Objective repayment performance in Bangladesh and its determinants:

How to improve the allocation of loans by MFIs?*

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Summary:

The aim of this article is to produce a comprehensive analysis of the performance of microfinance institutions (MFIs) in terms of repayment. We use 1629 loan observations to analyze with a probit the determinants of the repayment performance of borrowers of the BRAC, the BRDB and the Grameen Bank. We test for endogeneity of the size and duration of the loan in the determination of repayment and use instrumental variables to correct for it. We then use a comparative analysis of the determinants of the repayment performance and of the loan size to give policy recommendations to improve the allocation of loan by MFIs.

Keywords: Microfinance, social ties, group homogeneity, social intermediation, Asia, Bangladesh.

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Introduction.

Microfinance Institutions (MFIs) provide financial services (credit and saving) to the poor so as to reduce the credit rationing they face and help alleviate poverty. Should it be profit oriented or not, each MFI search the repayment performance as high repayment rates allow the MFI to lower the interest rate it charges to the borrower reducing thus the financial cost of credit and enabeling more borrowers to have access to credit. Improving the repayment rate could also help reduce the dependence on subsidies and help the MFI reach a better sustainability level. It is also argued that high repayment rates reflect the adequacy of MFI's services to clients' needs and restrict the cross subvention¹ of the borrowers. Repayment performance also acts as an important positive signal when the MFI has to rise new funds. For all these reasons, higher repayment rates are largely associated with benefits both for the MFI and the borrower².

The MFI will thus firstly tend to reach the first best level of a 100% on time repayment rate and, if such a level of repayment performance cannot be reached, it will try to allocate higher loans to borrowers with lower probability of default and reduce the delay in repayment. Understanding what the MFI should do to meet these objectives depends on the most common factors influencing repayment. Considering those factors, we can differentiate between those related to information asymetries, those related to adverse shocks and those related to a low performance of institutions such as justice or education. When gaining information on the characteristics or on the behavior of the borrower is costly for the MFI, problems of adverse selection -allocation of loans to borrowers who did not have the ability to take advantage of his loan or with a low probability- and problems of moral hazard -the borrower has not produced the required level of effort to take advantage of his loan or has used is loan for unproductive purposes- are more likely to occure. Adverse selection and moral hasard will increase the proportion of borrowers who do can not repay their loans on time next to those who experienced different adverse shocks (like illness or natural disasters). Borrowers might also have enough monney to reimburse their loan but still default strategically. Cost of strategic default might indeed be low if they have low collateral requirement and if the legal system give little power to the MFI to enforce contracts. MFIs will try to restrict the

¹ As borrowers have different probability of default and as it is difficult for the MFI to charge a different interest rate to each borrower relative to his probability of default, borrowers who are more prone to default will be subsidized by lower risk borrowers.

 $^{^{2}}$ If a good repayment performance is a prerequisite for financial sustainability, they are not a sufficient condition of financial health as high administrative costs or high borrower turnover could be the counterpart of those high repayment rates.

occurrence of those situations and design appropriate incentives to repay and sometime strengthen the economic ability of the borrower.

In this paper, we want to contribute to the improvement of the repayment performance of MFIs in examining the determinants of the repayment performance with a particular interest in "microfinance innovations". This analysis will highlight in which direction the MFI should work so as to increase the repayment rate and as a consequence approach the first best. This paper also includes an analysis of the current adequacy of microcredit supply (in terms of loan size) based on the comparison of the determinants of the repayment performance to these of the loan size. As the on time repayment rate is often inferior to 100%, the MFI will have second best strategies to increase the repayment. This work uses an objective repayment variable, i.e. a repayment variable based on the declaration of the borrower (not the MFI's). It addresses the problem of endogeneity of principal and duration of the loan in the determination of the repayment performance.

The results indicate that microfinance innovations have a mixed explanatory power among the other influencing factors of the reimbursement.

The layout of this article is as follows: after a brief presentation of the conceptual framework (section 1), section 2 involve a brief empirical litterature review and section 3 lays down the context of the case study. Section 4 presents the econometric methodology. The results of the regression model are discussed in section 5 and the article concludes with implications for policy recommendations and future research.

1. The conceptual framework.

1.1. How to get closer to the first best level of repayment performance?

Credit rationning and collateral requirement are the traditional means used to cope with asymetries in information on the credit market (Stiglitz & Weiss, 1981) but both of those means lead to the exclusion of the poor borrowers. To explain the success of microfinance in providing credit to the poor, a large literature uses the principal/agent theory to demonstrate that microfinance contracts which are lending o joint-liable groups allow the lender to bypass moral hazard (Stiglitz, 1990) and adverse selection (Gatack, 1999) due to asymmetries in information. It is also argued (Besley & Coates, 1995) that joint liable lending groups help enforce repayment as social interactions make it more costly to default. Regular repayment

schedules (Armendariz de Aghion & Morduch, 2000) or dynamic incentives³ (Besley, 1995) are other appropriate incentive mechanisms used by MFIs to increase their repayment performance. Social intermediation, in other words, the provision of non-financial services nest to credit and saving services (Edgcomb & Barton, 1998) also develops the economic ability of the borrower to repay. The previous mechanisms are considered to be financial innovations (Edgcomb & Barton, 1998) that make it financially sustainable for microfinance to lend to the poor. When the use of such mechanisms is unsufficient for the MFI to reach a first best repayment rate and when borrowers are heterogeneous in their probability of default, the MFI should also allocate loans of different size to the borrowers so as to maximize the proportion of outstanding debts repaid on time.

1.2. The second best perspective: increasing the proportion of outstanding debts repaid on time.

The purpose of this section is to understand why borrowers prefer bigger loans and why the MFI should allocate bigger loans to borrower with lower probability of default.

1.2.1. The context.

We consider the credit relationship of microfinance institutions providing credit to joint liable credit group at a uniform interest rate. The MFI faces demand for credit of borrowers heterogenous by their localisation, lending group, ability and preferences. The MFI maximizes the global net expected return of its borrower under a zero profit condition.

As borrowers face high credit rationning, there is a large set of highly productive projects and borrowers face an increasing medium productivity of capital. The expected profit for the borrower will thus be strictly increasing in the loan size for a given duration as shown in figure 1^4 .

The borrower acquires the information on the cash requirement, expected return and probability of success of the different projects he is able to manage before applying for a loan. This set of projects is possibly restricted by the local environment as the distance from marketable activities, the economic drive and the pre-existing concurrence of similar project in the area may induce variation in the set of profitable projects. The set of accessible projects

³ Dynamic incentives refer to the threat not to refinance a borrower who defaults on debt obligation. The incentive power of dynamic incentive is enhance if the MFI allocate larger loans over time to good repayment borrowers.

⁴ Figure 1 stands for a constant marginal productivity of capital. We could also allow for an increasing marginal productivity of capital which would strengten the atractiveness of bigger loans for the borrowers.

may be further restricted by his lending group (Madajewicz, 1999) which may incite the borrower to undergo similar project in terms of size, activity and probability of success so as to better monitor his activities and limitate the variation in default probability among group members and consequent group cross subsidiation.

The borrowers have no own funds to invest.

1.2.2. The behaviour of the borrower: demand for credit and repayment.

The demand for credit.

We consider a borrower who is given the chance to obtain a loan from a microfinance institution. The loan application of the borrower will correspond to the size and duration which maximizes his expected return⁵.

The optimal duration depends on the distribution with time of the returns of the project, on the scale of the project, on the preferences of the borrower for the present consumption and on the allocation of a new loan conditional to the total repayment of the previous loan. The duration will however be such that the sum of the return of the project and external returns is higher than each installement. This minimal duration of the loan increases when the returns to scale of the project are increasing and remains constant when they are constants.

For a given duration, each loan size will correspond to a single project as the borrower will undertake the project that has the higher expected return for each loan size.

As the net return is an increasing function of the size of the loan, the borrower will always prefer bigger loan and will ask for the maximum loan size he can ask for (L_{max} in figure 1) given his set of accessible projects –defined by his characteristics, the characteristics of his environment and these of his lending group.

The repayment.

The borrower will default on his loan when the duration of this loan is inferior to the minimum duration. An increase in the duration along with unregular repayment schedules may also increase his probability of default.

For a given borrower and a duration of the loan, it is argued (Freimer & Gordon, 1965) that the repayment probability decreases with the size of the loan as shown in figure 2 where P_{min} represent the probability of default due to external factors such as illness or acidental destruction of the borrower's productive assets. The increase in the default probability may be different among borrowers reflecting the difference in endowments and moral hasard or strategic default associated costs.

