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### Groningen Growth and Development Centre

# RuG

**Did Liberalization Start A Retail Revolution In Brazil?** 

Research Memorandum GD-105

Gaaitzen J. de Vries



RESEARCH MEMORANDUM

## Did Liberalization Start A Retail Revolution In Brazil?\*

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#### Abstract

In the 1990s, Brazil opened up its retail sector to foreign direct investment. It was expected that the entry and market expansion of retail chains would spur the development of a sector long characterized by small family-run stores. However, the effects on growth have been disappointing. Our results suggest that liberalization failed to deliver high growth because reallocation dynamics did not contribute to growth. For the period 1996-2004, we find little evidence that more-productive new establishments from retail chains replaced less-productive independent stores.

Key words: Structural reforms, Productivity growth, Retail sector, Latin America, Brazil JEL: L81, O12, O47

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#### 1 Introduction

Brazil's poor growth performance and macroeconomic instability in the 1980s motivated the government to undertake profound structural reforms in the early and mid-1990s (Baer, 2008). The government adopted prudent macroeconomic policies, achieved stabilization after a long period of hyperinflation, and created a more liberal trade and investment climate. The retail sector was opened up in the World Trade Organization 1995 General Agreement on Trade in Services, but also within the MERCOSUL<sup>1</sup>, and between the MER-COSUL members and the European Union. In addition, the participation of foreign capital in Brazilian retail firms was freed from restrictions in the Sixth Constitutional Amendment of 1995 (World Bank, 2004).

The reforms created very suitable conditions for investments by foreign chains. As a result, Foreign Direct Investment (FDI) in the retail sector increased rapidly.<sup>2</sup> The FDI stock in the retail sector increased sixfold from 1995 to 2000, and growth was above average FDI growth (Censo de Capitais Estrangeiros, available at www.bcb.gov.br). In turn, these investments created the perception that liberalization had started a retail revolution through the expansion of modern retail chains (Reardon and Berdegué, 2002).

The retail sector accounts for a large share of the Brazilian economy, both in terms of GDP and employment. During 1996-2004, the employment and value added share in the total economy was respectively about 11 percent and 5 percent (Timmer and de Vries, 2008). A revolution was considered necessary for the development of a sector long characterized by many small family-run stores operating alongside a few large modern retail chains. In the mid-1990s, various domestic (or partially foreign-owned) chains were active, but the sector mainly consisted of independent retailers, often operating their business in a traditional way at low productivity levels (McKinsey, 1998). The increasing presence of retail chains was expected to spur development by reducing waste (many agricultural products rot before reaching the market), lowering prices for consumers, improving the quality of goods and assurance of its delivery, raising the productivity of supplying industries (Javorcik et al., 2006), and raising the sector's productivity level.<sup>3</sup>

So far, productivity growth of the retail sector has been disappointing under the structural reforms. While productivity growth of the total economy has been disappointing as well (Paus, 2004), available evidence suggests that productivity growth of the retail sector was below that of the total economy during the 1990s (Melo et al., 1998; Mulder, 1999; Timmer and de Vries, 2008). This experience contrasts with OECD countries, where growth of the retail sector was above productivity growth of the total economy during the past decades (Inklaar et al., 2008). Obviously, this raises the question what held back growth of Brazil's retail sector.

Recent studies have shown that productivity growth in the retail sector of OECD countries occurred through a process of creative destruction. That is, growth originated from reallocation dynamics through firm churning (the entry and exit of firms) and resource reallocation to more-productive retail chains. For example, new establishments from retail chains (including, but not only, Wal-Mart) displacing 'mom-and-pop' stores accounted for virtually all growth in the US in the past decades (Foster et al., 2006). Similar findings for the UK are presented by Haskel and Sadun (2007) and for Japan by Matsuura and Motohashi (2005).

We use similar decomposition methodologies as in these studies to understand the performance of Brazil's retail sector. While Brazil's retail sector is dynamic, our results suggest that liberalization failed to deliver high growth because a process of creative destruction did not take off. During 1996-2004, we find little evidence for a reallocation of productive inputs and outputs. New establishments from retail chains did not replace low-productive independent stores at a large scale. Instead, large chains acquired other (smaller sized) chains. This contributed to a deepening of the dual structure in which low-productive independent stores continued to coexist with a declining number of retail chains.

The remainder of this paper is structured as follows. In the following section we present the data set and discuss the main characteristics of Brazil's retail sector. We describe our productivity decomposition method in section 3. Decomposition results are discussed in section 4. Conclusions and a discussion why the sector does not show patterns similar to the US are in section 5.

