

# **UNDERSTANDING UNCERTAINTY IN LOSS RATIO ESTIMATION: A TOP-DOWN APPROACH**

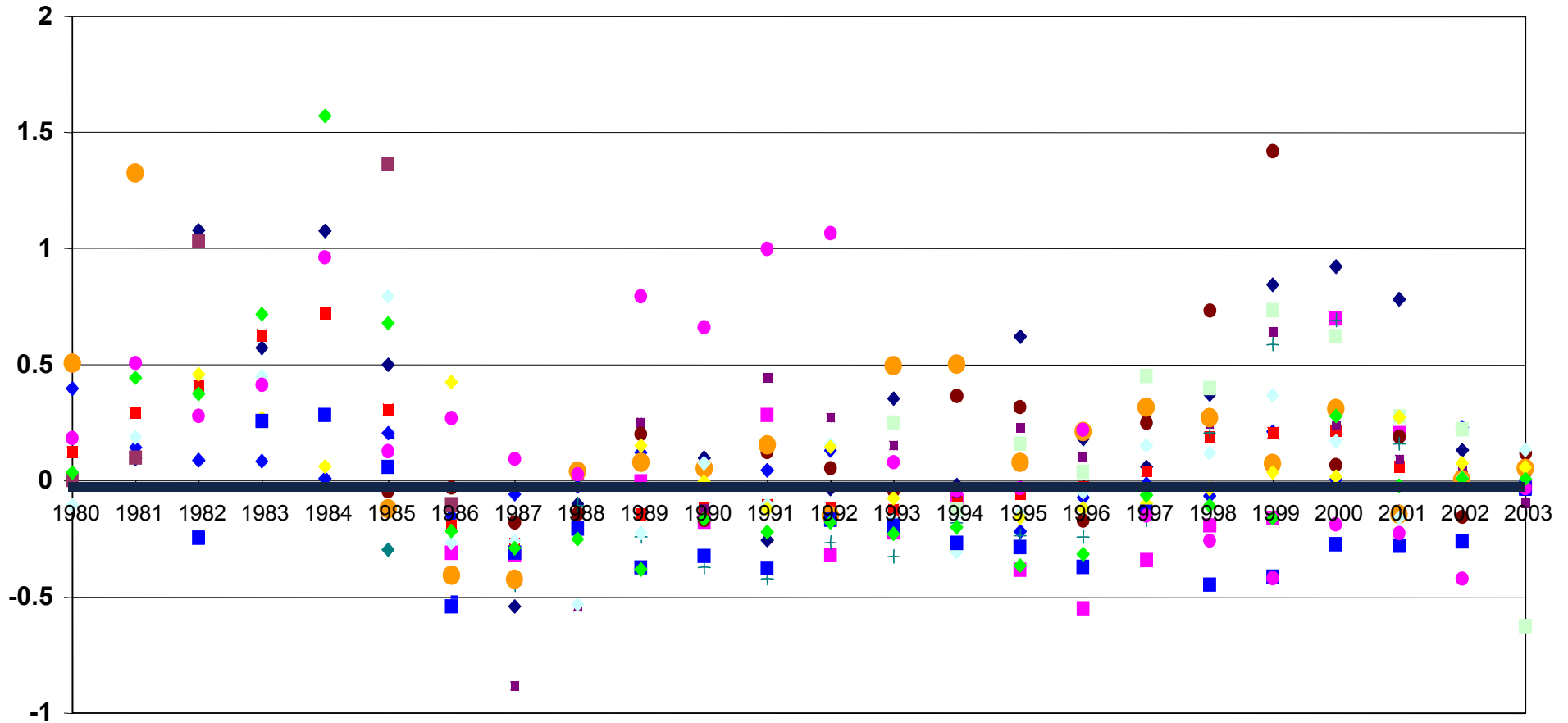
# CONTRIBUTING FACTORS

- Factors contributing to uncertainty in LR estimates include
  - data issues (flawed data; finite sample size)
  - projection issues (selection of trend, development, OLF)
  - judgmental adjustments for factors that not directly quantified
  - unforeseen external influences (law / coverage changes)
- Most research has focused on effects of finite sample size
- But this is not the only issue – and often not the most important