1.2.3. The MFI: improving the proportion of outstanging debts repaid on time.

If the above mentioned incentive mechanisms and non financial services are imperfect, the MFI will choose a new target probability of default and will respond to the borrower demand for credit only if his default probability is inferior to the target. If there is observable heterogeneity in the repayment probability of borrowers for a given size of the loan, the MFI then allocate larger loans to the safer borrowers as shown in figure 3.

2. Literature review.

Following the discussion on the theoretical literature on microcredit we expect that joint liability, especially through peer selection, peer monitoring, and peer pressure should be associated with a better repayment performance. Group homogeneity and social ties are also expected to increase the repayment performance not per se but because they allow a better efficiency of group dynamics. Group homogeneity as a result of effective peer selection (group homogeneity in terms of risks, Ghatak, 1999) and as a mean to increase peer monitoring (group homogeneity in terms of interest, economic power..., Stiglitz, 1990) should go together with higher repayment rate. High level of social ties should have the same impact as they facilitate peer monitoring and increase the potential social sanction of peer pressure (Besley & Coates, 1995). Dynamic incentives and social intermediation, which are extra group microfinance financial innovations, are also expected to increase the repayment performance.

Addressing the question of the relative performance of group loans compared to individual loans and using data from Zimbabwe, Bratton (1986) states that group loans perform better than individual loans in years of good harvest and worse in drought years when peers are expected to default. Paxton (1996) analyzes with a mean and covariance structural model the determinants of successful group loan repayment of 140 credit groups in Burkina Faso. She raises one's attention on what she calls the domino effect⁶ that can outweigh the positive effects of group lending. Zeller (1998) uses information on 146 credit groups in Madagascar and provides evidence in favor of group lending. Zeller shows indeed that the group generates insurance which leads to a better repayment performance.

Analyzing the potential positive effects associated with group dynamics, some studies examine the impact of different levels of peer selection, peer monitoring and peer pressure.

⁵ We consider that the utility of the borrower is increasing with the return he gets from his project.

Wenner (1995) presents a methodology to test whether selection mechanism has an impact on the repayment performance of 25 Costa Rican credit groups and whether group members use local information for the screening of their peers. His study shows that lending groups use private information to select their peers and that this selection mechanism increases the group repayment performance⁷. On the same point, the above mentioned study of Zeller (1998) confirms the positive role of peer selection (internal rules of conducts) on repayment performance. Wydick (1999) uses data from 137 Guatemaltese credit groups to show how social cohesion affects group performance in terms of repayment rate, group insurance and moral hazard. He found that peer monitoring in urban groups and peer pressure in rural ones significantly affects group performance. Limiting the conclusions on the impact of group dynamics of the previous three articles, Diagne, Chimombo, Simtowe & Mataya (2000), working on data from Malawi, found that peer monitoring, peer pressure and joint liability had little or negative impact on repayment performance whereas peer selection was found to be limited.

Social ties and group homogeneity are supposed to improve the power of group dynamics. Nevertheless, the studies give mixed results. The study of Sharma & Zeller (1997), based on the analysis of repayment rates of 128 credit groups in Bangladesh, leads to a controversial negative impact of preexisting social ties as well as group homogeneity in terms of asset and enterprise diversity. The study of Zeller (1998) investigates the effects of intragroup pooling of risky assets or projects on repayment rates. While this analysis supports the positive role of social cohesion, it also concludes that risk diversification (up to a certain level) has a significant positive effect on repayment performance. This could be explained by a matching problem (Paxton, 1996). The matching problem arises when credit terms and conditions are no longer appropriate for each member as credit is repeated again. If initial group homogeneity and prior experience of group activities were associated to better repayment performance, as time goes the positive effect of group homogeneity on peer monitoring balance with the negative impact of a matching problem and the absence of risk diversification that limit the possibilities of intra-group insurance.

Parallel to group lending, MFIs usually use dynamic incentives and social intermediation. MFIs use dynamic incentives when they increase with time the amount they lend to a specific borrower and condition new loans to prior reimbursement discipline. Microfinance is

⁶ The domino effect occurs when at least one member of a credit group default due to the default of other members.

⁷ Wenner challenges the positive effect of this feature as further analysis indicate that costs faced by the borrowers to get this information overcompensate the induced benefits in terms of repayment performance.

sometimes referred to as social intermediation (Edgcomb & Barton, 1998) as many MFI provide services or training that go beyond financial services. Contrary to group lending, those two main features of MFI have been little documented up to now. The most important factor that motivates lending groups to repay in the study of Diagne, Chimombo, Simtowe & Mataya (2000) is the relative value they associate to access to future credit. For Sharma & Zeller (1997), credit rationing up to a certain level, has significant positive effect on repayment performance. Moreover, we cannot assume that these dynamic incentives keep the same intensity as credit is repeated over time especially if borrowers observe that credit isn't systematically denied to defaulting or late borrowers. In a study devoted to the Grameen Bank and not exclusively focussed on a repayment rate analysis, Khandker, Kalily & Khan (1994) found that the longer the branch operates in an area, the higher the loan default rate. They explain this feature by the possible decreasing marginal profitability of new projects but as many MFI suffer today from a growth crisis, we have to be cautious on this point. Khandker, Khalily & Khan (1994) also found that membership training, which relates to social intermediation, has a positive influence on repayment.

The last set of variables to be documented in studies on the determinants of repayment rates are the characteristic of the area and of the borrower. Khandker, Khalily & Khan (1994) raise the question of whether default is random and influenced by erratic behavior or whether it is systematically influenced by area characteristics that determine local production conditions or branch-level efficiency. Their empirical test on Grameen overdue loans backs up the partial influence of area characteristics. Rural electrification, road width, primary educational infrastructure and commercial bank density are positively correlated with a low default rate as well as the predicted manager's pay and member training. We can infer from this study that the economic drive of the area positively influences the repayment rate. Paxton (1996) shows in the same way that access to other credit sources, market selling activities and urban location were linked to a better repayment performance. Questioning the impact of the characteristics of the borrower, Zeller (1998) showed that traditional priors against women, young borrowers or high family size could not be used as signals of repayment ability.

The above mentioned studies attribute a debatable role to the exploitation of group dynamics whereas the role of social intermediation and social ties is very little documented. It is thus important to produce further tests of the impact of these financial innovations on the repayment performance so as to understand better the common reasons for the success of microfinance. This article provides a test of the explanatory power of social ties and group homogeneity as well as social intermediation and dynamic incentives. Impact of the main characteristics of the loan contract and of the borrower is also taken into account.

3. Data.

The data come from a quasi experimental survey ran in Bangladesh in 1991-1992 by the BIDS (Bangladesh Institute for Development Studies) and the World Bank. The survey covered 1798 households, coming from 87 villages from 29 different thanas (subdistricts)⁸. 1538 of these households were "eligible" to MFI, which means they were poor enough to benefit from microfinance services and 905 of these households actually took part in a microfinance program. For the purpose of our work, we concentrate our interest on households that had actually borrowed from one of the three MFIs. On the 2349 workable observations, 485 corresponded to BRAC loans, 430 to BRDB loans, 1081 to Grameen Bank loans and 353 to other credit providers (see Table 1 for the description of other credit providers).

The exploration of the data bears out little differences across the MFIs in terms of general characteristics of the loan (the interest rate is the same for all loans) or type of borrowers. Differences appear when we consider non financial services: health, education, marketing and profesionnal training services. These services increase the value the borrower attributes to his relation with the MFI and can be referred to as social intermediation. The following section lays down the econometric model that will enable us to analyze the factors influencing the repayment performance.

4. The econometric framework.

Following the discussion on the theorical litterature, we describe the interaction between the borrower and the MFI with the following model:

Stage one: The borrower applies for a loan of a specific size and duration which correspond to the larger scale of his accessible projects difined by his/her characteristics, the characteristics of his environment and these of his/her lending group.

Stage two: Before allocating a loan to the borrower, the credit officer of the MFI computes the probability of default of this application given the information he has on the borrower, on his lending group, on the environmement and on the predicted effectiveness of his repayment incentives for this borrower. When the computed probability is inferior to the acceptability

⁸ These 29 thanas were randomly chosen out of the 391 thanas of Bangladesh.

treshold, he allocates the loan the borrower applied for, otherwise, he allocates a smaller loan which correspond to the acceptability treshold.

Stage three: The borrower reimburses his loan on time or not given his/her environment, his/her characteristics/ability, the characteristics of his/her group and the characteristics of the loan contract.

The break down in three steps of the microcredit relationship sheds light on the possibility of endogeneity of the principal characteristics of the microcredit contract (loan size and duration) in the estimation of repayment. The determination of the loan size and duration in stage two and the determination of the repayment in stage three might indeed be based on shared omitted variables – variables observed by the MFI ans the borrower but not available in our dataset (like the characteristics of the environment).

