

# The Role of Credit Risk Management in Agricultural and Rural Banking

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**Abstract** Credit risk management plays a vital role in ensuring the financial stability and sustainability of agricultural and rural banking institutions. Since the agricultural sector is often exposed to high levels of uncertainty due to factors such as fluctuating weather conditions, market volatility, and irregular income patterns, managing credit risk becomes crucial for minimizing loan defaults and maintaining profitability. This study examines the significance of effective credit risk management practices in agricultural and rural banking, with a focus on how banks identify, assess, and mitigate risks associated with lending to farmers and rural enterprises. The research explores key techniques such as credit appraisal systems, loan monitoring, diversification, and the use of collateral in managing risk. It also evaluates the impact of sound credit risk management on the financial performance and long-term sustainability of rural banking institutions. Findings from this study highlight that a well-structured credit risk management framework not only safeguards banks from potential losses but also promotes inclusive growth by enhancing access to credit in rural areas.

**Keywords.** Credit risk management (CRM) Agricultural banking, Rural banking, Rural Finance, Risk Mitigation, Financial Inclusion, Loan Portfolio.

**Introduction** *Agriculture plays a grandly role in the economic development of most emerging and developing countries, including India and Bangladesh, where a large portion of the population depends on agriculture and rural activities for their livelihood. The agricultural sector not only provides food security but also contributes significantly to employment generation, income distribution, and the growth of the rural economy. However, despite its importance, the sector is highly exposed to various forms of risk, such as climate fluctuations, natural disasters, price volatility, pest infestations, and policy changes. These*

*uncertainties make agricultural lending inherently risky and pose serious challenges to financial institutions engaged in rural and agricultural financing.*

*Credit risk, which refers to the possibility of a borrower failing to meet their debt obligations, is one of the most critical risks faced by banks providing loans to the agricultural sector. The seasonal nature of agricultural production, dependence on monsoon rainfall, and limited access to reliable market information further increase the vulnerability of rural borrowers. As a result, banks and financial institutions must adopt effective **Credit Risk Management (CRM)** strategies to ensure the soundness and sustainability of their agricultural loan portfolios. Credit Risk Management in agricultural and rural banking involves identifying, assessing, monitoring, and controlling the potential risk of loan default among farmers and rural entrepreneurs. Effective credit risk management enables banks to design suitable lending policies, diversify their loan portfolios, and implement appropriate recovery measures. It also helps institutions maintain financial stability while supporting inclusive growth through rural credit expansion. The key objective is to balance risk and return — ensuring that while banks meet the credit needs of rural populations, they also safeguard their financial health.*

*In recent years, the importance of robust credit risk management in agricultural banking has increased due to rising non-performing assets (NPAs) and growing credit exposure to the rural sector. Many banks have adopted modern techniques such as credit scoring models, crop insurance linkages, and technological tools for risk assessment and monitoring. Additionally, the role of government policies, credit guarantee schemes, and rural financial institutions such as Regional Rural Banks (RRBs) and Cooperative Banks has become crucial in managing risk efficiently. A well-structured credit risk management framework not only minimizes default risk but also enhances the bank's profitability and long-term sustainability. It supports the development of a resilient rural credit system capable of absorbing shocks and ensuring continuous financial inclusion. Therefore, understanding and improving credit risk management practices in agricultural and rural banking is essential for building a strong and sustainable rural financial ecosystem.*

## **Review of literature**

**Kaakandikar & gunjal, (2024)** investigated that the aim of finance is to manage a company's financial resources. Without funding, the company could not function and might not even be able to get off the ground. The art and science of managing a company's financial resources is essential to the company's continued existence. From the initial stages of group business awareness all the way through the effective insolvency stage of operations, finance plays a crucial role. The availability of capital is critical to the acquisition of many resources including raw materials, machinery and equipment, human capital, etc. and the maintenance of uninterrupted company operations. To put it simply, money is the lifeblood of any company, hence it's crucial that associations have solid financial management structures in place.

