

# Fundamental risk and capital structure

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# Risk-leverage trade-off



**Figure:** scatter plot of annual  $\overline{lev}_i$  vs  $\overline{\sigma}_{prof}_i$  for 4-digit SIC industries

- Sound theoretically, robust empirically
- Important in practice, Graham and Harvey [2002]
- But 'risk' has many dimensions...
- And any proxy depends on unobservable cash flow dynamics

# Intuition

Let's consider the following two-industry example.

## Agriculture

$\sigma_{prof} \approx 0.03 \rightarrow$  lower risk?

## Apparel

$\sigma_{prof} \approx 0.08 \rightarrow$  higher risk?

- Finance 101  $\rightarrow$  lower optimal debt ratio for apparel
- Data: this is false!  $\overline{lev}_{apparel} \approx \overline{lev}_{agriculture} \approx 0.25 - 0.30$
- Why? The **nature of the risk** matters, e.g.
  - Agriculture: stable earnings (inelastic demand), transient shocks
  - Apparel: high sales variability (fads), lasting but slow moving shocks
- NB:  $\hat{\rho}_{apparel} > \hat{\rho}_{agriculture}$  confirms the intuition (more later)

# Fundamental risk and leverage

The nature of firm's risk affects its capital structure.

- What determines *fundamental* risk?  
→ The structure of the cash flow process (i.e. the fundamental)
- What characterizes fundamental risk?  
→ Volatility *and* persistence

# This paper

I develop a **dynamic capital structure model** in which firm's nature of risk results from the exposure of cash flows ( $\approx$  profits) to two distinctive – transitory and persistent – shocks.

- 1 The model documents that:
  - leverage is **negatively related** to persistent shock exposure
  - **profits are persistent** even when persistent shock exposure is low
  - decomposition of fundamental risk allows to obtain **different optimal leverage ratios for the same level of total volatility**
- 2 The model explains why we **empirically observe**:
  - substantial dispersion in the risk-leverage relationship
  - low dispersion in profit persistence
  - weak association between cash flow persistence and firm characteristics

## **Intuition about the shocks**

# Economic intuition about separating shocks

The transitory and persistent components of cash flow process are represented by a **stationary** and a **non-stationary** process.

- **Persistent shocks** – permanently affect prospects of the firms  
⇒ technology improvements, changes to human capital, tastes...
- **Transitory shocks** – their impact subsides over time  
⇒ demand or supply shocks, regulatory shocks requiring real adjustments, changes in production cost structure...
- NB: in another paper I empirically show how cash flow risk evolves due to firm's product market characteristics.

# Why persistent & transitory shocks?

Shock separation introduces more degree of freedom into the model.

- More realistic to have non-stationarity in the model – real quantities (sales, book assets) behave as if they were non-stationary.
- Two truly different types of risk:
  - A model with two transitory shocks fails to match multiple correlation-based moments.
  - It is easier to think in terms of 'two extreme cases', more difficult to economically identify two 'similar' shocks.
  - The model is in line with macroeconomic literature.
- Important implications in other areas, e.g. asset pricing → Kaltenbrunner and Lochstoer [2010].



# Persistent and transitory shocks in corporate finance

- Gourio [2008]:  
persistent shocks  $\longleftrightarrow$  investment
- Gorbenko and Strebulaev [2010]:  
cash flow  $\perp$  firm value, persistent shocks  $\longleftrightarrow$  leverage
- Chang, Dasgupta, Wong, and Yao [2014], Décamps, Gryglewicz, Morellec, and Villeneuve [2016], Byun, Polkovnichenko, and Rebello [2016], Gryglewicz, Mancini, Morellec, Schroth, Valta [2017], ...

# The model

# The model: basics

Discrete-time dynamic investment model in the spirit of Hennessy and Whited [2005] and DeAngelo, DeAngelo, and Whited [2011], ...:

- A representative, infinitely-lived firm chooses capital and debt policy
- Fundamental risk  $\longleftrightarrow$  cash flow dynamics
  
- Decreasing returns to scale
- Convex capital adjustment costs
- Taxes
- Risk-free (net) debt subject to a collateral constraint  $P' \leq \omega K'$
- Linear equity financing costs
  
- NB: we can add other frictions (issuance cost, agency costs etc.) but they do not affect the main mechanism!

