced by foreign firms may indeed spill-over to domestic firms. Diffusion can also occur through labour turnover, so a high presence of foreign enterprises in a particular sector may attract domestic firms. In sum, whether FR is positively or negatively related to sector switching and firm exit depends on which of the above effects dominate (competition versus technology transfer).²¹

4 Data

Our data originate from the 2001–08 Enterprise Surveys collected annually by the General Statistics Office of Vietnam and include the population of all registered enterprises with 30 employees or more and a representative sample of smaller firms.²² We include all firms whose main enterprise is in the manufacturing sector.²³ Our sample therefore includes almost 31,000 firms.

Table 1 presents the numbers of firms included in our dataset in each sector in each year and the sample of manufacturing firms used in our analysis for which a complete set of information is available.²⁴

Table 2 illustrates the extent of diversification within the manufacturing sector. First, we present the number of 4-digit sub-sectors within each 2-digit sector which varies considerably across sectors. We do not have data to examine product diversification at the 6-digit level, as in Bernard et al. (2010) and Goldberg et al. (2008). However, we can tell whether firms produce more than one product and find that between 5 to 17 per cent of manufacturing firms do so. For these firms diversification across product mix is a potential source of productivity growth that we cannot capture in our analysis.

We use both 2-digit and 4-digit classifications of economic activity and switching behaviour in our analysis. While Bernard et al. (2006) focus exclusively on 4-digit switching we find

²⁰ Evidence for Venezuela suggests that once sector-specific effects are controlled for, domestic firms perform worse as foreign dominance in a sector increases (Tybout, 2000).

²¹ Foreign enterprises may also create a basis for domestically owned firms to produce intermediate inputs as in the case of SOEs. Therefore, inter-industry spillovers from FDI may occur. Javorcik (2004) finds evidence of backward linkages for Lithuania while Alfaro and Rodriguez-Clare (2004) find similar evidence for Venezuela, Brazil and Chile.

²² Trade and tariff data are from the World Integrated Trade Solutions database. Trade data at the 4-digit (2-digit) level for Vietnam with the rest of the world are taken from the UN COMTRADE database. Tariff data refer to the 4-digit (2-digit) weighted average Most Favoured Nation tariff applied to imports collected from the UNCTAD-TRAINS database for all imports into Vietnam

²³ Given that only a representative sample of small firms is included it is possible that the entry, exit and switching behaviour of small firms is not fully observed. As a robustness check we also analyse firms with 30 employees or more.

²⁴ We use both 2-digit and 4-digit classifications of economic activity in our analysis and slightly different samples are available depending on which classification we use.

that for Vietnam a large amount of switching occurs, even at more aggregated levels. Table 2 highlights the significant extent of enterprise dynamics within each 2-digit manufacturing sector. This is consistent with much of the existing literature on firm dynamics which finds a positive correlation between exit and entry rates at the sector level.²⁵ We also see a very high level of switching behaviour at both the 2-digit and 4-digit level across sectors ranging from 1 to 19 percent of firms when switching is defined at the 2-digit level and from 12 to 50 percent when switching is defined at the 4-digit level.

To place the extent of switching behaviour in Vietnam in context, Bernard et al. (2006) found that approximately 8 percent of US manufacturing firms switched activity (defined at the 4-digit level) during 5-year periods between 1977 and 1997. The fact that switching is much more prevalent in Vietnam reflects in our assessment an evolving industrial sector where new opportunities emerge due to deregulation and trade liberalization, as well as due to ongoing structural transformation. The extent of switching behaviour observed adds further weight to our view that the effects of switching on productivity should be decomposed from the effects due to standard exit/entry; and that a better understanding of the drivers behind switching is potentially rewarding from the perspective of designing effective economic policy.

As discussed in Section 3, our empirical model includes a range of firm- and sector-specific factors. Summary statistics are provided in Appendix A1. Before proceeding in Section 5 to estimating our empirical model we explore the mean difference in each sector-specific characteristic before and after a firm switches sector to establish *a priori* whether there is a clear pattern to switching behaviour in the raw data. The results are presented in Table 3. Statistically significant sector-specific differences emerge when comparing the sector characteristics of switching firms before and after they switch sectors. With the exception of sector level productivity, these differences hold when switching and sector-specific characteristics are defined at the 2-digit or 4-digit level. We also find some evidence to suggest that firms move into sectors where they are more likely to be able to compete. For example, firms switch into sectors with smaller average firm size and with lower concentration ratios. They also switch into sectors with lower levels of concentration of state-owned enterprises suggesting that firms may be pushed out of these sectors or, alternatively, find better opportunities available in other sectors. In contrast, we find that firms switch into sectors with high levels of foreign-owned enterprises that are more export-intensive. This suggests that these sectors may have better opportunities for firms.

In contrast to the Bernard et al. (2006) findings for US manufacturing firms it appears that firms switch into more labour-intensive sectors. This is consistent with the view that Vietnam has a competitive advantage in labour-intensive production and that firms are reacting to new opportunities for exports from these sectors. In contrast to our expectations we find that firms switch into sectors with lower tariffs suggesting that they are not deterred by the increased competitive pressures from imports. Finally, we find that firms switch into sectors where average productivity levels are lower, but this result only holds for the 4-digit measure of productivity and switching.

5 Empirical results

²⁵ Dunne et al. (1988) and Disney et al. (2003) find a high level of correlation between entry and exit rates within the US and UK manufacturing industries, respectively. Roberts and Tybout (1996) find similar evidence in a developing country context.

