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IZA DP No. 7412

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*IECON, Universidad de la República  
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Discussion Paper No. 7412  
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## ABSTRACT

### **Are Worker-Managed Firms Really More Likely to Fail?\***

Different theoretical explanations suggest that worker-managed firms (WMFs) are prone to failure in competitive environments. Using a long panel of Uruguayan firms, the author presents new evidence on firm survival comparing WMFs and conventional firms. Excluding microenterprises and controlling for differences in the effective tax burden faced by the two types of firms, the hazard of dissolution is 29% lower for WMFs than for conventional firms. This result is robust to alternative estimation strategies based on semi-parametric and parametric frailty duration models that impose different distributional assumptions about the shape of the baseline hazard and allow to consider firm-level unobserved heterogeneity. The greater survivability of WMFs seems to be associated with the greater employment stability achieved in this type of firms. The evidence suggests that the marginal presence of WMFs in actual market economies can hardly be explained by the fact that these organizations exhibit lower survival chances than conventional firms.

JEL Classification: P13, P51, C41

Keywords: labor-managed firms, capitalist firms, survival analysis

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## 1. Introduction

Samuelson (1957) claims that in a perfectly competitive market it does not really matter who hires whom. In other words, it is irrelevant whether entrepreneurial functions are carried out either by capital or labor. This famous statement seems to be at odds with the fact that most firms in actual market economies are ultimately controlled by capital suppliers and not by their workforce.

Recent developments in economic theory have provided several competing explanations to account for these facts. One important concern in this debate is to determine whether the low proportion of worker-managed firms (WMFs) is explained by structural obstacles impeding their formation or by internal inefficiencies leading this type of firms to a higher rate of failure compared with conventional enterprises.

I provide an empirical assessment of the comparative survivability of WMFs and conventional firms (CFs) based on a long panel of Uruguayan firms. The study exploits social security administrative records containing monthly information on the total population of WMFs and CFs in 112 3-digit sectors over the period January 1997-July 2009. The empirical strategy is based on semi-parametric and parametric frailty survival models that impose different distributional assumptions about the shape of the baseline hazard and allow to consider firm-level unobserved heterogeneity.

This paper adds to the literature on labor-managed firms and its main contribution relies on the fact that empirical work on the effect of workers' control on firm survival is not frequent. Previous studies comparing worker-managed firms and conventional firms has been mainly concerned with employment and wages adjustments, productivity and business cycle determinants of entry and exit.<sup>1</sup> While there is some evidence on the effect of unions and employee stock ownership plans (ESOPs) on firm survivability, this is to my knowledge one of the first studies on firm survival comparing conventional firms and firms

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<sup>1</sup> Craig and Pencavel (1992; 1995), Doucouliagos (1995), Pencavel et al (2006), Pérotin (2006), Burdín and Dean (2009) and Fakhfakh et al (2012).

fully controlled by their workforce. In contrast to previous descriptive research on worker-managed firms' survivability, I rely on appropriate micro data for both types of firms and apply a broad range of survival analysis techniques. The analysis of worker-managed firms, the most radical implementation of workplace democracy and profit-sharing, may also shed light on the potential effects of more limited participatory initiatives at the firm level. Thus, this paper also contributes to the growing body of recent literature on shared capitalism.<sup>2</sup>

## **2. Theoretical literature and previous evidence**

According to Dow (2003), any theoretical explanation concerning the paucity of WMFs actual economies should rely on the identification of relevant physical and institutional asymmetries between capital and labor. The author points out that differences in alienability may determine why ultimate control rights over firms are usually assigned to capital suppliers. The author points out that while human capital is not alienable, the ownership of non-human assets can be transferred from one person to another. Dow identifies three types of asymmetries that may be important to account for different survival prospects of WMFs compared with CFs.

First, there are *commodification asymmetries* involving the ability of members to trade control positions in markets (Dow, 2003, p236). In a conventional firm, shares of stock conferring voting rights can be transferred from one person to another without changing firm's physical assets. By contrast, it is impossible to transfer control rights in a WMF without replacing one person by another in the labor process. An adverse selection problem arises in this context because a departing member might benefit by selling her position to an undesirable replacement, inflicting losses on stayers (Dow and Putterman, 2000). This is one potential explanation of why membership markets are rare and, hence, why assets in WMFs are usually owned by their workforce collectively. Under collective ownership, WMFs would make inefficient employment and investment decisions which in turn may

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<sup>2</sup> See, for instance, Kruse et al (2010).

negatively affect their survival chances compared with conventional firms (Ward, 1958; Furubotn, 1976).

In relation to employment decisions, the basic neoclassical model predicts that WMFs would not respond in the usual way to changes in the product price; instead, they would reduce the level of employment and output when the market price increases (Ward, 1958). The model assumes that WMFs maximizes revenue per worker rather than total profits. The theoretical foundations of this seminal model have been harshly criticized in the literature and the backward supply response of WMFs has not been empirically confirmed.<sup>3</sup> However, there is ample evidence that employment responses to demand shocks are less elastic in WMFs compared with conventional firms (Craig and Pencavel, 1992; Pencavel et al, 2006; Burdín and Dean, 2009). Employment smoothing may be costly for WMFs, specially in industries in which employment variability is high, even though it may also provide incentives for investments in training and firm-specific human capital (Levine and Parkin, 1994). Regarding investment decisions, WMFs would suffer from the so-called horizon problem (Furubotn, 1976). As worker-members have no claim on future investments' returns after separation from their firm, the evaluation of investment projects will be truncated to the members' expected employment horizon. Workers would prefer to distribute income in the current period instead of financing investments, unless the expected rate of return exceeds the workers' opportunity cost of the funds by an amount that depends inversely on their expected tenure within the firm (Gui, 1984). Therefore, WMFs would underinvest and would only carry out projects with short-run returns. Moreover, members of a WMF must supply financial resources as well as labor and, hence, they would invest their savings in an asset whose returns are highly correlated with the returns on their human capital. But this would be incompatible with the desire of risk-averse workers to maintain a diversified financial portfolio (Dow and Putterman, 2000).

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<sup>3</sup> This result does not necessarily hold in the case of multiproduct WMFs or when the production process involves other variable inputs apart from labor. It has also been argued that worker-members will be reluctant to vote for layoffs because in a WMF in which members are equally treated everybody faces similar probabilities of being selected for expulsion (Moene, 1989).

It is worth noticing that the underinvestment critique was originally directed to labor managed firms in which, as in the old Yugoslav system, worker-members receive a share of current profits but do not have an ownership stake.<sup>4</sup> The applicability of the theory to WMFs operating in Western market economies depends on the structure of property rights (Bonin et al, 1993). Physical assets of WMFs can be owned by their members collectively or individually. Under collective ownership members do not own tradable shares and enjoy the right to usufruct as long as they work in the firm. Under individual ownership, members own capital shares that vary with the value of the firm (Ben Ner, 1988a). The underinvestment critique applies to collectively owned WMFs, as it is the case of most Uruguayan WMFs, but not to those owned through individual shares. In the latter case, departing members are able to capture the expected value of future profits based on current investments and recoup their past contributions toward such investments by selling their shares (Dow, 1986). However, as mentioned, membership markets are rarely observed in practice<sup>5</sup>

Second, there are *commitment asymmetries* concerning the capacity of firm controllers to extend credible commitments to the suppliers of non-controlling factors. Dow argues that while giving control rights to the workforce facilitates the alignment of workers' incentives within the firm, it also makes more difficult to offer credible guarantees of repayment to investors (see also Bowles and Gintis, 1994). As in WMFs the conflict of interest between managers and workers is virtually eliminated, this type of firms would reduce supervision costs and elicit higher levels of effort through the combination of profit sharing and mutual monitoring among coworkers, overcoming the standard free-rider problem associated with team production (Alchian and Demsetz, 1972).<sup>6</sup> However, WMFs would face a disadvantage to attract capital as members may not act in the interest of the lender. They may decide to pay high wages, misuse the capital equipment or engage in risky projects. According to Dow, the net effect of these commitment problems is to bias the allocation of

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<sup>4</sup> Estrin and Uvalic (2008) discuss the underinvestment critique in the context of the Yugoslav system.

<sup>5</sup> There is also evidence that existing membership markets operate imperfectly as share prices seem to be systematically undervalued (Craig and Pencavel, 1992).

<sup>6</sup> Available empirical evidence generally indicate that worker cooperatives do not underperform conventional firms in terms of productivity (Craig and Pencavel, 1995; Jones, 2007; Fakhfakh et al, 2012; Pencavel, 2012).



control rights over firms against labor. While capitalist firms develop social conventions that would make the workplace conflict tolerable, WMFs –mainly composed by wealth-constrained workers- would have limited access to capital markets.

Finally, there are also *composition asymmetries*, involving disparities in the characteristics of control groups, such as their size or the degree of heterogeneity in members' preferences. The problems faced by WMFs with an heterogeneous workforce have been pointed out notably by Hansmann (1996). WMFs may face higher costs of collective-decision making associated with democratic governance compared with conventional organizations. While capital suppliers unanimously support the maximization of profit, workers may have widely different attitudes toward effort, investment decisions, wage levels, job security and other workplace amenities.<sup>7</sup> For instance, it has been argued that WMFs may suffer from excessive egalitarianism which in turn may cause the outflow of high ability workers (Gui, 1987; Kremer, 1997; Abramitzky, 2008).<sup>8</sup> There is empirical support for the idea that the presence of skilled labor has a positive and significant effect on firm survival (Gimeno et al, 1997; Mata and Portugal, 2002; Geroski et al, 2010). Hence, the inability of WMFs to retain skilled labor may negatively affect their survival chances compared with conventional firms.<sup>9</sup>

Compared to the extensive theoretical literature, empirical work studying the relationship between workers' control and firm survival is very uncommon. Previous studies on WMFs survival have usually lacked appropriate microdata for both types of firms and relied on aggregate descriptive comparisons (Pérotin, 1987; Ben-Ner, 1988b; Staber, 1989; Pérotin, 2004). Close to the empirical approach adopted in this paper, Park et al (2004) studied the effect of employee ownership plans (ESOPs) on firm survival, relying on data from U.S. public companies and estimating a Weibull model. The study found that employee

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<sup>7</sup> Conventional investors may have different time horizons and time preference rates and these may also result in collective choice problems regarding investment decisions in capitalist firms (Pencavel, 2012).

<sup>8</sup> Indeed, survey evidence indicates that WMFs usually have a more compressed wage structure than conventional firms (see, for instance, Bartlett et al, 1992).

