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KEY UNDERWRITING CHALLENGES

Limited Visibility into Borrower Risk

Poor/No assessment of Thin-File/NTC Low Quality Bureau Score Differentiation



Inefficienct Risk Assessment

Manual, Slow and Subjective Rigid Rules

Weak Early Warning Systems

No Monitoring of BRE Rules

Missed Stress Indicators





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Scalability Hurdles

Non-scalable Underwriting Slow Expansion into New Segments

Alternate Data

Traditional underwriting methods do not leverage universe of non bureau data





Static Evaluation

Underwriting Parameters do not adapt to evolving population

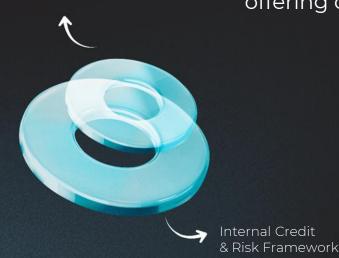


THE SOLUTION – NU SCORE

Added layer of analytics and Machine Learning through Nu Score

Nu Score

is an **analytics-as-a-service** based offering of



Data-Driven solutions

ranging from ml scorecards to advanced analytics

Assisting

financial institutions with smarter assessment & smarter decisions



NU SCORE PRODUCT SUITE

AIDING SMARTER DECISIONS ACROSS THE CUSTOMER JOURNEY

CUSTOMER AND PORTFOLIO ASSESSMENT



MACHINE LEARNING SCORECARDS

Advanced machine learning models aiding in underwriting and hollistic databacked customer assessment



REJECT INFERENCE ANALYTICS

Indepth analysis of customers rejected in your sourcing to enable higher loan approval rates



PORTFOLIO ANALYTICS DASHBOARDS

Interactive dashboards track portfolio performance, credit trends, and risk shifts for data-driven decision-making

ACTIVE LOAN MONITORING & MANAGEMENT



EARLY WARNING SIGNALS

Predict potential delinquencies through behavioral and transactional trends, enabling proactive risk management



COLLECTIONS SCORE

Data-driven collection score models prioritize delinquent borrowers, optimizing recovery efforts and reducing NPAs



CROSS-SELL AND UPSIZE OPPORTUNITY IDENTIFICATION

Identify high-potential customers for additional credit offerings, maximizing portfolio profitability

Nu X R&D – COLLABORATIVE EXPERIMENTAL SOLUTIONS



CREDIT LOSS ESTIMATIONS

Forecast potential credit losses basis historical portfolio behaviour to optimize provisions



INCOME ASSESSMENT

Estimate borrower income, specifically in segemnts where formal sources of income are unavailable



DEEP DEMOGRAPHIC ANALYTICS

Leverage demographic insights to identify expansion opportunities, and align product offerings with target customer segments



NU SCORE ML SCORECARDS



BUCKET	EVENT RATE	POINTS
0-50K	2.0%	75
50K-75K	4.5%	53
75K-1L	7.8%	41
1L-1.5L	10.2%	32
1.5L+	15.5%	15

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BUCKET	EVENT RATE	POINTS
0-2	2.3%	55
2-4	5.6%	42
4-6	7.8%	30
6+	11.3%	12

Credit Bureau - # Enquiries in the last 6m

BUCKET	EVENT RATE	POINTS
0-1	1.0%	68
1-2	3.2%	55
2-4	4.8%	43
4-6	6.7%	30
6+	10.8%	18

Demographics - Zone

BUCKET	EVENT RATE	POINTS
SOUTH	1.5%	42
NORTH	3.3%	30
EAST	5.8%	19
WEST	8.6%	8



Built on Anonymized Originator Portfolio DataCustom-Built to your portfolio and customers. No
PII inputs, ensuring privacy & compliance



Sector & Product-Specific Models + Industry data
Captures borrower-level nuances for precise
assessment and overlayed with industry parameters



Externally Validated Model Development & Governance Policy

Ensures transparency and regulatory compliance



Regular Model Recalibration

Adapts to evolving portfolio dynamics for sustained accuracy



Robust, Secure & Scalable Tech Stack

Built for reliability and seamless integration

Alternate - District Risk Category





Example Scorecard with 5 parameters*

Sum of Points from each parameter, corresponding to the bucket in which the assessed borrower falls, forms the Nu Score for the borrower



*Nu Score Models are always finalised with 10-15 significant parameters. This example only shows 5

NU SCORE ML SCORECARDS

What It Helps Achieve



Improved Sourcing
Through Reject Inference

Identify missed lending opportunities



Optimized
Revenue Yield

Find the right balance between AUM growth and risk adjusted losses



In-Depth Borrower Behavior Analysis

Enable smarter decision-making with actionable insights.



