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# The Role of Business Sophistication, Revenue Diversification, and Labor Relations on Firm Financing Choice

(Peranan Kecanggihan Perniagaan, Kepelbagaian Hasil, dan Hubungan Buruh terhadap Pilihan Pembiayaan Firma)

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#### ABSTRACT

We model and empirically estimate the relationship of ordinal scaled dependent variable: firm financing choice with business sophistication, revenue diversification and labor relationship using Indonesian data. We use controlling variables derived from Trade off Theory and Pecking Order Theory literature. We then elaborate the baseline model to include additional categoric variables of location and ownership, besides the interaction terms. The dataset is constructed from World Bank Enterprise Survey Year 2015 and Generalized logistic —partial proportional odds regression is employed as an estimator. We find that better business sophistication leads to greater acceptance to financing from outsiders and more diversified firms tend to prefer external financing. Finally, a better labor relationship corresponds to a greater preference for internal financing.

Keywords: Financing choice; business sophistication; revenue diversification; labor relationship.

#### ABSTRAK

Penyelidik memodelkan dan menganggarkan secara empirikal hubungan pemboleh ubah berskala ordinal: pilihan kewangan firma dengan kecanggihan perniagaan, kepelbagaian hasil dan hubungan buruh menggunakan data Indonesia. Pengkaji menggunakan pemboleh ubah kawalan yang diterbitkan daripada literatur Trade off Theory (TOT) dan Pecking Order Theory (POT). Pengkaji menghuraikan model asas untuk memasukkan pemboleh ubah kategori tambahan iaitu lokasi dan pemilikan serta beberapa istilah interaksi. Set data dibina daripada World Bank Enterprise Survey Year 2015 dan logistik umum – regresi ganjil berkadar separa telah digunakan sebagai penganggar. Pengkaji mendapati kecanggihan perniagaan yang lebih baik membawa kepada penerimaan yang lebih besar terhadap pembiayaan dari pihak luar dan firma yang lebih pelbagai cenderung memilih pembiayaan luaran. Akhir sekali, hubungan pekerja yang lebih baik sepadan dengan kecenderungan yang lebih besar kepada pembiayaan dalaman.

Kata kunci: Pilihan kewangan; kecanggihan perniagaan; kepelbagaian hasil; hubungan buruh.

#### INTRODUCTION

Even though empirical literature on financing structure is abundant, academics and practitioners have yet to reach consensus on exactly how firms choose their financing method (An et al 2016; Denis & McKeon 2012). The findings in this area are quite diverse, with a low to moderate robustness. It seems the result is highly context specific (Hang et al., 2018) - unsurprising, given the very wide spectrum of samples and methodologies in terms of firm size and characteristics, sectors, regions, and economies. This lack of consensus means the field is still wide open for new insights.

In this study, we investigate some qualitative aspects of firm financing choice, namely business sophistication, diversification, and labor relations, in addition to more-established variables hypothesized by the trade-off theory (TOT) and the pecking order theory (POT). A recent literature review by Fan et al (2011) emphasizes the role of the more qualitative aspects of a firm's financing choice. The "soft aspect" of firm business influence the decision on a variety of channels like signaling bankruptcy protection, business risk diversification and employee entrenchment. To the best of our knowledge, empirical study on the role of these aspects to financial structure is still limited.

We use data from the 2015 World Bank Enterprise Survey (WB-ES) for Indonesia, which had 1,320 respondents from across the country. The questionnaire covered a range of key aspects in details; there are more than 250 questions, excluding control and general information. Several key aspects covered by the questions are finance, regulation, taxation, law enforcement, competition, innovation, land and permit, crime, and labor. As a member of G20, Indonesia is a large and important emerging market in the global economy. Nevertheless, publications on business environment comparisons (like those from Doing Business-World Bank or Competitiveness Report-World Economic Forum) rate the country at the lowest quartile. Among often-cited problems with business environment in Indonesia, and generally in Asia Pacific Countries (Abe et al, 2015) is financing. Businesses (especially Small Medium Enterprises; SME) still prioritize internal financing and/or find external financing generally difficult (Mahmud & Huda 2011). This is an interesting result that spark our interest for further investigation. Specifically, we would like to know how financing decision of Indonesian enterprises are made. We agree with Fan et al (2011) assertion that qualitative aspects must have played an important role here.

We attempt to relate the WB-ES extensive information content to financing decision of business. TOT and POT are used as starting point of the study; they serve as qualitative basis choice of financing. Due to asymmetric information problem, the choice of financing would follow either as a trade-off between tax shield and cost of bankruptcy as in TOT (Kraus & Litzenberger 1973) or a preferred sequence as in POT (Myers & Majluf 1984). We model the dependent variable as an ordered response in which we transform original numeric financing structure data into ordinal type<sup>1</sup>. Initially we used ordered response regression (following Aitchison & Silvey 1957). Later, after we found violations on the proportional odds (also called parallel lines) assumption, we employed generalized ordered logistic regression (Williams 2016).

We elaborate on our analysis by including the effects of ownership (foreign versus domestic), location, and sectors both as a standalone impact and as an interaction factor. Who owns the company does matter to financing structure, although not conclusively (see Bandyopadhyay & Barua 2016; Quartey et al 2017). As outlined by Kayo and Kimura (2011), financing structure is influenced by firm-level characteristics as well as industry and country.

After this introduction, the paper proceeds as follows. In Section 2 (Literature Study), we present some relevant and recent theoretical and empirical studies on financing structure, which inform how we structure the research design. We then explain our methodology in Section 3, including the description of data, hypotheses, and econometric techniques used. In Section 4, we present estimation results along with the discussion, diagnostic, and robustness checks. Section 5 summarizes the study.

#### LITERATURE REVIEW

The literature in modern capital structure can be traced back to Modigliani and Miller (1958), who hypothesized that capital structure is irrelevant to firm value. This proposition was obtained under strict assumptions of no taxes, no transaction costs, no asymmetric information, and no agency problem. Other early theoretical works on capital structure is the static trade-off theory proposed by Krauz and Litzenberger (1973), firms optimize on both direct and indirect trade-off distress costs (Haugen & Senbet 1978) and tax shield benefits. This theory postulates preference of firms using debt over equity for financing. Jensen and Meckling (1976) added the consideration of agency costs in making a trade-off. Subsequent study by Myers (1977) proposed the underinvestment hypothesis of leveraged firm managers forgoing positive-NPV projects. Using the same framework, Jensen (1986) put forth the free cash flow hypothesis: that debt exerts a disciplining effect on managers.

On the other hand, pecking order theory (POT, Myers & Majluf 1984) states that because of asymmetric information, there exists different valuation on different debt-equity instruments between insiders (managers and owners) and outsiders (investors). This valuation gap causes financing to be biased toward those who are the most informed (minimizing adverse selection). Hence there exists a sequence of financing from inside through retained earnings, then debt, and new equities as the last option.

Nevertheless, because offinancial access constraints, small firms might depend more on credit provided by their suppliers than on bank loans. Corporate finance practices appear to be influenced mostly by firm size and to a lesser extent by shareholder orientation, whereas differences by country are weak at best (Brounen et al 2004; Drobetz et al 2006; Kayo & Kimura 2011). Fan et al. (2011) highlight several future directions for corporate finance research. They emphasize the role of more qualitative aspects of financing choice by firms. They also recognize a hierarchy of variables at the firm, industry, and country level and point out the rule of law, society characteristics, labor relationship, market condition, ownership, business practices, and governance as important sources of variation in financing structure.

Vos et al (2007) study on UK SME revealed that business sophistication increase probability of firms to be more financially diversified. Margaritis and Psillaki (2010) find support for the efficiency risk hypotheses (suggested by Berger and Di Patti, 2006) Using a sample of French manufacturing firms. More-efficient firms are perceived to have lower bankruptcy cost, which lower their cost of debt. Business sophistication is also associated with production efficiency as found by Salas-Velasco (2018) on his study of corporates across OECD countries.

Ngah-Kiinglim et al. (2009), using panel data from 245 Singaporean public firms, find a positive correlation between a firm's product diversification strategy and its debt financing level. Akhtar and Oliver (2009) find that the degree of revenue exposure to external sources has a negative effect on leverage among Japanese firms. This phenomenon is hypothesized to result from risk management practices, wherein Japanese multinational corporations prefer using derivatives while domestic-oriented firms prefer debt. Abe et al. (2015) conducted experts' interview for SME financing determinants in Asia Pacific countries in which they concluded that diversification and bankruptcy law could improve the inclusion of firms to formal financing.

