



# STRATEGIC ANALYTICS

## ***Predicting Credit Score Calibrations through Economic Events***

***Joseph L. Breeden, Ph.D.  
President, COO, & Chief Scientist***

***Michael A. Smith  
Chief Software Architect***

# **Overview**

---

- **Review of Score-Odds Calibrations**
- **Understanding Portfolio Dynamics**
- **Dual-time Dynamics**
- **Scenario-based Forecasting**
- **Score-Odds Predictions**



**STRATEGIC ANALYTICS**

## **Review of Score-Odds Calibrations**

**Copyright © 2002 Strategic Analytics  
Inc.**

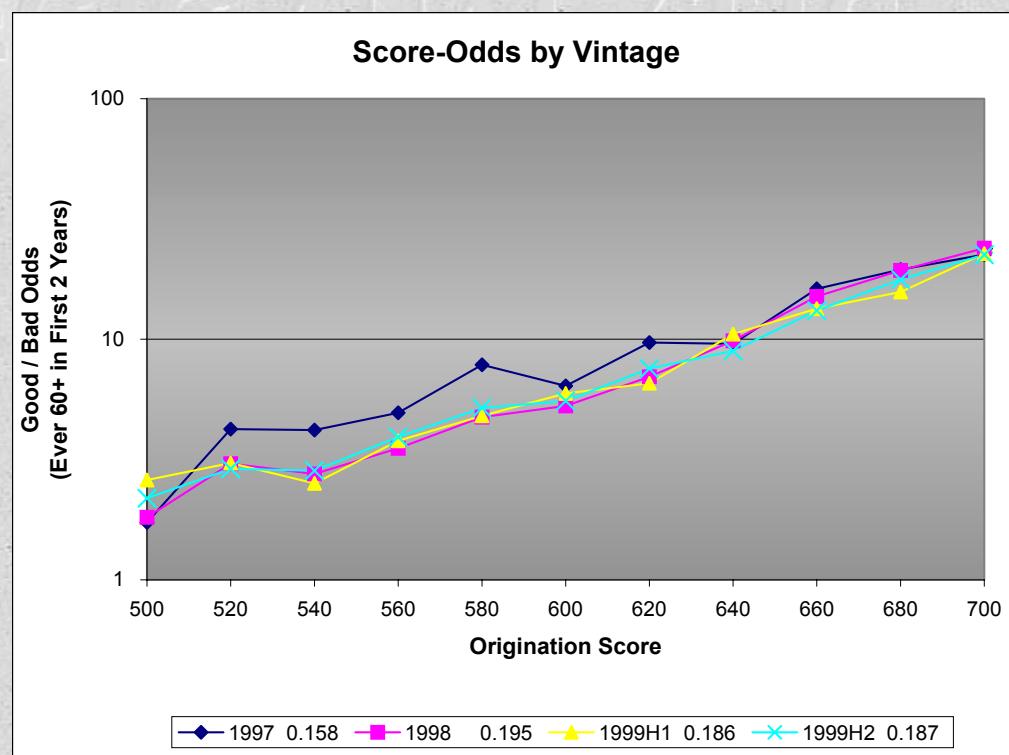
# **Score-Odds Analysis**

---

- Bureau scores have been shown to maintain effective rank ordering of consumers through a variety of environments.
- Score-odds calibrations calibrate credit scores to the specific odds of delinquency.
- For purposes of managing new originations, a common approach is to plot the odds of ever being 60+ DPD during the first 2 years of product ownership versus the score at origination.
- Re-estimation of score-odds calibrations are used as a guide in adjusting cut-off scores for originations.

