

Analysing the Role of Mobile Financial Services (MFS) in Financial Inclusion: A Data-Driven Exploration of CDIP's Journey

Original
Research Article



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Aims: This study explores how mobile financial services (MFS) have developed and impacted the work of the Centre for Development Innovation and Practices (CDIP), a mid-sized Bangladesh NGO-MFI. CDIP has worked for financial inclusion and social development through microfinance since 1991.

Study design: Bridging traditional microfinance with digital financial ecosystems has advanced significantly with the strategic integration of MFS into CDIP's microfinance operations, piloted through collaborations with Nagad, bKash, and Upay to establish financial inclusion.

Methodology: This study evaluates adoption rates and MFS usage trends among CDIP borrowers using data from 83,329 transactions collected over a 23-month period using a basic moving average model.

Results: The data shows significant changes in transaction volume, ticket size distribution, and client behaviour and also apparent increase in microfinance clients managing their own transactions. Subsequently, a cost-benefit analysis using discounted cash flow techniques shows that the operational efficiency, customer financial literacy, and long-term strategic gains balance by its short-term financial expenses. The MFS project has a negative net present value (NPV).

Conclusion: This paper emphasises how revolutionary MFS may be in increasing financial inclusion as well as operational efficiency in the microfinance industry, in spite of the fact that there are financial challenges to overcome in order to implement it.

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Keywords: NGO, Microfinance, MFS, Social Development, Financial inclusion, Digitization

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1. INTRODUCTION

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The target audience for microfinance is small enterprises and people without access to traditional banking and associated services. To marginalized populations it includes microcredit, which offers small loans, savings facility, microinsurance and related services (Chikwira et al., 2022). Since the late 1970s, microfinance interventions in Bangladesh have positively impacted low-income populations. As of June 30, 2023, MFIs functioning as non-governmental organizations (NGOs) had USD 12.97 billion in outstanding loans, with a significant total loan disbursement of USD 21.49 billion (MRA, 2023). Microfinance in Bangladesh has empowered millions, particularly women, by providing them with the financial resources to establish enterprises, better their living conditions, and contribute to the

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Branch Office



Figure 1: Traditional Microfinance Collection Flow

27 economy. The sector has developed tremendously, with thousands of microfinance institutions
 28 (MFIs) operating throughout the country, even the most rural locations (Mia, 2017; van Rooyen
 29 et al., 2017). Leading NGO-MFIs in Bangladesh, including BRAC, ASA, Grameen Bank, Shakti
 30 Foundation, BURO Bangladesh, CDIP and many more are driving the country's microfinance
 31 sector, which is essential to reducing poverty and promoting financial inclusion (Bhavana
 32 Srivastava et al., 2019). Since its founding in 1995, Centre for Development Innovation and
 33 Practices (CDIP), a mid-ranged NGO-MFI in Bangladesh has operated 226 branches in 30
 34 districts, offering healthcare, education, and microcredit to foster social development.

35 Mobile financial service (MFS) is a fast-expanding industry within the emerging economies of
 36 Asia, Africa, and the Middle East. It can help those who are left out of official financial channels
 37 and economically marginalized (Afroze & Rista, 2022; van Rooyen et al., 2012). Around the
 38 world, countries such as Kenya, with its M-Pesa platform, have demonstrated how
 39 revolutionary MFS can be by allowing not just payments but also savings, loans, insurance,
 40 and other services (Ndung'u, 2021). Bangladesh is rapidly entering the digital era and its
 41 socioeconomic characteristics are changing as a result of the remarkable rise in digitalisation
 42 that has occurred in the nation in recent years. The Mobile Financial Services (MFS) providers
 43 are a major force behind Bangladesh's transition to a digital economy. It has been successful
 44 in integrating a sizable portion of the impoverished people who had no access to formal
 45 banking into the system (Akhter & Khalily, 2020). These individuals, who reside in both rural
 46 and urban areas, have long been denied access to traditional