# The model: modeling fundamental risk

Firm's cash flow process  $Z = Z_P \times Z_T$  consists of two shocks.

- 1 **persistent**: unit root proces

$$\log(Z'_P) = \log(Z_P) + \sigma_P \varepsilon'_P$$

- 2 **transitory**: autoregressive process ( $\rho \ll 1$ )

$$\log(Z'_T) = \rho \log(Z_T) + \sigma_T \varepsilon'_T$$

- The model is solved by value function iteration solution method
- At this stage I only use parameter values from DeAngelo, DeAngelo, and Whited [2011] all parameters
- I study the effect of changing **risk composition**:
  - fundamental volatility: vary  $\sigma_P$  for the same  $\sigma_{tot}$ ,
  - fundamental persistence: vary  $\rho$  for the same  $\sigma_{tot}$  (and/ or  $\sigma_P$ ).

# Bellman equation

The model results in the following Bellman equation:

$$V(K, P, Z_T, Z_P) = \max_{K', P'} \left\{ E(K, K', P, P', Z_T, Z_P) + \Phi(E(K, K', P, P', Z_T, Z_P)) \right. \\ \left. + \frac{1}{1+r} \mathbb{E}_{Z'_T, Z'_P} [V(K', P', Z'_T, Z'_P)] \right\},$$

s.t.  $P' \leq \omega K'$ ,  $K' = I + (1 - \delta)K$ ,  
 $\log(Z'_P) = \log(Z_P) + \sigma_P \varepsilon'_P$ ,  $\log(Z'_T) = \rho \log(Z_T) + \sigma_T \varepsilon'_T$ ,

where cash flow  $E$  consists of

$$E(K, K', P, P', Z_T, Z_P) = (1 - \tau)Z_T Z_P K^\theta + \tau \delta K \\ - [K' - (1 - \delta)K] - \psi/2 [(K' - (1 - \delta)K)/K]^2 K \\ + P' - [1 + r(1 - \tau)]P$$

and external equity financing cost  $\Phi$  is modeled by

$$\Phi(E(\cdot)) = [\eta E(\cdot)] \mathbb{1}_{E(\cdot) < 0}.$$

# Model intuition via first-order condition

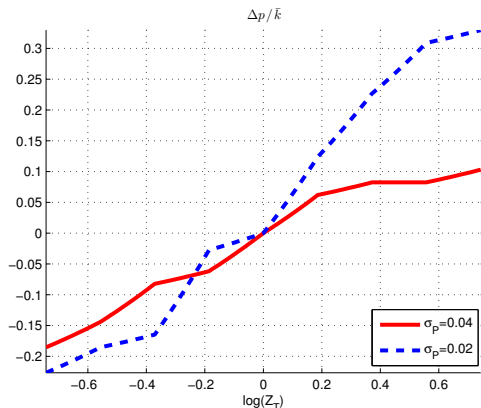
Taking the first-order condition of the value function and using the envelope condition gives:

$$1 + \eta \mathbb{1}_{E(\cdot) < 0} = \xi' + \frac{[1 + r(1 - \tau)]}{1 + r} \mathbb{E}_{Z'_T, Z'_P} [(1 + \eta \mathbb{1}_{E'(\cdot) < 0})].$$

- Financial flexibility – DeAngelo, DeAngelo, and Whited [2011].
- Marginal benefit of debt = marginal cost of debt (including losing the option to borrow).
- Real and financial policies are intertwined: investment is the main channel through which shocks affect leverage.
- Persistent shocks matter.

## **Main mechanisms**

# Policy functions



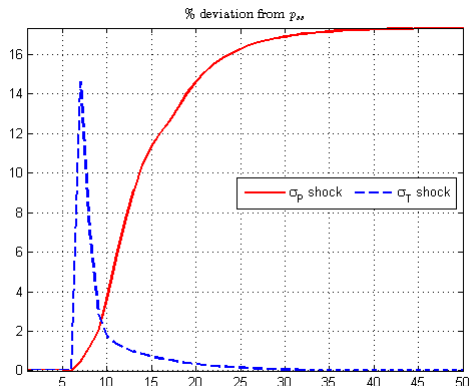
**Figure:** policy function for net debt change;  $\sigma_{tot} = 0.15$ ,  
 $\rho = 0.6$