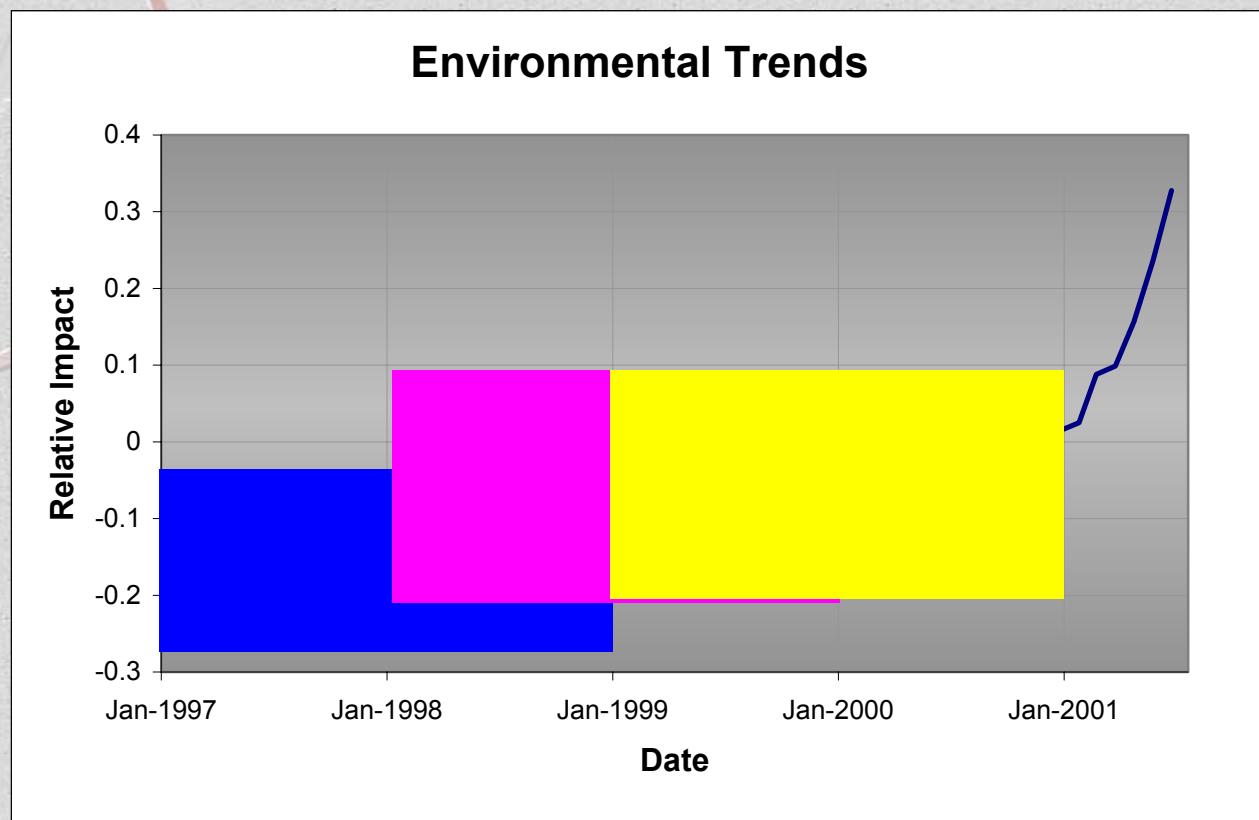
# **Score-Odds Calibrations Over Time**

- **Each vintage experiences a potentially different environment.**
- **The 1997 vintage performed better in its first 2 years than 1998 and 1999**



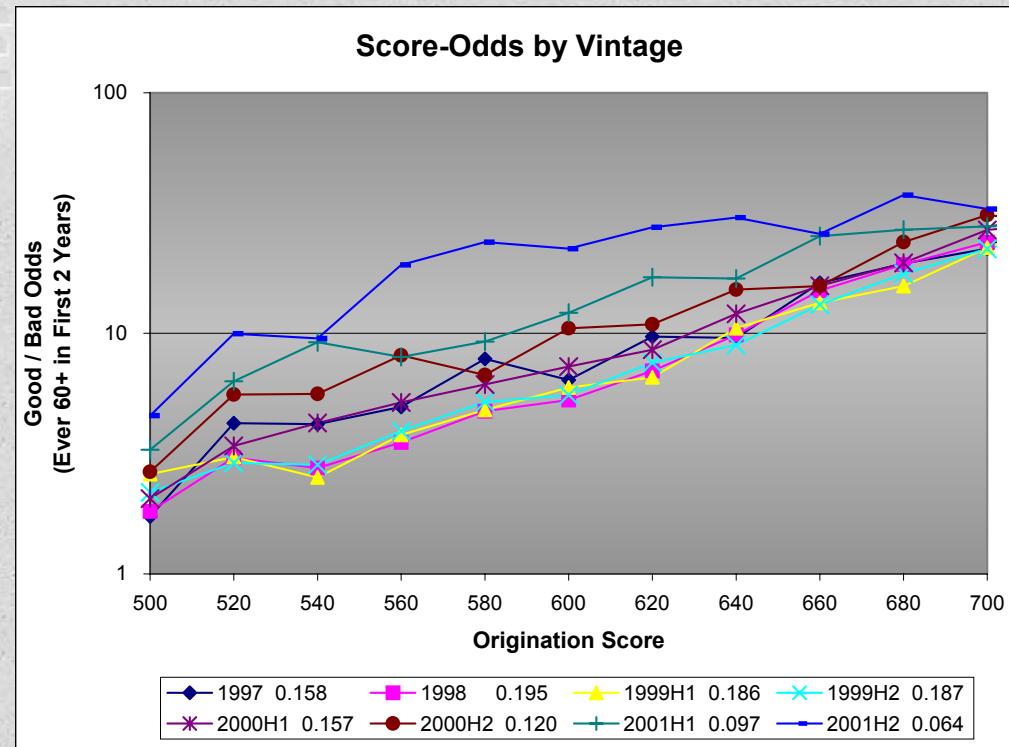
# ***Environmental Trends***

- An independent measure of environmental impacts (via Dual-time Dynamics) confirms that the 1997 vintage lived through a better environment.