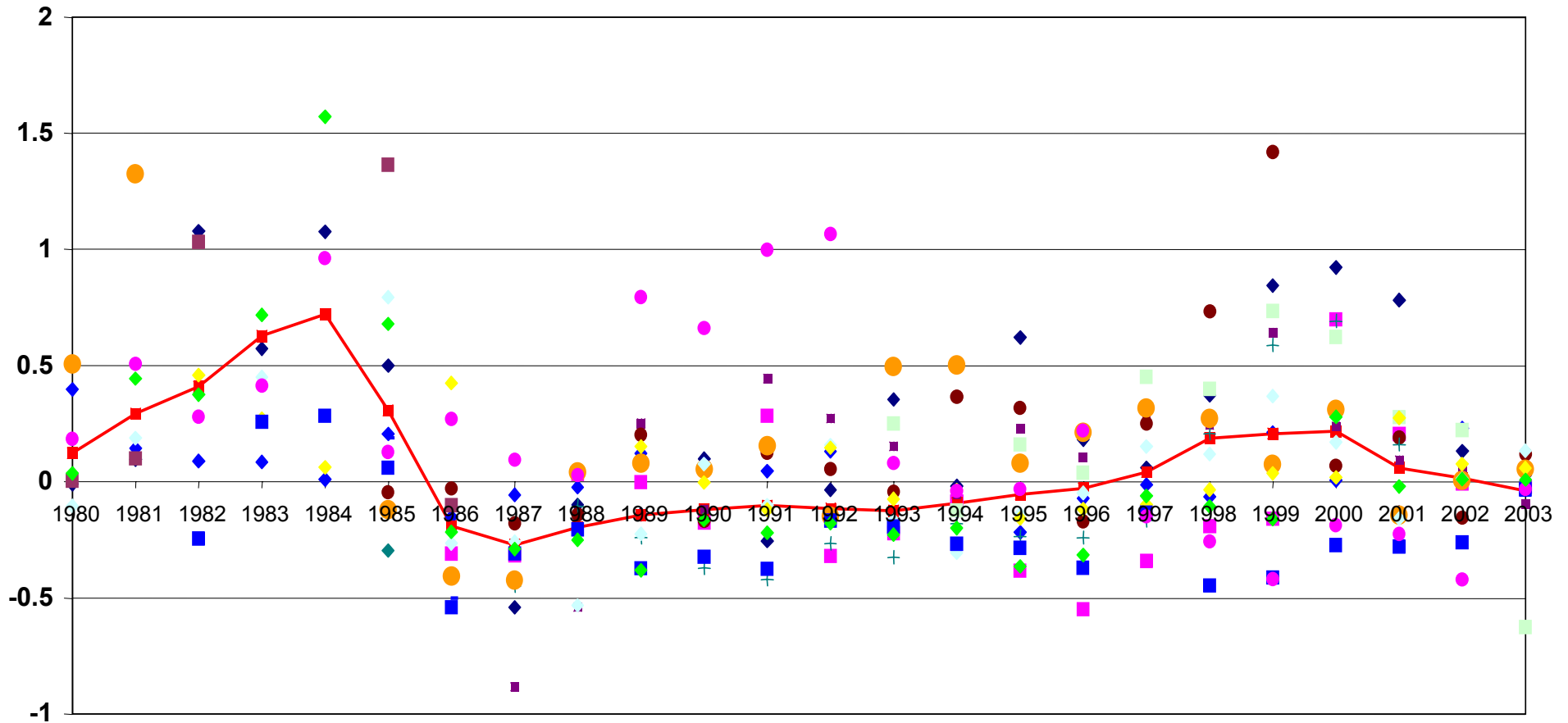
# CONTRIBUTING FACTORS

- Usually companies do a good job of estimating LRs
- But sometimes the industry as a whole is very wrong
  - Supports idea that finite sample size is not the key driver of estimation error
- For long-tail casualty lines:
  - LR estimation error correlated to the market cycle
  - Persists over a number of years
  - Not surprising since in these lines it takes longer for the effects of changing influences to become fully evident

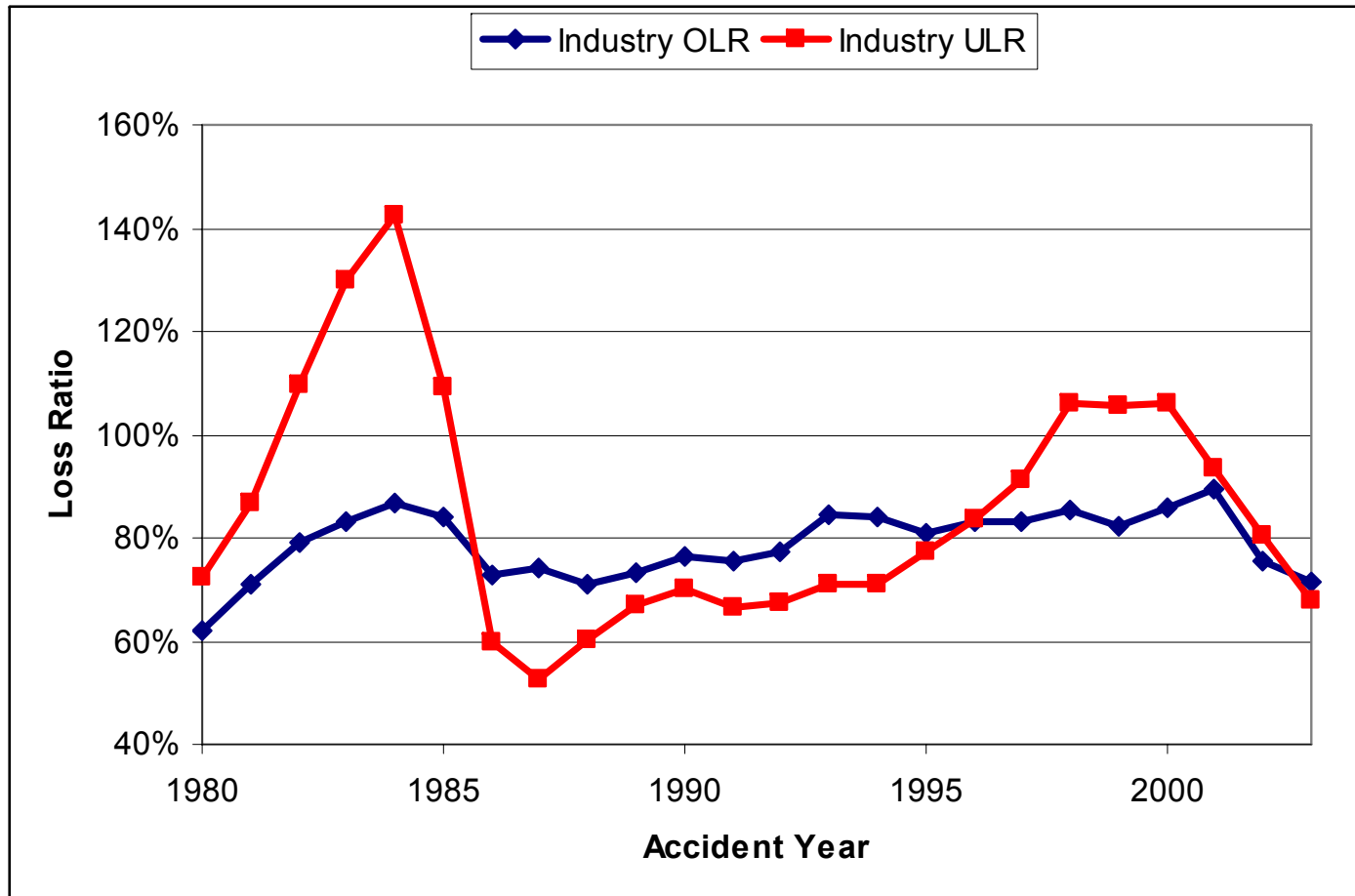
# OTHER LIABILITY OCCURRENCE: % CHANGE FROM OLR TO ULR