Berk et al. (2010) developed a model of financing structure that incorporates the role of human capital, bankruptcy, and capital structure. They postulate that cost of bankruptcy is mostly borne by the employee (not the investor, as previous literature suggested). Their model produces following projections: (a) Employee risk aversion will negatively affect the leverage ratio, (b) highly leveraged firms have to pay a premium to hire employees, (c) capital-intensive firms will choose higher leverage, and (d) riskier firms will choose lower leverage.

The role of employees in financing structure could also manifest in terms of strategic negotiation. Matsa (2010) developed and tested a model with US firm data in which he finds evidence that firms deliberately choose high leverage to improve their bargaining power with labor unions. Stronger labor ownership might pose a negative impact to financial performance including aversion to outside financing (Guedri & Hollandts 2008; O'Boyle et al. 2016). Nevertheless, the net impact remains inconclusive as higher bonding might also increase motivation and effort (Matsa 2018).

In recent empirical literature, tangible asset, size, growth, profitability and valuation are several most commonly cited conventional factors to influence capital structure (Fan et al. 2011; Fan et al. 2012; Bhaird & Lucey 2014; Hang et al. 2018). Higher tangible asset ownership, company's growth and size are positively correlated to leverage; while profitability and valuation impact to leverage is negative. These findings shown that the empirical body of knowledge have elements of both TOT and POT.

Company age impact to leverage could be positive as found by Forte et al. (2013), Borgia and Newman (2012) and Quartey et al. (2017) or negative (found by Bhaird & Lucey 2014; Kieschnick & Moussawi 2018). Fan et al. (2012) cross country study found the significant positive role of tax rate and bankruptcy cost to external financing. Bankruptcy cost could be proxied by asset riskiness; Forte et al. (2013) study based on Brazilian firms found that it negatively correlated with external financing. Foreign ownership impact to leverage is context dependent. Phung and Ley (2013) and Quartey et al. (2017) studies found that foreign ownership to be negatively affect leverage. On the other hand, Li et al. (2009), Margaritis and Psillaki (2010), Gurunlu and Gursoy (2010) and Bandyopadhyay and Barua (2016) found this relationship to be negative.

In Indonesia context, Machmud and Huda (2011) conducted an interesting survey on SMSE's financing and found almost equal portion of firms that have access to finance (56%) and those which don't have it (44%). Of those which have financial access; mostly (96%) opted to rely on internal financing due to culture or traditional way of doing business. For those firms who don't have financial access usually caused by high transaction cost, insufficient collateral and lack of business skills (ie. producing financial reports and busines plan). Moosa and Li (2012) based on cross section study of public companies found the order of importance of liquidity, size, profitability, tangibility and income variability to capital structure (leverage ratio). Haroon (2018) also found the role of liquidity, profitability, age and ownership to leverage.

#### METHODOLOGY

We model the estimated relationship using a linear form as follows:

$$Y_i^* = X\beta + u_i; E(u_i) = 0$$
<sup>(1)</sup>

in which the cutoff the latent variable for category j of dependent variable  $Y_i^*$  is given by

$$Y_{i} = 1; -\infty < Y_{i}^{*} < \tau_{i}$$

$$Y_{i} = j; \tau_{j-1} < Y_{i}^{*} < \tau_{j} \quad j = 2, \dots, m-1$$

$$Y_{i} = m; \tau_{m} < Y_{i}^{*} < \infty$$
(2)

where *Y* is the financing structure, an ordinal variable<sup>2</sup>, and *X* is the vector of regressors.

We are trying to cover a substantial portion of rich information provided by the dataset. To do so, we combine various items in questionnaire into three metrics: a measure of firm sophistication (SOPHIST), a

No	Variable	Symbol	Description	Expected Sign/
				Hypotneses
	I Financing Choice	FIN_CHOICE	Ordinal Measure as a proxy for financing choice of firm: 1 for Retained Earnings; 2 for Loans from Banks or Non Bank Financial Institutions (NBFIs), 3 for from Suppliers-Others. The indicator is constructed by first grouped the percentage of financing into three categories: retained earnings, loan by banks and NBFIs and suppliers-others. Then an ordinal number is assigned to the most used (shown by greatest percentage) type of financing. It is assigned 1 if the financing is obtained mostly from retained earnings, 2	
64	2 The Size of The Firm	SIZE	if from loans provided by banks and/or NBFI's and 3 if others. Ordinal measure variable as proxy of firm size: 1 if sales <rp. 1="" 5.000="" 500="" between="" if="" million-rp.="" million;="" million<="" rp.="" sales="" td=""><td>Positive (ToT)/</td></rp.>	Positive (ToT)/
(T)	3 Value of Tangible Assets	PL_OWN	and 3 if sales>Rp. 5.000 Million Percentage of Total Property and Land owned by the firm	Negative (POT) Positive (ToT)/
4	4 A measure of profitability	4a. SALES_G	Latest annual growth of sales	Negative (POT) Positive (ToT)/
		4b. TOBIN_Q	The ratio of replacement cost (based on firm own assesment) to book value of Machine and Land	Negative (POT)
43	A qualitative proxy of tax burden	TAX_INSPECT	TAX_INSPECT Measured as number of visits by Tax Officials last year	Positive
	6 A measure of probability of Bankrinetv	BURDEN	Constructed as simple sum of three standardized normal variables : (a) percentage power from generators (of total power consumed) (b) percentage of innort cost (to total moduction cost) and (c) Dave of Inventory	Negative (ToT)/ Positive (POT)
	7 Maturity of Firms	YEAR_OPS	Number of years the firm has been operational	Positive/Negative
~	8 A measure of Business Sophistication	SOPHIST	Constructed as simple sum of eight dummy variables: (a) Legal formalility of the firm, (b) Possesed at least one international certification in business-operation conduct, (c) perform R&D activities at least once in the last 3 years, (d) use email for communication, (e) own a website, (f) conduct a formal training for employee, (g) own a line of credit and (h) use external	Positive
~ ~ ~	A Measure of firm Revenue	DIVERS	auditor. Constructed as simple sum of two standardized normal variables: (a) Percentage of revenue diversification not from main product [Positive	Positive
	Diversification		and (b) Percentage of revenue that is from export (either direct or indirectly)	
1(	10 A measure of labour relationship quality	LABREL	Constructed as simple sum of standardized normal variables of three indicators: (a) ratio of Permanent to Non Permanent emplovee. (b) Average education of permanent emplove and (c) percentage of labour cost to total cost	Positive
11	11 Ownership	FORJV	FORJV=1 if >0% shares owned by foreign entity and/or joint venture; 0 for others.	
12	12 City Category	CITY	CITY=1 if population of the city< 250.000, 2 if population between 250.000-1.000.000 and 3 if population > 1.000.000	
1	13 Province Category	PROV	PROV=1 if a particular province is located in Java or Sumatera Island and 0 for other	
17	14 Sector category	SECTOR	SECTOR=1 if the firm belongs to sector chemical, non metallic mineral product and garments; zero for others (Food, retail, rubber and plastic, other manufacture, other service and textile)	

TABLE 1. Description of Variables and Hypotheses

Note: This table reports (a) the symbol and construction of variables used in the study and (b) the hypotheses in form of expected sign obtained from estimation.

measure of firm revenue diversification (DIVERS), and a measure of labor relationship quality (LABREL). The definition, symbol, details of construction, and expected sign hypotheses for each variable appear in Table 1.

