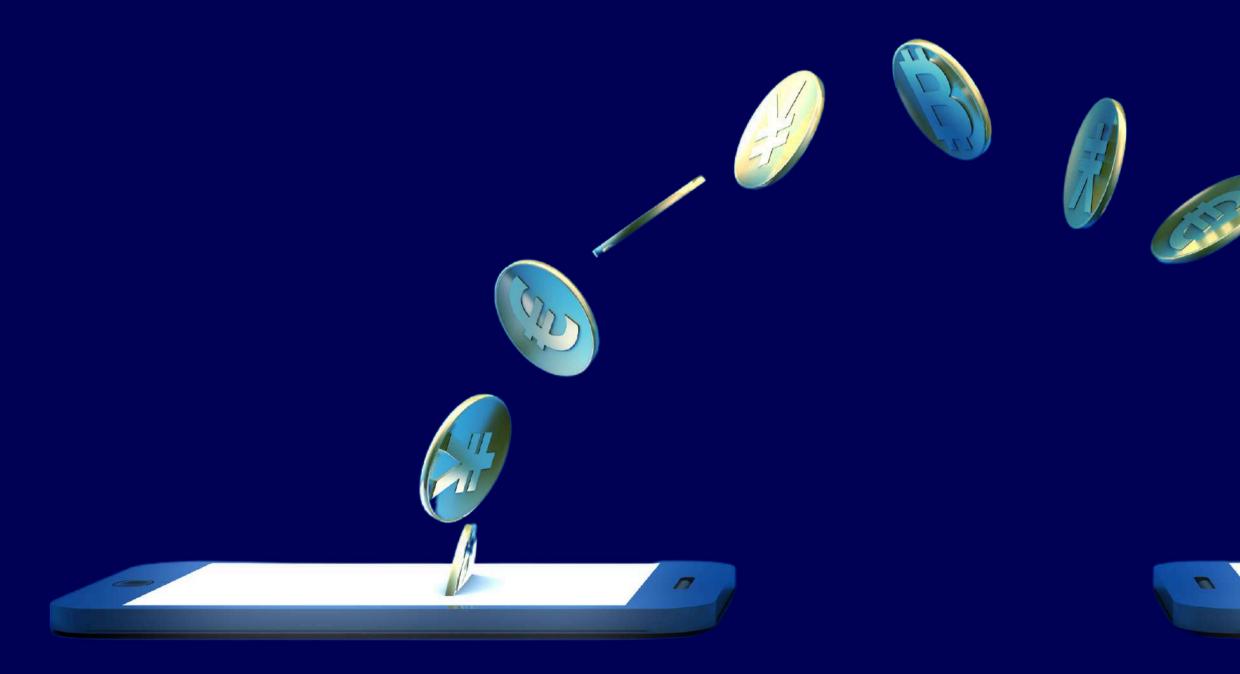


A THESIS ON INDIAN LENDING INFRASTRUCTURE



X LENDING INFRASTRUCTURE & ENABLERS

The lending infrastructure includes SaaS/Tech platforms for end-to-end loan underwriting and collections management. Core systems manage workflows, while data providers supply data to these workflows.

Core Platforms

LOS	LMS	Co-Lending Platforms	Credit Card Management Systems	FRM/Collections
CindingPad Klentra	Margill C finflux : LoanPro.	Yubi CredFlow	vegapay FALCON 42CS	DPDZEro Credgenics
LOS helps lenders in managing the entire process of loan application, approval, and disbursal.	LMS cover processes including loan servicing, reporting, customer care, syndication and customer monitoring.	Centralised infrastructure supporting end-to-end digital lending processes, including origination, underwriting, servicing, and portfolio management for banks and NBFCs to lend together.	A Credit Card Management System (CCMS) is software designed to oversee and manage the entire lifecycle of a card. It typically includes automated business rules to streamline card management processes.	Systems for Financial Risk Management and delinquency recovery, automating risk assessment, monitoring, and debt collection workflows.

Data Providers

Alternate Data Platforms	Embedded Finance Platforms	Banking Data	Credit Bureau	KYC / AML / Risk Management
CREDITVIDYA SCIEN&PTIC	FinBox BharatX	Finarkein Analytics	TransUnion EQUIFAX	Cygnet Infotech :Karza
Companies that offer non- traditional or unconventional sources of data for assessing creditworthiness and making lending decisions.	Embedded finance platforms integrate banking services within non-financial apps and websites for seamless financial transactions and services directly within user experiences.	Banking data providers and account aggregators drive lending decisions through advanced analytics, open banking, and API integration for seamless financial insights	Credit Bureau use AI and Big Data enhance credit scoring and report analysis for precise, efficient lender decisions.	KYC and AML compliance through API solutions, including Video-KYC, meeting evolving regulatory standards.

1.1 LOAN ORIGINATION SYSTEM (LOS)

LOS is a software platform that helps lenders in managing the entire process of loan application, approval, and disbursal. It automates tasks such as data collection, document verification, underwriting, compliance, and workflow management.

Process of Lending

Data Collection	The process begins with creating the lender's profile. Previously done through physical interview solutions integrate with modular data portals like account aggregators to gather essential custo
Data Verification	The verification process was usually done through interviews, background checks, document ver UIDAI, account aggregators, NSDL, etc. to authenticate information in real-time. Thus, this proce
Underwriting	Traditional solutions focus on financial and bank statements, while modern systems utilise a wid creditworthiness and collateral value. Real-time analysis through frameworks like account aggre
Collection	Collections involved the lender using field agents to solicit the loan. The process also had a high can utilise frameworks like eNach and auto UPI to automatically collect payments from the borro
Compliance	Before LOS solutions, banks had to manage a vast physical document repository, making audita data storage and tracking, enabling comprehensive monitoring of operations aligned with regul

Evolution of LOS

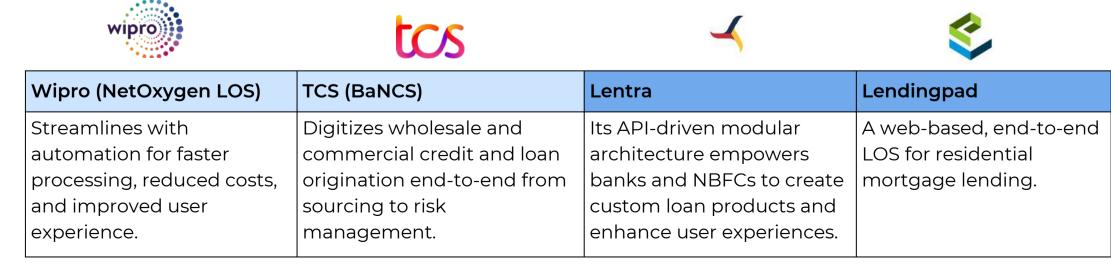
Pre 2010

- Monolithic systems, challenging to integrate, support multiple apps with separate server-based storage.
- They entail setup fees, maintenance costs, and long implementation times, requiring skilled security personnel.
- Manual credit assessment results in processing times of 15-30 days.
- Regulatory reporting is manually filed using data warehouses, used by both public and private sector banks.

2010-2015

- Monolithic and tightly coupled systems offer medium integration difficulty, don't support multiple apps, and feature server-based data storage.
- They involve a one-time setup fee, annual maintenance costs, and medium implementation times, requiring security expertise.
- Manual credit assessment leads to processing times of 7-10 days, with regulatory reporting manually filed using data warehouses.

Key Loan Origination Systems



ws, it's now conducted virtually via dedicated portals. Modern omer information directly.

erification, etc. Current solutions can directly interface with ess can be entirely automated.

de range of data points for a clearer assessment of egators refines this process.

degree of opacity. With the rise of digital payments, banks rowers's accounts. LOS has plug-ins for this.

ability and data tracking challenging. LOS solutions simplify ulatory guidelines.

Post 2015

- Featuring an open system architecture and auto-scalability, this system offers low integration difficulty, cloud-based data storage, and flexible payment options.
- It ensures quick implementation, enhanced security, and streamlined credit assessment with processing times of 1-3 days.
- Automated regulatory reporting makes it suitable for banks, NBFCs, and fintech companies.

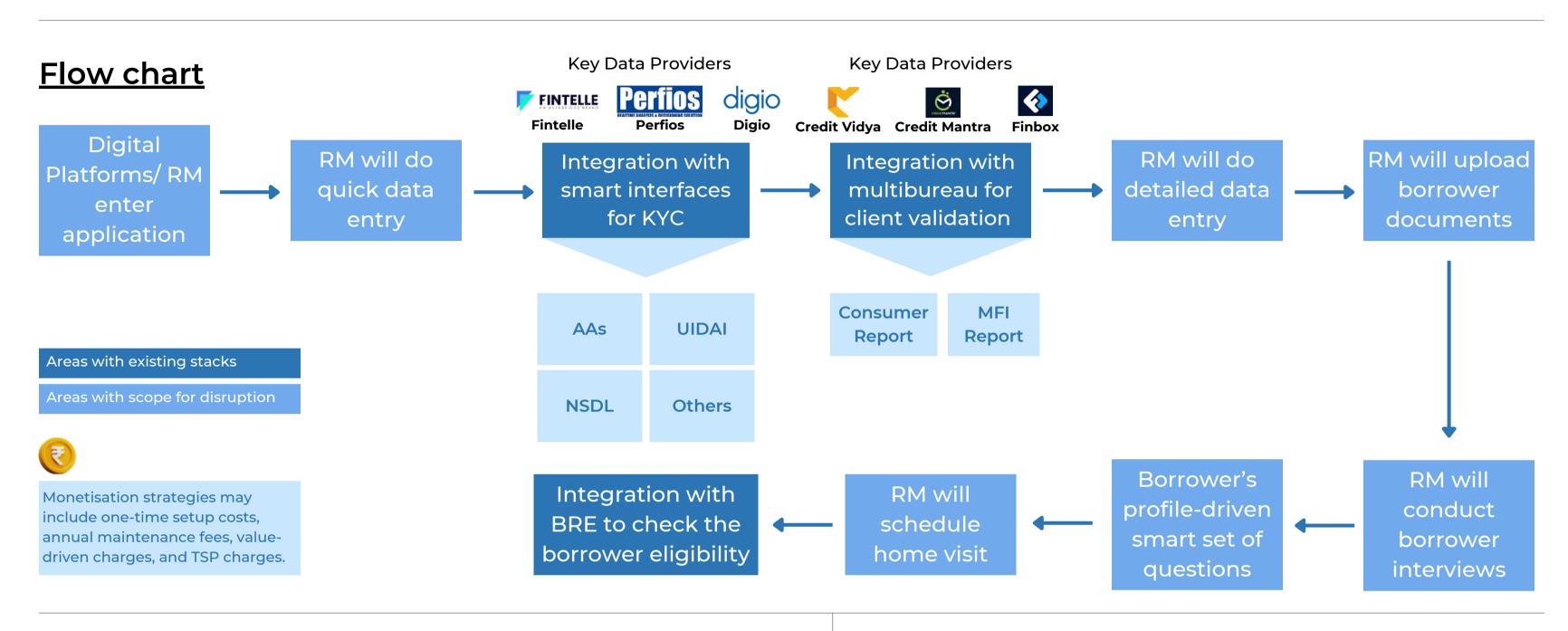




Finflux	Veefin
Finflux offers a centralized	Veefin uses extensive
lead generation platform	integrations, AI-powered credit
all the way to seamless	scoring, and robust data
CART & CRAM analyses.	accessibility to serve as an end-
	to-end tool.

1.2 MODULAR LOS SOLUTIONS

With rapid evolution, LOS solutions are now far more adaptive. They cannot only service a large part of the lending workflow through in-built systems, but can interact with external data providers real-time to add more precision to the process.