#### 2 Brazil's Retail Sector

To examine the contribution of reallocation dynamics to growth, we use a census dataset of retail firms. Our principal data source is the annual survey of distributive trade firms (Pesquisa Anual de Comércio, PAC) from 1996 to 2004. Firms registered in the Cadastro Nacional da Pessoa Jurídica from the ministry of Economic Affairs and classified as distributive trade firms in the Cadastro Central de Empresas of the national statistical office are surveyed in PAC. The PAC dataset consists of two groups, namely a group of firms which surpass the threshold and are included by census and another group of firms which are below the threshold and are included by sample. Sampled firms are surveyed for a maximum of three consecutive years and fill in a simplified questionnaire. The empirical analysis focuses on firms included by census only.<sup>4</sup>

Firms in the dataset are linked using their identification numbers from the tax registry. Different national sector definitions are used in PAC over time, which are converted to the International Standard Industry Classification Revision 3.0. After firms are linked, observations of nominal output divided by nominal input that fall into the first and the ninety-ninth percentile of the distribution at the most detailed industry classification are considered outliers and deleted. A detailed discussion of these steps is provided in appendix A.

Firms with more than 20 employees or firms with less than 20 employees but with establishments in more than one Federal State are included in PAC by census.<sup>5</sup> For 1996 this amounts to 14,445 firms included by census. In 2004 the number of firms included by census has risen to 17,366. While firms included by census constitute a fairly small share of the total population of retail firms, they represent the major part of the sector in terms of sales (about 60 percent). Furthermore, although our analysis excludes small (often informal) firms, the dataset mainly includes single-establishment stores with low productivity levels. For example, in 2004 about 69 percent of the firms in our dataset are single-establishment firms (see appendix table B.2). Therefore, results are considered representative for the sector.

Output and input variables are available to construct productivity measures. We measure labor productivity (LP) as the volume of sales divided by employment.<sup>6</sup> Because retail firms sell goods to consumers, we used the consumer price index to deflate output. We used the overall consumer price index to deflate output of retail firms. In some cases it was possible to use more detailed price series, for example for firms selling food and drinks.<sup>7</sup>

Figure 1 shows pie charts for the employment shares of firms (distinguished by the number of establishments a firm has) in 1996 and 2004. The employment share of single-establishment firms did not decline from 1996 to 2004. In fact, the employment share of independent stores increased from 22 percent to 29 percent in the retail sector. Nevertheless, we find an increasing presence of large-size chains (firms with >100 establishments) at the expense of small and medium-size chains as well. In particular, in food retailing (a sub-industry of the retail sector) the employment share of large-size retail chains increased from 5 percent to 23 percent, reflecting the entry and market expansion of large international retail chains.<sup>8</sup> Thus, we find an increasingly dual market structure.

Table 1 shows productivity levels by size class. Clearly, productivity levels rise with size class. Across the retail sector, retail chains tend to be more efficient than single-store retailers because of technology and scale advantages.<sup>9</sup> These differences in productivity levels across size classes indicate the scope of resource reallocation for boosting productivity growth. That is, resource reallocation toward retail chains offers much potential for productivity growth.

What is puzzling, is the low aggregate productivity growth of the sector despite the combination of a higher productivity level across size classes and an increasing market share of large retail chains. In the remainder of this paper, we will use the census data set and our productivity decomposition method to understand why productivity growth was not higher. The next section presents the decomposition method, before turning to the results in section 4.

#### 3 The Productivity Decomposition Method

Starting with the preliminaries of the productivity decomposition, aggregate productivity,  $LP^A$ , is the weighted geometric average of firm's productivity:

$$LP_t^A = \prod_i LP_{it}^{\theta_{it}},\tag{1}$$

where subscripts *i* and *t* refer to firm and time respectively,  $\theta$  is a firm-specific share in total employment, *LP* is labor productivity (sales per worker), and  $\Pi$ denotes multiplication. If we take the logarithm of productivity, the aggregate productivity level is defined as a weighted arithmetic mean:

$$\ln LP_t^A = \sum_i \theta_{it} \ln LP_{it}.$$
 (2)

Aggregate productivity growth between two years is the percentage change measured by:

$$\Delta \ln LP^A = \ln LP_t^A - \ln LP_{t-1}^A. \tag{3}$$

For the decomposition, consider three types of firms. Continuing firms are denoted by C, entering firms are denoted by E, and exiting firms are denoted by X. Firms in the initial year (t-1) either continue or exit the market. So in year t-1, continuing and exiting firms are active. In the final year (t), only firms that continued or entered the market are present. Hence, in year t, continuing and entering firms are active.