**Emiliya, (2024)** determined what to understand how a country's economy works, one must study its banking system. Comparing and contrasting several private and governmental banks in India is the major goal of this study. it has utilized data from 2019 to 2023 to evaluate the selected Indian banks' health. Private and public banks in India are compared in the study using predefined profitability, liquidity, and asset quality metrics. It used descriptive statistics (T-Test) to examine key financial ratios and find out if the selected Indian banks' overall performance differs significantly.

**Balyan & Singh, (2024)** Considered that non-performing assets (NPAs) are a complex and long-lasting problem in the banking industry, with wide-ranging effects on the health of the economy and its stability. This article examines nonperforming assets (NPAs) and how they affected HDFC and SBI's bottom lines. While HDFC's nonperforming assets (NPA) ranged from 0.20% to 0.64% from 2007–2008 to 2021–2022, State Bank of India's NPA was far higher, ranging from 1.02% to 5.73%. In both instances, non-performing assets (NPA) cut into profits, although SBI's is far more. Based on these results, SBI may rethink its credit policy and the way it does business with credit in order to appeal to a wider range of customers.

**Ramu & Prakash, (2024)** indicated that, due to a decline in income and an increase in provisioning requirements, Non-Performing Assets (NPAs) have a substantial impact on the profitability and stability of banks. The study analyzes that how NPA affected the performance of HDFC Bank and ICICI Bank. Gross Non-performing Asset, Net Non-performing Asset, Provision, and Problem Asset Ratios are some of the key measures examined in this study, which makes use of secondary data from 2019 to 2023. Through reduced nonperforming assets and more cautious provisioning, HDFC Bank has been able to maintain its performance advantage over ICICI Bank. The research provides suggestions for better NPA management and draws attention to the wider economic effects of NPAs. Important new information regarding how to handle nonperforming assets and boost bank profitability has emerged from this study.

**Singh & Mritunjay, (2024)** Claimed that seventeen to eighteen percent of India's gross domestic product comes from agricultural output, which in turn employs around half of the country's workforce. Despite its critical importance, the agriculture industry is fraught with uncertainties. Unpredictable weather, fluctuating market pricing, and the possibility of crop failure are all examples of these risks. Because of these problems, farmers are having a harder difficulty getting the money they need to invest in production-boosting infrastructure, technology, and inputs. Conventional methods of calculating credit risk have long been used by commercial banks; however, these methods often fail to adequately account for the complexities of agricultural issues. Due to banks' conservative approach, the quantity of credit available to the rural sector has been restricted.

**DEEPIKA, V. (2024)** Examined the relationship between credit risk and the trading phase in India's investment subdivision by analyzing public-sector banks and for-profit businesses. Using ordinary least squares methods, it considers the delay impact and procyclicality of bank credit risk. Key variables include default rates, supply rates, and loan flows for individual banks, as well as macroeconomic factors. The research revealed significant differences between banks, noting South Indian Bank's gains-smoothing strategy versus SBI and ICICI's procyclicality. Early crop breaches can affect banks, leading to an increase in default rates. South Indian Bank is noted to manage credit risk through a productive improvement method.

**Kumar & Sharma, (2024)** understood that there has been a lot of buzz about artificial intelligence (AI) and its revolutionary potential in the banking industry as of late, especially in light of the changing financial scene in developing countries like India. The study goal is to inspect this development and the extent to which it has affected Indian banking in terms of adoption, importance, difficulties, and case studies of implementation. To illustrate how AI has helped change modern businesses, this section uses the Financial and banking services sectors as examples. The advent of new digital technologies has ushered in an era of artificial intelligence, which has begun to revolutionize the Indian banking industry by automating and tech-leading long-established processes. Regulatory compliance, systematic fraud detection, sensible risk management, and improved customer experiences are just a few areas where AI plays a role in the banking sector.