<u>Key Data Providers</u>

Credit Vidya	Uses alternative data with AI algorithms to enable customer profiling and underwriting for new-to-credit customers.
Perfios Realtime analysis & decisioning solution	Perfios onboards users better using a comprehensive KYC suite and underwrites better by analysing their financial statements.
Finarkein Analytics	Finarkein assists in customer profiling and underwriting by providing lenders access to real-time data on AA.
Glib	Glib analyses financials statements, verifies customer income information, and analyses spending patterns to aid the lender.
Finbox	Finbox solicits customer data from multiple sources to aid in customer profiling, underwriting, and real-time risk management.

- conversational bots, streamlining initial customer interactions.
- Gen AI automates data collection effectively, particularly through • It enhances eKYC, speeding up processes while maintaining precision, and automates interviews seamlessly.
- Gen AI decrypts unstructured banking data, simplifying synthesis and interfacing with frameworks like account aggregators for additional data points, facilitating underwriting across asset classes.
- It tracks borrower behaviour for real-time repayment evaluations, improving transparency with automated reminders.
- For compliance, Gen AI solutions serve as comprehensive documentation repositories, ensuring real-time evaluation and transparency.

Generative AI Use Cases Across Work Flow

1.3 LOAN ORIGINATION METHODOLOGY

Comprehensive loan origination systems must integrate various factors and data points for effective underwriting, with distinctions between secured and unsecured lending workflows.

<u>Key Parameters to Consider</u>

Credit History Analysis

These filters refine lead quality for lenders. The 5C framework, highlighted below, is a popular tool:

- 1. Character: Evaluate reputation using references, credit history, etc.
- 2. Capacity: Determine repayment capacity through cash flow, DTI ratio, etc.
- 3. Collateral: Verify adequate assets or security against loans.
- 4. Capital: Assess financial health using statements, outstanding invoices, etc.
- 5. Conditions: Consider socioeconomic factors impacting repayment ability.

Credit Risk Analysis

The purpose of credit risk analysis is to analyse the risk factors and minimise losses due to defaults. The computation of credit risk considers the below factors.

- 1. Default Probability: Calculated using similar loans over a definite period and the % of defaults.
- 2. Exposure: It is the amount borrowed by the debtor plus interest payments.
- 3. Loss Rate: It is the lender's projected loss in the event that a borrower triggers an event of default.

Assess Intention to Repay

Lenders try to figure out a person's intentions through personal conversations and document verification. They would consider their cultural makeup and values in their decision to lend.

- 1. Interviews: Lenders interview customers to analyse their behaviour and personalities.
- 2. **KYC:** A thorough process of analysing and verifying the borrower's details is undertaken.
- 3. **Psychometrics:** Psychometric tests are standardised assessments that measure personality traits and behaviour patterns.

Secured Lending

- Secured lending relies on assets equal to or exceeding the loan value, ensuring easier disbursement and lower interest rates due to the asset's security.
- Special workflows are required for secured loans, particularly for digitising various asset classes. While digital assets like mutual funds are manageable, physical assets like gold pose challenges, necessitating tailored workflows.

Unsecured Lending

- Unsecured loans rely solely on borrower creditworthiness without collateral, leading to higher interest rates; lenders assess various data points for repayment evaluation.
- Unsecured loans rely on customer-provided information and digital data, facilitating easy digitisation of workflows. Lenders collaborate with various data portals and verification providers for comprehensive coverage.

Key Metrics Analysed

Pull-Through Rate

The pull-through rate indicates workflow efficiency, application quality, customer service, interest rate competitiveness, and customer profile alignment.

Application Approval Rate

This metric sheds light on the quality of the client acquisition and the efficiency of the overall loan application workflow.

Cost Per Unit Originated

Cost per unit originated is a great metric for evaluating the operational efficiency of your loan prospecting by measuring against business expenses.

Abandonment Rate

This metric highlights interest rate competitiveness and the lender's ability to close leads.

1.4 TRENDS IN LOAN ORIGINATION

With a more open data ecosystem, deeper partnerships, and cutting-edge technology, the loan origination process is becoming far more expansive. This has enabled lenders to find larger audiences and serve with higher precision and efficiency.



What Does It Mean?

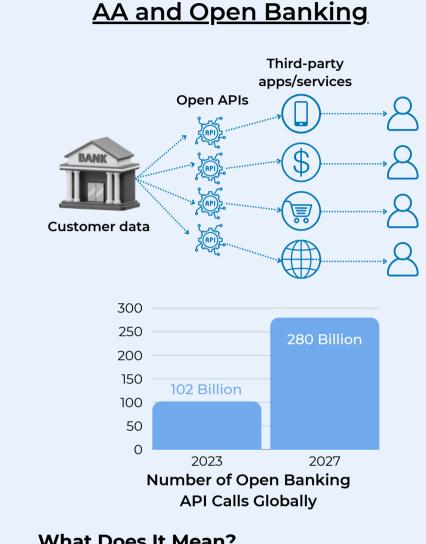
Simply put, embedded finance is the integration of financial services into traditionally non-financial offerings to attract new customers. This can take the form of BNPL (Buy Now Pay Later), point-ofsale financing, etc.

How Does It Benefit Lenders?

Embedded finance benefits lenders by expanding their customer base through convenient, targeted financial products while streamlining operations and reducing costs through partnerships.

What Is The Growth Opportunity?

In India, 60% of consumers are keen to avail of embedded financing solutions which has led major platforms like Amazon, Flipkart, etc, to adopt modalities like BNPL in their platforms.



What Does It Mean?

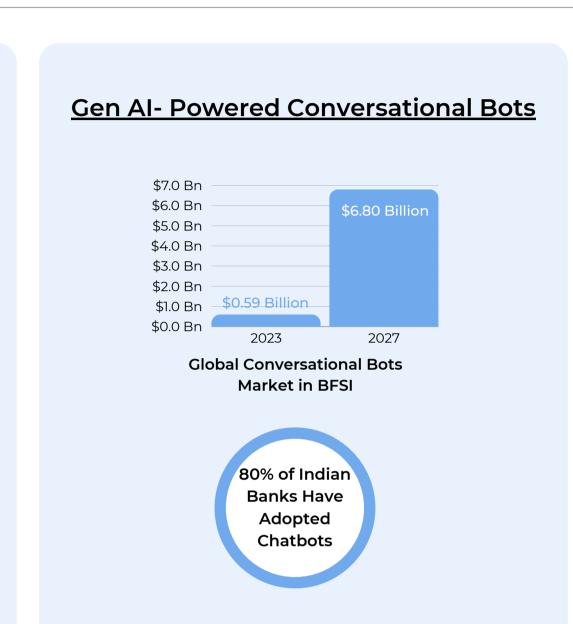
Open Banking unlocks financial data with the user's permission to allow secure sharing with regulated third-party providers. Account aggregators (AA) act as an intermediary by collecting data that hold the customers' financial data and share that with lenders.

How Does It Benefit Lenders?

Open Banking benefits by offering precise user data more accurate credit assessments. This leads to reduced risk and personalised loan offerings which can attract new customers and improve profitability.

What Is The Growth Opportunity?

In India, the number of successful open banking payments increased by 130% between 2022-2023. Further, 14 AAs operate with a NBFC-AA license.



What Does It Mean?

These are AI assistants that engage potential borrowers for qualifying leads and pre-filling application while gathering key information to streamline the process and assess them. The injunction of generative AI will make these conversations more authentic for customers.

How Does It Benefit Lenders?

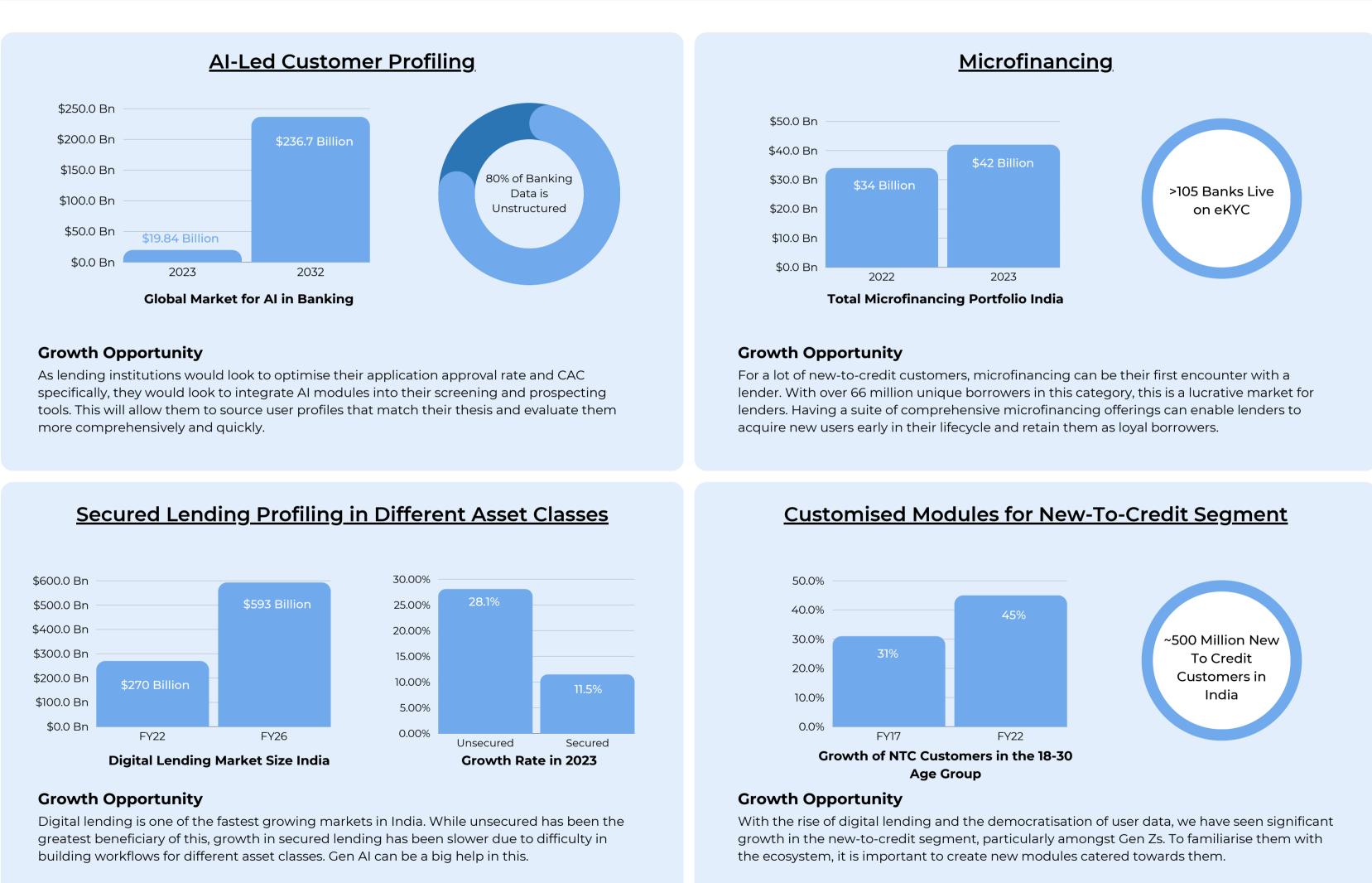
Conversational bots benefit by capturing more qualified leads 24/7 and automating key steps in the process. This translates to increased loan applications, faster processing times, and lower operational costs.

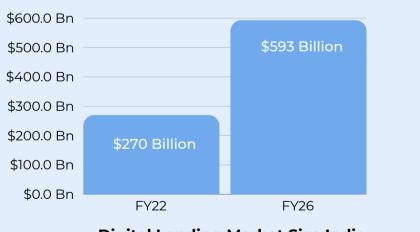
What Is The Growth Opportunity?

