

# Capital Structure Arbitrage

---

using non-Gaussian approach

## Presentation by:

Ramakrishnan Chirayathumadom

Ronnie Zachariah George

Venkateshwarlu Balla

Dhiraj Bhagchandka

Neeraj Shah

Kunal Shah

Sponsor:



Evnine-Vaughan Associates, Inc.



# Our Sponsor

## **EA** Evnine-Vaughan Associates, Inc.

- Equities Hedge Fund
- \$800 million in funds under management
- Founded by Jeremy Evnine and Richard Vaughan in 1994 in San Francisco
- The original founders of Iris Financial Engineering Holdings Ltd.



# Agenda

- Capital Structure Arbitrage – Overview
- Merton model
- Non-Gaussian approach
- Data
- Algorithm, Analysis, Results
- Issues, Future Work, Conclusions

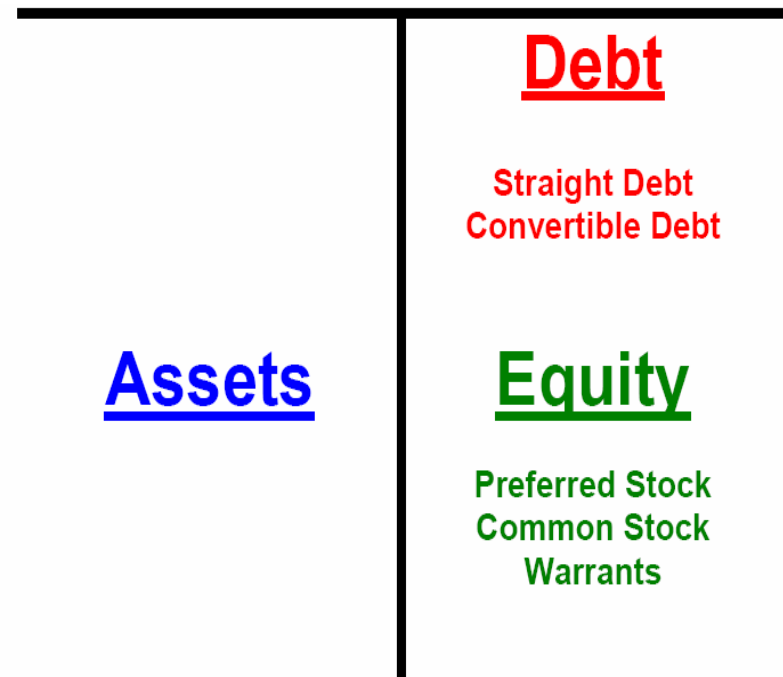
# Now...

- **Capital Structure Arbitrage – Overview**
- Merton model
- Non-Gaussian approach
- Data
- Algorithm, Analysis, Results
- Issues, Future Work, Conclusions

# Capital Structure Arbitrage

## Capital structure of a company

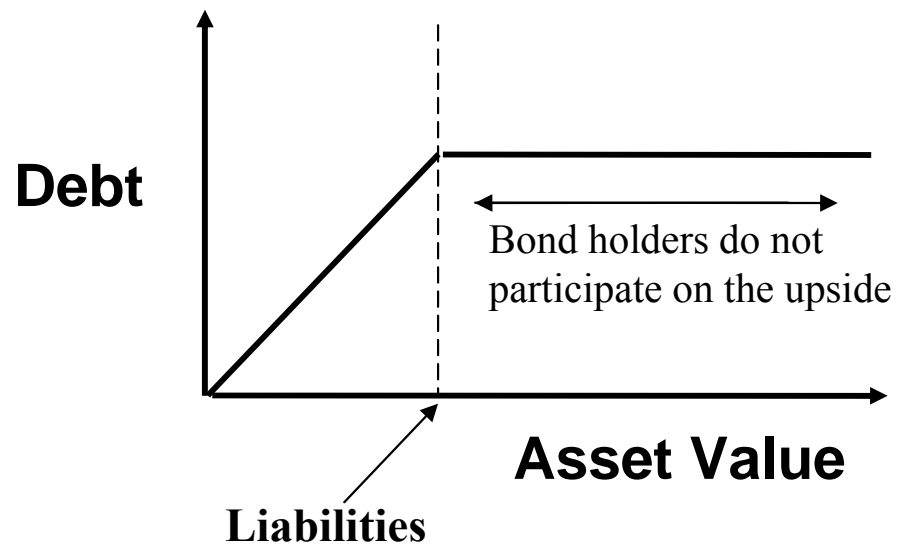
- Assets = Debt + Equity
- Modigliani & Miller (1958)
- Debt
  - Priority over Equity holders
  - No observable markets
  - Different seniority levels
- Equity
  - Equity holders paid after debt repayment
  - Observable markets exist
  - Different priority levels



# Capital Structure Arbitrage

Why does Capital Structure Arbitrage exist?

- Debt should be priced “fairly” to reflect the true state of the company. No fair market valuation of most debt instruments
- Black, Scholes (1973)
- No “correct” market valuation of the assets of the company!!!



