

Full Length Research Paper

Determinants of business companies' economic performance in Burkina Faso

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Received 31 December, 2018 ; Accepted 11 April, 2019

This study examines the determinants of enterprises economic performance in trade, industry and services sectors in Burkina Faso. Based on data from a sample of 179 companies of 2013 financial statements, various analyzes highlight effects of economic, financial, environmental and managements variables on company performance. The results of econometric estimations using the logit model show the significance of investments, seniority or companies ages, debt ratio, employee salaries and geographical location on companies economic performance in the three sectors. In addition, manager gender and nationality are decisive in industrial sector while employee total wages and productivity are in services. It therefore appears the necessity to develop general economic policies that are appropriate for companies but also specific to the different sectors of activity in the country.

Key words: Economic performance, sector of activities, logit model.

INTRODUCTION

The economic performance of companies is a problem for both developed and developing countries. Indeed, efficient companies participate in the development of a nation by achieving growth goals which generally deal with employability, collection of tax revenues, promotion of innovation, etc. (Lazare, 2016). Thus, they can be considered as levers of economic growth necessary for development and combating poverty.

Burkina Faso, along with other developing countries, in its ongoing pursuit of development, is continuously implementing structural policies to support growth and address the social and economic shortcomings that cause long-term problems.

In this sense, it has drawn up a economic policy reference document for achieving growth objectives, named National Plan for Economic and Social Development (Pndes). One of its main focuses is: private sector is an important lever for growth through promotion of trade sector and development of industrial sector, putting the company at the heart of social and economic development system. Thus, many reforms have been undertaken in the promotion of entrepreneurship and have helped to accelerate creation of businesses. On an annual average, more than 5000 companies were created over the period 2011 to 2015.

The mobilization of domestic resources, mostly done by

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JEL Classification: C25, D21, H32.

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formal enterprises, is essential to achieve economic development goals. The more effective they are, the more they will participate in the overall economic growth effort. This raises the question of economic performance of companies given their prominent place in the economic development system.

What are the business performance criteria at the national level? Are they the same for all sectors of activity? Do they depend on specific characteristics of enterprises as mentioned by Nwachukwu et al. (2010)? For example, Jibao and Kai (2010) showed that economic performance in some industrial sectors in China depends on industrial factors, while for others, it depends on firms factors.

This raises the question of companies economic performance determinants regarding their prominent place in the economic development system.

This work highlights the factors of companies economic performance. It will lead to a better understanding of factors influencing performance in order to make appropriate recommendations for better business profitability.

LITERATURE REVIEW

Theoretical aspects revolve essentially around the existential relationship between three (3) elements that are the structural behaviors of the market, the behavioral response of the company and its performance. This relationship is still called structure-behavior-performance paradigm or SCP paradigm.

SCP states that structural characteristics of the market orient the behavior of companies, which has an impact on their performance. It is described as the basic scheme of the American industrial economy. Bourke (1989), on a sample of 17 French banks in a comparative study of the profits of European banks use the SCP paradigm to explain the performance factors of these.

Looking empirical approaches, Nwachukwu and Oseghale (2010) found that the determinants of business performance could be divided into three (3) components. It would therefore depend on company individual characteristics, its economic characteristics and the environment in which it operates.

Concerning enterprise size, Vettori and Jarillo (2000) shows the existence of an optimal size and a decrease of company unit costs which could influence its profitability. Indeed, the size of the company allows practice of economies of scale by lowering costs and then increase profitability.

However Staikouras and Wood (2004) find, out of a sample of 690 banks (138 major banks and 547 small banks) that average profits decline with the size of the firm.

This support thesis of a negative relationship between firm size and its growth as stipulated by Davidsson et al. (2002), Almus and Nelinger (1999), Denis (1954)

Woywode and Lessat (2001).

About employee productivity, Steindl (1947) considered twenty-one (21) American industries in which the amount of electrical energy consumed per hour of human labor increases considerably with the number of workers employed in each establishment. Enke (1950) in the Journal *Intermediate Economy Theory* explains that "too much productivity may not pay if it is bought too expensive and if the rate of interest is too high". "But for Osborn (1951) "the law of the reduction of the cost according to the increase of the volume of production can not be verified if the establishments concerned use to a very variable extent their production capacity".

Looking to investments, Chowdhury and Wolf (2003), in a study of small and medium-sized enterprises in East Africa (Kenya, Tanzania, Uganda) found a non-significant impact of Information and communication technologies (ICT) investments on business profitability.

Concerning company age, Davidsson et al. (2002) found that age was the most influential variable on firm growth rate among twenty-one (21) explanatory variables.

Indeed, there is a number of activity year at which owners' incentives to grow their business diminish. They are reluctant about new expenses like staff recruitment for example, Storey (2016).

Company location can have an impact on its activity. Steil and Wolf (1997) linked one of the causes of a firm's growth to its geographic location.

For example, if the enterprise is located in a rural place, it develops a proximity strategy by operating in a low uncertainty market. This would have less impact on innovation capabilities and best business practices (Julien, 2000).

Company activity can also have an impact on its performance. Samuelson et al. (1989) show that "business growth rates vary significantly across different industries".

This is confirmed by Harhoff et al. (1998) who showed, on a sample of ten thousand (10000) West German companies covering all sectors of the economy find that service sector firms are characterized by above average employment growth rates. Hinchey et al. (1997) determine a relationship between development dynamics within a branch and the growth rate of the firm. Almus and Nelinger (1999) show that there is a strong correlation between the firm's specificity and its growth rate. For Woywode and Lessat (2001), firms in the transportation, finance, insurance and services sectors are more likely to grow than firms in the processing industry.

Company manager's age could have an impact on its performance. For Hambrick and Mason (1984), the young owner-manager is more adapt to develop a growth strategy based on new ideas and a propensity to develop innovative behavior than an older one. The senior manager's age or the average age of the executive team have a negative effect on the growth according to

Table 1. Average profitability in each sector.

Sector	Average profitability (%)
Trade	28
Industry	27
Services	27

Source: Study construction.

Woywode and Lessat (2001). Otherwise, Mathieu et al. (2003) show that manufacturing firms with the highest growth and innovation rates are led by employers with technical training.

Concerning gender, Robert and Berhe (1999) showed on a sample of SME from southern New Jersey that women entrepreneurs who made up 16% of their sample were relatively young (70% of them were under 50 years old), worked for fewer hours and took fewer risks, which is characteristic of low performance as stipulated by Fasci and Valdez (1998).

However, one aspect of the study has been successful in showing that women who are highly motivated at work and strive to find a balance between their work and their family produce better financial outcomes, while for men, these same conditions reduce the financial performance of the institutions they run. This result was found by Ekpinda (2010) on a sample of about one hundred Beninese firms showing through a quantile regression model, that women-run businesses were achieving better economic performance. So human capital, has a positive correlation with enterprise economic performance. Bates (1990), Brüderl and Preisendöffer (2000).