47 financial services. In 2012, Dutch Bangla Bank Limited launched mobile banking services
 48 across the country, marking the start of a ten-year journey (Md Asaduz Zaman, 2024).
 49 Additionally, the central bank started granting MFS licenses in an effort to encourage financial
 50 inclusion for anyone. MFS is a replacement payment mechanism that is now provided by ten
 51 banks and three of their subsidiaries. The following companies provide MFS services: Islamic
 52 Wallet, Meghna Pay, Nagad, FSIBL FirstPay SureCash, Upay, OK Wallet, Rocket, bKash,
 53 MYCash, Islami Bank mCash, and Trust Axiata pay (tap) (Bhavana Srivastava et al., 2019;
 54 Md Asaduz Zaman, 2024; Parvez et al., 2015).

56 Since its founding in 1995, Centre for Development Innovation and Practices (CDIP), a mid-
 57 ranged NGO-MFI in Bangladesh has operated 226 branches in 30 districts, offering
 58 healthcare, education, and microcredit to foster social development. The strategic decision by
 59 CDIP to integrate MFS into its microfinance operations will be examined in this paper as a
 60 major step towards closing the gap between traditional microfinance and the digital financial
 61 ecosystem. Traditional microfinance transactions, are still primarily non-digital. As shown in
 62 Figure 1, savings and loan transactions are normally completed in one of two ways: either

members visit the branch, or field agents travel to members' houses to collect payments (Pal et al., 2023). CDIP was largely inspired by 2020 COVID 19 scenario for loan collection, as lockdown was ongoing CDIP field officers couldn't physically go to member's home to home and that created decent organizational loss and inspired CDIP to need analysis and think about effective way to mitigate such financial risk. 2020 Covid-19 pandemic was a pivotal scenario for CDIP to rethink its loan collection approach. As lockdown was in the run, field officers were unable to collect instalments from member's houses which led to organizational losses. Later CDIP conducted a need analysis with the goal of exploring effective and resilient way to mitigate economic shock in the future.

CDIP is leveraging technology to enhance service delivery and broaden its outreach to marginalised communities. To further its goal of financial inclusion, CDIP has piloted the Nagad MFS provider as an alternative collection channel across all of its 226 branches, the bKash MFS provider in 54 of its branches and Upay MFS provider in 5 of its branches. Through integration, the communities that CDIP is dedicated to empowering will benefit more from increased financial inclusion, increased operational efficiency, and improved service. To guarantee sustained growth in Bangladesh's MFS sector, a unique mix of opportunities and difficulties accompany this shift.

The paper flow will be maintained as follows. Section 2 describes literature review on the field of financial inclusion. Section 3 gives a detailed go through with CDIP's MFS journey. And finally details of relevant analysis shows in Section 4.

2. STATE OF THE ART WORK AND METHODOLOGY

Policymakers and financial institution researchers have generally acknowledged the importance of operational resilience and financial inclusion. Numerous studies emphasise how digital financial services help underbanked areas close the financial gap. The Global Financial Index (Demirgüç-Kunt et al., 2020) stated that a lot of people do not have access to formal financial services, notably in developing nations. Financial illiteracy as well as inadequate banking infrastructure are mostly associated with this lack of inclusion. However, the COVID-19 pandemic has shown how important operational resilience is, especially for small financial service providers and microfinance institutions (MFIs) (Zheng & Zhang, 2021).

One of the most important ways to improve financial inclusion, especially in rural and impoverished areas, is to include digital money into microfinance (Dorffleitner et al., 2022). To solve the issues with microfinance, including high transaction costs, information asymmetries, and restricted accessibility, some organizations and nations have embraced digital alternatives. The growth of rural microenterprises in Malaysia has been greatly aided by microfinance, with digital finance acting as a link to raise the productivity and sustainability of these businesses (Al-Shami et al., 2014). Empirical studies that demonstrate how important fintech adoption is to growing financial services without jeopardizing MFIs' mission have also linked the digital transformation of MFIs to greater social performance and financial sustainability (Awaworyi Churchill, 2020). The extent to which digital finance can help the impoverished, however, is also up for debate.

