

Capital Structure and Financial Distress Risk: Evidence from China

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Abstract

Some of Chinese companies exhibit the risk of financial distress due to high leverage, leading to a series of social problems. This study seeks to investigate the effect of capital structure on the risk of financial distress. This study took a modified Z-score model as the measurement of the financial distress, while the independent variable capital structure included, debt to total assets ratio, debt to equity ratio, long-term debt to total assets ratio. The sample includes 18,630 firm-years from China's Shanghai and Shenzhen A-share listed companies between 2012 and 2021. To test the hypothesis of multivariate regression analysis using panel data. The pooled ordinary least squares (POLS), fixed effect (FE), random effect (RE) methods of regression were employed in carrying out this analysis. The results show a positive effect of capital structure on financial distress risk among Chinese listed firms supported by trade-off theory. Thus, policymakers should pay attention to leverage to prevent the risk of financial distress caused by over-leverage.

Keywords: Financial Distress, Capital Structure, Leverage, Modified-Z

Introduction

Financial distress, a condition where firms struggle to generate sufficient income to meet their obligations, has become a significant issue (Antunes et al., 2023). For decades, the issue of financial distress risk has been a significant concern in corporate finance. The global economic turmoil and massive economic slowdown have led to a more complex economic environment, increasing the financial distress risk. China, a crucial emerging market, is now significantly influencing the international investment market (Zhao et al., 2023). Financial distress has escalated significantly, necessitating measures to mitigate this risk (Balasubramanian et al., 2019). As the second-largest stock market in the world, the Chinese security market has certain peculiarities that make it particularly attractive for academic research (Leippold et al., 2021). Over the past three decades, China's A-share listed companies have exceeded 5,000

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with total assets of more than 38 trillion yuan and total market value of more than 85 trillion yuan, accounting for 70 to 80 percent of GDP. China's stock market has provided more than 16 trillion yuan of financing for more than 5,000 listed companies, greatly supporting the development of listed companies. The rapid growth of China's market economy has led to an increase in corporate debt and default risk among Chinese corporations in the past decade (Jiang & Jones, 2018).

In 2020, a series of notable default events occurred among Chinese state-owned enterprises, highlighting the importance of studying corporate financial distress (Zhang et al., 2022). Understanding financial distress is crucial for investors, policymakers, and business leaders as it can trigger economic downfall, as seen in the 2008 financial crisis (Meng et al., 2024).

China is grappling with the impact of high leverage and prioritizing preventing significant financial risks in recent decades (Dong et al., 2021; Wang et al., 2022). One of the objectives of China's supply-side structural reform is to decrease the leverage of non-financial firms (Wang et al., 2022). Debt within a certain limit can stimulate economic growth while exceeding this limit can significantly harm the economy (Shen et al., 2018). In the long period before 2008, the leverage level of China's real economy sector had been stable at around 150%, but this turned a corner after the financial crisis and showed a rapid upward trend, reaching 254% by the end of 2018, higher than the overall level of emerging market, which contains a large systemic financial risk hidden danger. From the international standards perspective, China's leverage ratio far exceeds the alarm value, and systemic financial risks cannot be ignored.

Financial distress is a continuous and dynamic process (Zhou et al., 2022), often starting with a shortage of funds, which leads to liquidity risks. Due to the lack of funds, enterprises will default on their debts, trigger a deep financial crisis, and finally lead to business failure. Financial distress is a significant topic in the financial sector, serving as a crucial indicator for users interested in understanding company performance (Pernamasari et al., 2019). Companies that cannot manage their risk well will adversely impact their financial performance, which may cause financial distress. Every company does not want to experience financial distress, so the risk must be managed well to avoid financial distress (Luthfiyanti & Dahlia, 2020). Enterprises in financial distress are usually unable to pay their debts on time, which affects the normal operation and cash inflow of creditors and even causes creditors' financial distress and affects the security of creditors' rights. As for the loan bank, one of the creditors, financial distress will lead to a high non-performing rate of the bank, which may lead to the loan risk of the banking system. If an enterprise is in financial distress, it will take longer to settle the payment for goods with the supplier. In addition, financial distress will lead to a decrease in the purchase volume and affect the supplier's profit. The financial distress of enterprises can significantly impact investors' confidence in the financial market, trigger a series of chain reactions, and cause investors to re-judge the value of corporate assets, which will cause sharp fluctuations in stock prices in the capital market. If the financial distress cannot be solved in time, it may lead to the liquidation of the enterprise (Cui & Lin, 2023). Financial distress can be temporary and not so severe, but if left untreated, it can develop into problems that are not solvable (Hanafi & Halim, 2016). Poor management, poor operational performance, and high leverage are the main internal sources of financial distress (Outecheva, 2007).