We constructed individual dummy variables for repayment. We thus used a probit model to estimate the probability for a borrower to repay his loan at the due date⁹. We used the method of Smith and Blundell (1986) to test for exogeneity in such a model. Endogeneity of the size and the duration of the loan couldn't be rejected and those variables are instrumented.

The previous discussion leads us to our estimation strategy:

• Step one : Estimation of the size and duration of the loan:

$$P_{i} = \hat{P}_{i} + \varepsilon_{i}^{p} = \alpha^{p} + \sum_{j=1}^{5} \beta_{j}^{p} X_{ij} + \sum_{j=1}^{5} \rho_{j}^{p} Y_{ij} + \sum_{j} \sigma_{j}^{p} W_{ij} + \gamma^{p} IVp + \varepsilon_{i}^{p}$$
$$D_{i} = \hat{D}_{i} + \varepsilon_{i}^{d} = \alpha^{d} + \sum_{j=1}^{5} \beta_{j}^{d} X_{ij} + \sum_{j=1}^{5} \rho_{j}^{d} Y_{ij} + \sum_{j} \sigma_{j}^{d} W_{ij} + \gamma^{d} IVd + \varepsilon_{i}^{d}$$
(1)

Where $X_{.j}$ represents the variables of social ties, group homogeneity and size of the group. Social ties of the borrower with the rest of the community as a whole can increase the social cost of peer pressure and the identification of the borrower to their weekly meeting group gives argument in this sense. We tried therefore not to restrict social ties to social ties among the group¹⁰ as in previous studies (Wydick 1999). We used the age of the group (i.e. the number of years during which the borrower took part to his present group) for inner group social ties and proxies such as living in the same house as the spouse for extended social ties. We postulate that the members of the group know each other better and develop social ties as the age of the lending group (AGEGP) increases. This is why we expect the ability of the

⁹ Estimations using larger definitions of repayment (repayment done before three, six or twelve months following the maturity date) have also been conducted and gave sensibly the same results. For such estimations, the sample had to be reduced to borrowers whose original date of reimbursement stands three to twelve months before the date of the survey. We chosed the exposed definition of repayment so as to work with the largest sample.

members of the group to monitor and pressure each other to increase with the age of the group. The variable AGEGP should thus have a positive impact on the repayment performance. We used two variables for extra-group social ties. The first one, SCOHAB, takes the value of one if the borrower and his/her spouse live in the same house. We postulate that the social net of the borrower is bigger when he does not live in the same place as his/her spouse does. That is why we expect SCOHAB to have a negative impact on repayment. The second variable, RESE, gives the number of months the borrower lived out of the village in the previous year. The longer the borrower lives out of the village, the smaller his social ties with other villagers. RESE is then also expected to have a negative impact on repayment. Group homogeneity is based on shared characteristics (gender, age, education level) of the borrower and its group leader. We expect the variables of group homogeneity (SAMESEX, SAMEEDU, SAMEAGE) to have a positive impact on repayment performance.

Small groups are expected to show a better repayment performance as they can easily monitor each other. Because borrowers of large groups can benefit from larger intra-group insurance possibilities, large group may also have a positive impact on group performance. We use different dummies (NMBG1, NMBG2, NMBG4, NMBG5) for the size of the group to control for the possible non linear effect of the size of the group.

 $Y_{...j}$ describes the variables of social intermediation (such as access to health services) and dynamic incentives (proxied by credit rationing). The variables of social intermediation (FACL, FACT, FACH, FACM) and the variable of dynamic incentive (CRd) are expected to have a positive impact on the repayment.

 $W_{,j}$ stands for the exogenous control variables. Control variables gather characteristics of the borrower and his household and basic information on the loan (dummy for the MFI, size and duration of the loan, purpose of the loan, period of redemption date in the year and number of loans attributed by the MFI during the year of the loan).

IVp and *IVd* represent the instruments respectively for principal and duration.

Because the determination of size and duration of the loan is simultaneous¹¹, we run simultaneous regressions for those two variables.

 Step two: Smith and Blundell (1986) exogeneity test of principal and duration in the determination of the repayment performance:

¹⁰ Social ties inside the group are expected to facilitate the peer monitoring and the use of peer presure.

¹¹ The MFI uses the same variable to allocate both the principal and the duration of the loan. This was confirmed by a Ramsey RESET test of omitted variable.

$$R_{i} = \alpha + \omega \widehat{P}_{i} + \upsilon \widehat{D}_{i} + \sum_{j=1}^{5} \beta_{ij} X_{ij} + \sum_{j=1}^{5} \rho_{ij} Y_{ij} + \sum_{j} \sigma_{ij} W_{ij} + \eta \varepsilon_{i}^{p} + \mu \varepsilon_{i}^{d} + \varepsilon_{i}$$
(2)

Where R_i , the latent variable of the model, is the capacity for an individual to generate cash in excess of the amount (principal plus interests) he has to repay before the initial date of paying back.

What we observe is the reimbursement R_i^* which takes the value of 1 if $R_i > 0$ and 0 if $R_i < 0$. Exogeneity is rejected if the coefficients of the errors (η, μ) of the instrumental regression of principal and duration are significant. This would indeed mean that the structure of the error term is the following: $\varepsilon_i = \alpha \varepsilon_i^p + \beta \varepsilon_i^d + \mu$

The test of instrument confirms that we used appropriate instrumental variables¹².

• Step three: Estimation of the repayment performance:

$$R_i = \alpha + \upsilon \hat{D}_i + \omega \hat{P}_i + \sum_{j=1}^{5} \beta_{ij} X_{ij} + \sum_{j=1}^{5} \rho_{ij} Y_{ij} + \sum_{j=1}^{5} \sigma_{ij} W_{ij} + \varepsilon_i \quad (3)$$

• Step four: Larger loans, for whom?

After a comment on the regression of the repayment probability, we compare its determinants to those of the size of the loan. If we assume that the loan size reflects the perception the MFI has of the capacities of the borrower, this allows us to analyze the adequacy of the loan allocation by the MFI.

Because, as previously exposed, the loan size is a result of both demand (stage one) and supply (stage two) factors, we cannot simply assume that the loan size reflects the abilities the MFI attributes to a specific borrower. We must indeed consider separately the two following cases:

- 1. If the demand of the borrower in terms of loan size is higher than the final loan size, the loan size reflects the perception of the MFI.
- If the demand is equal to the attributed loan size, it could be that the MFI would have given more if the borrower had asked for if the MFI has a higher representation of the abilities of the borrower.

¹² We use ELECTRICITY, i.e. private access to electricity (whole sample, BRDB, GB, RTG3) and the PGWBL, i.e. the number of weeks the borrower had to wait before receiving his loan (for the BRAC), as instrumental variable for loan size.

For the duration of the loan, we use COLS, i.e. signature or personal guaranty required as primary collateral (whole sample, BRAC, BRDB, RTG3) and PGWBL (GB) as instrumental variables.

Step four will thus be restricted to the borrowers who were credit rationed¹³ (over 70% of the sample).

Remarks:

1. We ran the regression on both split-sample (one regression by MFI) and on the entire sample. This allows us to assess if the impact of a specific variable is driven by a specific MFI or not. The estimation on split sample and the application of the test of Smith and Blundell (1986) also proved the need of correction for endogeneity of principal and duration in the estimation of the repayment performance. We also present the regression for the repayment probability when a delay of three months (RTG3) is admitted for repayment. Correction for endogeneity of principal and duration has also been made for this regression.

2. What we observe here are only marginal impacts of microfinance inovation since each of the studied MFIs uses group lending, social intermediation and dynamic incentives in their credit relationships. This induces an underestimation of the effect of these financial innovations.

5. Results and discussion.

5.1. The repayment behavior of the borrower.

The results of the probit estimation of the repayment are reported in Table 6 (repayment on time and with a grace of three months, whole sample) and Table 7 (repayment on time, split sample).

Social ties among the group, proxied by the age of the group (AGEGP), had a significant negative impact on repayment rate. We explain this contrasting feature in different ways. At first, we can refer to the matching problem (Paxton, 1996): as duration of membership increase, the credit need of the members of the group differs. A decreasing power of social penalties can also explain this feature as members know each other better and are more reluctant to control and sanction themselves. This seems to overcompensate the benefits of increasing experience in consumption smoothing and provision of insurance with membership duration. The age of the borrowing group was still significant when we allowed for arrears of three months for the repayment (estimation of RTG3).