## Implications

- risk composition matters for corporate policies
- small persistent shock exposure  
→ large effect on firm policies
- higher  $\sigma_P$  → less sensitivity to  $Z_T$
- here: more reliance on internal financing



# Impulse response functions



**Figure:** percent deviation of **net debt** from the steady state;  $\sigma_{tot} = 0.15$ ,  $\sigma_p = 0.04$ ,  $\rho = 0.6$

## Implications

- permanence
- adjustment time
- magnitude
- 'smoothness'

# **Fundamental risk and capital structure**

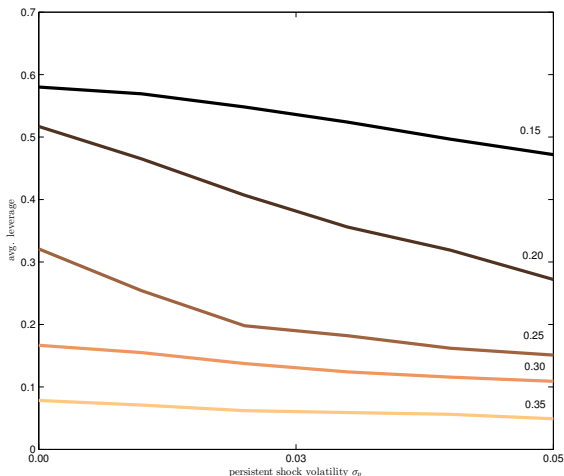
# Fundamental risk and leverage

Two main channels:

- 1 Fundamental volatility channel ( $\sigma_{tot}$  and  $\sigma_P$ )
  - higher total volatility  $\rightarrow$  larger investment expenditure is optimal  $\rightarrow$  firm preserves debt capacity
  - lower volatility  $\rightarrow$  firm's cash flows are more predictable  $\rightarrow$  less valuable option to borrow
- 2 Fundamental persistence channel ( $\rho$  and  $\sigma_P$ )
  - higher persistence  $\rightarrow$  cash flow more path dependent and investment more profitable
  - higher persistence  $\rightarrow$  firm policies are more sensitive to underlying shocks

Persistent shocks affect **both** volatility and persistence. Higher exposure increases investment size and makes its profitability more lasting.

# Fundamental volatility and average leverage

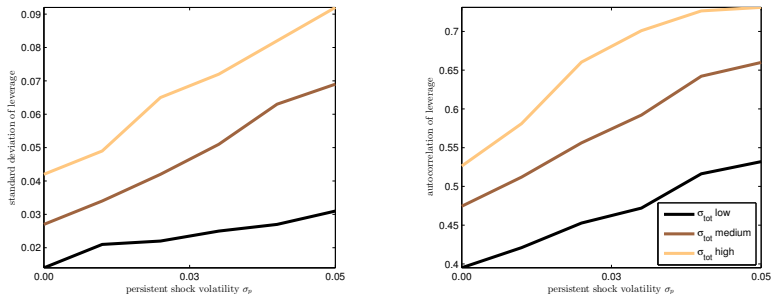


## Implications

- neg. relationship between leverage and persistent shock exposure
- the same leverage, different 'risk' and vice-versa
- total volatility determines the influence of  $\sigma_P$

**Figure:** average leverage vs. volatility composition;  
 $\rho = 0.60$

# Fundamental volatility and leverage dynamics

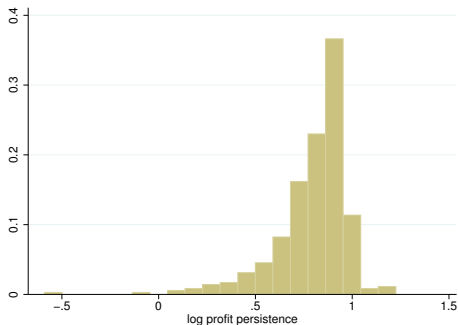


**Figure:** leverage dynamics when varying the volatility composition;  $\rho = 0.60$

## Implications

- persistent shock exposure increases leverage variation
- higher sensitivity of leverage variation to  $\sigma_P$  when  $\sigma_{tot}$  high
- leverage persistence more sensitive to  $\sigma_P$  than  $\sigma_{tot}$