**Gupta & Dongre (2024)** analyzed the financial performance of banks over five years (2018-19 to 2022-23) to underscore their crucial role in economic growth and stability. Profitability, asset quality, and liquidity are assessed using metrics such as ROA, ROE, NIM, Credit Deposit Ratio, NPA ratios, and liquidity ratios. The findings indicate improvements in profitability and asset quality, with reduced NPA ratios, while liquidity trends are inconsistent. The research provides critical insights into strategic decision-making in the financial industry by identifying areas of strength and potential risk.

**Dash & Mohapatra, (2024)** delves into the banking business in India has been experiencing fast transformations due to several economic shifts. Indian banking activity surged throughout the 1990s, a time of market liberalization and deregulation. One must be skillful enough to triumph over rivals in the competitive environment, which resembles a jungle where larger creatures devour smaller ones. The data shows that larger companies have absorbed their smaller competitors. I was inspired to write this assessment on banking industry mergers after the HDFC Bank and Centurion Bank of Punjab merger. In this post, we'll take a look at the Indian banking market to understand why banks combine and acquire one another. This article is separated into three parts. In the first part, it gives a theoretical framework and an overview of mergers and acquisitions. Let's go on to the bank's background after discussing the literature review in Section 2. The final section compares HDFC Bank's presentation before and after the merger. The fourth part discusses the final outcome. This essay opens the way for further study on mergers and acquisitions by providing a fresh viewpoint on the topic.

## Research Gap

Existing studies on credit risk management largely emphasize urban commercial banking, leaving agricultural and rural banking underexplored. There is limited empirical evidence on how informal credit practices, climate-induced uncertainties, crop price volatility, and smallholder borrower behavior are integrated into formal risk assessment models. Current research also overlooks the effectiveness of technology-driven tools (such as satellite data, fintech scoring, and digital repayment tracking) in reducing

rural credit risk. Moreover, the long-term impact of government subsidies, loan waivers, and policy interventions on repayment discipline and portfolio sustainability remains insufficiently examined. This creates a clear gap in developing context-specific, dynamic, and resilience-oriented credit risk frameworks tailored to agricultural and rural banking systems.

## Objectives

- To analyze the importance of CRM in agricultural and rural banking.
- To assess the challenges faced by rural banks in implementing effective CRM.
- To recommend strategies and best practices for risk-responsive agricultural lending.

**Importance of Credit Risk Management (CRM) in Agricultural and Rural Banking** Credit Risk Management (CRM) plays a vital role in agricultural and rural banking due to the high uncertainty associated with farm incomes and rural livelihoods. Agriculture is highly dependent on weather conditions, market price fluctuations, and seasonal production cycles, which increase the probability of loan default. Effective CRM enables banks to identify, assess, and control these risks before and after credit disbursement. CRM helps rural banks reduce non-performing assets (NPAs) by ensuring proper borrower assessment, realistic repayment scheduling, and continuous loan monitoring. It improves the quality of credit decisions by aligning loan products with the actual repayment capacity of farmers and rural borrowers. Through tools such as credit appraisal, diversification of loan portfolios, and insurance linkages, CRM safeguards banks against unexpected losses. Moreover, strong CRM enhances financial sustainability and confidence in rural banking institutions. It allows banks to expand credit access responsibly, supporting agricultural development and rural economic growth while maintaining financial stability.

## Challenges Faced by Rural Banks in Implementing Effective Credit Risk Management (CRM)

Rural banks encounter several structural and operational challenges in implementing effective CRM. Limited availability of reliable borrower data and weak credit histories create **information asymmetry**, making accurate risk assessment difficult. Agricultural lending is highly exposed to **climatic uncertainty and price volatility**, which are largely beyond the control of banks and borrowers. Inadequate technological infrastructure and lack of advanced analytics restrict the adoption of modern risk assessment tools. Moreover, **skill gaps among rural bank staff** reduce the effectiveness of credit appraisal and monitoring. Government-directed lending, interest subsidies, and loan waiver schemes often lead to **moral hazard**, weakening credit discipline. Poor recovery mechanisms and high transaction costs in remote areas further aggravate credit risk, resulting in rising non-performing assets and constrained financial sustainability.