The variable SCOHAB¹⁴ which is a proxy for social ties out of the group had a significant negative effect as expected. If the spouse of the borrower lives elsewhere, the social network

¹³ As we do not have information on the loan size demand, credit rationment refer to the subjective apreciation of

of the borrower will be larger. Group homogeneity (SAMESEX, SAMEEDU, SAMEAGE) proved to have no significant impact on repayment performance in the whole sample as in the study of Wydick (1999)¹⁵. Group homogeneity in terms of sex showed a positive impact (regression of RTG3 and BRDB) whereas homogeneity in terms of education showed a negative effect (same regressions). Homogeneity in terms of age showed both a negative (BRDB) and a positive (GB) effect on the repayment performance.

Variables for social intermediation proved to have little or negative influence in the whole sample. Access to health services (FACH) had significant negative effect whereas professional training (FACT), marketing (FACM) and literature (FACL) services showed no effect. Negative impact of these non-financial services could be attributed to correlation with unobservable variables like the level of risk of the project of the borrower (for professional training) or idiosyncratic shocks (for the access to health). However, access to professional training has a positive significant effect in the estimation of RTG3. This questions the possibility for these services to increase the borrower's ability to succeed in their projects. The costs incurred by non-financial services cannot be justified by their positive effects on repayment performance. Important differences among the MFIs appeared in the impact of social intermediation (non-financial services) on repayment performance. Whereas, the BRAC experienced a positive influence of its marketing service and negative influence of its health services, the BRDB experienced a negative influence of both its professional and health services. Access to basic literacy had a negative impact on the repayment of the Grameen borrowers while access to health services proved to have a positive impact. The difference among the MFI on the impact of non-financial services give rise to a field for future research on non-financial services: what kind of service is offered to a specific borrower?, why?, is there a difference in the quality of the provision of these services among the different MFIs? and what are the costs and benefices induced by these services?

The split sample regression gives evidence of the positive impact of dynamic incentives on the repayment behavior of the borrowers as credit rationing (CRd) has a positive significant impact on the repayment performance.

Small groups (NMBG1) had better results in terms of reimbursement than medium groups which confirms the positive impact of peer monitoring but big groups (NMBG4) also proved to have a better performance probably due to a large use of intra-group insurance. When a

the borrower who would or would not like to borrow more at the same interest rate.

¹⁴ SCOHAB is a dummy which takes the value of one if the borrower and his/her spouse live in the same place.

¹⁵ In the study of Wydick, SAMESEX is the only variable of social ties that affected repayment performance and it has a negative impact, only in urban groups.

grace period of 3 months is given for reimbursement, the relative performance of smaller group disappears. We can thus surmise that development of insurance services could give rise to a better exploitation of peer monitoring.

The characteristics of the contract showed significant impact on the repayment of the borrower. The instrumented size of the loan (PPRIN) presented a positive impact contrary to what was found before instrumentation and in the study of Sharma and Zeller, 1997. According to the theory of dynamic incentives, loan size increases with the duration in membership. The positive impact of loan size could thus be explained by a better ability of the borrowers to succeed in their projects with time. It is important to know whether the impact of the loan size is positive or negative because a negative impact of loan size could lead to embarrassing conclusions¹⁶. Duration (PDURATION) showed a negative impact in the whole sample but a positive one in two of the three split sample regressions. The repayment is significantly higher at the end of the year (ENDY) and during the harvest seasons (HARVEST). This is still the case when we allow a grace period of three months (RTG3). Borrowers that have to pay back their loan during the lean agricultural season seem to face permanent difficulties in paying back, maybe because of expensive coping strategies. That is why, if the cash management allows it, MFIs should avoid fixing the redemption date of the loan during the lean agricultural season¹⁷. Initial fees (FEE) had a positive effect. These fees are relatively low compared to the amount borrowed (cf. Table 3) but this formalization of the membership of the MFI seems to play a symbolic role for the borrower¹⁸. The number of weeks the borrower had to wait before receiving his loan (PGWBL) had no significant impact on repayment performance and we cannot postulate an appropriate screening of the MFI with this instrument. The estimation also reveals that personal (PURPP) and agricultural loans (PURPA) are better reimbursed than business ones. This must be related to the negative effect of employment (EO) and self-employment (SELFEO) in non agricultural activities. These activities are more risky but have an important role to play in the economic development of the area. This can justify the priority given by the Grameen Bank to self-employment and

¹⁶ Indeed, when big loans correspond to riskier projects with higher level of returns they are important for the economic development of the area and for the long term wealth of the borrower. This is a rather optimistic interpretation and we could also think that big loans do not meet the borrower needs and are not suited to the local economy. If borrowers cannot take advantage of big loans they will not be able to be independent of the MFI and to get out poverty. Lastly, we could think that incentives to strategic default increase with loan size. This discussion would temperate the interest for the MFI to attribute loans of big size.

¹⁷ This is one of the propositions of the Guinean borrowers of the Crédit Rural de Guinée (Condé, Bouju & Gentil, 2001).

¹⁸ This can be linked to the positive impact of rules of conduct in the study of Wenner (1997).

income generating activities even accounting for the lower performance of those projects in terms of reimbursement.

The size of the loan portfolio (NBYT) showed significant negative impact¹⁹ which could have different meanings. Firstly, in a financial perspective, as the MFIs grow they can finance projects with higher levels of risk because they can diversify their risks. Secondly, this could be explained by a fall in the manager's time allocated to each group as the loan portfolio increases. And lastly if as frequently reported, the MFIs do not systematically exclude bad or late borrowers, the experience of the MFI behavior will decrease the expected weight of the MFI's sanction in case of default. Considering that the number of borrowers steadily increased over the years, the negative impact of the size of the MFI portfolio could be linked to a better knowledge of the borrowers of the behavior of the MFI.

Individual and household characteristics like sex, household size, dependency ratio have no significant impact on repayment performance which confirms the finding of Zeller (1998) that traditional bias against female or high family size are not justified. Contrary to the traditional belief, female borrowing (SEX) even had a positive impact on BRAC and BRDB reimbursement performance and on RTG3 for the whole sample. This could justify the preference given to women by the MFIs. However, the repayment performance is influenced by age, wealth²⁰ (wealth is proxied by the value of productive assets, PASSET, the log of per capita consumption, LNPCXA, and the use of specific garbage disposition, GARBAGE) and ability (proxied by the education level, YEDLEVEL). This general finding holds in the split sample regressions and in the estimation of the repayment probability, given a grace period of three months.

The share of the variance explained by our variables remains small which could advocate for missing variables. These variables might be community-specific variables like local economic conditions, degree of monetarization, collective shocks²¹ like exposure of the area to natural disasters (Zeller, 1998 ; Khandker, Khalily & Khan, 1994)... ; program-specific variables like functioning costs of the MFIs (Khandker, Khalily & Khan, 1994) or borrower-specific characteristics like idiosyncratic shocks (illness and injuries).

5.2. Is the fixation of loan size efficient?

¹⁹ The negative impact of the size of the loan portfolio can be related to significant negative impact of the age of the branch in Khandker, Khalily & Khan (1994).

²⁰ The variables for wealth did not prove any significance in the regression of RTG3.

²¹ Village fixed effects were not used because of too little loan observations per village.

Table 8 report the results of the simultaneous estimation of the size of the loan issued from the simultaneous regression of the principal and duration of the loan (step 4). We consider that MFIs give bigger loans for project they anticipate to be successful.

As duration in membership grows, MFIs tend to give larger loans to their more experienced borrowers and this corresponds to the use of dynamic incentives. However, as previously exposed, the age of the group has a negative impact on repayment performance. Groups made of borrowers of both sex received larger loans but the standard composition of groups is unisex. Group homogeneity in terms of age had a positive impact on loan size which could mean that MFIs consider group homogeneity as a specific factor influencing the repayment behavior.

Access to each of the non-financial services has a positive influence on the loan size, except for the BRDB. These services might indeed increase the borrowers' capabilities and thus increase their probability of success²² even if they proved mixed effect on the repayment performance.

The size of the group had a non linear impact. Small groups and big ones received smaller loans compared to medium size groups. The MFI may take into account the overcompensation of lack of insurance possibilities in smaller groups (the long term repayment performance is indeed smaller) on positive effect of peer monitoring (repayment at the due date is higher). As they received smaller loans, biggest groups are maybe expected to be too heterogeneous to exploit group dynamic efficiently (this is confirmed by the regression of RTG3).

The MFIs seem to screen borrowers with the time they have to wait before they receive a loan as the longer they wait, the smaller the loan they receive. This screening did not prove its effectiveness as the number of weeks the borrower had to wait before receiving his loan did not prove to have any effect on the repayment (contrary to what was found before instrumentation). The MFI attributes significantly smaller loans to borrowers who have to pay initial fees but these borrowers had a better repayment performance. This could be due either to an effective incitative power of initial fees or to an ineffective use of initial fees.

The size of the loan portfolio had a significant positive influence on the principal of the loan offered by the MFI which could be due to a higher accepted level of risk by the MFI. As previously seen this variable has a negative impact on repayment performance.