In some lectures, companies' juridical forms has an effect on performance. Woywode and Lessat (2001) on a sample of 8436 companies shows that the effects of legal juridical form on probability of rapid growth are significant. Indeed, rapid growth is the affair of limited liability company (LLCs) and societies in general rather than individual companies.

Some studies have evoked the absence of a link between performance and capital. For Demsetz and Lehn (1985) and Charreaux (1991), capital performance is indifferent to organizational training, while other authors mentioned a non-neutrality (Shleifer et al., 1988; Djelassi, 1996).

Myers and Majluf (1984), through the pecking-order theory, establish a decreasing preference for the financing means of a company. Its respectively self-financing, debt and stocks issues.

Modigliani and Miller (1985) establish two periods in which the impact of financial debt on performance is different.

Wanda (2001), on a sample of 39 companies found over a period of 3 years that the long-term financial debt is neutral in explaining the performance of the company because shareholders prefer own funding financing.

MATERIALS AND METHODS

Data

2013 companies physical financial statements were collected by Chamber of commerce and industry of Burkina Faso and the study variables were extracted for the analysis. The database was build and the variables were subdivided into four categories. These are the economic, environment financial and managements variables. And then:

(1) Economic variables include number of employee, turnover, investments in 2013, productivity of business equal to ratio value added/number of employee;

(2) Environment variables include geographical location (Ouagadougou or others towns), sub-category of company activity. Thus, there are four sub-categories of activity for trade sector, seven for industry and also seven services³; the legal juridical form adopted by the company to conduct its business. A company is either of a legal form as a sole proprietorship or a limited liability company ;

(3) Management variables include age of the manager, nationality of the company, employees wages, companies age and sex of manager;

(4) Financial variables include company capital and its debt ratio.

Descriptive analysis

Average profitability in each sector

Trade, industry and services are the three sectors considered for the analysis. Table 1 shows the average profitability on each sector.

Principal component analysis ACP and multiple component analysis ACM approach

ACP or Principal component analysis

Principal component analysis is a technique for summarizing the information contained in a vast array of quantitative data from graphical representations. It provides a map of variables based on their linear correlation.

For the analysis, all the quantitative variables of the model are used namely the financial profitability of the company, its seniority (age), the realized turnover, the shareholders' equity, the number of employee, employee salaries, investments, age of manager, productivity⁴.

We will comment a factorial plan. Indeed, the first factorial axis gives nearly 42% of the information while the two axes combined alone give more than 60% information⁵. The quantitative variables such as turnover, capital, number of employee, employee wages and investments are shown on axis 1 with a fairly good correlation.

Financial profitability and debt ratios are best represented on the axis 2 with a pretty good correlation. To a lesser extent, we find company age or seniority.

According to Axis 1, we see that companies that generate significant turnover are those with largest capital. They are also ones who have a high number of employees and a high level of employee wages with strong investments made. Thus Axis

³ See Annex 1 for the subcategories of the trade, industry and services sectors.

³ The variables geographical location, productivity, nationality, sex of the manager as well as his age were put in illustrative in the ACP method, in order to increase the level of information of the chosen factorial plan.

⁵ See annex 2

contrasts this business profile with companies that have the lowest values for these variables that we just mentioned.

Axis 2 shows that companies that are more profitable are those that are most heavily indebted. They are ones that are the least old too. On the other hand, the companies that are the oldest are those which are unprofitable with low debt ratios⁶.

ACM or multiple correspondence analysis

The multiple correspondence analysis (ACM) is a factorial method adapted to tables in which a set of individuals is described by a set of qualitative variables (in columns). A typical example of this data issue on opinion surveys.

Variables were categorized according to modalities in order to search through an ACM, reconciliations between them⁷.

Thus, five distinct groups can be determined:

(1) There is a group of limited liability companies located in Bobo-Dioulasso. They have a workforce of less than 25 employees and a turnover less than 200 million. They seem to be run by women and are nationals companies as nationality. These are mainly semi-wholesale businesses, hotels and restaurants, study services that are best represented on axis 2.

(2) The second group, which is the opposite of the first group, represents limited companies. They are generally located in Ouagadougou. They realize more than one billion of turnover and have more than 200 employees. They are usually for foreign nationality. They work in the wholesale trade, chemical industries, extractive industries or mining, insurance, wood industries. Also, they realize the most important investments and have the highest productivities.

(3) A third relevant group represents firms with low investment and low productivity, who are Burkinabe in origin and generally run by men aged 40 to 59 years or less. A well-represented sector for this group is other commercial services.

(4) A fourth group consist of sole companies, making average investments with a turnover between 200 million and one billion CFA⁸ francs and led by seniors. A well-represented sector could be the agro-food industries.

(5) A fifth group would be companies with between 25 and 200 employees located in the capital Ouagadougou and practicing in the sectors of Buildings and public works and Retail. It was noticed that, in addition to the ACP conclusions, the most profitable sectors of activity seem to be industries like wood metal and miscellaneous and mining⁹, and the least profitable sectors seem to be the buildings and public works and the agro-food industries as well as the retail trade.

Also the foreign companies of our sample seem to be the most profitable as well as those located in Ouagadougou which are essentially of limited companies.

The model used is logistic method. Logistic regression is used for modeling of binary variables. It is applied in various fields such as medicine (healing or not of a patient), marketing (purchase or not of products or services following an action), etc. In the present case, the dependant variable which is financial profitability of companies take only 2 values explained by other variables. Such suits the present analysis to a logistic modelling approach.

Let consider Y_i be our interest variable, the financial profitability of companies. Y_i takes two values (0, 1) depending to each sector. It takes 1 if the company is profitable (0.28 for trade and

respectively 0.27 for industry and services) and 0 otherwise (Table 2). X_i is the set of exogenous variables of the model such as size, productivity, geographical location, age of the company, manager gender, shareholders' capital, debt ratio, investments, sub-category of activity, company nationality, manager age or years, productivity and employee wages.

We consider $Y_i = X_i * \beta + U_i$ with U_i estimation errors. Then have therefore the following equations:

$$Y_i = 1 \text{ si } Y_i^* = X_i * \beta + U_i > 0$$

$$Y_i = 0 \text{ si } Y_i^* = X_i * \beta + U_i < 0 \text{ with } Y_i^*$$

The probability that company is profitable means that $Y_i = 1$ is:

$$P(Y_i = 1) = P(X_i * \beta + U_i > 0) = P(X_i * \beta > -U_i) = P(-X_i * \beta < U_i)$$

$$= 1 - F(-X_i * \beta) = F(X_i * \beta)$$

With F the distribution function of the logistic law. The model is then estimated by the maximum likelihood method.

RESULTS

The estimation of the logit model by taking into consideration, all activity sector simultaneously gives non conclusive and insignificant results. This is the reason why the method has been applied in each sector of activity individually (trade, industry and services).

Trade

Model validation

The hypothesis of nullity of the coefficients is tested through the interpretation of the ratio of log likelihood LR, the statistic follows under H_0 a law of χ^2 with 15 degrees of freedom (dof). Thus, for a threshold of 5%, the LR statistic is 29.89, which is greater than the χ^2 value at 15 dof read in the table which is 24.996. Then we reject the hypothesis H_0 of nullity of coefficients. The estimated model has at least one explanatory variable of significance. In addition, the pseudo R^2 is 38.5%.

