

Finance 937

Leverage and Investment

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October 6, 2019

A Model of Corporate Debt and Investment

Simplified version of several papers

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The key novel assumptions are

- ▶ Endogenous investment decisions, $k' = k_{t+1}$, in each period.
- ▶ Endogenous choice of one period debt, $b' = b_{t+1}$ and distributions, d_t , in each period.
- ▶ The unit cost of external equity raised by the firm is $\lambda \geq 0$
- ▶ Endogenous profits

Profits, Investment and Debt Issues

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Debt issued at a discount - a face value issue of, b' , raises an amount $b'/R^b(b'; \cdot)$ today:

► Alternatively, the price of debt is $q^b(b'; \cdot) = 1/R^b(b'; \cdot)$

Modeling Corporate Income Taxes

Assume (as before) that a single effective tax rate on corporate income, τ , captures all features of the tax code.

- ▶ The corporate income **tax base** is:

$$\gamma(z, k, b; R_{-1}^b(b; \cdot)) = \pi(k, z) - \delta k - (R_{-1}^b(b; \cdot) - 1) \frac{b}{R_{-1}^b(b; \cdot)}.$$

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- ▶ Corporate tax payments are then defined as:

$$\tau(z, k, b; R_{-1}^b(b; \cdot)) \equiv \tau_c \gamma(z, k, b; R_{-1}^b(b; \cdot))$$

Modeling Corporate Income Taxes

Hennessy and Whited (2005) assume the tax rate is instead a strictly increasing and convex function of the tax base, $\tau_c(\cdot)$, that satisfies:

$$\lim_{\gamma \rightarrow \infty} \tau_c(\cdot) = \bar{\tau}_c > 0$$

$$\lim_{\gamma \rightarrow -\infty} \tau_c(\cdot) = 0$$

Although complicated, this has several advantages

- ▶ Adds realism to the problem since government is no longer subsidizing losses
- ▶ Adds extra concavity to the problem making it easier to compute interior solutions

How do we parameterize the function $\tau_c(\cdot)$?

- ▶ Could use data from John Graham's web site about firm's marginal tax rates

Net Distributions

Gross distributions to equity (dividends or repurchases) are:

$$\pi(z, k) - \tau(z, k, b; R_{-1}^b(b; \cdot)) - i(k', k) + \frac{b'}{R^b(b'; \cdot)} - b$$

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Net distributions to equity are given by:

$$d(z, k, b, k', b'; R_{-1}^b(b; \cdot)) \equiv$$

$$[1 + \chi\lambda][\pi(z, k) - \tau(z, k, b; R_{-1}^b(b; \cdot)) - i(k', k) + \frac{b'}{R^b(b'; \cdot)} - b]$$

where $\chi(\cdot)$ is an indicator function that takes value 1 when the firm issues equity - i.e. $d(\cdot) < 0$.

- ▶ This is similar to what we would obtain if the firm faces a strict non-negative dividend constraint, $d(\cdot) \geq 0$.
- ▶ In this case λ would be the endogenous multiplier on this constraint and not some exogenous value.

The Problem for Equity Holders

The Bellman equation for the equity holders in this firm is:

$$e(z, k, b; R_{-1}^b(b)) = \max_{k', b'} \left\{ d(\cdot) + E_z M \max\{e(z', k', b'; R^b(b')), 0\} \right\}.$$

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- ▶ In addition, when returns to scale are close to 1 and default probabilities are low, $R^b(b'; \cdot)$ is close to a constant and the problem becomes almost linear in both k' and b' (perfect substitutes).
- ▶ Moreover since $R_{-1}^b = R_{-1}^b(z_{-1}, k, b)$ - we actually need to keep track of z_{-1} in the state-space

Simplifications: Collateral Constraints

Many papers impose a collateral constraint to the choice of debt.
A popular form for this is (Rampini and Vishwanathan (2012)):

$$b_{t+1} \leq \eta(1 - \delta)k_{t+1}$$

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Several computational benefits:

- ▶ The constraint imposes an upper bound on debt. If there are tax or some other benefits to debt, leverage will always be exactly at the constraint.
- ▶ Ensures risk free debt so that $R_t^b = R_{t-1}^b = R^f$

Collateral Constraints: Alternative Formulations

Fluctuation in collateral values: Kiyotaki and Moore (1997)

$$b_{t+1} \leq \eta p_{I,t}(1 - \delta)k_{t+1}$$

- ▶ Fluctuations in the current price of capital, $p_{I,t}$, will force the firm to adjust its debt (and/or investment)
- ▶ In macro (general equilibrium) models these fluctuations in $p_{I,t}$ are endogenous and often contribute to magnify the effect of any shocks on firm behavior.