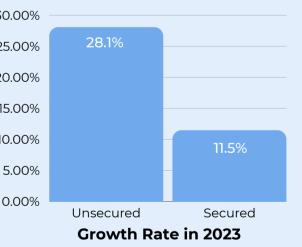
While this market grows at an 84% CAGR globally (Statista), 80% of banks have adopted them in India.

1.5 WHITESPACES IN LOAN ORIGINATION

To unlock the potential of this market, lenders need to not only make use of new technologies and serve new audience bases better, but also look to develop new solutions that can make use of these tailwinds to become large outcomes.











2.1 LOAN MANAGEMENT SYSTEM (LMS)

A Loan Management System empowers lenders by automating and streamlining the entire loan life cycle. LMS systems cover various processes including loan servicing, reporting, customer care, syndication and customer monitoring.

FIUCESSES	LIVIS SOLUCIONS SELVE
Application Processing	After the loan has been underwritten by the lender, the data of the application is fed to the LMS other important information in the platform which acts as a centralized server.
Loan Servicing	These systems help lenders perform complex computations on taxations, interest rates, track more. Modern LMS solutions can empower lending operations covering different types of loans
Debt Collections	LMS platforms enable lenders to track repayments, overdue amounts, and late fees. They can al terms. They also aid relationship managers and other staff in reviewing team-to-borrower comr
Portfolio Management	These systems enable comprehensive reporting through incisive and personalized analytics too portfolio's performance, delinquency rates, and profitability. These insights support data-driven
Reporting	LMS platforms also automate the storage of important documents for compliance and taxation options that make for easier auditing and document retrieval.

Processes I MS Solutions Serve

Evolution of LMS

API-Driven Architecture	Automated Processes	Digital Banking Enabled	Co-Lending Frameworks	Deferred Collections
While the preceding technology tended to be quite monolithic, newer solutions, especially after the pandemic, focus on providing a modular stack of integrations that allow lenders to customize their software. With cloud computing, they have become more efficient.	While earlier LMS solutions were capable of maintaining an oversight over the different lending operations, manpower was still needed to execute certain tasks. Newer LMS solutions are capable of robotic process automation (RPA) which can process mortgages and other loans 80% faster.	transactions, swiftly transitioned to digital payments post- pandemic, recording over 100 billion UPI transactions in 2023. LMS portals were revamped to facilitate digital banking, ensuring a seamless process for customers.	quadrupling from FY22. With the surge in digital lending and fintechs, LMS solutions adapted to handle their workflows, including splitting loan	With the rise of digital-native borrowers and business models like BNPL, LMS solutions have had to become more flexible to allow the structuring of more relaxed collection plans. This can allow lenders to attract the new- to-credit (NTC) market as well.

Key Loan Management Systems

Margill







Margrill	Cloudbankin	Finnone Neo	LoanPro	Finflux	TurnKey Lender
A cloud-based solution,	Offers easily configurable	An end-to-end lending	Increase operational	Allows lenders to design	Automate all elements of the
which assists lenders with	modules-driven solution for	suite that digitizes the	efficiency, simplify the	customised lending	loan cycle from loan
servicing multiple loan	all types of loans allowing	complete lending lifecycle	loan lifecycle, and create	products, leverage an API-	application, underwriting,
types with support for	lenders to manage their	with smarter and faster	any number of loan types	driven architecture to	servicing and collection to
automation and complex	portfolio in just a single	credit decisions driven by	using one comprehensive	collaborate and remain	reporting using a customisable
computations.	platform.	460+ APIs.	LMS platform.	compliant with guidelines.	solution.

1S. This results in the creation of the borrower's profile and

monthly repayments, generate monthly statements, and IS.

also check borrower history and arrange for new payment nmunication throughout the customer journey.

ools that help lenders gain valuable insights into their loan n decision-making.

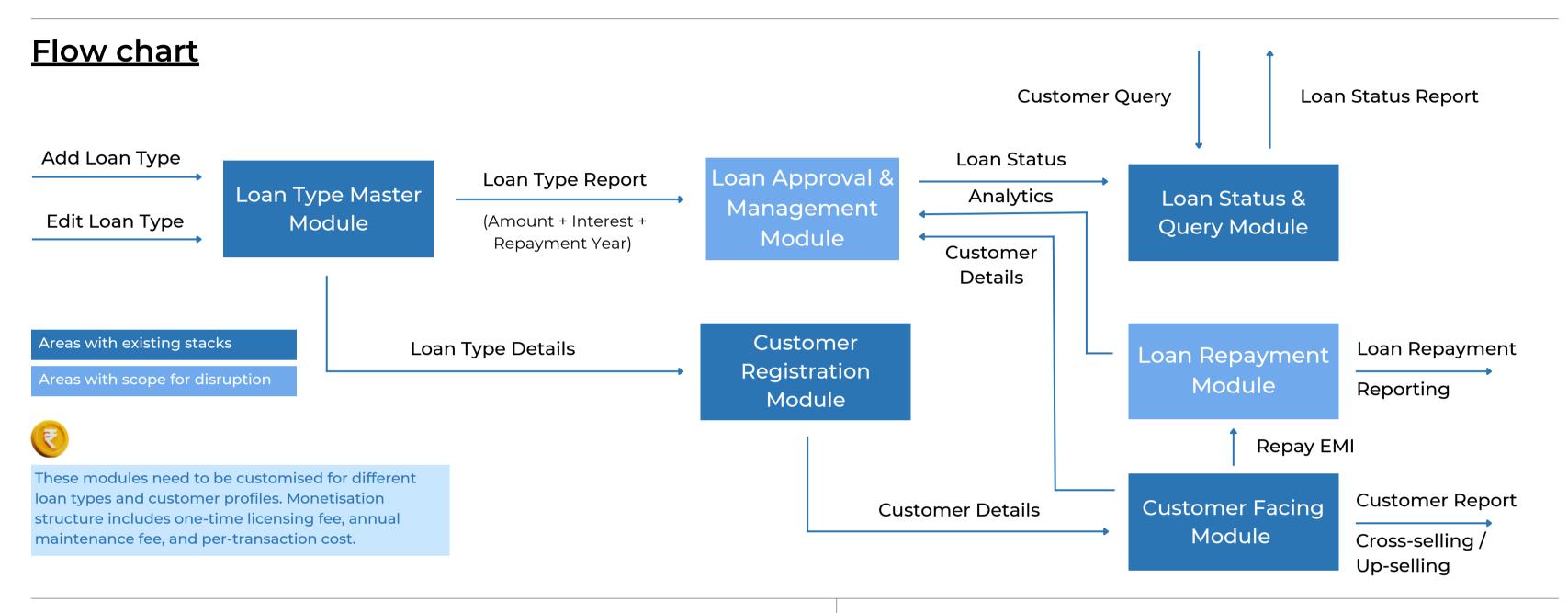
on purposes. They also tend to provide cloud-based storage





2.2 MODULAR LMS SOLUTIONS

With greater modularity and an API-drive architecture, LMS can be tailor-made to fit the lender's needs. The introduction of generative AI can amplify their abilities considerably. With the rise of co-lending and the new FLDG guidelines, these solutions will need to be more comprehensive to accommodate multiple parties and types of loans.



<u>Key Data Providers</u>

Credit Mantri	Credit Mantri enables lenders to have greater insight into borrowers by leveraging the power of alternate data.
ſ	Idfy mitigates the risk of fraud using tech-powered products and solutions for KYC, and digital onboarding.
Decentro	Decentro offers white-label solutions for payments, seamless KYC, and AI-powered compliant debt collections for lenders.
PiChain PiChain	PiChain uses AI and blockchain along with deep domain expertise to ensure sustainable compliance management.
A Razorpay	Razorpay is India's first full-stack financial solutions company which can be leveraged by lenders for building a digital repayment stack.

Generative AI Use Cases Across Work Flow

- Generative AI could be used by lenders alongside account aggregators (AAs) for tracking other loan products availed by users in the market and create a comprehensive customer profile.
- The technology can also be used to create synthetic data sets that simulate various economic scenarios for stress-testing the portfolio for adverse situations.
- borrowers.
- lenders.

- Generative AI can analyse borrower behaviour and identify an increased risk of delinquency which can be pivotal in risk
 - management and creating more flexible repayment plans for those

• Al can also automatically segment the portfolio into cohorts based on risk profiles which makes performance monitoring more intuitive for

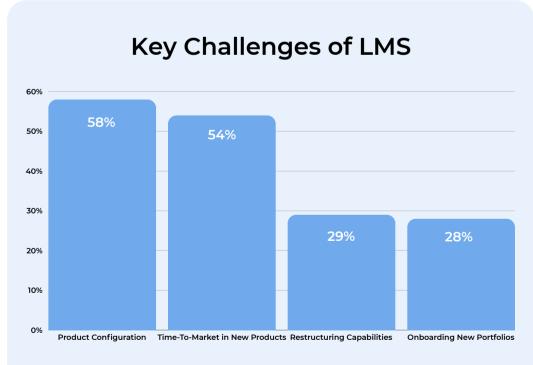
2.3 LOAN MANAGEMENT LANDSCAPE

As the effectiveness of LMS solutions has increased, so has the requirements from lenders. With new-age solutions, lenders look for comprehensive solutions which can offer greater flexibility.

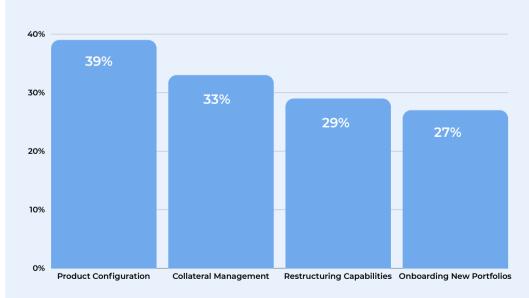
Key Checkboxes for LMS Modules



Key Checkboxes for LMS



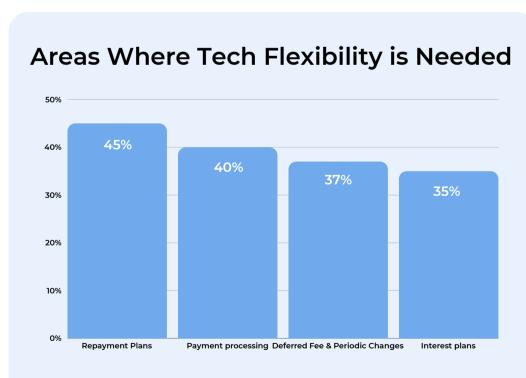
- The biggest problem statement for lenders in LMS is configuration as that hinders their ability to create personalized loan products.
- Time-to-market follows as a close second which indicates scope for greater automation in both product creation and market release.



- Lenders demand more flexible LMS platforms for personalized offerings due to democratized user data.
- Efficient workflows for secured lending, notably collateral management, are still sought after despite advancements in unsecured lending.

