

# Default Risk, Shareholder Advantage, and Stock Returns

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## Motivating Questions

1. **Q:** How should **default risk** affect **equity returns**?

**A:** With a **proper** measure of default risk,

$\uparrow$  **default risk**  $\Rightarrow$   $\uparrow$  **expected return**

2. **Q:** What is the **empirical evidence** on this relationship?

**A:** Pervasive evidence:

$\uparrow$  **default probability**  $\nRightarrow$   $\uparrow$  **expected returns**

3. **Q:** Is this an **arbitrage opportunity**? Or is it attributable to some overlooked **economic mechanisms**?

## Objective

**Understand** the link: **default probability**  $\leftrightarrow$  **equity returns**. **Three steps:**

1. Revisit empirical evidence using a unique dataset from Moody's KMV (**EDF<sup>TM</sup>**) as a default probability indicator
2. Use a **contingent claim valuation model** that allows for **shareholders' advantage** in distressed firms
  - ▶ **shareholder advantage**: ability of shareholders to **extract rents** in renegotiation with other claim-holders in the event of financial distress (e.g., APR violations).
3. **Empirically test** cross-sectional predictions of the model

## Preview of Results

1. Using Moody's KMV **EDF** measure, we **confirm**:

**High default probability**  $\nRightarrow$  **High future returns**

2. Using the valuation **model** with shareholder advantage, we **show**:

- ▶ **Recovery** for shareholders upon default **alters equity risk**
- ▶ **Empirical predictions** (consistent with **risk/return trade-off**):

**Shareholder advantage** ↑

1. **Returns vs. EDF** ↘ or ↻

2. **Returns given EDF** ↓

3. Using **proxies** for shareholder advantage, we **confirm** the predictions

## Previous Evidence

### ▶ Dichev (1998)

- High Olsen's 'O' or low Altman's 'Z' → **low** future returns

### ▶ Griffin and Lemmon (2002)

- Low B/M and high 'O' → **low** future returns

### ▶ Campbell, Hilscher and Szilagyi (2005)

- Use a hazard model to construct default probability
- Find that high default probability → **low** future returns

### ▶ Vassalou and Xing (2004)

- Construct an EDF-mimicking measure for default probability
- Conclude that default risk is **positively** priced

## Data

### ▶ **Moody's KMV EDF: Expected Default Frequency™**

- Inspired by the Black-Scholes-Merton Model (Kealhofer (2003))
- Time period: January 1969–December 2003
- Number of observations: 1,430,713 firm-month
- No financial firms

### ▶ **CRSP**

- Equity Returns

### ▶ **COMPUSTAT**

- Accounting variables

## Evidence from Moody's KMV EDF (Table 2)

	Low EDF			High EDF			
	1	2	3	4	5	High-Low	t-value
<b>Raw returns</b>							
<b>EW</b>	1.14	1.23	1.26	1.25	1.65	0.51	<b>1.50</b>
<b>VW</b>	0.96	1.11	1.08	0.95	0.82	-0.14	<b>-0.38</b>
<b>DGTW-adjusted returns</b>							
<b>EW</b>	0.03	0.08	0.08	0.09	0.74	0.72	<b>2.95</b>
<b>VW</b>	-0.01	0.07	-0.02	-0.18	-0.23	-0.22	<b>-0.84</b>