<sup>9</sup> Inequality may be detrimental for firm performance if it increases perceptions of unfairness among workers and deters cooperation in the workplace (Akerlof and Yellen, 1990; Levine, 1991; Baron and Pfeffer 1994).

ownership increases the probability of firm survival.<sup>10</sup> The author suggested that the higher survival may be explained by the greater employment stability exhibited by these companies.<sup>11</sup>

### **3. Worker-managed firms in Uruguay**

In Uruguay, WMFs are defined as firms legally registered as Producer Cooperatives in which the ratio between permanent employees and members does not exceed 20%. Despite the fact that WMFs are allowed to hire temporary employees in response to seasonal demand changes, they must fulfill this maximum level of hired workers to be entitled with certain tax advantages. In particular, WMFs are exempted from paying the employer payroll tax to social security. Finally, the law defines a minimum of six members in order to register a new cooperative firm.

Even though certain key organizational features are predetermined by law, WMFs are free to decide upon a broad range of associational rules. Regarding their governance structure, WMFs have a General Worker Assembly that selects a Council (who usually selects the managers) to supervise the daily operations. Each member within the assembly has only one vote, regardless of her capital contribution to the firm. Uruguayan WMFs mainly operate under a collective ownership regime. As is common in other countries, membership markets are extremely rare in Uruguay. Recent survey evidence indicates that less than 10% of Uruguayan WMFs are owned by their workforce through individual shares (Alves et al, 2012). WMFs usually use two sources to finance their activities: bank loans and retained earnings. As capital markets play a minimal role in the financing and capitalization of Uruguayan firms, most conventional firms operate as closely held firms.

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<sup>10</sup> A related strand of research analyzes the relationship between unionization and closures (Freeman and Kleiner, 1999; Bryson, 2004; DiNardo and Lee, 2004).

<sup>11</sup> Park et al (2004) identified employee-owned firms as those in which workers own 5% or more stock of the company. This raises the concern about the limited scope of workers' control in most of these companies.

Previous studies have shown that Uruguayan WMFs exhibit a different adjustment process of wage and employment levels compared with conventional firms. The employment responses to idiosyncratic and macroeconomic shocks seem to be less elastic in WMFs than in conventional firms (Burdín and Dean, 2009; 2012).

#### **4. Data and descriptive statistics**

This study is performed using an unbalanced panel of Uruguayan firms, consisting of monthly firm-level observations over the period January 1997- July 2009. The data set is based on social security administrative records provided by *Banco de Previsión Social* (BPS), the public agency in charge of social security affairs in Uruguay. The data set covers the entire population of firms registered as Producer Cooperatives (PCs) and conventional firms in 112 3-digit sectors in which at least one PC was registered during that period. The available firm-level information includes firms' industry class (5 digits, ISIC, fourth revision), employment, and average wage, distinguishing members and non-members in the case of PCs. The analysis is based on all cohorts of newly formed firms since February 1997 onwards. I do not consider firms that were already active at the beginning of the observation period (January 1997) as their spells are left-censored, i.e. there is no information on their starting dates.<sup>12</sup>

Previous studies on Uruguayan WMFs have pointed out that not all firms registered as PCs should be considered as WMFs. Specifically, in many firms legally registered as PCs the majority of the workforce has no control over firm decisions as in conventional firms (Burdín and Dean, 2009; 2012). I distinguish WMFs from the total population of producer cooperatives using information of the ratio between employees and members. I define WMFs as those firms registered as PCs in which this ratio is no greater than 20% (measured at the time of entry). I drop observations on producer cooperatives in which the computed employee-to-member ratio is greater than 20%.

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<sup>12</sup> Left-censored firms have already been exposed to the risk of failure for an unknown amount of time before coming under observation.

Regarding the identification of firms' failures, I proceed in the following manner. All private Uruguayan firms must transfer employees' social security contributions; when a new firm is registered as active in BPS files, an entry can be identified in the data, while a firm cancellation indicates it is no longer active as such (i.e., a "failure"). Hence, the date of entry and exit of each firm can be determined accurately.<sup>13</sup> "Failure" is a dummy variable which takes value 1 (at the exit date) if the firm exits during the period and 0 otherwise.

The way in which failures are identified in the data requires two further clarifications. First, information regarding the reason for dissolution is not available. This is a potential limitation as cases of successful firms dissolved from being bought out by another firm may be counted as failures. Specifically, it is not possible to identify mergers and acquisitions. However, anecdotal evidence suggests that a negligible fraction of dissolutions seems to be explained for these reasons.<sup>14</sup>

Second, a broader definition of organizational failure may not only include dissolutions but also transformations of one organizational type into another type (Ben-Ner, 1988a). For instance, workers may buy out a CF in financial distress and convert it into a WMF in order to prevent the firm from shutting its doors. Conversions of CFs into WMFs cannot be identified in the data. However, survey evidence indicates that most Uruguayan WMFs were created from scratch. Only 11% of total PCs that were active in 2009 had been formed through conversions of conventional firms (Alves et al, 2012). In addition, it has been argued that successful WMFs may degenerate into CFs increasing the employee-to-member ratio over time (Ben-Ner, 1984). Considering the impossibility of providing a unified treatment of conversions in both CFs and WMFs, cases of WMFs that increase their employee-to-member ratio surpassing the initial threshold of 20% over the course of their

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<sup>13</sup> Audretsch et al (1999) investigated the relationship between start up size and firm survival also using social security records from Italy.

<sup>14</sup> There are no official statistics on mergers and acquisitions in Uruguay. The firms are obliged to inform mergers and acquisitions to the Commission for the Promotion and Defense of Competition (Ministry of Economy and Finance) only in cases in which such operations involve substantial changes in the market structure. For instance, the commission received only eleven notifications of mergers and acquisitions during the period 2009-2011.

life were not computed as failures.<sup>15</sup> Hence, the definition of “failure” used in the analysis only refers to dissolutions.

The basic information on the firm-level panel for the final sample is reported in Appendix Table A1. There are 29125 different firms, including 223 WMFs (i.e. 1% of total firms in the sample and 74% of total firms registered as PCs). As the average number of monthly records per firm is 43.21, the total number of firm-month observations in the data is 1258606. There are approximately 15% of firms with time gaps (interval truncation) and the median gap length is 5 months. A gap in a firm’s spell may be due to temporal interruption of operations or to the fact that the firm exits and restarts with the same identification number. The social security agency keeps the original identification in both cases. Temporal exits from the panel are not computed as failures. The number of firms’ failures is 15308, including 90 failures of WMFs. The average failure rate is lower in WMFs (40.4%) than in CFs (53%).

Table 1 reports information on the characteristics of both types of firms. Firm start-up size is larger in WMFs than in CFs. While most CFs (84%) are classified as micro-enterprises (less than 6 workers), WMFs (63%) are typically small firms (between 6 and 18 workers).<sup>16</sup> This is due to the fact that the Uruguayan law determines that WMFs cannot be formed with less than six members. WMFs are highly concentrated in Services (49%) and CFs are more frequently located in Manufacturing, Transport and Other Sectors (Construction, Electricity and Retail Trade). The average firm wage at the entry date is higher in CFs than in WMFs.

{ { Place Table 1 about here } }

As expected, the comparison between dying and surviving firms indicates that survival is positively associated with employment and wage growth in both WMFs and CFs (see

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<sup>15</sup> Below, I analyze the sensitivity of the results to the inclusion of this group of WMFs.

Appendix Table A2). This suggests that firm survival is associated with better firm performance no matter whether the dissolution decision is controlled by the workforce or by conventional investors. Interestingly, firm survival seems to be negatively correlated with both wage and employment variability. WMFs exhibit significantly less employment variability, more wage volatility and experience higher wage growth and lower employment growth rates than CFs. A similar pattern arises when microenterprises are excluded, except from the fact that the differences in terms of employment growth reverse in favor of WMFs. As mentioned, the Uruguayan law defines a minimum of six members in order to start-up a WMF. Hence, the higher employment growth rates of CFs compared to WMFs, when the whole sample is considered, may simply reflect a composition effect associated with the fact that firm's growth is inversely related with start-up size (see, for instance, Audretsch et al, 1999). However, among those firms that do not fail employment grow faster in CFs than in WMFs.

The descriptive analysis of the comparative demographic behavior of WMFs and CFs shows interesting results. Birth and exit rates of WMFs and CFs during this period are presented in the Appendix Figure A1 and A2. The average birth and exit rate for WMFs is 10% and 7% respectively. In the case of CFs, 11% of firms enter and 11% of firms exit the market in a given year (when microenterprises are excluded the average birth and exit rates are 5.5% and 7.5% in that order). Figure 1 reports non-parametric estimates of the survivor and hazard function, pooling all cohorts of newly formed firms during the period 1997-2009. At first glance, WMFs seem to have a lower hazard rate than CFs. According to the Log-rank test, I reject the null hypothesis of equality of the survivor functions ( $\chi_{(1)} = 10.1$ ).<sup>17</sup> The hazard exhibits an inverted U-shape for both WMFs and CFs, reaching a maximum around the second year of the firm lifespan and then decreasing with firm age. The pattern of greater vulnerability of young firms observed in the data seems consistent with the “liability of newness” argument developed in the organizational ecology and

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<sup>16</sup> This right-skewed size distribution is characteristic of Uruguayan firms. For instance, data from the National Statistical Institute indicate that 83% of Uruguayan firms employed less than 5 workers in 2010 ([www.ine.gub.uy](http://www.ine.gub.uy)).

<sup>17</sup> Burdín and Dean (2010) obtained similar results comparing non parametric estimates of the hazard of exit for Uruguayan WMFs and CFs over the period 1996-2005.

industrial organizational literature on firm survival (Jovanovic, 1982; Freeman et al, 1983; Geroski, 1995).<sup>18</sup>

{{ Place Figure 1 about here }}

Figure 2 provides further exploratory analysis of the data, reporting the survivor functions by cohorts of firms and sectors. WMFs do not seem to underperform CFs in any cohort. Indeed, WMFs exhibit better performance than CFs in most cohorts, particularly when the comparison is restricted to Retail Trade and Services. However, one should be caution to draw definitive conclusions from these graphs for two reasons. First, non-parametric estimates do not account for other factors that may affect firm survival. Second, given the small number of total WMFs, cohort-sector specific survivor functions are rather imprecisely estimate. For these reasons, I provide in the next sections a more rigorous econometric test of the differences in survivability between WMFs and CFs, estimating semi-parametric and parametric duration models.

{{ Place Figure 2 about here }}

## 5. Econometric framework

The variable of interest in the analysis of firm survival is the time elapsed between entry and exit.<sup>19</sup> The lifespan of each firm either can be fully observed (complete spell) or right-censored (incomplete spell). It is assumed that the length of this spell  $t > 0$  is the realization of a random variable  $T$  with a cumulative distribution function (cdf) and probability distribution function (pdf) given by  $F(t)$  and  $f(t)$  respectively.  $F(t)$  is also known as the failure function. The survivor function is defined as  $S(t) \equiv 1 - F(t)$  and

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<sup>18</sup> The “liability of newness” refers to the higher risk of failure faced by younger firms (Stinchcombe, 1965).