Potential arbitrage opportunities exist if market price of debt cannot be “justified” by its capital structure

# Capital Structure Arbitrage

## Capital Structure Arbitrage Outline:

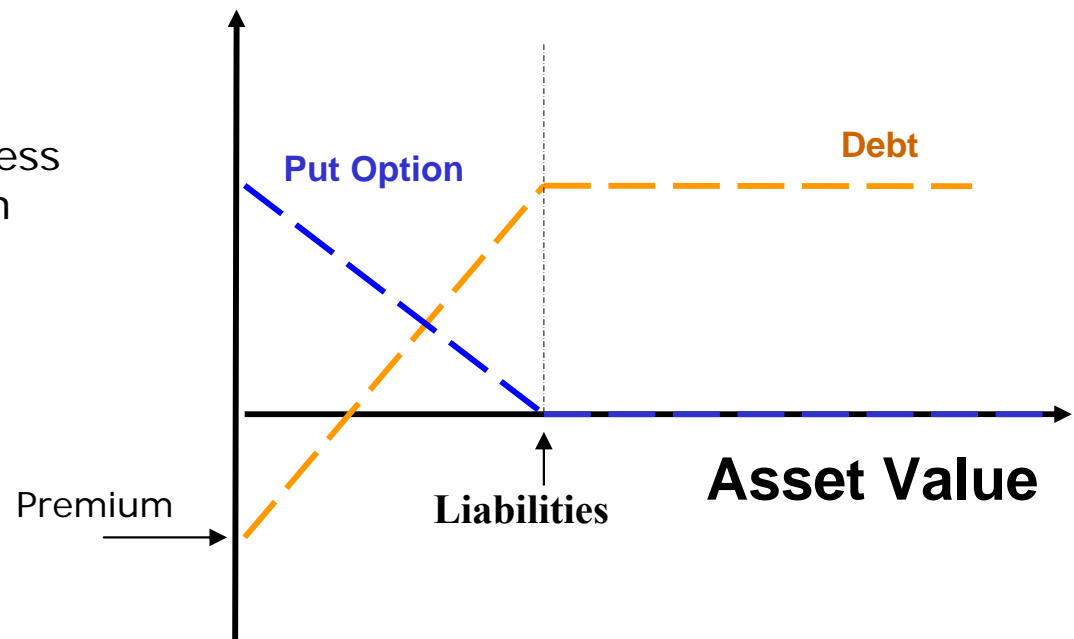
- A trader believes that debt of a company is under priced
- Trader purchases the “cheap” corporate bonds
- Hedges his position by purchasing puts on the stocks

### “No Default”

- Receives yield on bond in excess of what he paid for put option

### “Default”

- Receives strike price less premium



# Now...

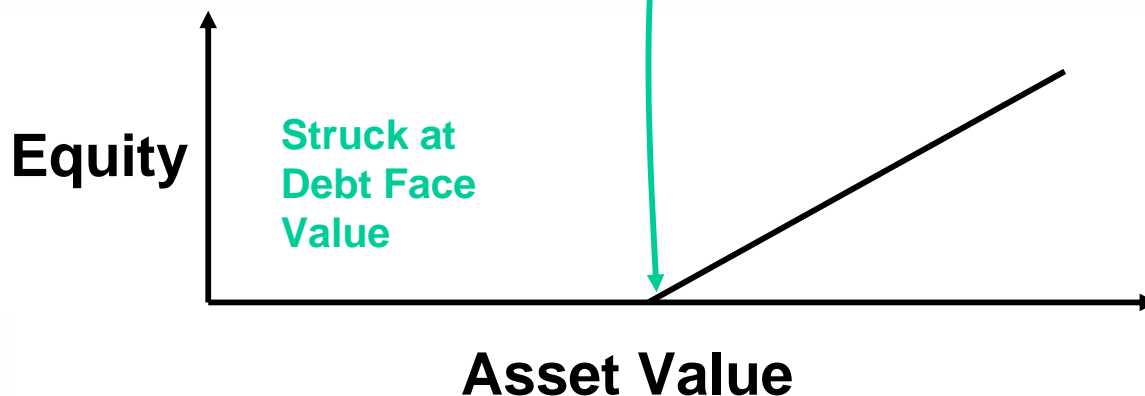
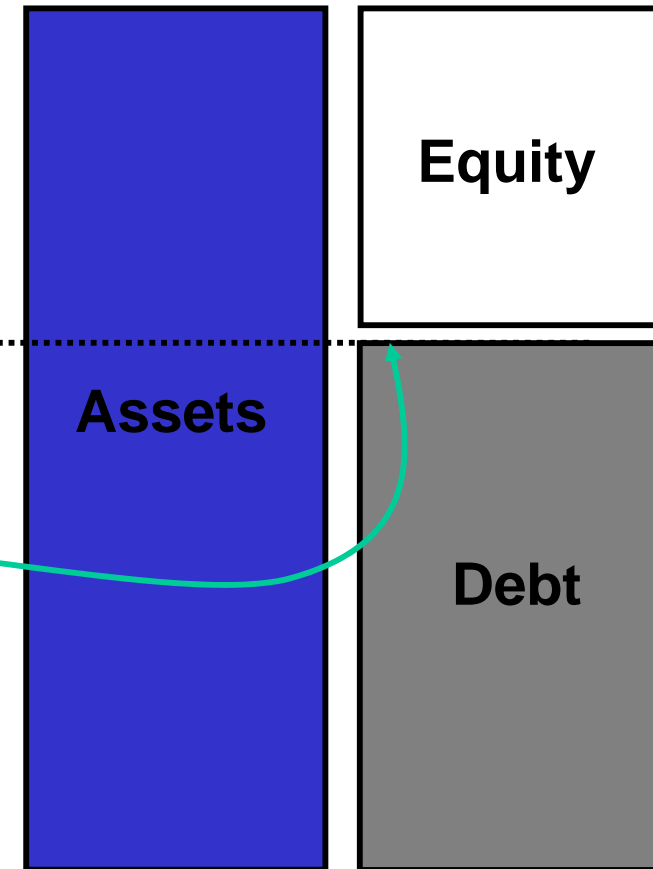
- Capital Structure Arbitrage – Overview
- **Merton model**
- Non-Gaussian approach
- Data
- Algorithm, Analysis, Results
- Issues, Future Work, Conclusions



# Merton Model (1974)

- Equity is a call option on underlying assets of firm

| Suppliers of Capital      | Payoffs to Suppliers of Capital<br>at Bond Maturity |              |
|---------------------------|---|--------------|
|                           | If $A_T \leq F$                                     | If $A_T > F$ |
| Bondholders receive       | $A_T$   | $F$          |
| Stockholders receive      | 0   | $A_T - F$    |
| Total capital distributed | $A_T$   | $A_T$        |