 $^{^{22}}$ The use of health, marketing, literature or professional training services might also be compulsory for big loans and the availability of these services could reflect the age of the branch which is positively correlated with the loan size.

Wealthy borrowers (wealth is proxied by log of per capita consumption, private access to electricity, use of toilets and the number of landed relatives) received bigger loans. Education level and age of the borrower had a positive effect on the loan size attributed by the MFI which makes sense but these two variables had a negative impact on the repayment. Other traditional factors like household size and the number of landed relatives are used in the MFI's determination of the size of the loan but with no effect on repayment performance. This leads us to think that the MFI should not take these variables into consideration when determining the loan size.

6. Conclusion.

The aim of this article was to test the explanatory power of models that attribute the performances of MFIs in terms of repayment rate to the use of group lending, social intermediation and dynamic incentives. Financial innovations showed mixed results in the determination of the repayment performance. The age of the group, a proxi for social ties inside the group, showed a significant negative impact on the reimbursement which raises the question of the necessity of specific incentives instruments for experienced borrowers. The social ties of the borrower out of his group have the expected positive impact as well as the proxy for dynamic incentives. In terms of sex, group homogeneity proved a positive impact to group homogeneity in terms of age or education level. Non-financial services did not show a positive impact in all the cases whereas MFIs tend to attribute bigger loans to borrowers who have access to these services. Negative impact of these non-financial services could be attributed to correlation with unobservable variables like the level of risk of the project of the borrower (for professional training) or idiosyncratic shocks (for the access to health).

The size of the group showed a non-linear effect revealing the conflict of the benefits of peer monitoring and these of insurance due to group. The development of insurance services could permit the exploitation of the full benefit of peer monitoring.

We also found that other loan characteristics like the purpose of the loan, the duration and the principal of the loan have to be taken as control variables for an effective analysis of determinants of the repayment performance.

²³ We didn't address the question of the predicted positive impact on repayment of group homogeneity in terms of risk as a result of peer selection (Ghatak, 1999). Nevertheless, both the study of Zeller (1998) and the study of Sharma and Zeller (1997) give evidence from Madagascar and Bangladesh that show that this kind of homogeneity has a negative impact on repayment performance.

We draw one's attention to the endogeneity of the principal and duration of the loan in the determination of the repayment performance and we advise the use of instrumental variables for future analysis of repayment rate.

Our estimation could underestimate the effects of the financial innovations as we can only estimate marginal effects as we do not have a control group and as each of the three studied MFIs use such financial innovations.

Further researches on the effective explanatory power of social ties are needed as empirical studies do not manage to prove any impact of social ties on repayment performance. Group homogeneity is a prerequisite in many MFIs and further researches must be undertaken to understand what type, if any, of group homogeneity positively influences the borrowers' reimbursement. The mixed impact of non-financial services and the difference amongst MFIs in their provision give rise to further studies on the provision (condition of attribution, level of quality,...) and impact of these services. In the same line, further information on the formation before loan and time borrowers have to wait before they receive their loan could provide interesting comments. Seasonality seems to affect the borrower and his/her vulnerability. Further researches on this point and on possibilities to use the harvest cycle to increase the repayment performance are thus necessary.

The above analysis gives however rise to comments on ways to improve the repayment performance by a more adequate loan provision.

MFIs should find new incentives for more experienced lending groups of borrowers.

As engagement in non agricultural activities as well as participating to a professional training has a negative impact on repayment performance, MFIs should devote a specific attention to the training of borrowers engaged in non agricultural projects.

MFIs could take advantage in paying attention to the way they grow: devote the same attention to borrowers along time, pay attention to keep credible the threat of dropping out bad borrowers and avoid giving significantly bigger loans as they extend their borrowers portfolio.

MFIs should avoid fixing the redemption date of the loan during the lean agricultural season.

MFIs should limit the use traditional variables like the education level, sex or size of the family into consideration when determining the loan size as those variables might have an unexpected effect and go contrary to traditional expectations on age, sex or education.

19

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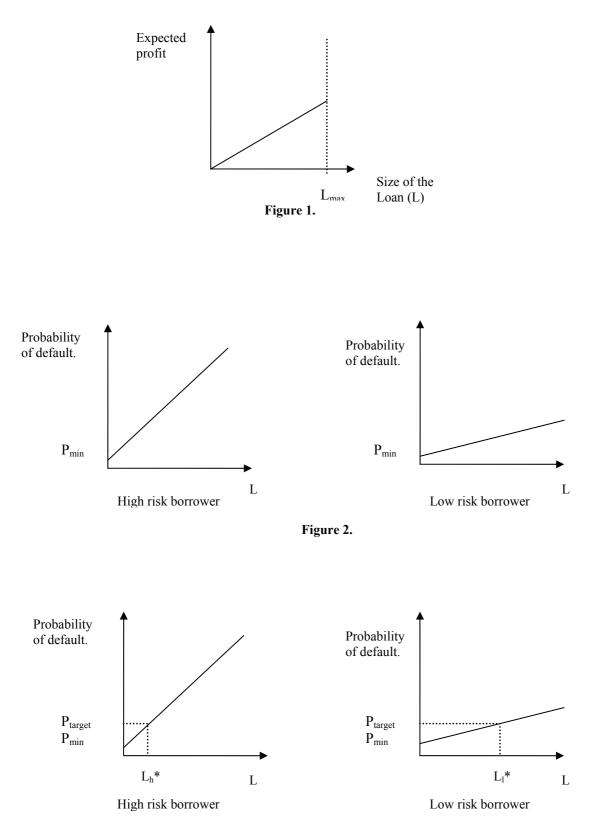


Figure 3: Optimal size of the loan.

Other credit providers :	
Government	2,8%
Krishi Bank	10,1%
Commercial Bank	10,4%
Cooperative	2,2%
Other NGO	7,3%
Relatives	32,9%
Friends and neighbor	21,4%
Shopkeeper	3,6%
Landlord	5,1%
Other	4,2%

Table 1.Other source of credit of borrowers.

Table 2.Different measures of the repayment rate.

Repayment rates	Whole MFI	BRAC	BRDB	GB	Other credit source
ROT	0,518	0,416	0,495	0,562	0,167
KÜI	(1638)	(364)	(321)	(971)	(126)
RTG3	0,792	0,717	0,653	0,865	0,405
KI05	(1537)	(311)	(291)	(935)	(74)
DTCC	0,871	0,807	0,776	0,920	0,470
RTG6	(1434)	(290)	(259)	(885)	(68)
RTG12	0,954	0,917	0,899	0,981	0,579
KIG12	(1337)	(264)	(238)	(835)	(57)

(The number of loan observations available for the calculation of the different repayment rate is given in parentheses.)

- ROT : Dummy = 1 if the borrower repaid his loan on time.
- RTG3 : Dummy = 1 if the borrower repaid his loan with arrears of less than three months.
- RTG3 : Dummy = 1 if the borrower repaid his loan with arrears of less than six months.
- RTG3 : Dummy = 1 if the borrower repaid his loan with arrears of less than twelve months.