To start, we use an ordered logistic estimation technique. Then we test the proportional odds assumption using the Brant test. Williams (2016) showed that violations of the parallel lines assumption could result not only in a loss of efficiency but even in a bias of estimates. Long and Freese (2014) suggested that in this assumption is often violated in practice. Should such violations happen, we will then use the generalized ordered logistic technique as proposed by Williams (2016). In this study, we use a variant of the generalized logit model, which allows some variables to have the same logit coefficients (called beta coefficients) while others do not (called gamma coefficients). This approach is called the partial proportional odds (PPO) model. An illustration for a model with M categories and three regressors in which the third variable  $(X_{2})$ is relaxed from the assumption is given as follows (Williams 2016):  $P(Y_i > j) =$ 

$$\frac{\exp(\alpha_{j} + X_{1i}\beta_{1} + X_{2i}\beta_{2} + X_{3i}\beta_{3j})}{1 + \exp(\alpha_{j} + X_{1i}\beta_{1} + X_{2i}\beta_{2} + X_{3i}\beta_{3j})}, j = 1, 2, \dots, M-1$$
(3)

We extend our basic model to include foreign ownership (FORJV), classification of the city (CITY) and province (PROV) in which a firm resides, and the sector in which a firm receives the majority of its revenue (SECTOR)<sup>3.</sup>

In addition to the parallel assumption test on the final model, we also conduct robustness checks through sequential inclusion on variables of interest (SOPHIST, DIVERS, and LABREL). We want to see whether each of these variables will affect the estimation results. We use the World Bank Enterprise Survey Year 2015 dataset for Indonesia. We review for data defect: improper responses and outliers before using it for estimation. We had 1,320 observations to begin with. In the next section after data screening, we eventually worked with 774 observations.

#### **RESULTS AND DISCUSSION**

In this section, we present the process of estimation and the estimation results. First, we present descriptive statistics and notes on the data process. Next, we present the estimation results and a brief discussion of the key findings. Finally, we present our diagnostic check to gauge the robustness of the findings. Here, we use statistical cut-off point of p value at 5% at most to indicate significance of variables.

#### TABLE 2. Descriptive Statistics

Variable	Mean	Median	Max	Min	Std. Dev.	Obs
FIN_CHOICE	1.401	1.000	3.000	1.000	0.749	774
SIZE	2.009	2.000	3.000	1.000	0.789	774
PL_OWN	86.017	100.000	100.000	0.000	31.728	774
SALES_G	0.132	(0.001)	27.889	(1.000)	1.739	774
TOBIN_Q	4.580	1.333	275.000	0.007	18.921	774
TAX_INSPECT	1.923	2.000	5.000	1.000	0.979	774
BURDEN	0.175	(0.611)	16.143	(1.327)	1.839	774
YEAR_OPS	21.428	19.000	95.000	2.000	11.032	774
SOPHIST	2.363	2.000	8.000	0.000	2.081	774
DIVERS	0.067	(0.852)	6.800	(0.852)	1.604	774
LAB_REL	0.478	0.525	8.980	(5.412)	1.623	774

*Note:* This table reports descriptive statistics of the variables used in the study. We start with 1,320 observations and then exclude observations based on the following qualifications: tallies on financing choice, zero sales, zero book value of machine and land, winsorizing 1% of sales growth, and Tobin\_Q. After filtering out the foregoing observations, we have 774 observations to be analyzed. The lower part is number of cases in each category of dependent and explanatory variables.

			#0	Cases of Categ	orical Varial	oles			
FIN P	RTY	SIZE	CAT	CI	ГҮ	D FO	RJV	SEC	TOR
Category	#Cases	Category	#Cases	Category	#Cases	Category	#Cases	Category	#Cases
1	588	1	237	1	64	1	88	1	327
2	62	2	293	2	209	0	686	0	447
3	124	3	244	3	501				
Sum	774		774		774		774		774

#### TABLE 3. Correlation Table

	FIN_CHOICE S	SIZE	PL_OWN	SALES_G	TOBIN_Q	TAX_INSPECT	YEAR_OPS	BURDEN	SOHPIST	DIVERS L	AB_REL
FIN_CHOICE	1.000										
SIZE	0.018	1.000									
PL_OWN	(0.114)	(0.140)	1.000								
SALES_G	(0.007)	(0.114)	0.062	1.000							
TOBIN_Q	(0.052)	0.030	0.066	(0.023)	1.000						
TAX_INSPECT	0.042	0.241	(0.007)	0.069	(0.061)	1.000					
YEAR_OPS	0.032	0.178	0.133	0.048	0.098	0.071	1.000				
BURDEN	0.141	0.340	(0.130)	(0.004)	0.225	0.024	0.243	1.000			
SOHPIST	0.244	0.561	(0.112)	0.077	0.174	0.085	0.331	0.414	1.000		
DIVERS	0.253	0.283	(0.095)	0.100	0.002	(0.074)	0.146	0.162	0.303	1.000	
LAB_REL	(0.162)	(0.110)	0.078	0.119	(0.153)	0.078	0.142	0.019	0.006	(0.018)	1.000

*Note:* This table reports matrix of correlation (Pearson correlation) between dependent variables and (non-categoric) explanatory variables. The calculation is based on 774 observations.

#### DESCRIPTIVE STATISTICS

Table 2 presents the descriptive statistics of the variables used in the estimation. After the filtering process, it looks like the data are reasonably well behaved. Except for TAX\_INSPECT, all variables have 774 observations. The correlations, shown in Table 3, indicate that a somewhat high correlation exists between variables SIZE and SOPHIST (0.561). Nevertheless, we find that overall bivariate correlation structure is quite acceptable.

#### REGRESSION RESULTS

As explained earlier, we first perform ordered logistic regression. The results show that the parallel line assumption has been violated based on the Brant test. As Table 4 shows, the Brant test chi squares are 19.35

TABLE 4. Ordered Logisti	c Regression	Estimation	and Brant
	Test		

Coefficient	Мо	lel A	Мос	iel B
	Coef.	P_val	Coef.	P_val
SIZE	1.196***	0.005	1.108***	0.006
PL_OWN	-0.011*	0.086	-0.010	0.136
SALES_G	0.033	0.662		
TOBIN_Q			-0.038	0.329
TAX_INSPECT	-0.005	0.976	-0.025	0.876
BURDEN	0.054	0.338	0.082	0.159
YEAR_OPS	-0.006	0.735	-0.005	0.771
SOPHIST	0.164*	0.097	0.190**	0.050
DIVERS	0.188***	0.010	0.184***	0.013
LAB_REL	-0.166**	0.042	-0.191**	0.019
Pseudo R2	0.123		0.129	
χ2 Model	43.78***	0.000	48.78***	0.000
χ2 Brant Test	19.35**	0.022	16.96**	0.049

*Note:* This table reports the result of ordered logistic regression and test on the parallel line assumption (Brant test) with dependent variable FIN\_CHOICE. \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% level, respectively. and 16.96 for Model A and Model B, respectively, both statistically significant at the 5% level. Therefore, at least one of the regressors must have a different coefficient for different category equation.

Because ordered logistic is not the correct method to use, we then proceed to generalized ordered logistic regression. To preserve parsimony, we impose coefficient restrictions on variables in which proportional assumptions hold (verified by a Wald test); this is the PPO model. For these variables, we could use the same coefficients for each values of *j* category, called

TABLE 5.	Baseline	PPO	Regressions
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Coefficient	Mod	el 1	Mod	el 2
	Coef.	P_val	Coef.	P_val
Beta				
SIZE	0.526***	0.002	0.503***	0.003
PL_OWN	-0.018***	0.000	-0.018***	0.000
SALES_G	0.056	0.162		
TOBIN_Q			0.007**	0.050
BURDEN	0.007	0.880	0.006	0.904
YEAR_OPS	0.000	0.986	0.000	0.972
SOPHIST	0.100*	0.090	0.111*	0.059
DIVERS	0.198***	0.000	0.198***	0.000
LAB_REL	-0.248***	0.000	-0.242***	0.000
Gamma				
TOBIN_Q			-0.011**	0.037
SOPHIST	-0.105**	0.013	-0.119***	0.005
Pseudo R2	0.130			0.137
χ2 Model	124.89***	0.000	126.04***	0.000
χ2 Prop. Assumption	8.070	0.326	4.990	0.545
Negative Pred. Prob		0.000		0.000

*Note:* This table reports the result of PPO regression with dependent variable FIN\_CHOICE, complemented by tests on parallel assumption (Wald test) and specification (in sample cases of negative predicted probability). \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% level, respectively.

beta. The test and estimation are worked like a stepwise regression using an autofit mechanism (Williams, 2006). We report here only that the chosen model no longer has a parallel line violation issue. Variables in which assumptions are not required to hold could have separate effect coefficients (called gamma). In addition to testing for the proportional odds assumption, we also test for proper specification. Williams (2016) states that a proper PPO model should not produce negative probability in sample cases<sup>4</sup>.