<sup>19</sup> This section draws on Jenkins (2005).

represents the probability of surviving beyond time  $t$ .<sup>20</sup> The pdf is the slope of the failure function such that,  $f(t) = \lim_{\Delta t \rightarrow 0} \frac{P(t \leq T \leq t + \Delta t)}{\Delta t} = \frac{\partial F(t)}{\partial t} = -\frac{\partial S(t)}{\partial t}$ .

The survivor function  $S(t)$  and the failure function  $F(t)$  both satisfy the properties of probabilities.  $S(t)$  is bounded between zero and one and is strictly decreasing in  $t$ ,  $S(t)$  is equal to one at the beginning of the spell and zero at infinity. The hazard rate,  $h(t)$ , is defined as the instantaneous chance of failure at time  $t$ . More precisely, it is the conditional probability that the firm exits the market at time  $t$ , conditional on the fact that the firm has been active until  $t$ , such that  $h(t) = \frac{f(t)}{1 - F(t)} = \frac{f(t)}{S(t)}$ . Finally, the cumulative hazard rate,

$H(t)$ , is defined as the integral of the hazard rates over  $(0, t)$ , such that  $H(t) \equiv \int_0^t h(u) du$ .<sup>21</sup>

The shape of the hazard function is in principle unknown so it is necessary to impose distributional assumptions on the data. To avoid misspecification errors, I estimate a Cox proportional hazard model. This model, originally proposed by Cox (1972), has been widely used in the literature on firm survival (for a review see Manjón and Arauzo, 2008). The main advantage of this model relies on the fact that it is possible to estimate the relationship between the hazard rate and the covariates without making assumptions about the functional form of the baseline hazard. The Cox model is specified as follows:

$$h(t | \cdot) = h_0(t) \exp(\beta_1 COOP_i + \beta_2 X_i) \quad (1)$$

where  $h_0(t)$  is the baseline hazard function, COOP is a dummy variable that takes value equal to one if the firm is a WMF and  $X$  is a vector of control variables (firm size and average wage at the entry date, cohort dummies, industry dummies). The coefficient of

<sup>20</sup> More precisely,  $P(T \leq t) = F(t)$ , which implies for the survivor function that  $P(T > t) = 1 - F(t) \equiv S(t)$ .

<sup>21</sup> The only restriction on the hazard rate is that  $h(t) \geq 0$ . Note that  $H(t) \geq 0$  and  $\partial H(t) / \partial t = h(t)$ .



interest is  $\beta_1$ . The effect of a unit change in a covariate is to produce a constant proportional change in the hazard rate, i.e. the proportional hazard assumption.

## 6. Results

Table 2 reports the estimates of the baseline Cox-model. In Column (1), the estimation only control for firm's start-up size and average wage. More precisely, estimates include the log of employment at the time of entry.<sup>22</sup> The firm average wage at the entry date is included as a rough proxy of the starting firm quality. For instance, the average wage may reflect the initial endowment of human capital within the firm. In Column (2), the estimates include 4 industry dummies in order to control for time-constant industry characteristics.

It has been argued that the environment at the time of birth largely determines the strategic choices of firms. Organizations founded in unfavorable times are unlikely to be close to their optimal structural configuration and may not be able to find the right kind of resources, make the correct organization specific investments, or design appropriate organizational routines (Geroski et al, 2010). Furthermore, entrepreneurs who have entered self employment from unemployment exhibit higher exit rates than those who have entered from paid employment (Pfeiffer and Reize, 2000). Indeed, there is evidence pointing out that if the underlying motivation to start a new firm is linked to innovative projects, then better post-entry performance may be expected than if a new firm is started on the basis of a purely "defensive" motivation, such as the fear of becoming unemployed (Vivarelli and Audretsch, 1998; Santarelli and Vivarelli, 2007). The effect of founding conditions may be important in this setting as it is well known that WMFs exhibit higher formation rates in recessions (Pérotin, 2006). Therefore, in Column (3) estimates also include 12 cohort dummies in order to control for macroeconomic conditions at the time of entry.<sup>23</sup>

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<sup>22</sup> Small firms may operate at a sub-optimal scale level of output and face a cost disadvantage with respect to larger firms (Caves, 1998; Geroski, 1995; Audretsch and Mahmood 1995, Mata and Portugal 1994; Esteve et al, 2004).

<sup>23</sup> The inclusion of cohort dummies also ensures that the assumption that the true duration is independent of the starting and censoring time holds (Wooldridge, 2001: p696).

Results indicate that WMFs exhibit higher survival chances than capitalist firms and the difference is highly significant in all specifications. According to estimates reported in Column (3) of Table 2, the hazard of dissolution is about 25% lower for WMFs than for CFs.<sup>24</sup> The included control variables have the expected effect. In line with the large IO literature on firm survival, there is a negative and significant relationship between initial firm's size and the hazard of exit. Moreover, survival prospects are positively associated with the firm average wage at the time of entry. The estimated hazard function - obtained from the Cox regression- is plotted in the Appendix Figure A4.

{{ Place Table 2 about here }}

To check the sensitivity of the results, alternative estimates were performed including year fixed effects to control for current macroeconomic conditions. I also estimated the model including four start-up size categories (distinguishing micro, small, medium and large firms) and 66 2-digit industry dummies and analyze whether the results are affected by the exclusion of firms with time gaps in their records. Finally, to check whether the result is driven by the way in which I identified WMFs, I estimated the model comparing conventional firms with all firms registered as PCs. Neither of these modifications alter the results.<sup>25</sup>

The observed difference between WMFs and CFs may simply reflect industry differences in demand volatility. To rule out this possibility, Column (1) of Table 3 presents the results of additional estimates of the baseline Cox model, excluding construction and retail trade firms.<sup>26</sup> I exclude these sectors because the presence of WMFs is comparatively low. The results are very similar compared with baseline estimates. Even excluding firms located in

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<sup>24</sup> I check the empirical plausibility of the proportional hazard assumption by means of graphical methods (Cleves et al, 2008). This assumption seems to be satisfied by the data (see Appendix Figure A3). According to the test based on the Schoenfeld residuals for the variable *Coop*, I do not reject the proportional hazard (PH) assumption. However, the PH assumption is rejected when the global test of the model is considered (Appendix Table A3). For this reason, in the next section I analyze the sensitivity of the results providing additional estimates of parametric models that do not rely on the PH assumption.

<sup>25</sup> All these additional estimates are available from the author upon request.

<sup>26</sup> It is worth mentioning that during this period the Uruguayan law forbade the formation of WMFs in Retail Trade.

high firm turnover sectors, the hazard of exit is 24% lower for WMFs than for CFs ( $\exp(-0.272)-1$ ). In Column (2)-(4) of Table 3, I report the results of separate estimates for Manufacturing, Transport and Services. While in Manufacturing and Transport the hazard of exit is not significantly different, in the Service sector the hazard of exit of WMFs is 46% lower compared with CFs ( $\exp(-0.619)-1$ ). Thus, the better performance of WMFs in the Service sector explains the aggregate results obtained in the baseline estimates. This is consistent with fact that firms in the services sector have lower physical capital requirements compared to other sectors. According to theoretical explanations previously discussed, this is precisely the kind of economic environment in which one would expect that WMFs outperform conventional firms (see, for instance, Bowles and Gintis, 1994; Dow, 2003).

{{ Place Table 3 about here }}

## **7. Robustness checks**

I performed a large number of robustness checks, addressing the following issues: i) differences in the size composition of both types of firms, ii) conversions of WMFs into CFs, iii) differences in tax regimes, iv) unobserved heterogeneity and alternative parametric specifications of the hazard function. All of these estimates are presented in Columns (1)-(6) of Table 4.

### *7.1 Size composition*

One important concern regarding the estimates presented in the previous section refers to the different size composition of both groups of firms. As explained, the Uruguayan law establishes that WMFs must be formed with at least six workers. This formal rule seems to be enforced reasonably well: on average only 18% of WMFs can be defined as micro-enterprises. By contrast, 85% of CFs start-up with less than six workers (see Table 1). It is a stylized fact in the literature on firm survival that survival chances positively depend on firm size (Caves, 1998; Audretsch and Mahmood; 1994; Bartelsman et al., 2005). Therefore, results presented in the previous section may be an artifact of the different size

composition of both types of firms. Column (1) of Table 4 reports the estimates of the Cox model excluding micro-enterprises.<sup>27</sup> It is worth considering that in this case estimates are performed with 201877 observations (i.e. 16% of the original sample). Despite this dramatic loss of information, results remain qualitatively unchanged. WMFs exhibit higher survival chances than CFs even excluding microenterprises. I continue restricting estimates to firms employing at least six workers at the time of entry through out the rest of the analysis.

## *7.2 Degeneration*

WMFs were identified in the data as those firms registered as PCs in which the employee-to member ratio was no greater than 20% at the time of entry. This implies that previous estimates may be pooling WMFs in which the employee-to-member ratio evolved very differently, including cases of WMFs in which the ratio surpass the initial threshold of 20% at some point in time. It is worth noticing that hired workers in WMFs, similarly to what occur in CFs, do not have formal control rights over the organization, which means that the higher the fraction of employees the lower the proportion of the workforce involved in decision-making within the firm. One could argue that in such cases WMFs have survived longer but at the expense of degenerating into CFs (Ben-Ner, 1984).<sup>28</sup> However, it is doubtful whether a WMF that surpass the 20% threshold in a given month can be considered a case of organizational transformation as the law allows WMFs to exceed the threshold temporarily to cope with seasonal demand increases. A better approximation is to define conversions of WMFs into CFs as those WMFs in which the employee-to-member ratio averaged during their entire spells exceeds 20%. Column (2) of Table 4 reports additional estimates excluding those cases. Results remain qualitatively unchanged. Workers' control is positively associated with firm survival, even excluding that group of WMFs.

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<sup>27</sup> As reported in Table 1, the size composition of WMFs and CFs becomes rather similar after the exclusion of microenterprises.

<sup>28</sup> Burdín and Dean (2009) did not find support for the degeneration hypothesis in the Uruguayan case.