Aggregate productivity growth between two periods can therefore be decomposed into:

$$\Delta \ln LP^{A} = \ln LP_{t}^{A} - \ln LP_{t-1}^{A} = (\sum_{i \in E} \theta_{it} \ln LP_{it} + \sum_{i \in C} \theta_{it} \ln LP_{it})$$
(4)  
$$-(\sum_{i \in X} \theta_{i,t-1} \ln LP_{i,t-1} + \sum_{i \in C} \theta_{i,t-1} \ln LP_{i,t-1}).$$

Equation 4 is the basic decomposition of productivity growth. It shows that aggregate productivity can be decomposed into the contribution of entering, exiting, and continuing firms. Aggregate productivity growth between two periods is either due to within-firm improvements or reallocation dynamics. So far, however, equation 4 does not separate the contribution to growth from continuing firms into within-firm improvements and resource reallocation. Preferably, these contributions from continuing firms are to be separated. Several methods have been developed to distinguish between these two contributions from continuing firms (see Baldwin and Gu (2006) for the derivations). In this paper we follow the decomposition method developed by Griliches and Regev (1995), hereafter denoted GR:<sup>10</sup>

$$\Delta \ln LP^{A} = \sum_{i \in E} \theta_{it} \left( \ln LP_{it} - \overline{LP}^{A} \right) \quad (\text{entry})$$

$$+ \sum_{i \in C} \left( \frac{\theta_{it} + \theta_{i,t-1}}{2} \right) \left( \ln LP_{it} - \ln LP_{i,t-1} \right) \quad (\text{within})$$

$$+ \sum_{i \in C} \left( \theta_{it} - \theta_{i,t-1} \right) \left( \frac{\ln LP_{it} + \ln LP_{i,t-1}}{2} - \overline{LP}^{A} \right) \quad (\text{between})$$

$$- \sum_{i \in X} \theta_{i,t-1} \left( \ln LP_{i,t-1} - \overline{LP}^{A} \right), \quad (\text{exit})$$

$$(5)$$

where  $\overline{LP}^A = \frac{\ln LP_t^A + \ln LP_{t-1}^A}{2}$  and the terms on the right-hand side of equation 5 are:

- The *entry* effect: the sum of differences between entering firms' productivity and average aggregate productivity, weighted by the firm's market share. This term measures the contribution of entering firms to growth.
- The *within-firm* effect: the sum of productivity change within continuing firms, weighted by the firm's average market share. This term reflects gains from productivity growth within firms.
- The *between-firm* effect: the sum of productivity change due to the expansion or contraction of continuing firms, where the firms' average productivity is measured in deviation from average aggregate productivity. This term captures productivity gains from the expansion of more-productive firms, or the contraction of less-productive firms.
- The *exit* effect: the sum of differences in the productivity of exiting firms and average aggregate productivity, weighted by initial market shares. Exiting firms have a positive effect on aggregate productivity growth if the firms exhibit productivity levels below average productivity.

If liberalization started a retail revolution through the entry and expansions of retail chains, this shows up from the decomposition as large reallocation dynamics (the sum of *entry* effects, *between-firm* market-share changes, and *exit* effects). For OECD countries, these dynamics accounted for most growth. For example, for the US it was found that reallocation dynamics accounted for 83 percent of growth during 1987-1997 (Foster et al., 2002).

Table 2 shows descriptive statistics of the census data set we use. Output and input variables are reported by entering, exiting, and continuing firms. Continuing firms are on average the largest firms in terms of sales and employees, and they show the highest productivity (sales per employee) as well. Exiting and entering firms are less productive, with exiting firms marginally more productive than entering firms. Although surprising at first, below average productivity of entering firms is a common finding across countries (Bartelsman et al., 2005). It is generally interpreted as the result of market experimentation in which selection and learning effects eventually sort out the most competitive entrants.<sup>11</sup>

Entry and exit rates reveal substantial churning. Table 2 reports average annual entry rates of 25 percent and exit rates of 18 percent. In comparison to manufacturing industries in Latin America, there appears more churning in retailing (for instance, Eslava et al. (2006) reports average annual entry rates of 9 percent and exit rates of 10 percent for Colombian manufacturing industries). Firm turnover is higher in the retail sector because it has a much higher share of small businesses, which have a lower probability of survival than large businesses (Foster et al., 2002). Churning in Brazil's retail sector is comparable to that observed in the US retail sector, where Foster et al. (2002) describe the sector as having 'enormous rates of entry and exit' (p. 7) and Jarmin et al. (2004) find that 50 to 60 percent of retailers that exist one year disappear within five years.

#### 4 Brazil: No Retail Revolution Here

We performed productivity decompositions at detailed industry levels using equation 5. However, in this section we report results for the total retail sector (industry 52) and for food retailing (industry 521), because we are mainly interested in the aggregate outcomes. To this end the detailed decomposition results were aggregated.<sup>12</sup> We decomposed growth annually and present period averages of the annual contributions.