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Financial distress means an enterprise is in a state of continuous loss, insolvency, debt default, lack of liquidity, etc. Three factors cause financial distress: allocation resources, capital structure, and governance (Lizal, 2002). Financial distress refers to the decline stage of the financial conditions that occur before bankruptcy or liquidation (Platt & Platt, 2002; Susanti,2020). Companies frequently experience financial distress before bankruptcy (Zhou et al., 2022). The study of financial distress originates from the study of financial risk, financial crisis, financial deterioration, insolvency, business failure, bankruptcy, etc. Financial distress occurs before the financial crisis, and debt default occurs with the deepening of the financial crisis. If the debt crisis cannot be eliminated in time, the risk of bankruptcy will be faced, and the bankruptcy of enterprises can be confirmed as a business failure. Therefore, the research on enterprise bankruptcy risk, financial deterioration, debt default, and other issues can be classified as financial distress research (Zhang & Wang, 2020).

The study of financial distress risk has a long history dating back to Beaver (1966). Early scholars viewed financial distress as a straightforward financial issue and established financial distress models using financial indicators, such as Altman (1968), Altman et al., (1977), Beaver (1966), Ohlson (1980), etc. Although the correlation between capital structure and the likelihood of financial distress has been studied, research in China is limited. It is against this background that an investigation of the effect of leverage on the financial distress of Chinese listed firms is necessary. Taking into consideration the above issues, this study focuses on analyzing the impact of the company's capital structure on the firm's financial distress risk. This study attempts to provide valuable information on the variables influencing a company's financial distress risk.

Literature Review and Hypotheses Development

Trade-off Theory

The trade-off theory, propounded by Myers (1977), arguing that while debt offers tax-shield cash flows, the benefits are not indefinite. Debt, in addition to agency costs, also increases the likelihood of financial distress because of the potential for default on debt repayment (Muigai, 2016). Myers (1977), demonstrates that debt can decrease a firm's present market value by reducing its incentive to make good future investments, theorizing that increasing a firm's debt leads to increased financial risk and decreased motivation from equity-holders to provide more capital. The trade-off theory suggests that moderate gearing levels are recommended (Muigai, 2016), a firm should not attempt to borrow as much as possible (Myers 1977).

More and more scholars have found that with the increase of corporate debt scale, the probability of corporate debt default may also increase gradually, which leads to the rise of financing costs. The debt default will eventually force the company into financial distress or even bankruptcy. The trade-off theory holds that management weighs the possible cost of bankruptcy against the size of the benefit of the debt tax shield before making capital structure decisions. The trade-off theory shows that a company with higher debt must bear interest and risk bankruptcy if it cannot pay the debt (Pradana & Imelda, 2023).

This theory is relevant to the study as it introduces the concept of financial distress costs, demonstrating how leverage can positively increase the risk by increasing borrowing. The

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trade-off theory suggests that leverage increases the likelihood of financial distress and bankruptcy costs (Kalash, 2023).

Capital Structure and Financial Distress

Capital structure refers to the combination of various financing methods used by a company to finance its operations (Muigai, 2016; Abor, 2005). Capital structure can be measured by various factors and key determinants such as total debt ratio, debt to equity ratio, long-term leverage ratio, and so on (Ahmed et al., 2024). Researchers have used various leverage ratios, including total liabilities to total assets, EBIT to interest expenses, and total equity to total liabilities, to predict financial distress (Waqas & Md-Rus, 2018). The majority of studies show that an increase in leverage is linked to a higher hazard level (Tinoco & Wilson, 2013; Ugur et al., 2022).

Companies with higher leverage are at a higher likelihood of financial distress. Based on trade-off theory, the risk of failure increases monotonically with the increase in leverage (Fitzpatrick & Ogden, 2011), the debt adjustment relationship with Z-score is found to be significantly negative, debt increases the risk of financial distress, leverage is calculated by dividing total debt by total assets (Abdullah et al., 2023). The use of debt often leads to financial distress for non-financial companies (Muigai, 2016).