Most Desired Features of LMS

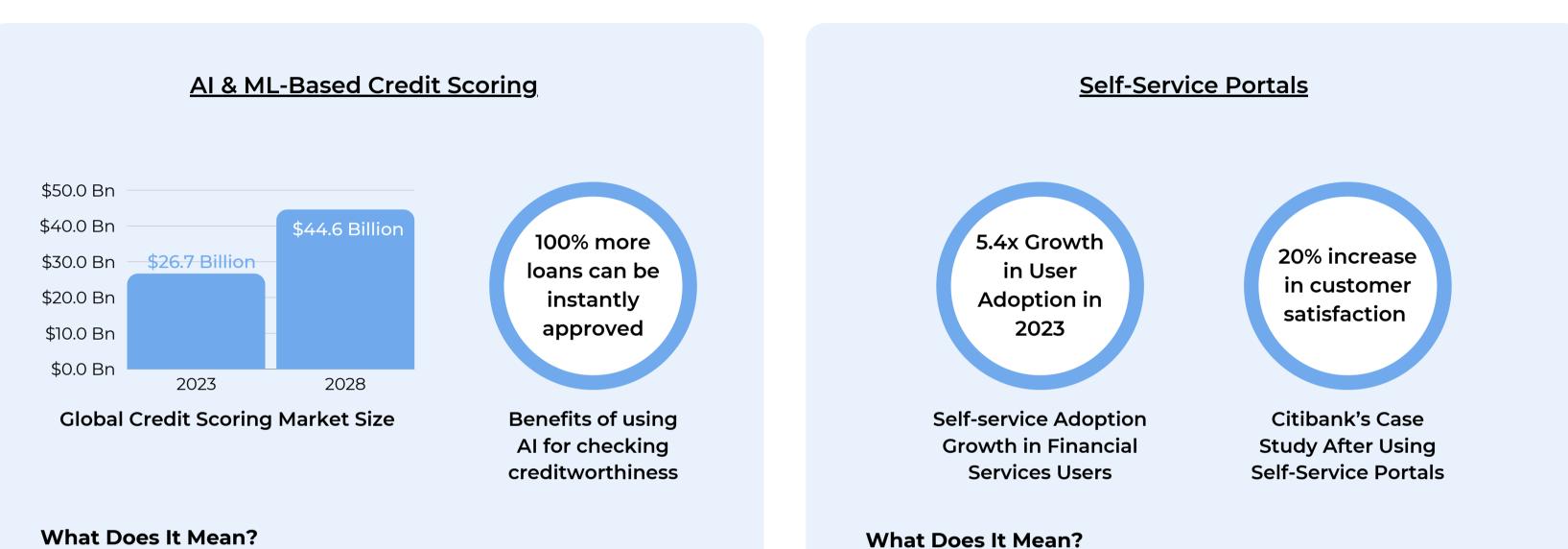
ways	Performance Management Default Customer Analysis
′S	Smart Views Performance Tracking
plications ations	Dynamic Micro/Macro reports



- With the onset of structured repayment plans and deferred repayment plans, lenders are looking to offer greater flexibility to borrowers.
- As digital transactions have increased significantly in volume, lenders want more comprehensive payment modules.

2.4 TRENDS IN LOAN MANAGEMENT SYSTEMS

To account for a rapidly evolving landscape, LMS are evolving to accommodate cutting-edge technology to increase effectiveness across the board for lenders and offer better products to borrowers.



Banks calculate portfolio at risk and the potential of default using a multitude of static variables. ML and AI allow banks not just real-time insight into the borrowers' actions, but also faster and more precise synthesis of these data points.

How Does It Benefit Lenders?

Using AI and ML can not only allow lenders to track their credit risk at a real-time basis but, this technology can also allow banks to factor in more dynamic variables in their calculation which can aid them in portfolio management and credit risk mitigation.

What Is The Growth Opportunity?

Growing at a CAGR of 67.2%, the credit-scoring market is expected to reach \$44.6 billion by 2028. As one-fourth of borrowers in India prefer online lending channels, and the tally of NTC customers reaches 400 million, AI and ML will find increased use for unlocking these markets and tracking their behavior for more accurate forecasts.

Self-service portals provide borrowers with a centralized location from where they can manage their borrowings. Lenders are now working to build such portals to allow borrowers additional flexibility digitally. They also serve as another use case for AI-powered chatbots.

How Does It Benefit Lenders?

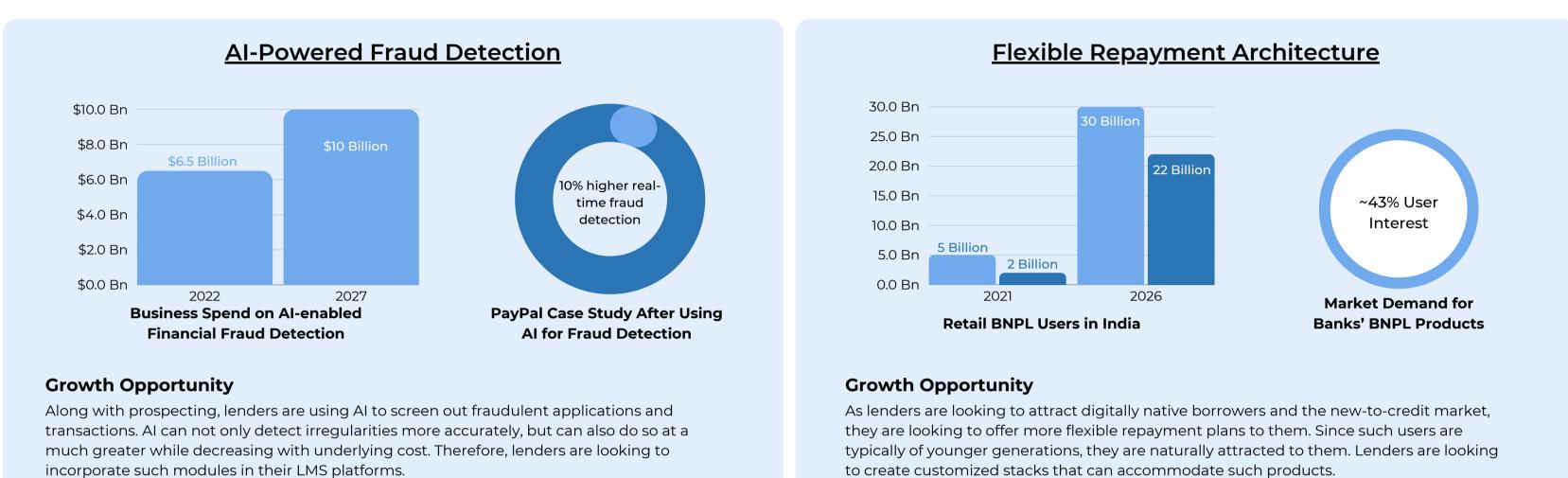
Self-service portals not only allow lenders to reduce their manpower needs but also enables greater satisfaction amongst customers. Since modern LMS solutions can enable such portals, they greatly boost customer engagement.

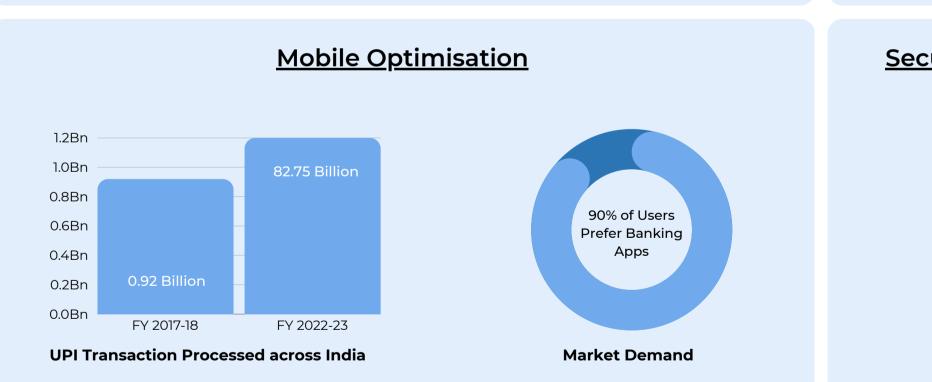
What Is The Growth Opportunity?

As per Zendesk, financial services users' adoption of self-service portals has increased by 5.4x in 2023. As lending becomes increasingly digital, this trend is expected to grow.

2.5 WHITESPACES IN LOAN MANAGEMENT SYSTEMS

While there has been considerable evolution for LMS platforms over the past few years, there are areas that need to be addressed to offer a more sophisticated suite of offerings.





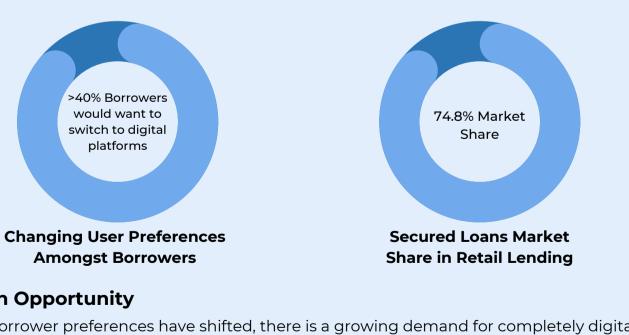
Growth Opportunity

Married with the rise of digital lending products, there has been a suite of offerings targeted specifically for mobile users. With India having over 659 million smartphone users, lenders are looking to create customized experiences to target mobile customers and offer them greater flexibility in managing their borrowing via those devices.

Growth Opportunity As the borrower preferences have shifted, there is a growing demand for completely digital borrowing experiences. To accommodate this market, LMS platforms would need to incorporate modules that can facilitate secured lending at a greater scale through the valuation of different assets, default treatment, repossession, liquidation, etc. digitally.

to create customized stacks that can accommodate such products.





3.1 DEBT COLLECTION SOLUTIONS

A debt collection software is a tool for streamlining and automating the collection process to increase collections and mitigate credit risk through a panoramic view of the collections process.

Account / Data Management	Debt collection software act as a central hub for collections by storing and organizing debt updating accounts with new information for efficient tracking and management by lender
Collection Management	These systems organize the collection process by creating automated workflows, monitori credit risk, and automatically assigning cases to debt collection agents for expediting the p
Borrower Communication	Debt collection software offers multi-channel communication tools with pre-built template outreach at scale.
Payment Processing	Such systems integrate with secure payment gateways, enabling debtors to make online p transactions, reduces manual processing, and provides real-time payment confirmation.
Reporting	Debt collection software analyzes vast data on debtor behavior and collection efforts, gene trends and measure collection effectiveness. It also tracks communication and actions to e

Processes Debt Collection Solutions Serve

Key Debt Collection Solutions

G Credgenics	DPDzero	leadsquared	֎ datacultr	🕥 Prodigal	CRE⊅ITAS
digital communications, AI powered predictor models, comprehensive dashboards and deep analytical models	managing from data automation to recovery, by prioritising borrower relationships and	manage the end-to-end field collections lifecycle with advanced automation, guided actions and direct	digital debt collection platform, enabling lenders to reduce risk on 'new to credit' customers by binding the loan to	targeted digital engagement. Prioritize accounts based on fresh information. Transform	Provides lending institutions around the world with tech- based debt collections solutions to help them unlock efficiencies, enhance the brand experience, improve recovery success and reduce cost.