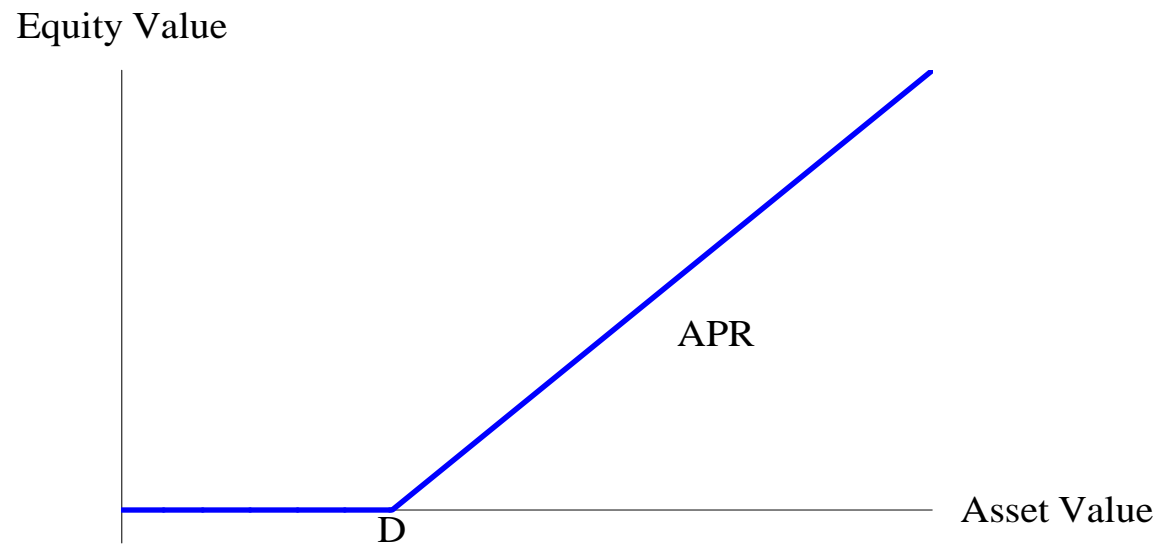
- ▶  $EW \neq VW$  even **after** DGTW adjustment!
- ▶ Possible **cross-sectional variation** in the relation **Returns vs. EDF**

## Shareholder Advantage in Default: Basic mechanism

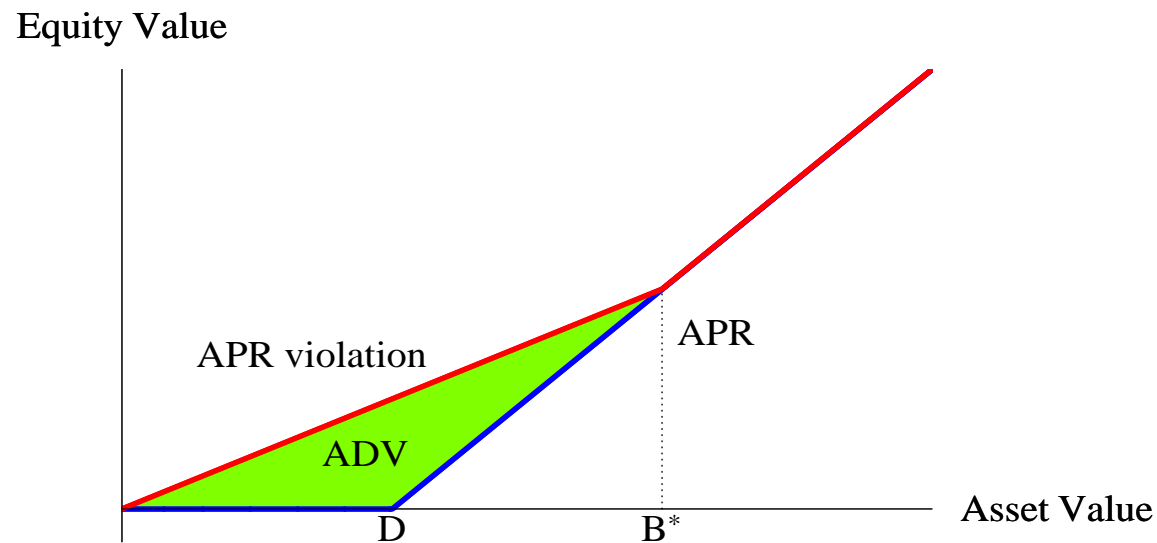
- ▶ **Equity = Call Option** on firm's asset value
- ▶ **Default  $\neq$  liquidation: Chapter 11 filings and APR deviations**
- ▶ Black-Merton-Scholes **contingent claim framework** with
  - **Endogenous default**
  - **Non-zero expected payoff** to shareholder upon default
- ▶ Shareholder advantage captures different **cash-flow realizations**.
  - **NOT a new pricing factor!**

## Equity Payoff **without** Shareholder Advantage

$$E_T = \max[V_T - D, 0]$$



## Equity Payoff **with** Shareholder Advantage



- ▶ **Equity payoff**  $\propto$  **assets** if APR violations in default

## Research Design

1. Start from existing valuation models of **strategic debt service**  
Anderson and Sundaresan (1996), Mella-Barral and Perraudin (1997), Fan and Sundaresan (2000), François and Morellec (2004), Acharyam, Huang, Subrahmanyam and Sundaram (2004)
2. Derive **equity returns** and **default probabilities** within the model
3. **Simulate** data from the model
4. Analyze the effect of **shareholder advantage** on simulated data
5. Use the model insights to design **empirical tests on true data**

