

# CREDIT RISK MODELLING [225+ hours]

**EXCEL + PYTHON** 



## 1. Basic Understanding

- 1.1 Understanding Loan Lifecycle
- > 1.2 Scorecards vs Basel vs IFRS9 vs Stress testing models
- 1.3 Excel and Python hands-on Data Preparation for Model development using MENTOS

#### 2. Scorecards

- 2.1 Application Scorecard vs Behavioural Scorecard
- 2.2 Understanding Bad definition
- 2.3 Excel hands-on Roll Rate Analysis (to incorporate bad flag) on Fannie Mae Mortgage data
- 2.4 Understanding concepts of Snapshot, Observation Period & Performance Period
- 2.5 Excel hands-on Vintage analysis to identify Performance Window
- 2.6 Segmentation techniques, criteria and validation checklist (Excel)
- 2.7 Variable Selection using PCA clustering and Information value (Excel)
- 2.8 Fine Weight of Evidence Binning and Coarse Weight of Evidence Binning (Excel)



- 2.9 Excel and Python hands-on Building Application
   Scorecards using Logistic Regression
- 2.10 Behavioural variables creation utilisation, payment and delinquency
- 2.11 Deciding cut off by maximizing Revenue or profit or minimizing risk (Excel)
- 2.12 Thinking beyond Statistics Policy rules, Overrides, Reject Inferencing (Excel)

# 3. Loss Modelling

- 3.1 Excel hands-on Modelling Losses through Age Period Cohort Analysis
- 3.2 Excel hands-on Modelling Losses using Flow Rate Analysis

# 4. Modelling Probability of Default

- **4.1** Excel hands-on -Calculating PD using Logistic Regression
- 4.2 Calculating PD using Machine Learning Techniques (Excel)



#### 5. Modelling Loss given Default

- 5.1 Calculating workout LGD (Excel)
- 5.2 Handling incomplete workouts using Chain Ladder Method (Excel)
- 5.3 Tobit, Fractional Logit & Beta Regression for LGD Modelling (Excel)
- > 5.4 LGD modelling using Survival analysis (Excel)
- 5.5 Component based approach for LGD modelling (Excel)

## 6. Modelling Exposure at Default

- 6.1 Modelling EAD using CCF (Excel)
- 6.2 CCF data preparation using Fixed & Variable Horizon, Cohort approach (Excel)
- 6.3 CCF Regression (Excel)

## 7. Cure Modelling

- > 7.1 Instant Cure vs Probationary Cure (Model design)
- > 7.2 Loss given Cure modelling (Excel)



## 8. Basel Capital Charge

- 8.1 RWA & Capital Adequacy Ratio calculations (Excel)
- 8.2 Using Vasicek formula to convert TTC PD to Worst Case PD
- 8.3 Excel and Python hands-on Calculating Capital as per Basel IRB Approach

## 9. IFRS 9 Introduction

- > 9.1 TTC PD in Basel vs PIT PD in IFRS
- **9.2** 12 months PD calculation vs lifetime PD calculation
- 9.3 Understanding Concepts of Staging Stage 1 |
   Stage 2 | Stage 3

## 10. IFRS 9 PD Calculation

- 10.1 Understanding Conditional PD Vs Unconditional PD
- 10.2 Excel and Python hands-on Converting TTC PD to PIT PD using Scalar approach
- 10.3 Excel and Python hands-on Converting TTC PD to PIT PD using Log Odds shift



- 10.4 Calibration & Smoothening techniques (Excel)
- 10.5 Excel and Python hands-on Converting TTC PD to PIT PD using z score
- 10.6 Excel and Python hands-on Converting TTC PD to PIT PD using multi state Transition matrices
- 10.7 Building PD term structure for lifetime under
   2 states and multi state framework (Excels)

# 11. CECL techniques

- 11.1 Discrete Time Hazard Models (Excel)
- 11.2 Snapshot/Open Pool Method (Excel)
- > 11.3 WARM Model (Excel)
- 11.4 Vintage analysis (Excel)