As Table 5 illustrates, we find strong empirical support for our variables of interest: Business Sophistication, Revenue Diversification, and Labor Relationship. The coefficients for Business Sophistication are all positive (in the range of 0.100 to 0.111) but barely statistically significant (at the 10% level). Hence it seems that more-sophisticated enterprises tend to use greater leverage. More sophisticated business entities have better transparency and risk management hence would be more willing to accept outside financing. These findings are also

confirmed by Fan et al. (2011) and Quartey et al. (2017).

Revenue Diversification is also positively correlated with financing choice in all model specifications (coefficient of 0.198, significant at the 1% level). Firms that have more-diversified revenue are more willing to accept financing from outsiders (i.e., creditors). Hang et al (2018), Bhaird and Lucey (2010), and Quartey et al. (2017) all find similar results. Aligned with these studies, we find diversification could be associated with more profit and less risk business, which subsequently linked with greater propensity in taking leverage.

The quality of the labor relationship seems to exert adverse influence on leverage. The coefficients are negative (in the range of -0.248 to -0.242) and statistically significant (at the 1% level). Our findings confirm the theoretical projection of Berk, Stanton, and Zechner (2010), in which labor-intensive firms are associated with low leverage. Higher bonding of labor to the firm will exert risk averse attitude in part of the labor that affect managerial financing decision. It might also

Coefficient	Мо	del 3	Мо	del 4	Мо	del 5	Мо	del 6
	Coef.	p val						
Beta								
SIZE	0.521***	0.002	0.531***	0.002	0.544***	0.001	0.505***	0.003
PL_OWN	-0.018***	0.000	-0.019***	0.000	-0.018***	0.000	-0.018***	0.000
SALES_G	0.051	0.200	0.052	0.198	0.048	0.235	0.056	0.169
BURDEN	-0.001	0.991	0.029	0.545	0.004	0.935	0.009	0.852
YEAR_OPS	0.001	0.953	0.001	0.875	-0.001	0.950	0.000	0.974
SOPHIST	0.104*	0.076	0.150**	0.014	0.086	0.146	0.092	0.122
DIVERS	0.197***	0.000	0.208***	0.000	0.207***	0.000	0.199***	0.000
LAB_REL	-0.244***	0.000	-0.254***	0.000	-0.233***	0.000	-0.246***	0.000
CITY	-0.220	0.134						
FORJV			-0.855***	0.007				
PROV					-0.365***	0.047		
SECTOR							-0.105	0.297
Gamma								
SOPHIST	-0.114***	0.004	-0.107**	0.013	-0.107**	0.012	-0.105***	0.013
CITY	0.417***	0.002						
Pseudo R2	0.144		0.138		0.134		0.131	
χ2 Model	133.85***	0.000	129.8***	0.000	130.66***	0.000	127.3***	0.000
χ2 Prop. Assumption	14.97**	0.036	12.990	0.112	9.710	0.286	10.050	0.262
Negative Pred. Prob	0		0		0		0	

TABLE 6. Extended PPO Regressions with SALES\_G as a Proxy for Profitability

*Note:* This table reports the result of Extended PPO regression with dependent variable: FIN\_CHOICE and Categoric Variables: CITY, FORJV, PROV and SECTOR. SALES\_G is used as the profitability proxy. The results are complemented with tests on parallel assumption (Wald test) and specification, in sample cases of negative predicted probability. \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% level, respectively.

support Matsa's (2010) bargaining hypotheses, which suggests that firms use leverage, rather than labor, to improve their strategic position.

Size of the firm appears to have a positive effect on the odds proportion of taking financing from outsiders (banks and NBFIs, suppliers, or other sources). This finding supports the TOT hypothesis and is consistent with Kayo and Kimura (2011), Quartey et al. (2017), Fan et al. (2012), and Hang et al. (2018). Larger firm (hence larger revenue); ceteris paribus, means greater tax saving could be obtained from using leverage. Nevertheless, it seems that a higher percentage of tangible asset ownership exerts an inward tendency on the firm's financing choice. Higher percentage of property owned by the firm exerts a negative and highly significant impact to leverage. Therefore, our finding also supports the POT hypothesis: greater tangible assets means more private value that results in less incentive to get external financing. Bhaird and Lucey (2010), Forte et al. (2014), and Bandyopadhyay and Barua (2016) are studies that find similar results.

The influence of profitability if measured by sales growth is positive but not statistically significant. Nevertheless, if we use Tobin's Q, we find a positive and significant (at the 5% level) coefficient. This finding supports the TOT hypothesis and is aligned with empirical evidence by Graham and Harvey (2001), Bhaird and Lucey (2014), and Forte, Barros, and Nakamura (2014). We find no supporting evidence from bankruptcy and years of operation proxies. The coefficients are not statistically significant.

There are two variables for which the proportional odds assumption does not hold: TOBIN\_Q (Model 1) and Business Sophistication (Models 1 and 2). Note that these gammas are the coefficients of respective variables in regressions for dependent variable: Financing choice of odds ratio using Retained earnings (category 1) and Loan from Banks and NBFIs (category 2) versus Other (category 3). Because the dependent variable has only three categories, they can be thought of as the (algebraic) sign inverse probability of other type of financing versus retained earnings and loans from bank and NBFIs.

Coefficient	Mod	el 7	Mod	lel 8	Model	9	Mod	el 10
	Coef.	p val						
Beta								
SIZE	0.505***	0.003	0.510***	0.003	0.531***	0.002	0.481***	0.004
PL_OWN	-0.018***	0.000	-0.018***	0.000	-0.018***	0.000	-0.018***	0.000
TOBIN_Q	0.003	0.253	0.007*	0.058	0.007**	0.036	0.007*	0.054
BURDEN	0.000	0.999	0.028	0.563	0.002	0.961	0.007	0.879
YEAR_OPS	0.000	0.958	0.001	0.899	-0.001	0.923	0.000	0.964
SOPHIST	0.112**	0.056	0.160***	0.009	0.094	0.108	0.104*	0.081
DIVERS	0.196***	0.000	0.208***	0.000	0.207***	0.000	0.199***	0.000
LAB_REL	-0.238***	0.000	-0.249***	0.000	-0.226***	0.000	-0.240***	0.000
CITY	-0.218	0.139						
FORJV			-0.855***	0.007				
PROV					-0.387**	0.035		
SECTOR							0.193	0.306
Gamma								
TOBIN_Q			-0.011**	0.039	-0.011**	0.034	-0.011**	0.037
SOPHIST	-0.114***	0.004	-0.121***	0.004	-0.121**	0.004	-0.119***	0.004
CITY	0.421***	0.002						
Pseudo R2	0.143		0.144		0.141		0.138	
χ2 Model	136.330***	0.000	130.200***	0.000	133.120***	0.000	128.550***	0.000
χ2 Prop. Assumption	14.460**	0.044	9.100	0.245	7.320	0.397	8.410	0.298
Negative Pred. Prob	0.000		0.000		0.000		0.000	

TABLE 7.	Extended PPC	Regressions v	with TOBIN	Qa	is a Proxy	y of Profitability	

*Note:* This table reports the result of Extended PPO regression with dependent variable: FIN\_CHOICE and categoric variables: CITY, FORJV, PROV, and SECTOR. TOBIN\_Q is used as the profitability proxy. The results are complemented with tests on parallel assumption (Wald test) and the specification test: in sample cases of negative predicted probability. \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% level, respectively.