### 7.3 Differences in tax regimes

As in most countries, WMFs in Uruguay benefit from a favorable tax treatment. Specifically, they are exempted from paying the employer payroll tax (i.e. employer contributions to the pension system) for the fraction of the wage bill corresponding to members (this exemption does not hold for hired workers).<sup>29</sup> In fact, as reported in Table 1, this implies that WMFs face a lower effective tax burden than CFs. One may argue that the superior performance WMFs in terms of survivability is simply a by-product of this favorable tax regime. Interestingly, during this period there was considerable variability in payroll tax rates applied to CFs across industries and over time, including sub-periods of zero tax rate in specific sectors (Manufacturing, Transport). In addition, the Uruguayan Constitution establishes further tax exemptions in sectors in which WMFs and conventional firms compete, such as in the provision of educational services. Hence, CFs also enjoy full or partial tax exemptions in many sectors during the period of analysis (Bucheli and Vigna, 2006).<sup>30</sup>

Using the information on the 5-digit industry classification and the wage bill of each firm (distinguishing members and employees in WMFs), I construct a measure of the *effective tax burden* faced by each firm over time. I define the effective tax rate faced by firm  $i$  at time  $t$  as the total payroll tax bill divided by the total wage bill and, hence, given by  $T_{it} = \frac{Taxbill_{it}}{W_{it}}$ . This variable intends to control for differences in non-wage labor costs faced by both types of firms. Results are presented in Column (3) of Table 4. The effect of the *effective tax burden* on the hazard of exit is significantly positive, though rather small. One percentage point increases in the tax burden increases the hazard by 3%. The condition of being a WMF still has a negative effect on the hazard compared with CFs. The magnitude of the effect is smaller compared to estimates reported in Column (1) of Table 4: the hazard rate is about 29% lower for WMFs than for CFs.

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<sup>29</sup> Uruguayan WMFs are also fully exempted from the corporate income tax (IRAE). However, the corporate tax rate is quite low in Uruguay (25%). Available estimates indicate that the corporate income tax represents on average 1% of firm revenue in Uruguay (Gonzalez and Montero, 2008).

<sup>30</sup> Table A4 (Appendix) provides a detailed description of the evolution of tax rates by sectors between 1997 and 2009.

#### 7.4 Unobserved heterogeneity and parametric specification of the hazard

The Cox model allows to estimate the effect of covariates without making assumptions about the pattern of duration dependence of the hazard. Although this procedure minimizes specification errors, it produces less efficient estimates compared to the “correct” parametric model. Moreover, previous estimates have assumed that all differences between firms are captured by observed explanatory variables. This may bias coefficient’s estimates and overestimate the negative duration dependence of the hazard function, i.e., the duration dependence of the hazard may be less negative when unobserved heterogeneity is present (Jenkins, 2005). Therefore, I consider a generalization to allow for unobserved firm-specific effects (“frailty”). A frailty model defines the hazard to be <sup>31</sup>:

$$h(t_i | x_i, \alpha_i) = \alpha_i h(t_i | x_i) \quad (2)$$

where  $\alpha_i$  is some unobserved-observation specific effect. The effect  $\alpha_i$  is known as frailty and indicates that firms are heterogeneous due to factors that remain unobserved. It is assumed that  $\alpha_i$  has mean one and variance  $\theta$ , where  $\theta$  is estimated from the data. The relationship between the hazard and survivor function is such that

$$S(t_i | x_i, \alpha_i) = \{S(t_i | x_i)\}^{\alpha_i} \quad (3)$$

where  $S(t_i | x_i)$  is the survival function for a standard parametric model. The unconditional survival function is obtained by integrating the unobservable  $\alpha_i$ . Assuming that  $\alpha_i$  follows a gamma distribution and has a pdf  $g(\alpha_i)$ , then the unconditional survivor function is such that

$$S_{\theta}(t_i | x_i) = \int_0^{\infty} \{S(t_i | x_i)\}^{\alpha_i} g(\alpha_i) d\alpha_i \quad (4)$$

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<sup>31</sup> The formal exposition draws heavily on Cleves et al (2008).

where,

$$g(\alpha_i) = \frac{\alpha_i^{1/\theta-1} \exp(-\alpha_i/\theta)}{\Gamma(1/\theta)\theta^{1/\theta}} \quad (5)$$

Finally, combining (4) and (5), the following expression is obtained:

$$S_\theta(t_i | x_i) = \left[ 1 - \theta \ln \{ S(t_i | x_i) \}^{\alpha_i} \right]^{-1/\theta} \quad (6)$$

The frailty model is the standard parametric model with the addition of one new parameter,  $\theta$ .<sup>32</sup> Assuming a Weibull distribution of the hazard with gamma-distributed heterogeneity, the survivor function can be written as follows:

$$S_\theta(t_i | x_i) = \left[ 1 - \theta \exp(\beta_0 + x_j \beta_x) t_j^p \right]^{-1/\theta} \quad (7)$$

Estimates of this model are reported in Column (4) of Table 4. Results remain unchanged: WMFs exhibit a lower hazard than CFs.<sup>33</sup> The estimated parameter  $1 < \hat{p} < 2$  in the Weibull model indicates that the hazard is increasing over time at a decreasing rate.<sup>34</sup> This pattern of duration dependence is not consistent with the shape of the hazard reported in Figure 1. Considering the potential misspecification of the hazard, Column (5) reports the estimates of the frailty model assuming a log-logistic distribution of the hazard. Results are qualitatively similar. The status of WMF is positively associated with longer survival times.<sup>35</sup> As the estimated parameter  $\hat{\gamma} < 1$ , the log-logistic hazard increases and then decreases which in turn is consistent with the inverted U-shaped pattern described by Figure 1.

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<sup>32</sup> It is worth noting that  $S_\theta(t_i | x_i)$  reduces to  $S(t_i | x_i)$  as  $\theta$  goes to zero.

<sup>33</sup> The Wald test for  $H_0 : \ln(p) = 0$  for which the test statistic is 8.98 leads to rejection of the null hypothesis of constant hazard.

<sup>34</sup> The 95% confidence interval for  $\hat{p}$  is (1.239 1.397).

<sup>35</sup> The log-logistic model has no Proportional Hazard interpretation as it is defined in the Accelerated Failure Time (AFT) metric. The effect of the covariates must be interpreted in terms of survival time and not in terms of the hazard. Therefore, the magnitude of the effect cannot be compared with Cox model estimates.

Finally, Column (6) of Table 4 presents the estimates of a Generalized Gamma Model.<sup>36</sup> Apart from the coefficient  $\beta$ , this model involves the estimation of two additional parameters,  $\kappa$  and  $\sigma$ . The gamma model presents two main advantages. First, this model possesses a highly flexible hazard function, allowing a large number of possible shapes. Second, this distribution includes as special cases the Weibull model ( $\kappa=1$ ), the Exponential model ( $\kappa=1, \sigma=1$ ) and Log-Normal model ( $\kappa=0$ ). The fact that these parametric models are nested allows the use of the Gamma model for searching the appropriate parametric specification for the data. The estimate indicates that the status of WMF has a positive effect on survival time. The estimate of the coefficient of interest  $\hat{\beta}^{COOP} = 0.545$  indicates that the status of WMF increases the expected value of  $\ln(t)$  by 0.545, i.e. for a firm predicted to fail at  $t=1$ , the status of WMF would delay the predicted time of failure to  $\exp\{\ln(1) + 0.545\} = 1.725$ .

The Wald test for  $H_0: \kappa=1$  leads to a strong rejection of the Weibull model ( $\chi_{(1)} = 185.59$ ). The result of the Wald test for  $H_0: \kappa=1, \sigma=1$  also allows to discard the Exponential model ( $\chi_{(1)} = 260.35$ ), suggesting that the hazard is not constant over time. The 95% confidence interval for  $\hat{\kappa}$  is (-0.111 0.169) which indicates that  $H_0: \kappa=0$  is not rejected. This means that a log-normal model would provide similar estimates to the Gamma model.<sup>37</sup>

{ { Place Table 4 about here } }

## 8. Exploring possible explanations

The results presented in the previous sections are surprising considering several theoretical predictions suggesting that WMFs will have lower survival chances than conventional

<sup>36</sup> The Gamma model is also defined in the AFT metric.

<sup>37</sup> In fact, the Log-Normal model gives the highest Akaike Information Criterion (AIC) index which suggests its selection among several parametric models (Appendix Table A5).



firms. In this section, I evaluate the relevance of different explanations that may account for the previous findings.<sup>38</sup>

The greater survival of WMFs may simply reflect the fact that worker-members exert control over the dissolution decision, particularly when outside job opportunities are scarce. Members may be more reluctant to close than conventional investors and decide to continue running the firm just in order to secure their jobs. It is doubtful whether the greater survival of WMFs can be interpreted as a measure of firm performance in this case. From a social point of view, it might be better to dissolve the firm and reallocate labor and physical assets to more productive firms. In fact, the period analyzed in this paper includes four years (1999-2002) in which Uruguay faced a deep economic crisis. This may partly explain the large difference in survival prospects in favor of WMFs found in the previous sections.

To rule out this explanation, I split the analysis in two four-year sub-periods characterized by very different macroeconomic conditions and perform separate survival estimates for each period. During the period 1999-2002, the Uruguay experienced a severe economic crisis. The average GDP growth rate was -3.7% and the unemployment rate rose to 17% in 2002. By contrast, between 2004 and 2007 the Uruguayan economy performed extremely well, the GDP grew on average 5.8% and the unemployment rate decreased to 9.6% in 2007. The average unemployment rate was 2.7 percentage points lower compared to the period 1999-2002 (see Appendix Table A6).

Table 5 reports the results of separate estimates for the two periods of a parametric survival model that assumes an exponential distribution of the baseline hazard.<sup>39</sup> If the greater survival of WMFs is mainly driven by the lack of alternative jobs, one should observe that WMFs outperform CFs mainly during the period 1999-2002. The estimates do not seem to support this hypothesis. The status of WMFs significantly reduces the hazard of dissolution under both expansionary and recessionary macroeconomic conditions. Indeed, the

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<sup>38</sup> This section draws on helpful comments and suggestions provided by an anonymous referee.

<sup>39</sup> The crucial assumption of this model is that the firm faces the same hazard at any age (constant hazard), which allows the inclusion of left-censored firms, i.e. firms that are already active at the beginning of each sub-period (1999 and 2004 respectively). Cox model estimates, also reported in Table 5, provide very similar results.

comparison of point estimates suggests that the magnitude of the effect is slightly larger for the economic boom than for the recession.<sup>40</sup> The greater survival of WMFs is not just the outcome of defensive strategies implemented by insiders during bad economic times.

{{ Place Table 5 about here }}

A more straightforward explanation is that WMFs survive longer because they are more productive than CFs as some studies have shown (Craig and Pencavel, 1995; Perotin et al, 2012). As reported in Appendix Table A2, firm survival is positively associated with wage growth and WMFs exhibit higher wage growth – a crude proxy of productivity growth– than their conventional counterparts, even excluding microenterprises. Unfortunately, the lack of information on output and non-labor inputs in social security records precludes to construct appropriate productivity indicators at the firm level.