# 12. Actuarial Credit Risk Models

- 12.1 Survival analysis (Excel)
- 12.2 Cox Regression, Accelerated Failure Time models (Excel)
- > 12.3 Age Period Cohort Analysis (Excel)



## 13. APC Extensions

- 13.1 Validating APC Alternating Vintage Diagrams, Moran's D (Excel)
- 13.2 Bayesian APC (Excel)
- 13.3 Quantifying Adverse Selection by Vintage (Excel)
- 13.4 Adverse Selection through Fixed and Random effects (Excel)

# 14. IFRS 9 LGD & EAD Calculation

- ▶ 14.1 PIT forward looking term structure of LGD as a function of Collateral value (Excel)
- 14.2 PIT forward looking term structure of LGD using Regression (Excel)
- > 14.3 Calculating PIT LGD using Jacob Frye model (Excel)
- 14.4 EAD Term structure for credit cards using PIT CCF Modelling (Excel)
- ➤ 14.5 EAD Term structure for loans using amortisation schedule (Excel)
- ➤ 14.6 Modelling prepayments and incorporating in amortisation schedules (Excel)



# 15. IFRS 9 Staging criteria

- 15.1 Staging decision tree using quantitative and qualitative criteria
- 15.2 Staging Validation (Excel)

## **16. Wholesale Models**

- 16.1 Understanding Transition Matrices
- ▶ 16.2 Building Transition Matrix using Cohort Approach (Excel and Python)
- ▶ 16.3 Building Transition Matrix using Duration Approach (Excel and Python)
- 16.4 Excel and Python hands on Converting TTC Transition Matrix to PIT Transition matrix
- 16.5 Validating Transition Matrices (Excel)
- 16.6 Building Wholesale scorecards using Quantitative and Qualitative scores

## **17. Low Default Portfolios**

- > 17.1 Bayesian approach to handle LDP (Excel)
- 17.2 Pluto Tasche Approach (Excel)
- > 17.3 Van Der Burgt Method (Excel)
- > 17.4 QMM Method (Excel)



#### 18. Stress Testing

- > 18.1 Top Down vs Bottom Up stress Testing (Excel)
- > 18.2 Understandings CCAR vs DFAST requirements
- 18.3 Modelling ARIMA & ARIMAX (Excel)
- > 18.4 Regression modelling and assumption handling (Excel)
- 18.5 Variable selection pipeline for macro-economic models
- ▶ 18.6 Excel and Python hands-on Building CCAR models using multiple regression and VECM
- 18.7 Excel hands-on Perform 9 quarter In Sample & Out of Sample Back testing

# 19. Model Validation

- > 19.1 Evaluating Discriminatory Power of Model (Excel)
- > 19.2 Evaluating Accuracy of Model and Calibration (Excel)
- 19.3 Performing Stability analysis (Excel)
- > 19.4 Margin of Conservatism (Excel)
- > 19.5 Validating Scorecards and Basel Capital Models (Excel)
- > 19.6 Validating Transition Matrices (Excel)
- > 19.7 Validating PIT IFRS 9 models including staging criteria (Excel)



- 19.8 Validating Stress Testing Models (Excel)
- > 19.9 Validating LGD and EAD models (Excel)
- 19.10 Model Risk Management using SR 11-07 checklist

## **20. Pricing Loans**

- 20.1 Optimizing Yields using Solver (Excel)
- 20.2 RAROC based pricing (Excel)

# **21. Corporate Credit Models**

- 21.1 Merton & KMV Models (Excel)
- 21.2 Credit Plus Models (Excel)
- 21.3 Credit Portfolio View (Excel)
- 21.4 Credit Metrics Model (Excel)

# 22. Machine Learning for credit risk

- **22.1** Supervised Learning LDA, SVM, Decision trees, XG Boost, Neural Network (Excel)
- 22.2 Unsupervised Learning PCA, Clustering (Excel)