Kalash (2023), reveals that a firm's higher debt ratio decreases performance measures, particularly for those with high risk. This decrease is exacerbated by distress risk, supporting the trade-off theory that firm performance decreases with leverage. Companies with a high debt utilization rate face significant financial risks, particularly when they cannot pay their obligations on time, increasing the likelihood of financial distress (Karugu et al., 2018). Empirical studies by Kisman & Krisandi (2019), Moch et al. (2019), Utami et al. (2021), Yazdanfar & Öhman (2020) also suggest that a firm's dependence on debt significantly impacts financial distress. High-leveraged companies are more likely to default due to persistent financial strain, potentially affecting their production and operation (Dong et al., 2021). The capital structure is significantly influenced by its long-term financing methods and the debt-to-equity ratio in its financing choice (Serghiescu & Văidean, 2014).

Previous studies have examined leverage's impact on financial distress and financial performance, but many focus on its direct effect and report inconsistent results, including negative, positive, or no significant relations. Leverage decisions are a widely discussed topic in corporate finance (Abdullah et al., 2023). The unclear empirical relationship between leverage and financial distress complicates the debate among finance scholars (Muigai, 2016). Given this discussion, the hypothesis is on the effect of capital structure on financial distress risk.

Hypothesis 1 (H1): The total debt-to-total assets ratio (DTA) positively impacts the financial distress risk.

Hypothesis 2 (H2): The total debt-to-equity ratio (TDE) positively impacts the financial distress risk.

Hypothesis 3 (H3): The long-term debt-to-total assets ratio (LTDTA) positively impacts the financial distress risk.

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Data and Methodology

Sample and Data Collection

The study analyzed A-share listed companies on the Shanghai and Shenzhen Stock Exchanges from 2012 to 2021. To ensure accuracy, the samples were processed as follows: delisted companies were deleted; financial listed enterprises were excluded as their financial statements were significantly different from those of other industries; and samples with missing data of main variables were removed. This study's financial data were sourced from the China Stock Market and Accounting Research Database (CSMAR). A total of 18,630 samples were included.

Dependent Variable

The dependent variable of the study is the financial distress risk, as determined by modified Z-scores (Graham et al., 1998; Lee et al., 2011; Mackie-Mason, 1990). The original Altman's Z-score is a calculation that uses coefficients and variables of the equation. The Z-Score model by Altman is used to identify companies experiencing financial distress and at risk of bankruptcy, identifying the root cause of their declining performance (Abdullah et al., 2023).

Altman (1968), first used multivariate discriminant analysis to establish a Z-score model to study financial distress. Altman suggests that financial ratios can predict the occurrence of financial distress (Oktasari, 2020). A higher Z-score indicates a firm's financial health, indicating less distress than a lower Z-score. Mackie-Mason (1990) modified the Z-score by excluding the market value of equity and book value of total liabilities to examine a firm's capital structure and identify debt ratio as a separate variable. The modified version is: Modified-Z = 1.2 (Working Capital/Total assets) +1.4 (Retained Earnings/Total assets) + 3.3 (Earnings before interest and taxes/Total assets) + (Sales/Total assets) (Burak Güner et al., 2008; Graham et al., 1998; Koh & Jang, 2009; Lee et al., 2011)

The modified Z-score method was used to eliminate factors that contained similar information to other variables in the Z-score model, specifically total debt information with leverage. The inclusion of the market value of equity and book value of total debt in the model could establish a systematic relationship with other variables, potentially leading to a significant relationship between Z-score and related variables rather than a true relationship (Lee et al., 2011).

Independent Variable

Leverage, a measure of capital structure, is utilized to analyze the dependent variable and can be calculated in various ways (Abdullah et al., 2023). Financial leverage refers to a company's utilization of debt and equity as primary forms of corporate financing. Researchers have used various leverage ratios, including total liabilities to total assets, EBIT to interest expenses, and total equity to total liabilities, to predict financial distress (Waqas & Md-Rus, 2018).

The study utilizes leverage as a measure of capital structure following previous research (Chow et al., 2018; Wang et al., 2023). This study uses three leverage values to represent the capital structure. First, DTA is calculated by the ratio of total debt to total assets (Abdullah et al., 2023). Second, TDE is calculated by the ratio of total debt to equity, which represents the ratio of liabilities to equity (Diyanto, 2020). Third, LTDTA is measured by the ratio of long-term debt to total assets (Al-Taani, 2013; Chandra & Juliawati, 2020).