In addition, the analysis of the prediction table shows that the investments as well as the company's age have a significant impact at the 5% threshold on the financial profitability in the trade sector while the impact of the sub-category (semi-wholesale) is significant at 10%.

Quality of the regression

LinkTest: The linktest regression in this first case shows that the hat variable is significant at the 5% threshold while the $_{\text{hat}}sq$ variable is not significant. Our model is not badly specified (Annex 5).

Hosmer Lemeshow: In addition, the p-value associated

⁶ See Annex 3

⁷ See Annex 4

⁸ The local money. 1 dollar US is around 500 F CFA

⁹ Sectors having the best coordinates on the axis

Table 2. Logistic regression of financial profitability in the trade sector.

Independent variable	beta	SE	z	P	IC
Nationality	-2.797	2,175	-1.290	0.198	(-7.060008, 1.46485)
Sub-category					
Retail trade (reference)					
Semi-wholesale	2.94	1,571	1,870	0.061 *	(-1385761, 6.019377)
Wholesale	2,175	1,575	1,380	0.167	(-9121059, 5.263016)
Small business	3,071	2,696	1,140	0.255	(-2.213143, 8.356885)
Legal form					
Sole proprietorship (reference)					
limited company (LC)	-2.288	1,947	-1.180	0.240	(-6.105249, 1.527256)
limited liability company (LLC)	-0.62	1,329	-0.470	0.641	(-3.22449, 1.983764)
Geographical location	0.302	1,041	0.290	0.771	(-1.737327, 2.34254)
Sex	0.001	1,019	0.000	0.999	(-1.996553, 1.998493)
Manager's age	0.031	0.047	0.670	0.505	(-060625, 1230393)
Debt ratio	-0.323	0.293	-1.110	0.269	(-8979891, 2503731)
Shareholders capital	-0.102	0.121	-0.840	0.398	(-3392818, 1349454)
Investments	0.74	0.293	2,520	0.012 **	(0.165527, 1.315377)
Productivity	6.951	5,035	1,380	0.167	(-2.917112, 16.81979)
Employees wages	0.018	0.014	1,320	0.186	(-0089329, 0460206)
Compagny's age	-0.166	0.077	-2.150	0.032 **	(-0.318212, -0144972)
Constant	1,232	3,348	0.370	0.713	(-5.328519, 7.794204)
N				56	
χ^2 (15)				29.89	
P				0.0123	
Nickname R ²				0.385	

*Significant at 10%; **significant at 5%; P: Pvalue; IC: confidence interval; SE: standard error.

Table 3. Prediction table in the trade sector.

Classified	Predicted value		Total
	Profitable	Unprofitable	
Profitable	25	11	36
Unprofitable	3	17	20
Total	28	28	56

Source: Study construction/stata.

with the Hosmer-Lemeshow statistic is 0.20. Which suggests that there is no evidence of a poor representation of the model. In conclusion the model is well specified (Annex 6).

Quality of the prediction: In our modeling of the determinants of financial profitability in the retail sector, x is the average value of financial profitability in the sector, which is 27%. The prediction table (Table 3) shows that for profitable commercial firms, 25 out of 36 cases were well predicted while for unprofitable firms, 17 out of 20 cases were well predicted. The prediction rate of the

model is equal to the sum of the cases correctly predicted relative to the total number of observations, that is, $[(25 + 17) / 56] \times 100 = 75\%$.

This explains why the variables used in the model explain to a good extent the probability that a company will be profitable.

ROC Curve¹⁰: The calculation of the area under curve (AUC) under stata shows that the value of the area under the ROC curve is about 88%. This demonstrates

¹⁰ The receiver operating characteristic (ROC) curve

Table 4. Marginal effects in the trade sector.

Independent variable	dy/dx	SE	Z	P	IC
Nationality	-0.389	0.285	-1.36	0.173	-0.9476528, 0.1702596
Sub-category					
Retail trade (reference)					
Semi-wholesale	0.402	0.159	2.53	0.011	0.0902257, 0.7130341
Wholesale	0.286	0.186	1.54	0.124	-0.0785448, 0.6498081
Small business	0.421	0.359	1.17	0.241	-0.2827409, 1.124204
Legal form					
Sole proprietorship (reference)					
limited company (LC)	-0.309	0.228	-1.36	0.175	-0.7553375, 0.1373981
limited liabilitycompany (LLC)	-0.084	0.173	-0.49	0.627	-0.4240836, 0.2556807
Geographical location	0.042	0.144	0.29	0.771	-0.2408871, 0.3249756
Sex	0.000	0.142	0	0.999	-0.277402, 0.2776716
Rate of endettement	-0.045	0.039	-1.15	0.249	-0.1214965, 0.0315165
Employees	0.003	0.002	1.42	0.156	-0.0009865, 0.0061395
Company's age	-0.023	0.009	-2.54	0.011	-0.0409289, -0.0052979
Productivity	0.966	0.656	1.47	0.141	-0.3206087, 2.252252
Equity	-0.014	0.016	-0.86	0.388	-0.0464024, 0.0180118
Manager's age	0.004	0.006	0.68	0.498	-0.0082089, 0.0168808
Investments	0.103	0.031	3.28	0.001	0.0413357, 0.1644216

Source: Study construction/stata.

excellent discrimination of the model in trade sector (Annex 7).

Marginal effects in the trade sector: The marginal effects make it possible to study the impact of each exogenous variable on the explained variable (Table 4). The analysis of marginal effects of the model at 5 and 10% of significance, in the trade sector gives the following comments.

- (1) The probability for a semi-wholesale company to be profitable increases by 40% compared to a company in retail trade;
- (2) Compared to a company operating in retail trade, the probability of a company in trade to be profitable increase by about 10% when investments made are up to 1%;
- (3) The probability of a trade company to be profitable decrease by around 2% when its age or seniority increase by one year.

Industry sector

The estimation results for industry sector data are shown in Table 5.

Validation of the model

The hypothesis of nullity of the coefficients is tested

through the interpretation of the ratio of log likelihood LR. The statistic follows under H_0 a χ^2 law with 16 degrees of freedom. Thus for a threshold of 5%, the LR statistic is 35.28, which is greater than the value of χ^2 at 16 dof read in the χ^2 table which is 26.296. Then we reject the hypothesis H_0 of nullity of the coefficients. The estimated model has at least one explanatory variable of significance. The pseudo R^2 is about 56%.

In addition, the analysis of the prediction table shows that the *personnel expense*, *investment* and *debt ratio* variables are significant at the 5% threshold while *nationality*, *sex of the manager* and *geographical location* are significant at 10%.

Quality of the regression

LinkTest: The linktest regression for the industry sector gives the results table (Table 6). As in the trade sector, we note that the variable *hat* is significant at the 5% threshold while the variable *_ hatsq* is not significant. This shows that our model does not suffer from a bad specification and does not omit important explanatory variables (Annex 8).