	XX/L-L- M/ET		DDDD	CD
Consul observations of the loss	Whole MFI	BRAC	BRDB	GB
General characteristics of the loan.	2939.605	2519.773	2467.752	3316.096
Loan size (Taka) ²⁴	(1432.80)	(1400.59)	(1404.24)	(1349.08)
	400.888	477.582	391.338	370.326
Duration (days) ²⁵	(187.38)	(304.05)	(101.50)	(125.69)
1 , , , , , , , , , , , , , , , , , , ,	16.136	16.049	16.009	16.225
Interest rate ²⁶	(0.72)	(0.44)	(0.19)	(0.92)
Associated costs				· · ·
Required primary collateral:				
None	63,65%	57,53%	64,04%	66,23%
Signature or personnal guarantee	31,40%	35,46%	24,59%	32,28%
Credit group	4,91%	7,01%	11,14%	1,48%
Initial fees :				·
Dummy variable	0.705 (0.45)	0.8 (0.40)	0.967 (0.17)	0.559 (0.49)
Amount	6.774 (6.33)	8.328 (6.19)	12.058 (6.36)	3.975 (4.56)
% of loan size	0.003 (0.003)	0.004 (0.004)	0.005 (0.004)	0.001 (0.002)
Number of week before loan	9.548 (11.10)	18.846 (14.32)	14.5 (10.07)	3.337 (2.73)
Weeks of training before loan	2.743 (3.14)	2.711 (3.46)	0.627 (1.33)	3.605 (3.10)
and associated services.			× ,	
Access given to 1	0.252 (0.43)	0.253 (0.43)	0.420 (0.49)	0.184 (0.38)
2	0.259 (0.43)	0.317 (0.46)	0.051 (0.22)	0.315 (0.46)
3 non-financial services	0.472 (0.49)	0.420 (0.49)	0.513 (0.50)	0.479 (0.49)
Access given to basic literacy	0.677 (0.46)	0.567 (0.49)	0.481 (0.50)	0.805 (0.39)
Access given to professional training	0.280 (0.44)	0.327 (0.46)	0.727 (0.44)	0.080 (0.27)
Access given to health	0.695 (0.46)	0.663 (0.47)	0.327 (0.46)	0.856 (0.35)
Access given to marketing	0.279 (0.44)	0.068 (0.25)	0.202 (0.40)	0.404 (0.49)
Access given to other services	0.254 (0.43)	0.523 (0.49)	0.325 (0.46)	0.105 (0.30)
Other characteristics.	()			
Credit Rationing (dummy)	0.712 (0.45)	0.647 (0.47)	0.783 (0.41)	0.713 (0.45)
	657.121	565.414	573.809	731.406
Program saving	(927.90)	(415.05)	(467.78)	(1189.24)
Purpose of the loan:				
Agricultural	0.058 (0.23)	0.105 (0.30)	0.039 (0.19)	0.045 (0.20)
Personal	0.086 (0.28)	0.049 (0.21)	0.195 (0.39)	0.060 (0.23)
Related to dwelling expenses	0.011 (0.10)	0.039 (0.19)	0 (0)	0.002 (0.05)
Business	0.843 (0.36)	0.806 (0.39)	0.765 (0.42)	0.891 (0.31)
Seasonality (harvest)	0.211 (0.40)	0.214 (0.41)	0.220 (0.41)	0.206 (0.40)
Seasonality (end of the year)	0.232 (0.42)	0.276 (0.44)	0.146 (0.35)	0.246 (0.43)
Number of borrower of the year	169.529 (64.84)	122.760 (41.57)	148.502 (64.05)	198.876 (57.81)
Number of observations (available for the general characteristics of the loan/ available for the calculation of repayment rate)	1996/1963	485/481	430/429	1081/1073

Table 3. Descriptive statistics of the microcredit contract.

(Standard errors are given in parentheses).

²⁴ 43% (27% for the Grameen Bank, 56% for the BRAC and 67% for the BRDB) of the loans correspond to loan size of 1000 to 2000 taka. ²⁵ 72% of the loans have a duration of 350 to 370 days.

²⁶ The interest rate is the same for the three MFI : 16%, 20% after 1991 for the BRAC and the Grameen Bank due to an increase in bank employee payment.

Table 4.The loan contract of other credit providers.

	Other credi	t providers
General characteristics of the loan.		
Loan size (Taka)	5753.853	(17961.54)
Duration (days)	356.142	(350.45)
Interest rate (%)	36.254	(53.64)
Associated costs		
Required primary collateral:		
None	51,	56%
Signature or personnal guarantee	17,	85%
Credit group	1,7	0%
Initial fees (dummy)	0.150	(0.35)
Amount	14.900	(74.22)
% of loan size	0.004	(0.02)
Other characteristics		
Credit Rationing (dummy)	0.308	(0.46)
Purpose of the loan :		
Agricultural	0.382	(0.48)
Personal	0.331	(0.47)
Related to dwelling expenses	0.050	(0.22)
Business	0.235	(0.42)
Seasonality (harvest)	0.104	(0.30)
Seasonality (end of the year)	0.118	(0.32)
Number of observations	353	/203

(Standard errors are given in parentheses).

Table 5.Descriptive statistics of the borrower and his group.

	Whole MFI	BRAC	BRDB	GB
Characteristics of the borrower.				
Sex (dummy : 1 if male, 2 if female)	1.660 (0.47)	1.7216 (0.44)	1.380 (0.48)	1.744 (0.43)
Household head or spouse	0.890 (0.31)	0.863 (0.34)	0.923 (0.26)	0.889 (0.31)
Education level	1.635 (2.72)	1.397 (2.67)	2.446 (3.44)	1.419 (2.33)
Age of the borrower (in months)	389.593 (122.89)	398.847 (134.33)	396.958 (123.26)	382.506 (116.89)
Marital status (dummy : 1 if married)	0.881 (0.32)	0.826 (0.37)	0.906 (0.29)	0.896 (0.30)
Self Employement in agriculture	0.711 (0.45)	0.630 (0.48)	0.741 (0.43)	0.736 (0.44)
Self Employement in othe activities	0.640 (0.47)	0.552 (0.49)	0.611 (0.48)	0.691 (0.46)
Employement in agriculture	0.136 (0.34)	0.092 (0.290)	.2139535 .4105721	0.124 (0.33)
Employement in other activities	0.107 (0.30)	0.109 (0.31)	0.169 (0.37)	0.081 (0.27)
Spouse lives in the same house	0.865 (0.34)	0.826 (0.37)	0.902 (0.29)	0.868 (0.33)
Number of month lived elsewhere	0.083 (0.60)	0.136 (0.87)	0.141 (0.76)	0.037 (0.30)
Characteristics of his/her household				
Value of productive assets (taka)	39057.34	38612.37	38042.23	39660.76
	(63303.87)	(66703.68)	(55566.03)	(64662.34)
Transfers received	0.051 (0.22)	0.045 (0.20)	0.076 (0.266)	0.043 (0.20)
Household size	5.464 (1.99)	5.523 (2.22)	5.344 (1.83)	5.486 (1.95)
Average age of the household	22.265 (7.23)	22.581 (7.90)	21.630 (7.56)	22.375 (6.76)
Number of landed relatives	3.665 (4.22)	2.828 (3.68)	3.255 (3.39)	4.204 (4.65)
Log of per capita consumption	4.278 (0.34)	4.307 (0.39)	4.281 (0.33)	4.264 (0.32)
Use of garbage equipment	0.881 (0.32)	0.820 (0.38)	0.865 (0.34)	0.914 (0.27)
Private access to electricity	0.062 (0.24)	0.092 (0.29)	0.093 (0.29)	0.036 (0.18)
Characteristics of the group				
Age of the group (years)	3.991 (2.00)	3.866 (1.88)	3.080 (1.99)	4.413 (1.93)
Group size (person)	30.937 (15.28)	49.087 (16.15)	21.329 (8.54)	26.545 (8.92)
Group size 1 :<=10	0.0854 (0.27)	0.006 (0.07)	0.143 (0.351)	0.098 (0.29)
Group size 2 :>10 & <=15	0.045 (0.20)	0.008 (0.09)	0.081 (0.27)	0.048 (0.21)
Group size 3 :>15 & <=30	0.571 (0.49)	0.169 (0.37)	0.654 (0.47)	0.719 (0.44)
Group size 4 :>30 & <=50	0.177 (0.38)	0.391 (0.48)	0.106 (0.30)	0.109 (0.31)
Group size 5 :>50 & <=81	0.119 (0.32)	0.424 (0.49)	0.013 (0.11)	0.024 (0.15)
same sex	0.932 (0.25)	0.925 (0.26)	0.832 (0.37)	0.975 (0.15)
same education level	0.578 (0.49)	0.595 (0.49)	0.367 (0.48)	0.654 (0.47)
same age	0.394 (0.48)	0.371 (0.48)	0.295 (0.45)	0.444 (0.49)

(Standard errors are given in parentheses).