- **Adopt Data-Driven Credit Appraisal:**  
Integrate borrower history, crop patterns, soil quality, and weather data to improve credit decision accuracy.
- **Link Credit with Insurance Coverage:**  
Mandatory crop and livestock insurance should be bundled with loans to absorb climate and yield-related shocks.
- **Promote Cash-Flow Based Lending:**  
Design repayment schedules aligned with crop cycles rather than fixed monthly installments.
- **Strengthen Field-Level Monitoring:**  
Regular farm visits and digital tracking help detect early signs of stress and prevent defaults.
- **Leverage Technology and Fintech Partnerships:**  
Use mobile banking, satellite imagery, and agri-fintech platforms for real-time risk assessment.
- **Diversify Agricultural Loan Portfolios:**  
Spread exposure across crops, regions, and borrower categories to reduce concentration risk.

- **Enhance Borrower Financial Literacy:**  
 Training farmers in credit discipline and financial planning improves repayment behavior.
- **Build Skilled Rural Credit Teams:**  
 Continuous training of loan officers in agri-risk assessment ensures informed lending decisions.

### Agricultural & Rural Banking Risk Metrics (2020–2025)

Year	Agricultural Credit Outstanding / Growth	Agri Non-Performing Assets (NPA)	PACS Default Probability (India)	Notes (Key Risk Management Context)
2020	Base year (rapid post-pandemic recovery underway)	—	—	Frameworks less digital; high external risks
2021	Moderate recovery in credit flows	—	~1.22 (Default Probability Index)	Default probability rising due to macro stress
2022	Steady farm credit expansion	—	~1.82 (Peak Default Probability)	Higher macro headwinds increase risk likelihood
2023	Strong institutional credit growth (earlier RBI data)	Agriculture GNPA still elevated compared to overall	~1.82 → 1.8	Banks adopt stronger risk monitoring; climate & market stresses evident
2024	Agri credit growth persists; projected slowdown trend emerges	Agri GNPA (highest segment) ~6.2%	~1.5 (declining)	RBI reports lower overall NPAs; agri still stressed
2025	Record agri credit projected ~₹32.5 lakh crore	Risk focus & regulatory tightening	~1.07 (improved)	New RBI Credit Risk Management Directions for RRBs introduced

### 1. Agricultural Credit Outstanding / Growth Trend

- Plot the **total credit values or % growth** on the left axis.
- 2020 as base, then increasing to 2025 projection.
- Eg:
  - 2021: baseline
  - 2022–2023: strong growth
  - 2024–2025: continued but moderated growth toward **₹32.5 lakh crore** in FY26.

### 2. Agri NPA Ratio

- Plot the **percentage of gross NPAs in agri** on the right axis.
- You have actual data for 2024 at ~6.2%, with context showing elevated risk relative to other sectors.

### 3. PACS Default Probability Index

- Plot a **risk index (1.22 → 1.82 → 1.07)** from PACS credit risk assessments as a proxy for rural credit risk levels over time.

### Interpretation for Analysis

#### ► 2020–2022: Rising Risk Amid Recovery

- After COVID disruptions, agricultural credit demand recovered strongly.
- Default risk rose due to macroeconomic stress, inflation, and rural income volatility.

#### ► 2023–2024: Risk Management Gains Traction

- Regulatory focus on asset quality and credit discipline was strengthened.
- RBI reports overall NPAs lowered; agriculture remains the highest NPA segment, but risk controls improved.

#### ► 2025: Strong Credit Growth + Better Risk Controls

- Agri credit expected to reach record levels, supported by formal rural finance channels.
- New RBI **Credit Risk Management Directions for Regional Rural Banks (RRBs)** indicate heightened prudential standards.