Hosmer Lemeshow: The p-value associated with the Hosmer-Lemeshow statistic is 0.59. Which suggests that there is no evidence of a poor representation of the

Table 5. Logistic regression in the industry sector.

rf 1	beta	SE	z	P	IC
Independent variable					
Nationality	3,932	2,226	1.770	0.07*	(-0.4304825, 8.293968)
Sub-category					
Agrifoods industries	2,044	2,637	0.780	0.438	(-3.124744, 7.21277)
Chemical Industries	0.800	2,963	0.270	0.787	(-5.006811, 6.606706)
Textile Industries	1,551	2,405	0.650	0.519	(-3.162429, 6.265319)
Wood Industries	2,572	2,596	0.990	0.322	(-2.516055, 7.660595)
Extractive industries	-1.360	3,445	-0.390	0.693	(-8.112589, 5.392505)
Geographical location	3,403	1,761	1,930	0.053*	(-0.048857, 6.854688)
Sex of the manager (man)	4,135	2,408	1,720	0.086*	(-0.5845775, 8.854781)
Manager's age	-0.028	0.139	-0.210	0.837	(-0.3000892, 0.243092)
Debt ratio	1,351	0.659	2,050	0.040**	(0.0593693, 2.64268)
Shareholder's capital	-0.293	0.193	-1.510	0.130	(-0.6713025, 0.0860198)
Investments	-1.438	0.694	-2.070	0.038**	(-2.797817, -0.0772436)
Productivity	-0.091	0.999	-0.090	0.927	(-2.049407, 1.866856)
Number of employees	-1.324	1,183	-1.120	0.263	(-3.642261, 0.993925)
Company's age	-0.071	0.095	-0.740	0.457	(-0.2571611, 0.1157827)
Employees wages	1,834	0.882	2,080	0.038**	(0.1051549, 3.56209)
Constant	-9.064	5,590	-1.620	0.105	(-20.02027, 1.892588)
N				51	
χ^2 (16)				35.28	
P				0.0036	
Nickname R ²				0.5561	

*Significant at 10% ; **Significant at 5%; P: P value; IC: confidence interval; SE: standard error.

Table 6. Prediction table in the industry sector.

Classified	Predicted values		
	Profitable	Unprofitable	Total
Profitable	14	7	21
Unprofitable	2	28	30
Total	16	35	51

Source: Study construction/stata.

model. In conclusion the model is well specified (Annex 9).

Quality of the prediction: The analysis of the prediction quality of our model will be done through the prediction table (Table 6). It is question of comparing, like in the commercial sector, the predictions of the occurrence of the event, that is, the cases where the dependent variable is equal to 1 to the true values taken by the dependent variable at the 27% threshold corresponding to the average value of financial profitability in the industrial sector. Using the lstat command under stata, we obtain the following results:

The prediction table shows that 14 out of 16 profitable

industrial enterprises have been well predicted while 28 out of 35 unprofitable companies have been well predicted. The prediction rate of the model is equal to the sum of cases correctly predicted relative to the total number of observations that is, $[(14 + 28) / 51] \times 100 = 82.35\%$.

This explains that variables used in the model largely explain the probability of an industrial company profitability.

ROC Curve: The calculation of the AUC under stata shows that the value of the area under the ROC curve is about 88%. This demonstrates an exceptional discrimination of the model in the industrial sector

Table 7. Marginal effects in the industry sector.

Independent variable	dy / dx	SE	z	P	IC
Nationality	0.350	0.169	2.07	0.038	0.0190686, 0.6810087
Sub categories					
Agri-food industries	0.165	0.194	0.85	0.394	-0.2151284, 0.545959
Chemical Industries	0.056	0.206	0.27	0.784	-0.3481499, 0.4610835
Textile Industries	0.120	0.169	0.71	0.478	-0.2109484, 0.4502618
Wood Industries	0.216	0.204	1.06	0.289	-0.1833399, 0.6158377
Extractive industries	-0.073	0.179	-0.41	0.683	-0.4237223, 0.277682
Geographical location	0.303	0.124	2.44	0,015	0.0597503, 0.5461651
Sex of the manager (man)	0.368	0.180	2.05	0.041	0.0157312, 0.7205558
Manager's age	-0.003	0.012	-0.21	0.837	-0.0266426, 0.0215682
Rate of endettement	0.120	0.045	2.69	0.007	0.0325969, 0.2079635
Shareholders capital	-0.026	0.015	-1.72	0.085	-0.0556749, 0.0035678
Investments	-0.128	0.047	-2.7	0.007	-0.2207189, -0.0352445
Productivity	-0.008	0.089	-0.09	0.927	-0.1822681, 0.1660158
Numberof employees	-0.118	0.099	-1.19	0.234	-0.3119394, 0.076161
Comapny's age	-0.006	0.008	-0.75	0.451	-0.0226579, 0.0100712
Employee wages	0.163	0.060	2.71	0.007	0.0449644, 0.2815264

Source: Study construction/stata.

(Annex 10).

Marginal effects in the industry sector: Marginal effects estimation results are shown in Table 7. Thus the analysis of the marginal effects of the significant variables shows that:

- (1) Compared to foreign companies, the probability for an industrial company to be profitable increase by 35% if it's nationality is Burkinabe ;
- (2) Compared to a company located in Bobo Dioulasso, the probability for an industrial company to be profitable increase by more than 30% when it is located in Ouagadougou;
- (3) Compared to companies led by woman, the probability for an industrial company led by man to be profitable increase of nearly 37%;
- (4) The probability for an industrial company to be profitable decrease by almost 13% if its investments rise by one unit;
- (5) The probability for an industrial enterprise to be profitable increase by about 12% if its debt ratio increases by one unit;
- (6) The probability for an industrial company to be profitable increase by more than 16% if its employee global wages rise by one unit.

Service sector

The estimation results for the services sector data are shown in Table 8.

Validation of the model

The hypothesis of nullity of the coefficients is tested through the interpretation of the ratio of log likelihood LR. The statistic follows under H0 a law of Chi² with 15 degrees of freedom. Thus for a threshold of 5%, the LR statistic is 26.84. Which is greater than the value of the Chi² at 15 ddl read in the table which is 24,996. Then we reject the hypothesis H0 of nullity of the coefficients. The estimated model has at least one explanatory variable of significance. The pseudo R² is about 38%.

Also, the subcategories «*Computer and* at the 5 and 10% thresholds, respectively.

The geographic location, equity, productivity and seniority of *the company* are all significant at the 5% level. As for *personnel expenses*, they are significant at the 10% level.

Quality of the regression

LinkTest: The linktest regression for the service sector gives the results table (Table 9). As in the trade and industry sectors, we note the significance of the $\hat{\mu}$ variable at the 5% threshold and the non-significance of the $\hat{\mu}^2$ variable at the same threshold. This shows that our model does not suffer from a bad specification and does not omit important variables (Annex 11).

