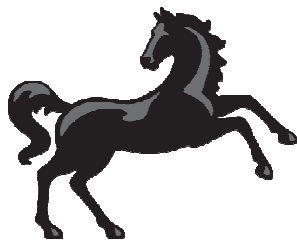


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*Quantum Mechanics Framework to  
Minimize the Lack of Stationary Properties  
in Markov like Credit Risk Models*

—  
**Credit Scoring Conference 2009**  
Edinburgh, August 26-28th 2009

**Disclaimer:** The views expressed in this work are those of the authors and do not necessarily reflect those of Lloyds Banking Group or Closer or its members.

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## 01. Motivation

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**04.06.** *Getting dynamic (economy dependent) TM*

**04.07.** *Classification distribution for alternative economical environment*

## 05. Conclusions



—

*How can I forecast with a **Transition Matrix** for different economical scenarios?*



## 02. Introduction

### 02.01 The Classic Approach

- Is based on the **classical statistics paradigm**. That implies an event space, with events, probability measures, algebras, etc...(heavy math stuff)
- Stable information means **massive** data collected cover a timeframe **much longer** than classification revision period.
- Furthermore, if we need **forecasting**, we need a TM which can be related to **economical environment**. And this demands **even greater** amounts of data.

*How, then, do we **bypass these shortcomings?***



## 02. Introduction

### 02.02. The Quantum Approach

—

Well ... there are **good news** ...

There is an **alternative paradigm**, in which the probabilities are **not** inferred via observation – as happens the classical approach – but by its **possibility of occupying different states**.

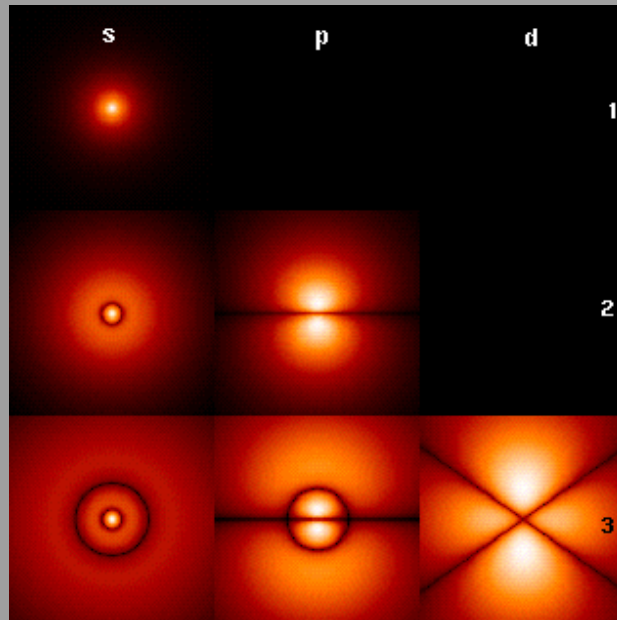
How can we apply this approach to **debtors** as physicists have been doing to **sub-atomic particles** for almost a century?



# 02. Introduction

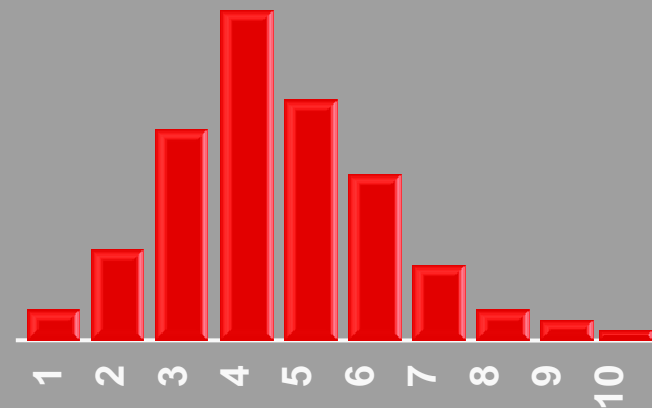
## 02.02. The Quantum Approach

In an atom, an electron is given a probability of occupying – at a given **instant** - **certain, predictable** electron configurations ...



Different orbitals for the simplest of all atoms – Hydrogen

Likewise, a debtor can be given a certain probability of occupying – at a given **instant** - **certain, predictable** credit classifications...



Different credit classifications and it's distribution for a given debtor.