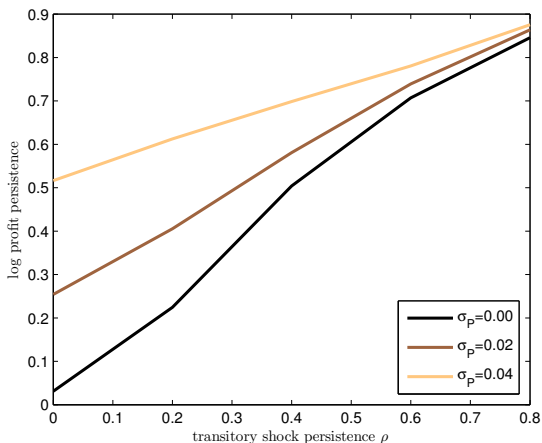
# Decomposing fundamental persistence – motivation



**Figure:** average persistence parameters  $\hat{\rho}$  of  $\log(\tilde{\Pi})$  for 4-digit SIC industries

- standard models: comparative statics of  $\rho$  result in large changes in model-implied moments
- data:  $\hat{\rho}$  negatively skewed and clustered around high value with next to none explanatory power for firm characteristics empirical evidence
- what could explain the discrepancy? **risk composition**

# Fundamental persistence – the two sources

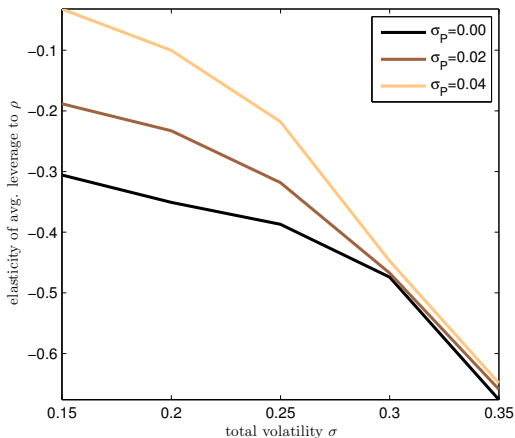


## Implications

- both  $\rho$  and  $\sigma_P$  are important for persistence
- profits may be persistent even when  $\rho = 0$  and  $\sigma_P$  is small
- the same level of persistence but different  $\rho$
- $\sigma_{tot}$  is important!

**Figure:** log profit persistence vs.  $\rho$  and  $\sigma_P$ ;  $\sigma_{tot} = 0.15$ .

# Fundamental persistence and average leverage



## Implications

- negative relationship between leverage and persistence
- but each source of persistence has distinctive quantitative effect
- sensitivity of leverage to  $\rho$  decreases as  $\sigma_p$  increases

**Figure:** elasticity of average leverage to changing  $\rho$ :  
 $(\partial lev / \partial \rho) \times (\overline{lev} / \bar{\rho})$



# Implications for studying leverage variation

- 1 The one-to-one link between total volatility and leverage is broken.
- 2 Composition of profit persistence is informative about leverage.

- Firms with the same observable  $\hat{\sigma}$  can adopt markedly different policies depending on risk composition.
- Similarly, firms with the same observable  $\hat{\rho}$  may behave differently depending on risk composition.

⇒ Risk composition could help explain more variation in leverage ratios (as a fixed effect), but *incremental* explanatory power of shock characteristics may vary.

# Take-aways

Firm's fundamental risk is an important determinant of capital structure.

- 1 Persistent and transitory shock have different implications for corporate policies and imply specific cash flow dynamics.
- 2 Risk composition helps explain some of the observable capital structure heterogeneity in the data.

Still largely work in progress...

- **How much** of variation in corporate policies can risk composition actually explain? → I structurally estimate the model.
- Where does fundamental risk come from? → In another paper I show that it's largely determined by product market characteristics.
- Open Q: Do **investment dynamics** reflect capital adjustment costs or persistent shocks? What about risk composition and **returns**?

# Solution method

Introducing the non-stationary shock results in unbounded state-space for capital – as in Gourio [2008, 2012] we can 'detrend' the variables by a scaling factor  $Z_P^{1/(1-\theta)}$ .