Figure 2 shows the GR decomposition of labor productivity growth. Aggregate productivity growth averaged 1.1 percent for the retail sector during 1996-204. The within-firm contribution to productivity growth is larger than the contribution from reallocation dynamics in the various periods considered. In fact, the negative value for reallocation dynamics indicates that reallocation often exerts a drag on aggregate productivity growth. For example, the average annual 1.1 percent growth during 1996-2004 is due to a 2.8 percent productivity contribution from within-firm improvements and to a -1.7 contribution from reallocation dynamics.

Results are similar for food retailing, with the exception of the period 2000-2004. Productivity of food retailers declined during the 2000-2004 period, which might be due to the expansion in services offered (such as amenities and the breadth of assortment) not accounted for in the output measure we employed (Betancourt and Gautschi, 1993; Ratchford, 2003). However, for both the total retail sector and food retailing, the main finding from the decomposition analysis is that within-firm effects account for most growth. In addition, a comparison of the 1996-2000 period with 2000-2004 shows that despite increasing FDI flows during the period considered (Concha-Amin and Dias de Aguiar, 2006), the contribution of reallocation dynamics did not increase.

Reallocation dynamics consist of between-firm effects and the contributions

from firm entry and exit. The contributions of these different components are shown in the last columns of table 3. Between-firm effects were positive (with the exception of food retailing during 2000-2004), indicating that moreproductive firms expanded their market share at the cost of less-productive firms. The between-effect is modest however, especially in food retailing (we discuss this below). Entry effects are negative reflecting that productivity of entering firms was below average productivity. Finally, the exit effect positively contributed to growth, because the productivity of exiting firms was below average productivity, which is consistent with the idea that competition drives the least competitive firms out of the market.

We examined the robustness of our results. First, we used alternative decomposition methods proposed by Foster et al. (2006), and Baldwin and Gu (2006). The relative contributions of decomposition components were comparable. Hence, our main conclusions are independent from the particular decomposition method used. Second, since there is a census threshold, entrant firms in our dataset may not be true entrants but simply firms that grow beyond the threshold. We addressed that limitation by artificially raising the threshold and examining changes in the decomposition results. Our findings suggested that raising the threshold leaves the relative contributions of the components unchanged. Similarly, Scarpetta et al. (2002) examined the sensitivity of decomposition results to a threshold for Finnish manufacturing industries. They find that results are insensitive to various artificially set thresholds as well. Third, note that we examine *firm* dynamics using firm-level data. Most studies examined firm dynamics this way (Bartelsman and Doms, 2000; Bartelsman et al., 2005). But some studies examined firm dynamics at the establishment level (Foster et al., 2006; Matsuura and Motohashi, 2005). The difference between the two concepts is that firm-level analysis does not distinguish between single-establishment firms and firms with multiple outlets whereas an establishment-level analysis does. Therefore an establishment-level

analysis is able to decompose movements in productivity into changes within establishments on the one hand and changes within firms on the other. The unit of analysis should be kept in mind when comparing decomposition results in this paper with other studies. New establishments from continuing firms are included in *between-firm* effects in our paper, whereas it is counted as an entering establishment from a continuing firm in Foster et al. (2006). This has no important implications for the interpretation of the results, since both effects are part of the reallocation dynamics. Therefore, our results are robust.

High within-firm effects and modest reallocation dynamics suggest that the reforms did not start a retail revolution through the entry and expansion of foreign and domestic retail chains. Although liberalization in the 1990s did result in the expansion of chains (see section 2), our findings question the extent to which retail chains have contributed to aggregate outcomes by entering the market or expanding their market shares. So far, it is more likely that if liberalization did result in productivity gains, they are reflected in within-firm improvements. That is, some firms started to adopt new Information and Communication Technologies (ICT) when the market for ICT goods was liberalized in the 1990s (Baer, 2008), reorganized their business as a result of increased competition, and benefited from cheaper imported goods for resale.<sup>13</sup> These gains, however, are largely temporary. The major gains should originate from a fundamental restructuring of the sector.

Our finding of limited reallocation dynamics correspond with several recent qualitative studies of the retail sector of Brazil (and Latin America in general). For example, Booz-Allen Hamilton (2003) claim that 'Small-scale retailers in Latin American markets have demonstrated remarkable resilience, and previous gains against [large retail chains] are tapering off or even reversing slightly in some cases. In Argentina and Brazil, small-scale retailers have been particularly successful in staving off the large chains' (p. 2-3). They argue that small-scale retailers managed to retain their market share, because they are located close to consumers, offer the product assortment which their customers demand, sell products only at a small price-disadvantage, provide a 'personal touch', and offer special services such as selling on credit.