Existing research highlights the potential of digital money in microfinance, but there are few institution-level studies on its actual application and financial sustainability. Most studies focus on theoretical benefits and macroeconomic trends, ignoring borrower behaviour and real transaction data. Furthermore, even while digital banking is known to improve accessibility and reduce costs, nothing is known about the financial trade-offs it poses for microfinance organisations. This article addresses these gaps by providing empirical insights into MFS adoption inside an NGO-MFI and investigating cost-benefit dynamics, transaction trends, and operational performance. It encourages a more comprehensive understanding of the implications of digital finance integration for institutional resilience and financial inclusion by offering a realistic perspective on the challenges and strategic benefits of doing so.

116 2.1 Data and Methodology

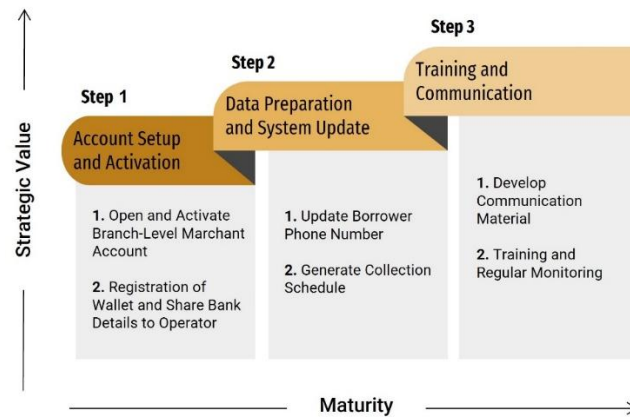


Figure 2: MFS Piloting Phases

119 The financial analysis section of this paper presents a detailed breakdown of the costs and
 120 financial outcomes associated with implementing Mobile Financial Services (MFS) within
 121 CDIP. The average ticket size of collections, growth trends, patterns of transactions carried
 122 out directly by members, and the timing of these collections were among the many topics that
 123 have been examined through analysis of 83,532 detailed transaction records.

124 Analysis of the adoption rate taken from borrowers of CDIP MFI who made transactions
 125 without any outside help. Data spanning of 23 months have been taken and a simple moving
 126 average model was fitted to smooth out trends by filtering out the noise from random short-
 127 term fluctuations.

128 The basic formula for simple moving average model is written as Equation (1) -

$$129 \hat{y}_t = \frac{1}{k} \sum_{i=1}^k y_{t-i}, \quad (1)$$

130 Where y_t is an actual value and \hat{y}_t is a forecast for the observation t and k is the length of the
 131 simple moving average model (Svetunkov & Petropoulos, 2018).

132 The cost-benefit analysis was conducted over a 23-month period from the very inception of
 133 MFS at CDIP, examining the financial impacts from both cost and benefit perspectives. The
 134 analysis of the data with a series of equations was used to calculate the Net Present Value
 135 (NPV) in a cost-benefit analysis (Jason Fernando, 2024).

137 2.1.1 Model Description:

138 1. Discount Factor Calculation:

$$139 \text{Discount Factor} = \frac{1}{(1+\text{Discount Rate})^{\text{Month}}} \quad (2)$$

140 2. Discounted Net Benefit:

$$141 \text{Discounted Net Benefit} = \text{Net Benefits} \times \text{Discount Factor} \quad (3)$$

142 3. Net Present Value:

$$143 \text{NPV} = \sum \text{Discounted Net Benefits} \quad (4)$$

144 Costs included the monthly service charge that organization paid to MFS operators, along with
 145 initial integration costs. Benefits were measured primarily through three key indicators:

- 146 1. **Client Literacy:** Enhanced client understanding of digital financial tools, reducing the
 147 need for frequent staff assistance.
- 148 2. **Staff Time Savings:** Decreased time spent by staff on educating clients and
 149 processing transactions, resulting in increased operational efficiency.