Multi-Faceted Portfolio & Customer Analytics

Drive strategic growth and portfolio management.

Where It's Applied



Direct/Indirect Lending, PTC/DA transactions

Enables faster selection on PTC/DA pools



Instant API-Driven Credit Decisions

Enables real-time evaluation and scalable assessment



NU SCORE REPORT

Nu Score

The Nu Score for every application



Behavioural Insights Customer + Credit

> Traits of Customer Credit Behaviour



Total Outstanding Amount

of all Active Loans

Any Written off

Loans ever

N.RTHERN 10th Floor, IIT Madras Research Park, Kanagam Rd Kanagam, Tharamani, Chennai, Tamil Nadu 60011 Total EMI of

all Active Loans

8 mths

Loan Amount Taken

in the last year



Disbursal Amount Recommendation

Product wise Credit Recommendation



Product wise Interest Rate Recommendation





YOUR DATA OUR SCIENCE

ADAPTIVE DATA SCIENCE: WE WORK WITH YOUR DATA LANDSCAPE

Demographic Data

Age, income, geography, occupation, household expenses, pin code level stress indicator

10,000+

PARAMETERS
AND GROWING

Engineered and Derived Features

Attributes created using below data points to cull out patterns

Credit Bureau Data

Historical credit data across tradelines and entities

Bank Statement Data

Monthly bank statement data of customer accounts

Loan Origination Parameters

Loan cycle, repayment frequency, monthly DPD, originator captured data points

GST Data

GST data on customers from select sectors

Alternate Data

Rich, Historical, District level Data on GDP, Inflation, Unemployment Rate, Infra development and more

Risk Monitoring visits data

Quantified parameters from risk monitoring visits



ML SCORECARD DEVELOPMENT



TEST AND VALIDATE OUTCOMES

Trained Model will be validated against unseen future data to assess predictive power and stability





BUILD ALGORITHM AND TRAIN DATA

Machine learning techniques will be used to understand borrower behaviour and compute a likelhood of default



EXPLORE AND ENGINEER DATA

Data points will be engineered to provide the model with readable and usable patterns and behaviours



DEFINE RISK PARAMETER

A benchmark metric on the originating book will be used to define high risk applications/customers