5.1 Productivity growth

We first estimate productivity for each sub-sector of the manufacturing industry.²⁶ Table 4 presents the trend in productivity by sector from 2001 to 2008 computed using the index number approach outlined in Section 3.²⁷ The contribution of firm turnover (including firm exit, entry and switching) to productivity is captured by the covariance between output and productivity. It is clear that the reallocation of market share from less to more productive activities is an important component of productivity growth. On average the reallocation component of productivity accounts for 40 percent of total productivity growth ranging from 9 to 137 percent, depending on the sector and the year.²⁸

To determine whether switching is economically important we must, next, compare productivity between incumbents, entrants, exits and switchers. This involves assessing productivity performances across sectors. This is not straightforward. Relying on productivity *levels* is not appropriate given that in the construction of the productivity index firms are positioned relative to the average within the sector, making comparisons across sectors impossible to interpret.

To overcome this challenge, we rank the productivity performance of each firm within each sector and average this ranking across the lifetime of the firm. We then perform simple t-tests of the difference between incumbent, switching, entry and exit firms in terms of their average productivity ranking. The results are presented in Table 5 for productivity estimated using the index number approach both at the 2-digit and 4-digit level. For the former measure, switching is also defined at the 2-digit level, while for the latter it is defined at the 4-digit level. Each firm in the sample is counted once for the purpose of these tests.

We find that incumbent firms rank higher in the productivity distribution than entry and exit firms on both the 2-digit and 4-digit productivity measure, and this is so both when switchers are included with incumbents and when they are excluded. We also find that entry firms rank higher than exit firms for the duration of their survival in the panel. This is consistent with the extensive literature cited above which emphasises resource reallocations involving the exit and entry of firms into sectors as an important source of productivity growth.

Our behavioural framework predicts that due to information advantages switchers will be more productive than entry and exit firms, but less productive than incumbents given that the latter will have more information about the sector they are producing in than firms that have just switched into that sector. Our results show that switchers rank higher in terms of productivity than entry and exit firms, suggesting that switching firms are indeed a separate important source of productivity growth. We also find that incumbents have a higher productivity ranking than switchers, consistent with our theoretical predictions.²⁹

²⁶ The input and output variables used in the construction of the productivity indices are summarized in Appendix A2.

²⁷ The figures presented are computed based on a 2-digit level of aggregation but the results are very similar when productivity is first measured at the 4-digit level and then aggregated to the 2-digit level. As a further robustness check we have estimated productivity using the Olley and Pakes (1996) approach for each 2-digit sub-sector. A very similar trend in productivity and disaggregation among the components of the index is found. Missing data on investment levels leads to a reduced sample when this approach is used. The results are available on request. The magnitude of the productivity estimates is neither directly interpretable, nor comparable across sectors. The focus should be on the trend over time and the importance of the reallocation component to overall productivity growth.

²⁸ In many sectors pure productivity improvements are also an important component of growth.

²⁹ Comparing productivity *levels* across groups of firms leads to the same conclusions. Results are available on request.

5.2 Switching behaviour

Having established that sector switching is important for productivity growth we focus in the remainder of the empirical analysis on exploring switching behaviour.

Our behavioural model predicts that, conditional on firm-specific productivity, profitability and other characteristics, firms will base their exit and switching decisions on their expectations about future profitability and opportunities, both within the sector they are producing and in other sectors within the industry. In our empirical model we measure these expectations using observed sector characteristics relative to those of other sectors in the industry. Accordingly, we include sector-specific fixed effects, and this approach implies that the effect of sector-specific characteristics on firms' decisions is identified through the between sector variation in these observed characteristics. The mechanism through which sector-specific factors impact on the firm's decision making process is through the information it provides about market conditions in one sector relative to another.

To ascertain the importance of the above factors we rely on the model given in equation (3). We first include firm-specific factors along with firm-specific fixed effects, sector, province and time controls, and next we expand the model to include sector-specific factors, reflecting the extent to which regulatory reform and trade liberalization has induced entry, exit and switching behaviour.

The first set of results relate to the decision of firms to switch into a particular sector. We present the results for the decision to switch out of a particular sector alongside these results since the former will identify the sector-specific pull factors affecting switching while the latter identifies the sector-specific push factors. The results for the 2-digit classifications of switching and the sector-specific variables included are presented in Table 6a while those for the 4-digit classification are shown in Table 6b.

The firm-specific factors associated with switching behaviour are largely the same, independently of whether the 2-digit or 4-digit classification is used. Switching firms rank higher in the productivity distribution of the sectors they switch into than other firms; and they rank below incumbents and other firms in the sectors they switch out of. This provides evidence that firms, which switch sectors, manage to improve their relative performance, and it suggests that our theoretical prediction seems to hold, i.e. that switching sectors to exploit profitable opportunities is a viable alternative to exiting production. It should be noted, however, that this depends on the assumption that relative productivity is a good indicator of profitability.

We also find that switching firms tend to be larger than other firms in the sectors they switch into and smaller than the firms in the sectors they switch out of.³⁰ Given that much of the literature suggests a positive association between size and survival probability, this finding indicates that firms switch to sectors where they are larger than other firms and therefore will survive longer. There is also evidence in our results that switchers tend to have a lower capital-labour ratio than non-switching firms. This means that labour intensive firms are more likely to be switchers than capital-intensive firms. Moreover, there is evidence that multi-product firms are less likely to switch. This is in accordance with recent literature including Bernard et al. (2010) and Goldberg et al. (2008), which shows that multi-product firms have the potential to change their product mix in response to changing market conditions without switching sector.