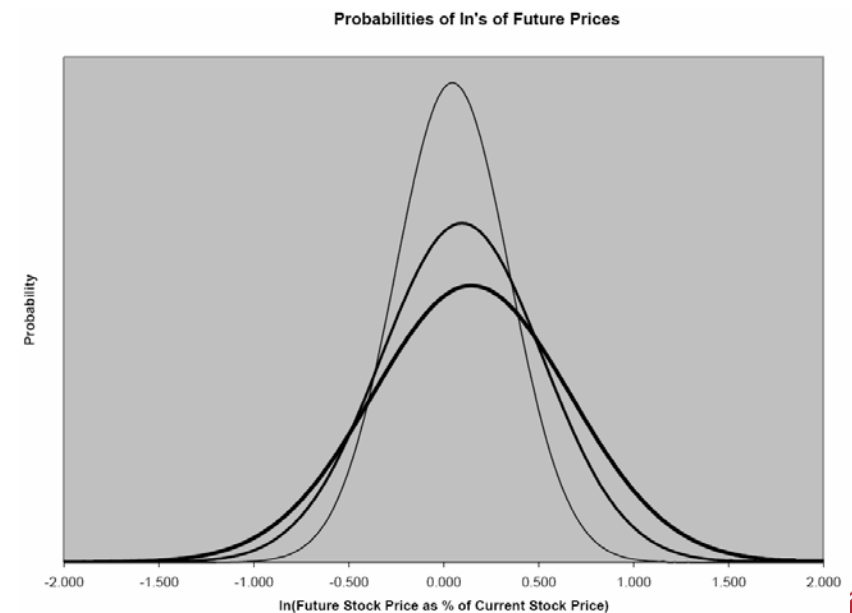
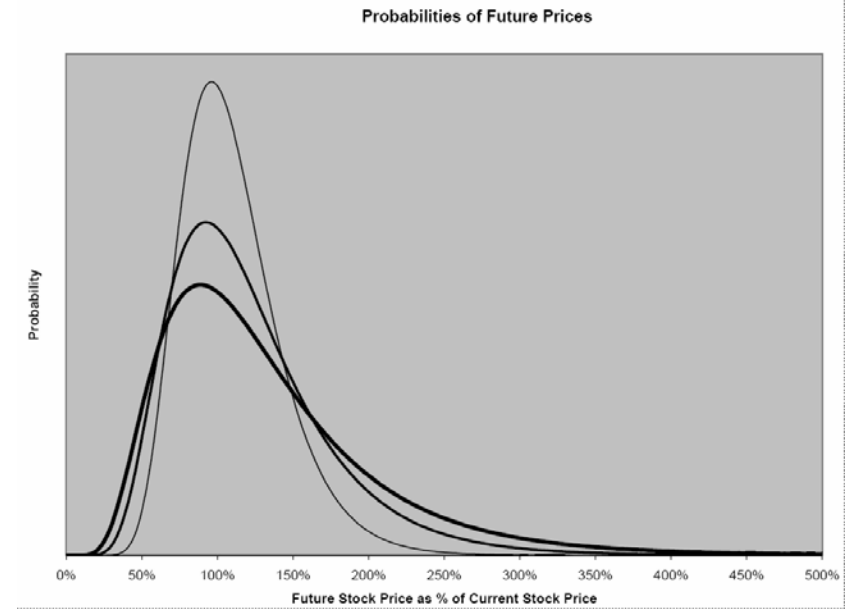


# Merton Model

- Key assumptions
  - Underlying assets follow stochastic log normal process
  - Debt in terms of single zero coupon bond
  - Black-scholes valuation for European call option

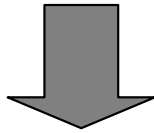
- Asset Process:

$$dA = \mu A dt + \sigma A dz$$

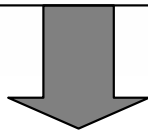


# Merton Model – credit spread

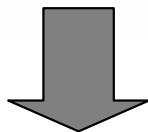
$$E_T = \max[A_T - D, 0]$$



$$E_0 = A_0 N(d_1) - D e^{-rT} N(d_2)$$



$$B_0 = A_0 [N(-d_1) + LN(d_2)]$$



$$s = y - r = -\ln [N(d_2) + N(-d_1)] / L / T$$

$$E_0 \sigma_E = \frac{\partial E}{\partial A} A_0 \sigma_A$$

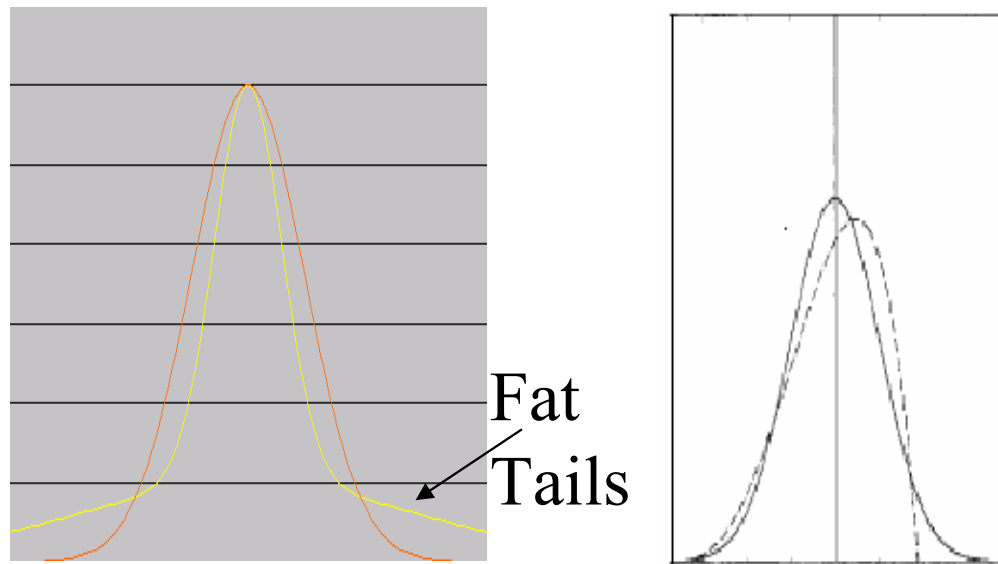
Assets = Equity + Debt

Implied credit spread!