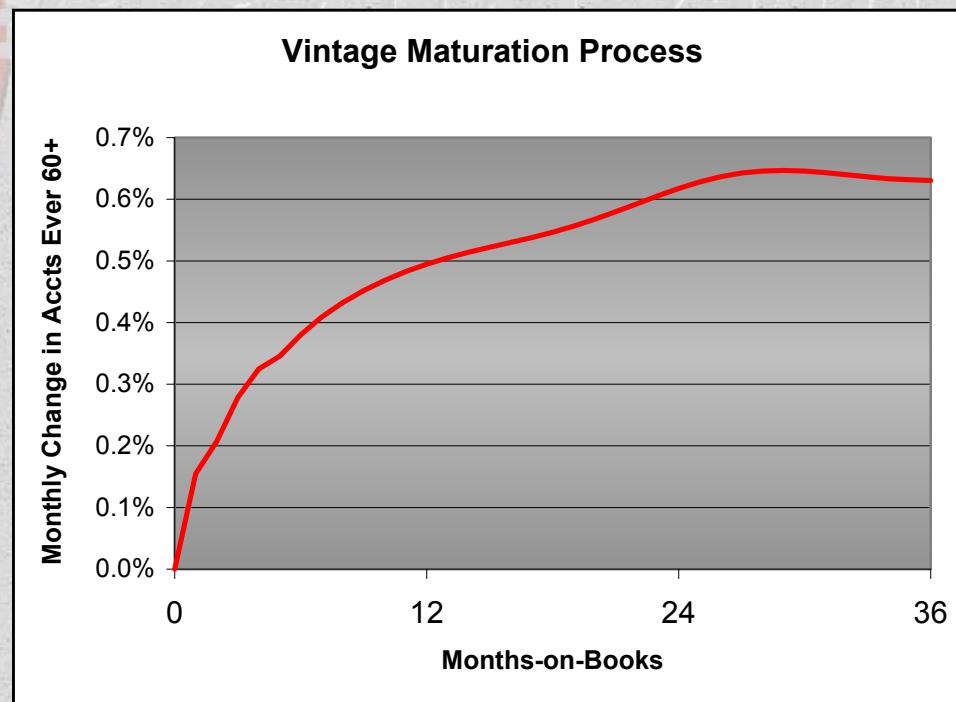
# **Score-Odds on Maturing Accounts**

- Including recent vintages is problematic because they have been observed for a shorter period of time.**



# **Account Maturation Dynamics**

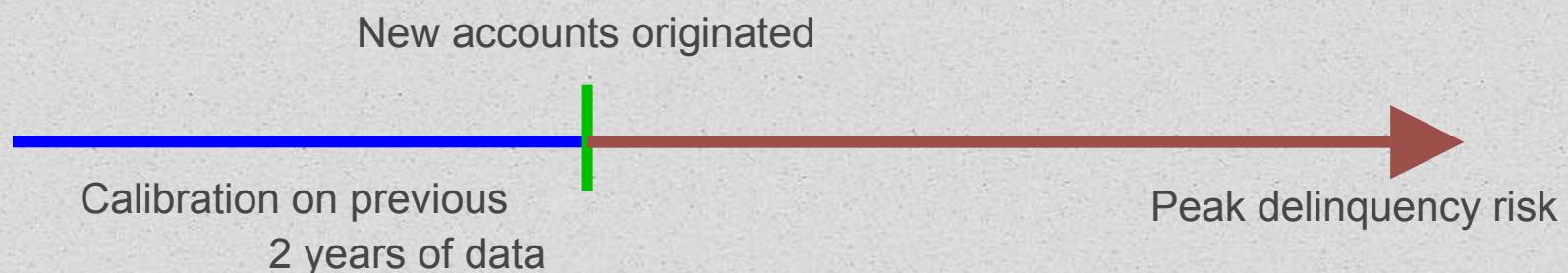
- **Peak delinquency risk may not occur for several years after booking. This portfolio shows peak delinquency risk between 24 and 36 months-on-books.**



# **Originations Timeline**

**Trailing score-odds calibrations have several problems:**

- **Cannot use the most recent vintages because of immaturity of the accounts.**
- **Accounts booked today will have peak delinquency up to several years in the future. Setting cut-off scores based upon a calibration to the previous 2 years' data implicitly assumes that the macro-economic environment will remain unchanged for 4 to 5 years.**



## ***Creating an Ideal Approach***

---

**The technique just illustrated is simplistic. We need a score-odds calibration methodology that:**

- **Uses the full history of both old and new vintages.**
- **Normalizes for changes in business practices, e.g. improved collections scores or systems.**
- **Can be projected under changing macroeconomic environments.**



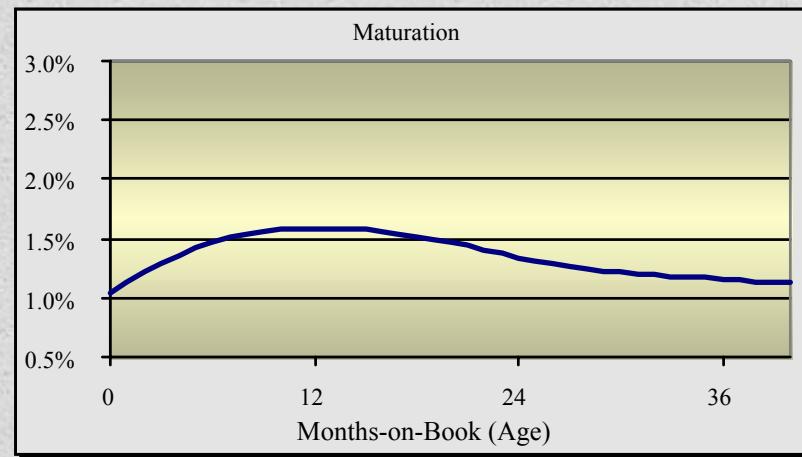
**STRATEGIC ANALYTICS**

## **Understanding Portfolio Dynamics**

**Copyright © 2002 Strategic Analytics  
Inc.**

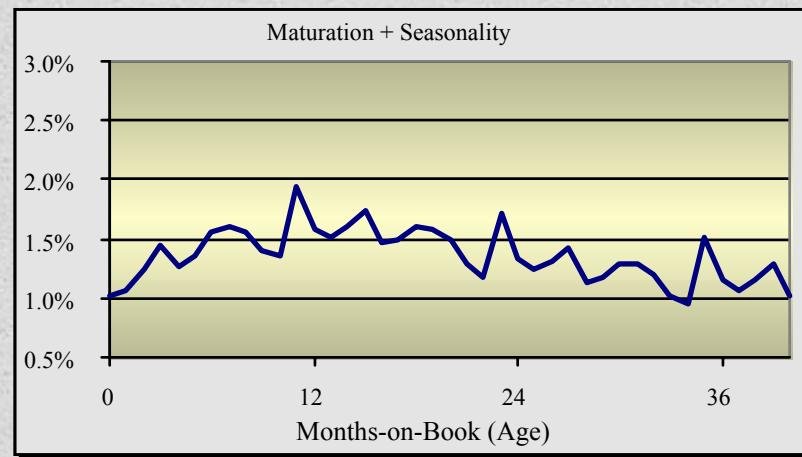
# **Components of Portfolio Performance**