Compensation flexibility and employment stability may be other possible mechanisms accounting for the lower risk of dissolution of WMFs. Indeed, there is extensive evidence suggesting that WMFs cope with negative demand shocks differently, exhibiting greater employment stability and wage variability than conventional firms (Craig and Pencavel, 1992; Pencavel et al, 2006, Pencavel, 2012). This empirical regularity has also been proved to hold in the Uruguayan case (Burdín and Dean, 2009). It has also been argued that employment stability may affect firm survival through labor productivity. Long-term employment relations may create better incentives to invest in training and firm-specific human capital. Workers may also be more willing to share productive information with managers as productivity improvements will not jeopardize their jobs (Levine and Parkin, 1994).

Table A2 also reports that WMFs exhibit significantly greater compensation flexibility and employment stability than CFs. In addition, Somewhat surprisingly, information provided in Table 3 shows that compensation flexibility is not a good candidate to explain the greater

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<sup>40</sup> The effect of WMF on the hazard of exit for the sub-period 1999-2002 is statistically significant only at 10%.

survival of WMFs as surviving firms generally exhibit lower wage variability than dying firms. By contrast, firm survival seems to be positively correlated with employment stability.

To provide additional evidence on the role played by these mechanisms, I estimate the Cox model sequentially adding wage variability and employment variability as control variables. As pointed out, WMFs significantly differ from CFs in terms of these variables. Hence, if some of these factors mediate the relationship between workers' control and firm survival, one would expect that their inclusion will partly absorb the observed effect of WMF.<sup>41</sup> Results are reported in Table 6. For simplicity, Column (1) of Table 6 reproduces the baseline results excluding microenterprises.<sup>42</sup> Column (2) presents the estimates of the Cox model including an indicator of wage variability. Consistently with the descriptive analysis presented in Table A2, there is a significantly positive association between wage variability and the hazard of dissolution. The estimated coefficient of WMF remains unchanged compared to the baseline estimates, suggesting that compensation flexibility in itself does not explain the positive association between workers' control and firm survival. Column (3) reports the results of the Cox model in which differences in employment variability between firms are controlled for. There is a positive correlation between employment instability and the hazard of exit. Interestingly, the negative effect of WMFs on the hazard decreases considerably and remains statistically significant only at 10%, suggesting that employment variability is partly picking up the effect of workers' control on survival. Differences in employment variability roughly explain 34% of the difference in the hazard of dissolution between WMFs and CFs reported in Column (1) of Table 6.<sup>43</sup>

{ { Place Table 6 about here } }

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<sup>41</sup> This approach is similar to the one adopted by Park et al (2004).

<sup>42</sup> Firms with very short spells (less than 12 months) are excluded by construction as it is not possible to compute the annual change in employment and wages for those firms. This explains the slight variation in the estimates and the number of observations compared to Column (1) of Table 7.

<sup>43</sup> This is computed as  $(0.734-0.6)/(1-0.6)=0.34$ .

Considering the potential endogeneity of these variables, I perform additional estimates measuring these variables just over the pre-2004 period and studying their effect on the post-2003 likelihood of survival. In this case, the analysis is restricted to pre-2004 cohorts of firms. It is reasonable to assume that the pre-2004 values of these variables are exogenous with respect to the post-2003 firm survival. Results remain qualitatively unchanged. The effect of workers' control on firm survival is lower and no longer significant after controlling for the pre-2004 employment variability (see Appendix Table A7). Therefore, the greater survival of WMFs appears to be partly linked with lower employment variability, implying that employment stability may be a potential mediator between workers' control and firm survival. This result is in line with previous evidence on the effect of employee stock ownership plans (ESOPs) on firm survival (Park et al, 2004)

## **9. Conclusions**

Based on a long micro-panel of Uruguayan firms, I conduct a survival analysis comparing WMFs and CFs. In contrast to the theoretical "pessimism" regarding the viability of workers' control in market economies, I find that WMFs exhibit lower hazard rates (longer survival times) than CFs. This finding remains robust to the exclusion of microenterprises, to the exclusion of high firm turnover sectors in which WMFs are less frequently observed and to alternative estimation strategies based on semi-parametric and parametric frailty models. Moreover, the results do not seem to be driven by the differential tax regime applied to WMFs. The hazard of dissolution is 29% lower for WMFs than for CFs after controlling for differences in the tax burden faced by the two types of firms and excluding microenterprises.

This finding seems to contradict several theoretical predictions that WMF will have performance problems and higher risk of dissolution related, for instance, with poor work incentives, inefficient investment and risk taking decisions and costly collective-choice problems (see, for a review, Dow and Putterman, 2000; Dow, 2003). I do not specifically address whether or not WMFs suffer from some of these problems. Nevertheless, the

evidence suggests that the disadvantages pointed out in the theoretical literature (if exist) may be counterbalanced by other comparative organizational advantages.

I examine several possible explanations for the results. WMFs outperform CFs under both recessionary and expansionary macroeconomic conditions, suggesting that the greater survivability of WMFs cannot be merely explained by the fact that members exercise their control rights over the dissolution decision when outside job opportunities are scarce. Compensation flexibility does not explain in itself the greater survival of WMFs as firm survival is generally correlated with lower wage variability. The positive effect of workers' control on firm survival seems to be associated with the greater employment stability exhibited by WMFs. Long-term employment relationships may encourage worker-members to make firm-specific investments and facilitate organizational changes which in turn may increase productivity and survival prospects (Levine and Parkin, 1994). Consistently with this argument, survey evidence comparing WMFs and CFs in Uruguay indicates that WMFs employ less supervisors compared with CFs, rely more on mutual monitoring among co-workers and are more likely to introduce organizational innovations such as team work, quality groups, job rotation and consultation mechanisms (Alves et al, 2012).

This study has some caveats that deserve further analysis. First, direct measures of firm productivity were not available. The evidence indicate that greater survivability of WMFs is coupled with higher wage growth compared to CFs. However, wage growth is at best a crude proxy for productivity growth at the firm level. This suggests the importance of conducting further longitudinal studies comparing other performance measures apart from firm survival.<sup>44</sup> Second, the fact that WMFs survive longer may partially reflect self-selection of both WMFs into industries and workers into organizational forms. It may be the case that WMFs firms are not randomly sorted into industries or, in other words, they enter in industries in which they might face better survival prospects. Workers may be also self-selected into organizational forms according to unobservable characteristics that might also affect firm survival. As Chiappori and Salanié (2003) point out, the combination of unobserved heterogeneity and endogenous matching of agents to contracts is bound to

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<sup>44</sup> Recent evidence from 2009 cross-section data indicates that Uruguayan WMFs are less capital-intensive and exhibited lower value-added per worker and investment rates than conventional firms (Alves et al, 2012).

create selection biases on the parameters of interest. For instance, cooperatives may be able to attract highly motivated workers (Elster, 1989). Obviously, this selection problem is a potential identification threat common to all studies on WMFs based on observational data (Kremer, 1997: p13). However, recent experiments on team production in which subjects are randomly assigned to “democratic” and conventional workplaces also suggest positive incentive effects associated with worker control (Mellizo et al, 2011).

Notwithstanding these issues, the evidence presented in this paper suggests that the marginal share of WMFs in the population of firms and employment in Uruguay can hardly be explained by the fact that these organizations exhibit a higher hazard of failure than conventional firms. The analysis indicates the importance of focusing the attention on both the obstacles face by workers at the formation stage of a WMF and the growth constraints faced by incumbent WMFs.

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## Appendix

Table A1. Descriptive survival statistics

	per-firm				
	Total	Mean	Min	Median	Max
<u>All firms</u>					
No. of firms	29125				
No. of records	1258606				
(Final) Exit time		45.63	1	35	150
Firms with gap	4546				
No. of gaps	6497				
Time on gap if gap	70974	10.92	1	5	138
Time at risk	1258606	43.21	1	32	150
Failures	15308	0.53	0	1	1
<u>CFs</u>					
No. of firms	28821				
No. of records	1244542				
(Final) Exit time		45.63	1	35	150
Firms with gap	4520				
No. of gaps	6466				
Time on gap if gap	70668	10.93	1	5	138
Time at risk	1244542	43.18	1	32	150
Failures	15177	0.53	0	1	1
<u>All PCs</u>					
No. of firms	304				
No. of records	14064				
(Final) Exit time		47.27	1	37	147
Firms with gap	26				
No. of gaps	31				
Time on gap if gap	306	9.87	1	6	51
Time at risk	14064	46.26	1	35	147
Failures	131	0.43	0	0	1
<u>WMFs</u>					
No. of firms	223				
No. of records	10179				
(Final) Exit time		46.18	1	38	145
Firms with gap	14				
No. of gaps	17				
Time on gap if gap	118	6.94	1	6	26
Time at risk	10179	45.65	1	38	145
Failures	90	0.40	0	0	1

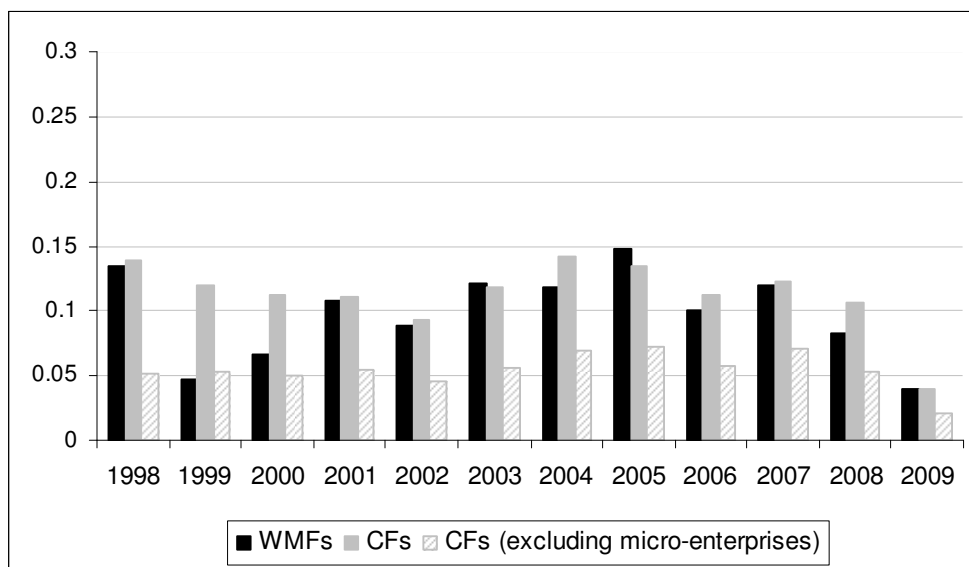
Notes: the total number of records divided by the number of firms gives the mean number of monthly records (mean time at risk) per firm (43.18 months). The difference between the final exit time and the number of records (or time at risk) is due to firms with gap. Time on gap if gap refers to the length of the gap. The median gap lasts 5 months. The total Time on gap if gap computed as the mean Time on gap if gap times the number of gaps (there are firms' spells with multiple gaps). Failure is a dummy variable which takes value 1 (at the exit date) if the firm exits during the period and 0 otherwise. Source: Authors' calculation using data from the Banco de Previsión Social.