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Future cash flows:

$$b_{t+1} \leq \pi(z_{t+1}, k_{t+1}) - \tau(z_{t+1}, k_{t+1}, b_{t+1}) + \eta(1 - \delta)k_{t+1}$$

- ▶ This is essentially similar to (motivated by) limited commitment models
- ▶ E.g. Hennessy and Whited (2005), Gertler and Kiyotaki (2014)

Simplifications: Linearity

Another useful simplification is to assume the profit function and adjustment cost functions are constant returns to scale.

- ▶ Now $\tau(z, k, b; R_{-1}^b)$ is linear in k and b and net distributions can be scaled by capital:

$$d/k = [1 + \chi\lambda][z - \tau(z, b/k) - i(k'/k, 1) + \frac{b'/R^b}{k'} \frac{k'}{k} - b/k]$$

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where

- ▶ $g = k'/k =$ growth rate of capital
- ▶ $\omega = b/k =$ leverage

This requires either $R^b = R_{-1}^b$ is constant or homogenous in (b, k)

- ▶ We will see how this can be achieved in some models later on
- ▶ For now we assume $R^b = R^f = 1/M$ (e.g. collateral constraint)

The Problem for Equity with Linearity

Rewrite the Bellman equation as

$$e(z, k, b)/k = \tilde{e}(z, \omega) = \max_{g, \omega'} \{d/k + gE_z M \tilde{e}(z', \omega')\}$$

- Note that the only endogenous **state** variable is now ω

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Comments

- ▶ Since $d/k(g, \omega, z)$ it follows that the optimal issuance decision can be written as $\chi = \chi(g, \omega, z)$ too.
- ▶ Linear homogenous problems are fine if we want to study **smooth** aggregate variables.

Optimal Investment with Linearity

The choice of optimal capital accumulation is now static and, when $\lambda = 0$, obeys the FOC

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- ▶ As usual without adjustment costs ($i'(\cdot) = 1$) this equation is indeterminate
- ▶ Generally this is not an issue because these problems are usually embedded in a GE setting where consumption saving decisions help to determine investment

Optimal Investment with Linearity and Constraints

With equity issuance costs (or $d \geq 0$ constraint) $\lambda \geq 0$ and the optimal FOC for investment becomes:

$$i'(g) = \frac{E_z M \tilde{e}(z', \omega')}{1 + \chi \lambda} + \frac{\omega'}{R^b}$$

Everything else the same:

- In the region of positive equity issuance the marginal benefit of investment is below its unconstrained level

Optimal Investment with Linearity and Constraints

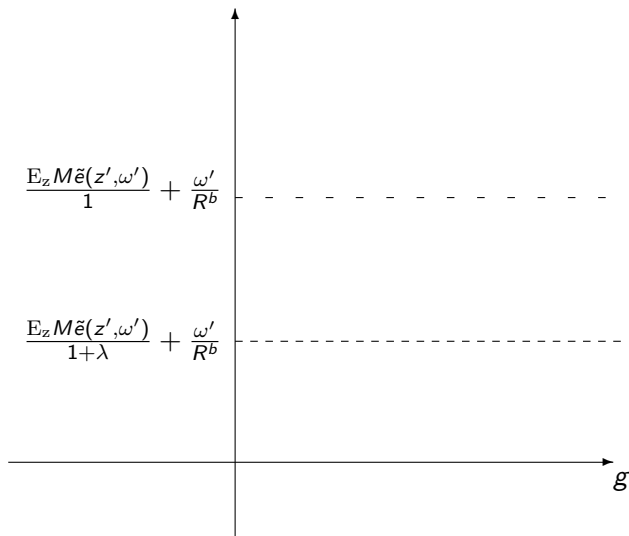
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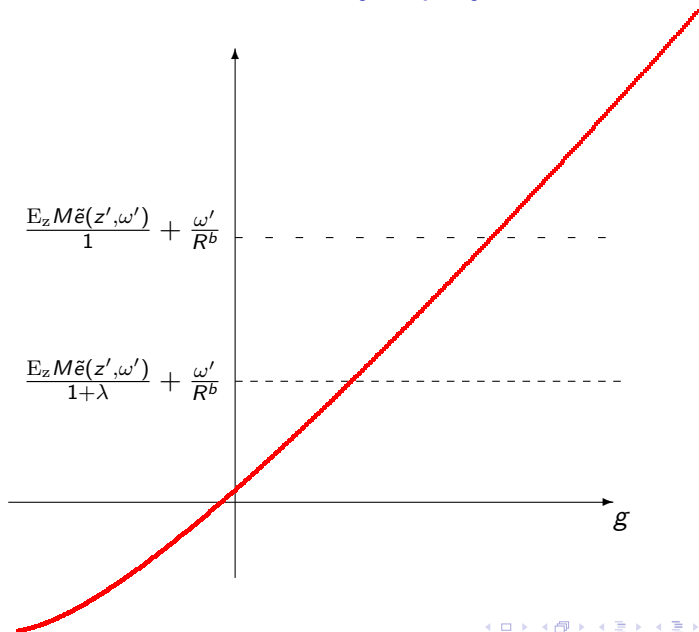
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- ▶ In the region of positive equity issuance the marginal benefit of investment is below its unconstrained level
- ▶ With convex adjustment costs, the optimal investment rate (capital growth) is also lower
- ▶ Thus equity issuing firms are *financially constrained*.