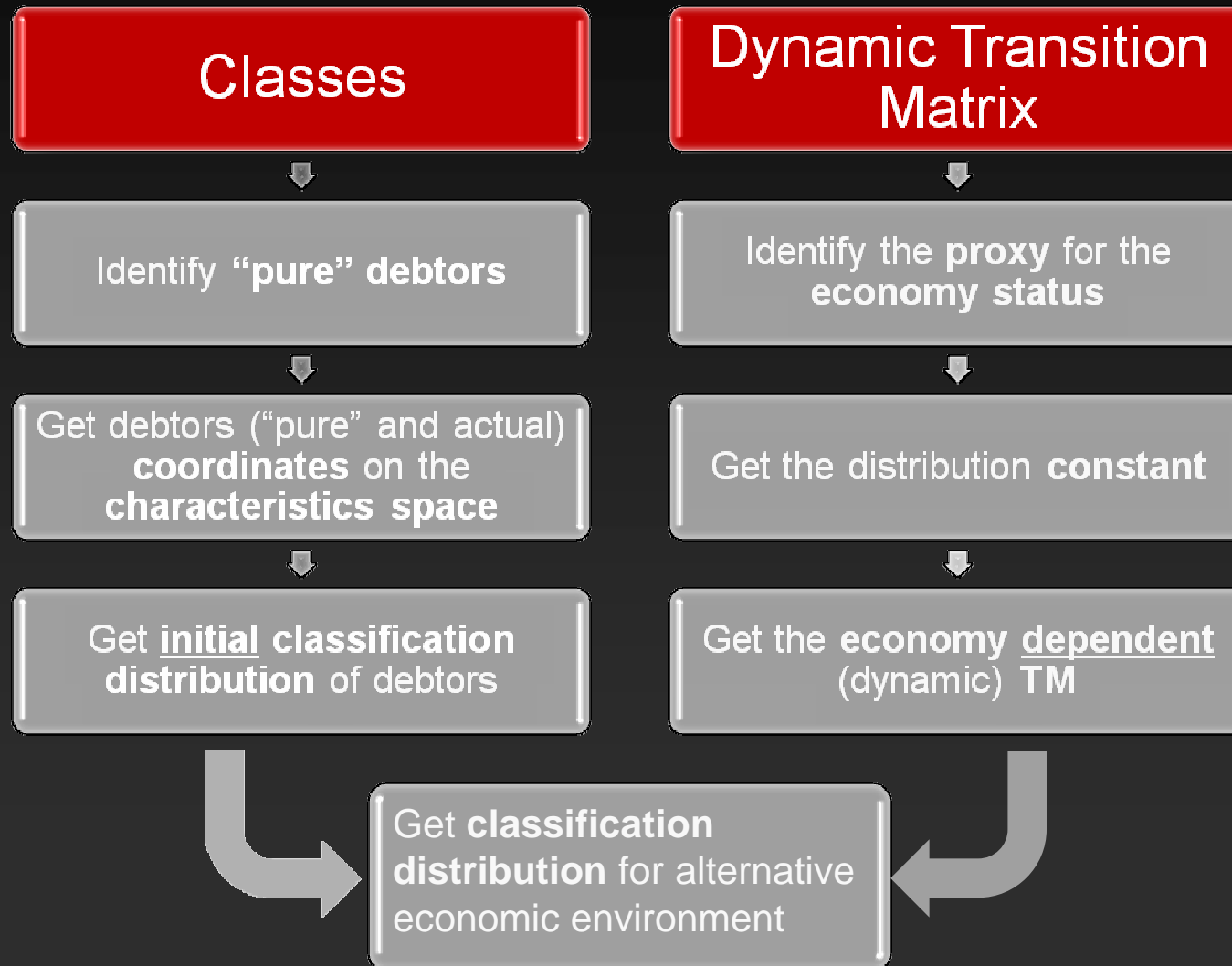
# closer. 03. The Quantum Approach Core



—  
In a nutshell ...

- We **no longer** care about knowing **where a debtor is**, based on the few debtors we know.
- We only care about **where a debtor can be**, based on all the debtors we don't know!