The observed characteristics of sectors that are statistically important vary depending on whether switching is defined at the 2- or the 4-digit level. Focusing, first, on the 2-digit definition (Table 6a) we find that firms are more likely to switch into sectors with larger firms (on average), a greater concentration of foreign-owned firms, but lower concentration

³⁰ Dunne et al. (1988) find that firms that diversify into other industries are larger than new entrants and so are less likely to fail. Our findings are consistent with this result.

ratios in general. This is contrary to our initial expectations about the direction of the relationship between these sector-specific factors and firm behaviour presented in Section 3. We expected firms to be deterred from switching into sectors where firms are on average larger given the potential economies of scale advantage that incumbents might enjoy. However, given our earlier result that switchers are more likely to be labour-intensive firms it is not really surprising that they switch into labour-intensive sectors.

Furthermore, it was also expected that a high CR might reduce firms' incentives to move out of a sector, but we find the opposite to be the case. That is, firms switch out of sectors with higher concentration ratios. This suggests that firms are more likely to switch into sectors that are more competitive than the ones they leave meaning that switching firms may seek out sectors that are less subjected to regulation.

Our literature review also led us to expect that firms would avoid sectors with a dominance of foreign enterprises (Aitkin and Harrison, 1999; Tybout, 2000). Instead we find that firms switch out of sectors with low levels of foreign ownership and into sectors with high levels of foreign ownership. This is indicative of a general move by firms toward more competitive sectors, and opens up for the possibility that the presence of learning spill-over effects and technology diffusion tend to make a sector attractive to domestic enterprises.

The behaviour of switching firms may also be explained, in part, by the ongoing process of structural change that took place in Vietnam over the time frame of the present analysis which opened up new competitive opportunities in many sectors. Nevertheless, Vietnamese firms are less likely to switch out of sectors with a high concentration of state ownership. This suggests that rigidities remain within parts of the manufacturing sector as a whole and prevent further productivity improvements from being realized.

Finally, in relation to trade liberalization, firms appear to switch into 2-digit sectors with low levels of export intensity relative to other 2-digit sectors and switch out of sectors with low tariff levels relative to other 2-digit sectors. This suggests that at an aggregate level firms are deterred from switching into sectors with high levels of trade exposure and choose to switch out of sectors that are more exposed to competition as a result of the ongoing process of tariff reductions. In sum, when we consider the 2-digit level of aggregation, the process of market liberalization appears to encourage firms to switch to more competitive sectors while trade liberalization has the opposite effect.

When switching is defined at the 4-digit level different sector-specific drivers emerge as being important. In particular, we find that many sector-specific factors are similar pre- and post-switching suggesting that switching at the 4-digit level is between sectors with similar characteristics. For example, firms appear to switch between high productivity sectors and between sectors where firms are in general larger in terms of the number of employees. Given that our analysis is set in a developing country context where labour costs are relatively low, coupled with the evidence that firms are more likely to switch into sectors with low capital-labour ratios, it is not surprising that our analysis shows that firms are switching into sectors where they can potentially exploit low labour cost advantages.

In relation to the market structure variables, and in contrast to the results for 2-digit switching, we find that at the 4-digit level switching is less likely to occur in sectors with a large proportion of foreign and state-owned firms. We also observe that firms are more likely to switch into sectors with low concentration ratios meaning that they are not deterred by competition. Further support for this is the fact that we find strong evidence to suggest that firms switch into sectors with low tariff levels and out of sectors with high tariff levels and low levels of trade exposure. When considered alongside the results at the 2-digit level this means that at an aggregate level firms will make significant changes to the nature of their production to protect themselves against increased competition, while they are willing to switch to a different 4-digit sector to exploit potential opportunities that trade reform may afford.

5.3 Firm entry and exit

Table 7 presents the results of our empirical model describing the entry and exit decisions of firms in our data. Sector characteristics are aggregated at the 2-digit level but results are very similar at the 4-digit level.³¹

Dunne et al. (1988) find a significant amount of heterogeneity in the characteristics of entry firms in the US manufacturing sector. This is also the situation for Vietnam. In the case of firm-specific factors our results show that entry firms have lower productivity levels than incumbents and firms that switch into a sector. They are more capital intensive, and consistent with this observation, are of a smaller size in terms of the number of employees than other firms. Entry firms are more likely to be private domestic firms as opposed to state-owned firms or foreign-owned firms. This reflects deregulation of the manufacturing sector over the period of the analysis, which opened up many new opportunities for private domestic firms.

There is also some evidence that entry firms are more likely to be multi-product firms, which means that a new type of more flexible enterprise seems to have emerged over the period under study. Consistent with the literature on firm survival, smaller firms are, according to our analysis, more likely to exit production. Exit is associated in a statistically significant way with state ownership, rooted in the ongoing reform process discussed by CIEM (2003). It is clear from this analysis that the firm-specific characteristics of entry and exit firms are very different from those of switching firms.

In sum, our entry and exit results are consistent with the existing literature on industry evolution, but our expanded analysis identifying switching as separate from exit and entry points to a dimension that has so far gone completely unexplored in developing country contexts.

Further differences are embedded in sector-specific characteristics. Our results show that firms are more likely to enter sectors with high concentration ratios, which is consistent with the Audretsch (1991) finding that a high CR may help the survival rates of new entrants in the short run. Meanwhile firms are also less likely to enter sectors with a high concentration of foreign-owned firms, consistent both with our finding for switching firms (4-digit) and the idea that preferential treatment of foreign-owned firms may distort competition deterring domestic firms from entering into sectors with a high foreign presence, as suggested by Aitkin and Harrison (1999) and Tybout (2000). Finally, we find that firms are less likely to enter sectors with high tariff levels, meaning that barriers to entry may exist in these sectors.

5.4 Robustness checks

First, we consider a sub-set of data focusing in particular on large manufacturing firms (above 30 employees) for which we have a full population of firms. Second, we consider a sub-sample of private firms. Third, we exclude all multi-product firms given that measuring productivity is complicated for firms that produce more than one product. Fourth, we exclude firms that exit and re-enter the sample. Fifth, we consider two alternative measures of productivity, as discussed in Section 3, namely an index number approach based on a relative measure of productivity, which compares firms with the best producing firm in a sector, and a measure constructed using the Olley and Pakes (1996) semi-parametric approach to productivity measurement. The results for these six alternative specifications are presented in Table 8.