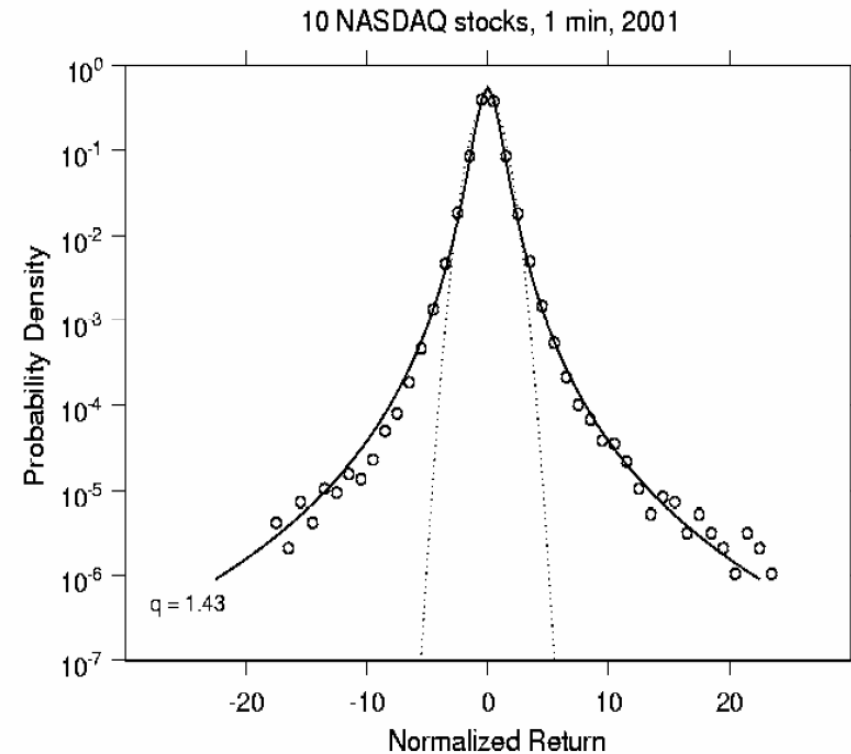
# Now...

- Capital Structure Arbitrage – Overview
- Merton model
- **Non-Gaussian approach**
- Data
- Algorithm, Analysis, Results
- Issues, Future Work, Conclusions

# Non-Gaussian process



- Stock distributions have fat tails as well as skew
- Special distributions:  
Tsallis fits & explains data better
- Asset is underlying to stock  
=> asset process non-Gaussian



- o Empirical
- Gaussian
- $q=1.43$  Tsallis Distribution

Courtesy: Lisa Borland, EVA Funds

# Tsallis distribution

Asset Stochastic Process

$$dA = \mu A dt + \sigma A^\alpha d\Omega$$

$$d\Omega = P(\Omega)^{\frac{1-q}{2}} d\omega$$

Feedback term

Tsallis distribution

$\alpha$  is “skew”

$q$  is “smile”

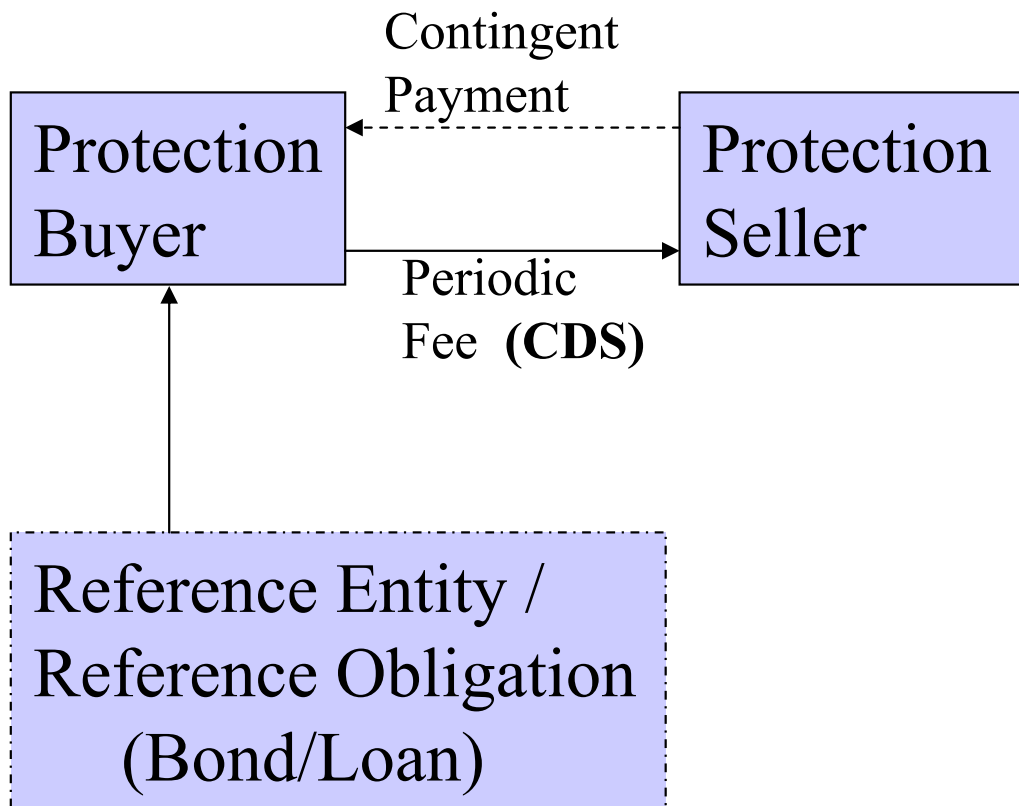
Fat tails giving  
higher extreme returns