- **Vintage Lifecycle**



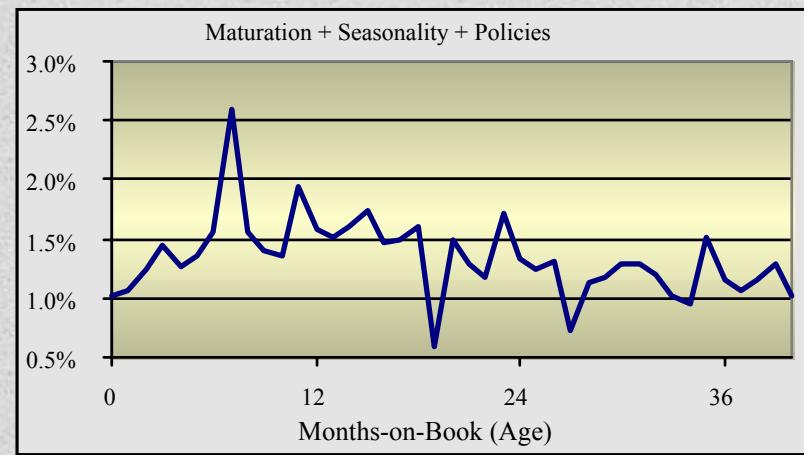
# **Components of Portfolio Performance**

- **Vintage Lifecycle**
- **Seasonality**



# **Components of Portfolio Performance**

- **Vintage Lifecycle**
- **Seasonality**
- **Management Actions**



# **Components of Portfolio Performance**

- **Vintage Lifecycle**
  - **Seasonality**
  - **Management Actions**
  - **Competitive & Economic Environment**
- 
- Maturation  
(age-based)**
- Exogenous  
(time-based)**





# STRATEGIC ANALYTICS

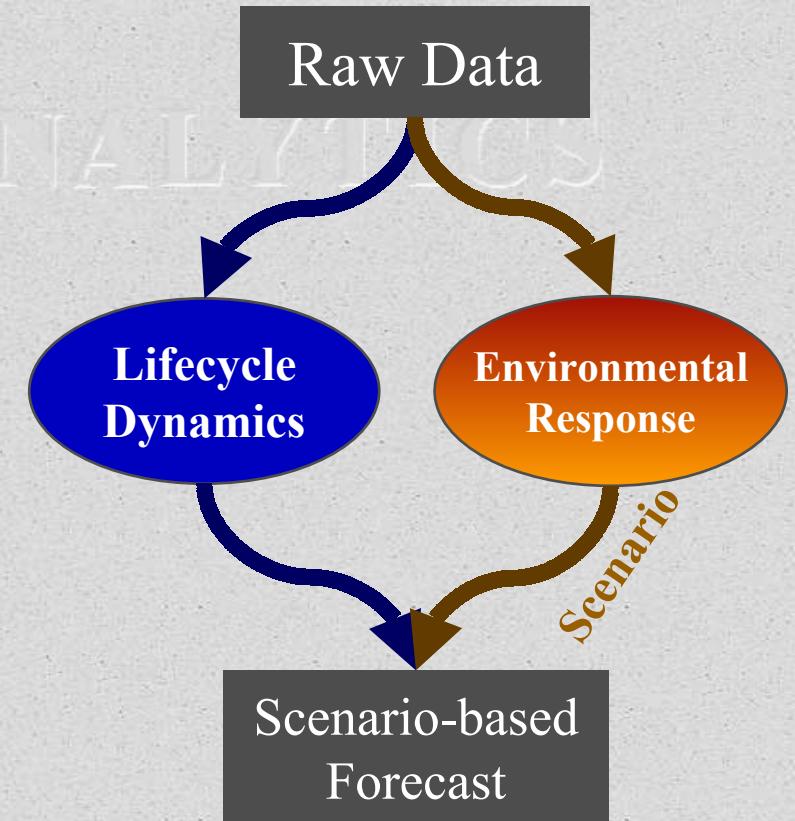
## Dual-time Dynamics (DtD)

*Powerful, New Analytics*

**Copyright © 2002 Strategic Analytics  
Inc.**

# **Dual-time Dynamics Modeling**

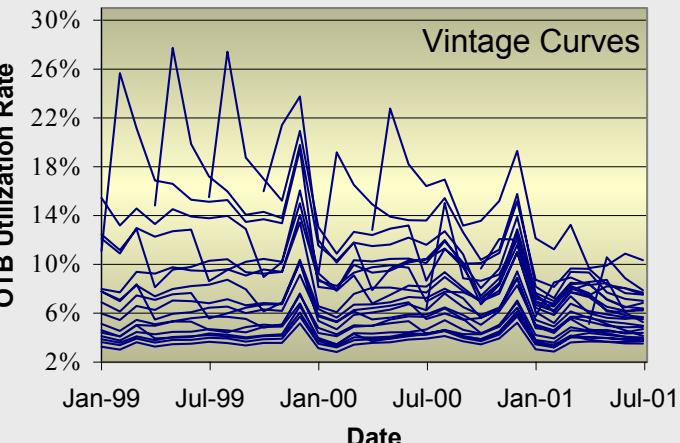
- Behavior is decomposed into natural dynamics and environmental response.
- Captures the full nonlinear dynamics of the components.
- All historical data is made relevant for the present.
- Past environment may be replaced with a future scenario.