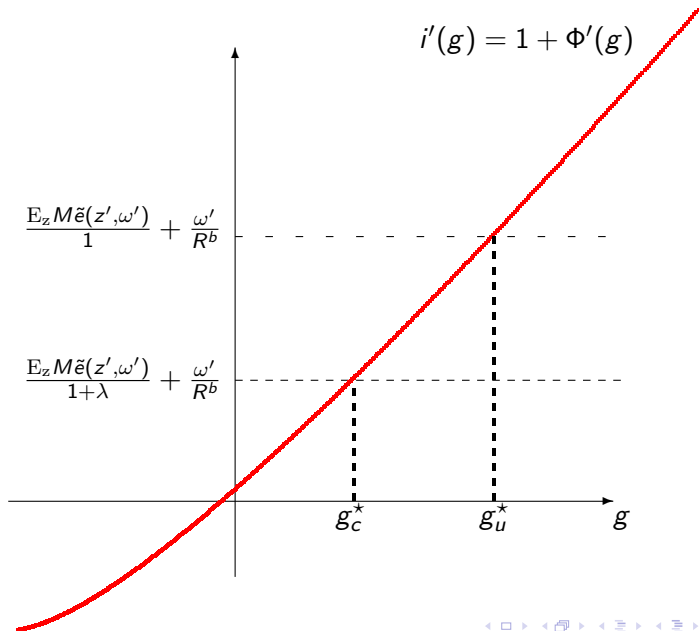
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Together we get the "distorted" Euler equation:

$$1 = EM \left[\frac{1 + \chi'\lambda}{1 + \chi\lambda} (R^b - \tau_c(R^b - 1)) \right] = \frac{1 + r^b(1 - \tau_c)}{1 + r^f} E\zeta$$

where $\zeta = \frac{1 + \chi'\lambda}{1 + \chi\lambda}$ and $M = 1/(1 + r^f)$

Financial Constraints and Leverage

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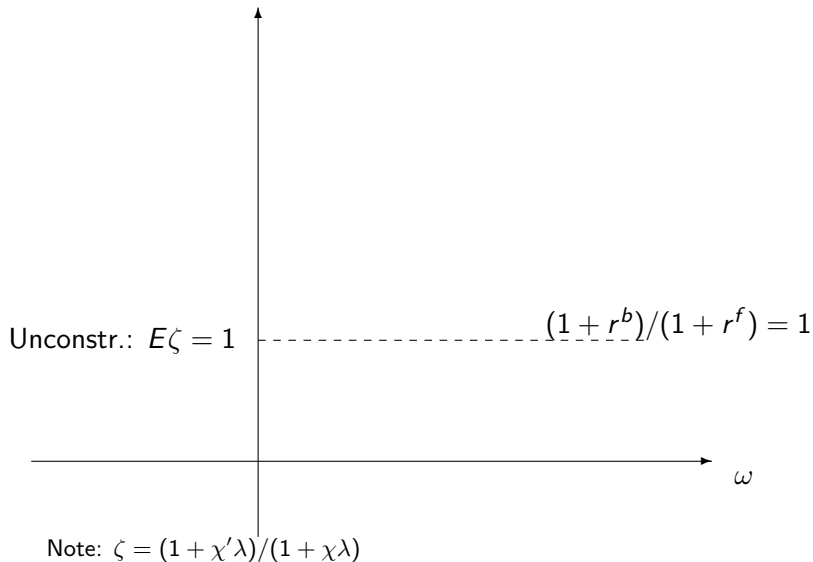
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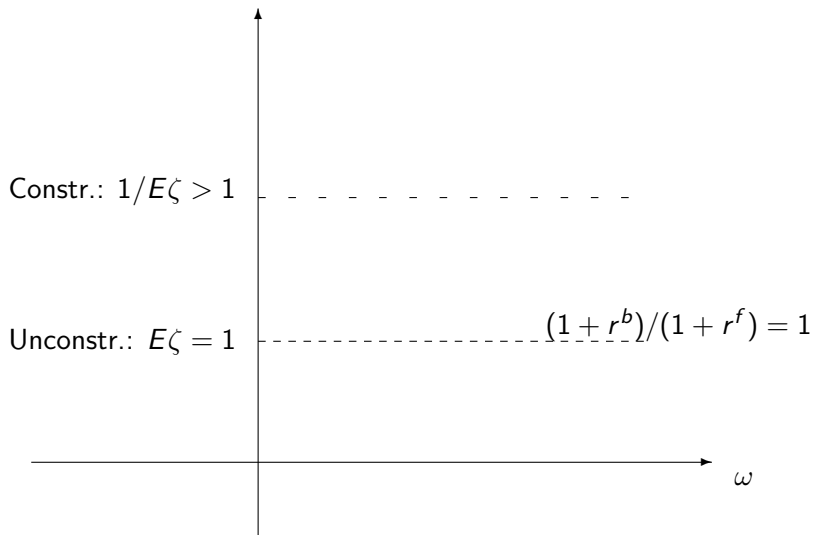
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 - ▶ In this case we need a collateral constraint to restrict firm leverage
- ▶ When a firm issues equity and pays λ today, then $E\zeta < 1$.
 - ▶ This decreases the effective marginal cost of issuing debt today.
- ▶ With mean reversion of z it is unlikely that $E\zeta > 1$