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# OTHER LIABILITY OCCURRENCE: % CHANGE FROM OLR TO ULR



- Clearly some error is not diversifying away
- Magnitude and direction of industry error change over time

# TOP-DOWN APPROACH

Define estimation error ratio  $R = ULR / OLR$

For a single company: average over a long time frame yields “company bias”

- Might differ from 1.0 depending on reserve strategy

For a single accident year: average over a large number of companies yields “industry delusion” for that accident year

- Difference between industry’s initial view of loss potential for that AY and true loss potential

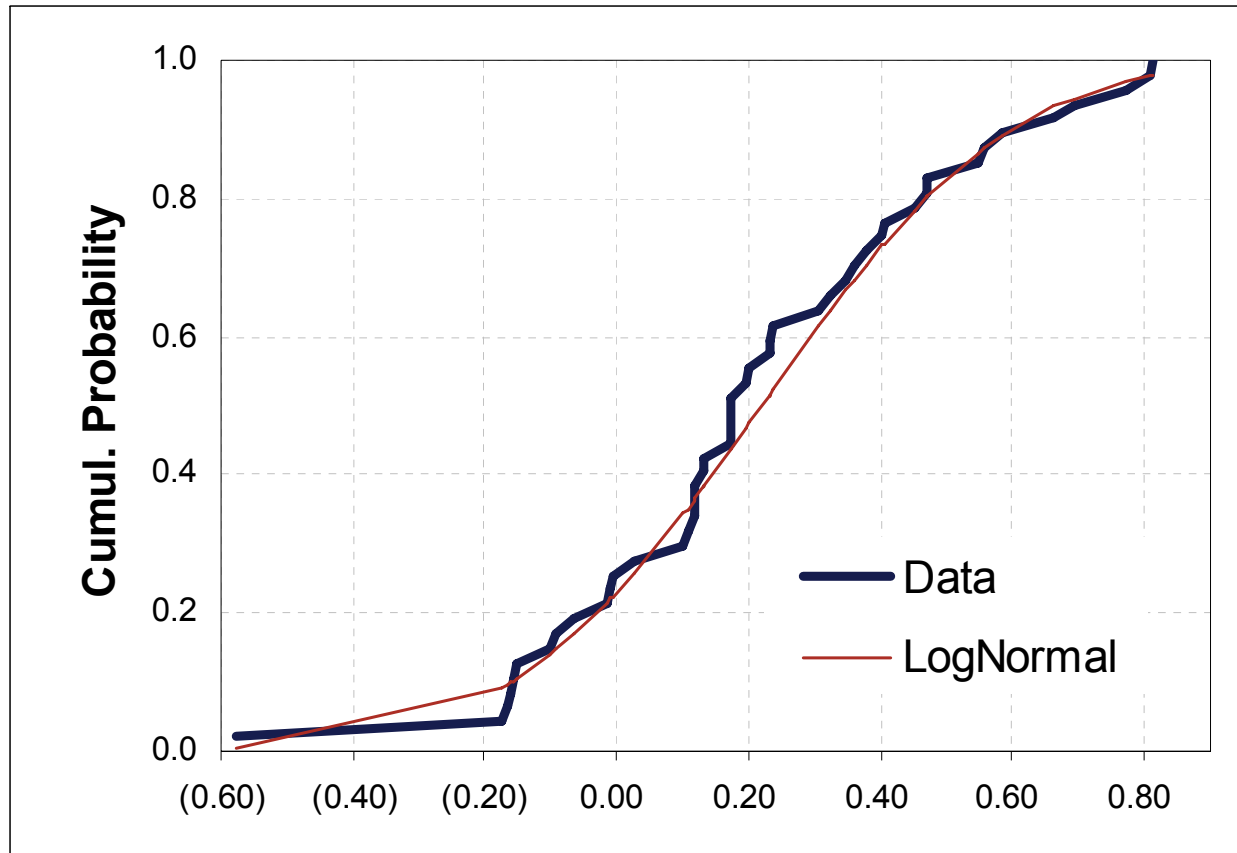
# TOP-DOWN APPROACH

## Key findings: Other Liability Occurrence

- For each accident year the R values are lognormally distributed across companies
- The mean and standard deviation of these lognormal distributions are linked
- The lognormal  $\sigma$  parameter can be approximated as a function of the  $\mu$  parameter
- The  $\mu$  parameter can be analyzed using time series methods