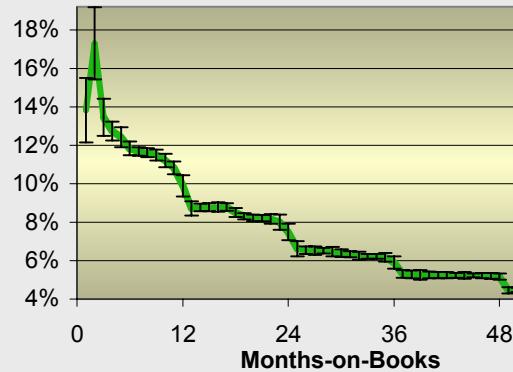
# Dual-time Dynamics (DtD)

- A unique technology for modeling portfolio dynamics
- Unparalleled accuracy for quantifying maturation and management controls
- Patent-pending technology derived from techniques in nonlinear dynamics

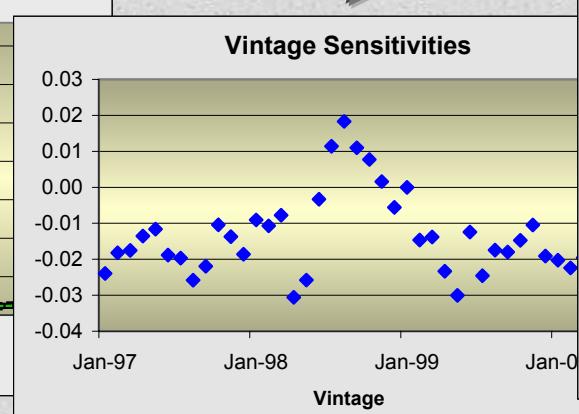
Open-to-Buy Purchase Utilization Rate



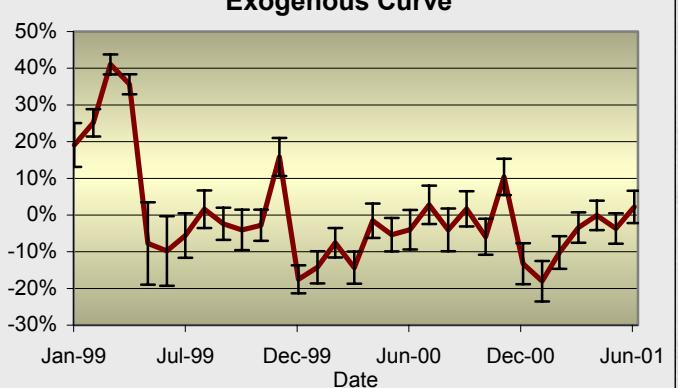
Maturation Curve



Vintage Sensitivities

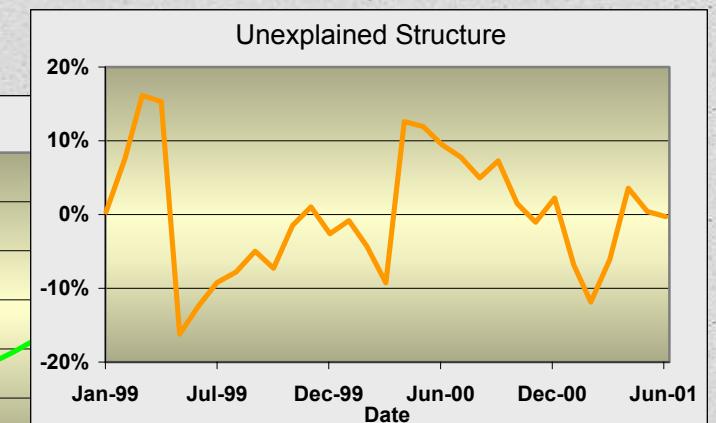
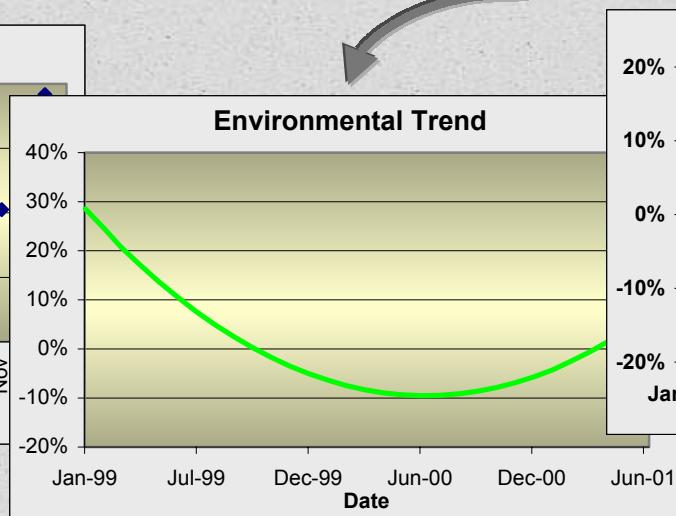
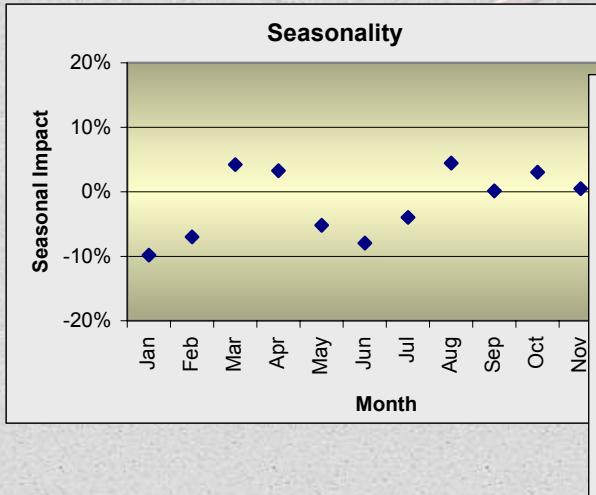
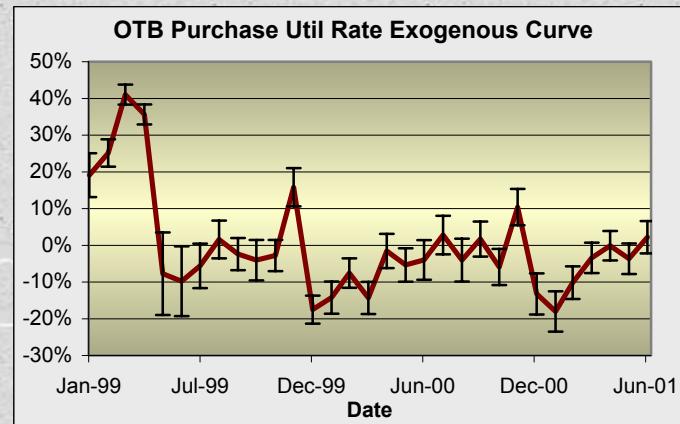