The most consistent findings across all specifications are that switching firms (i) have a lower capital labour ratio than other firms, (ii) are larger in terms of number of employees, (iii) are

³¹ These results are not shown but are available on request.

unlikely to be multi-product firms, (iv) switch between high productivity sectors,³² (v) are more likely to switch into sectors with low capital to labour ratios,³³ and (vi) are more likely to switch into sectors with low tariff levels and out of sectors with low levels of export intensity.

6 Conclusion

The point of departure of this paper was the observation that while sector switchers are likely to have different characteristics and behaviour from ‘real’ exit and entry firms, this has never been studied and established empirically in developing country contexts. Arguably, this is an important omission in the existing literature on firm dynamics, and our understanding of the productivity impacts of firm turn-over and resource reallocations at both firm- and sector levels.

To help motivate and frame our empirical investigation of switching we adapted a behavioural framework based on Ericson and Pakes (1995), and proceeded to identify a list of key predictions about the productivity impact of switching. We also specified our detailed empirical model.

Data for our case study, focusing on sector switching in the manufacturing sector, originate from the 2001 to 2008 Enterprise Surveys collected annually by the General Statistics Office (GSO) of Vietnam. On this basis we have been fortunate to distil a unique panel dataset covering a very large number of manufacturing firms, including almost 31,000 firms for which complete information is available.

We found solid evidence that the reallocation of resources within and across sectors accounts for a significant proportion of total productivity growth in the Vietnamese manufacturing sector in the period studied, but also that firm switchers make an important contribution to these reallocations. They are indeed more productive than both entrants and exits, and firms which switch sector improve their productivity ranking on average, while entry firms rank lower in the productivity distribution.

Our analysis also revealed that switching firms have different characteristics to entry and exit firms and appear to be motivated by different sector-specific factors. For example, switching firms have a lower capital to labour ratio than entry firms, and firms which switch tend to be larger than firms in the sector they switch into, while entry firms tend to be smaller than other firms in the sector. Another insight is that multi-product firms are less likely to switch sectors. Deregulation and privatization induces switching behaviour at an aggregate level with firms switching into more competitive sectors, but switching at a disaggregate level occurs across similar sectors in terms of market structure. Finally, trade liberalization is positively associated with switching behaviour. At an aggregate level firms have switched from sectors exposed to trade into more protected sectors; while at a disaggregate level firms are more likely to switch into sectors with opportunities to trade.

Our analytical framework and empirical insights could, in our assessment, serve as a useful starting point for similar analyses in other developing countries and help inspire the necessary redesign of enterprise surveys across the developing world. Getting the respective contributions of entry, exist and switching firms to productivity growth right has important analytical and policy implications, but at this stage empirical evidence is almost non-existent.

³² One exception to this is when productivity is measured relative to the benchmark of the best performing firm. In this case our results suggest the firms switch out of low productivity sectors into high productivity sectors.

³³ The only exception to this finding is for the sub-sample of large firms which are more likely to switch into high capital intensive sectors.

For Vietnam we conclude that: (i) there is a much more complex story of firm dynamics underlying the robust economic progress achieved in this dynamic East Asian economy than inherent in standard firm exit and entry explanations, (ii) firms have in practice adjusted to changing circumstances in sometimes innovative but not always easily predictable ways, (iii) government policy (including trade, information, credit, training and other support programmes as well as the development of the legal framework for business sector development) should pay careful attention to both the potential for productivity-enhancing reallocations through sector switching as well as the need to avoid that firms are motivated to switch into sectors that are not associated with comparative advantage.

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Table 1: Panel attrition

	Total	Agriculture	Manufacturing	Services	Sample (2-digit)	Sample (4-digit)
2001	56,295	4,255	13,142	38,898	9,858	9,858
2002	62,510	4,218	14,654	43,638	11,581	11,583
2003	71,479	3,381	16,746	51,352	13,239	13,241
2004	91,139	3,510	20,341	67,288	15,739	15,750
2005	112,251	3,674	23,836	84,741	18,664	18,668
2006	129,165	3,695	26,131	99,339	21,824	21,830
2007	155,432	4,113	30,922	120,397	24,301	24,305
2008	205,396	10,779	38,269	156,348	30,867	30,869

Note: Sector allocation refers to enterprises' main activity.

Source: authors' calculations.

Table 2: Sector diversification and dynamics

	Number of 4- digit sub- sectors	% multi- product	% exits	% entrants	% switch (2-digit)	% switch (4-digit)
15 Food products and bev.	23	10.83	49.63	68.35	1.04	12.96
16 Tobacco products	2	19.05	42.86	33.33	2.38	57.14
17 Textiles	13	8.26	46.06	78.01	8.99	28.40
18 Wearing apparel	9	5.09	53.35	84.36	6.09	21.18
19 Tanning/dressing leather	8	7.98	48.02	74.98	10.61	29.12
20 Wood and wood products	10	12.79	53.04	81.08	10.38	22.54
21 Paper and paper products	3	9.10	48.15	77.67	6.49	23.90
22 Publishing, printing, etc	9	5.06	49.70	88.55	5.17	15.03
23 Coke, refined petroleum	7	7.14	55.71	82.86	11.43	27.14
24 Chemicals and chem. prod.	11	11.47	47.92	78.59	6.13	14.81
25 Rubber and plastics	8	8.47	42.22	80.86	10.56	28.67
26 Other non-metallic mineral	15	16.77	49.64	68.97	3.71	15.72
27 Basic metals	11	16.58	44.19	81.80	11.22	35.09
28 Fabricated metals	8	10.10	48.90	86.84	8.74	26.18
29 Machinery and equipment	17	9.40	48.52	81.31	19.36	32.90
30 Office equipment	7	6.09	61.74	93.91	7.83	23.48
31 Electrical machinery	24	12.12	51.01	79.60	15.15	38.89
32 Radio, television, etc	9	7.23	51.98	82.10	10.33	29.95
33 Medical, precision and opt.	9	7.48	47.64	80.31	13.78	23.23
34 Motor vehicles, transport	13	13.58	57.21	72.96	18.87	32.21
35 Other transport equip.	14	17.78	46.58	73.69	11.02	35.24
36 Furniture	20	9.86	52.78	82.98	12.55	25.96
37 Recycling	7	10.96	42.47	90.41	17.81	26.71