Optimal Leverage With Collateral: No Taxes

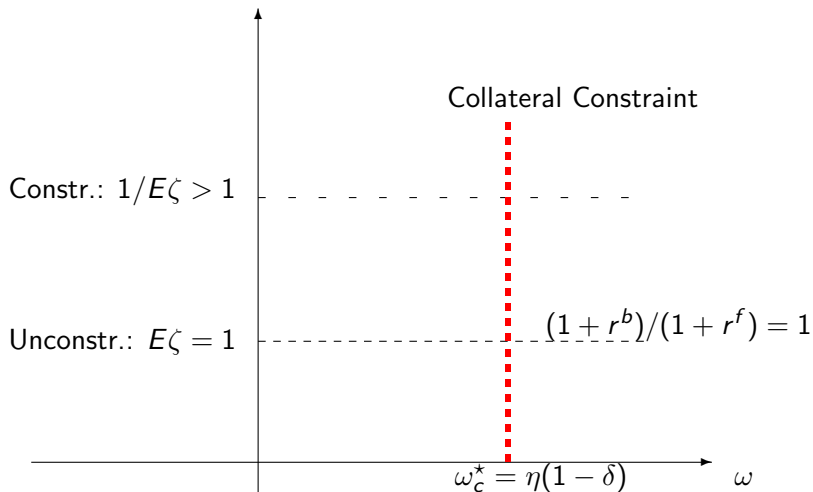


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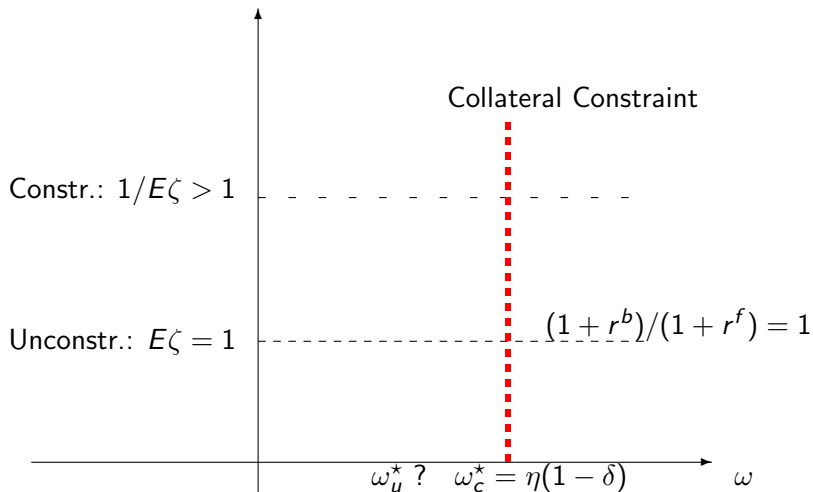
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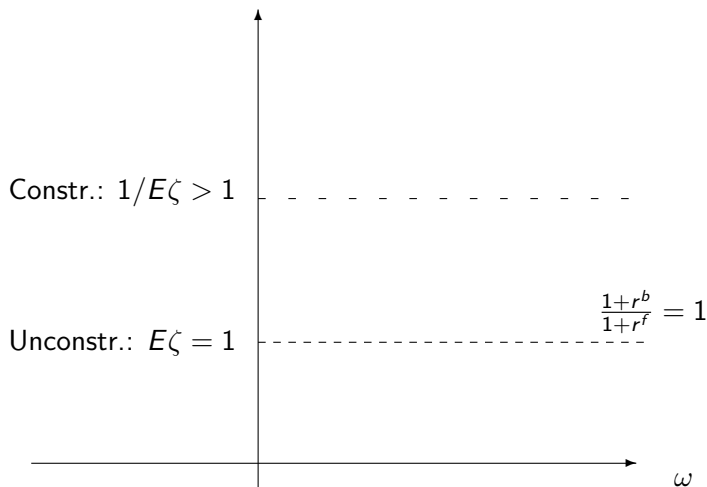
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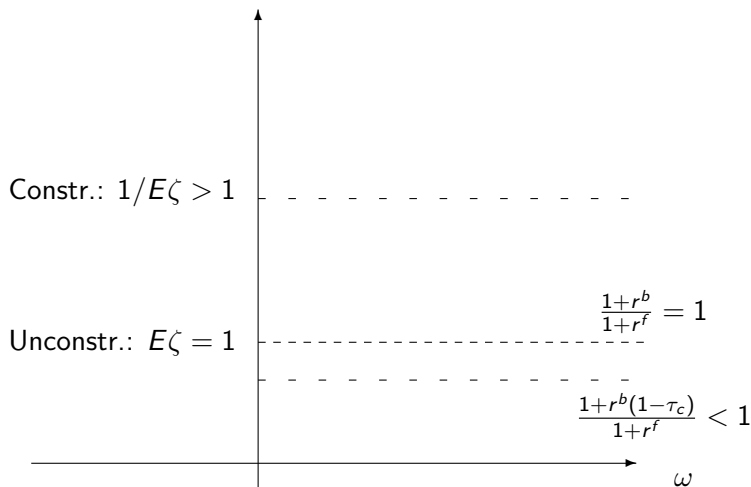
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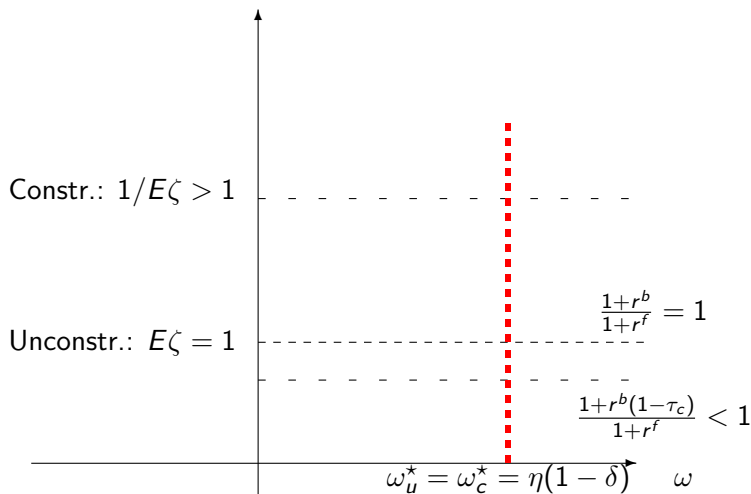
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3. Otherwise solve optimal investment from

$$i'(g) = E_z M \tilde{e}(z', \omega) / (1 + \lambda) + \omega' / R^b$$

and compute the implied d .

4. What if $d > 0$ in the last case? Then we must have $d = 0$ and the FOC for investment does not hold.

Solving Models with Collateral Constraints

When there are no taxes, so $\tau_c = 0$:

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4. Otherwise solve optimal investment from

$$i'(g) = E_z M \tilde{e}(z', \omega) / (1 + \lambda) + \omega' / R^b$$

5. Compute the implied d assuming $\omega' = \eta(1 - \delta)$.
6. Again, if $d > 0$ we must have $d = 0$ ($\omega' = \eta(1 - \delta)$) and the FOC for investment does not hold.

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- ▶ The firm cannot use new equity issues to pay debt

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- ▶ The firm cannot use new debt to service old debt
- ▶ The firm cannot use new equity issues to pay debt
- ▶ Government claims having priority over debt holders

Default and The Cost of Debt

Assume upon default the bondholder recovers a part of the firm's assets (per unit of capital), $\theta(z)$

- ▶ The required yield on new debt offered to bond holders, R^b , must obey the arbitrage (zero profit) condition:

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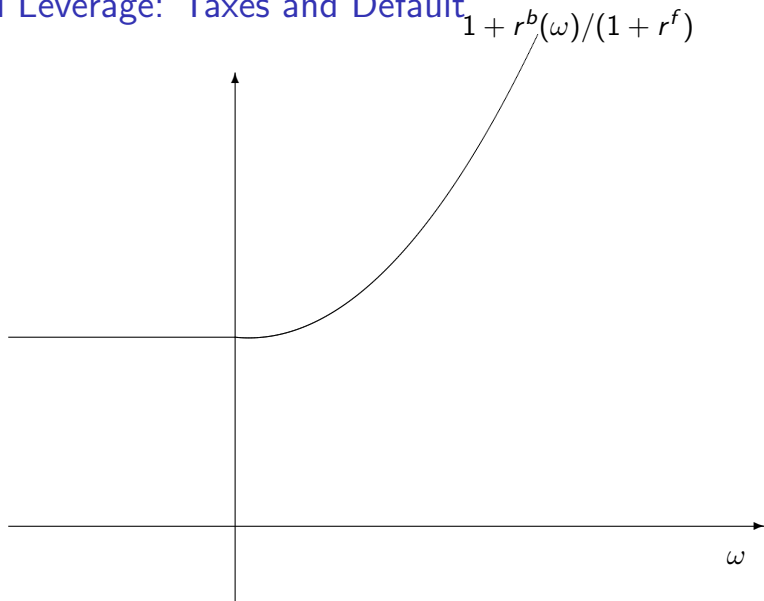
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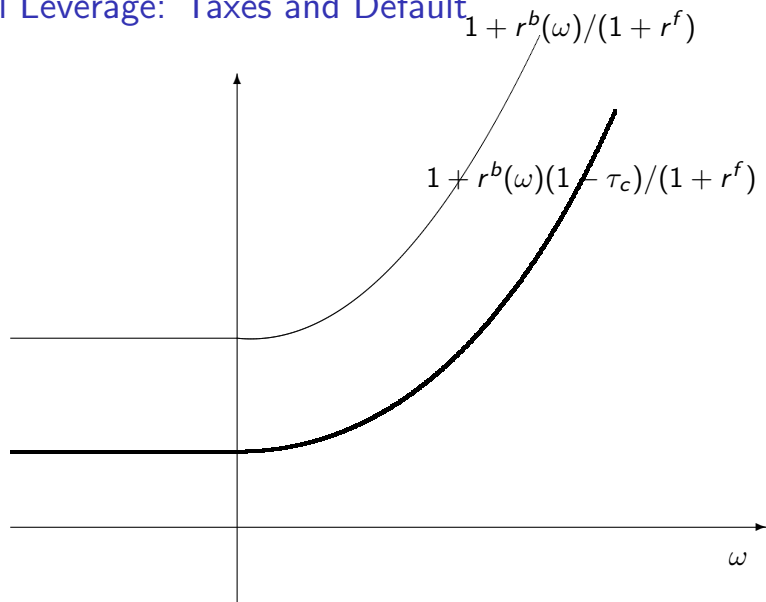
This is

1. an increasing function of the leverage ratio ω'
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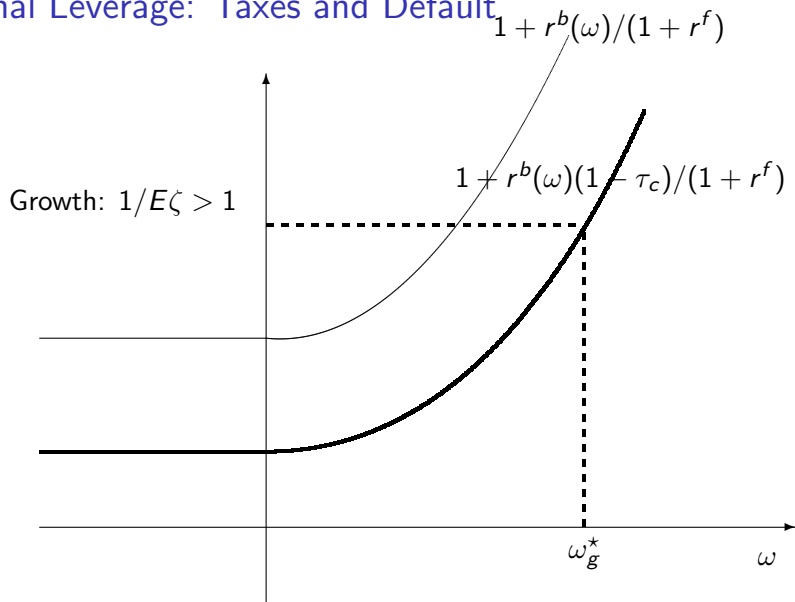
Optimal Leverage: Taxes and Default