Exogenous Curve



# **Decomposing the Exogenous Curve**

- The exogenous curve measures the relative impact of external factors upon the intrinsic consumer dynamics
- e.g. “20% higher utilization of unused credit line than would have been expected from the maturation process”
- To ascertain cause-and-effect, the exogenous curve is further decomposed into seasonality, environmental trends, management actions, and intrinsic volatility





# **STRATEGIC ANALYTICS**

## **Scenario-based Forecasting**

*via Dual-time Dynamics*

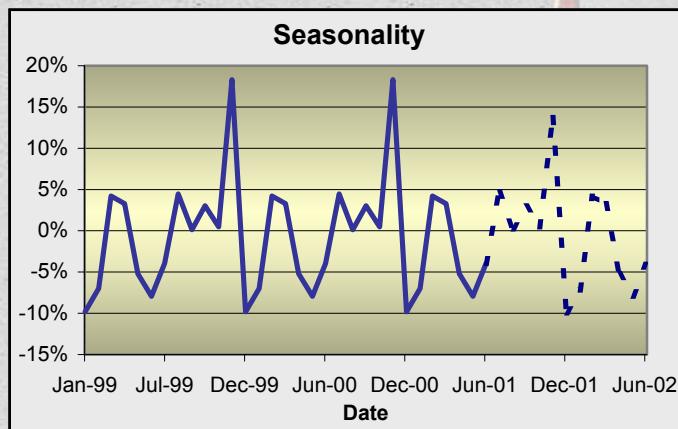
**Copyright © 2002 Strategic Analytics  
Inc.**

# **Exogenous Scenarios**

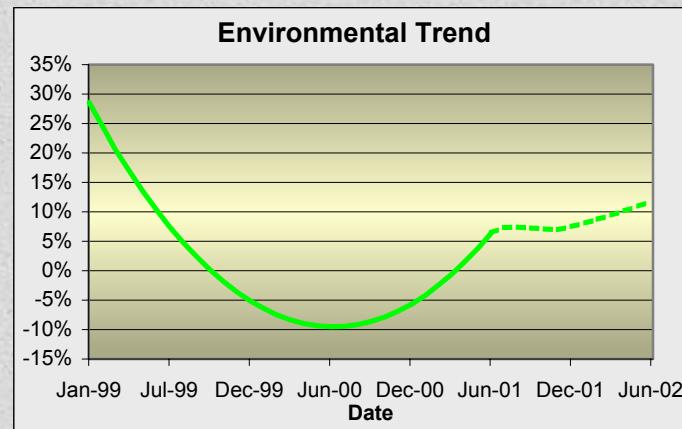
**Decomposition generates elements that are familiar and visual**