Table 1. Descriptive statistics of firm-level variables

	1997-1999		2000-2002		2003-2005		2006-2009		Total	
	CFs	WMFs	CFs	WMFs	CFs	WMFs	CFs	WMFs	CFs	WMFs
Firm start-up size (in logs)	0.72 (0.90)	2.42 (0.74)	0.81 (0.95)	2.24 (1.19)	0.78 (0.91)	2.13 (0.90)	0.76 (0.93)	2.02 (0.84)	0.76 (0.92)	2.22 (0.95)
Start-up average wage (in logs)	8.34 (0.92)	7.44 (1.35)	8.24 (0.96)	7.62 (1.31)	7.96 (0.93)	7.46 (1.16)	8.29 (0.90)	7.55 (1.39)	8.21 (0.94)	7.51 (1.29)
Effective tax burden	0.086 (0.049)	0.023 (0.042)	0.081 (0.053)	0.014 (0.031)	0.075 (0.049)	0.006 (0.014)	0.075 (0.028)	0.005 (0.016)	0.081 (0.049)	0.013 (0.030)
<i>Sectoral composition (%)</i>										
Manufacturing	27.85	13.52	25.43	27.19	27.44	16.70	23.98	25.05	26.69	19.76
Transport	13.52	9.06	10.48	11.04	13.80	8.00	13.67	5.57	12.82	8.78
Services	25.72	54.07	28.94	50.88	26.72	44.16	33.88	45.57	27.71	48.90
Other sectors	32.91	23.35	35.14	10.89	32.04	31.15	28.47	23.81	32.78	22.56
<i>Size composition (%)</i>										
Micro firms	85.35	3.5	82.53	24.31	84.2	25.09	84.64	25.64	84.26	18.96
Small firms	12.1	80.5	14.56	50.69	13.23	59.47	12.2	58.1	13.03	62.77
Medium firms	2.5	11.68	2.74	21.64	2.43	15.44	2.98	16.26	2.6	16.17
Large firms	0.05	4.32	0.17	3.36	0.15	0	0.19	0	0.12	2.1

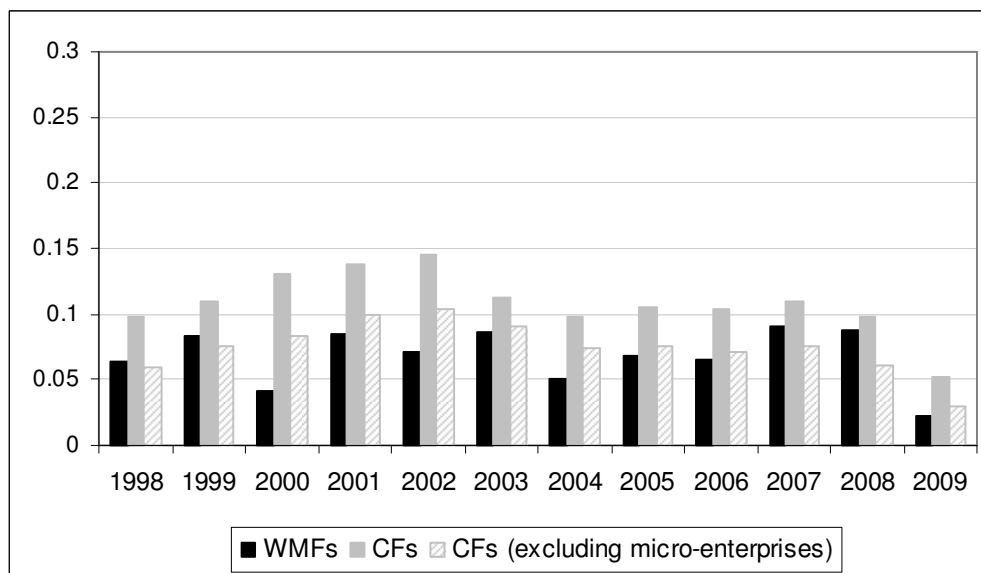
*Notes:* Wages are defined as the firm wage bill divided by total employment and measured as pesos uruguayos deflated by the official Consumer Price Index (IPC). Start-up size defined as the log of employment at the time of entry. Start-up wage defined as the log of firm average wage measured at the time of entry. Tax burden is the effective employer payroll tax rate. Firms are classified in four categories according to their start-up size: micro (less than 6 workers), small (between 6 and 19), medium (between 20 and 99) and large (100 or more workers). The category “Other Sectors” includes Construction, Electricity and Retail Trade. Standard deviations in parentheses. Source: Authors’ calculation using data from the Banco de Previsión Social.

Figure A1. Birth rates of WMFs and CFs. Period 1998-2009



Notes: Annual birth rates calculated as the number of entering firms divided by the total number of firms in the previous year. In 2009, only the period January-July is considered. Source: Authors' calculation using data from the Banco de Previsión Social.

Figure A2. Exit rates of WMFs and CFs. Period 1998-2009



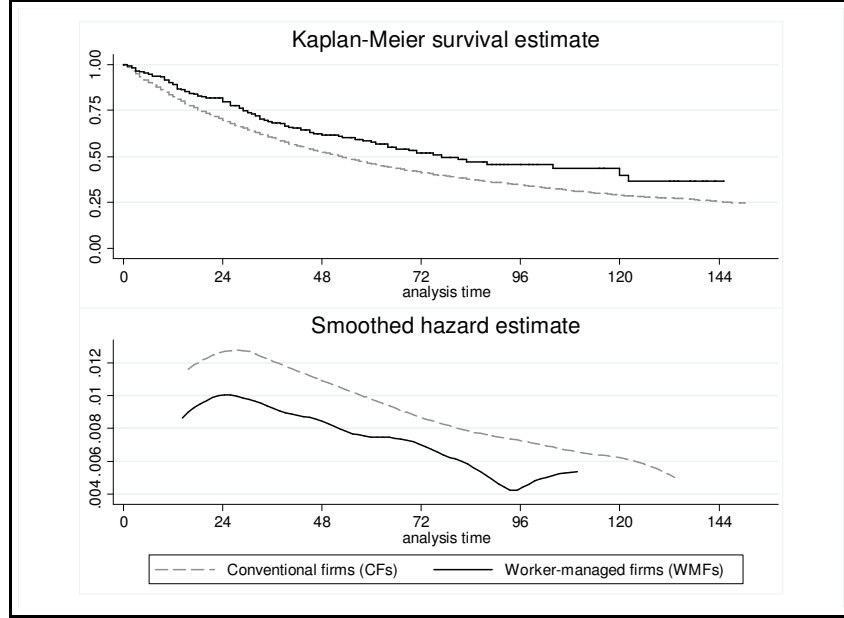
Note: Annual exit rates calculated as the number of exiting firms divided by the total number of firms in the previous year. In 2009, only the period January-July is considered. Source: Authors' calculation using data from the Banco de Previsión Social.

Table A2. Employment and wage dynamic

	Total	Dying firms	Surviving firms	t-stat (i)
<i>All firms</i>				
Employment growth				
WMFs	0.022	-0.064	0.050	(8.47)***
CFs	0.072	-0.008	0.107	(94.80)***
t-stat (ii)	(10.31)***	(4.46)***	(11.87)***	
Wage growth				
WMFs	0.071	-0.006	0.093	(4.67)***
CFs	0.048	-0.001	0.073	(77.21)***
t-stat (ii)	3.28***	0.21	2.94***	
Employment variability				
WMFs	0.267	0.329	0.244	11.17***
CFs	0.370	0.395	0.358	64.82***
t-stat (ii)	(37.26)***	( 9.27)***	(41.54)***	
Wage variability				
WMFs	0.460	0.605	0.409	22.46***
CFs	0.353	0.392	0.333	120.44***
t-stat (ii)	30.79***	26.61***	21.22***	
<i>Excluding microenterprises</i>				
Employment growth				
WMFs	-0.007	-0.010	0.021	(8.31)***
CFs	-0.0176	-0.166	0.047	(58.40)***
t-stat (ii)	2.19**	4.66***	(5.34)***	
Wage growth				
WMFs	0.054	-0.059	0.084	(6.12)***
CFs	0.031	-0.039	0.059	(31.97)***
t-stat (ii)	3.09***	(0.89)	3.33***	
Employment variability				
WMFs	0.232	0.296	0.211	9.89***
CFs	0.377	0.510	0.311	112.87***
t-stat (ii)	(47.41)***	(25.73)***	(34.62)***	
Wage variability				
WMFs	0.434	0.576	0.387	18.48***
CFs	0.352	0.452	0.303	93.10***
t-stat (ii)	(21.33)***	12.90***	22.21***	

Notes: employment and wage growth rates defined as the annual change in employment and wages respectively (in log form) such that,  $\Delta \ln E_{it} = \ln E_{it} - \ln E_{it-k}$  and  $\Delta \ln w_{it} = \ln w_{it} - \ln w_{it-k}$ . Employment and wage variability measured as the standard deviation of annual changes in the log of employment and wages respectively. (i) Test for differences between dying and surviving firms. (ii) Test for difference between WMFs and CFs. Source: Authors' calculation using data from the Banco de Previsión Social.