Note: Statistics are based on all enterprises operating in 2008 whose main output was in the manufacturing sector at some stage between 2001 and 2008.

Source: authors' calculations.

Table 3: t-tests of differences in sector characteristics before and after switching

	Number of observations	Mean difference before and after switch	t-statistic (difference = 0)	P-value
2-digit measure				
WTFP	4,488	0.004	1.596	0.111
lnKL	6,251	-0.032	-6.384	0.000
Size	6,251	-0.067	-8.716	0.000
CR	6,251	-0.008	-4.722	0.000
FR	6,249	0.015	4.828	0.000
SR	6,171	-0.031	-13.267	0.000
Tariff	5,207	-0.011	-5.044	0.000
Exports	5,207	0.263	17.755	0.000
	Number of observations	Mean difference before and after switch	t-statistic (mean = 0)	P-value
4-digit measure				
WTFP	16,652	-0.156	-52.775	0.000
lnKL	22,585	-0.044	-17.683	0.000
Size	22,583	-0.042	-11.347	0.000
CR	22,473	-0.020	-14.362	0.000
FR	21,873	0.015	10.900	0.000
SR	20,620	-0.033	-24.318	0.000
Tariff	13,448	-0.009	-5.737	0.000
Exports	13,450	0.381	21.972	0.000

Source: authors' calculations.

Table 4: Weighted productivity estimates and decomposition (manufacturing sample)

Activity 15	n	Weighted	Covariance	Activity 17	n	Weighted	Covariance
2001	2,722	0.173	0.115	2001	385	0.299	0.093
2002	2,962	0.198	0.123	2002	471	0.301	0.118
2003	3,046	0.215	0.140	2003	551	0.643	0.120
2004	3,280	0.494	0.149	2004	635	0.495	0.127
2005	3,665	0.530	0.163	2005	784	0.528	0.117
2006	4,383	0.587	0.162	2006	957	0.601	0.179
2007	4,506	0.385	0.153	2007	1,058	0.373	0.124
2008	5,306	0.721	0.142	2008	1,293	0.288	0.086
Activity 18	n	Weighted	Covariance	Activity 19	n	Weighted	Covariance
2001	524	0.413	0.144	2001	236	0.203	0.098
2002	766	0.487	0.172	2002	290	0.258	0.165
2003	934	0.363	0.156	2003	316	0.281	0.095
2004	1,206	0.466	0.166	2004	395	0.360	0.130
2005	1,320	0.537	0.149	2005	453	0.389	0.072
2006	1,548	0.525	0.150	2006	441	0.479	0.109
2007	1,783	0.338	0.096	2007	524	0.340	0.106
2008	2,580	0.568	0.071	2008	659	0.387	0.039
Activity 20	n	Weighted	Covariance	Activity 21	n	Weighted	Covariance
2001	726	0.116	0.117	2001	431	0.106	0.074
2002	818	0.173	0.111	2002	494	0.187	0.072
2003	914	0.486	0.104	2003	596	0.241	0.074
2004	1,096	0.354	0.111	2004	689	0.210	0.087
2005	1,261	0.440	0.113	2005	871	0.261	0.089
2006	1,440	0.387	0.087	2006	960	0.185	0.077
2007	1,755	0.411	0.100	2007	1,033	0.257	0.085
2008	2,366	0.554	0.091	2008	1,301	0.598	0.062
Activity 22	n	Weighted	Covariance	Activity 24	n	Weighted	Covariance
2001	335	0.249	0.136	2001	428	0.277	0.101
2002	454	0.269	0.182	2002	509	0.321	0.142
2003	580	0.581	0.190	2003	598	0.538	0.149
2004	820	0.497	0.202	2004	688	0.579	0.189
2005	1,023	0.536	0.182	2005	840	0.673	0.200
2006	1,564	0.466	0.170	2006	1,026	0.563	0.200
2007	1,457	0.310	0.182	2007	1,120	0.442	0.167
2008	1,890	0.754	0.139	2008	1,376	0.674	0.155
Activity 25	n	Weighted	Covariance	Activity 26	n	Weighted	Covariance
2001	525	0.154	0.077	2001	1,051	0.679	0.672
2002	683	0.182	0.104	2002	1,069	0.336	0.257
2003	769	0.420	0.096	2003	1,122	0.476	0.232
2004	971	0.371	0.105	2004	1,282	0.547	0.206