Control Variables

Five control variables that may affect financial distress are covered in this study. Firm size (Size), calculated as the natural log of total assets, accounts for variations in economies of scale due to resource availability, competition, and so on (Chatterjee et al., 2023a). Darrat et al., (2016), Magee (2013), Oktasari (2020), and Shumway (2001) suggest that larger firms are believed to be less vulnerable to get into financial distress due to their superior resource capabilities compared to smaller firms.

The age of the firms (Age) may have a significant influence on financial distress. Hence, it was introduced as the number of years since the inception of the firm to the observation date (Rao et al., 2007). The Board of Commissioners (BSize) is responsible for managing and representing a company (Kalbuana et al., 2022). This study measured board size based on the number of boards.

Additionally, earlier studies revealed that ROA (Net profits/Total assets) influence negatively on financial distress (Luthfiyanti & Dahlia, 2020). According to Kordestani et al., (2011), the initial stage of bankruptcy occurs when the company's ROA decreases. A high return on assets indicates that a company has effectively utilized its assets to generate profit, these benefits reduce the likelihood of financial instability for companies (Luthfiyanti & Dahlia, 2020).

Furthermore, this analysis uses Tobin's q (TOBIN) as a control variable, which is a market-based method that provides a more accurate measure of performance and growth opportunities. It combines fair market value and total liabilities, is predicted to decrease financial distress risk, as better performance leads to greater stability (Atif & Ali, 2021). Tobin's q measures a firm's performance that exceeds stakeholder expectations. The formula is: market value/total assets.

Empirical Methodology

This study begins by examining whether capital structure significantly affects financial distress risk. Continuous variables are wonorized at the 1st and 99th percentiles to reduce the risk of outliers affecting the results (Chatterjee et al., 2023).

The three methods for estimating panel data regression models are POLS, FE, RE (Zhou et al., 2023). In this study, all the three methods will be used to test the hypothesis.

Model 1 explains the association between DTA and Modified-Z. Model 2 explains the association between TDE and Modified-Z. Model 3 explains the association between LTDTA and Modified-Z. The models are as follows:

FDit = β 0 + β 1DTAit + β 2Sizeit + β 3Ageit + β 4BSizeit + β 5ROAit + β 6TOBINit + ϵ it (Model 1)

FDit = β 0 + β 1TDEit + β 2Sizeit + β 3Ageit + β 4 BSizeit + β 5ROAit + β 6TOBINit + ϵ it (Model 2)

FDit = β 0 + β 1LTDTAit + β 2Sizeit + β 3Ageit + β 4 BSizeit + β 5ROAit + β 6TOBINit + ϵ it (Model 3)

Where:

FD represents a firm's risk of financial distress, measured by Modified Z-score model; DTA represents a capital structure or firm's leverage, measured by total debt to total assets; TDE represents a capital structure or firm's leverage, measured by total debt to equity;

LTDTA represents a capital structure or firm's leverage, measured by long-time debt to total assets;

Size represents a firm's size, measured by the natural log of firm's assets;

Age is firm age computed by the period from the activity start to the current year;

BSize is measured based on the number of boards of commissioners in the company;

ROA is measured by net income divided by total assets, indicates a firm's return on assets.

TOBIN (Tobin's q) is measured by market value/total assets, refer to the ratio of market capitalization, liabilities, preferred equity, and minority interest to total assets.

i = refer to firm-year observations in the sample;

t = financial years 2012-2021;

β0 is a constant; βi represents the regression coefficient; εi is the random error term are known by the Gaussian noises or errors (Habib, 2022).

Empirical Results and Discussion

Descriptive Statistics

Table 1 presents the descriptive statistics. The dependent variable Modified-Z has a maximum value of positive, while its minimum value is negative. This indicates that some of the key financial indicators of some Chinese listed companies are negative. The DTA has an average level of 0.471, suggesting that the leverage of listed Chinese companies is generally at a high level. The standard deviation is 0.206, the maximum value is 0.924, and the minimum is 0.068, indicating that there is a large gap in the level of leverage between different companies. The maximum and minimum values of TDE are 12.08 and 0.073, respectively, and the average is 1.420. The maximum and minimum values of LTDTA are 0.473 and nil, respectively, and the average is 0.100, indicating significant variation in the long-term leverage among the companies.