Hosmer Lemeshow: The p-value associated with the Hosmer-Lemeshow statistic is 0.66. Which suggests

Table 8. Logistic regression in the services sector.

rf 1	Beta	SE	z	P	IC
Independent variable					
Nationality	0.964	1,656	0.58	0.56	-2.281087, 4.209552
Subcategories					
Insurance	0.000				
Other market services	1,251	1,147	1.09	0.276	-0.9978956, 3.499287
Hotels and restaurants	0.944	1,799	0.52	0.6	-2.582394, 4.469636
IT and telecommunications	4,015	2,010	2	0.046 **	0.075635, 7.954566
Study services	2,428	1,433	1.69	0.09 *	-0.3817456, 5.237402
Transport, warehousing and communications (reference)	0.000	(omit)			
Manager's age	0.062	0.048	1.27	0.202	-0.0331504, 0.1565111
Legal form					
Sole proprietorship (reference)					
Limited company (LC)	1,001	1,467	0.68	0.495	-1.874853, 3.87615
Limited liability company (LLC)	-0.309	1,393	-0.22	0.824	-3.039566, 2.420796
Geographical location (Ouaga)	2,227	1,130	1.97	0.049 **	0.0132642, 4.441337
Debt ratio	0.319	0.165	1.93	0.053 *	-0.0045697, 0.6429621
Shareholders capital	-1.386	0.637	-2.18	0.030 **	-2.635398, -0.13735
Productivity	0.985	0.441	2.23	0.026 **	0.1202477, 1.849407
Number of employees	0.003	0.009	0.3	0.764	-0.0148052, 0.0201531
Sex of the manager	0.000	(omit)			
Company's age	0.113	0,056	2	0.046 **	0.0020775, 0.2235158
Employee wages	-0.191	0.112	-1.7	0.090 *	-0.4109689, 0.0297195
Constant	-7.617	3,450	-2.21	0.027 **	-14.37885, -0.8549538
N				64	
Wald χ^2 (15)				26.84	
P				0.0301	
Nickname R2				0.3798	

*Significant at 10% ; **Significant at 5%; P: P value; IC: confidence interval; SE: standard error.
Source: Study construction.

that there is no evidence of a poor representation of the model. In conclusion the model has a good fit (Annex 12).

Quality of the prediction: The analysis of the predictive quality of our model through the prediction table (Table 9) compares, as in the trade and industry sector, the predictions of the occurrence of the event. These are the cases where the dependent variable is equal to 1 to the true values taken by the dependent variable at the 27% threshold corresponding to the average value of financial profitability in the service sector. Using the *lstat* command under *stata*, we obtain the following results. The prediction table shows that for profitable service firms, 27 cases out of 30 have been well predicted while for companies that are not profitable, 18 out of 33 cases have been well predicted. The prediction rate of the model is equal to the sum of the cases correctly predicted relative to the total number of observations that is, $[(27 + 18) / 64] \times 100 =$

70.31%.

This explains why the variables used in the model explain the probability that a company will be profitable.

ROC Curve: The calculation of the AUC under *stata* shows that the value of the area under the ROC curve is about 88%. This demonstrates excellent model discrimination in the service sector (Annex 13).

Marginal effects in the service sector

Marginal effects estimation results are shown in Table 10. Thus the analysis of the marginal effects of significant variables in the service sector shows that (Table 11):

- (1) The probability for a services company to be profitable increase by about 31% when the company is located in Ouaga rather than other place;
- (2) The probability for a services company to be profitable

Table 9. Prediction table in the service sector.

Classified	Predicted values		
	Profitable	Unprofitable	Total
Profitable	27	16	43
Unprofitable	3	18	21
Total	30	34	64

Source: Study construction/stata.

Table 10. Estimated marginal effects in the services sector.

Variable	dy / dx	SE	Z	P	IC
Marginal effects					
Nationality	0.136	0.233	0.58	0.561	-0.3218385, 0.5930117
Manager's age	0.009	0.006	1.34	0.179	-0.0039785, 0.021325
Legal form					
Sole proprietorship	(reference)				
Limited company (LC)	0.132	0.189	0.70	0.484	-0.2382829, 0.502526
Limited liability company (LLC)	-0.042	0.188	-0.22	0.823	-0.4107077, 0.3266142
Geographical location (Ouaga)					
Debt ratio	0.313	0.140	2.23	0,026	0.0379929, 0.5883955
Shareholders capital	0.045	0.021	2.12	0,034	0.0033474, 0.0864209
Productivity	-0.195	0.071	-2.76	0.006	-0.3333206, -0.0565722
Number of employee	0.138	0.064	2.18	0,029	0.0138907, 0.2630744
Manager sex	0.000	(omitted)	0.30	0.764	-0.0020798, 0.0028318
Company's age	0.000				
Employee wages	0.016	0.007	2.20	0,027	0.0017586, 0.0299635
	-0.027	0.016	-1.63	0,103	-0.0590432, 0.0054334

P: Pvalue; IC: confidence interval; SE: standard error.

Table 11. Resume of sign and significance of financial profitability and the explanatory variables.

Variable	Financial profitability		
	Trade	Industry	Services
Nationality	-	* +	+
Limited liability company (LLC)	-	<i>n.e.</i>	+
Limited company (LC)	-	<i>n.e.</i>	-
Geographical location (Ouaga)	+	* +	** +
Sex (Male)	+	* +	<i>n.e.</i>
Manager's age	+	-	+
Debt ratio	-	** +	* +
Shareholders capital	-	-	- **
Investments	** +	- **	<i>n.e.</i>
Productivity	+	-	** +
Number of employee	+	-	+
Company's age	- **	-	** +
Employee wages	<i>n.e.</i>	** +	- *

- = negative link; + = positive link; - * = significant negative link at 10%; + ** = significant positive link at 5%; *n.e.* = not estimated.

Source: Study construction.

decrease by about 19% when its shareholders capital is increased by one unit;

(3) The probability for a services company to be profitable increase by about 14% when employee productivity increases by one unit;

(4) The probability for a services company to be profitable increase by only 1.5% if it's seniority increases by one unit;

(5) The probability for a services company to be profitable decreases by 2.6% if employee total wages increase by one unit.

DISCUSSION

Trade sector

Investments are an important part of the growth of an enterprise. It contributes to companies performance in the global market by making new acquisitions, improving production capacities and so on.

In the commercial sector, investments and company's age are significant to explain commercial units economic performance at the 5% level. The sub-sector semi wholesale trade is significant at 10% level.

However, the role of investments in the financial performance of companies has not always been elucidated and the expected impact is often variable as shown by Chowdhury and Wolf (2003). They found that this impact on ICT companies was not significant. Thus, in the trade sector in Burkina Faso, it appear the necessity for a company to invest because of its role in financial profitability.

In addition, the company's age of the company came out significant in the explanation of the economic performance of the company. Moreover, this impact is negative, as suggested by Davidsson et al. (2002) and Storey (2016) on the link between age and performance.

So the older a business is, the lower the profitability become over time. This could be explained by a decrease in motivation of promoters specially when, for a given level of growth, expenses become more and reach high proportion. These expenses are encouraging by the thoughts of managers / owners whom starting believing theirs business become "immortal" and will never die. So, it appear a let to go in the expenses of personal consumption, which contribute to increase vulnerability of the company, which generally evolves in an uncertain environment.