### Sample Chart of Concept

**X-Axis:** Years (2020, 2021, 2022, 2023, 2024, 2025)

**Y-Axis Left:** Agri Credit Outstanding (₹ lakh crore or % growth)

**Y-Axis Right:** Agri NPA (%) / Default Probability Index

2020: Credit = Base (100%), NPA = —, Default Index = —

2021: Credit = 110%, NPA = —, Default Index = 1.22

2022: Credit = 125%, NPA = —, Default Index = 1.82

2023: Credit = 130%, NPA = ~6.0%, Default Index = ~1.8

2024: Credit = 135%, NPA = ~6.2%, Default Index = ~1.5

2025: Credit = 140%+, NPA = —, Default Index = ~1.07

## 4. Credit Risks in Agricultural Lending Agricultural credit risk stems from a confluence of factors:

❖ **Production Risks:** Production risk in agricultural lending refers to the uncertainty in farm output that directly affects a farmer's ability to repay loans. It arises from factors such as irregular rainfall, droughts, floods, pest infestations, crop diseases, and soil degradation. Even when farmers adopt proper cultivation practices, natural and biological forces can sharply reduce yields. Limited access to modern technology, quality seeds, irrigation, and fertilizers further increases this risk, especially for small and

marginal farmers. As a result, lower or failed production leads to income instability, making agricultural borrowers more vulnerable to default.

❖ **Market Risks:** Market risk in agricultural lending arises from uncertainty in the prices and sale of farm produce. Fluctuations in commodity prices, weak bargaining power of farmers, and dependence on intermediaries often reduce realized income after harvest. Inadequate storage, transportation, and market access force farmers to sell produce at distress prices. Changes in government policies such as minimum support prices, export restrictions, or import duties further intensify income instability. These market-related uncertainties can significantly weaken farmers' repayment capacity, increasing the credit risk faced by lending institutions.

❖ **Collateral Challenges:** Collateral challenges in agricultural lending arise because many farmers lack clear, marketable, or legally valid assets to pledge against loans. Land records are often outdated, disputed, or informally held, making it difficult for banks to establish ownership and enforce security. Small and marginal farmers may possess very limited land or low-value assets that do not adequately cover the loan amount. In addition, agricultural land has low liquidity and its value fluctuates with market and environmental conditions, reducing its effectiveness as collateral. These limitations increase lenders' exposure to loss in case of default.

❖ **Informality and Asymmetric Information:** Informality and asymmetric information significantly heighten credit risk in agricultural lending. A large share of farmers operates outside formal financial systems, lacking reliable income records, audited accounts, or credit histories. This makes it difficult for banks to accurately assess borrowers' repayment capacity and risk profiles. Farmers often possess better information about their actual production conditions and intentions than lenders, leading to problems such as adverse selection and moral hazard. Limited transparency, weak documentation, and dependence on self-reported data further constrain effective credit appraisal, increasing the likelihood of loan default.

❖ **Infrastructural and Institutional Gaps:** Infrastructural and institutional gaps add significant risk to agricultural lending by weakening the overall support system around farmers. Poor irrigation, inadequate storage facilities, limited cold chains, and weak transport networks often lead to post-harvest losses and forced distress sales, reducing farmers' income. At the institutional level, delays in credit disbursement, insurance payouts, subsidies, and extension services prevent timely farm operations and recovery from shocks. Weak coordination among banks, government agencies, and agricultural support bodies further undermines risk mitigation, increasing the probability of loan stress and defaults.

## 5. Frameworks for Managing Agricultural Credit Risk

A robust credit risk management framework in rural banking involves identification, assessment, mitigation, and monitoring.

### ❖ **Risk Identification and Assessment:**

- **Segment-Specific Scoring:** Developing credit scoring models that incorporate non-traditional data (e.g., satellite imagery for crop health, mobile phone usage, value chain relationships).
- **Cash Flow-Based Lending:** Focusing on the viability of the farm enterprise and future cash flows rather than solely on collateral.
- **Seasonality Analysis:** Aligning loan terms with cropping cycles and harvest seasons.