Coefficient	Model 11	=	Moc	Model 12		Model 15		Model 14	4	MIN	CI labolu	9W	Model 16		Model 17		Model 18	18	Model 19	611
	Coef. p	p val	Coef.	p val	Coef.	ď		Coef. p val	_	Coef.	p val	Coef.	p val	Coef.		_	Coef. p 1	p val	Coef. p	p val
Beta				1									1							
SIZE	0.530**	0.017	$0.492^{***}$	0.004		0.539***	0.002	0.506***	0.003	$0.507^{***}$	0.003	3 0.523***		0.002 0.3	0.524***	0.002	$0.488^{***}$	0.005	$0.526^{***}$	0.002
PL_OWN	-0.018***	0.000	-0.020***	0.000		$-0.018^{***}$	0.000	-0.019***	0.000	$-0.018^{***}$	0.000	0 -0.018***		0.000 -0.0	-0.018***	0.000	-0.020***	0.000	-0.018***	0.000
SALES G	0.048	0.221	0.058	0.165	65	0.059	0.139	0.051	0.203	0.056	0.175	5 0.058		0.151	0.050	0.223	0.050	0.227	0.056	0.162
BURDEN	0.006	0.900	0.005	0.920	20	0.011	0.822	0.028	0.558	0.010	0.829			0.861	0.005	0.925	0.009	0.844	0.007	0.880
YEAR OPS	-0.001	0.893	-0.001		50	-0.002	0.867	0.001	0.870	0.001	0.912	2 0.000		0.998	0.000	0.985	-0.002	0.863	0.000	0.985
SOPHIST	0.187	0.296	0.107*	. 0.071	71	0.100*	0.089	$0.164^{***}$	0.009	$0.115^{**}$	0.050	0.098*		0.094 0	0.131**	0.034	0.112*	0.060	0.100*	0.092
DIVERS	0.183***	0.001	-0.01	0.964		$0.200^{***}$	0.000	0.207***	0.000	0.239***	0.000	0 0.203***		0.000 0.0	0.206***	0.000	0.120	0.142	0.198***	0.000
LAB_REL	-0.240***	0.000	- 0	0.000		-0.466***	0.002	-0.256***	0.000	-0.243***	0.000	0 -0.229***		0.000 -0.	-0.236***	0.000	-0.248***	0.000	-0.248***	0.000
SIZE*SOPHIST	-0.020	0.776																		
SIZE*DIVERS			0.087	0.313	13				_											
SIZE*LAB_REL						0.093	0.132		_											
FORJV*SOPHIST								-0.154***	0.009											
FORJV*DIVERS									_	-0.247**	0.034	4								
FORJV*LAB_REL									_			-0.110		0.364						
PROV*SOPHIST									_						-0.083	0.126				
PROV*DIVERS									_								0.163	0.120		
PROV*LAB_REL																			0.001	0.994
									_											
Gamma	**770 0	0 033	**9000	0000	00												**0000	0.010		
DI OWN	0+0-0-	ccn.0			26				_								0.005**	210.0		
SALES G			0000		2												000.0	070.0		
SOPHIST	-2.798**	0.017	-0.164***	0.000		-0.103**	0.015	-0.107**	0.013	-0.129***	0.006	6 -0.106**		0.013 -0	-0.107**	0.012	-0.187***	0.000	-0.105**	0.013
DIVERS									_											
SIZE*SOPHIST	0.902**	0.021																		
SIZE*DIVERS			-0.132**	0.029	29				_											
FORJV*DIVERS									_	0.212**	0.031	1								
PROV*DIVERS																	-0.124**	0.046		
Pseudo R2	0.158		0.141			0.132		0.137		0.136		0.131			0.133		0.141		0.130	
χ2 Model	125.240***	0.000	134.690***	0.000	00 123.	$123.620^{***}$	0.000 1	127.970***	0.000	$131.340^{***}$	0.000	0 127.940***		0.000 128.	$128.670^{***}$	0.000	$128.630^{***}$	0.000	125.29***	0.000
$\chi^2$ Prop. Assumption	7.380	0.287	1.990	0.737	37	9.060	0.337	12.210	0.142	9.950	0.191	9.150		0.330	7.890	0.445	3.270	0.659	8.790	0.360
Negative Pred. Prob	162		27			0		0	_	10			0		0		72		0	

The Role of Business Sophistication, Revenue Diversification, and Labor Relations on Firm Financing Choice