Further, our results for food retailing confirm concerns raised by Humphrey (2007) that the depth and implications of the food retail transformation in Latin America have been overstated in previous research (for example Reardon et al. (2003)). In particular, distinguishing the food retailing sector from the total retail sector shows that the between-firm market share changes are low in the former (see table 3). This corroborates Farina (2002), who analyzes the supermarket sector in Brazil and shows that the share of food sales by supermarket chains declined from 45.1 percent to 42.8 percent during 1994 to 2000. During this period, the share of independent stores grew from 40 percent to 44 percent (the remaining food sales are by traditional stores). Thus, single-establishment firms were not replaced by retail chains, and our decomposition analysis shows that the observed changes in market shares added little to productivity growth.

#### 5 Concluding Remarks

Brazil undertook profound structural reforms during the 1990s. In combination with stabilization after a long period of hyperinflation, this resulted in increasing FDI inflows. In turn, these foreign investments by retail chains were expected to alter the sector which had long been characterized by independent stores operating their businesses in traditional ways with low productivity levels. That is, the opening up of the retail sector was expected to raise productivity growth through the entry and expansion of international retail chains. Thus, the main effects of the reforms were expected to work through reallocation dynamics. However, growth of the sector has been low, averaging about 1.1 percent per annum, raising questions about the effects of the reforms.

This paper examined the effects of liberalization on productivity growth in Brazil's retail sector. We decomposed growth into the contribution from withinfirm improvements and reallocation dynamics during 1996-2004. We found substantial churning, with average annual entry rates of 25 percent and exit rates of 18 percent. However, two findings suggested that reforms did not live up to expectations. First, we found no strong tendency of retail chains displacing independent stores. In fact, the employment share of single-establishment firms increased slightly. Second, the contribution of reallocation dynamics to growth was negative, averaging -1.7 percentage points per year, whereas within-firm improvements contributed 2.8 percentage points per year.

In the US, chains of convenience stores with bargaining power, centrally performed operations, and best-practice operations have been displacing singleshop convenience stores for several decades (Jarmin et al., 2004). For the US, this process explains virtually all growth (Foster et al., 2006) and has transformed the retail sector into a sector which leads the aggregate economy (Inklaar et al., 2008). Clearly, this development process is lagging in Brazil. At least three aspects deserve careful examination in future research to understand why the sector does not show patterns similar to the US.

First, business regulation is slowing down the expansion of retail chains. In particular, regulations concerning zoning and commercial real estate act as barriers to the development of the retail sector. For example, quantitative limits on retail floor space in particular geographical areas (often city centers) are set. This occurs even if national legislation puts little restrictions on floor space, because decisions are often taken at the local level (for instance by city *vereadores*) where choices can be influenced by local pressure groups (e.g. small retailers). In addition, business regulation in other markets such as in transport and logistics limit the expansion of multi-establishment firms. Excessive business regulation distorts the functioning of the Brazilian economy. For example, Brazilians have the saying "to my friends: everything, to my enemies: the law". In fact, according to a World Bank study on doing business across countries, Brazil is one of the most regulated countries in the world (World Bank, 2006). Thus, zoning laws and excessive business regulation in other markets slow down the emergence of chains in Brazil.

Also, the quantity, quality, and orientation of rail and road networks is holding back the emergence of national distribution systems and thereby the expansion of chains. The physical gap in transport networks between Brazil and OECD countries is large (Calderón and Servén, 2004). In addition, only a small part (less than 20 percent) of the road network is paved and the provision of infrastructure did not grow during the past decade as a result of the retrenchment of the public sector in this area (Calderón and Servén, 2004). Furthermore, early investments in railways were meant to integrate Brazil in the international economy (that is, to export primary products) rather than to integrate the regions into a large domestic market (Baer, 2008).

Finally, demand factors influence the expansion of multi-establishment firms. Consumer patterns are culturally determined, and many Brazilians prefer to buy their goods at street markets and local stores instead of at supermarkets from chains with a fixed assortment, because of food preparation habits and the perceived freshness of the produce there (Zinkhan et al., 1999; Humphrey, 2007). Therefore, consumer preferences influence the cohabitation of modern and traditional forms of retailing. In addition, car penetration influences the attractiveness for retail chains to establish large supermarkets outside crowded residential areas. Thus, with lower car penetration, especially in the poorer Northern states, it has been less attractive for chains to invest in large new establishments there. However, other demand factors are slowly favoring modern retail formats, such as the increasing female labor force participation (shifting demand to one-stop shopping), the recent improvements in the income distribution, and the growing middle class. This indicates that once supply constraints are eased, a revolution may be in the making.

#### Notes

<sup>1</sup>Mercado Comum do Sul, the regional trade block consisting of Argentina, Brazil, Paraguay, and Uruguay.

<sup>2</sup>See Santos and Gimenez (1999) and Concha-Amin and Dias de Aguiar (2006) for an overview of foreign retail chains which entered or expanded their market share. Concha-Amin and Dias de Aguiar (2006) concluded that during 1989-2002, 93 percent of all mergers and acquisitions by foreign firms took place after 1997.