Also the sub-category of semi-wholesale trade activities is significant compared to other sectors in the explanation of the financial performance of the trading companies. As suggested by Samuelson et al. (1989), the growth rates of firms depend on their nature. Thus the sub- sector "semi-wholesale trade" has a comparative advantage that would allow it to make good financial performance. Moreover, the fact that the activity is between the wholesale and retail sub categories, this

subsector has the benefits of them.

Industry sector

In the industry sector, investments, employees wages and debt ratio were significant in explaining the financial performance of companies at 5% level. While, manager's nationality and gender and geographical location of the industrial unit are significant at 10% level.

As in the commercial sector, investments play a major role in explaining company's financial performance. However, this impact is negative for industries. Some explanations could be give by the fact that, industries does all required and necessary acquisitions before starting their business. And then, any new investments (equipment changes, new acquisitions, etc.) generate costs and appear as expenses for hem without inducing a significant growth. So, the impact could be low and decrease the financial profitability of industries.

Another result is the positive significance impact of debt ratio on industries profitability, unlike commercial sector where it is not. This is mentioned by Wanda (2001) as being the process of long-term debt neutrality. Thus, in Burkina Faso, manufacturers prefer debt to self-financement instead of use of pecking order theory of Myers and Majluf (1984). However, indebtedness can allow companies, below a given threshold, to finance their expansion capacities and use their own funds to develop certain aspects of their companies, which create a positive effect on industry value, Modigliani and Miller (1985). So debt influence the probability of industries in the country.

As result, employees wages have positive and significant impact on industries for being financially profitable. In fact, better wages have the effect of boosting the productivity of workers by making them more efficient and more innovative, which is known to lead positive results for the company even if Enke (1950) thinks that «too much productivity may not pay if it is bought too expensive and if the rate of interest is too high».

Moreover, as the literature shows, the location of the company could give it a significant comparative advantage that would influence its growth and profitability. Thus, in the explanatory model of the financial profitability of industries, the location is significant at 10% level. The fact that the industrial units are located in Ouagadougou, the economic capital of the country, significantly impact their financial profitability. They not only benefit from economies of scale and agglomeration, but also from the availability of support infrastructure and administrative services essential for their activities (Steil and Wolf, 1997). These factors prove to be important to achieve good financial results for the industrial sector. However, units located elsewhere operate in a market with low uncertainty, which is a limitation of their capacity for innovation and a source of

less impact on profitability (Julien, 2000).

One more result in the industrial sector founded is the nationality of the industry also has a significant positive impact on the probability at 10% of level. Indeed, the fact that the company operates on its territory confers it benefits related to this status, which is different for a foreign company. These can be related to tax reduction, to the knowledge of economic environment, etc. Thus, the knowledge of national market, the establishment of long-lasting and solid distribution networks, constitute major elements of influence on the financial profitability.

Another result is gender which is the subject of more attention of countries decision-makers. Increasingly, women's entrepreneurship is an integral part of development pillar use by governments to attain national objectives. Particularly, in Africa countries and many others of the world, the important role of women in society is critical to achieving sustained and inclusive growth.

From the explanatory model in the industry sector, it appears that gender has an impact on financial performance of industrial companies. Thus, the fact that the entrepreneur is male increase the probability that an industrial enterprise will become profitable compared to the fact that the entrepreneur is female. This can be explained by the nature and specificities of industrial activity base on time-consuming management, and exposition of various risks to ensure performance of the unit. However, this is not always close to the role gives to women in our society, a role in which they are frowned upon if they are not socially involved, Fasci and Valdez (1998) and Robert and Berhe (1999).

Service sector

In the services sector, the econometric analysis shows the significance of geographical location, shareholders capital, productivity and seniority to determine financial performance of companies in Burkina at the 5% threshold. In addition, debt ratio and employees wages have a significant impact at the 10% level.

The geographical location of services in the economic capital Ouagadougou give them comparative advantages. Indeed, country capital contains the most opportunities for services such as transport activity, other market services, hotels and restaurants, research services, etc. This is mainly due to the proximity with a large population, so an available costumers, better infrastructure compared to elsewhere in the country (Steil and Wolf, 1997).

Shareholders capital has a significant and negative impact on the probability for a business service to be financially efficient as Tarek (2001) points it. There is a relationship of non-neutrality between these two quantities as denote by Shleifer et al. (1988). This negative effect can be explained by "lower financial income that does not cover workloads".

Productivity is a variable that plays a significant and

positive role in the business services profitability. Unlike other sectors where this finding does not emerge as Steindl (1947) states, there is an important role between productivity level and business performance.

The service companies ages have a significant and positive impact on their probability. The fact that a service enterprise is older allows it to build a strong network of partnerships and maintain it. This gives it comparative advantages related to its reputation, its experience gained in the field, etc. The seniority of the firm is therefore an influential variable in the explanatory model of Davidsson et al. (2002), in the service sector.

The debt ratio has an impact on the probability that a service company will perform financially as shown in the industry sector. Indeed, indebtedness is often used for capital expenditures related to the installation and operation of the service unit. This is often the case of research and training firms. Also some service activities such as transport, sells services require significant investments that can be made by the debt. This reduce the pressure on the company cash flow and rentabilize the money invested.

In addition, employees wages have a significant impact on the probability for a service activity to be profitable.

However, this impact is negative. Thus, the fact that personnel costs are much higher can lead to a decrease in performance.

Conclusion

Thus the study reveals the existence of relevant explanatory factors on the financial profitability of companies in Burkina. However, from one sector to another, these elements differ and provide a better understanding of the strategic choices made by these entities in their growth process.

As recommendations, it is essential for Burkina Faso government to encourage initiatives that support businesses with high growth potential through appropriate policies. This could allow them to have more flexibility in the investments they make and greater flexibility in the restructuring of companies if they begin to face some difficulties related to significance factors showned.

CONFLICT OF INTERESTS

The authors have not declared any conflict of interests.

ACKNOWLEDGEMENTS

The extend his thank his institution, Chamber of Commerce and Industry of Burkina Faso and the General Manager, Mr. Issaka Kargougou for their support in allowing access data for the paper.