150 3. **Staff Travel Cost Savings:** Reduction in travel expenses due to the implementation
 151 of MFS, which allows staff to handle more transactions remotely rather than requiring
 152 in-person visits to clients or branches.

153 In order to understand the operational efficiency, samples of 165 field staff data were taken
 154 with the concerning parameters of the *Distance of Borrowers from the Branch* and the *Number*
 155 *of Collections Made*.
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Definition of Variables

Variable	Description
Own Transaction	The total number of financial transactions conducted by the MFI borrowers using their own mobile number.
Other MFS Models	Total number of transactions processed through MFS Agents.
Simple Moving Average Model	A simple moving average (SMA) is calculated by taking the arithmetic mean of a given set of values over a specified period.
Discount Factor	The discount factor is calculated by taking the reciprocal of one plus the discount rate raised to the power of the number of periods.
Discounted Net Benefit	The net benefits for each period (which is the difference between benefits and costs) are multiplied by the corresponding discount factor to convert them into present value terms.
Net Present Value	The NPV is computed by summing all the discounted net benefits across all periods.

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Table 1: Definition of Variables

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3. RESULTS AND DISCUSSION

3.1 Transaction Volume Analysis

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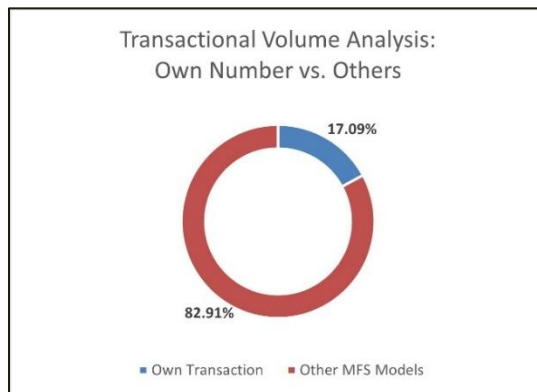


Figure 3: Transactional Volume Analysis

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Since the inception of Mobile Financial Services (MFS) at CDIP, our core mission has been to enhance client financial literacy. As illustrated in Figure 2, a significant stride towards this goal have been made. Currently, 17.09% of CDIP's borrower are independently conducting transactions using their own mobile numbers—a clear indicator of growing confidence and understanding of digital financial tools. However, the majority, 82.91%, still rely on agents or

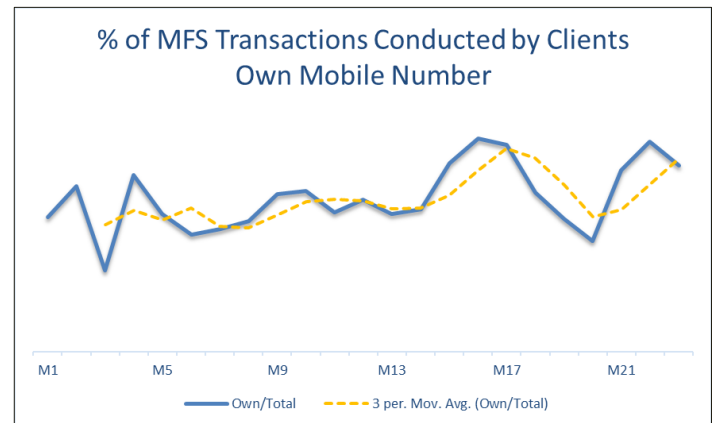


Figure 4: MFS Transaction Growth

other family members/close relatives to complete their transactions. This demonstrates both the achievements to date and the prospects ahead to further empower our clients in their financial endeavours.