For example, this implies the following law of motion for capital:


$$K' = K(1 - \delta) + I \iff$$
$$k' = \frac{K'}{Z_P^{1+\theta}} = \frac{K'}{Z_P^{1-\theta}} \frac{Z_P^{\frac{1}{1-\theta}}}{Z_P^{\frac{1}{1-\theta}}} = (k(1 - \delta) + i) \exp(-\sigma_P \varepsilon'_P / (1 - \theta)),$$

where  $k = K/Z_P^{\frac{1}{1-\theta}}$  and  $i = I/Z_P^{\frac{1}{1-\theta}}$ .

Similar transformation is carried out for debt dynamics, expressed by  $\Delta P := P' - P$ . This transformation is necessary so as not to optimize over  $p'(\varepsilon'_P)$ . The problem is ultimately solved by value function iteration.

## Appendix: model calibration

Interest rate	$r$	0.02
Corporate tax rate	$\tau$	0.35
Production function curvature	$\theta$	0.75
Capital depreciation rate	$\delta$	0.15
Convex capital adjustment cost	$\psi$	0.10
Linear cost of external equity issuance	$\eta$	0.15
Collateral constraint	$\omega$	0.60
Persistence of transitory shock $Z_T$	$\rho$	0.00–0.80
Total volatility	$\sigma$	0.15–0.35
Volatility of persistent shock $Z_P$	$\sigma_P$	0.00–0.05

Note that  $\sigma_{tot} = \sqrt{\sigma_P^2 + \sigma_T^2}$ . 

## Appendix: $\hat{\rho}$ and firm characteristics

Average...	Firms			4D-SIC industries		
	$\rho(\pi/k)$	$\rho(\log(\Pi))$	$\bar{\rho}(\pi/k)$	$\bar{\rho}(\log(\Pi))$	$\rho_{agg}(\pi/k)$	$\rho_{agg}(\log(\Pi))$
Book leverage	-0.018	-0.002	0.009	-0.108	-0.032	-0.139
Investment	-0.007	-0.033	0.047	-0.009	0.082	0.058
Market-to-book	0.016	0.037	-0.002	0.040	0.032	0.076
Size	0.013	0.029	0.070	0.085	0.011	-0.156
Asset tangibility	-0.006	-0.025	0.020	-0.045	0.031	-0.039
Collateral	-0.002	-0.002	-0.037	-0.058	-0.038	-0.127
Volatility of log real profits	-0.022	-0.028	-0.095	-0.191	-0.159	-0.128
Vol. of agg. log real profits	—	—	-0.059	-0.167	-0.312	-0.155

**Table:** Correlations between firm characteristics and estimated profit persistence.  $\rho$  is estimated as the persistence parameter from an AR(1) fit of log real profits  $\log(\Pi)$  or profitability  $\pi/k$  for each firm and then averaged over all firms in an industry. Industry-specific persistence parameters  $\rho_{agg}$  are estimated using the aggregate industry-level data.

## Appendix: $\hat{\rho}$ and firm characteristics

	Firms		4D-SIC industries			
	$\bar{\rho}(\pi/k)$	$\bar{\rho}(\log(\Pi))$	$\bar{\rho}(\pi/k)$	$\bar{\rho}(\log(\Pi))$	$\rho_{agg}(\pi/k)$	$\rho_{agg}(\log(\Pi))$
$\hat{\rho}$	-0.001	0.001	-0.004	-0.007	-0.009	-0.011
<i>t</i> -stat	-1.89	1.30	-0.74	-0.69	-0.75	-0.86
Incr. $\bar{R}^2$ of $\hat{\rho}$	0.001	0.000	0.002	0.001	0.001	0.000
$\bar{R}^2$	0.262	0.262	0.313	0.332	0.332	0.333
Industry dummy	Yes, 4D-SIC	Yes, 4D-SIC	Yes, 2D-SIC	Yes, 2D-SIC	Yes, 2D-SIC	Yes, 2D-SIC
<i>N</i>	6387	6387	353	353	353	353

**Table:** Coefficients from cross-sectional regressions of average book leverage on average leverage factors (size, profitability, asset tangibility, market-to-book, volatility of log real profits) and estimated profit persistence  $\hat{\rho}$ . 