Table 1

Descriptive statistics

Variable	Obs	Mean	Std. dev.	Min	Max
Modified-Z	18,630	1.161	0.823	-1.816	3.393
DTA	18,630	0.471	0.206	0.068	0.924
TDE	18,630	1.420	1.762	0.073	12.080
LDTDA	18,630	0.100	0.107	0.000	0.473
Size	18,630	22.590	1.337	19.780	26.500
Age	18,630	19.450	5.641	6.000	33.000
BSize	18,630	8.744	1.728	5.000	15.000
ROA	18,630	0.029	0.062	-0.265	0.192
Tobin	18,630	1.959	1.374	0.828	9.206

Correlation Analysis

Table 2 displays the Pearson correlation matrix for variables. It can be observed that leverage (DTA, TDE, LTDTA) have a significant negative impact on Modified-Z, that is the higher the leverage, the greater the likelihood of financial distress, which is consistent with the original hypothesis. Further regression tests should be conducted to delve deeper into this relationship. Furthermore, there is a positive relationship between firm size (Size) and Modified-Z, and also a positive relationship between ROA and Modified-Z, indicating that the more the firm size or ROA, the less likely of financial distress. The variable of firm age (Age)

shows a significant negative correlation with Modified-Z, and also a negative relationship between Tobin's q (TOBIN) and Modified-Z, indicating that an increase in firm size or Tobin's q is not beneficial for reducing the likelihood of financial distress. As for the relationship between board size (BSize) and Modified-Z, there is no clear linear correlation.

Table 2
Pearson Correlation Matrix

reuison C	.orrelation	IVIULIIX							
	Modified -Z	DTA	TDE	LDTDE	Size	Age	BSize	ROA	Tobi n
Modified -Z	1								
DTA	- 0.396** *	1							
TDE	- 0.394** *	0.770** *	1						
LDTDE	- 0.320** *	0.493**	0.341**	1					
Size	0.041** *	0.428** *	0.245** *	0.425** *	1				
Age	- 0.113** *	0.135**	0.114**	0.109** *	0.115**	1			
BSize	-0.011	0.116** *	0.059** *	0.150** *	0.237** *	-0.002	1		
ROA	0.653**	- 0.335** *	- 0.325** *	- 0.151** *	0.074**	- 0.072** *	0.037**	1	
Tobin	- 0.029** *	- 0.243** *	- 0.099** *	- 0.233** *	- 0.459** *	-0.012	- 0.134** *	0.110** *	1

Notes: ***significant at 1% level. **significant at 5% level. *significant at 10% level. Modified-Z = financial distress risk. DTA = total debt-to-total assets ratio. TDE = total debt-to-equity ratio. LTDTA = long-term debts-to-total assets ratio. Size = firm size, the natural logarithm of assets. Age = firm age, computed by the period from the activity start to the current year. BSize = board size, the number of boards of commissioners in the company. ROA = net income divided by total assets. TOBIN (Tobin's q) = market value/total assets

Empirical Tests and Discussion of the Effect of Capital Structure on Financial Distress Risk Table 3 shows the regression results of DTA on financial distress risk using POLS, FE or RE estimations. The total debt-to-total assets ratio (DTA) has a negative and significant impact on Modified-Z at a 1% significance level, with the coefficients of -0.994 (POLS), -1.158 (FE), -1.162 (RE). This suggests that higher DTA is associated with lower levels of Modified-Z, thus confirming hypothesis H1, DTA increases the risk of financial distress.

Table 4 shows the regression results of TDE on financial distress risk using POLS, FE or RE estimations. The total debt-to-equity ratio (TDE) has a negative and significant impact on

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Modified-Z at a 1% significance level, with the coefficients of -0.0963 (POLS), -0.0763 (FE), -0.0801 (RE). All three estimations come to the same trend of conclusion: higher TDE is associated with lower levels of Modified-Z, thus confirming hypothesis H2, TDE increases the risk of financial distress.

Table 5 shows the regression results of LTDTA on financial distress risk using POLS, FE or RE estimations. The LTDTA has a negative and significant impact on Modified-Z at a 1% significance level, with coefficients of -2.126 (POLS), -0.677 (FE), and -0.896 (RE). The results of the three estimations show that higher LTDTA is associated with lower levels of Modified-Z, thus confirming hypothesis H3: LTDTA increases the risk of financial distress.