Coef.         P val         Coef.         P val </th <th>0.003 0.0078 0.078 0.058 0.058 0.058 0.058 0.058 0.058 0.058 0.058 0.056 0.056 0.056 0.056</th> <th>Coef. p val 0.005 0.485*** 0.005 0.109*** 0.006 0.007* 0.576 0.001 0.891 0.174*** 0.006 0.277*** 0.000 -0.252*** 0.000 -0.252*** 0.000</th> <th>Coef. p val 0.485*** 0.005 0.018*** 0.000 0.007* 0.052 0.001 0.940 0.001 0.940 0.233*** 0.000 0.237*** 0.000 -0.237*** 0.003</th> <th>Coef.         p val           05         0.500***           00         -0.018***           52         0.007**           60         0.007**           10         0.110*           11         0.110*           00         -0.224***           00         -0.224***           00         -0.224***           00         -0.224***</th> <th>Cont.           0.000         -           0.047         0.047           0.047         0.061           0.061         0.000           0.000         -           0.000         -           0.000         -           0.000         -           0.000         -           0.000         -</th> <th>p val p val 0.007** 0.003 0.003 0.143** 0.143** 0.230*** 0.230***</th> <th>0.003 0.007 0.007 0.007 0.001 0.001 0.001 0.001 0.001 0.001 0.000</th> <th>p val p val 0.003 0.010 -0.002 0.117 0.117 240***</th> <th>Coef. 0.006 0.5 0.000 -0.0 0.203 0 0.233 0 0.233 0 0.24 0 0.154 0.1 0.169 -0.2 0.109 -0.2</th> <th>p.val           p.val           0.503***         0.003           0.018***         0.000           0.007**         0.000           0.006         0.907           0.000         0.974           0.111*         0.600           0.111*         0.000           0.1239***         0.001           -0.239***         0.001</th>	0.003 0.0078 0.078 0.058 0.058 0.058 0.058 0.058 0.058 0.058 0.058 0.056 0.056 0.056 0.056	Coef. p val 0.005 0.485*** 0.005 0.109*** 0.006 0.007* 0.576 0.001 0.891 0.174*** 0.006 0.277*** 0.000 -0.252*** 0.000 -0.252*** 0.000	Coef. p val 0.485*** 0.005 0.018*** 0.000 0.007* 0.052 0.001 0.940 0.001 0.940 0.233*** 0.000 0.237*** 0.000 -0.237*** 0.003	Coef.         p val           05         0.500***           00         -0.018***           52         0.007**           60         0.007**           10         0.110*           11         0.110*           00         -0.224***           00         -0.224***           00         -0.224***           00         -0.224***	Cont.           0.000         -           0.047         0.047           0.047         0.061           0.061         0.000           0.000         -           0.000         -           0.000         -           0.000         -           0.000         -           0.000         -	p val p val 0.007** 0.003 0.003 0.143** 0.143** 0.230*** 0.230***	0.003 0.007 0.007 0.007 0.001 0.001 0.001 0.001 0.001 0.001 0.000	p val p val 0.003 0.010 -0.002 0.117 0.117 240***	Coef. 0.006 0.5 0.000 -0.0 0.203 0 0.233 0 0.233 0 0.24 0 0.154 0.1 0.169 -0.2 0.109 -0.2	p.val           p.val           0.503***         0.003           0.018***         0.000           0.007**         0.000           0.006         0.907           0.000         0.974           0.111*         0.600           0.111*         0.000           0.1239***         0.001           -0.239***         0.001
Oct.         Prat.         Oct.         Prat.         Oct.         Prat.         Oct.         Prat.         Oct.         Prat.         Oct.         Prat.	0.003 0.006 0.851 0.869 0.058 0.058 0.058 0.006 0.006 0.006 0.006	0.485*** 0.005 0.485*** 0.000 0.007* 0.058 0.001 0.891 0.124*** 0.005 0.207*** 0.000 0.252*** 0.000 0.154*** 0.000	0.148.*** 0.018.*** 0.009 0.001 0.126** 0.237*** 0.248**	0.500**** 0.500*** 0.007** 0.007 0.110* 0.110* 0.202**** -0.224****	0.003 0.007 0.885 0.977 0.061 0.000 0.0000 0.0000 0.0000	P * 44 0.506*** 0.007** 0.003 0.000 0.143** 0.230*** 0.230***		9 * 41 776 * *** 0.003 0.010 0.117 0.117 2.40 * ** 0.168 0.168	-000 -000 -000	
WN 0.57** 0.015 0.514*** 0.002 0.509*** WN -0.018*** 0.006 -0.018*** 0.006 0.018*** 0.006 EN 0.07** 0.045 0.018*** 0.006 0.018*** DEN 0.07** 0.045 0.018*** 0.006 -0.07** 0.045 0.018*** 0.006 -0.01 0.872 0.000 0.998 -0.001 IST 0.243 0.172 0.106* 0.071 0.111* REL -0.235** 0.000 -0.239*** 0.000 -0.460*** SOPHIST -0.039 0.578 0.096 0.282 0.19*** REL -0.239*** 0.000 -0.239*** 0.001 -0.460*** *CHAB_REL -0.039 0.578 0.096 0.282 0.19*** *CHAB_REL -0.039 0.578 0.096 0.282 0.19*** *PIVERS -0.001 -0.239*** 0.000 -0.460*** *DIVERS 0.184** 0.001 -0.239*** 0.001 -0.460*** *SOPHIST -0.039 0.578 0.096 0.282 0.19*** *DIVERS 0.184** 0.001 -0.239*** 0.000 -0.460*** *DIVERS 0.184** 0.001 -0.239*** 0.001 -0.011** *DIVERS 0.284** 0.001 -0.239*** 0.001 -0.011** *DIVERS 0.235*** 0.001 -0.011** 0.031 -0.011** *DIVERS 0.001 -0.000 -0.000 -0.011** 0.031 -0.011**					0.003 0.001 0.047 0.885 0.977 0.061 0.000 0.000 0.000					
WI -0.018*** 0.000 -0.018*** 0.000 -0.018*** 0.006 EN 0.07** 0.045 0.007** 0.045 0.006 EN 0.005 0.914 0.005 0.925 0.009 IST 0.243 0.172 0.106* 0.07111* AS 0.184*** 0.001 0.872 0.199*** REL -0.235*** 0.000 -0.239*** 0.000 -0.460*** SOPHIST -0.039 0.578 0.096 0.282 0.199*** REL -0.235*** 0.000 -0.239*** 0.091 0.111* *REL -0.235*** 0.000 -0.239*** 0.091 0.191** *REL -0.235*** 0.001 -0.239*** 0.001 0.191** *DIVERS -0.934** 0.021 0.011** 0.031 0.011** *LAB_REL -2.848** 0.016 0.347** 0.031 0.011** NN -0.011** 0.029 0.111** 0.011					0.000 0.047 0.885 0.977 0.061 0.000 0.000 0.000				0	
N.Q. 0.007** 0.045 0.007** 0.045 0.006* EN 0.05 0.914 0.005 0.925 0.009 IST 0.043 0.172 0.000 0.998 -0.001 IST 0.243 0.172 0.106* 0.071 0.111* REL -0.235** 0.000 -0.942 0.862 0.19*** REL -0.235** 0.000 -0.239*** 0.000 -0.460*** SOPHIST -0.039 0.578 0.096 0.282 0.19*** REL -0.239*** 0.000 -0.239*** 0.001 -0.460*** NELL -0.239*** 0.001 -0.239*** 0.001 -0.460*** SOPHIST -0.039 0.578 0.096 0.282 0.19*** V*LAB_REL -0.235** 0.000 -0.239*** 0.001 -0.460*** *SOPHIST -0.039 0.578 0.096 0.282 0.091 -0.011** *SOPHIST -0.039 0.578 0.096 0.282 0.091 -0.011** *SOPHIST -0.039 0.578 0.096 0.282 0.001 -0.011** *SOPHIST -0.039 0.578 0.006 0.282 0.001 -0.011** *SOPHIST -2.848* 0.016 -0.09*** 0.008 -0.011** NN -0.011** 0.029 -0.011** 0.031 -0.011** NS -0.011** 0.029 -0.011** 0.031 -0.011** NS -0.011** 0.008 0.347** 0.028 -0.011**					0.047 0.885 0.977 0.061 0.000 0.000 0.000		0-		0 100	
EN         0.005         0.914         0.005         0.925         0.009          OPS         -0.001         0.872         0.000         0.998         -0.001           IST         0.243         0.172         0.106*         0.071         0.111*           REL         0.235***         0.000         0.998         -0.001           SS         0.184***         0.001         -0.042         0.862         0.199***           REL         -0.235***         0.000         -9.98         0.091         -0.460***           SOPHIST         -0.039         0.578         0.096         0.282         0.091           V*LAB_REL         -0.339         0.578         0.096         0.282         0.091           V*SOPHIST         -0.339         0.578         0.096         0.282         0.091           V*LAB_REL         -0.344         0.096         0.282         0.091         0.091           V*LAB_REL         -0.034         0.282         0.091         0.091         0.091           V*LAB_REL         -0.034         0.021         0.091         0.091         0.091           *SOPHIST         -0.034         0.021         0.091         0.091         0.0				0 0	0.385 0.001 0.000 0.000 0.387		0-			
OPS         -0.001         0.872         0.000         0.998         -0.001           IST         0.243         0.172         0.106*         0.071         0.111*           REL         0.235***         0.001         -0.042         0.862         0.199***           REL         -0.235***         0.000         -0.362         0.199***           SOPHIST         -0.039         0.578         0.096         0.282         0.919***           DIVERS         -0.039         0.578         0.096         0.282         0.991           V*SOPHIST         -0.031         0.578         0.096         0.282         0.991           V*SOPHIST         -0.034         0.578         0.096         0.282         0.991           *SOPHIST         -0.034         0.578         0.096         0.282         0.991           *SOPHIST         -0.034         0.091         -0.460***         0.991           *SOPHIST         -0.034         0.091         -0.460***         0.991           *SOPHIST         -0.934**         0.021         -0.934**         0.991           *OPUERS         -0.011**         0.021         -0.011**         -0.911***           *DIVERS				0 0	0.977 0.061 0.000 0.000 0.387		9		00	
IST 0.243 0.172 0.106* 0.071 0.111* REL -0.235*** 0.000 -0.239*** 0.000 -0.460*** SOPHIST -0.039 0.578 0.096 0.282 0.199*** IDIVERS -0.039 0.578 0.096 0.282 0.091 V*SOPHIST *0.096 0.282 0.091 V*SOPHIST *0.096 0.282 0.091 *VAB_REL *0.096 0.282 0.091 *VAB_REL *0.096 0.282 0.091 *VAB_REL *0.096 0.282 0.091 *1.AB_REL *0.096 0.282 0.091 *1.AB_REL *0.091 *0.091 0.091 *1.AB_REL *0.001 *0.0031 0.011** *1.AB_REL *0.006 0.011** 0.031 0.011** *1.AB_REL *0.006 0.024				0 0	0.061 0.000 0.000 0.387		D-			
REL -0.01 -0.04** 0.001 -0.042 0.862 0.199*** REL -0.235*** 0.000 -0.239*** 0.000 -0.460*** SOPHIST -0.039 0.578 0.096 0.282 DIVERS 0.096 0.282 0.091 v*SOPHIST -0.039 0.578 0.096 0.282 v*LAB_REL -v*SOPHIST -0.091 0.091 v*LAB_REL -0.094** 0.001 -0.011** 0.031 0.001 *DIVERS 0.010* 0.021 -0.011** 0.031 0.011**				0 0	0.000 0.387				- CO-	
REL -0.235*** 0.000 -0.239*** 0.000 -0.460*** SOPHIST -0.039 0.578 0.096 0.282 DIVERS -0.039 0.578 0.096 0.282 LAB_REL				() -	0.000				C0-	
SOPHIST -0.039 0.578 0.096 0.282 LAB_JEL LAB_JEL LAB_JEL v*DIVERS 0.091 0.091 v*DIVERS 0.094 0.282 0.091 v*LAB_JEL *LAB_JEL *LAB_JEL *LAB_JEL *LAB_JEL *LAB_JEL *LAB_JEL *1.094* 0.021 0.011** 0.031 0.011** *1.09*** 0.016 0.021 0.011** 0.031 0.011** *1.18*** 0.016 0.024 0.011**					0.387		0.104			
DIVERS DIVERS IAB_REL (AB_REL (ASOPHIST V*DIVERS V*DIVERS V*DIVERS T= 0.094** 0.021 MN 0.0934** 0.021 MN 0.011** 0.031 0.011** 0.031 0.011** 0.031 0.011** 0.011** SER (0.01** 0.016 0.0347** 0.024 0.011** 0.031 0.047** 0.024 0.011** 0.031 0.047** 0.024 0.011** 0.031 0.047** 0.024 0.011** 0.031 0.047** 0.024 0.011** 0.031 0.047** 0.024 0.011** 0.034 0.047** 0.024 0.044** 0.044** 0.044 0.044** 0.044 0.044** 0.044** 0.044 0.044** 0.044 0.044** 0.044** 0.044 0.044** 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044 0.044** 0.044** 0.044 0.044** 0.044** 0.044** 0.044 0.044*** 0.044** 0.044*** 0.044*** 0.044*** 0.044*** 0.044*** 0.044*** 0.044*** 0.044**********					0.387		0.104			
LAB_REL V*DVPRS V*DIVERS **OPHIST **OPHIST **OPHIST **OPHIST **LAB_REL **LAB_REL **LAB_REL **LAB_REL **OPHIST **OP					0.387		0.104			
V*SOPHIST V*DIVERS V*LAB_REL *SOPHIST *SOPHIST *DIVERS *LAB_REL *DIVERS *LAB_REL MN -0.934** 0.021 NN -0.011** 0.011** 0.031 NN NO -0.011** 0.031 -0.011** 0.018 SS					0.387		0.104			
V*DIVERS V*LAB_REL *SOPHIST *SOPHIST *DIVERS *LAB_REL *LAB_REL *LAB_REL 0.934** 0.021 WN VO -0.011** 0.029 -0.011** 0.031 -0.011** 0.018 *0.008 -0.118*** 0.018 SS					0.387		0.104			
V*LAB_REL **SOPHIST **DVERS *DVERS *LAB_REL *LAB_REL *LAB_REL *LAB_REL *LAB_REL *0.934** 0.021 *0.001*** 0.031 *0.011*** 0.011 *0.001*** 0.011				-0.106	0.387		0.104			
*SOPHIST *DIVERS *LAB_REL *LAB_REL -0.934** 0.021 WN -0.934** 0.029 -0.011** 0.031 -0.011** 0.031 -0.011** 0.031 -0.011** 0.031 -0.011** 0.031 ST -0.011** 0.034 -0.011** 0.024 -0.011** 0.024							0.104			
*DIVERS *LAB_REI. *LAB_REI. 0.934** 0.021 WN VO -0.011** 0.029 -0.011** 0.031 -0.011** 0.011** SS -0.011** 0.031 -0.011** -0										
*LAB_REL 101 -0.934** -0.934** -0.02 WN -0.011** 0.02 -0.011** 0.03 -0.011** -2.848** 0.016 -0.109*** 0.008 -0.118*** RS RS 0.07** 0.0										
mathematical         -0.934**         0.021           VN         -0.934**         0.021           WN         -0.011**         0.031           NQ         -0.011**         0.031           IST         -2.848**         0.016           SS         -0.011**         0.024           OC         -0.011**         0.024										
na         -0.934**         0.021           WN         -0.934**         0.021           WN         -0.011**         0.031           NQ         -0.011**         0.031           IST         -2.848**         0.016           -0.109***         0.028           O.347**         0.024										
-0.934**         0.021           WN         -0.934**         0.021           N_Q         -0.011**         0.031         -0.011**           N_Q         -0.011**         0.034         -0.011**           IST         -2.848**         0.016         -0.109***         0.028           AND         -0.016         -0.016**         -0.018***         -0.018***           AND         -2.848**         0.016         -0.018***         -0.018***										
0 -0.011** 0.029 -0.011** 0.031 -0.011** -2.848** 0.016 -0.109*** 0.008 -0.118*** 0.347** 0.024									0.012	
-0.011**         0.029         -0.011**         0.031         -0.011**           -2.848**         0.016         -0.109***         0.008         -0.118***           0.310         0.347**         0.024         -0.118***								0.005**	0.025	
-2.848** 0.016 -0.109*** 0.008 -0.118*** 0.347** 0.024	.011** 0.033	-0.011** 0.038	-0.011** 0.039	39 -0.011**	0.038	-0.011**	0.037		Ŷ	-0.011** 0.037
0.347**	18*** 0.005	-0.121*** 0.004	-0.143*** 0.002	-0.120***	0.004	-0.121***	0.004 -0	-0.187***	0.000 -0.1	-0.119*** 0.004
0 000**										
776.0										
SIZE*DIVERS -0.143** 0.031										
FORJV*DIVERS			$0.206^{**}$ $0.036$	36						
PROV*DIVERS								-0.125**	0.044	
0.164 0.141 0.138										
χ <sup>2</sup> Model 126.410*** 0.000 139.620*** 0.000 124.440*** 0	40*** 0.000	128.600*** 0.000	132.410*** 0.000	00 128.490***	0.000	129.650***	0.000 13	134.61***	0.000 126.2	126.220*** 0.000
χ2 Prop. Assumption 3.920 0.561 5.290 0.381 5.150 0	5.150 0.642	8.360 0.302	6.780 0.342	42 6.510	0.481	4.840	0.679	4.990	0.417	5.460 0.604
Negative Pred. Prob 162 16 0	0	0	8	0		0		72		0
				-						>