**Scenario's for the future environment are best managed by adjusting seasonality and economic response separately**

**Cumulative effects then drive the forecast**



2001 holiday spending is expected to be weaker than prior years

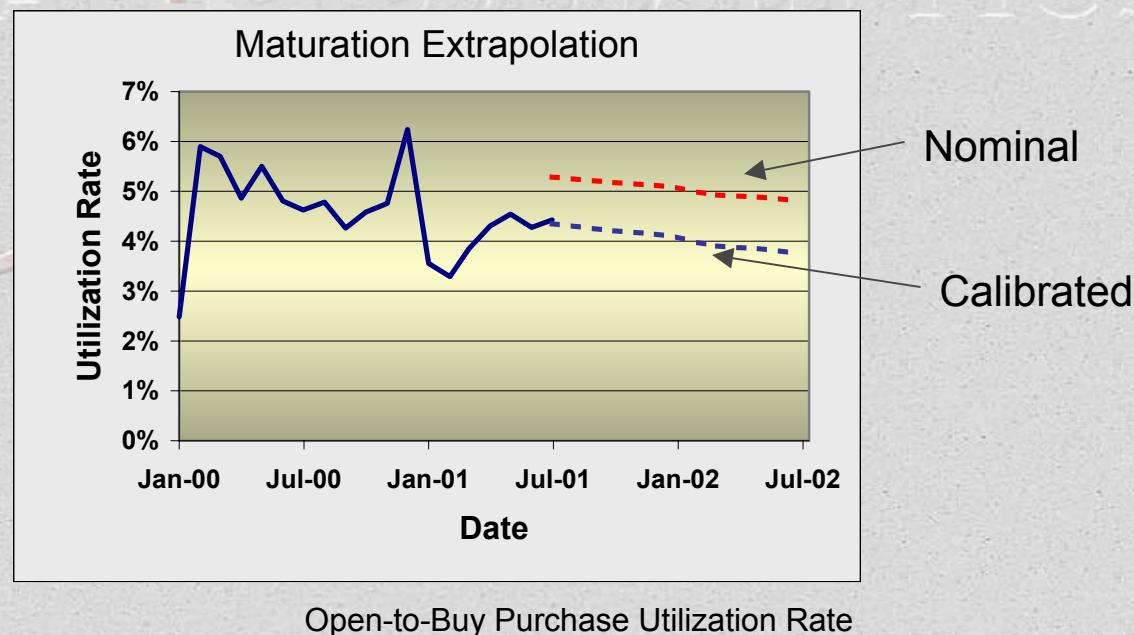


and spending should grow more slowly while in recession

# **Vintage Forecasting**

**Forecasts are built up from the vintage/segment level**

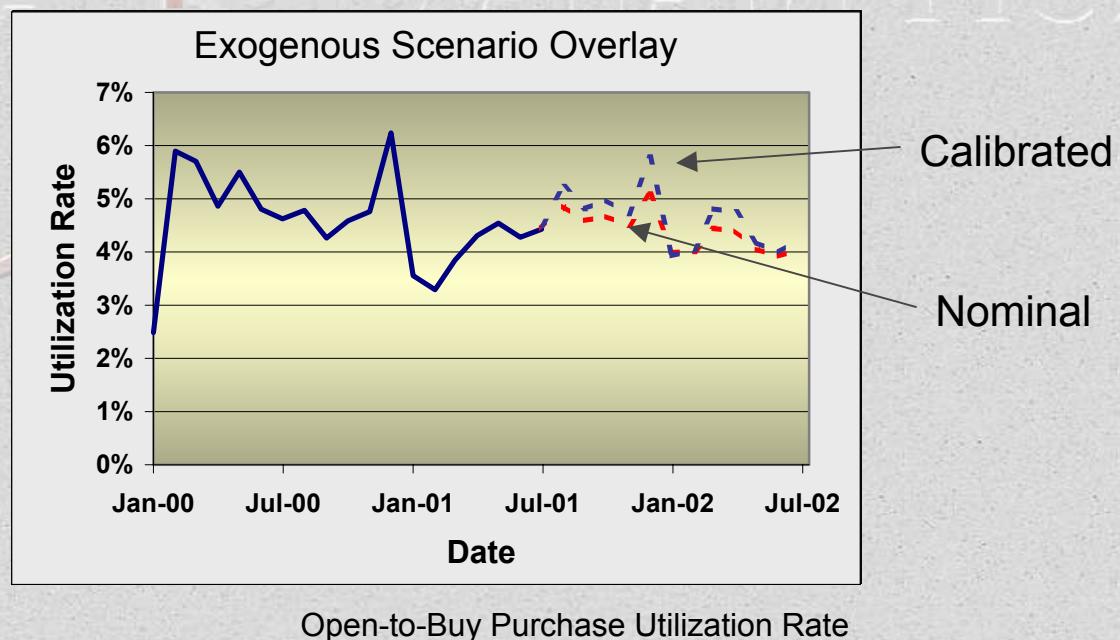
**The DtD engine extrapolates the maturation curve...  
and calibrates to the vintage using the vintage sensitivities**



# **Vintage Forecasting**

**Economic and management actions are then introduced**

**The DtD engine overlays the chosen exogenous scenario...  
and calibrates the exogenous scenario to the vintage using  
the vintage sensitivities**





**STRATEGIC ANALYTICS**

## **Predictive Score-Odds Calibrations**

**Copyright © 2002 Strategic Analytics  
Inc.**

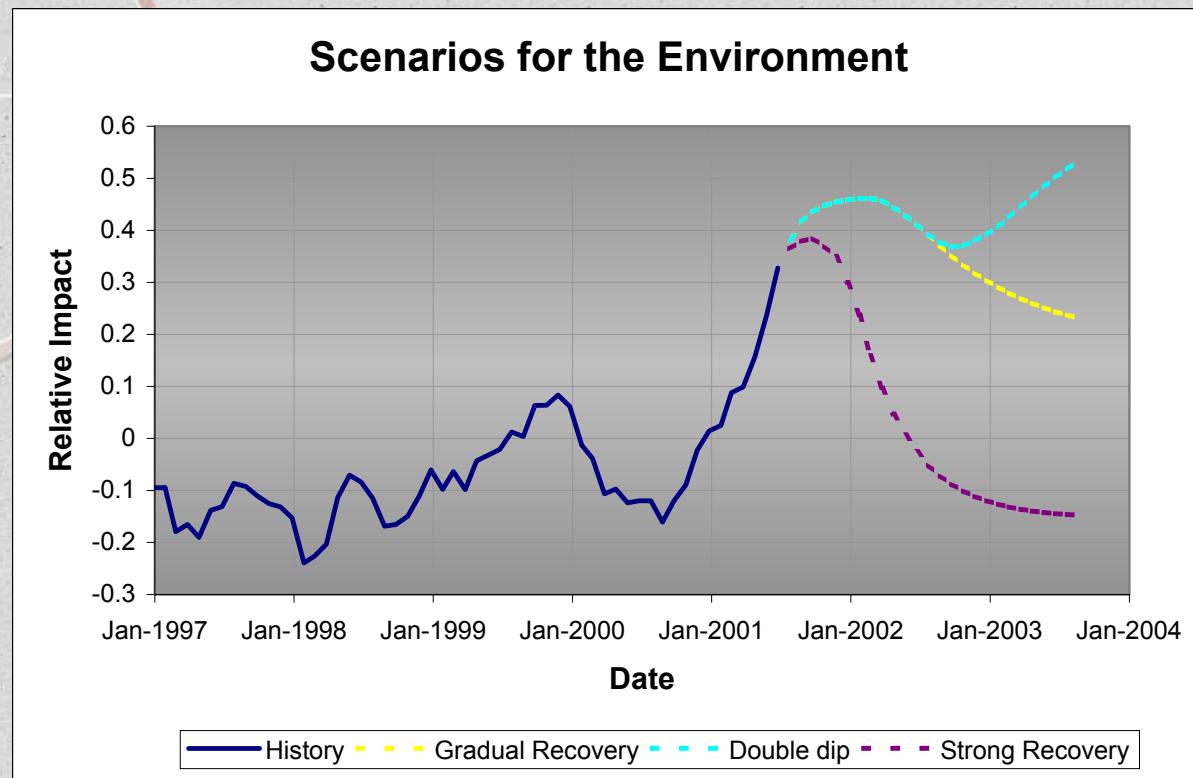
# **Predicting Score-Odds Calibrations**