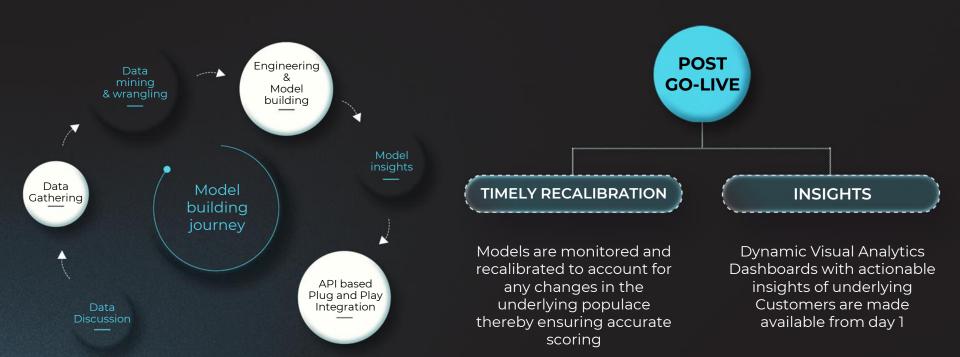








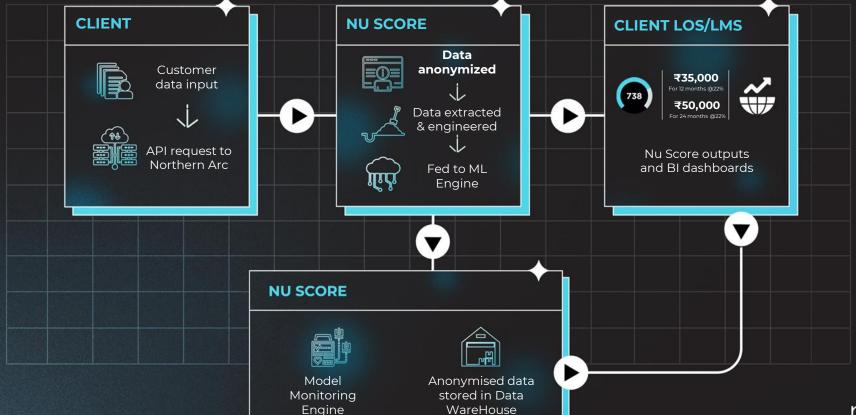
ML SCORECARD LIFECYCLE



MODEL DELIVERY IN 2 WEEKS



EASY API INTEGRATION





NU SCORE APPROACH VS CREDIT BUREAU APPROACH

PARAMETERS

NUSCORE

BUREAU SCORE



SCORING IDEOLOGY

Risk score of borrower for the specific institution

Generic customer score across industry



PARAMETERS

Bureau and Non Bureau data, including data on District behaviour, natural calamities, Borrower specific demographic data and a variety of engineered behavioural parameters

Only mandatory data points submitted to Bureau



RISK ASSESSMENT Reflective of the Institution's Portfolio thereby providing a highly accurate assessment of the borrower

Institution specific portfolio quality and borrower behaviour not taken into account



RECALIBRATION

Timely Recalibration of models through automated Model Monitoring Pipelines to maintain accuracy and relevance of model in response to naturally evolving underlying populace

Industry Standard Models that are Recalibrated basis industry level changes alone and therefore not monitored for changes in populace at an organisation level



A DECADE OF DATA BRILLIANCE- ELEVATING YOUR ANALYTICS EXPERIENCE

30mn+ granular data points collected over a decade



Transaction level data - 4,00,000+ loans monthly



Financial and operational data of Originator Partners



Qualitative insights on Originator Partners

Continuous addition of new sources and data points





Strengthening the models to incorporate future risk events which may result in portfolio deterioration.



Enrich default prediction and recovery estimation capabilities enabling effective management of unpredictable events in the future



Early warnings signals on the health of assets in our portfolio



Helps assess potential losses in portfolios or pools



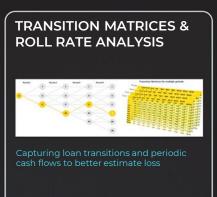
Helps arrive at credit parameters for retail business partnerships

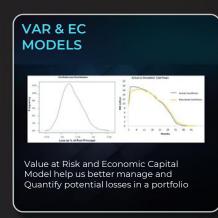


Helps asset and borrower selection in new initiatives being rolled out



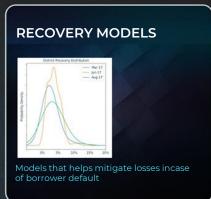


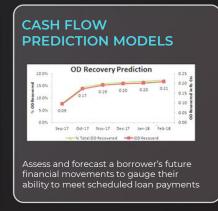
















EMPOWERING FINANCIAL INSTITUTIONS

OUR DIVERSE ANALYTICS ENDEAVORS

Pioneering Workshops

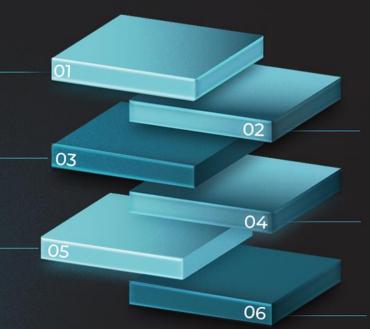
First in the nation for ECL, Event Risk, VaR, and Economic Capital Modeling.

Expansion Advisory

Guided Microfinance, Vehicle Finance and SME institutions On targeted growth areas.

Ratings Expertise

Provided strategic guidance for a large multi-asset class NBFC.



Due Diligence Expertise

Conducted quality assessments and lead diverse due diligence projects, aiding PE firms in their equity due diligence

DFI Support

Essential modeling assistance for a major Development Financial Institution

Financial Optimization

Implemented economic capital modeling for a significant vehicle Financing NBFC.



Thank you