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ANNEX

Annex 1. List of categories and sub-categories of activities

Trade

- Semi-wholesale
- Retail business
- Wholesale
- Small business

Industry

- Buildings and public works
- Agrofoods industries
- Chemical Industries
- Mineral Products Industries and Basic Metallurgical Industries
- Textile and paper industries
- Wood, Metal and Miscellaneous Industries
- Extractive industries

Services

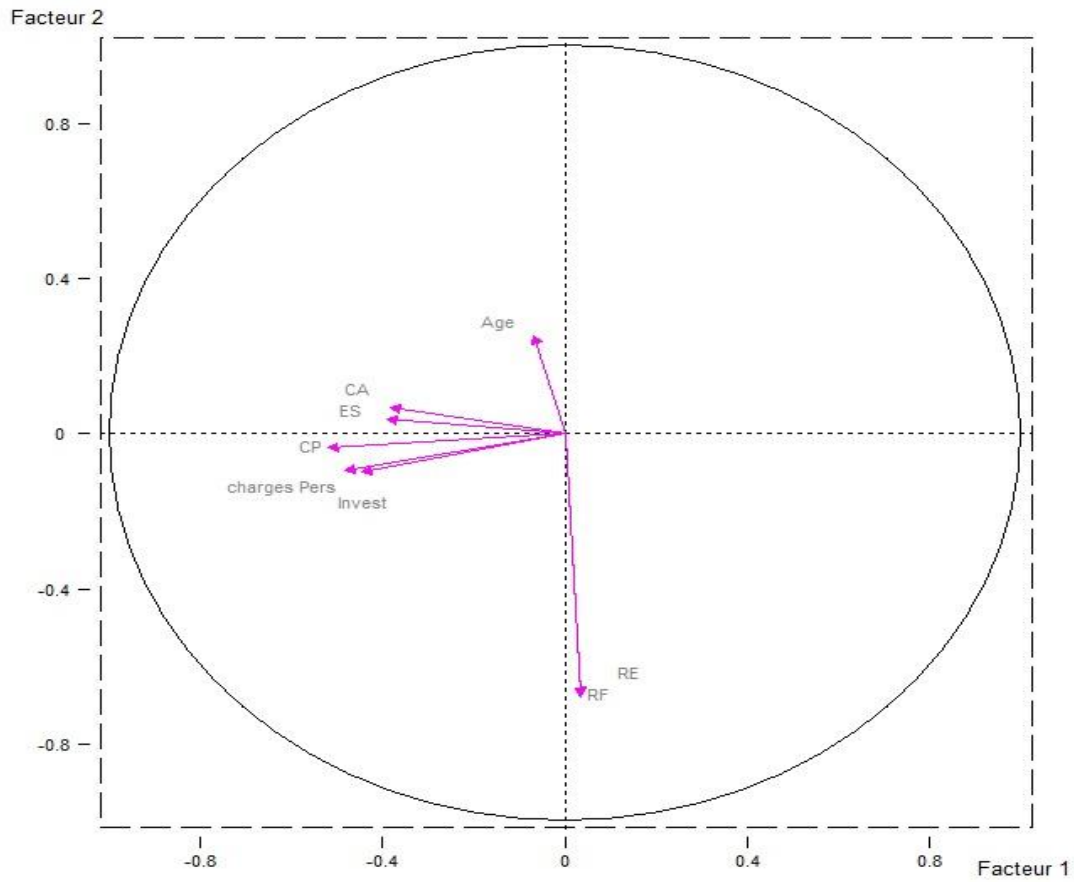
- Insurance
- Other commercial services
- Banks and financial institutions
- Hotels and restaurants
- IT and telecommunications
- Study services
- Transport, Warehouses and Communications

HISTOGRAMME DES 8 PREMIERES VALEURS PROPRES

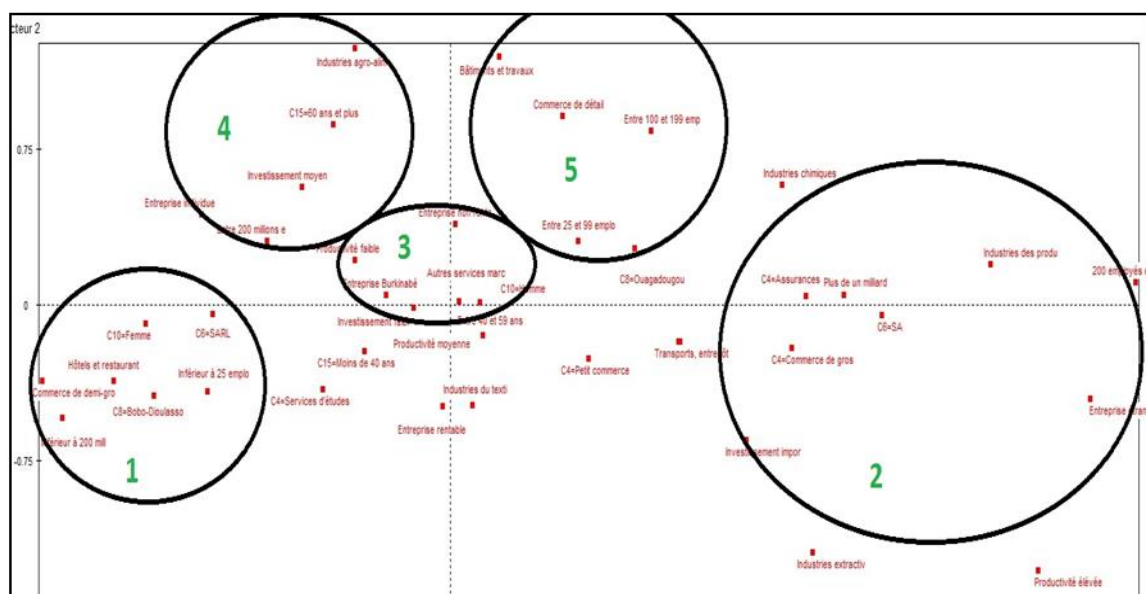
NUMERO	VALEUR PROPRE	POURCENTAGE	POURCENTAGE CUMULE	
1	3.3467	41.83	41.83	*****
2	1.5033	18.79	60.63	*****
3	1.1613	14.52	75.14	*****
4	0.7174	8.97	84.11	*****
5	0.5266	6.58	90.69	*****
6	0.5101	6.38	97.07	*****
7	0.2050	2.56	99.63	*****
8	0.0296	0.37	100.00	*

Annex 2. Histogram of eigenvalues.

Source: Study construction on SPAD.



Annex 3. Factorial representation of study variables. Age = Age of company; CA = turnover; ES = number of employee; CP = capital; Charges Pers = employee wages; Invest = investments; RE = debt ratio; RF = financial profitability.
Source: Study construction on SPAD.



Annex 4. Multiple correspondence analysis representation.
Source: Study construction on SPAD.

Annex 5. Linktest in the trade sector.