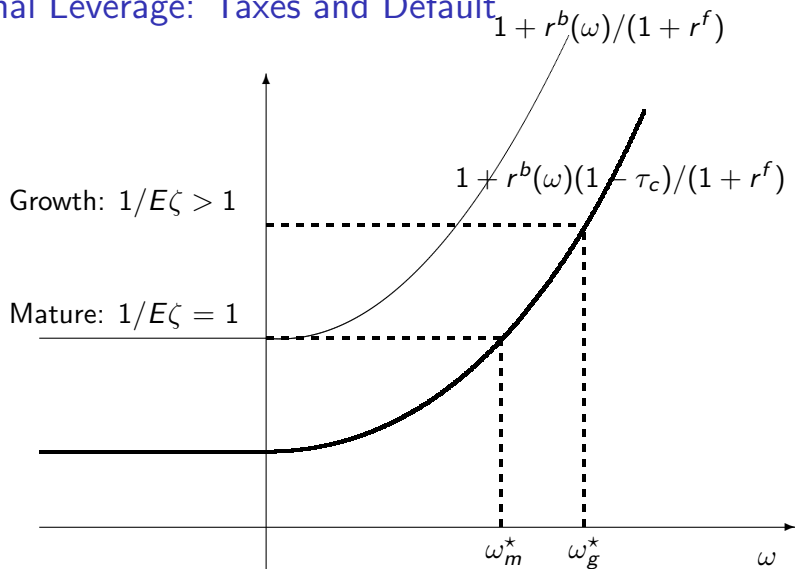
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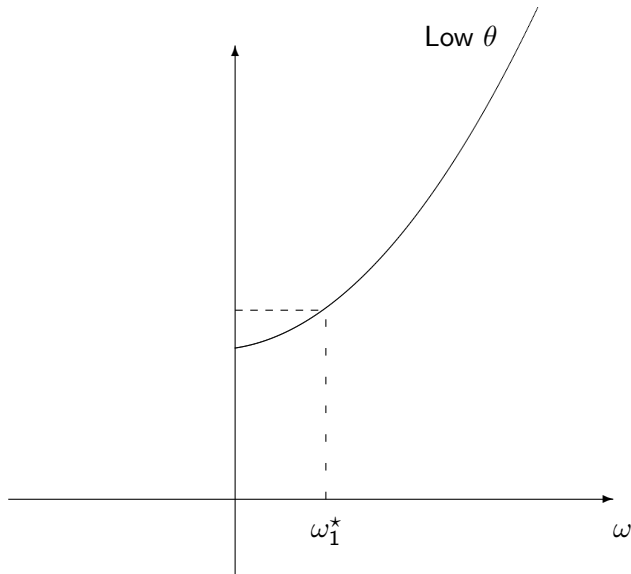


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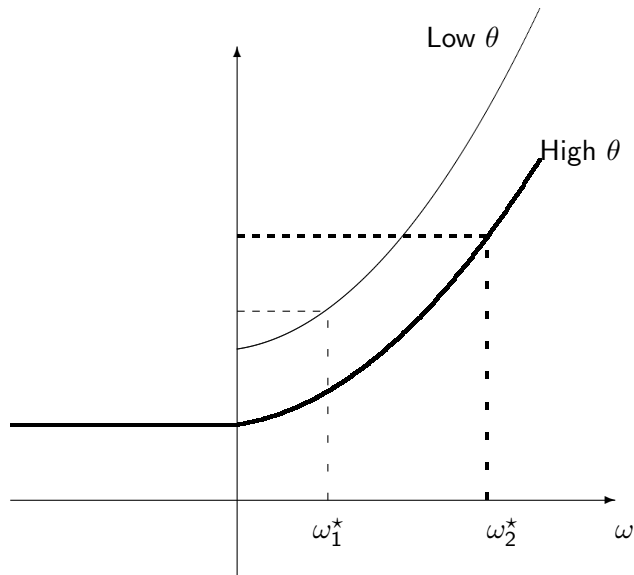


- Notes: (1) $E\zeta$ high = firm expects to be more constrained in the future
 (2) Now ω' has an interior solution even if $\lambda = 0$

Optimal Leverage: Effect of Higher Recovery θ



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This is only exactly true when taxes are 0, otherwise the firm almost always prefer to use debt before internal funds.

Empirical Issues: Determinants of Leverage

Collectively then these models should fit the data quite well. Specifically they imply that:

- ▶ Leverage should be lower for growth firms or those that expect to be issuing equity in the future
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- ▶ Empirically these should be the *high Q* firms
- ▶ Leverage decreases with the cost of default: the extent to which assets are tangible or can be collateralized $\theta(z)$
- ▶ Empirically there should be a relation between leverage and tangible assets like Plant, Property and Equipment (PP&E)

Determinants of Firm Leverage - Rajan & Zingales 1995

Country Variable	United States	Japan	Germany	France	Italy	United Kingdom	Canada
Panel A: Book Capital							
Tangibility	0.50*** (0.04)	1.41*** (0.18)	0.42** (0.19)	0.53** (0.26)	0.36 (0.23)	0.41*** (0.07)	0.26*** (0.10)
Market-to-book	-0.17*** (0.01)	-0.04 (0.04)	-0.20*** (0.07)	-0.17** (0.08)	-0.19 (0.14)	-0.13*** (0.03)	-0.11*** (0.04)
Logsale	0.06*** (0.01)	0.11*** (0.02)	-0.07*** (0.02)	0.02 (0.02)	0.02 (0.03)	0.026*** (0.01)	0.08*** (0.01)
Profitability	-0.41*** (0.1)	-4.26*** (0.60)	0.15 (0.52)	-0.02 (0.72)	-0.16 (0.85)	-0.34 (0.30)	-0.46** (0.22)
Number of observations	2079	316	175	117	96	522	264
Pseudo R ²	0.21	0.29	0.12	0.12	0.05	0.18	0.19

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The one big point of debate is the relation between leverage and profits.