## Example: Fan and Sundaresan (2000) model

- ▶ Valuation model with **endogenous default** and **renegotiation**

$$V : \text{given asset value; } \tilde{E}(V) = \tilde{\theta}V, \quad \tilde{D}(V) = (1 - \tilde{\theta})V,$$

- ▶  $\tilde{\theta}$  sharing rule, from a Nash bargaining game:

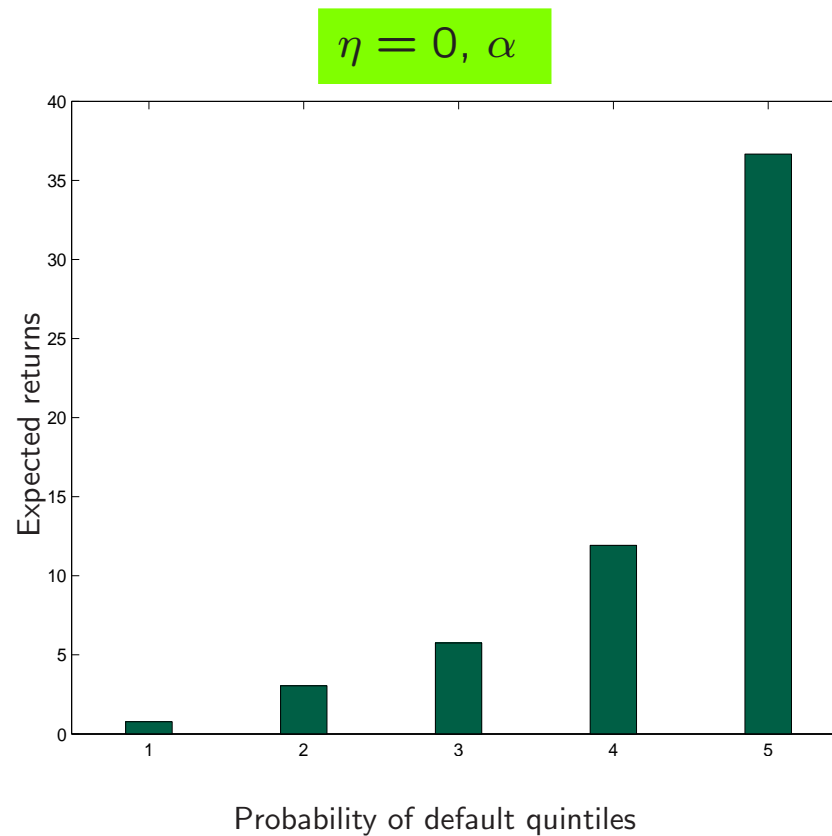
$$\tilde{\theta}^* = \arg \max \underbrace{[\tilde{\theta}V - 0]^\eta}_{\text{Shareholders}} \cdot \underbrace{[(1 - \tilde{\theta})V - (1 - \alpha)V]^{1-\eta}}_{\text{Debt holders}} = \eta\alpha$$

$\eta$ : Shareholder bargaining power } Shareholder Advantage  
 $\alpha$ : Liquidation cost } (ADV)