2005	1,222	0.499	0.105	2005	1,425	0.587	0.206
2006	1,427	0.404	0.098	2006	1,479	0.558	0.182
2007	1,664	0.185	0.082	2007	1,641	0.462	0.187
2008	2,000	0.556	0.051	2008	2,004	0.667	0.178
Activity 27	n	Weighted	Covariance	Activity 28	n	Weighted	Covariance
2001	142	0.180	0.139	2001	725	0.157	0.133
2002	185	0.299	0.130	2002	941	0.182	0.133
2003	223	0.329	0.115	2003	1,239	0.395	0.122
2004	267	0.363	0.096	2004	1,611	0.405	0.111
2005	351	0.408	0.082	2005	2,057	0.473	0.119
2006	388	0.331	0.093	2006	2,551	0.367	0.114
2007	510	0.363	0.111	2007	3,009	0.294	0.101
2008	634	0.090	0.079	2008	3,984	0.495	0.091
Activity 29	n	Weighted	Covariance	Activity 31	n	Weighted	Covariance
2001	264	0.296	0.088	2001	167	0.179	0.087
2002	342	0.306	0.115	2002	195	0.110	0.118
2003	404	0.285	0.125	2003	238	0.530	0.123
2004	466	0.604	0.130	2004	316	0.673	0.207
2005	559	0.451	0.125	2005	372	0.335	0.130
2006	628	0.439	0.136	2006	398	0.204	0.132
2007	758	0.337	0.125	2007	385	0.251	0.110
2008	887	0.279	0.091	2008	498	0.764	0.076
Activity 32	n	Weighted	Covariance	Activity 33	n	Weighted	Covariance
2001	76	0.280	0.109	2001	37	0.408	0.089
2002	101	0.299	0.213	2002	49	0.428	0.066
2003	125	0.471	0.206	2003	53	0.213	0.048
2004	151	0.378	0.246	2004	60	0.595	0.119
2005	169	0.664	0.201	2005	83	0.249	0.163
2006	187	0.578	0.150	2006	95	0.245	0.091
2007	229	0.249	0.133	2007	101	0.551	0.096
2008	299	0.395	0.227	2008	125	0.450	0.111
Activity 34	n	Weighted	Covariance	Activity 35	n	Weighted	Covariance
2001	182	0.214	0.293	2001	250	0.358	0.184
2002	222	0.249	0.267	2002	298	0.303	0.175
2003	222	0.568	0.269	2003	344	0.521	0.200
2004	247	0.426	0.219	2004	363	0.529	0.207
2005	301	0.625	0.193	2005	452	0.587	0.195
2006	239	0.514	0.146	2006	452	0.483	0.179
2007	275	0.331	0.164	2007	558	0.483	0.195
2008	348	0.446	0.178	2008	618	0.914	0.141
Activity 36	n	Weighted	Covariance				
2001	601	0.175	0.132				
2002	679	0.307	0.208				

2003	901	0.618	0.130
2004	1,118	0.512	0.141
2005	1,373	0.515	0.123
2006	1,552	0.475	0.097
2007	1,793	0.405	0.110
2008	2,510	0.542	0.090

Note: Sectors 16, 23, 30 and 37 are excluded due to the small number of firms that operate in these sectors.

Source: authors' calculations.

Table 5: t-tests of differences in productivity rankings

2-digit productivity measure	Number of observations	Average rank in productivity distribution	t-statistic (Difference = 0)	P-value
Incumbents (incl. switcher)	6,683	0.572		
Entry firms	38,891	0.415	47.363	0.000
Incumbents (excl. switcher)	2,936	0.570		
Entry firms	38,891	0.415	32.478	0.000
Incumbents (incl. switcher)	6,683	0.572		
Exit firms	22,217	0.398	50.341	0.000
Incumbents (excl. switcher)	2,936	0.570		
Exit firms	22,217	0.398	35.619	0.000
Entry firms	21,896	0.438		
Exit firms	22,217	0.398	16.916	0.000
Entry firms	39,775	0.427		
Switch firms	4,486	0.450	-5.751	0.000
Exit firms	26,559	0.422		
Switch firms	4,486	0.450	-6.790	0.000
Incumbent firms	11,535	0.505		
Switch firms	4,486	0.450	12.344	0.000
4-digit productivity measure	Number of firms	Average rank in productivity distribution	t-statistic (Difference = 0)	P-value
Incumbents (incl. switcher)	6,683	0.576		
Entry firms	38,904	0.416	47.714	0.000
Incumbents (excl. switcher)	2,936	0.567		
Entry firms	38,904	0.416	31.229	0.000
Incumbents (incl. switcher)	6,683	0.576		
Exit firms	22,225	0.397	50.626	0.000
Incumbents (excl. switcher)	2,936	0.567		
Exit firms	22,225	0.397	34.300	0.000
Entry firms	21,901	0.440		
Exit firms	22,225	0.397	18.156	0.000
Entry firms	31,186	0.411		
Switch firms	13,088	0.479	-25.507	0.000
Exit firms	17,967	0.393		
Switch firms	13,088	0.479	-29.459	0.000
Incumbent firms	2,936	0.567		
Switch firms	13,088	0.479	16.691	0.000

Source: authors' calculations.