---

- **Renormalize the vintages as if they were all the same maturity (months-on-books) during the scenario.**
- **Project the vintages under a scenario for the future environment.**
  - *Using scenarios means that the predictions depend upon management assumptions, but those assumptions are made explicit and available for validation. An audit trail is maintained.*
- **Compute the score-odds calibration under this scenario and maturity.**
  - *Management should consider a range of possible future scenarios to determine the portfolio's sensitivity to environmental change.*

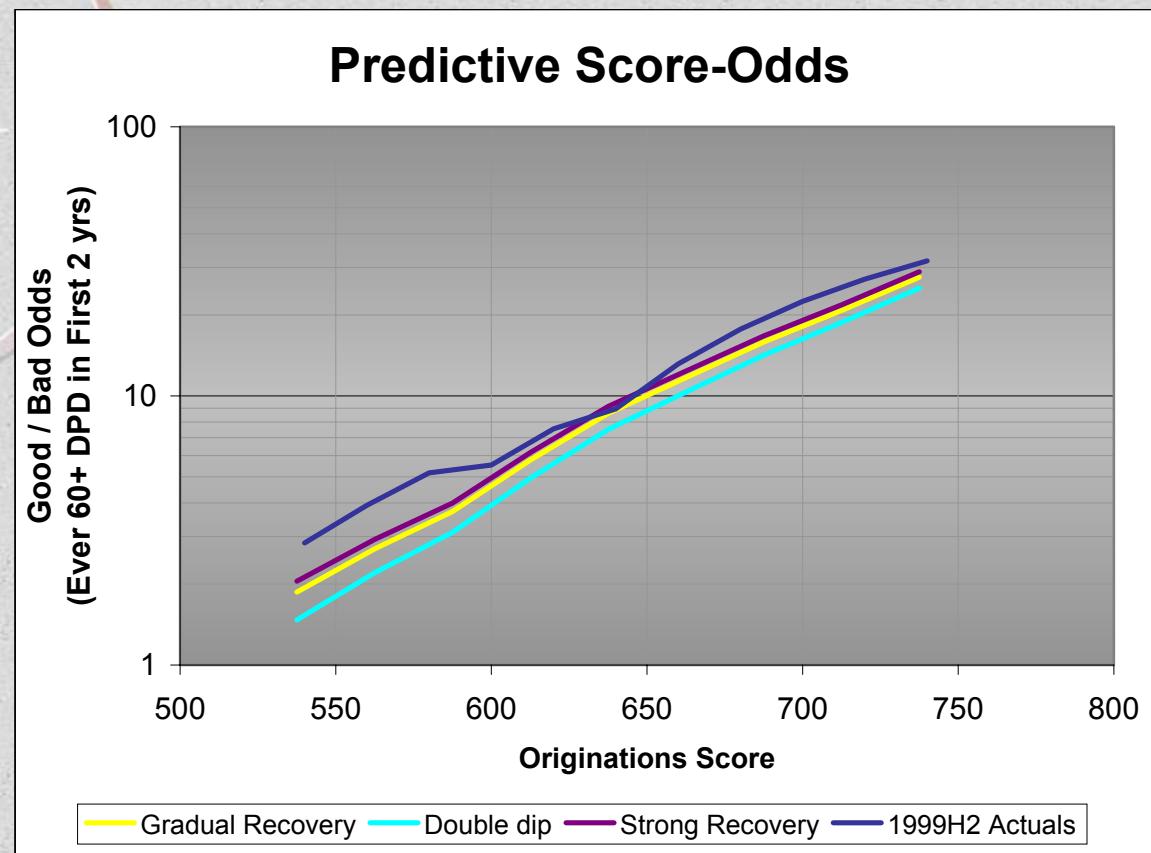
# Create the Scenarios

- Shows three possible scenarios for the next two years. At the time, Gradual Recovery was considered the most likely.



# **Optimal Cut-off Scores**

- In this example, to maintain odds of 4:1 would require raising the cut-off score by 32 (Gradual Recovery), 41 (Double-dip), or 28 (Strong Recovery).**



# **Summary**

---

- **Score-Odds calibrations can and should account for future changes in the environment.**
- **Predictive Score-Odds are probably most important for short term loans (less than one full business cycle) that will not experience a broad range of environments.**
- **The Predictive Score-Odds technique leads naturally to optimizing profitability. Including revenue analysis in the Score-Odds calibration makes setting cut-off scores an act of optimizing profit rather than minimizing losses.**