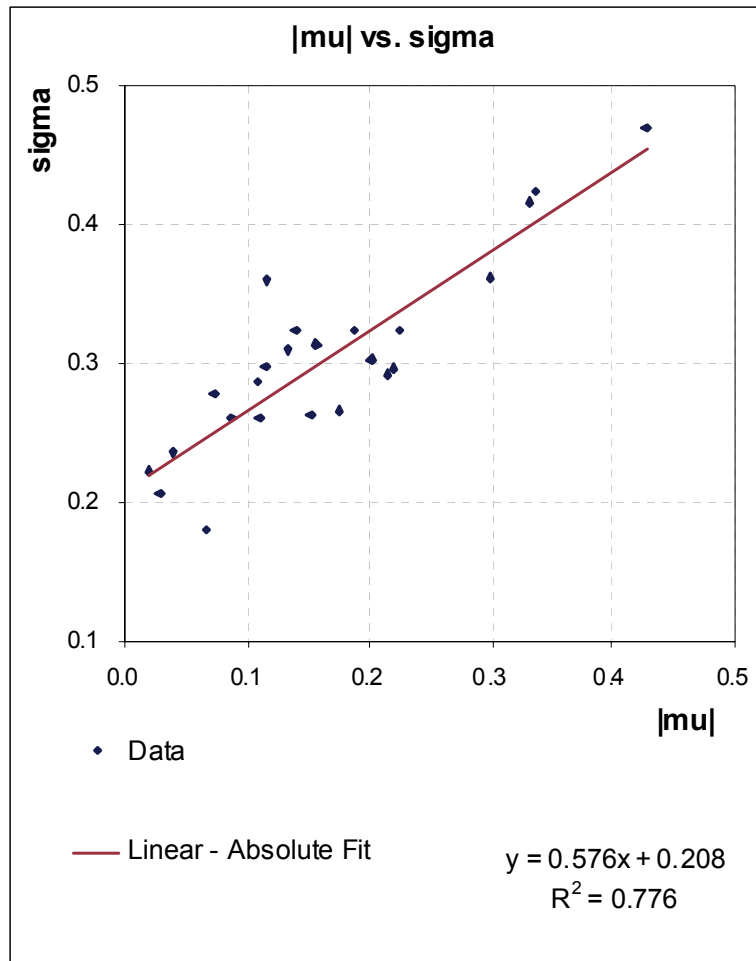


# LOGNORMAL FIT



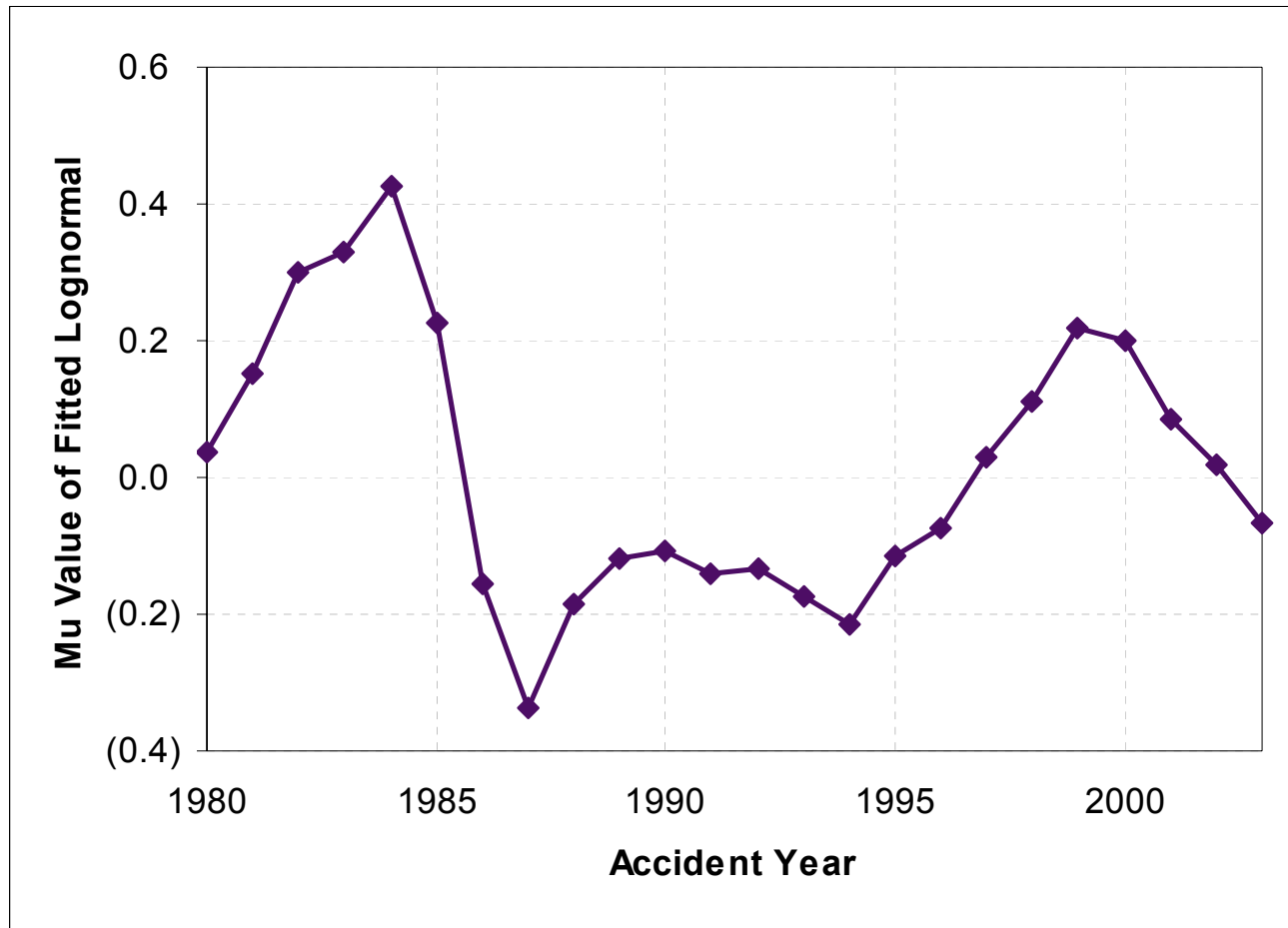
Sample lognormal fit to  $R(c, t_i)$  by method of moments (AY 1999)