Tsallis distribution becomes Gaussian with  $\alpha=1$  and  $q=1$

$$\frac{\partial F}{\partial t} + rS \frac{\partial F}{\partial S} + \frac{1}{2} \frac{\partial^2 F}{\partial S^2} \sigma^2 S^2 P(\Omega)^{1-q} - rF = 0$$

Generalized Black-Scholes PDE

# Credit Default Swaps & Arbitrage



- CDS – transaction
- CDS spread = credit spread
- Credit spread mis-pricing can be used for arbitrage
  - sell CDS at high price and buy bonds at low
  - buy CDS at low price and sell bonds at high spread
- Trading spreads: buy CDS & sell options (achieve +ve theta) etc

# Now...

- Capital Structure Arbitrage – Overview
- Merton model
- Non-Gaussian approach
- **Data**
- Algorithm, Analysis, Results
- Issues, Future Work, Conclusions



# Project Focus

- Implementation of the capital structure arbitrage theory in a non-Gaussian setting
- Observables – equity price, equity volatility, time to maturity, total assets, long-term debt, risk-free interest rate
- Calculated values –  $q$  and alpha values, credit spread
- CDS data for comparing the actual credit spread against the calculated credit spread

# CDS Data

- Provides insurance against a default by a particular company or sovereign entity
- In theory, close to the credit spread of the yield on a n-year par yield bond issued by the reference entity over n-year par yield risk-free rate
- CDS quotes<sup>1</sup> for each company taken according to the time to maturity of its bonds

1. Courtesy Lombard Data Systems

# Equity Data

- **CDS data**
- **Equity price**
- **Equity volatility**

- Equity prices<sup>1</sup> taken for the observed period
- Adjusted closing price taken for this purpose
- Historic volatility estimated using the daily stock prices of that particular quarter

1. Taken from CompuStat

# Balance-sheet Data

- **CDS data**
- **Equity price**
- **Equity volatility**
- **Total assets**
- **Long-term debt**

- Book value of assets<sup>1</sup> compiled
- Book value of long term debt<sup>1</sup> obtained

1. Taken from CompuStat

# Interest Rate and “T”

- **CDS data**
  - **Equity price**
  - **Equity volatility**
  - **Total assets**
  - **Long-term debt**
  - **Risk-free rate**
  - **“T”**
- 
- Risk-free interest rate taken for each data-point
  - ‘T’ – time to maturity taken as weighted average of different time to maturity for different bonds

# Merging the Data

- **CDS data**
- **Equity price**
- **Equity volatility**
- **Total assets**
- **Long-term debt**
- **Risk-free rate**
- **“T”**

- In total, 54 companies were chosen across various sectors such as Retail, Communication, Aerospace, Finance, Energy etc
- Companies chosen with different market cap sizes
- Data for each company was taken for January 2000 to December 2003 at quarter-end points

# Now...

- Capital Structure Arbitrage – Overview
- Merton model
- Non-Gaussian approach
- Data
- **Algorithm, Analysis, Results**
- Issues, Future Work, Conclusions

# Algorithm

Assume a 'q' and 'α' pair

To apply the non-gaussian routine, the asset volatility is required.  $\sigma_A(q, \alpha, k)$  is obtained by exploiting the nonlinear parity relationship <sup>1</sup>

$$E(q, \alpha, \sigma_A, k) / A_0 = dE / dA_0(q, \alpha, \sigma_A, k) \sigma_A / \sigma_E$$

where **k** are other available parameters

The Asset Value needed is more accurately calculated using the observed equity quote as  $A_0 = E_0 / E(q, \alpha, \sigma_A, k)$

CDS Spread calculated is computed using the above parameters and compared to the CDS Spread quote.

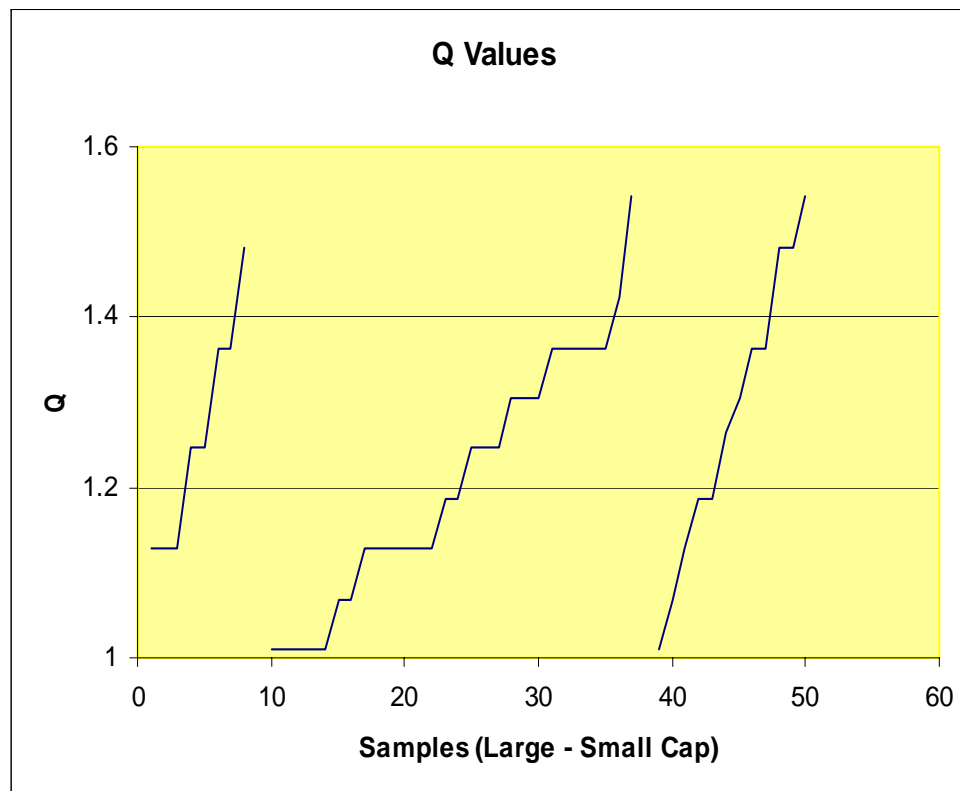
$q^*, \alpha^* = \arg \min \sum [ \text{CDS Spread calculated} - \text{CDS Spread quote} ]^2$   
over all available data points