Table 6a: Determinants of switching—2-digit definition

	<i>Switch IN</i>				<i>Switch OUT</i>			
<i>Firm-specific</i>								
Productivity	0.001 (0.001)	0.003 (0.003)	0.003 (0.003)		-0.002 (0.001)	-0.004 (0.003)	-0.003 (0.003)	
Rank productivity				0.010** (0.005)				-0.013*** (0.005)
lnK/L	-0.003** (0.001)	-0.003** (0.001)	-0.003*** (0.001)	-0.003** (0.001)	0.0002 (0.001)	0.0002 (0.001)	-0.001 (0.001)	-0.001 (0.001)
Size	0.005** (0.002)	0.005** (0.002)	0.004* (0.002)	0.003* (0.002)	-0.004** (0.002)	-0.004** (0.002)	-0.004* (0.002)	-0.003* (0.002)
State-owned	-0.003 (0.007)	-0.003 (0.007)	-0.005 (0.007)	-0.005 (0.007)	-0.003 (0.006)	0.001 (0.007)	0.001 (0.006)	0.0003 (0.006)
Foreign-owned	0.009 (0.026)	0.009 (0.026)	0.007 (0.026)	0.007 (0.026)	0.011 (0.026)	0.013 (0.026)	0.010 (0.027)	0.009 (0.027)
Multi-product	0.004 (0.004)	0.004 (0.004)	0.007* (0.004)	0.006* (0.004)	-0.008** (0.004)	-0.008** (0.004)	-0.008** (0.004)	-0.007** (0.004)
<i>Sector-specific</i>								
Productivity ^Ω		0.009 (0.008)	0.004 (0.008)			-0.022*** (0.008)	-0.029*** (0.009)	
IQR productivity ^Ω				0.005 (0.004)				-0.009* (0.005)
lnK/L ^Ω		0.004 (0.016)	0.012 (0.017)	0.013 (0.017)		0.062*** (0.016)	0.047*** (0.017)	0.048*** (0.017)
Size ^Ω		0.024*** (0.009)	0.019** (0.009)	0.021** (0.009)		-0.034*** (0.008)	-0.033*** (0.008)	-0.032*** (0.008)
CR ^Ω		-0.063 (0.043)	-0.112** (0.047)	-0.107** (0.045)		0.184*** (0.042)	0.214*** (0.046)	0.195*** (0.046)
FR ^Ω		0.155*** (0.035)	0.154*** (0.037)	0.151*** (0.036)		-0.079** (0.033)	-0.068** (0.034)	-0.050 (0.033)
SR ^Ω		-0.041 (0.025)	-0.027 (0.028)	-0.029 (0.028)		-0.142*** (0.027)	-0.151*** (0.029)	-0.146*** (0.029)
Tariff level ^Ω			0.012 (0.019)	0.013 (0.019)			-0.061** (0.024)	-0.048** (0.023)
Export intensity ^Ω			-0.005* (0.003)	-0.006* (0.003)			0.007** (0.003)	0.007** (0.003)
Observations	136,204	135,978	128,844	128,844	115,195	114,908	108,877	108,877
Firms	49,394	49,358	47,517	47,517	39,809	39,764	38,573	38,573

Note: Robust standard errors reported in parenthesis. *, **, *** indicate significance at a 10%, 5% and 1% level, respectively.

^Ω Average for each 2-digit sector except IQR which is the inter-quartile range for the 2-digit sector.

All models include firm, sector (2-digit), time and provincial fixed effects.

Source: authors' calculations.

Table 6b: Determinants of switching—4-digit definition

	<i>Switch IN</i>				<i>Switch OUT</i>			
<i>Firm-specific</i>								
Productivity	0.001** (0.001)	0.001 (0.001)	-0.001 (0.001)		0.001* (0.000)	0.0002 (0.001)	0.001 (0.001)	
Rank productivity				0.052*** (0.008)				-0.009 (0.009)
lnK/L	-0.003 (0.002)	-0.003 (0.002)	-0.002 (0.002)	-0.001 (0.002)	-0.004** (0.002)	-0.005** (0.002)	-0.005** (0.002)	-0.005** (0.002)
Size	0.011*** (0.003)	0.010*** (0.003)	0.009*** (0.003)	0.005* (0.003)	-0.011*** (0.003)	-0.010*** (0.003)	-0.011*** (0.003)	-0.011*** (0.003)
State-owned	0.016 (0.013)	0.034** (0.013)	0.031** (0.013)	0.032** (0.013)	0.006 (0.013)	0.015 (0.013)	0.013 (0.013)	0.012 (0.013)
Foreign-owned	0.087* (0.046)	0.075* (0.044)	0.058 (0.043)	0.059 (0.043)	0.010 (0.062)	-0.005 (0.060)	-0.015 (0.060)	-0.017 (0.060)
Multi-product	0.006 (0.006)	0.004 (0.006)	0.006 (0.006)	0.004 (0.006)	-0.014** (0.006)	-0.017*** (0.006)	-0.021*** (0.006)	-0.020*** (0.006)
<i>Sector-specific</i>								
Productivity ^Ω		0.053*** (0.007)	0.054*** (0.008)			0.057*** (0.007)	0.053*** (0.008)	
IQR productivity ^Ω				-0.018*** (0.004)				0.004** (0.001)
lnK/L ^Ω		-0.020 (0.013)	-0.035** (0.014)	-0.030** (0.014)		0.014 (0.014)	0.024* (0.015)	0.021 (0.015)
Size ^Ω		0.070*** (0.009)	0.105*** (0.010)	0.129*** (0.010)		0.017* (0.009)	0.019** (0.009)	0.024*** (0.009)
CR ^Ω		-0.227*** (0.035)	-0.137*** (0.036)	-0.114*** (0.036)		0.003 (0.034)	-0.002 (0.036)	-0.027 (0.035)
FR ^Ω		-0.384*** (0.030)	-0.353*** (0.030)	-0.377*** (0.030)		-0.472*** (0.030)	-0.455*** (0.031)	-0.467*** (0.031)
SR ^Ω		-0.209*** (0.022)	-0.224*** (0.024)	-0.231*** (0.024)		-0.085*** (0.023)	-0.130*** (0.024)	-0.126*** (0.024)
Tariff level ^Ω			-0.229*** (0.027)	-0.217*** (0.026)			0.298*** (0.049)	0.328*** (0.048)
Export intensity ^Ω			0.003 (0.003)	0.001 (0.003)			-0.026*** (0.003)	-0.027*** (0.003)
Observations	136,235	132,193	124,356	124,356	115,189	111,736	104,994	104,994
Firms	49,409	48,412	46,404	46,404	39,820	39,124	37,838	37,838

Note: Robust standard errors reported in parenthesis. *, **, *** indicate significance at a 10%, 5% and 1% level, respectively.