TABLE 9. Extended PPO Estimation: Interaction Variable with TOBIN\_Q as Profitability Proxy

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The TOBIN\_Q gamma coefficient is negative: 0.011 and statistically significant in Model 1. It means that the higher TOBIN\_Q, the higher the probability of using another type of financing (in the "other type of financing" odds regression). The gamma coefficients of Business Sophistication are all negative in the range of -0.119 to -0.105 (and statistically significant), which means the odds of using other type of financing is greater the higher Business Sophistication (in other type of financing odds regression).

We extend our baseline model by including categoric variables: City Category, Ownership (Foreign-Joint Venture versus Domestic), Province Category, and Economic Sector Category. We first estimate using Sales Growth as a profitability proxy; Table 6 presents the results. Of the four additional categoric variables, only Ownership and Province Category have statistically significant coefficients. Interestingly, we find a large negative magnitude effect of foreign-Joint Venture dummy ownership (FORJV). The coefficient is -0.855 and highly significant (at the 1% level). This finding shows a strong tendency among foreign-JV firms for using retained earnings compared with other financing types. This finding is similar to Li et al. (2009), Margaritis and Psillaki (2010), and Gurunlu and Gursoy (2010). It could be that foreign-joint venture entities have more private information, or they have limited need of funds due to financing facilities provided by the parent company (or their foreign partner). Other studies produce different results, indicating that foreign firms tend to be more open to outsiders (Phung & Ley 2013; Quartey et al. 2017).

The coefficient of Province Category is also negative (-0.365) and significant (at the 5% level). This result offers evidence that firms located in Java and Sumatra are more conservative in terms of financing. They prefer using retained earnings to outside financing and we suspect that it might be cultural related factors. Categoric variables: City and Economic Sector are not significant. We can see also that PPO regression on City category suffers from proportional odds assumption violation.

We obtain a qualitatively similar finding when we change the profitability proxy from Sales Growth to TOBIN\_Q. From four additional categoric variables, again, only Ownership and Province Category coefficients are statistically significant. Here we find the coefficients to be -0.855 and -0.387 for Foreign-Joint Venture and Province Category, respectively.

Finally, we extend the analysis further by incorporating interaction variables. We are interested in possible interaction of firm size, ownership, and province category with our variables of interest: Business Sophistication, Revenue Diversification, and

Coefficient	Ordere	d Logit	Ordere	d Probit	Generali	zed Logit	Generaliz	zed Probit	P	PO
	Coef.	p val	Coef.	p val	Coef.	p val	Coef.	p val	Coef.	p val
Beta										
SOPHIST	0.145***	0.001	0.082***	0.001					0.170***	0.000
DIVERS	0.242***	0.000	0.145***	0.000					0.245***	0.000
LAB_REL	-0.251***	0.000	-0.150***	0.000					-0.253***	0.000
Eq1										
SOPHIST					0.170***	0.000	0.104***	0.000		
DIVERS					0.250***	0.000	0.147***	0.000		
LAB_REL					-0.258***	0.000	-0.154***	0.000		
Eq2										
SOPHIST					0.055	0.290	0.034	0.270		
DIVERS					0.244***	0.000	0.141***	0.000		
LAB_REL					-0.237***	0.000	-0.140***	0.000		
Gamma										
SOPHIST									-0.115***	0.004
Pseudo R2	0.063		0.062		0.072				0.072	
χ2 Model	73.130***	0.000	73.320***	0.000	78.560***	0.000	82.030***	0.000	78.480***	0.000
χ2 Prop. Assumption									0.480	0.788
Negative Pred. Prob									0	

TABLE 10.	Robustness	Check:	Limited	Model
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*Note:* This table reports the results of several regressions methods of FIN\_CHOICE only on variables of interest: SOPHIST, DIVERS, and LAB\_REL. Regression methods used are ordered logit, ordered probit, generalized logit, generalized probit, and PPO. The results are complemented with tests on parallel assumption (Wald test) and specification test: in sample cases of negative predicted probability. \*, \*\*, and \*\*\* indicate significance at the 10%, 5%, and 1% levels, respectively.