- ▶ Closed-form expressions for **equity returns** and **default probability**

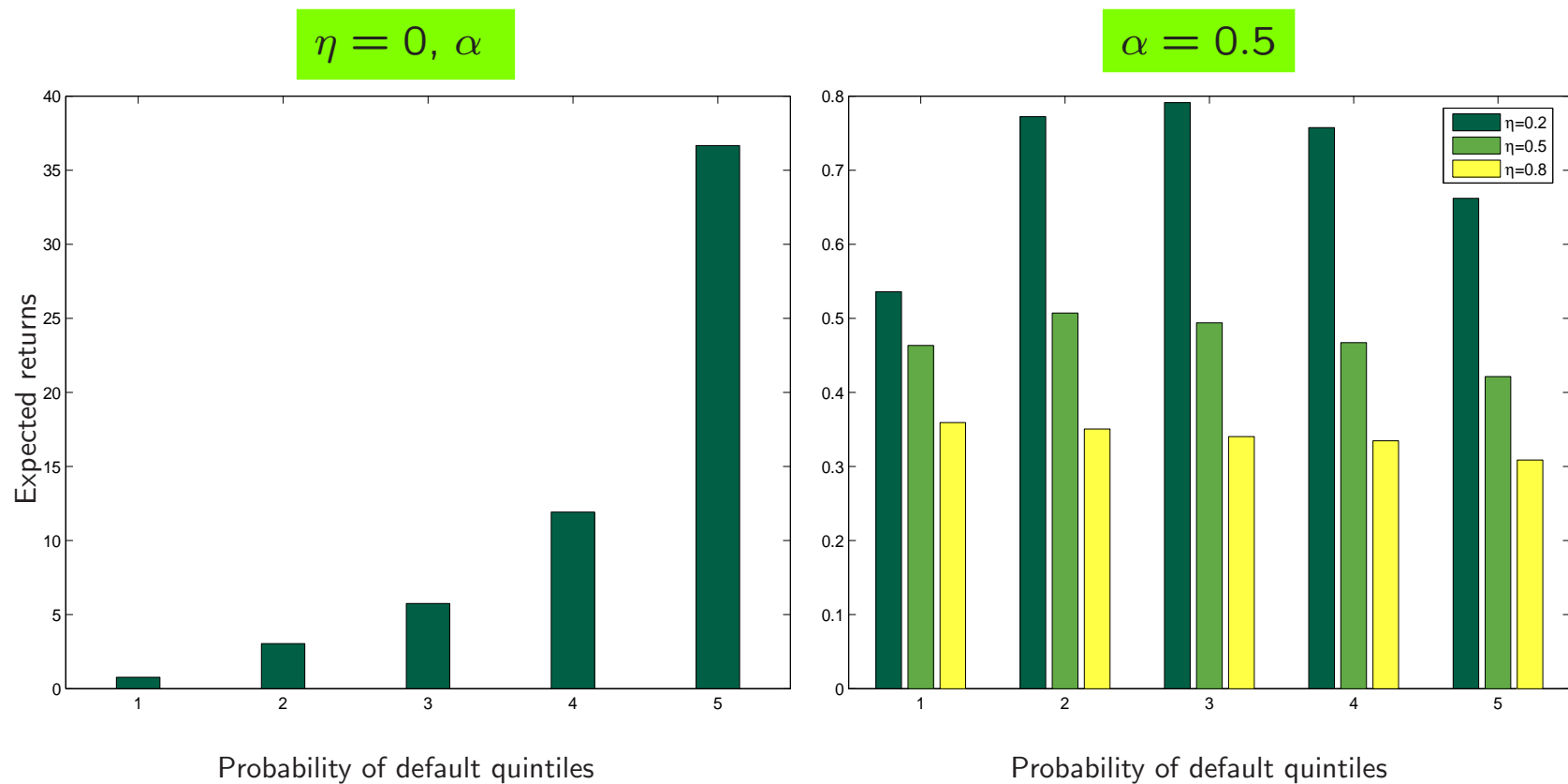
## Simulations

### Role of shareholder Bargaining Power ( $\eta$ )



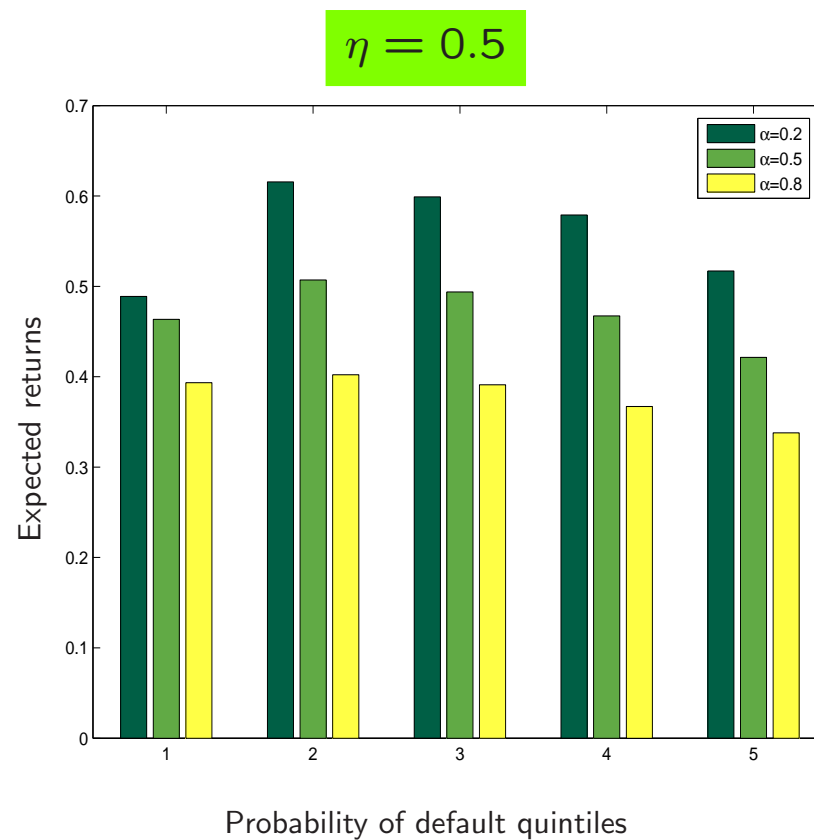
## Simulations

### Role of shareholder Bargaining Power ( $\eta$ )



# Simulations

## Role of Liquidation Costs ( $\alpha$ )



## Testable Implications from the Model

- ▶ **Hypothesis 1.** The relationship between default probability and expected return should be
  - **Upward-sloping** for firms with **minimal** shareholder advantage
  - **Downward sloping and hump-shaped** for firms with **substantial** shareholder advantage.
  
- ▶ **Hypothesis 2.** For a **given** default probability the expected return should be **lower** for firms in which
  - shareholders have **stronger** bargaining power and/or
  - the economic gains from renegotiation are **larger**.

## Empirical Proxies - Shareholders' Bargaining Power

### 1. Asset size ( $\uparrow \Rightarrow \text{ADV} \uparrow$ )

- ▶ **Information Asymmetry.** Small firms tend to have more concentrated creditors (Diamond (1991) and Sufi (2005))
- ▶ **Moral Hazard.** Large borrowers in default have better bargaining position.

### 2. R&D expenditures/assets ( $\uparrow \Rightarrow \text{ADV} \downarrow$ )

- ▶ **Empirically.** High R&D expenditure makes firm susceptible to cash flow constraints (Opler and Titman (1994))
- ▶ **Theoretically.** Cash flow-based covenants (Fan and Sundaresan (2000))