# closer<sup>®</sup> 04. Process Description

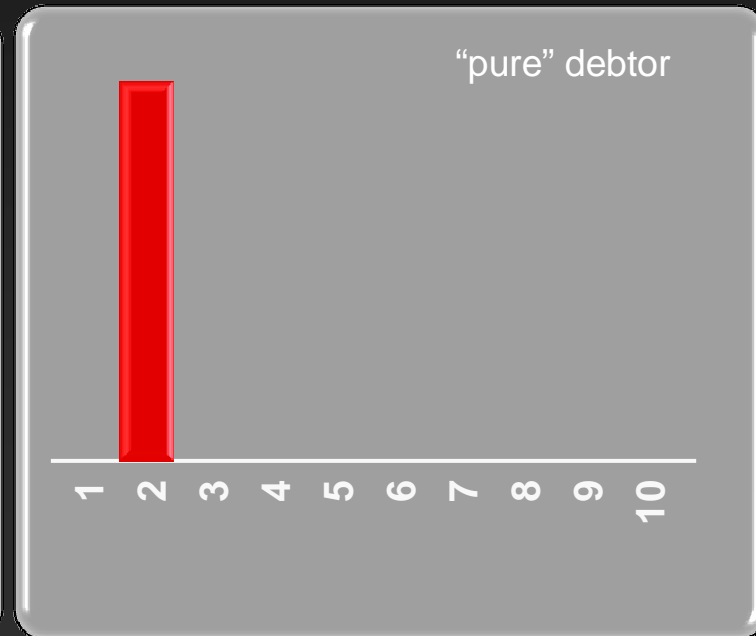
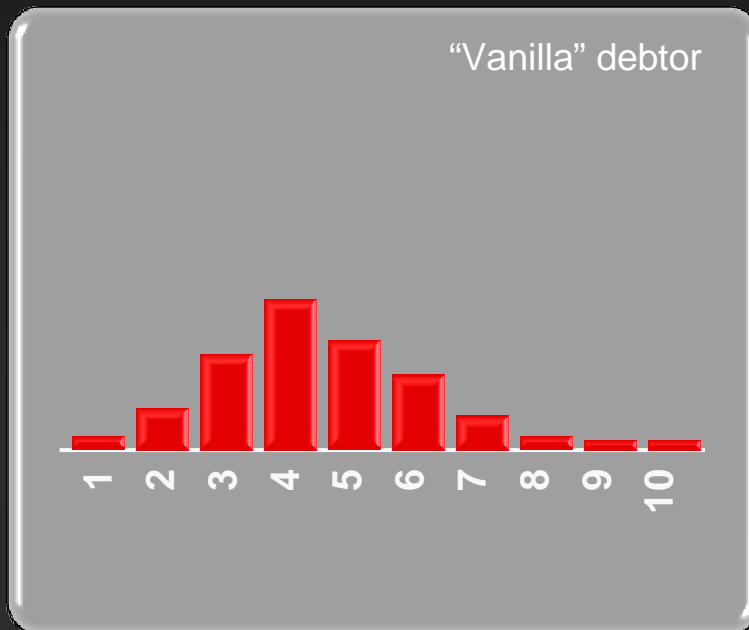