- ▶ Empirically the relation between debt and profits is robustly negative (Titman and Wessels (1988), Myers (1993), Rajan and Zingales (1995), and Fama and French (2002))
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- ▶ We saw that models without investment and costs of issuing equity/constraints may find it hard to match this fact
- ▶ Adding large costs to issue equity (or more debt) **and** investment is endogenous encourages firms to use excess cash flows to reduce debt and lower the probability of paying large issuance costs in the future
- ▶ This is a classical precautionary savings argument.

The Model with Optimal Default

These models are (by far) the hardest to solve.

- ▶ When default is optimally determined by equity holders it will generally be determined by the value of an outside option $e^0(z)k$ (we normalize it to 0 in these notes):

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now requires knowledge of the equity value function $\tilde{e}(z', \omega')$.

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4. Stop upon convergence

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More serious theoretical issues:

- ▶ Does this dual recursion converge? It is not obviously a contraction when R^b is endogenous
- ▶ Is there a unique solution/equilibrium? We can sometimes construct multiple equilibria. (Chatterjee and Eyigungor (2012))

The Model with Decreasing Returns

In this case we have two endogenous state variables

- ▶ To again reduce the state space let us define *net worth*:

$$n = \pi(z, k) - \tau(z, k, b; R_{-1}^b(b)) + (1 - \delta)k - b$$

This allows us to write net distributions to equity as:

$$d(z, n, k', b') = [1 + \chi\lambda] \left[n - k' + \frac{b'}{R^b(b')} \right]$$

The Bellman equation for the equity holders in this firm is:

$$e(z, n) = \max_{k', b'} \{ d(z, n, k', b') + E_z M \max\{e(z', n'), 0\} \}$$

Now we have one endogenous state, n , and two controls (k', b') .

- ▶ Adjustment costs to k or b make this trick harder to deploy
- ▶ Should think carefully about how to model the costs

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- ▶ Only requires at least as many moments as underlying structural parameters.

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 - ▶ Weighting matrix is the variance-covariance of estimated moments.

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- ▶ This way we can focus the challenging estimation procedure on fewer parameters.

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Another serious problem is its reliance on asymptotic theory for most estimation and testing procedures.

- ▶ The existence of a long time series for $\{y_t\}$ is unrealistic in many panels where most of the variation is cross-sectional.

Hennessy and Whited (2007) - Matching Moment Conditions

Panel A: Moments		
	Actual Moments	Simulated Moments
Average Equity Issuance/Assets	0.0892	0.0963
Variance of Equity Issuance/Assets	0.0911	0.0847
Variance of Investment/Assets	0.0068	0.0117
Frequency of Equity Issuance	0.1751	0.2305
Payout Ratio	0.2226	0.2026
Frequency of Negative Debt	0.3189	0.3258
Variance of Distributions	0.0013	0.0037
Average Debt-Assets Ratio (Net of Cash)	0.1204	0.1104
Covariance of Investment and Equity Issuance	0.0004	0.0005
Covariance of Investment and Leverage	-0.0018	-0.0025
Serial Correlation of Income/Assets	0.5121	0.5661
Standard Deviation of the Shock to Income/Assets	0.1185	0.1057

Hennessy and Whited (2007) - Parameter Estimates

Panel B: Parameter Estimates								
α	λ_0	λ_1	λ_2	ξ	ϕ	σ_ε	ρ	χ^2
0.627	0.598	0.091	0.0004	0.104	0.732	0.118	0.684	8.018
(0.219)	(0.233)	(0.026)	(0.0008)	(0.059)	(0.844)	(0.042)	(0.349)	(0.091)

parameters, with standard errors in parentheses. λ_0 , λ_1 , and λ_2 are the fixed, linear, and quadratic costs of equity issuance. ϕ governs the shape of the distributions tax schedule, with a lower value for ϕ corresponding to a lower marginal tax rate. ξ is the bankruptcy cost parameter, with total bankruptcy costs equal to ξ times the capital stock. σ_ε is the standard deviation of the innovation to $\ln(z)$, in which z is the shock to the revenue function. ρ is the serial correlation of $\ln(z)$. χ^2 is a chi-squared statistic for the test of the overidentifying restrictions. In parentheses is its p -value.