The empirical findings show that leverage negatively correlates with Modified-Z, and increases the risk of financial distress, supporting trade-off theory.

Regarding the control variables in Table 3, firm size (Size) positively and significantly affects Modified-Z at a 1% significance level, indicating that larger companies are less likely to engage in financial distress (Dirman, 2020; Zeitun & Refai, 2017). ROA also exhibits a positive and significant impact on Modified-Z, signifying that higher ROA reduces the risk of financial distress, which is consistent with the previous findings of Atif & Ali (2021) and Hidayah (2014). Board size and Tobin's q (TOBIN) have a negative and significant effect on Modified-Z.

Table 3
The Effect of DTA on Financial Distress Risk

	POLS	FE	RE
VARIABLES	Modified-Z	Modified-Z	Modified-Z
DTA	-0.994***	-1.158***	-1.162***
	(0.025)	(0.025)	(0.024)
Size	0.0358***	0.111***	0.101***
	(0.004)	(0.006)	(0.005)
Age	-0.007***	0.022**	-0.003
	(0.001)	(0.009)	(0.002)
BSize	-0.017***	-0.007**	-0.009***
	(0.003)	(0.003)	(0.003)
ROA	7.671***	5.567***	5.692***
	(0.077)	(0.050)	(0.050)
Tobin	-0.079***	-0.032***	-0.036***
	(0.004)	(0.003)	(0.003)
Constant	1.027***	-1.030***	-0.422***
	(0.091)	(0.194)	(0.124)
Observations	18,630	18,630	18,630
Number of code	_3,555	1,918	1,918
R-squared	0.488	0.567	.,
Firm FE	NO	YES	YES
Year FE	NO	YES	YES
· -	· · ·	· 	· = -

Notes: ***significant at 1% level. **significant at 5% level. *significant at 10% level.

Table 4
The Effect of TDE on Financial Distress Risk

	POLS	FE	RE
VARIABLES	Modified-Z	Modified-Z	Modified-Z
TDE	-0.096***	-0.076***	-0.080***
	(0.003)	(0.002)	(0.002)
Size	0.005	0.056***	0.046***
	(0.004)	(0.006)	(0.005)
Age	-0.007***	0.025***	-0.006**
	(0.001)	(0.009)	(0.002)
BSize	-0.019***	-0.007**	-0.009***
	(0.003)	(0.003)	(0.003)
ROA	7.913***	5.851***	5.989***
	(0.077)	(0.051)	(0.051)
Tobin	-0.070***	-0.035***	-0.039***
	(0.004)	(0.0031)	(0.003)
Constant	1.383***	-0.291	0.400***
	(0.090)	(0.198)	(0.124)
Observations	18,630	18,630	18,630
Number of code		1,918	1,918
R-squared	0.481	0.543	
Firm FE	NO	YES	YES
Year FE	NO	YES	YES

Table 5
The Effect of LTDTA on Financial Distress Risk

	POLS	FE	RE	
VARIABLES	Modified-Z	Modified-Z	Modified-Z	
LTDTA	-2.126***	-0.677***	-0.896***	
	(0.045)	(0.041)	(0.040)	
Size	0.037***	0.051***	0.045***	
	(0.004)	(0.007)	(0.006)	
Age	-0.007***	0.020**	-0.007***	
	(0.001)	(0.010)	(0.002)	
BSize	-0.012***	-0.007**	-0.009***	
	(0.003)	(0.003)	(0.003)	
ROA	8.227***	6.242***	6.413***	
	(0.071)	(0.050)	(0.050)	
Tobin	-0.083***	-0.040***	-0.045***	
	(0.004)	(0.003)	(0.003)	
Constant	0.691***	-0.163	0.420***	
	(0.090)	(0.203)	(0.126)	
Observations	18,630	18,630	18,630	
		1,918	1,918	
R-squared	0.506	0.520		
Firm FE	NO	YES	YES	
Year FE	NO	YES	YES	

Robustness Test

This study uses modified-variable measurement of the dependent variable to assess the robustness of the empirical analysis. The dependent variable, Modified-Z, is replaced by the Merton DD model to measure the risk of financial distress.