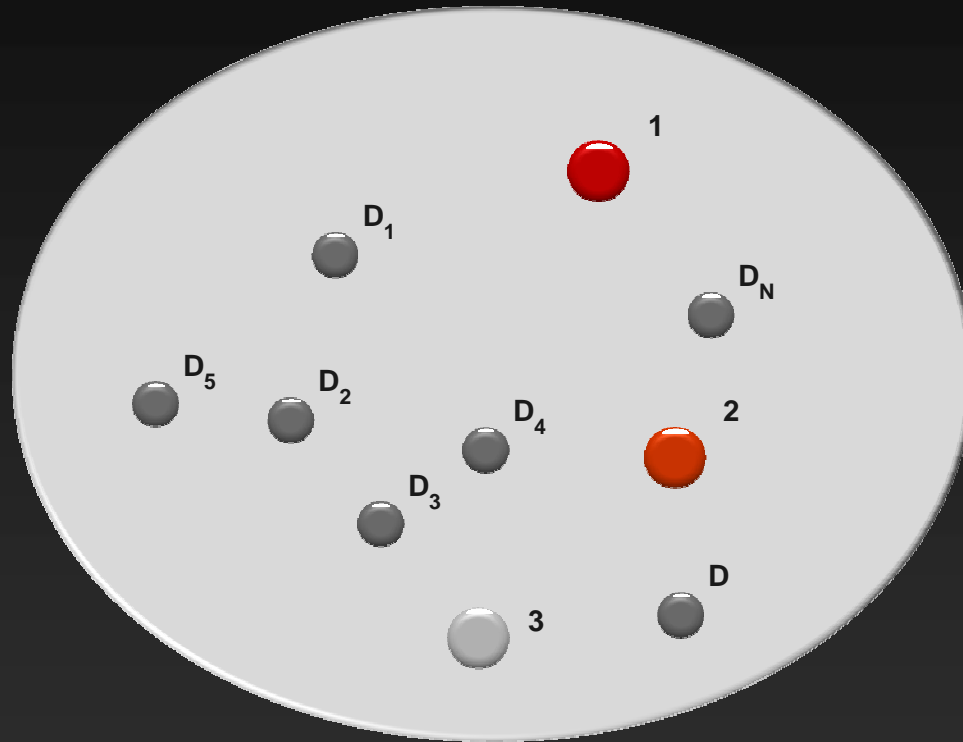


# 04. Process Description

## 04.01. Identify “Pure” Debtors

- This task is left to **Credit Risk experts**;
- It aims to identify debtors (either real or idealized) which can be treated as falling into a **single credit classification** (with no distribution across different classes);
- They are needed as “**references**” on the **characteristics space**.



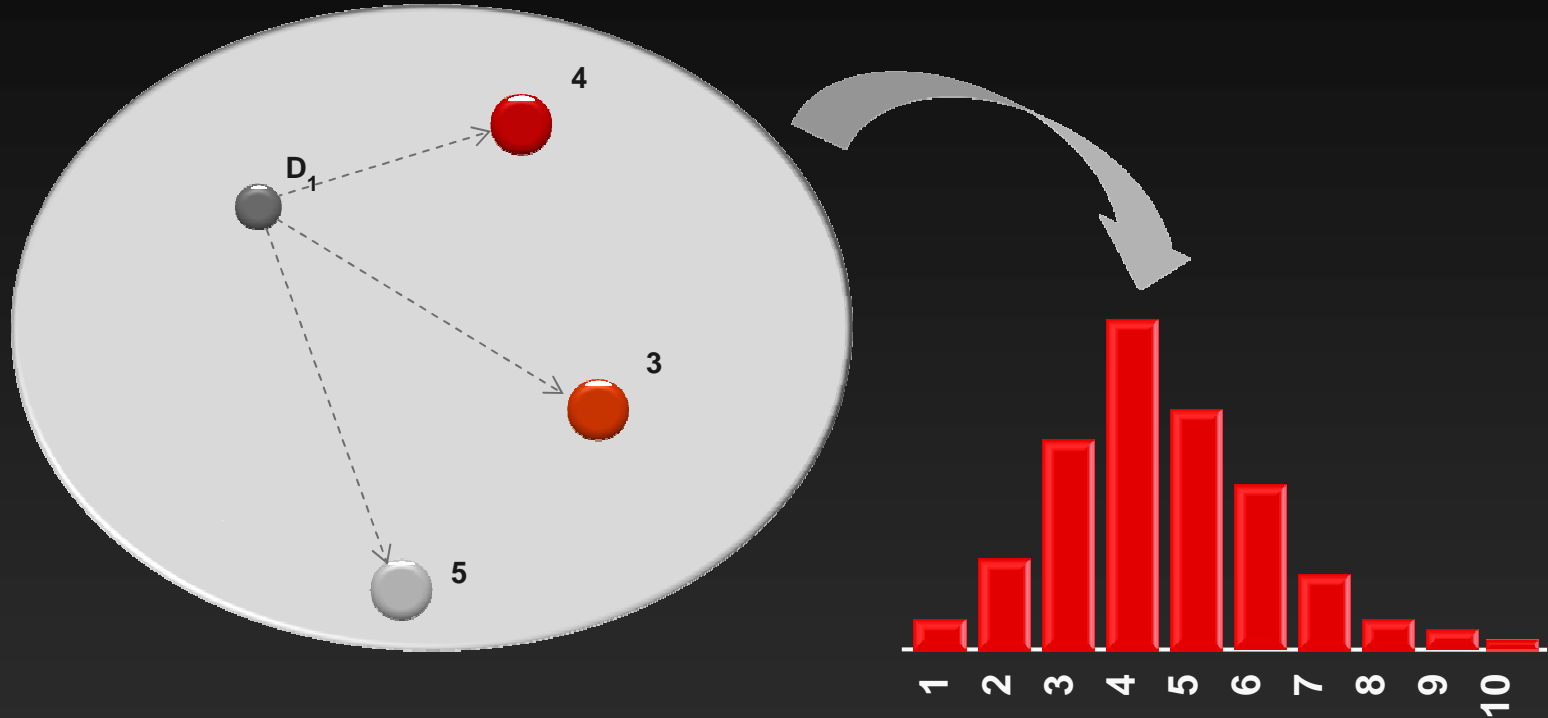


We place the debtors (both the “pure” and actual) on the hyperspace of financial/structural attributes – which we name as “characteristics space”.