^Ω Average for each 4-digit sector except IQR which is the inter-quartile range for the 4-digit sector.

All models include firm, sector (4-digit), time and provincial fixed effects.

Source: authors' calculations.

Table 7: Determinants of entry and exit—2-digit definition of sector level variables

	<i>Entry</i>				<i>Exit</i>			
<i>Firm-specific</i>								
Productivity	-0.002 (0.001)	-0.007** (0.003)	-0.006** (0.003)		-0.001 (0.001)	0.0005 (0.001)	0.002 (0.001)	
Rank productivity				-0.217*** (0.007)				-0.008 (0.005)
lnK/L	0.019*** (0.002)	0.019*** (0.002)	0.019*** (0.002)	0.013*** (0.002)	0.0003 (0.001)	0.0003 (0.001)	0.0004 (0.002)	0.0001 (0.002)
Size	-0.042*** (0.003)	-0.042** (0.003)	-0.042*** (0.003)	-0.032*** (0.003)	-0.025*** (0.002)	-0.025*** (0.002)	-0.026*** (0.002)	-0.025*** (0.002)
State-owned	-0.071*** (0.010)	-0.070*** (0.010)	-0.065*** (0.010)	-0.074*** (0.010)	0.049*** (0.008)	0.048*** (0.008)	0.046*** (0.008)	0.046*** (0.008)
Foreign-owned	-0.154*** (0.042)	-0.153*** (0.041)	-0.149*** (0.041)	-0.150*** (0.041)	0.030 (0.032)	0.030 (0.032)	0.029 (0.032)	0.028 (0.032)
Multi-product	0.008* (0.005)	0.008* (0.005)	0.007 (0.005)	0.015*** (0.005)	0.006 (0.004)	0.006 (0.004)	0.006 (0.004)	0.006 (0.004)
<i>Sector-specific</i>								
Productivity ^Ω		0.033*** (0.010)	0.033*** (0.010)			-0.013* (0.007)	-0.029*** (0.008)	
IQR productivity ^Ω				-0.020** (0.010)				0.011 (0.007)
lnK/L ^Ω		0.010 (0.019)	0.021 (0.020)	0.031 (0.019)		0.064*** (0.015)	0.025* (0.015)	0.020 (0.015)
Size ^Ω		0.017 (0.011)	0.020* (0.011)	-0.007 (0.011)		-0.005 (0.009)	-0.003 (0.009)	-0.007 (0.009)
CR ^Ω		0.139*** (0.051)	0.086 (0.056)	0.109** (0.055)		0.027 (0.040)	0.086** (0.043)	0.063 (0.042)
FR ^Ω		-0.263*** (0.042)	-0.248*** (0.042)	-0.253*** (0.041)		0.069** (0.033)	0.051 (0.034)	0.070** (0.034)
SR ^Ω		-0.044 (0.031)	-0.047 (0.032)	-0.057* (0.032)		0.047* (0.024)	0.051* (0.026)	0.061** (0.025)
Tariff level ^Ω			-0.071*** (0.022)	-0.072*** (0.022)			0.020 (0.015)	0.020 (0.015)
Export intensity ^Ω			-0.002 (0.004)	-0.003 (0.004)			-0.003 (0.003)	-0.002 (0.003)
Observations	146,027	145,775	138,345	138,345	146,027	145,775	138,345	138,345
Firms	50,794	50,753	49,046	49,046	50,794	50,753	49,046	49,046

Note: See Table 6a.

Source: authors' calculations.

													(0.011)
CR ^Ω	-0.068 (0.045)	-0.120*** (0.042)	0.171*** (0.038)	0.153*** (0.037)	0.113** * (0.036)	- 0.107* (0.061)	0.012 (0.044)	0.003 (0.041)	-0.017 (0.038)	-0.0003 (0.036)	- 0.070***	0.183* (0.057)	
FR ^Ω	-0.426*** (0.036)	-0.225*** (0.038)	0.359*** (0.031)	0.358*** (0.031)	0.337** * (0.031)	0.115* * (0.047)	0.500* ** (0.036)	0.346* ** (0.038)	0.449*** (0.032)	0.453*** (0.031)	0.491** *	-0.016 (0.042)	
SR ^Ω	-0.299*** (0.029)	-0.083*** (0.028)	0.216*** (0.025)	0.222*** (0.024)	0.181** * (0.025)	-0.012 (0.036)	0.174* ** (0.029)	-0.042 (0.028)	0.120*** (0.025)	0.126*** (0.024)	0.181** *	0.133* ** (0.039)	
Tariff level ^Ω	-0.088*** (0.028)	-0.305*** (0.031)	0.223*** (0.028)	0.232*** (0.027)	0.211** * (0.026)	-0.027 (0.025)	0.288* ** (0.062)	0.207* ** (0.057)	0.230*** (0.052)	0.305*** (0.050)	0.277** *	-0.026 (0.032)	
Export intensity ^Ω	-0.007** (0.003)	0.001 (0.004)	0.006* (0.003)	0.004 (0.002)	0.004 (0.003)	0.0000 4 (0.004)	- 0.040* ** (0.004)	- 0.026* ** (0.004)	- 0.025*** (0.003)	- 0.026*** (0.003)	- 0.031** *	0.006 (0.005)	
Observations	68,086	101,964	114,993	121,248	124,356	94,760	61,059	84,622	96,497	102,083	104,994	79,034	
Firms	19,158	40,779	44,951	45,280	46,404	42,326	17,812	32,572	36,465	36,745	37,838	34,285	

Note: See Table 6a and 6b depending on level of aggregation.

Source: authors' calculations.