Figure 3 highlights the month-by-month progress in client own made transaction of Mobile Financial Services (MFS) at CDIP. With the actual data (the blue line), there are significant monthly variations, suggesting that clients' usage of their own mobile numbers for transactions may be influenced by various factors, such as seasonal effects, promotions, or other external conditions. The moving average shows a gradual increase in the percentage of transactions completed by clients using their own numbers over time. This suggests that, overall, client literacy and confidence in using their own devices for transactions have been improving.

Key Periods:

- **Month 1 to Month 3:** Initial volatility with a noticeable incline in usage.
- **Month 6 to Month 9:** A sharp rise in the adoption rate, followed by another dip.
- **Month 14 to Month 21:** Another increase, showing a possible seasonal or campaign-related spike in MFS usage.

Ticket Size of Collection		
Segment	Count	Amount (USD)
Less than or equal to 5000	5,660	1,98,298
5001-25000	67,152	66,83,852
25001-45000	9,074	23,62,870
45001-65000	1,173	4,95,627
65001-85000	167	1,01,802
85001-150000	96	82,040
More than 100000	7	9,942
Total	83,329	99,34,431

Table 2: Ticket Size of Collection

Data on transaction ticket sizes was analysed to understand the distribution of transaction amounts, identify the most common transaction sizes and the contribution of each ticket size category to the total collection. The majority of transactions fall within the 5001-25000 ticket size range, accounting for USD 66,83,852 in collections, which represents the largest portion of the total collected amount.

3.2 Cost-Benefit Analysis

3.2.1 Cost Breakdown

The costs associated with the MFS implementation included the initial development and integration cost and the service charge that MFIs bear for each transaction. Each transaction carried out through MFS incurs a 1% service charge, which is borne by the MFI. This charge represents a direct cost to the organization for providing this service to borrowers. Service charges and integration came to a total of USD 98,423 during the last 23 months. Without any financial assistance from other MFS operators, CDIP covered all of the associated costs.

3.2.2 Benefit Analysis

The primary benefits identified were the savings in staff time and the increased operational efficiency resulting from improved client literacy. The staff time savings were quantified by evaluating the reduction in hours spent by staff on time consuming tasks, such as door to door collection from clients. While these savings don't yield a direct financial return, they play a

crucial role in boosting long-term operational efficiency and elevating client literacy. Consequently, our model indicates no immediate financial gain, but the strategic value lies in the sustained improvements these factors bring to the organization's overall performance.

3.2.3 Discounted Cash Flow Analysis

Given the long-term nature of the project, a discount rate of .1% was availed by one of the MFS operators after continuation of 15 months of the project. CDIP availed this offer only for 8 months with our data range for this analysis.

The last 8 months discount rate derived from the annual rate was approximately 0.10%. Using this rate, the net benefits for each month were discounted, resulting in a present value analysis that provides a clear picture of the project's financial viability.

3.2.4 Results

The net present value (NPV) of the MFS implementation was found to be negative. This indicates that the benefits of the MFS project, outweigh the costs over the 23 months period.

- **Integration cost (Twice in the time frame of 23months):** USD 3,553 (approx.)
- **Net Present Value (NPV):** USD -68,585 (approx.)

This negative NPV indicates that, from a purely financial standpoint, the MFS implementation did not generate a financial return sufficient to cover the initial and ongoing costs. While the cost-benefit analysis of implementing mobile financial services (MFS) shows a negative net benefit, CDIP believe that the strategic, operational, and social advantages far outweigh the immediate financial losses.

Data was analyzed from a sample of 165 field staff who are in charge of collecting instalments from borrowers on a daily basis. Our insights revealed that when a borrower within a 2 km radius makes a payment via Mobile Financial Services (MFS), it saves the field staff 19 minutes of collection time. Similarly, significant time savings are observed for borrowers located at greater distances. By analyzing data from branches with the highest and lowest MFS collections, it was observed that, on average, field officers in high-collection branches manage 29 more members than those in low-collection branches.