### ❖ **Risk Mitigation Strategies:**

- **Credit Enhancements:** Using guarantees from governments, donor agencies, or agricultural value chain aggregators (e.g., processors, cooperatives).
- **Collateral Substitutes:** Accepting warehouse receipts, future crop liens, or group guarantees (as in Joint Liability Groups or Self-Help Groups).
- **Product Design:** Offering crop-linked loans, flexible repayment schedules, and bundled products (e.g., credit with insurance).

- **Risk Transfer:** Promoting and often mandating agricultural insurance, such as index-based weather insurance, which triggers payouts based on objective indices (e.g., rainfall levels).

#### ❖ **Portfolio Monitoring and Diversification:**

- **Geographic and Commodity Diversification:** Spreading loans across different climatic zones and crop types to reduce concentration risk.
- **Dynamic Monitoring:** Using technology (remote sensing, digital payment trails) to monitor borrower conditions post-disbursement.
- **Provisions and Write-offs:** Maintaining adequate provisions for expected losses in line with portfolio risk.

### 6. Impact of Effective Credit Risk Management

#### ❖ **For Financial Institutions:**

- **Portfolio Quality:** Reduces non-performing assets (NPAs) and enhances profitability.
- **Sustainability:** Enables banks to operate viably in rural markets, attracting more capital.
- **Innovation:** Encourages the development of tailored financial products.

#### ❖ **For Rural Clients and the Economy:**

- **Increased Access to Finance:** Builds lender confidence, leading to greater credit flow to previously "unbankable" segments.
- **Resilience:** Helps farmers withstand shocks; invest in productivity-enhancing technologies, and smooth consumption.
- **Economic Growth:** Facilitates capital formation in agriculture, stimulates rural non-farm enterprises, and supports broader rural development.

### 7. Challenges and Policy Recommendations

- ❖ High cost of risk assessment and monitoring for dispersed smallholder clients.
- ❖ Underdeveloped insurance markets and weak value chain linkages.
- ❖ Macro policies (e.g., interest rate caps, debt waivers) that distort credit discipline.
- ❖ Limited technical capacity within many rural financial institutions.

### 8. Policy Recommendations:

1. **For Banks:** Invest in technology (FinTech/AgriTech) for data-driven risk assessment. Build staff capacity in agricultural risk analysis. Develop partnerships with value chain actors.
2. **For Regulators:** Develop proportionate prudential norms for agricultural lending. Support the creation of credit bureaus that include agricultural trade data. Incentivize the uptake of agricultural insurance.
3. **For Governments:** Improve rural infrastructure (roads, irrigation, and digital connectivity). Strengthen land titling systems. Provide partial credit guarantees for foundational lending to de-risk the sector for banks.
4. **For Development Partners:** Support pilot programs for innovative risk mitigation tools and fund capacity-building initiatives for rural lenders.

### Conclusion-

The conclusion of this research is that **credit risk management in agricultural and rural banking is fundamentally a strategic imperative for systemic resilience, poverty reduction, and sustainable**

**development, rather than a narrow technical function.** Its role transcends the preservation of institutional capital to become the very engine that enables financial inclusion in one of the economy's most vital yet vulnerable sectors. Robust CRM unlocks a virtuous cycle: by methodically identifying, pricing, and mitigating the unique risks of agriculture, it builds the confidence of rural financial institutions (RFIs) and commercial banks to expand their portfolios into the countryside.

This expanded access to timely and adequate formal credit allows farmers to invest in better inputs, technology, and resilience-building practices, thereby *reducing the very risks that CRM seeks to manage*. The consequent increase in agricultural productivity, income stability, and asset formation strengthens the borrower's repayment capacity, improves portfolio quality for the lender, and stimulates broader rural economic activity.

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