The Merton DD model, also known as the Distance to Default (DD) model, is an option pricing theory developed by Black & Scholes (1973) and Merton (1974) for determining financial distress risk. The model focuses on how a market-based approach predicts firms' default, where default occurs when asset volatilities cause asset market values to decline below debt value, highlighting the importance of asset volatility. The DD model is a market-based prediction model that incorporates volatility in the market values of firms' assets to predict corporate financial distress (Dinh et al., 2021). Merton DD models are widely used to predict potential credit defaults in firms (Dinh et al., 2021). The Merton DD model represents the standard deviation of a firm's value from its default point. The firm's lower values indicate a closer proximity to the default point, indicating a higher likelihood of default. The model is also explained by Dinh et al. (2021), Kang et al. (2022).

Table 6 employs an FE estimation and shows that leverage (DTA, TDE, LTDTA) negatively correlates with Merton DD. This indicates that capital structure exacerbates the risk of financial distress, thus validating hypotheses H1, H2, and H3.

Table 6
Robustness Test

	Model 1(FE)	Model 2(FE)	Model 3(FE)
VARIABLES	Merton DD	Merton DD	Merton DD
DTA	-6.431***		
	(0.324)		
TDE		-0.256***	
		(0.029)	
LTDTA			-3.093***
			(0.508)
Size	0.0150	-0.356***	-0.344***
	(0.081)	(0.079)	(0.080)
Age	-0.123	-0.110	-0.128
	(0.117)	(0.118)	(0.118)
BSize	0.104***	0.108***	0.105***
	(0.035)	(0.035)	(0.035)
ROA	-1.457**	1.246*	2.408***
	(0.641)	(0.637)	(0.614)
Tobin	0.393***	0.362***	0.346***
	(0.039)	(0.039)	(0.039)
Constant	13.400***	18.670***	18.610***
	(2.479)	(2.485)	(2.498)
Observations	18,630	18,630	18,630
Number of code	1,918	1,918	1,918
R-squared	0.221	0.207	0.205
Firm FE	YES	YES	YES
Year FE	YES	YES	YES

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Conclusion

High leverage is present in a huge number of Chinese listed companies, which can have a considerable impact on financial distress. This study tests how capital structure affects financial distress in China. The effect of the leverage of Chinese-listed firms on financial distress is analyzed in this empirical study. Additionally, to enrich the literature beyond the narrow perspective, this study uses three leverage measures on the association between capital structure and financial distress risk. The study's analyses reveal that trade-off theory arguments effectively explain the significant influence of capital structure on financial distress risk.

This study has two primary contributions. Firstly, in this study, three variables are used to measure the capital structure, and three estimations are used for regression analysis, and the results are completely consistent. This study offers evidence on the impact of capital structure on financial distress risk, revealing that high leverage is highly correlated with financial distress, aligning with the trade-off theory. The number of Chinese enterprises facing financial distress is increasing rapidly, necessitating improving their risk-resistance capabilities. Financial distress is a crucial indicator of potential bankruptcy or default, and its prediction can provide early warning of potential losses to investors and creditors (Zhou et al., 2022). Recent corporate scandals and significant failures have highlighted the need for extensive research on financial distress, particularly the accelerated impairment of value in the final stages before default when distress risk is highest (Outecheva, 2007). Historical evidence indicates that financial distress is not a quick issue but rather a long incubation period, making the study of it crucial. This study suggests that firms must pay attention to leverage; if a company's leverage is consistently increasing, it is a sign that it may be at risk of financial distress. Secondly, this study uses the LTDTA as one of the variables; this study suggests managers focus on the internal structure of liabilities, with particular attention to the impact of long-term liabilities on financial distress. At the same time, this study also reminds investors, creditors, and other stakeholders to pay attention to the total leverage of enterprises and the internal debt structure, especially long-term debt.

The study provides crucial insights into the role of capital structure in corporate financial distress, laying the groundwork for future research. The main motivation of this study is to remind managers and stakeholders to pay attention to the company's capital structure, predict potential financial distress risks early, and reduce losses. This study emphasizes the importance of maintaining the optimal capital structure to protect firms from financial distress, thereby boosting shareholder wealth and investor confidence in the Chinese capital market. The findings also aid regulators and policymakers in creating mechanisms to monitor and evaluate corporate financing continuously.

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Vol. 14, No. 4, 2024, E-ISSN: 2225-8329 © 2023

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