Distance of Borrower from Branch (km)	Required Collection Time per Borrower (minutes)
2	19
5	34
8	49
9	54

Table 3: Collection Time Based on Distance

Benefits in operational implications

- **Increased Capacity:** The time saved by using MFS can be redirected to other productive tasks. For example, field staff could use this time to serve additional borrowers, complete administrative work, or reduce their working hours, leading to better work-life balance.
- **Client Financial Literacy:** From our analysis its evident that clients are making their transaction by their own. This shift suggests that they are gradually becoming more financially literate, as they gain confidence in using digital financial tools.
- **Client Satisfaction:** Borrowers benefit from the convenience of MFS, potentially leading to higher satisfaction and retention rates. This is also incredibly easy for them

266 because they don't have to pay any additional fees for the transaction and they can
 267 complete it using their own mobile as well as with available agent points.
 268 • **Reduced Cash Handling Risk:** As the payment is conducting via cashless system,
 269 the risk associated with handling cash are significantly lowered. Specially in the
 270 evening hours, as shown in table 2, a considerable amount of transaction which is
 271 28,171 transactions, occur between 6.00 PM to 11.59 PM.
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273 4. CONCLUSION

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 275 The incorporation of MFS within the microfinance framework of CDIP signifies a noteworthy
 276 development in the direction of connecting the digital financial ecosystem and conventional
 277 microfinance models. With collaborations with bKash, Upay, and Nagad, CDIP has set out on
 278 a revolutionary path to improve client empowerment, operational effectiveness, and financial
 279 inclusion. The study's findings point to several significant problems. Firstly, the increase in
 280 self-approached transactions suggests that there has been a noticeable shift in client
 281 behaviour since MFS was implemented. This tendency suggests a gradual change in favour
 282 of growing client financial literacy and greater digital financial autonomy. Secondly, the
 283 analysis of transaction volumes and patterns reveals that MFS usage is influenced by a variety
 284 of factors, not only seasonal trends and time of day. Despite the analysis's negative net
 285 present value (NPV), the cost-benefit analysis shows that the long-term strategic benefits—
 286 such as increased client literacy and operational efficiencies—outweigh the short-term
 287 financial drawbacks. The results underscore the need for persistence and steadfast
 288 commitment to the digital transformation, as the actual importance of MFS surpasses
 289 immediate financial benefits. Thirdly, from an operational standpoint, the implementation of
 290 MFS has resulted in a significant decrease in staff time and travel costs. This has an impact
 291 on CDIP's overall cost-effectiveness as well as its capacity to service a larger clientele and
 292 achieve its goal of social development. The improved customer experience and satisfaction
 293 with MFS use further support the strategic decision to devote resources to digital financial
 294 services.
 295 Even though MFS integration at CDIP has a financial cost, the broader benefits it provides—
 296 such as financial inclusion, client empowerment, and operational efficiency—illustrate its
 297 revolutionary potential in the microfinance sector. The CDIP with MFS journey demonstrates
 298 the challenging but beneficial path towards digital transformation in microfinance, where the
 299 emphasis is on sustainable growth, social impact, and financial inclusion. Further research
 300 endeavors could delve further into the intricacies of consumer behavior, difficulties related to
 301 scaling, and the integration of progressively complex digital tools to enhance the effectiveness
 302 of MFS in comparable microfinance contexts.
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COMPETING INTERESTS DISCLAIMER:

Authors have declared that they have no known competing financial interests OR non-financial interests OR personal relationships that could have appeared to influence the work reported in this paper.

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CONSENT (WHERE EVER APPLICABLE)

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Not applicable. This study does not involve any patient data, clinical case reports, or identifiable human subjects.

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ETHICAL APPROVAL (WHERE EVER APPLICABLE)

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Not applicable. This study did not involve any human participants or animal experiments.

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