Processes Fraud and Risk Management Tools Serve

Risk Governance	FRM tools allow lenders to finetune the risk parameters and overall risk approach they wou automate parts of the lending and risk management processes, but also allow the lender to
Application Verification	FRM tools integrate with several data repositories to vet borrowers' applications. This not or also verify their authenticity through document verification.
Portfolio Tracking	Working with alternate data providers, these tools can track borrowers' risk profile and thei behavioral patterns in the borrowers to detect any anomalies and flag them to the borrowe
Case Management and Resolution	In addition to identifying risks, FRM tools also work with fraud analysts to manage their wo optimised their efficiency. They also offer direct ways of communicating with borrowers-at-
Reporting	As a result of monitoring both the portfolio and the inflow of applications, FRM tools are ab applications received by the lender and also the core characteristics of their portfolio. This h

btor data (names, balances, history, etc.) and automatically ers.

ring accounts to track repayment possibilities and evaluate process.

ates and automated scheduling. This allows personalized

payments directly through the platform. This streamlines

nerating insights through advanced analytics that identify ensure adherence to compliance regulations.

buld be looking to adopt in their portfolio. This can not only to alter their risk approach from one centralised console.

only helps evaluate the creditworthiness of applications, but

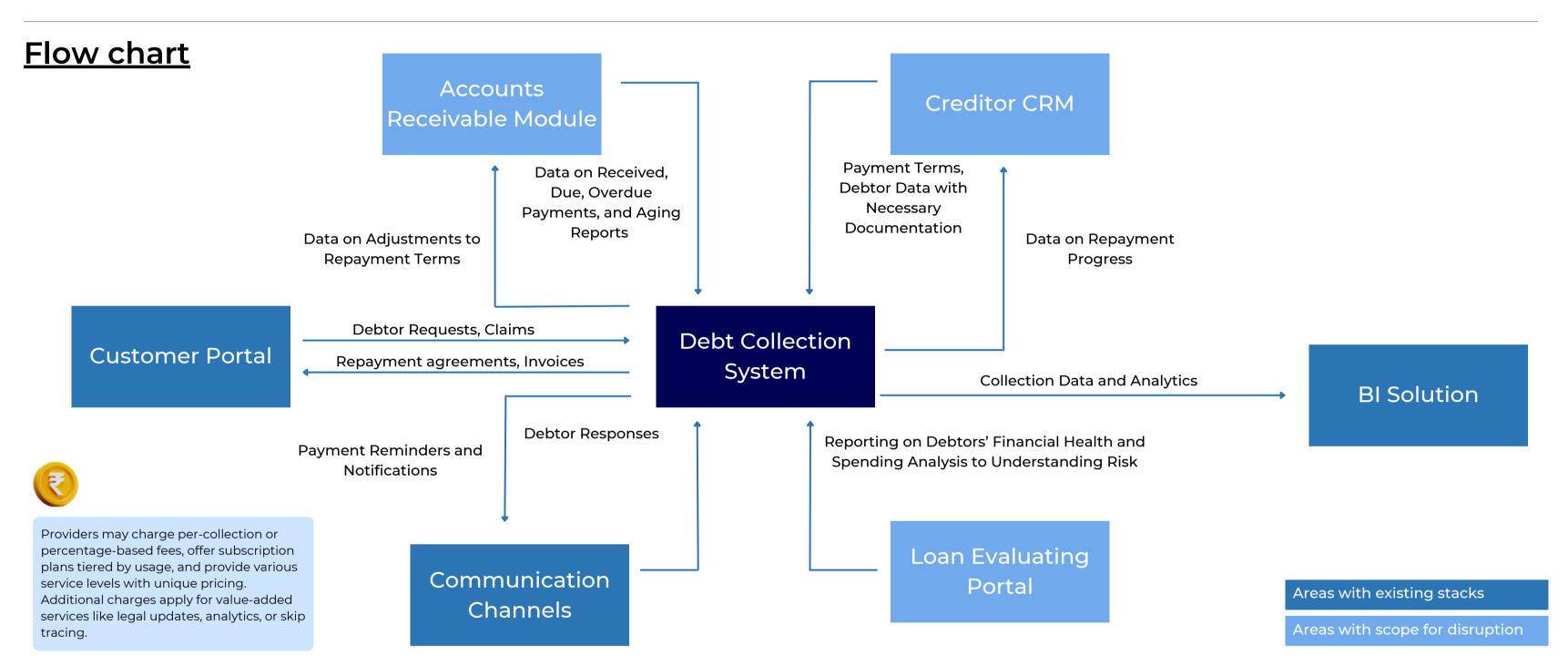
eir behavior on a real-time basis. They can also recognise ver. This has a greater use case in credit cards.

orkloads and assign them cases suited to them. This at-risk and resolving situations.

ble to provide precise insights into both the nature of helps lenders manage their operations better.

3.2 MODULAR DEBT COLLECTION SOLUTIONS

As the scope of processes undertaken by debt collection solutions has increased, lenders are looking to create more personalized workflows through specific integrations. As the penetration of generative AI across these workflows increases, their intuitiveness and precision are bound to increase.



Key Integrations for Debt Collections

tcn	TCN offers a robust cloud call center technology in the industry to boost revenue, recovery rates and compliance for lenders.		W TransUnio
	Livevox offers a cloud-powered omnichannel collections		
	platform that is easy to use and optimise.		An Equifax Company
Five	Five9 helps contact centers automate debt recovery and optimize agent effectiveness while lowering operational costs		
FIVE7'			🕺 squirr
GENESYS [®]	Genesys helps manage manage account assignment, segmentation and exception handling for the entire lifecycle		
	including collections, litigation or recovery.		actico

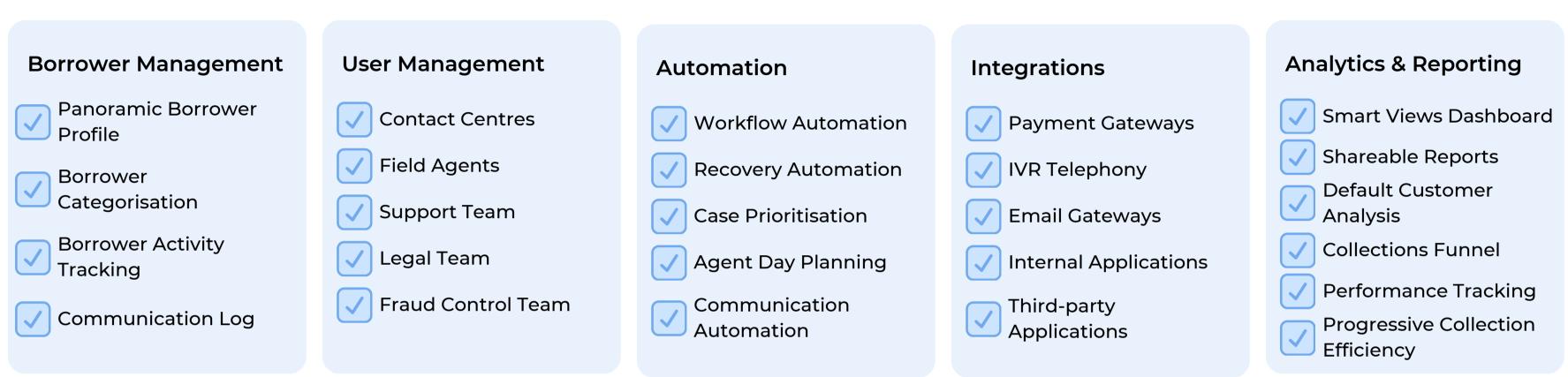
Key Integrations for FRM

ion.	TransUnion has tools like TruValidate and TruVision which power identity verification and credit risk management respectively
	Kount offers a complete approach to trust and safety with tools for payments fraud, identity verification, and compliance.
0	Squirro helps companies to identify and evaluate risks while minimizing manual and time-consuming research.
	Actico allows lenders to analyze and monitor credit risks, automate loan and decision-making processes

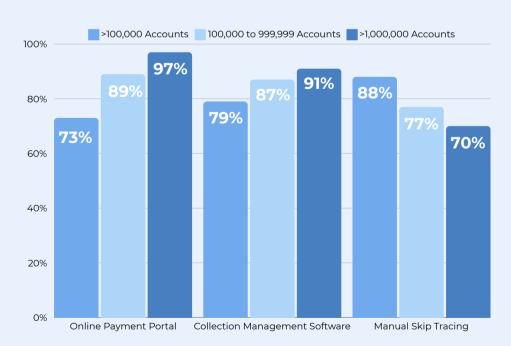
3.3 DEBT COLLECTION SOLUTIONS LANDSCAPE

Since the services covered by debt management solutions has increased over the past few years, the checklist for ideal solutions has gotten more complex. As AI percolates to these solutions, its use-cases are starting to emerge.

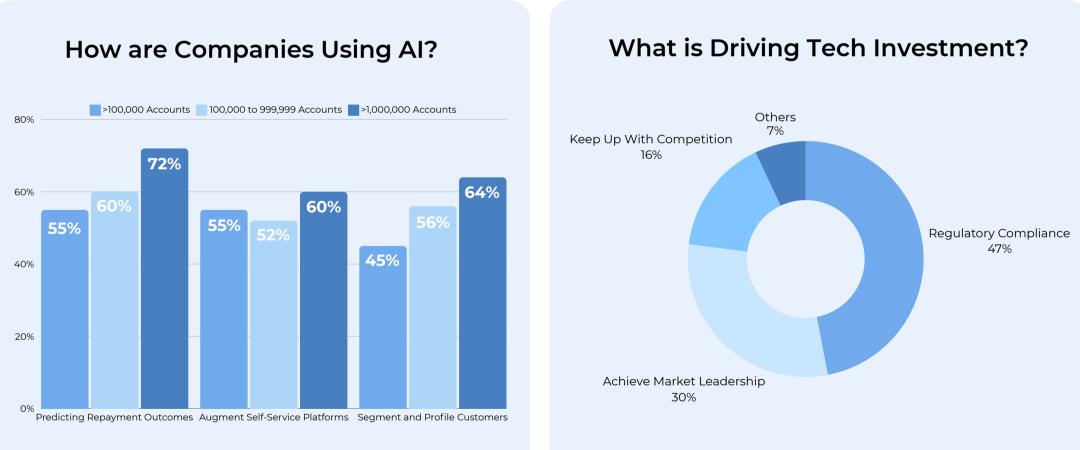
<u>Key Checkboxes for Debt Collection Solutions</u>



What Tools Are Companies Using?



As online transactions become more popular, companies, especially those with fewer accounts, are relying on online platforms for collections. In contrast, larger companies prefer specialized collection management software for its added functionality and customization options.

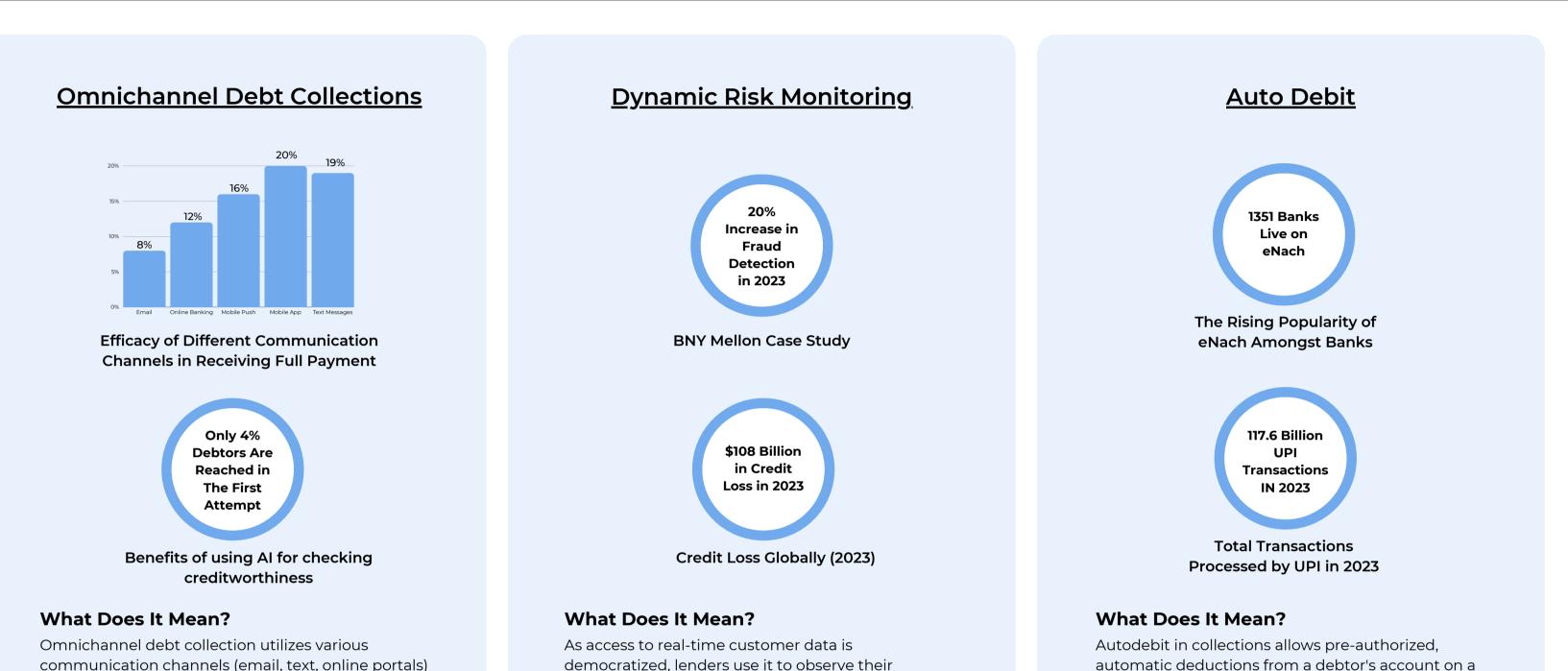


Collection companies leverage AI to analyze big data rapidly and predict repayment outcomes in their portfolios efficiently. Lenders are also adopting self-service platforms to enhance automation and operational efficiency.