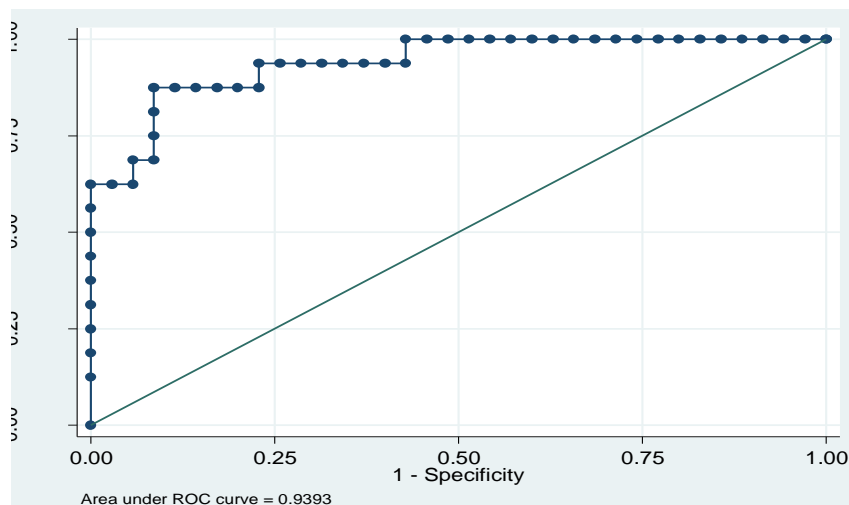
Variable	beta	SE.	z	P	IC
_ hat	1,012	0.2801	3.61	0.000**	0.4630052, 1.561308
_ hat square	0.0175	0.0089	1.95	0.051*	-0.0000793, 0.0351893
constant	- 0.028	0.3611	-0.08	0.937	-0.7362954, 0.6792314
N	56				
χ^2 (15)	30.16				
P	0.0000				
Nickname R ²	0.3885				

Source: Study construction/Stata.

Annex 6. Hosmer-Lemeshow statistics in the trade sector.

Number of observations	56
Number of groups	10
Hosmer-Lemeshow χ^2 (8)	10.90
P value	0.2075

Source: Study construction/Stata.



Annex 7. AUC for the model in the trade sector.

Source: Study construction/stata.

Annex 8. Linktest of the industry sector.

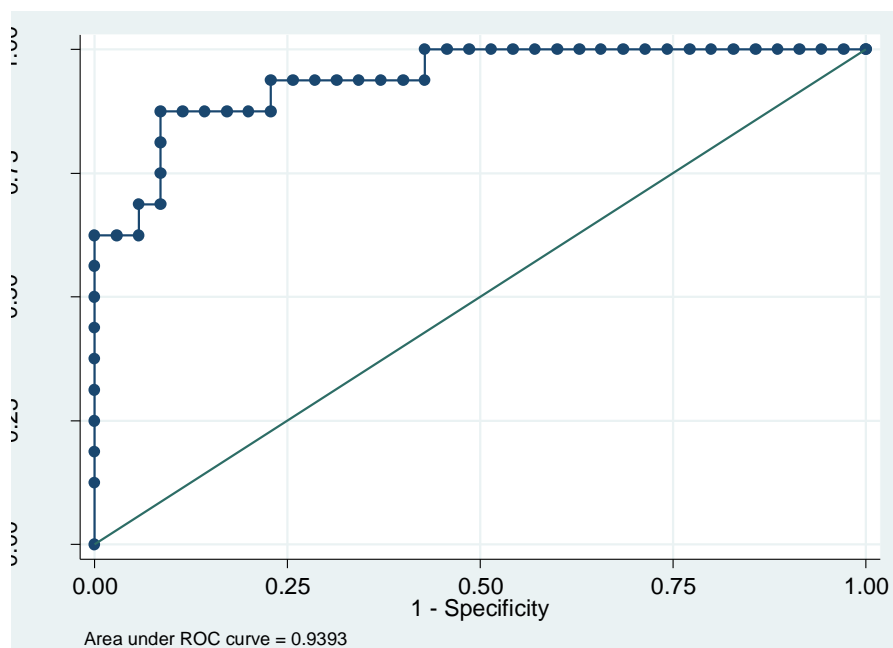
Variable	beta	SE	z	P	IC
_ hat	1,008	0.347	2,910	0.004	0.3281328, 1.686867
_ hatsq	0.005	0.003	1,540	0.124	-0.0013788, 0.0114223
_ cons	-0.007	0.483	-0.020	0.988	-0.9547472, 0.9399244
N			51		
χ^2 (15)			35.32		
P			0.000		
Nickname R ²			0.5567		

*Significant at 10%; **Significant at 5%; P: P value; IC: confidence interval; SE: standard error.
Source: Study construction.

Annex 9. Hosmer-Lemeshow Statistics in the Industry Sector.

Number of observations	51
Number of groups	10
Hosmer-Lemeshow χ^2	6.47
pvalue	0.5953

Source: Study construction / stata.



Annex 10. AUC in the industry sector.

Source: Study construction on stata.

Annex 11. Linktest in the service sector.

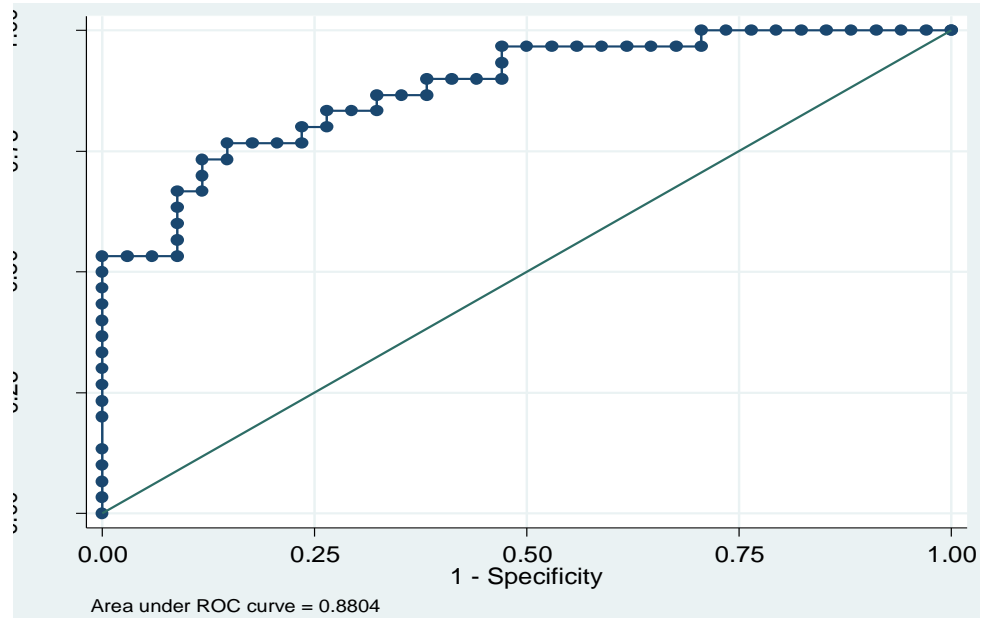
rf 1	beta	SE	z	P	IC	
_ hat	1,014	0.266	3.82	0.000	0.4931945	1.534832
_ hatsq	0.016	0.008	1.94	0.053	-0.0001852	0.0322439
_ cons	-0.026	0.335	-0.08	0.939	-0.6820239	0.6305759
N	64					
χ^2 (2)	33.83					
Prob> chi ²	0.0000					
Nickname R ²	0.3824					

*Significant at 10%; **Significant at 5%; P: P value; IC: confidence interval; SE: standard error.
Source: Study construction.

Annex 12. Statistics of Hosmer Lemeshow in the services sector.

Number of observations	64
Number of groups	10
Hosmer-Lemeshow χ^2	5.85
P value	0.6635

Source: Study construction /Stata.



Annex 13. AUC in the services sector.
Source: Study construction on stata.