		Predicted impact on repayment	ROT IV Coef.	P>z	ROT with Coef.	out IV P>z		RTG3 IV Coef.	P>z	RTG3 without IV Coef.	P>z
										Std.	
~	agegp	+	-0,142**	0.007	-0,007	0.735	agegp	-0,100**	0.039	0,011	0.672
Social Ties	scohab	-	-0,313**	0.004	-0,225**	0.036	scohab	-0,104	0.403	-0,038	0.757
	rese	-	-0,066	0.336	-0,067	0.297	rese	-0,094	0.208	-0,087	0.233
Group	samesex	+	0,327	0.223	-0,025	0.871	samesex	0,726**	0.004	0,460**	0.007
Homogeneity	sameedu	+	-0,033	0.686	-0,062	0.425	sameedu	-0,189**	0.048	-0,203**	0.030
	sameage	+	0,078	0.332	0,130*	0.083	sameage	0,029	0.752	0,076	0.398
	facl	+	0,076	0.479	0,144	0.111	facl	0,249**	0.027	0,284**	0.006
Social	fact	+	-0,233	0.124	,	0.398	fact	-0,285*	0.061	-0,178	0.147
Intermediation	fach	+	-0,173*	0.099	/	0.638	fach	-0,161	0.175	0,019	0.865
	facm	+	0,171	0.148	0,331**	0.001	facm	-0,093	0.492	0,023	0.855
Dynamic Incentives	CRd	+	-0,182**	0.042		0.347	CRd	-0,247**	0.017	-0,151	0.126
	nmbg1		1,112***	0.000	0,389**	0.009	nmbg1	0,193	0.416	-0,390**	0.022
Group Size	nmbg2		-0,306	0.109	-0,181	0.339	nmbg2	-0,028	0.895	0,091	0.672
Group Size	nmbg4		0,571***	0.000	0,082	0.479	nmbg4	0,449**	0.005	0,045	0.737
	nmbg5		-0,153	0.414	0,374**	0.033	nmbg5	-0,114	0.598	0,384*	0.060
	BRAC		-0,247	0.181	-0,801***	0.000	BRAC	-0,615**	0.003	-1,169***	0.000
	BRDB		-0,217	0.190	-0,411**	0.010	BRDB	-0,636**	0.001	-0,844***	0.000
	Pprin		0,001**	0.007	0,000***	0.000	Pprinrg3	0,001**	0.012	0,000***	0.000
	Pduration		-0,007***	0.000	0,002***	0.000	Pdurationrg3	-0,006***	0.000	0,001**	0.006
	fee		1,086***	0.000	0,549***	0.000	fee	0,447**	0.005	0,026	0.834
Characteristics	pgsaving		0,000**	0.028	0,000	0.440	pgsaving	0,000	0.244	0,000***	0.000
of the loan	pgwbl		0,005	0.477	-0,013**	0.002	pgwbl	0,011*	0.079	-0,003	0.466
	purpa		0,427**	0.006	0,159	0.280	pgwt	-0,015	0.321	-0,017	0.237
	purpp		0,654***	0.000	/	0.566	purpa	0,041	0.811	-0,205	0.214
	harvest		0,296**	0.001	0,157*	0.074	purpp	0,457**	0.013	-0,023	0.880
	endy		0,319**	0.001	0,304**	0.001	harvest	0,301**	0.004	0,168	0.107
	NBYt		-0,012***	0.000	-0,003***	0.000	endy	0,122	0.255	0,114	0.273
	sex		-0,162	0.113	-0,082	0.416	NBYt	-0,012***	0.000	-0,004***	0.000
	yedlevel		-0,037*	0.070	-0,014	0.373	sex	-0,287**	0.013	-0,208*	0.071
Characteristics	ageb		-0,002***	0.000	0,000	0.101	yedlevel	-0,046**	0.027	-0,029*	0.098
of the	selfEagr		0,038	0.672	0,095	0.291	ageb	-0,002***	0.000	-0,001**	0.014
individual	selfEo		-0,303**	0.001	-0,008	0.922	selfEagr	0,257**	0.014	0,316**	0.003
	Eagr		0,054	0.693	-0,121	0.305	selfEo	-0,127	0.210	0,143	0.120
	Eo		-0,473**		0,039	0.739	Eagr	-0,001	0.996	-0,145	0.287
	Passet		0,000**	0.001	0,000**	0.001	Eo	-0,311*	0.062	0,133	0.339
<i>.</i>	transferr		0,355*		0,227	0.187	Passet	0,000	0.693	0,000	0.771
<i>Characteristics</i>	hhsize		-0,017		0,019	0.357	transferr	0,185	0.389	0,063	0.764
of the	Rownl		0,005		0,034**	0.001	hhsize	0,014	0.621	0,043*	0.069
houshold	lnpcxa		-0,349**		-0,071	0.540	Rownl	-0,009	0.486	0,017	0.143
	garbage		0,511***		0,336**	0.004	lnpcxa	-0,113	0.504	0,135	0.337
			<i>´</i>		,		garbage	0,233*	0.094	0,079	0.554
	_cons		3,363***	0.000	0,210	0.758	_cons	3,162***	0.094	0,472	0.559
	Log		-923,02		-908,47		Log	-644.7		-639.52	
	likelihood		16.48%		17.8%		likelihood	15.53%		16.20%	
	PseudoR2		1597		1597		Pseudo R2	1507		1507	
	Ν						N				

Table 6.Determinants of the repayment performance, whole sample.

	BRAC IV	Coef.	P>z	BRDB IV	Coef.	P>z	GB IV	Coef.	P>z
	agegp	-0,139**	0.022	agegp	-0,498***	0.000	agegp	-0,162**	0.015
Social ties	scohab	-0,436*	0.083	scohab	0,021	0.950	scohab	0,043	0.793
	rese	-0,019	0.894	rese	-0,033	0.798	rese	0,130	0.579
C	samesex	0,272	0.459	samesex	0,899**	0.005	samesex	-0,884	0.122
Group Homogeneity	sameedu	-0,010	0.956	sameedu	-1,050***	0.000	sameedu	0,056	0.646
nomogeneuy	sameage	-0,148	0.440	sameage	-0,457*	0.054	sameage	0,403***	0.000
	facl	0,211	0.345	facl	0,314	0.272	facl	-0,484**	0.010
Social	fact	-0,151	0.642	fact	-0,780**	0.005	fact	-0,148	0.537
Intermediation	fach	0,394*	0.058	fach	-1,370***	0.000	fach	0,473**	0.010
	facm	-1,307**	0.003	facm	-0,243	0.456	facm	-0,011	0.953
Dynamic Incentives	CRd	0,260	0.211	CRd	1,111***	0.004	CRd	0,307**	0.020
	nmbg2	0,776	0.416	nmbg1	-2,653***	0.000	nmbg1	1,677**	0.002
Group Size	nmbg4	0,140	0.640	nmbg2	0,844*	0.095	nmbg2	-0,373	0.227
	nmbg5	0,511*	0.080	nmbg4	-1,807**	0.003	nmbg4	-0,967**	0.009
	Pprin1	0,000	0.101	Pprin2	0,003***	0.000	nmbg5	0,745	0.388
	Pduration1	0,005***	0.000	Pduration2	-0,002*	0.088	Pprin3	0,001*	0.083
	fee	0,196	0.485	fee	2,643**	0.021	Pduration3	0,030***	0.000
	pgsaving	0,000	0.881	pgsaving	-0,001**	0.002	fee	0,851**	0.003
	pgwt	0,013	0.647	pgwbl	0,012	0.376	pgsaving	0,000***	0.000
of the loan	purpa	-0,483	0.101	pgwt	-0,112	0.215	pgwbl	0,063**	0.003
	purpp	-0,462	0.280	purpa	-1,343*	0.057	pgwt	0,027	0.147
	harvest	0,166	0.427	purpp	0,666**	0.016	purpa	1,053***	0.000
	endy	0,427**	0.029	harvest	1,933***	0.000	purpp	0,958***	0.000
	NBYt	-0,013***	0.000	endy	-0,140	0.667	harvest	-0,088	0.509
	sex	-0,432*	0.086	NBYt	-0,013***	0.000	endy	-0,444**	0.003
	yedlevel	-0,067	0.163	sex	-1,829***	0.000	NBYt	-0,010**	0.003
Characteristics	ageb	-0,001	0.162	yedlevel	-0,031	0.338	sex	0,101	0.528
of the	selfEagr	0,081	0.720	ageb	-0,003**	0.003	yedlevel	-0,011	0.696
individual	selfEo	0,102	0.608	selfEagr	-0,891**	0.005	ageb	0,002**	0.004
	Eagr	-0,184	0.632	selfEo	-0,291	0.242	selfEagr	0,239*	0.065
	Eo	-0,158	0.594	Eagr	1,228**	0.003	selfEo	0,284**	0.036
	Passet	0,000*	0.083		-1,207**	0.002	Eagr	-0,078	0.666
	transferr	0,056	0.886		0,000*	0.056		-1,064***	0.000
Characteristics	hhsize	-0,066	0.165	transferr	0,315	0.453	Passet	0,000**	0.009
of the	Rownl	0,050*	0.084	hhsize	0,086	0.237	transferr	0,512*	0.081
houshold	lnpcxa	-0,167	0.544	Rownl	0,016	0.628	hhsize	-0,039	0.179
	garbage	-0,197	0.476	lnpcxa	0,542	0.146	Rownl	0,052**	0.001
	electricity	-0,686*	0.052	garbage	0,951**	0.006	lnpcxa	-0,202	0.264
	_cons	-1,315	0.387	_cons	-9,959**	0.001	garbage cons	-0,313 -9,620***	0.132 0.000
	Log			Log			Log		
	likelihood	-181,86		likelihood	-153,65		likelihood	-472,02	
	Pseudo R2	20.64%		Pseudo R2	28.95%		Pseudo R2	26.97%	
	N	336		N	312		N	945	

Table 7.Determinants of the repayment performance, split sample.

Table 8.Determinants of the principal.