New technology serves as a watchtower, ensuring oversight and auditability of operations, particularly in compliance. Optimizing collection rates and net interest margins drives lenders to adopt market-leading tech.

3.4 TRENDS IN DEBT COLLECTION SOLUTIONS

As customer behavior and the enabling technology continue to evolve at break-neck pace, these systems are also undergoing rapid evolutions to provide more flexibility to lenders and more ease to borrowers.



communication channels (email, text, online portals) to reach debtors, leveraging data to personalize outreach and automate interactions for efficient recovery.

How Does It Benefit Lenders?

By using debtor data to predicting the most effective communications channel, lenders are looking to increase successful contacts which is the biggest problem statement in collections (only 4% debtors are reached in the first attempt).

What Is The Growth Opportunity?

Lenders are shifting towards digital-centric approaches, recognizing the higher success rates of digital channels compared to traditional ones, which typically achieve only a 12% successful contact rate.

How Does It Benefit Lenders? Lenders are able to use this added access to analyze borrower behavior with greater precision which makes the entire process more dynamic and transparent. They are also able to mitigate emerging

borrowers on a real-time basis to generate precise

management process.

repayment probabilities. This greatly boosts the risk

What Is The Growth Opportunity?

risks and proactively reach borrowers-at-risk.

As the global credit loss reached \$108 billion in 2023, lenders are looking for ways that can add more clarity to the cycle for them and identify possible risks as soon as possible.

automatic deductions from a debtor's account on a scheduled basis. This streamlines payments, reduces delinguencies, and integrates with collection software for real-time updates on received funds.

How Does It Benefit Lenders?

Autodebit in collections minimizes manual payment processing, eliminates late fees due to missed payments, and ensures predictable cash flow for lenders through automated deductions directly from debtor accounts.

What Is The Growth Opportunity?

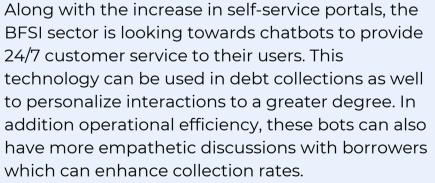
As the transactions processed on UPI exceeded 100 billion in 2023, users around the country have become comfortable with digital payments. Banks and other lenders are looking to make use of this familiarity to reduce their credit risk.

3.5 WHITESPACES IN DEBT COLLECTION SYSTEMS

To meet the problem statements associated with traditional debt collection systems and the emergence of new areas where technology can cover market gaps, these platforms need to increase in operational capabilities and features.



The biggest use-case of AI in debt collections is in its ability to identify borrower patterns and predict delinguency ahead of time. As the delinguency rate in digital lending in India reaches 4.2% (primarily driven by micro-loans and the new-tocredit segment), lenders can integrated AI to foresee borrower behavior ahead of time.



Banks and lenders as a whole are looking to increase investments into AI for reducing their credit loss and making their operations more efficient. Better user segmentation can not only increase the lucrativeness of their products through higher personalization, but also boost the effectiveness of their risk management processes through more clarity on the borrower profile and the risk associated with their borrowings. They can also create personalized collection plans.

4.1 CREDIT CARD MANAGEMENT SYSTEM (CCMS)

CCMS empowers banks and financial institutions to provide credit card services, with modules facilitating customer approval, card issuance, personalized offers, purchase management, and payment handling.

Application via LOS	The process begins when a customer applies for a credit card through the LOS. The LOS ca like eligibility criteria and credit checks using Aadhaar and PAN.	
Approval and Account Setup in LMS	Once the application passes the initial checks, the LMS takes over for credit risk assessmen credit account with e-KYC. For secured cards, digital lien marking needs to happen.	
Card Details Generation in CCMS	The CCMS generates the credit card details, including the card number, expiry date, and C customer's name and card details. Online form factors exist today.	
Fraud Checks with FRM	Before the card is issued, the Fraud Risk Management (FRM) system assesses the appl security of the card issuance process.	
Card Issuance and Dispatch	The CCMS approves and coordinates card issuance, including printing and dispatching the for security and need activation. User-friendly experience layers, like mobile apps or custon management, often integrated with back-office reporting in modern systems.	

Process of Creating a Credit Card

Process of Making a Transaction via Credit Card

Transaction Initiation	When a customer uses the card for a transaction, the merchant's mPOS system or online p transaction. The transaction gets routed to ACS through network routes, the ACS validates
Authorisation by CCMs	The CCMS receives the transaction request, verifies the card details (switch integration con (Bank Identification Number) using protocols like ISO 8583 for messaging), checks for suffic transaction.
Fraud Monitoring by FRM	Concurrently, the FRM system evaluates the transaction for potential fraud based on variou customer's spending patterns. New age systems can have different merchant-level control
Transaction Posting & Account Update in LMS	Upon successful authorisation, the transaction is posted to the customer's account in the L

Process of Collecting Payement via Credit Card

Statement Generation by CCMS	The CCMS issues monthly statements for cardholders, detailing transactions, dues, and mir installments. It informs the bank of collection amounts, managed through a pool account a
Payment Processing & Account Update in LMS	The customer makes a payment, which can be processed through various channels like ne payment is updated in the customer's account in the LMS, reducing the outstanding balan
Collections	If payments are overdue, the Collections system gets involved, using data from the Custom and recovery processes effectively.
Reporting and Analytics	The data is collected and analysed for reporting, insights, and continuous improvement of and operational efficiency. It also gives information to CIBIL for the customer's credit score.

captures the application details and performs initial checks,

ent and approval. Upon approval, the LMS helps set up the

CVV and is physically produced and personalised with the

ition and the customer for potential fraud risks to ensure the

ne physical card to customers. Cards are typically sent inactive omer portals, aid in activation, PIN setup, and card

payment gateway captures the card details and initiates the es the OTP and network sends a signal to card processor.

nfigures the switch to route transactions based on BINs ficient credit limit, and then either authorises or declines the

ous parameters like transaction amount, location, and ols.

LMS, updating the account balance and available credit.

inimum payments, which can be divided into multiple across networks and deducted upon settlement.

et banking, UPI, or direct bank transfers and further the nce and updating the available credit.

mer Management System (CMS) to manage communication

f the credit card program, enhancing customer experience e.

4.2 EVOLUTION OF CREDIT CARD MANAGEMENT SYSTEM (CCMS)

The transition from traditional to next-gen platforms, today's CCMS solutions seamlessly integrate with external data ecosystems in real-time, enhancing precision and adaptability across the lending landscape.

Evolution of CCMS

Pre 2010

- Magnetic stripe technology standard for data storage.
- Basic fraud detection algorithms with limited predictive capabilities.
- Traditional banking infrastructure with proprietary systems for credit card management.
- Initial introduction of EMV (Europay, Mastercard, and Visa) chip technology for enhanced security.
- Use of batch processing for transaction settlements.

2010-2015

- Widespread adoption of EMV chip technology, reducing counterfeit card fraud.
- Introduction of PCI DSS (Payment Card Industry Data Security Standard) compliance for enhanced security measures.
- Development of proprietary APIs by banks for integration with payment gateways and merchant systems.
- Initial rollouts of contactless payment technologies, such as NFC (Near Field Communication).
- Growth of online fraud detection services like Falcon and integration with CCMS for real-time fraud monitoring.

Key Credit Card Management Systems

Fis	fiserv.	TSYS	opismo	M2P	Hyperface	vegapay
FIS	Fiserv	TSYS	PISMO	M2P	Hyperface	Vegapay
Provides comprehensive card management solutions encompassing debit, credit, and ATM services, integrating card processing, risk management, digital enablement, and loyalty programs to enhance financial institutions' card offerings.	card management solutions across global financial ecosystems.		issuing credit, debit, and prepaid cards, featuring flexible innovation, quick scaling, live stream data analytics, and a SaaS	Offers a platform enabling rapid deployment of diverse card programs with integrated modules for KYC, onboarding, transaction processing, and customer engagement, tailored for agility and scalability in the credit card domain.	Provides a pre-integrated Credit Cards-as-a-Service platform with a focus on co-branded credit card stacks, enabling rapid program launches with features like intuitive onboarding journeys, high power customer engagement, and comprehensive card lifecycle management.	Plug and play solution for Fls and Fintechs to start off their lending business by integrating with existing APIs which cover end-to- end lending lifecycle, co- branded cards and multi currency cards.

Legacy players like FIS, Fiserv and TSYS lack the flexibility and innovation that new-age players offer. They also have longer timelines to go live and typically provide just a core CCMS without an added experience layer. New age platforms are differentiated on the basis of depth of product offering, time to integrate and stability of product.

	Post 2015
d	 Rapid API adoption for seamless integration between CCMS, payment gateways, and fintech. Introduction of tokenization and encryption for secure data transmission. Emergence of open banking standards for secure data sharing.
	 Widespread use of AI in fraud detection for predictive analytics. Integration of biometric authentication for secure verification. Expansion of mobile wallet and digital payment
	services like Apple Pay, Google Pay, BNPL, and UPI for contactless payments.

4.3 CCMS PERFORMANCE METRICS

Comprehensive CCMS must assimilate a myriad of factors and data inputs for proficient card management, with nuances in workflows between different card services.

Key Parameters to Consider for BSFIs

Compliances and Security Standards

Rigorous examination of adherence to comply to regulatory frameworks (PCI DSS, GDPR, local banking regulations) and implementation of cryptographic protocols for data integrity and confidentiality; assessment of compliance certifications and meet reporting requirments.

Fraud Detection and Risk Management

Assessment of fraud detection algorithms' sophistication, including ML and AI capabilities for real-time pattern recognition; evaluation of integration with external fraud databases and adaptability of fraud models to emerging threats.

Integration Capabilities with **Banking Ecosystem**

Detailed analysis of API/SDK documentation, compatibility with existing banking policies, payment gateways, and third-party services; pilot integration projects to evaluate interoperability, data exchange efficiency, and middleware requirements.

Customer Experience and Personalisation

Examination of user interface customisation options, real-time notification systems, and rewards management features; user journey simulations and analysis of customer feedback on usability and engagement metrics.

Scalability and Performance

Evaluation of architectural design for dynamic resource allocation, stress testing under peak loads, analysis of cloud-based solutions and microservice architecture, and integration capabilities with banking systems to ensure scalability and future-proofing for business growth.

Stability and No Downtime

>99.9% uptime guarantee, ensuring continuous service availability. Additionally, the system must exhibit minimal latency in transaction processing, supporting real-time authorisation and settlement to enhance user experience and operational efficiency.