<sup>3</sup>The beneficial effects of foreign retail chains are not undisputed. In particular, concerns about their effects on wages and employment have been raised (Basker, 2007). For example, Durand (2007) argues that FDI in Mexico's retail sector dampened retail wages by introducing higher competitive pressures.

<sup>4</sup>We discuss implications of excluding firms below the threshold in section 4. Registered firms with less than 20 employees are selected by means of a stratified random sampling procedure. The dataset has 12,402 sampled firms in 1996 and 10,596 sampled firms in 2004.

<sup>5</sup>Firms in several northern regions which are located outside the Federal States' capital are not included in the survey because of the high costs involved in collecting information for these firms. These regions are: Rondônia, Acre, Amazonas, Roraima, Pará, Amapá, and Tocantins.

<sup>6</sup>Since some retailers employ part-time workers and family workers, a preferable measure of labor input is hours worked. Data limitations force us to use employment. Productivity is therefore underestimated for retailers who employ relatively more part-time and or family workers.

<sup>7</sup>Further detail is provided in appendix A.

<sup>8</sup>We also computed concentration ratios. For the retail sector, the concentration ratio of the top ten firms by sales is 0.23 in 1996 and increased to 0.27 in 2004. In comparison to OECD countries, concentration ratios are still low (see for instance Boylaud and Nicoletti (2002); Haskel and Sadun (2007)).

<sup>9</sup>See Doms et al. (2004), and Foster et al. (2006) for further detail for the US.

<sup>10</sup>This method has the advantage that it avoids the mixing of Paasche-type measures with Laspeyres-type measures by using a symmetric decomposition method (Balk, 2001). In addition, by taking period averages, the influence of measurement error becomes smaller. The disadvantage of the GR method is that, because of taking averages, the *within-firm* effect is affected by changes in the market share, and the *between-firm* effect is affected by changes in productivity. In section 4 we consider alternative decomposition methods and find that our main conclusions are independent from the particular decomposition method used.

<sup>11</sup>In our decompositions of productivity growth (see section 4) we increased the time horizon to examine the selection and learning effect. We found that increasing the time horizon raises the contribution to growth from entering firms in line with selection and learning effects, but the additional contribution is small.

<sup>12</sup>The weights which were used to average across the industries are nominal gross output by industry averaged over the first and last year of the period for which the change is measured. These weights were kept constant across the decompositions. Hence, the results are within-industry decompositions and do not reflect changes in the composition of distributive trade industries over time.

<sup>13</sup>If price changes of inputs were taken into account, the lower price of purchased goods for resale would not be reflected in the productivity measure. We were unable to take price changes of inputs into account, and it is therefore reflected in productivity growth.

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Figure 1. Firms and employment shares in 1996 and 2004

Figure 2. Productivity growth decomposition



Note: See table 3 for further detail.

i iouucuivity ic	veis, defified as sales div	fuce by employment, by size class
Number of	Productivity level	Productivity level
Employees	1996	2004
Retail sector		
20-49	100	100
50-99	104	102
100-249	107	105
250-499	106	106
500 +	120	113

Table 1 Productivity levels, defined as sales divided by employment, by size class

Note: Unweighted average productivity by size class. The productivity level for the size class 20-49 is set to 100.

Table 2Averages of firms in the Brazilian retail sector

	Continuing firms	Entering firms	Exiting firms
Real Sales	16.05	14.29	14.08
Employment	4.62	3.44	3.18
Labor productivity	10.62	10.26	10.34
Entry rate		0.25	
Exit rate			0.18
Observations	$84,\!101$	25,403	$18,\!329$

Note: Sales is measured in Brazilian reais. Real sales, employment, and labor productivity are in natural logarithms. The entry (exit) rate is the average annual number of entrants (exiters) divided by the total number of firms. The values are averages for the period 1996 to 2004. Descriptive statistics are for firms included by census in PAC.

Industry	Average	Contribution from:						
Period	annual growth	Within-firm	Total reallocation	Between-firm	Entry	Exit		
	(in percentage	effect	effect $((3)+(4)+(5))$	effect	effect	effect		
	$\operatorname{points})$	(1)	(2)	(3)	(4)	(5)		
Retail sector								
1996-2000	1.1	1.5	-0.4	1.5	-4.8	2.9		
2000-2004	1.2	4.1	-3.0	1.0	-7.0	3.0		
1996-2004	1.1	2.8	-1.7	1.3	-5.9	2.9		
of which								
Food retailing								
1996-2000	1.4	2.7	-1.3	0.4	-2.5	0.7		
2000-2004	-0.3	3.3	-3.6	-0.7	-4.3	1.5		
1996-2004	0.6	3.0	-2.4	-0.1	-3.4	1.1		

Table 3Productivity growth decomposition

Note: Griliches and Regev (1995) decomposition of labor productivity growth. Decompositions are performed annually, average annual percentage points contributions to growth are presented. Total reallocation effect, (2) = (3) + (4) + (5).