# LINKAGE OF LOGNORMAL PARAMETERS

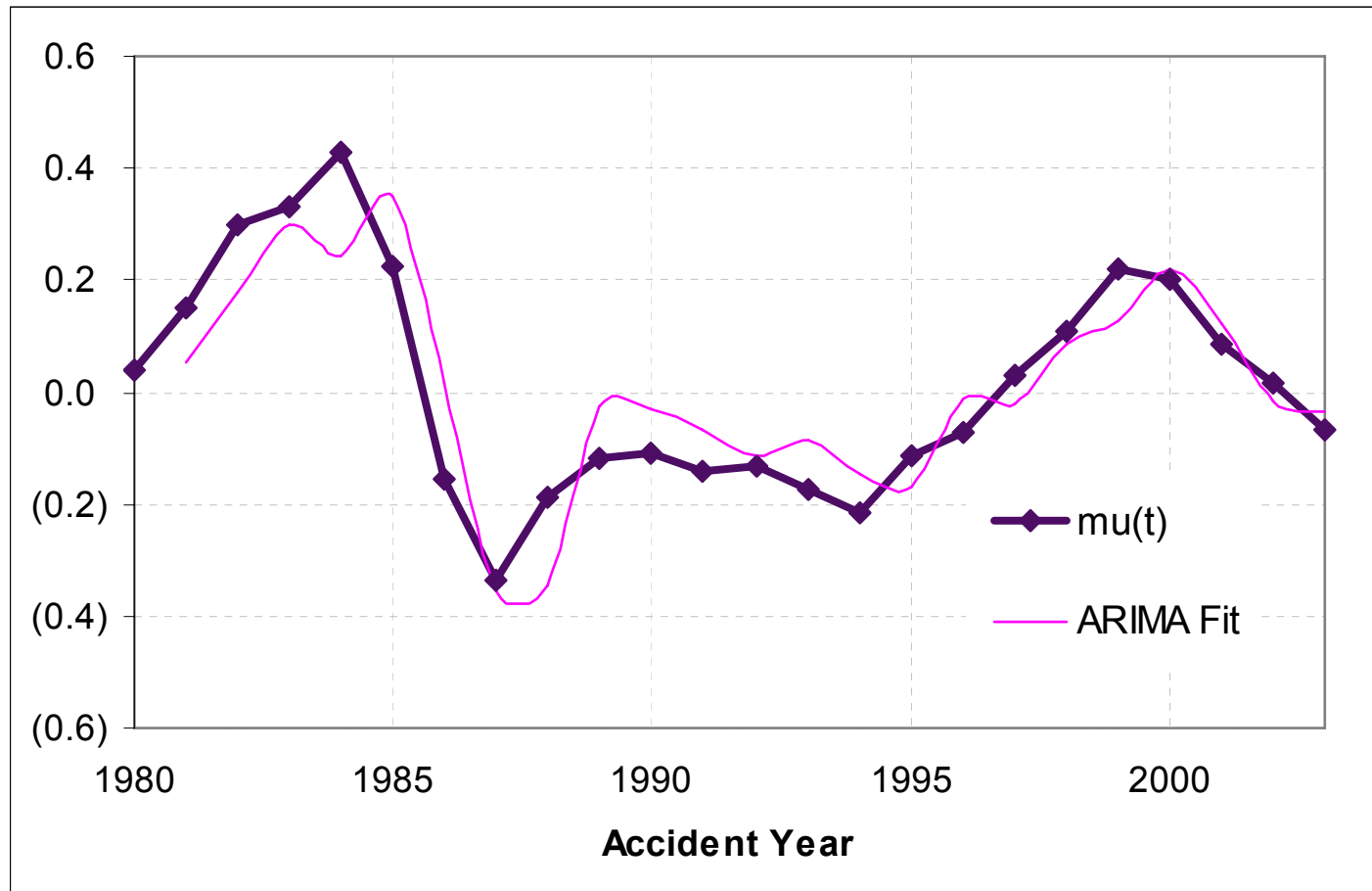


The  $\sigma$  parameter can be approximated as a function of the  $\mu$  parameter