How do CCMS platforms earn money?

Software Licensing: Providers may charge a one-time license fee for the use of their software, followed by regular updates and maintenance fees.

SaaS: A recurring subscription fee is charged to access the software based on the volume of accounts, users or transactions.

Transaction-based Fee: Some CCMS might charge a fee for every transaction processed through the system. Additional Services: Fees for additional services apart from their core functions, like analytics, FRM or report generations etc.

Key Metrics Analysed

Customer Activation

Measures the percentage of credit card activated, which means issued and have had a first transaction authorised indicating converting users.

Fraud Detection Accuracy

Quantifies the system's fraud detection precision, balancing false positives and true fraud identification to optimize security and user experience.

Average Transaction **Processing Time**

Measures transaction completion time, indicating CCMS payment processing efficiency.

Retention Rate

Measures the percentage of credit card holders who continue to use the card over a specific period, reflecting customer loyalty and satisfaction with the card services

4.4 MODULAR CCMS SOLUTIONS

With rapid evolution, CCMS solutions are now far more adaptive. They cannot only service a large part of the lending workflow through in-built systems, but can interact with external data providers real-time to add more precision to the process.

CCMS Flow

	PROGRESS	USER	LOS	LMS	FRM	
	A. Sumbits Application					
a A CC	B. Verifies Data & Assess Creditworthiness					B
ISSUING A	C. Decides Credit					С
ISS	D. Sets up Card Production and Issuance					e c
Z	E. Activates Credit & Establishes an Account					
СТІО	F. Makes a Transaction					F
TRANSACTION	G. Monitors Transaction and Flags Fraud Activities					S
	H. Records a Transaction * Makes Payment					⊢ ir
NO	I. Updates Account					
COLLECTION	J. Generates Statement & Manages Delinquencies					K P D
	K. Continuous Monitoring & Reporting					Tı R
FEEDBACK	L. Feedback for System Updates					
	M. Implement Updates					
Ë	N. Customer Support					N q

Source: Expert Interviews

count Aggregator integration will improve data ability.

n AI will aid real-time creditworthiness ation using alternative data. Further, NTC omers could also get secured cards.

e different form factors of cards have emerged; age switches have adapted to it. For eg. the UPI

e LMS records it in the central banking system, and rated with front office and back office modules.

n Al-driven chatbot integration for 24/7 customer resolution and support within CCMS platforms.

4.5 TRENDS IN CCMS

Amidst expanding data ecosystems, deeper partnerships, and advanced tech, CCMS is evolving, leveraging co-branded cards, UPI linkage, and analytics-driven personalization to reach broader audiences with enhanced precision.



What Does It Mean?

Credit cards issued jointly by a bank and a retail or service partner, featuring combined branding and benefits tied to the partner's offerings.

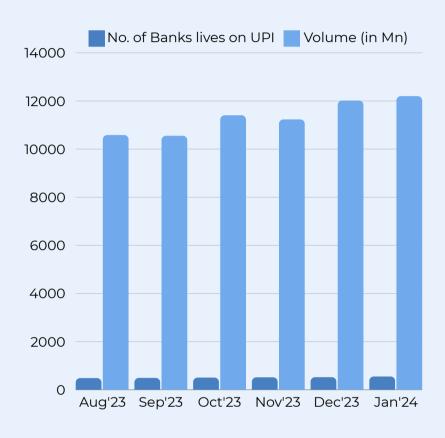
How Does It Benefit Lenders?

Enhances customer acquisition and retention by leveraging partner brand loyalty; diversifies revenue streams through shared marketing costs and increased card usage in partner ecosystems.

What Is The Growth Opportunity?

Expanding market penetration in niche segments; potential for increased transaction volumes and cross-selling opportunities.

Credit Cards linked to UPI



UPI 6-month Growth in India

What Does It Mean?

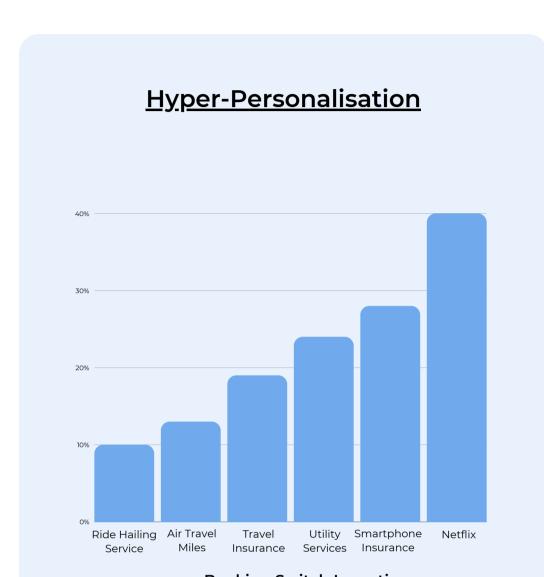
Linking credit card functionalities with UPI, enabling credit card transactions to be processed via UPI's real-time payment platform.

How Does It Benefit Lenders?

Opens new transaction channels for credit card users, potentially increasing transaction frequency and volume; enhances user convenience and transaction speed.

What Is The Growth Opportunity?

Access to India's rapidly growing UPI transaction market, which recorded 1 billion (NPCI) in early 2024, expanding credit card use cases and user base. Merchant acceptance will be higher.



Banking Switch Incentives

What Does It Mean?

Employs data analytics to craft tailored offers based on individual consumer spending behaviours and objectives, enhancing issuer-consumer engagement and loyalty.

How Does It Benefit Lenders?

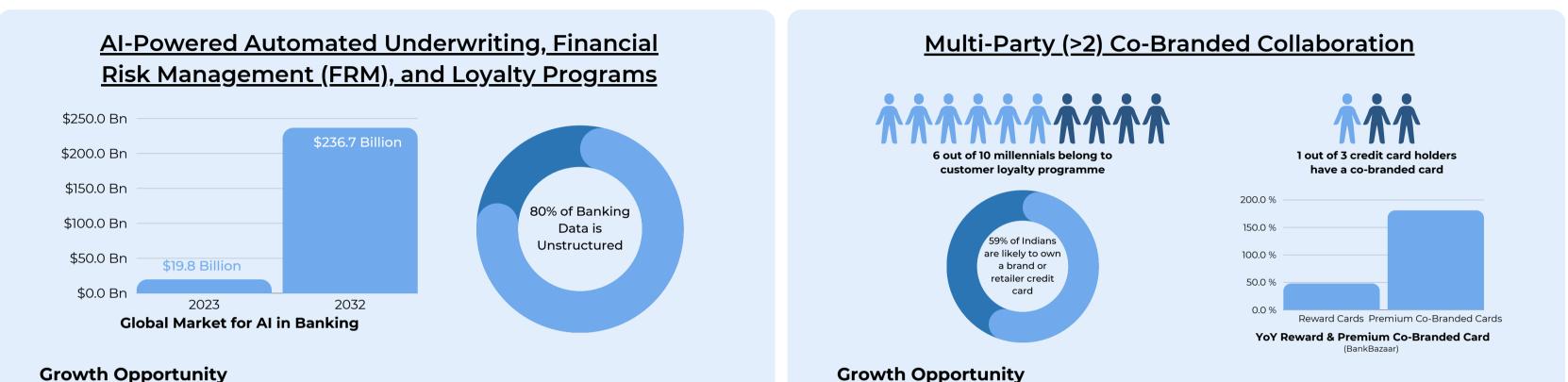
Enables issuers to refine consumer financial behavior understanding, facilitating targeted marketing, product relevance, and personalised financial guidance, which enhances customer value proposition and operational efficiency.

What Is The Growth Opportunity?

Utilizing analytics for enhanced cross-selling and upselling. Personalized offerings lead to greater market reach and stronger customer loyalty.

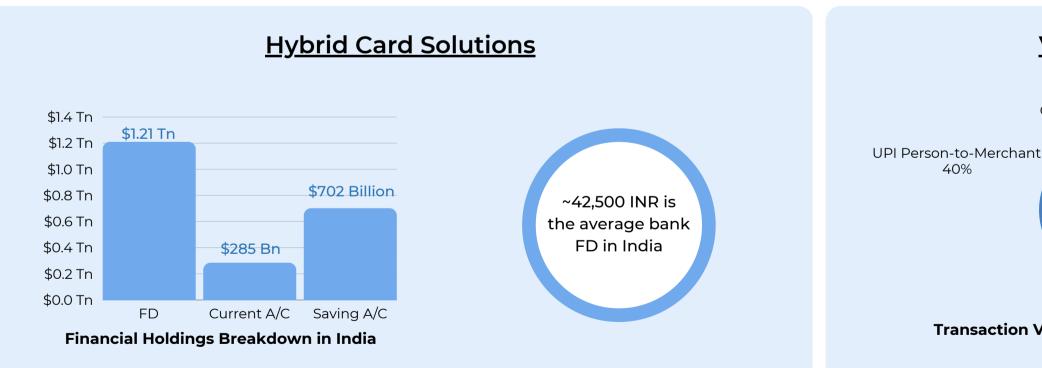
4.6 WHITESPACES IN CCMS

To unlock the potential of this market, lenders need to not only make use of new technologies and serve new audience bases better, but also look to develop new solutions that can make use of these tailwinds to become large outcomes.



Growth Opportunity

Leveraging AI in CCMS for auto underwriting presents a transformative opportunity, enabling dynamic upselling and downselling while enhancing FRM. This technological integration facilitates real-time decision-making and risk assessment, optimizing the credit management ecosystem.



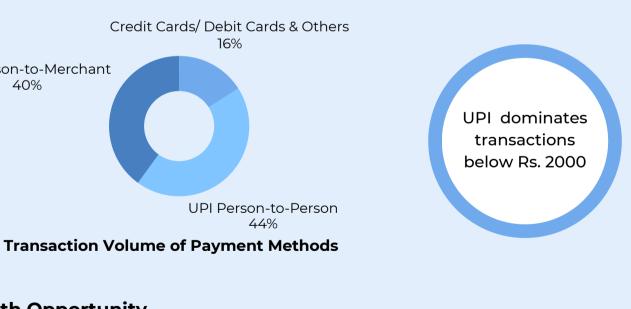
Growth Opportunity

Deploying hybrid cards (mixing debit and credit features) operating on Overdraft (OD) or Fixed Deposit (FD) mechanisms introduces variable credit options, allowing users access to revolving credit lines based on predefined financial assets. Credit card usage has increased by 20%, while debit card swipes declined by 31%, indicating a growth trend for secured cards.

Growth Opportunity The amalgamation of virtual cards with the UPI framework optimises transactional efficiency and security, facilitating seamless digital payments and enhancing user experience in a contactless payment ecosystem. CCMS will need to evolve to be flexible across card switches and UPI switches to be able to process such transactions.

Implementing a co-branded credit card within a CCMS allows for advanced risk and reward management through shared data analytics and algorithmic modeling, enhancing precision in credit risk evaluation and reward allocation by leveraging cross-brand insights for improved financial decision-making.

Virtual Card and UPI Integration



5.1 CO-LENDING

Co-lending merges bank and non-bank resources to enhance loan accessibility and affordability, driven by market needs and guided by RBI's co-lending models (CLM) guidelines from November 2020.

What is Co-lending?

Co-lending is a collaboration where NBFCs team up with banks to offer loans, enabling NBFCs to grow rapidly using the bank's larger balance sheets, boosting their ROE. For banks, it expands their customer base into new segments through NBFCs' distribution channels. The substantial growth of many NBFCs has attracted Fintech companies' attention. In FY23, India's bank co-lending portfolio reached \$3.04 billion.

Why Co-lending is needed?