#### A Data Appendix

#### A.1 Data Cleaning

IBGE has the policy to encrypt the identification number of firms (CNPJ) before giving researchers access to the data. The method which is used to encrypt identification numbers is equal across years. Therefore, a firm can be traced throughout the sample. We inspected the encrypted firm ID's and deleted firms with duplicate numbers.

We used the following procedure to detect outliers before the productivity decomposition. First, nominal output is divided by nominal input for each firm. Observations of nominal output divided by nominal input that fall into the first and the ninety-ninth percentile of the distribution at the most detailed industry classification (four digits) are identified as outliers. After two periods have been linked, firms with outlying productivity values or missing data in one of the two periods are deleted. Entrant and exiting firms are determined from the remaining data. We also decomposed productivity growth without the outlier procedure. Results from these decompositions are similar.

#### A.2 Price Deflators

Several industry-wide and economy-wide price indices are available for Brazil. Choices, however, are limited. We worked with price indices at fairly aggregated levels. Because retail firms sell goods to consumers, we used the consumer price index to deflate output. Consumer price indices (Índices Nacionais de Preços ao Consumidor - Amplo, INPC-A) are available at IBGE. We use the amplified consumer price index (INPC-A) to deflate output measures, where we use either Brazil's or the Federal states' price index for all goods or one of the following groups of goods: (1) clothing; (2) household equipment; (3) food and beverages. Firms report economic numbers that refer to the calendar year of the survey. Firms whose business year differs from the calendar year are required to adjust their numbers accordingly. Therefore, we used annual (mid-year) price deflators to deflate output.

#### A.3 Conversion of CNAE to ISIC Revision 3.0

Different national sector definitions are used in PAC over time. We used data in PAC from 1996 to 2004. Two national classifications are therefore relevant. First, the CNAE classification (Classificacão Nacional de Atividaded Econômicas), which was adopted in 1995 and used until 2003. Second, from 2003 onwards, the CNAE 1.0 classification.

Our approach has been to first convert CNAE 1.0 in later surveys to CNAE. We followed this approach because only two years with the new classification are available. Next, we converted CNAE to the International Standard Industry Classification Revision 3.0 (ISIC Rev. 3.0). At the one and two digit level, the industry classifications CNAE, CNAE 1.0, and ISIC Rev. 3.0 are identical. Differences between the classifications only occur at the three and four digit level. Usually, more detail is offered in the CNAE/CNAE 1.0 classification and aggregation of CNAE/CNAE 1.0 to groups recomposes ISIC groups. We describe the conversion CNAE x CNAE 1.0 and CNAE x ISIC Rev. 3.0 below.

First, consider the conversion of CNAE 1.0 to CNAE for distributive trade firms. The difference between both classifications is not large. For 68 out of 72 (four digit) industry categories, an exact matching exists. The lack of unique correspondence between both classifications in the remaining 4 categories concerns wholesale of machinery, equipment and supplies and retail trade not in stores. Differences arise, because CNAE 1.0 does not distinguish between the different forms of commercialization. For example, whether sales take place via a store, TV, or Internet, is no longer separated in the new CNAE 1.0. This distinction is made in CNAE (and it is made in ISIC Rev. 3.0). This implies that no strict correspondence between both classifications exists. Firms that belong to CNAE 1.0 industry code 51.64-0 and 51.65-9 all belong to a similar aggregate category in CNAE, namely 51.6 (CNAE). Firms in CNAE 1.0 51.64-0 are all converted to CNAE 51.62-4, and firms in CNAE 1.0 51.65-9are converted to CNAE 51.63-2. Firms in CNAE 1.0 52.62-0 are converted to CNAE 52.69-8, but some firms in CNAE 52.69-8 are moved to CNAE 1.0 64.12-2. These firms can no longer be traced and artificially disappear from the data set. Firms in CNAE 52.61-2 and some firms in CNAE 52.69-8 are difficult to trace, because CNAE 1.0 does not distinguish between the various forms of commercialization. IBGE (2004) indicates that in the total population of retailers, only 5 retailers realized 100 percent of their sales via the Internet, 40 via the TV, and 584 via other forms of commercialization. In the total sample, this bias is unlikely to be large. Furthermore, we focus in the productivity decompositions on broader aggregates so to some extent these firms are possibly recomposed in an aggregate.

Second, we converted firms in four-digit CNAE sector classifications to fourdigit ISIC Revision 3.0 classifications. In fact, since CNAE is based on ISIC Rev. 3, matching is unique. The only difference between both classifications stems from more detail in the CNAE classification. Hence more detailed categories in CNAE are recomposed in a broader ISIC category.