COETHCIENT	Model 29	6	Model	lel 30	Model 31	1	Model 32	5	Model 33	33	Model 34	
,	Coef. P	P_val	Coef.	P_val	Coef. P_	P_val	Coef. P	P_val	Coef. P	P_val	Coef. P_	P_val
Beta												
SIZE	$0.649^{***}$	0.000	$0.600^{**}$	0.000	$0.500^{***}$	0.003	$0.638^{***}$	0.000	$0.585^{***}$	0.000	$0.492^{***}$	0.003
PL_OWN	-0.018***	0.000	-0.019***	0.000	-0.019***	0.000	$-0.018^{***}$	0.000	-0.019***	0.000	$-0.018^{***}$	0.000
SALES_G	$0.064^{*}$	0.093	0.056	0.190	0.048	0.244						
TOBIN_Q							$0.007^{**}$	0.049	0.007**	0.043	0.008**	0.023
BURDEN	0.050	0.275	0.00	0.847	0.017	0.715	0.053	0.238	0.008	0.864	0.014	0.756
YEAR_OPS	0.002	0.845	-0.002	0.854	-0.003	0.773	0.002	0.838	-0.002	0.829	-0.003	0.745
SOPHIST			$0.130^{**}$	0.023	0.098*	0.089			$0.139^{**}$	0.014	0.108*5	0.061
DIVERS	0.206***	0.000			$0.188^{***}$	0.000	$0.207^{***}$	0.000			$0.189^{***}$	0.000
LAB_REL	-0.247***	0.000	-0.241***	0.000			-0.241***	0.000	-0.235***	0.000		
Gamma												
TOBIN_Q							$-0.010^{**}$	0.048	$-0.010^{**}$	0.040	-0.011**	0.046
BURDEN	-0.09**	0.018					$-0.102^{***}$	0.010	$-0.116^{***}$	0.005	-0.114***	0.005
SOPHIST			-0.102**	0.014	-0.101**	0.014						
P seudo R2	0.129		0.118		0.111		0.134		0.124		0.119	
χ2 Model	$114.490^{***}$	0.000	$115.560^{***}$	0.000	$105.990^{***}$	0.000	$116.600^{***}$	0.000	$116.590^{***}$	0.000	$110.090^{***}$	0.000
$\chi^2$ Prop. Assumption	4.020	0.674	8.200	0.224	7.860	0.248	2.090	0.836	4.790	0.442	4.870	0.432
Negative Pred. Prob	0		0		0		0		0		0	

TABLE 11. Robustness Check Baseline Model; Dependent Variable: Financing Choice

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Labor Relationship. Because of limitations in degrees of freedom (especially at the categorical level), we estimate only a partial interaction effect (subsequentially included). There are 18 interaction coefficients estimated from each profitability proxy: Sales Growth and TOBIN\_Q.

Table 8 and Table 9 present the result of extended model, in which we included the interaction variables for each profitability proxy. From 18 coefficients of interaction terms, we find only three that are statistically significant and of acceptable specification. The coefficients are FORJV\*SOPHIST (Model 13); coefficient = -0.154 (significant at the 1% level), FORJV\*SOPHIST (Model 23); coefficient = -0.154(significant at the 1% level) and PROV\*SOPHIST (Model 26); coefficient = -0.067 (significant at the 10% level). Other interaction terms are either not statistically significant, have negative probability in sample cases, or both. Based on these findings, qualitatively we conclude that the interaction terms might not play an important role in determining financing choice.

#### ROBUSTNESS CHECK

We conducted two types of robustness checks, aiming to verify the statistical importance of our variable of interest. The first is by regressing Financing Choice to our variables of interest only, called a limited model. Here we employ five estimation techniques: ordered logit, ordered probit, generalized logit, generalized probit, and PPO. The second check is by sequentially inserting our variables of interest to the regression. No algebraic sign or substantial numerical changes were considered as a support of robustness to our findings. We conduct our robustness check only to the baseline regression (Table 5).

Table 10 presents the result of limited model estimation. Here we can see that quantitively, none our variables of interest deviate from the baseline regressions, either in algebraic sign or numerical size. We find a similar qualitative conclusion when performing the second robustness check (see Table 11 below).

#### CONCLUSION

In this study, we estimate the relationship of financing choice with various regressors. Specifically, we want to see how our variables of interest (Business Sophistication, Revenue Diversification, and Labor Relationship) affect Financing Choice. We also include variables from established theories, notably TOT and POT: Firm Size, Percentage of Property Owned by the Firm, Tax Burden, Profitability and Probability of Bankruptcy. We then go further and include additional categoric variables: City, Ownership and Province, as well as some interaction terms. As a straightforward application of financing structure theories, we employ ordinal response logistic regression. Upon testing and reviewing variables and data, we find that a variant of generalized logistic regression—partial proportional odds regression, introduced by Williams (2016)—is preferred over standard ordered logistic jekoregression

We find the following important insights from estimation. First, business sophistication is positively correlated with financing choice. The better a firm's business sophistication, the more willing the firm will be to accept financing from outsiders. Second, revenue diversification is positively associated with financing choice. On average, a more diversified firm tends to prefer external financing. Third, quality of labor relationship has negative effect on external financing. A better labor relationship corresponds to a greater preference for internal financing. Fourth, findings in support of tradeoff theory are the positive and significant coefficients of SIZE and TOBIN Q. On the other hand, the negative and significant coefficient of PL OWN supports POT. Fifth, foreign ownership and province location both have a negative influence on financing choice. Foreign firms and firms located in Java and Sumatra prefer internal financing. Lastly, there seems to be a weak effect from interaction between SIZE, FORJV, and PROV with variables of interest to financing choice.

The above key insights show that a better business sophistication and greater revenue diversification tend to make firms to be open to outside financing. Outside financing in turn would bring better corporate governance as a disciplining device to management (Brealey et al, 2017). Better corporate governance will improve transparency and credit information spur innovation and eventually economic growth itself (Allen & Gale 1999). Therefore, regulator should play an active role in encouraging adoption of modern business practices by firms. Especially due to current advancement; many technologies are cheap to adopt.

A concern should be in place since we find a negative effect of better labor relationship on external funding. It perhaps signaling an entrenched attitude of employee that might potentially lead for unfavorable outcome like non optimal financial performance (Guedri & Hollandts 2008; O'Boyle et al. 2016). On the other hand, this finding could also be interpreted as heightened ownership of employee which can also be beneficial (Matsa 2018). Therefore, this issue perhaps should be approached cautiously by practitioner and regulator alike. The role of labor relationship to simultaneously financing and performance is open to further study.

Our study provides evidence of the role of business sophistication, revenue diversification and quality of labor to financial choice of the firms. Since World Bank Enterprise Survey also provides database for 40 other countries and some of them are of panel structure; therefore, it could be avenues for future research. We also recommend using the econometric method: PPO as it has relaxed and more realistic assumption to use.

#### NOTES

- 1 There are two types of capital financing structure (in percentage of capital expense) in the dataset: (a) working capital and (b) capital expenditure. Further investigation of the dataset shows, however, that using capital expenditure would not yield reliable estimates because of the small degrees of freedom (only 84 valid responses). Therefore, we rely only on the working capital structure and hence use the term "financing structure" rather than capital structure.
- 2 In defining financing priority, we used working capital only because of adequacy of sample. We grouped the percentage of financing by three categories: retained earnings, loan by banks and non-bank financial institutions (NBFIs), and other sources. Then we assigned an ordinal number to indicate the most-used type of financing: 1 if the financing is obtained mostly from retained earnings, 2 if from loans provided by banks and/or NBFIs, and 3 if from other sources.
- 3 We modify the definition of variables from the original (WB Survey) to increase our degrees of freedom. CITY is simplified to three categories (from four in World Bank) by merging the category of city population of 50,000 into the 250,000-population category. PROV is simplified into two categories (Java or Sumatra) from the original 10. Java and Sumatra are Indonesia's most populated islands and are growth centers within the nation. SECTOR is simplified into two categories: sectors that we perceive as capital intensive (SECTOR=1) versus non-capital intensive (SECTOR=0). Originally this variable had nine categories.
- 4 Unfortunately, after performing estimation and testing, it turned out that TAXINSPECT is no longer viable. Every PPO estimation that includes this variable suffers from negative predicted probability in sample cases. Therefore, we conclude that we should remove this variable.

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