## Empirical Proxies - Liquidation Costs

### 1. Herfindahl Index of sales ( $\uparrow \Rightarrow \text{ADV} \uparrow$ )

- ▶ Indirect measure of asset specificity
- ▶ High Industry concentration  $\rightarrow$  High likelihood of “fire sale”  
 $\rightarrow$  high liquidation cost (Shleifer and Vishny (1992))

### 2. Asset Tangibility ( $\uparrow \Rightarrow \text{ADV} \downarrow$ )

- ▶ Direct measure of asset specificity
- ▶ Asset liquidation value (Berger, Ofek and Swary (1996))

$$\text{Tang} = \text{Cash} + 0.715 \times \text{Receivables} + 0.547 \times \text{Inventory} + 0.535 \times \text{Capital}$$

### 3. Book-to-Market Ratio ( $\downarrow \Rightarrow \text{ADV} \uparrow$ )

- ▶ Loss of intangible assets in liquidation  $\rightarrow$  Scope for bargaining

## Empirical Predictions

Shareholder advantage (ADV) ↑

1. Returns vs. EDF ↘ or ↻

2. Returns given high EDF ↓

## Empirical Methodology

- ▶ Sub-portfolio analysis
- ▶ Regression analysis

## Summary of Results from Sub-Portfolio Analysis

### Hypothesis 1: Returns vs. EDF

#### DGTW-adjusted returns (% per month)

	$ret^{\text{high EDF}} - ret^{\text{low EDF}}$		Diff.
	High ADV	Low ADV	
	(-)	(+)	(-)
<b>Bargaining power</b>			
- Asset Size	-1.02*	0.73*	-1.74***
- R&D expenditures	-0.42	0.78*	-1.19***
<b>Liquidation costs</b>			
- Industry concentration	-0.59**	-0.02	-0.57*
- Asset tangibility	-0.46	0.30	-0.76**
- Book-to-Market ratio	-0.91**	0.34	-1.24***