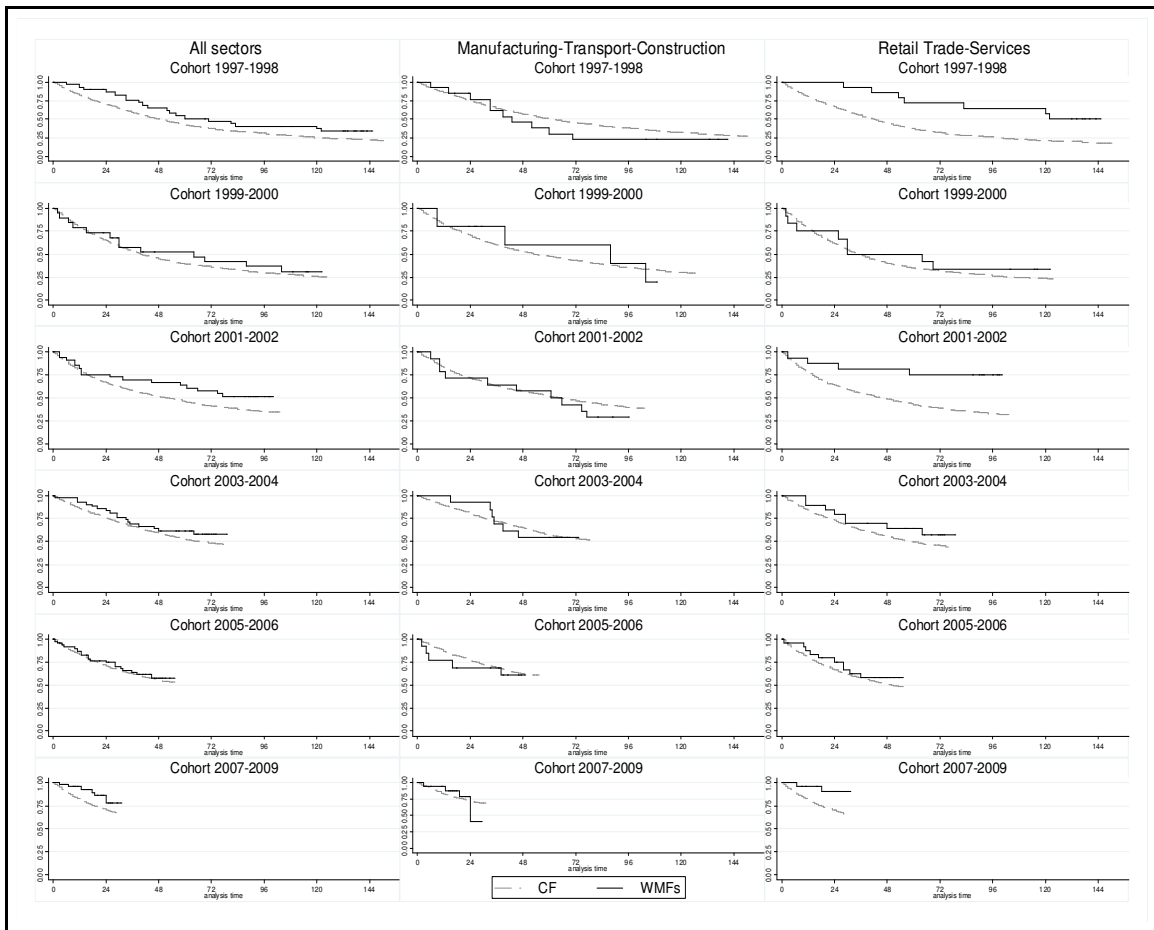
Figure 1. Survivor and hazard functions. Non parametric estimates.



Notes: the Kaplan-Meier survivor function is defined as  $\hat{S}(t_j) = \prod_{j|t_j < t} \left(1 - \frac{d_j}{n_j}\right)$ , where  $d_j$  is the number of failures occurring at time  $t_j$  and  $n_j$  is the number at risk at  $t_j$  before the occurrence of the failures. The hazard function is calculated as a weighted kernel-density using the estimated hazard contributions,  $\Delta\hat{H}(t_j) = \hat{H}(t_j) - \hat{H}(t_{j-1})$ , where  $t_j$  is the current failure time and  $\hat{H}(t_j)$  is the estimated cumulative hazard. The Nelson-Aalen estimator of  $\hat{H}(t_j)$  is defined as  $\hat{H}(t_j) = \sum_{j|t_j \leq t} \left(\frac{d_j}{n_j}\right)$ , i.e. the sum of the expected number of failures at each observed time. See Jenkins (2005) and Cleves et al (2008) for further details on nonparametric survival analysis.

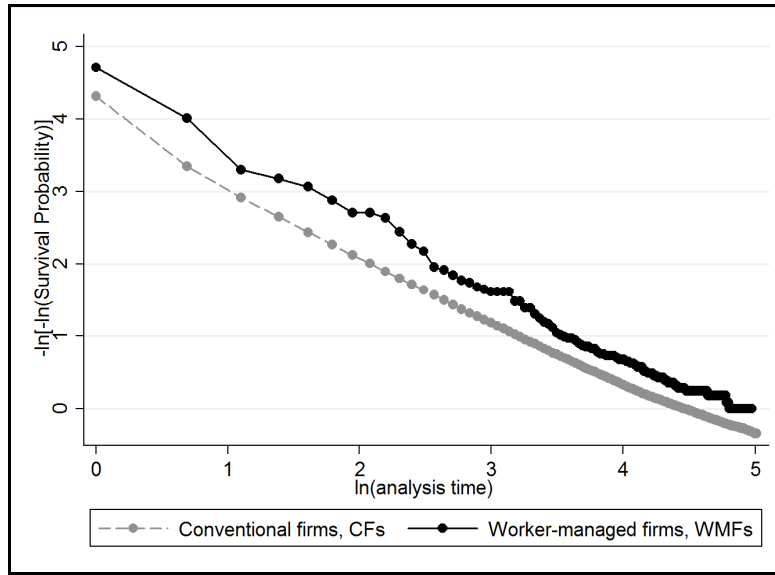


Figure 2. Survivor function of WMFs and CFs by firm cohorts and sectors.



Notes: plots of the Kaplan-Meier survivor function, defined as  $\hat{S}(t_j) = \prod_{j|t_j < t} \left(1 - \frac{d_j}{n_j}\right)$ , where  $d_j$  is the number of failures occurring at time  $t_j$  and  $n_j$  is the number at risk at  $t_j$  before the occurrence of the failures. The right-hand side panels plot the survivor function estimated pooling all sectors. The left hand side panels plot the survivor function considering retail trade and services firms. Panels displayed to the center consider Manufacturing, construction and transport firms.

Figure A3. Graphical check of the Proportional Hazard assumption



Notes: This figure depicts the plot of the transformation  $-\ln[-\ln\{\hat{S}(t)\}]$  versus  $\ln(t)$  for CFs and WMFs, where  $\hat{S}(t)$  is the Kaplan- Meier estimate of the survivor function. Under the proportional hazard assumption, the curves should be parallel.

Table 2. Cox Model estimates

	(1)	(2)	(3)
Coop	-0.326*** (0.107)	-0.298*** (0.109)	-0.293*** (0.110)
Firm start-up size	-0.058*** (0.01)	-0.076*** (0.01)	-0.071*** (0.01)
Firm start-up wage	-0.156*** (0.009)	-0.148*** (0.009)	-0.170*** (0.009)
<b>Hazard ratio</b>	<b>0.722</b>	<b>0.742</b>	<b>0.746</b>
Industry fixed effects	No	Yes	Yes
Cohort fixed effects	No	No	Yes
Observations	1245207	1245207	1245207

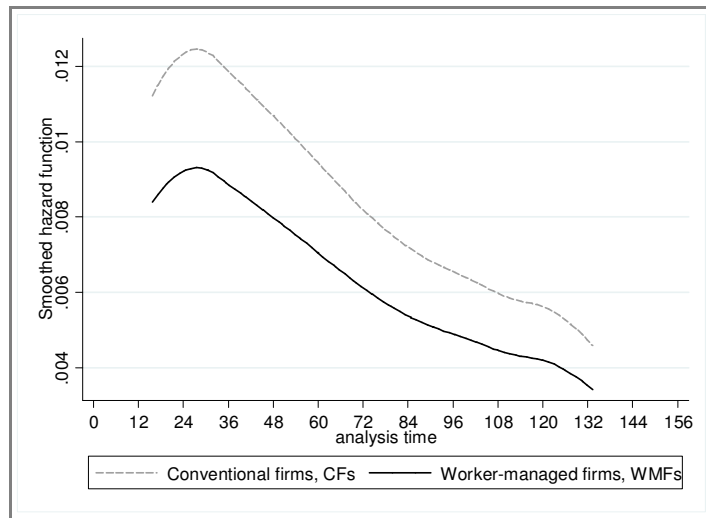
Notes: Start-up size defined as the log of employment at the time of entry. Start-up wage defined as the log of firm average wage measured at the time of entry. In Column (2)-(3), estimates include 4 industry dummies (distinguishing Manufacturing, Transport, Services and Other Sectors). In column (3), estimates include 13 cohort dummies. The hazard ratio is obtained computing  $\exp(\beta^{coop})$ . Robust standard errors in parentheses. Standard errors are clustered at the firm level. \* Statistically significant at .10 level; \*\* at the .05 level; \*\*\* at the .01 level

Table A3. Test of proportional hazard assumption

	Chi-square	p-value
Coop	0.11	0.7420
Firm start-up size	5.49	0.0192
Firm start-up wage	31.8	0.0000
<i>Sectoral dummies</i>		
(Manufacturing)		
Transport	0.81	0.3695
Services	5.8	0.0161
Other sectors	50.02	0.0000
<i>Cohort dummies</i>		
(1997)		
1998	30.42	0.0000
1999	39.76	0.0000
2000	52.58	0.0000
2001	62.85	0.0000
2002	26.93	0.0000
2003	7.13	0.0076
2004	17.34	0.0000
2005	25.17	0.0000
2006	27.43	0.0000
2007	19.36	0.0000
2008	14.42	0.0001
2009	2.77	0.0962
Global test	218.31	0.0000

Notes: Test based on Schoenfeld residuals. Rejection of the null hypothesis indicate a deviation from the proportional hazard assumption.

Figure A4. Hazard function of WMFs and CFs



Notes: Cox model post estimation

Table 3. Cox Model estimates (within industries)

	(1)	(2)	(3)	(4)
	All firms (excluding Construction and Retail Trade)	Manufacturing	Transport	Services
Coop	-0.272** (0.118)	0.173 (0.190)	0.014 (0.288)	-0.619*** (0.189)
Firm start-up size	-0.082*** (0.012)	-0.079*** (0.020)	0.009 (0.040)	-0.094*** (0.017)
Firm start-up wage	-0.165*** (0.011)	-0.164*** (0.020)	-0.238*** (0.030)	-0.148*** (0.016)
Industry fixed effects	Yes	-.-	-.-	-.-
Cohort fixed effects	Yes	Yes	Yes	Yes
Observations	853911	329009	159560	347972

*Notes:* Start-up size defined as the log of employment at the time of entry. Start-up wage defined as the log of firm average wage measured at the time of entry. In column (1), estimates include 4 industry dummies (distinguishing Manufacturing, Transport, Services and Other Sectors). All estimates include 13 cohort dummies. Robust standard errors in parentheses. Standard errors are clustered at the firm level. \* Statistically significant at .10 level; \*\* at the .05 level; \*\*\* at the .01 level