#### A.4 Firm Dynamics

To estimate the contribution of firm dynamics to growth, it is important to measure 'truly' entering and exiting firms. We use unique firm identification numbers to measure entrants, exiters and continuing firms. But some characteristics of PAC cloud the measurement of true entrants and exiters.

The structure of some firms change during the period analyzed. For example,

the structure of some firms change because of mergers, takeovers, and spin-offs. A firm that is taken over, continues operating. But the firm now has a different firm identification number (the same as the firm that has purchased her). Due to the takeover, the previous firm identification number disappears. Without additional information about changes in the structure of firms, we would count a "false" exit. Other studies solved this problem by including information from business registers. We are partly able to solve this problem, because PAC asks firms to report changes in legal and economic status (mudanças na estrutura da empresa). Furthermore, if a change in the legal or economic status of the firm occurs, the firm reports an additional tax number link (PAC provides two firm identification numbers in these cases). Therefore, the additional tax number link changes its meaning depending upon the change in legal or economic status.

Consider the possible changes in the structure of trade firms. First, if no change is reported, the firm can be linked directly. However, note that the industry classification of a firm could change. This happens with a change in its main economic activity. Firms that switched between industry classifications are dropped from the data set. Second, a new firm can emerge from a merger. The merged firm has 2 predecessors. Because we need two additional tax number links (in stead of one) and because the newly emerged firm is often restructured considerably, we consider it a new entrant. Likewise, if a firm emerges from a complete split-up, we considered it a new entrant. The argument for making these choices is that this firm now stands alone and gains experience on its own. Third, consider a partial spin-off. A new firm emerges from a parent firm. We considered it a new firm, again, on the assumption that this new firm stands alone and gains experience on its own. Fourth, if the firm reports that it is acquired by another firm or it has acquired another firm, output and input data are added to the purchasing firm. Fifth, a 'rest' category exists, where firms report other reasons for a change in its tax number link in 'observaçãos.'

Here, observations for old and new firm identification numbers were treated as one firm.

### **B** Appendix tables

	1	2		3		4		5		6		
Sector	All	Firm	Firms		Firms		Firms		$\operatorname{Firms}$		Firms	
	firms	with	1	with 2	2-5	with (	6-10	with 11	L-100	with $>$	100	
		establishment		establishments		establish	establishments		establishments		establishments	
		number	$\mathbf{share}$	number	share	$\operatorname{number}$	share	number	share	number	share	
Employment (1996)												
Retail sector	$1,\!043,\!651$	$233,\!446$	22%	$247,\!032$	24%	$111,\!527$	11%	$372,\!837$	36%	$78,\!809$	8%	
Food retailing	455,799	84,627	19%	83,890	18%	50, 360	11%	209,395	46%	24,233	5%	
other	587,852	148,819	25%	163,142	28%	61,167	10%	163,441	28%	54,576	9%	
Employment $(2004)$												
Retail sector	$1,\!344,\!476$	$393,\!834$	29%	$226,\!010$	17%	$107,\!831$	8%	$360,\!578$	27%	$256,\!278$	19%	
Food retailing	632, 153	155,476	25%	91,934	15%	53,708	8%	185, 563	29%	145,440	23%	
other	712, 323	238,358	33%	134,075	19%	54,124	8%	175,015	25%	110,838	16%	

Table B.1Firms, establishments and employment in 1996 and 2004

Note: columns 2, 3, 4, 5, and 6 add up to column 1.

	1	2		3		4		5		6		
Sector	All	Firm	$\mathbf{ns}$	Firr	$\mathbf{ns}$	Firm	ns	Firm	$\mathbf{ns}$	Firm	$\mathbf{ns}$	
	firms	with	1	$\operatorname{with}$	2-5	with 6	6-10	with 1	1-100	$\mathbf{with} >$	>100	
		establish	establishment		establishments		establishments		establishments		establishments	
		number	share	number	share	number	share	number	share	number	share	
Number of firms $(1996)$												
Retail sector	$14,\!445$	7,760	54%	$5,\!314$	37%	813	6%	541	4%	17	0%	
Food retailing	3,327	2,211	66%	897	27%	113	3%	103	3%	3	0%	
other	11,118	5,549	50%	4,417	40%	700	6%	438	4%	14	0%	
Number of firms $(2004)$												
Retail sector	$17,\!366$	$12,\!066$	69%	$4,\!119$	24%	644	4%	507	3%	30	0%	
Food retailing	4,684	3,760	80%	716	15%	110	2%	88	2%	10	0%	
other	12,682	8,306	65%	3,403	27%	534	4%	419	3%	20	0%	

Table B.2Firms, establishments and employment in 1996 and 2004

Note: columns 2, 3, 4, 5, and 6 add up to column 1.

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