(\* , \*\* , \*\*\* = significant at 10%, 5%, 1%)

## Summary of Results from Sub-Portfolio Analysis

### Hypothesis 2: Returns given EDF

#### DGTW-adjusted returns (% per month)

	$ret^{\text{high ADV}} - ret^{\text{low ADV}}$	
	Low EDF	High EDF
	(-/0)	(-)
<b>Bargaining power</b>		
- Asset Size	0.21	-1.54***
- R&D expenditures	-0.13	-1.32***
<b>Liquidation costs</b>		
- Industry concentration	-0.03	-0.60*
- Asset tangibility	-0.24*	-1.00***
- Book-to-Market ratio	0.13	-1.11***

(\* , \*\* , \*\*\* = significant at 10%, 5%, 1%)

## Cross-Sectional Regression Analysis (Table 9)

$$R_i = F(\beta_i, \text{Size}_i, \text{BM}_i, \text{MOM}_i, \text{EDF}_i, X_i * \text{EDF}_i)$$

- $\beta_i$  : firm  $i$ 's beta  
 $\text{Size}_i$  : asset size  
 $\text{BM}_i$  : B/M ratio  
 $\text{MOM}_i$  : past six-month returns  
 $\text{EDF}_i$  : MKMV EDF measure  
 $X_i$  : proxy for bargaining power/liquidation cost

- ▶ **Univariate** regression with each  $X_i$ ;
- ▶ **Multivariate** regression with all  $X_i$ 's.

Models	Model 3	Model 4	Model 5	Model 6	Model 7	Model 8
Beta	0.0001	-0.0024*	-0.0007	-0.0011	-0.0008	-0.0019
t-stat	0.08	-1.86	-0.50	-0.88	-0.62	-1.49
Ln(AVL)	0.0005	-0.0012***	-0.0017***	-0.0017***	-0.0019***	0.0011**
t-stat	1.25	-3.02	-4.18	-4.28	-4.33	2.32
Ln(BM)	0.0047***	0.0053***	0.0044***	0.0045***	0.0023**	0.0040***
t-stat	5.94	7.42	5.37	5.98	2.12	3.89
Ret(-6,-1)	0.0208*	0.0194*	0.0175	0.0166	0.0174	0.0193*
t-stat	1.86	1.75	1.54	1.50	1.48	1.75
EDF	0.1026***	-0.0107***	0.0040	-0.0154***	-0.0025	0.0855***
t-stat	5.62	-3.12	0.97	-3.98	-0.79	4.06
R&D		0.0001				0.0005**
t-stat		0.32				2.42
Hfdl			0.0007***			0.0001
t-stat			4.74			0.08
Tang				-0.0006***		0.0001
t-stat				-2.98		0.54
<b>Ln(AVL)×EDF</b>	<b>-0.0058</b> ***					<b>-0.0051</b> ***
t-stat	-6.14					-4.86
<b>R&amp;D×EDF</b>		<b>0.0019</b> ***				<b>0.0031</b> **
t-stat		4.44				2.04
<b>Hfdl×EDF</b>			<b>-0.0016</b> ***			<b>-0.0007</b> *
t-stat			-5.28			-1.85
<b>Tang×EDF</b>				<b>0.0021</b> ***		<b>0.0020</b> ***
t-stat				6.41		4.29
<b>Ln(BM)×EDF</b>					<b>0.0039</b> ***	<b>0.0007</b> *
t-stat					3.06	1.92
Average Adj. $R^2$	0.0461	0.0548	0.0492	0.0471	0.0441	0.0575

## Robustness Checks

- ▶ Returns over **different holding periods** (liquidity issues)
  
- ▶ **Other proxies** used in the literature for
  - **Default probability**
    - ★ Z-score, O-score, and Shumway's hazard model
  - **Bargaining power**
    - ★ Managerial Shareholdings
    - ★ Institutional Holdings
  - **Liquidation cost**
    - ★ Non-fixed assets
    - ★ Market-to-book assets

## Conclusions

- ▶ Propose a **novel economic explanation** for the relationship:

**Default risk**  $\longrightarrow$  **Equity returns**

that is based on **shareholder advantage** and is consistent with the **risk-return** trade-off

- ▶ Provide additional **empirical support** for the cross sectional predictions of the model
- ▶ Demonstrate the importance of **shareholder advantage** in strategic interactions among stake-holders for equity returns.