# 04. Process Description

## 04.03. Getting classification distribution



- The debtor is given a **distribution** of classifications based upon its **position** regarding the **pure debtors**;
- This **probability** of each state is assigned via **proximity algorithms**.



## 04. Process Description

### 04.04. Identifying a proxy of the economy status

- As we saw, the classification distribution displays an exponential behavior so that the probability that the classification changes to K when the economy changes from  $\beta$  to  $\beta_0$  is given by:

$$\frac{P(\beta)}{P(\beta_0)} \propto e^{-(\beta - \beta_0)\varepsilon_k}$$

- The parameter  $\beta$  is a composed metric derived from a set of **macro-economic indicators**.



## 04. Process Description

### 04.05. Getting the distribution constant

- The constant in the model is found on the parameter  $\epsilon_k$  :

$$V_{kk} = \frac{P(\beta)}{P(\beta_0)} = e^{-(\beta - \beta_0) \epsilon_k}$$

- This constant can be obtained by performing **OLS** on empirical data



- The elements of the Dynamic Transition Matrix are computed via **Matrix OLS**.

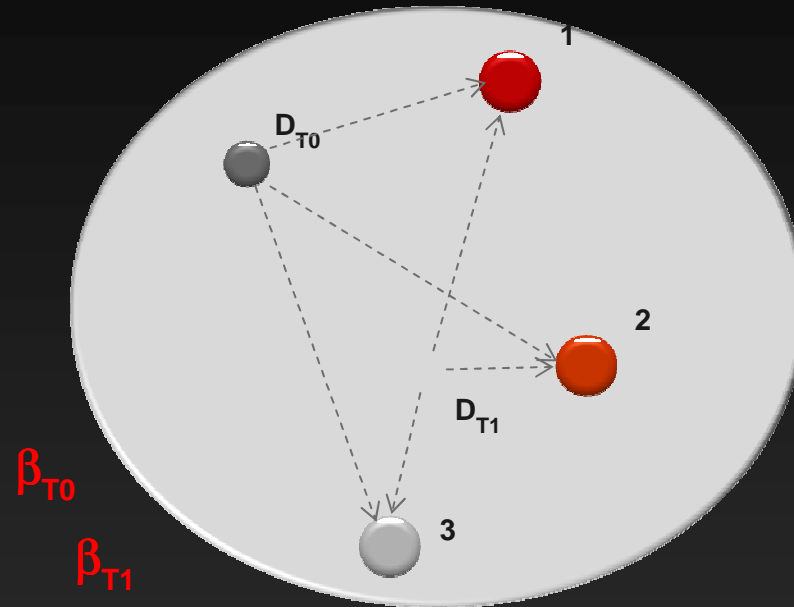
$$R \cdot T_M \rightarrow R'$$



# 04. Process Description

## 04.07. Classification distribution for alternative economical environment

—



- By **changing** the **economic environment**, our debtor describes a **trajectory** on the **characteristics space**.
- This trajectory derives from applying **the dynamic transition matrix** (expressing different economic environment).
- If we take **R** as the initial classification distribution; **T<sub>M</sub>** as the dynamic transition matrix, then the classification distribution on an alternative scenario, **R'** will be

$$R \cdot T_M \rightarrow R'$$



- As a result of this approach, our TM is no longer a scalar matrix (it couldn't be)

$$\begin{bmatrix} V_{11}(\beta) & V_{12}(\beta) & \dots & \dots \\ V_{21}(\beta) & V_{22}(\beta) & \dots & \dots \\ \dots & \dots & \dots & \dots \\ \dots & \dots & \dots & V_{nn}(\beta) \end{bmatrix}$$

- Now it yields the economic dependency but, also important, the uncertainty associated to the lack of homogeneity and stationarity.



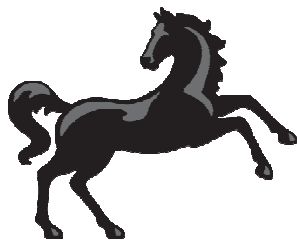
## Epilogue

*“There is one thing **stronger than all the armies in the world,**  
and that is an **idea whose time has come.**”*

Victor Hugo

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**Thank you for your attention!**

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