<sup>1</sup> Merton's model, Credit Risk and Volatility skews – Hull, Nelken & White (2003)



# Analysis

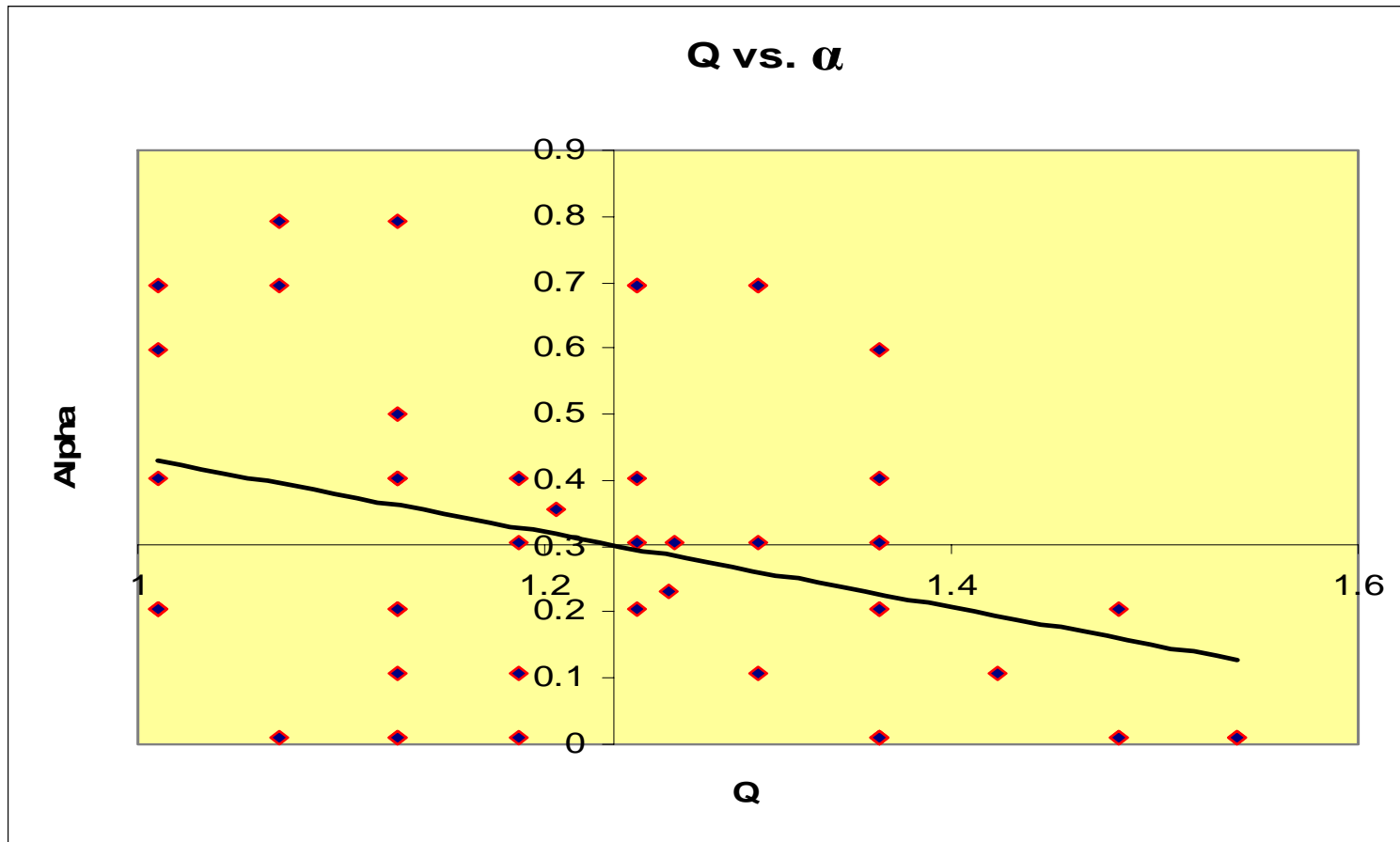
- Analyzing all the samples,  $q_{\text{avg}} = 1.23$  and  $\alpha_{\text{avg}} = 0.3$   
These values provide a zeroth order estimate to evaluate asset processes
- Target companies split into buckets by Market Cap and cross-segregated by sector
- $q, \alpha$  tested for predictability: all ranges of  $q$  are found in all size buckets



- Higher  $q$  (implying fatter tails) are less frequent in larger company observations
- 
- The asset volatilities and  $q$  values are slightly lower on average than those measured directly on equity