Table 4. Robustness checks

	Semi-parametric models			Parametric models		
	Proportional Hazard			Accelerated Failure Time		
	Cox model			Weibull	Log-logistic	Generalized Gamma
	(1)	(2)	(3)	(4)	(5)	(6)
Coop	-0.502*** (0.138)	-0.476*** (0.151)	-0.338** (0.168)	-0.705*** (0.209)	0.533*** (0.160)	0.545*** (0.156)
Firm start-up size	-0.009 (0.033)	-0.010 (0.033)	-0.039 (0.038)	-0.009 (0.049)	0.005 (0.037)	0.023 (0.038)
Firm start-up wage	-0.243*** (0.025)	-0.245*** (0.025)	-0.239*** (0.026)	-0.430*** (0.042)	0.327*** (0.030)	0.318*** (0.03)
Tax burden			0.032*** (0.008)			
<b>Hazard ratio</b>	<b>0.605</b>	<b>0.621</b>	<b>0.713</b>	<b>0.494</b>	<b>--</b>	<b>--</b>
$\kappa$						0.029 (0.071)
$\sigma$						1.481 (0.036)
$P$				1.316 (0.040)		
$\gamma$					0.783 (0.02)	
$\theta$				1.589 (0.165)	0.281 (0.079)	
Industry fixed effects	Yes	Yes	Yes	Yes	Yes	Yes
Cohort fixed effects	Yes	Yes	Yes	Yes	Yes	Yes
Observations	201877	200139	185671	201877	201877	201877

Notes: All estimates restricted to firms employing at least six workers at the time of entry. Start-up size defined as the log of employment at the time of entry. Start-up wage defined as the log of firm average wage measured at the time of entry. In Column (2) WMFs in which the average value of the employee-to-member ratio during their spells is greater than 20% are excluded. In Column (3), the tax burden variable is lagged three months. All estimates include 4 industry dummies (distinguishing Manufacturing, Transport, Services and Other Sectors) and 13 cohort dummies. The hazard ratio is obtained computing  $\exp(\beta^{coop})$ . Columns (1)-(3) report Cox model estimates. Columns (4)-(5) report estimates of parametric frailty models that control for unobserved observation-specific effects and assume a Weibull and Log-logistic distribution of the baseline hazard respectively. The frailty term is assumed to follow a gamma distribution with mean 1 and variance  $\theta$ . Column (6) reports the estimate of a Generalized Gamma model. In Column(5)-(6), the effect of the covariates must be interpreted in terms of survival time (Accelerated Failure Time metric) and not in terms of the hazard. Robust standard errors in parentheses. Standard errors are clustered at the firm level. \* Statistically significant at .10 level; \*\* at the .05 level; \*\*\* at the .01 level

*Table A4. Employer payroll tax rate by sector*

<i>Period</i>	<i>General tax rate</i>	<i>Total and partial tax exemptions</i>
1997	12.5%	0% - Education 6.25%- Manufacturing
1998	12.5%	0%- Education 6.25%- Manufacturing
1999	12.5%	0%- Education 6.25%- Manufacturing
2000	12.5%	0%- Education 6.25%- Manufacturing, Freight transport by road (from October 2000)
2001	12.5%	0%- Education 6.25%- Manufacturing, Freight transport by road (until May 2001) 0%- Urban and suburban passenger land transport, Manufacturing, Freight transport by road (from June 2001)
2002	12.5%	0%- Education, Taxicabs (from May 2002), Urban and suburban passenger land transport , Manufacturing, Freight transport by road
2003	12.5%	0%- Education, Taxicabs, Urban and suburban passenger land transport, Manufacturing, Freight transport by road
2004	12.5%	0%- Education, Taxicabs, Urban and suburban passenger land transport , Manufacturing, Freight transport by road
2005	12.5%	0%- Education, Taxicabs, Urban and suburban passenger land transport , Manufacturing, Freight transport by road
2006	12.5%	0%- Education, Taxicabs, Urban and suburban passenger land transport , Manufacturing, Freight transport by road
2007	7.5% (from July 2007)	0%- Education, Taxicabs, Manufacturing, Freight transport by road (until June 2007), Urban and suburban passenger land transport
2008	7.5%	0%- Education, Taxicabs, Urban and suburban passenger land transport
2009	7.5%	0%- Education, Taxicabs, Urban and suburban passenger land transport

*Source:* Bucheli and Vigna (2006)

Table A5. Comparison of AIC values for several parametric models

	Log Likelihood	K	C	AIC
Exponential	-5427.0172	20	1	10896.0344
Weibull	-5418.7098	20	2	10881.4196
Gompertz	-5378.1049	20	2	10800.2098
Log-normal	-5335.0687	20	2	10714.1374
Log-logistic	-5349.2146	20	2	10742.4292
Generalized Gamma	-5334.9943	20	3	10715.9886

Notes: k is the number of model covariates and c the number of model-specific distributional parameters.  $AIC = -2 \ln L + 2(k + c)$ . All estimates restricted to firms employing at least six workers at the time of entry.

Table A6. Macroeconomic performance of the Uruguayan economy. Period 1999-2007

	1999	2000	2001	2002	2003	2004	2005	2006	2007
GDP growth rate	-1.94%	-1.93%	-3.84%	-7.73%	0.81%	5.00%	7.46%	4.10%	6.54%
Inflation	4.17%	5.05%	3.59%	25.94%	10.19%	7.59%	4.9%	6.38%	8.5%
Unemployment rate	11.3%	13.6%	15.3%	17%	16.9%	13.1%	12.2%	11.4%	9.6%
Real wage growth rate	0.90%	-1.19%	-0.85%	-10.89%	-12.79%	-1.45%	4.02%	4.99%	4.55%

Notes: Real wage growth rate only computed for workers employed in the private sector. The unemployment rate is the urban unemployment rate. Source: INE, BCU.

Table 5. Survival estimates under different macroeconomic conditions

	Cox model		Exponential model	
	Period	Period	Period	Period
	1999-2002	2004-2007	1999-2002	2004-2007
Coop	-0.435 (0.265)	-0.518*** (0.195)	-0.437* (0.265)	-0.523*** (0.197)
Firm start-up size	-0.102* (0.062)	0.064 (0.050)	-0.100 (0.062)	0.065 (0.051)
Firm start-up wage	-0.183*** (0.041)	-0.285*** (0.036)	-0.183*** (0.041)	-0.288*** (0.036)
<b>Hazard ratio</b>	<b>0.647</b>	<b>0.596</b>	<b>0.646</b>	<b>0.593</b>
Industry fixed effects	Yes	Yes	Yes	Yes
Cohort fixed effects	Yes	Yes	Yes	Yes
Observations	49762	86301	49762	86301

Notes: All estimates restricted to firms employing at least six workers at the time of entry. Start-up size defined as the log of employment at the time of entry. Start-up wage defined as the log of firm average wage measured at the time of entry. All estimates include 4 industry dummies (distinguishing Manufacturing, Transport, Services and Other Sectors) and 13 cohort dummies. The hazard ratio is obtained computing  $\exp(\beta^{coop})$ . Robust standard errors in parentheses. Standard errors are clustered at the firm level. \* Statistically significant at .10 level; \*\* at the .05 level; \*\*\* at the .01 level

Table 6. Employment stability, wage flexibility, wage growth and firm survival.  
Cox model estimates

	(1)	(2)	(3)	(4)
Coop	-0.511*** (0.166)	-0.518*** (0.164)	-0.309* (0.161)	-0.369** (0.161)
Firm start-up size	0.046 (0.04)	-0.023 (0.042)	-0.035 (0.041)	-0.065 (0.041)
Firm start-up wage	-0.200*** (0.028)	-0.137*** (0.030)	-0.147*** (0.028)	-0.115*** (0.028)
Wage variability		0.781*** (0.103)		0.628*** (0.099)
Employment variability			0.817*** (0.072)	0.628*** (0.074)
<b>Hazard ratio</b>	<b>0.600</b>	<b>0.596</b>	<b>0.734</b>	<b>0.691</b>
Industry fixed effects	Yes	Yes	Yes	Yes
Cohort fixed effects	Yes	Yes	Yes	Yes
Observations	194894	194894	194894	194894

*Notes:* All estimates restricted to firms having at least 12 monthly records and employing at least six workers at the time of entry. Start-up size defined as the log of employment at the time of entry. Start-up wage defined as the log of firm average wage measured at the time of entry. Wage growth defined as the annual change in the log of firm-average wage. Employment and wage variability measured as the standard deviation of annual changes in the log of employment and wages respectively. All estimates include 4 industry dummies (distinguishing Manufacturing, Transport, Services and Other Sectors) and 13 cohort dummies. The hazard ratio is obtained computing  $\exp(\beta^{coop})$ . Robust standard errors in parentheses. Standard errors are clustered at the firm level. \*Statistically significant at .10 level; \*\* at the .05 level; \*\*\* at the .01 level.



Table A7. Employment stability, wage flexibility, wage growth and post-2003 firm survival.

	Cox model				Exponential model			
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Coop	-0.643** (0.327)	-0.594* (0.326)	-0.473 (0.326)	-0.476 (0.326)	-0.652* (0.335)	-0.602* (0.334)	-0.476 (0.334)	-0.479 (0.335)
Firm start-up size	0.0053 (0.078)	-0.008 (0.075)	-0.035 (0.077)	-0.033 (0.076)	0.011 (0.081)	-0.002 (0.078)	-0.026 (0.079)	-0.025 (0.078)
Firm start-up wage	-0.228*** (0.052)	-0.177*** (0.052)	-0.203*** (0.052)	-0.193*** (0.053)	-0.236*** (0.054)	-0.184*** (0.054)	-0.212*** (0.053)	-0.203*** (0.054)
Wage variability		0.512*** (0.145)		0.144 (0.163)		0.515*** (0.148)		0.129 (0.167)
Employment variability			0.949*** (0.128)	0.882*** (0.146)			0.986*** (0.133)	0.924*** (0.154)
<b>Hazard ratio</b>	<b>0.526</b>	<b>0.552</b>	<b>0.623</b>	<b>0.621</b>	<b>0.521</b>	<b>0.548</b>	<b>0.621</b>	<b>0.619</b>
Industry fixed effects	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Cohort fixed effects	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Observations	55601	55601	55601	55601	55601	55601	55601	55601

Notes: The analysis is restricted to the post-2003 firm survival. All estimates restricted to firms having at least 12 monthly records in the pre-2004 period and employing at least six workers at the time of entry. Start-up size defined as the log of employment at the time of entry. Start-up wage defined as the log of firm average wage measured at the time of entry. Wage growth rates defined as the annual change in the log of firm-average wage (measured in the pre-2004 period). Employment and wage variability measured as the standard deviation of annual changes in the log of employment and wages respectively (measured in the pre-2004 period). All estimates include 4 industry dummies (distinguishing Manufacturing Transport Services and Other Sectors) and 13 cohort dummies. The hazard ratio is obtained computing  $\exp(\beta^{coop})$ . Robust standard errors in parentheses. Standard errors are clustered at the firm level. \* Statistically significant at .10 level; \*\* at the .05 level; \*\*\* at the .01 level.