Financial Inclusion Targets underserved regions, enabling credit flow to EWS, LIG, and MIG through NBFCs' local reach and banks' capital.

Affordable Credit

Leverages bank-NBFC partnerships to offer lower interest rates, reducing financial barriers for borrowers.

Risk Distribution

Adopts an 80:20 funding model, balancing risk and incentivising quality loan origination.

Synergy

Evolution of Co-Lending

Pre 2010

- Initial partnerships formed, exploring synergy between banks' capital and NBFCs' local networks.
- Absence of formal guidelines led to ad-hoc and limited co-lending ventures.
- Limited digital infrastructure hindered efficient integration and scaling.

2010-2018

- RBI and regulators acknowledged and framed co-lending models.
- Technological advancements and fintech innovations facilitated collaborations.
- Increasing banks and NBFCs entered colending agreements driven by mutual benefits.

Key Co-Lending Companies

🍸 Yubi	- - lentra	
YubiCo. Lend is a digital platform for credit	Lentra offers digital lending solutions,	Knight Utopia offers fint
discovery, execution, and fulfilment. It	prioritizing automation for the entire	for banks and financial ir
enables lenders to seamlessly collaborate	loan lifecycle, from origination to	on treasury and credit. T
with multiple partners through a one-time	repayment. This ensures smooth	middleware, Co-Lend, fa
API integration. With over INR 10k Cr. loans	operations for banks and NBFCs.	collaboration for shared
disbursed, it serves 10L+ retail clients and	Recently, Lentra has expanded into	returns. Serving over 70
500+ partners.	co-lending modules as well.	growth, it manages a \$1

Combines banks resources with NBFCs' operational agility to increase market penetration/portfolio diversification.

Efficiency

Streamlines loan processing via NBFCs' tech-driven platforms, ensuring rapid fund disbursal.

Post 2018

- Formalized co-lending models for banks and NBFCs, addressing operational and regulatory aspects.
- Advanced APIs and platforms for seamless colending ecosystems.
- Emphasis on financial inclusion, targeting diverse borrower segments.

NIGHT

tech solutions tailored institutions, focusing Their advanced acilitates bank-NBFC d risks and enhanced D clients with 120% YoY Bn AUM.

Knight Fintech's co-lending product offers seamless integration, comprehensive lending tools, and automatic reconciliation, optimizing processes for banks and NBFCs. It streamlines credit policies, enhances compliance checks, and fosters operational savings and flexibility for both parties.

炎 5.2 HOW IS A CO-LENDING MODEL OPERATED AND REGULATED?

The co-lending model operates under stringent regulatory frameworks to ensure seamless collaboration between entities and safeguard borrower interests.

Process of Co-Lending

ros	 Front-end customer-facing portal managed by NBFC. LOS systems of both banks and NBFCs must integrate seamlessly, allowing for the real-time exchange of applicant data, credit assessments, and loan eligibility criteria. Implement dynamic, rule-based engines within LOS to accommodate varying credit policies of banks and NBFCs, ensuring compliance and adaptability to diverse borrower profiles. Utilise advanced analytics and AI within LOS to automate loan decisioning processes, reducing turnaroun times and enhancing the efficiency of credit underwriting. Relationship depends upon master agreement arrangement, and can have a joint approval system.
LMS	 LMS should support joint portfolio management, enabling both parties to monitor and manage loans, tracerepayments, and assess loan performance collaboratively. Implement risk management modules within LMS to dynamically adjust for shared risks, provisioning, and asset classification in line with regulatory requirements and agreed risk-sharing ratios. Ensure LMS can accommodate various loan products and co-lending arrangements, supporting tailored learns, interest rates, and repayment schedules agreed upon by banks and NBFCs. A joint asset charge creation for secured type loans between both the lenders.
Escrow	 Establish jointly managed escrow accounts, ensuring funds are disbursed and received transparently, with clear oversight from both lending parties. Integrate automated triggers within escrow management systems for timely loan disbursements based or predefined criteria and loan agreement terms. Structure escrow arrangements to comply with regulatory directives, safeguarding against fund commingling and ensuring fiduciary responsibilities are met.
Collections	 Develop a cohesive collection framework, after NBFC has initiated collection from the LMS, the loan is sen the escrow amount where it is disbursed to the lenders in their profit sharing ratios. Standardise borrower communication channels and messaging, ensuring clarity and consistency in collect efforts, while adhering to fair practices and regulatory guidelines. Implement robust tracking and reporting tools within collection systems to monitor recovery rates, delinquency trends, and operational effectiveness, facilitating data-driven strategies.
Reporting	 Establish comprehensive reporting protocols that aggregate data across both entities, offering insights in portfolio health (NBFC to Banks), financial performance, and risk exposure. Automate the generation of regulatory reports, ensuring timely and accurate compliance with central bar guidelines, including risk-sharing disclosures and financial statements. Maintain detailed audit trails within reporting modules, capturing all co-lending activities, transactions, ar decisions for transparency and accountability.

Note: Typically NBFCs take charge of engaging with customer.

	<u>Regulations for Co-Lending</u>
F	Banks are mandated to ensure KYC adherence in line with RBI guidelines.
d	While KYC due diligence can be executed via third parties, it's
nd	imperative that these entities are not domiciled in jurisdictions deemed high-risk by relevant assessments.
ack	
nd	The NBFC and bank must establish a creditworthiness assessment
loan	framework in compliance with RBI directives that prohibit outsourcing of credit sanctioning. Both entities are
th	required to conduct direct ex-ante due diligence.
on	
	Banks and NBFCs are required to independently manage accounts for each borrower's loan portion. All
nt to	financial exchanges between these
ection	institutions must be conducted through an escrow account, ensuring no commingling of funds.
nto	NBFC acts as the primary contact for
ank	customers, setting unified interest rates with banks and facilitating
nd	account statements through data- sharing agreements. A complaint resolution system is also mandated for NBFCs.

5.3 WHAT SHOULD A CO-LENDING MODEL LOOKLIKE?

Essential features for a co-lending platform include a robust technological infrastructure and transparent operations, guiding partners in selecting the most suitable platform for effective collaboration.

Must have Features

Reconciliation Middleware

A sophisticated middleware should be employed to facilitate accurate and transparent reconciliation among banks, non-banking financial companies (NBFCs), and borrowers.

Dynamic Business Rules Engine (BRE)

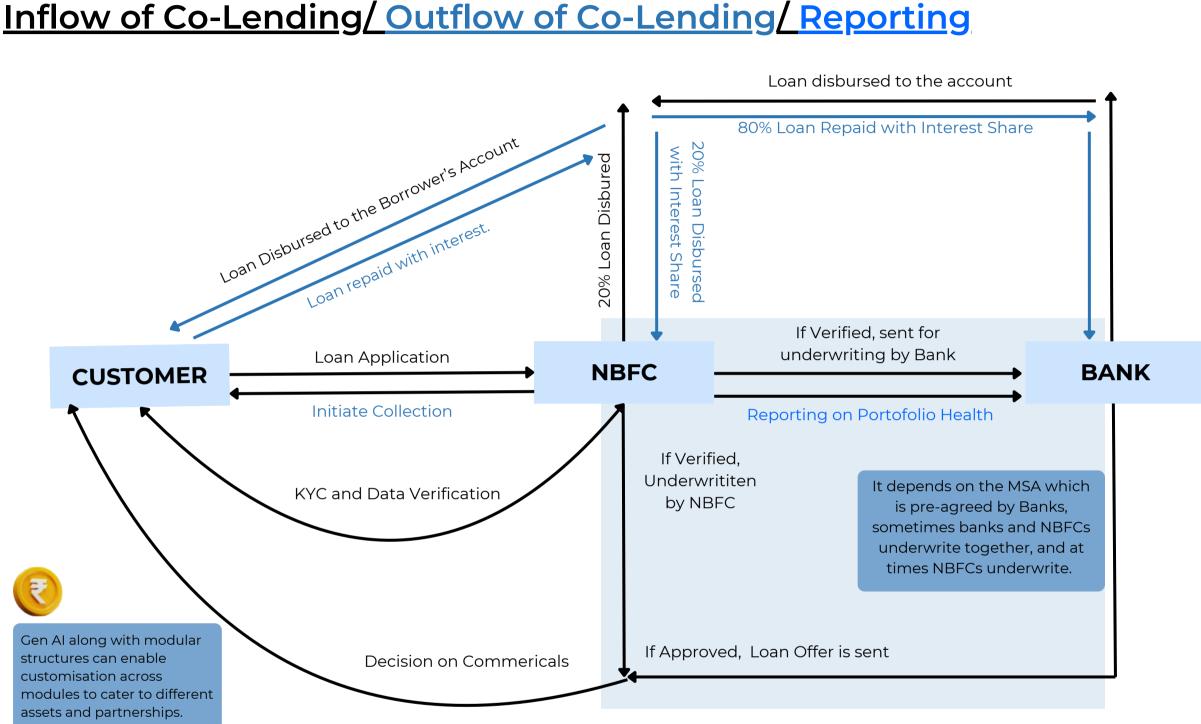
The platform should feature a dynamic BRE that allows for realtime decision-making and adaptation to changing lending conditions.

Automated Integration with CBS and CMS

Integration with Core Banking Systems (CBS) and Customer Management Systems (CMS) is crucial for streamlining operations and automating the lending process.

Low Rejection Rates

Advanced risk assessment capabilities and pre-agreed credit policies should be in place to reduce rejection rates and expand access to lending.



How to choose the ideal Co-Lending Platform?

- Risk Sharing Mechanism: Partnerships for credit risk mitigation.
- Regulatory Compliance: Ensuring adherence to financial regulations.
- Technology Infrastructure: Robust operational backbone.
- Data Management and Security: Protection of sensitive financial data.
- Customer and Data Ownership: Clarification of customer information ownership.

- **Operational Efficiency:** Process efficiency through automation.
- Reconciliation and Reporting: Accurate financial reconciliation and reporting.
- Flexibility and Scalability: Adaptation to evolving markets and business growth.
- **Customer Experience:** Prioritizing smooth end-user interactions.
- Integration with Credit Bureaus: Supporting real-time credit assessments.

5.4 WHITESPACES AND TRENDS IN CO-LENDING

The co-lending space is ripe for innovation, with emerging trends and untapped opportunities set to redefine collaborative lending and expand financial inclusion. Regulation is only three years old and adoption across institutions is just picking up.

<u>Whitespaces in Co-Lending</u>



partnerships. Such solutions would simplify integration, improve scalability, and meet the diverse needs of co-lending entities, driving adoption and market expansion.

Views on Banks/NBFCs building their own Co-Lending platform

- Prevalent systems often act as gateways to LOS and LMS but lack crucial two-way integration for seamless co-lending.
- Platforms like Yubi are primarily focused on loan origination, potentially neglecting co-lending needs.
- Banks and NBFCs without their LOS/LMS may struggle to develop robust colending technology.
- Achieving a competitive edge requires successful integration between internal systems and external co-lending platforms, a challenge due to technical complexity and security standards.
- Institutions like UGro and Muthoot have internal systems not fully equipped for external co-lending collaboration.

Commercial Structures of a Co-Lending platform

In 1-to-1 NBFC-Bank setups, NBFCs access via bank's middleware/API. Larger NBFCs prefer paid models for efficiency.

 Subscription Fees: Recurring access fee, tiered by usage/features. • Transaction-Based Fees: Per-loan fee aligning with lending volume. Revenue Sharing: Percentage of loan income shared with platform. Setup/Integration Fees: One-time charge for system setup. • Tiered Access: Varied feature levels at different subscription tiers. Freemium Model: Basic free access, paid additional features.

Enterprise Agreements: Customized contracts for large-scale needs.



Investing in Founders **From Ideation to Execution**