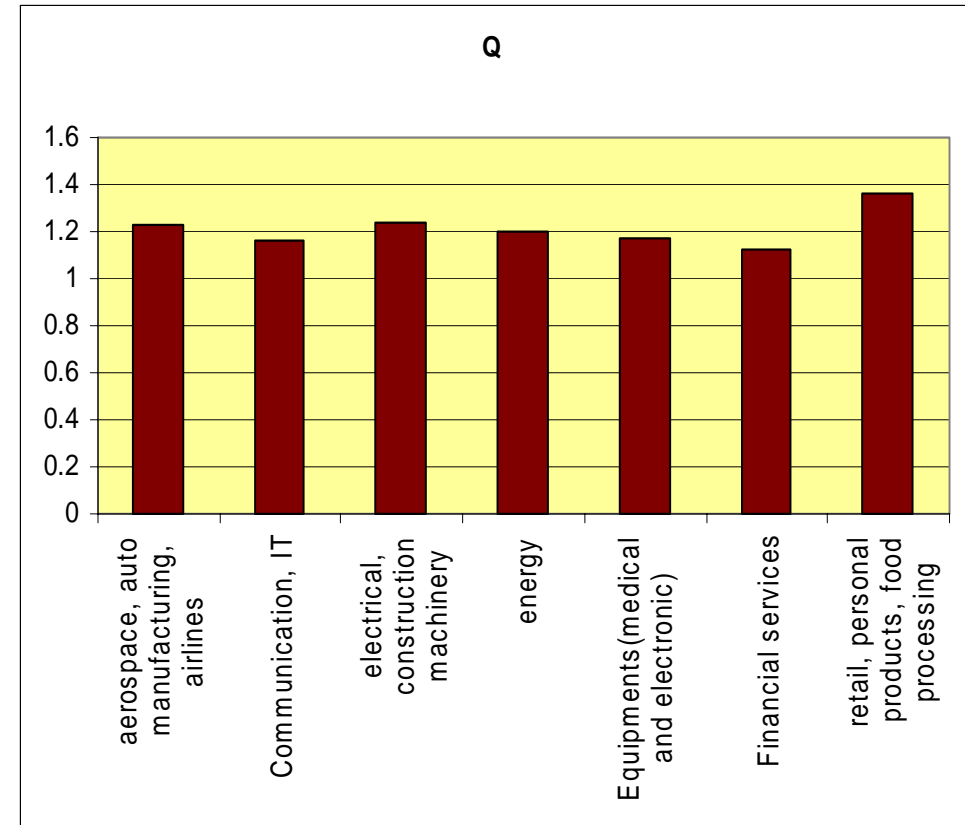
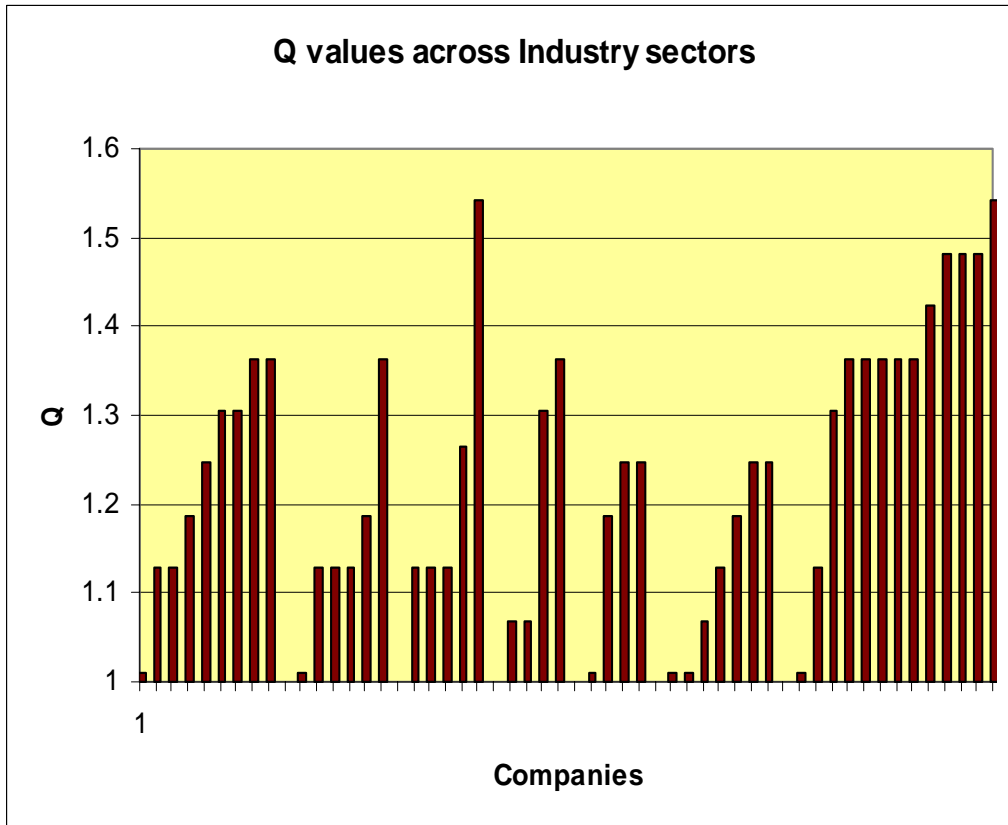
# Analysis

- $q$  and  $\alpha$  are essentially independent. These values reinforce the requirement to determine both these parameters to capture the model completely