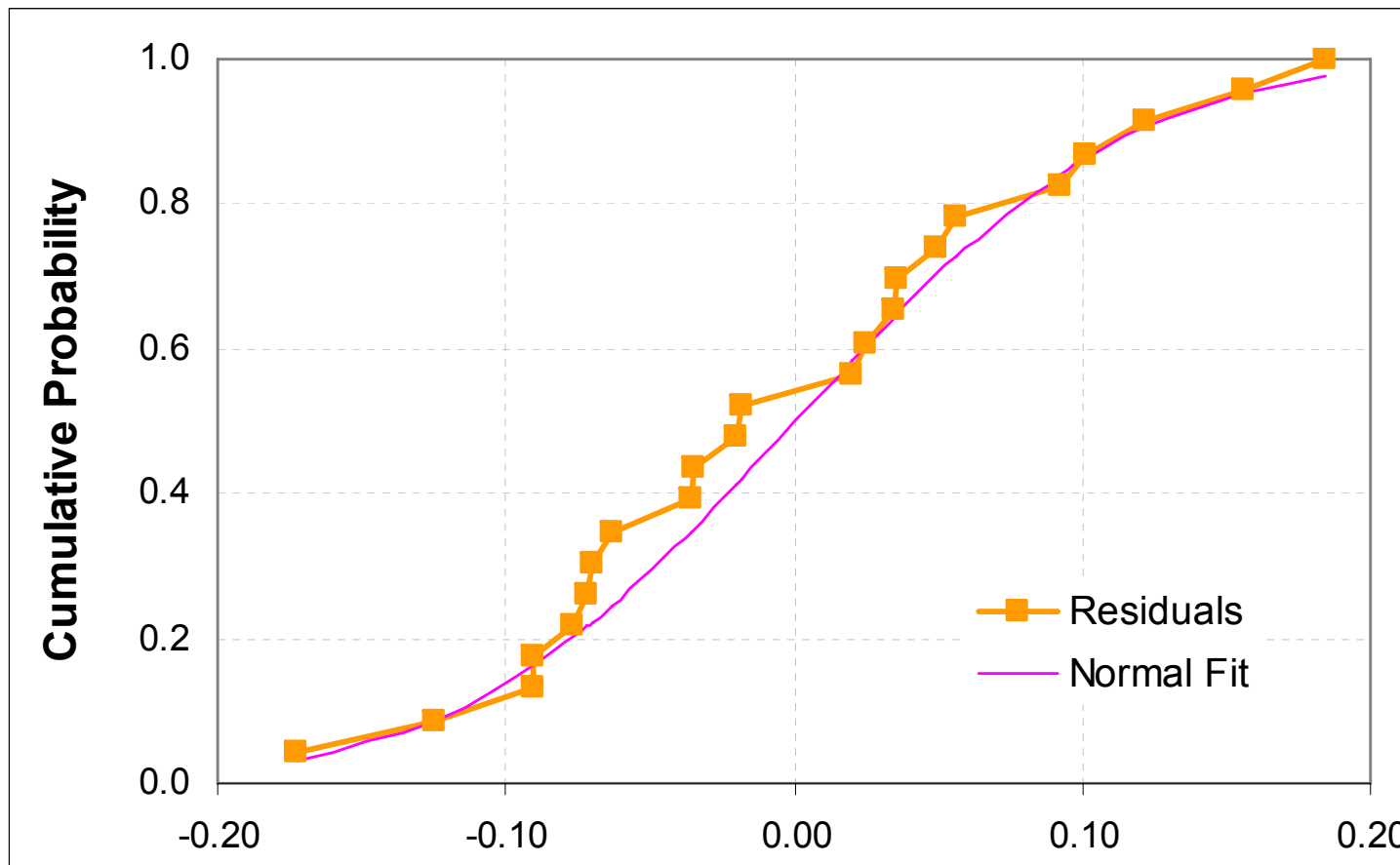
# BEHAVIOR OF $\mu$ PARAMETER OVER TIME



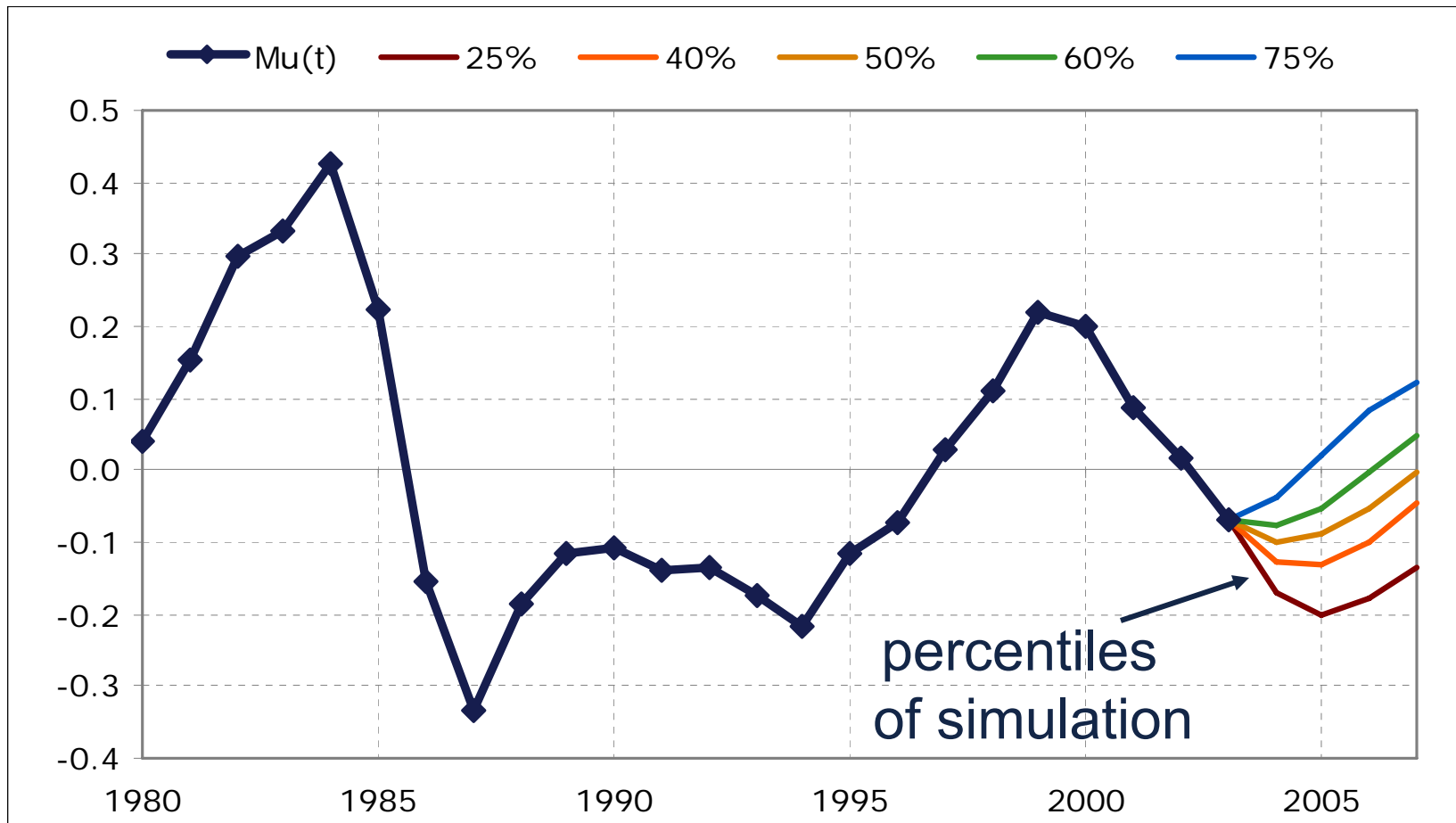
# AR(2) MODEL



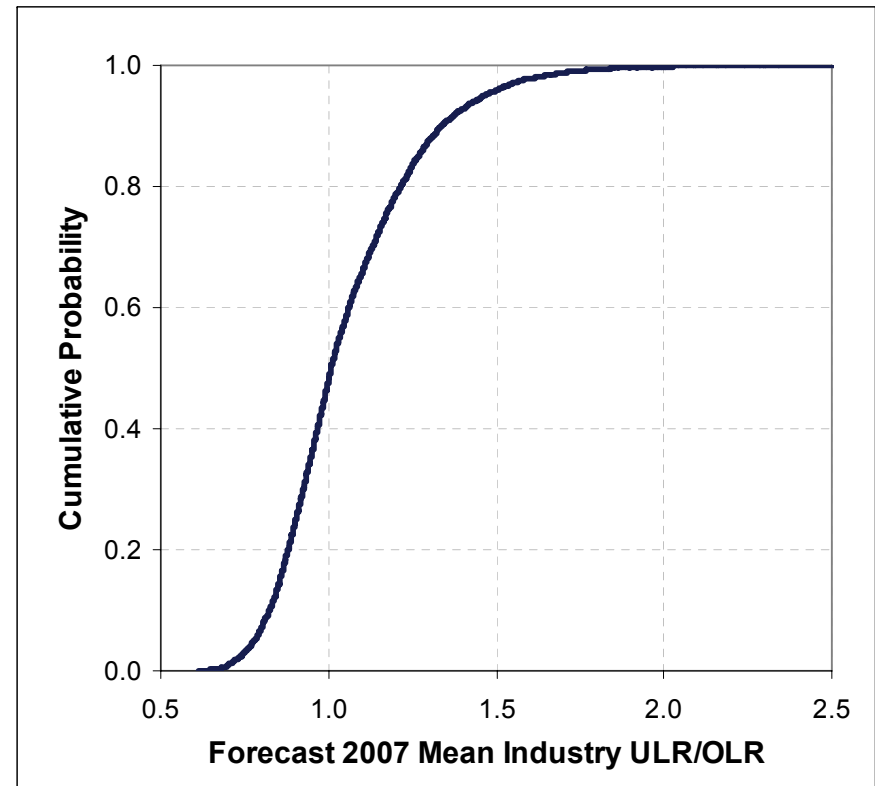
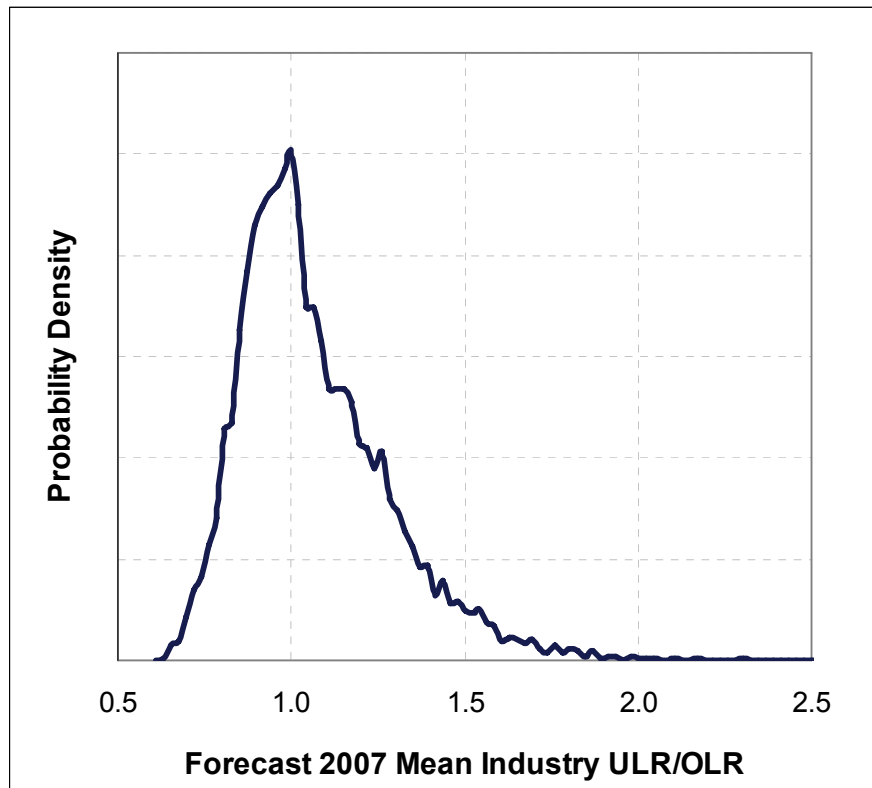
# RESIDUALS OF AR(2) MODEL



# FORECASTING VIA SIMULATION



# FORECASTING VIA SIMULATION



# BACK-TESTING

Compared  $\mu$  values fitted to data to the percentiles of the forecast distributions

Quintile	Observed	Observed Percentage		Theoretical
	Count	Incremental	Cumulative	Cumul. %
1	4	27%	27%	20%
2	2	13%	40%	40%
3	5	33%	73%	60%
4	4	27%	100%	80%
5	0	0%	100%	100%
Total	15	100%	100%	100%

Observations fit theoretical quintiles reasonably well



# OBSERVATIONS

Do not necessarily expect future  $\mu$  values to fall at the center of forecast distribution

- Not a precise point estimate of future  $\mu$
- Not a crystal ball to predict shifts in market

However, useful in predicting the range of future  $\mu$  values

- How likely is the industry to get it wrong, and by how much?

# CAVEATS

- Imperfect data
- ULR approximation
- External “shock” influences
- Intrinsic “component” influences
- Company-specific behavior

Note: back-testing suggests tail of forecast may be somewhat conservative... but with only 15 data points cannot draw firm conclusion

# CONCLUSIONS

- Advantages of top-down approach
  - By its nature, incorporates all sources of estimation error
  - Does not require contemplation of dependencies among them
- Time series analysis can help quantify the likelihood and magnitude of estimation error for current and future accident years at the industry level
- May be useful in
  - Stress testing
  - Making reinsurance decisions
  - Conducting dynamic financial analysis
  - Applying enterprise risk management techniques

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