# Analysis

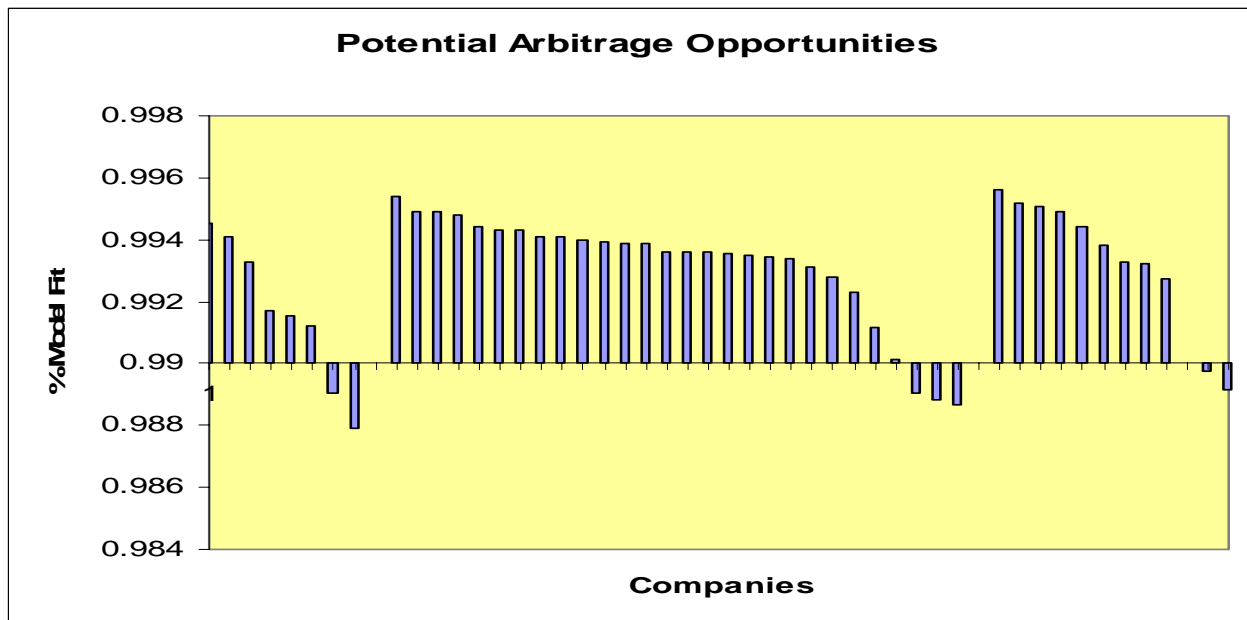
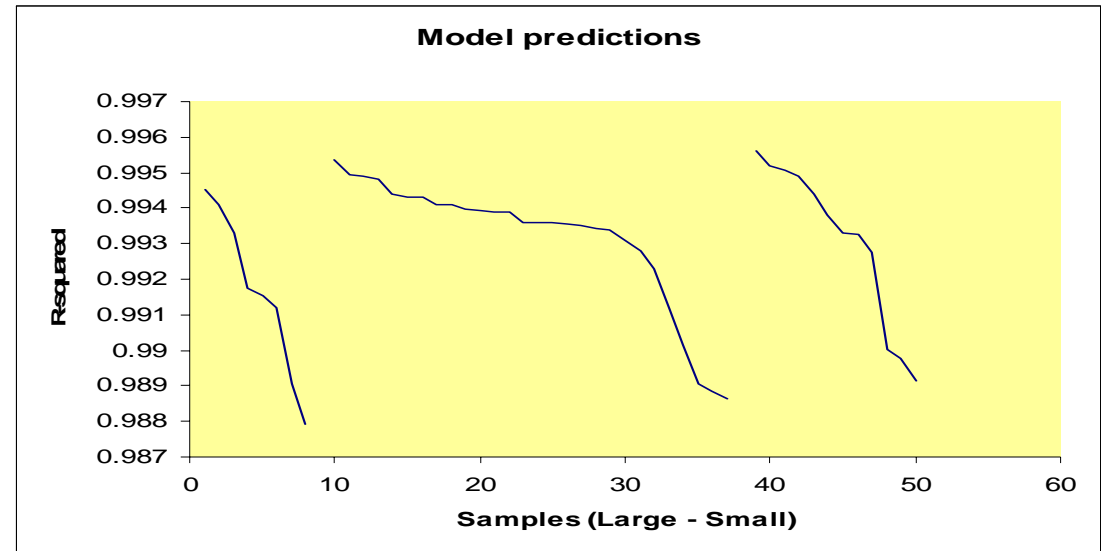
Sectors 1 through 7 are Aerospace, Communication, Construction, Energy, High tech equipment, Financial services and Retail



These values are fairly stable across industries

# Reliability

- All samples showed very high R-squared error with the model when measured at the observed CDS spread point
- On a closer observation however, some samples were markedly “less tractable” than others:



- Here, a select few show  $< 99\%$  matches
- Prime candidates for further examination

# Now...

- Capital Structure Arbitrage – Overview
- Merton model
- Non-Gaussian approach
- Data
- Algorithm, Analysis, Results
- **Issues, Future Work, Conclusions**

# Issues

- Code not stable for certain ranges of inputs
- CDS spread approximated by Bond Yield spread
- Equity as an Option on the Asset process can cause a departure from the lognormal distribution
- Estimation of Asset Value and Variance

# Scope for future work

- Calculate various risk parameters (Greeks) numerically w.r.t to non-Gaussian model

$$\Delta = dC / dS$$

$$\Gamma = d^2C / d^2S$$

$$\Theta = dC / dT$$

$$\text{Vega} = dC / d\sigma$$

$$O = dC / d(\text{OAS}), \text{ oas: option adjusted spread}$$

- Why are these important – protection against un-hedged ‘calamities’
- Omicron neutral hedging<sup>2</sup>
- Re-create results for other choices of T
- Time stability analysis of q, alpha

<sup>2</sup> *Capital Structure Arbitrage Strategies: Models, Practice and Empirical Evidence* - Oliver Berndt and Bruno Stephan Veras de Melo, November 2003, Lausanne, Switzerland

# Conclusions

- 1) The non-Gaussian model is found to be very effective in estimating the CDS spread quotes
- 2)  $Q$  and  $\alpha$  need to be evaluated independently and show little correlation and the above are stable over industry sectors and company sizes
- 3) The model is particularly useful in calculating the Omicron risk parameter allowing for development of effective hedging strategies



# Acknowledgements

**Lisa Borland (EVA)** *for her timely advice, encouragement and help with the code*

**Jeremy Evnine (EVA)** *for his useful insights on capital structure arbitrage*

**Lombard Data Systems** *for providing us with CDS data*

**Sachin Jain** *for his suggestions, help and feedback during the course of our project*

**Prof. Rob Luenberger** *for his advice and support*

# Questions / Comments