P_Whole	Coef.	P>z	P_BRAC	Coef.	P>z	P_BRDB	Coef.	P>z	P_GB	Coef.	P>z
agegp	138,478***	0.000	agegp	104,572**	0.006	agegp	115,465***	0.000	agegp	192,582***	0.000
scohab	54,421	0.544	scohab	141,490	0.448	scohab	44,194	0.823		184,437*	0.094
rese	-51,466	0.262	rese	-130,710*	0.064	rese	-45,993	0.472	rese	565,518***	0.000
samesex	-530,354***	0.000	samesex	338,872	0.215	samesex	-188,969	0.270	samesex	-848,886**	0.005
sameedu	1,504	0.982	sameedu	217,884	0.105	sameedu	-79,614	0.532	sameedu	-58,204	0.480
sameage	133,976**	0.033	sameage	322,789**	0.017	sameage	220,110*	0.072	sameage	45,358	0.544
facl	322,294***	0.000	facl	296,896**	0.050	facl	-289,684**	0.044	facl	192,197*	0.086
fact	280,346**	0.001	fact	245,371	0.217	fact	84,460	0.547	fact	371,468**	0.008
fach	267,912**	0.001	fach	-77,748	0.595	fach	266,155	0.129	fach	249,680**	0.039
facm	-3,084	0.971	facm	-49,978	0.863	facm	-13,420	0.945	facm	79,611	0.488
nmbg1	-336,837**	0.021	nmbgl	(dropped)		nmbg1	779,177**	0.004	nmbgl	-1570,988***	0.000
nmbg2	41,780	0.825	nmbg2	1,167	0.999	nmbg2	247,819	0.381	nmbg2	-327,575	0.221
nmbg4	-208,729**	0.023	nmbg4	-535,269**	0.014	nmbg4	620,172**	0.001	nmbg4	-638,440***	0.000
nmbg5	68,246	0.636	nmbg5	-206,623	0.330	nmbg5	(dropped)		nmbg5	-620,094	0.218
BRAC	185,875	0.190	fee	-575,446**	0.002	fee	-191,466	0.542	fee	-717,815***	0.000
BRDB	-3,677	0.978	pgsaving	0,970***	0.000	pgsaving	0,466***	0.000	pgsaving	0,031	0.475
fee	-385,252***	0.000		-12,627**	0.019	pgwbl	-0,132	0.985		-188,969	0.280
pgsaving	0,173***	0.000	purpa	428,437**	0.036	purpa	748,516**	0.012	purpp	-382,120**	0.007
pgwbl	-14,541***	0.000	purpp	-513,346*	0.097	purpp	-160,779	0.286	harvest	-282,064**	0.003
purpa	276,862**	0.030	harvest	-165,729	0.275	harvest	-134,669	0.328	endy	22,361	0.797
purpp	-412,710***	0.000	endy	197,002	0.182	endy	371,187**	0.015	NBYt	10,886***	0.000
harvest	-151,842**	0.044	NBYt	9,747***	0.000	NBYt	1,867**	0.044	sex	-285,485**	0.011
endy	104,613	0.152	sex	107,187	0.606	sex	304,394**	0.045	yedlevel	24,410	0.163
NBYt	7,327***	0.000	yedlevel	67,519**	0.016	yedlevel	0,384	0.985	ageb	0,897**	0.010
sex	-7,981	0.926	ageb	0,808	0.105	ageb	0,548	0.241	selfEagr	113,233	0.229
yedlevel	26,696**	0.031	selfEagr	86,766	0.563	selfEagr	219,504	0.121	selfEo	168,554*	0.058
ageb	0,931***	0.000	selfEo	-86,394	0.542	selfEo	213,551*	0.089		234,064	0.123
selfEagr	137,960*	0.063	Eagr	166,659	0.533	Eagr	-379,217**	0.018		213,957	0.166
selfEo	170,264**	0.011	Eo	51,046	0.800	Eo	361,705**	0.021	Passet	0,000	0.843
Eagr	-52,286	0.623	Passet	-0,002	0.155	Passet	0,001	0.315	transferr	148,655	0.389
Eo	365,468***	0.000	transferr	25,786	0.945	transferr	-105,794	0.644		6,735	0.746
Passet	0,000	0.794	hhsize	31,845	0.377	hhsize	8,575	0.814	Rownl	35,490***	0.000
transferr	-84,152	0.548	Rownl	12,434		Rownl	-15,011		lnpcxa	97,823	0.467
hhsize	31,934*		lnpcxa	385,220**		lnpcxa	-23,103		garbage	615,521***	0.000
Rownl	27,815***		garbage	-397,439**	0.021	garbage	-138,645	0.427		514,401**	0.015
lnpcxa	177,359*	0.079	electricity	106,107	0.587	electricity	289,461	0.169	cons	-1097,072	0.168
garbage	-3,803	0.968	cons	-1347,346	0.241	cons	1585,843	0.161	_	,	
electricity	373,848**	0.003	-	<i>,</i>			~				
cons	-329,935	0.568									
Pseudo	•		Pseudo	10 070/		Pseudo	20 (10/		Pseudo	19 650/	
R2	36.49% 1387		R2	40.87% 307		R2	38.64% 330		R2	48.65% 750	
Ν	130/		N	507		Ν	330		Ν	750	

Table 9.Dictionary of the variables used in the regression.

ageb agegp BRAC BRDB CRd duration	Age of the borrower. Age of the lending group in years. Dummy: 1 if the loan program is the BRAC. Dummy: 1 if the loan program is the BRDB. Dummy: 1 if the borrower feels credit rationed (would like to borrow more at the same interest rate).
BRAC BRDB CRd	Dummy: 1 if the loan program is the BRAC. Dummy: 1 if the loan program is the BRDB. Dummy: 1 if the borrower feels credit rationed (would like to borrow more at the same interest rate).
BRAC BRDB CRd	Dummy: 1 if the loan program is the BRDB. Dummy: 1 if the borrower feels credit rationed (would like to borrow more at the same interest rate).
CRd	Dummy: 1 if the borrower feels credit rationed (would like to borrow more at the same interest rate).
	Dummy: 1 if the borrower feels credit rationed (would like to borrow more at the same interest rate).
duration	
uuration	Duration of the loan.
Eagr	Dummy: 1 if the borrower received income from employment in agricultural activities.
electricity	Dummy: 1 if the household has private access to electricity.
endy	Dummy: 1 if the loan had to be finished paid back during the end of the year.
Eo	Dummy: 1 if the borrower received income from employment in other activities.
fach	Dummy: 1 if the borrower had access to health services.
facl	Dummy: 1 if the borrower had access to basic literacy services.
facm	Dummy: 1 if the borrower had access to marketing services.
fact	Dummy: 1 if the borrower had access to professional training.
fee	Dummy: 1 if the borrower had to pay initial fees.
garbage	Dummy:1 if the household use specific garbage disposition.
harvest	Dummy: 1 if the loan had to be finished paid back during the month of harvest.
hhsize	Number of members in the household.
Inpexa	Log of per capita consumption.
NBYt	Number of borrowers of the MFI of the borrower at the year the borrower received his/her loan ²⁷ .
nmbg1	Dummy: 1 if the size of the borrower's lending group is inferior or equal to 10 persons.
nmbg2	Dummy: 1 if >10 & \leq =15
nmbg4	Dummy: 1 if $>30 \& <=50$
nmbg5	Dummy: 1 if >50
Passet	Value of productive assets.
pgsaving	Value of program savings.
pgwbl	Number of weeks the borrower had to wait before he received his loan.
pgwt	Number of training weeks before the borrower received his loan.
Prin ²⁸	Principal of the loan.
purpa	Dummy: 1 if the purpose of the loan is agricultural.
purpp	Dummy: 1 if the purpose of the loan is personal.
purpw	Dummy: 1 if the purpose of the loan is related to dwelling expenses.
rese	Number of months the borrower lived elsewhere.
Rownl	Number of landed relatives.
sameage	Dummy: 1 if the borrower and the group leader have the same age (more or less 5 years).
sameedu	Dummy: 1 if the borrower and the group leader have the same education level (more or less two years).
samesex	Dummy: 1 if the borrower and the group leader have the same sex.
scohab	Dummy: 1 if the spouse of the borrower lives in the same place.
selfEagr	Dummy: 1 if the borrower received income from agricultural self-employment.
selfEo	Dummy: 1 if the borrower received income from other activities self-employment.
sex	Dummy: 1 if male, 0 if female.
transferr	Dummy: 1 if the household of the borrower received transfers.
vedlevel	Education level in years.

²⁷ The growth of the loan portfolio in the sample was similar to the effective growth of the portfolio of the MFI. The annual growth rate of the loan portfolio for the Grameen Bank was of 32.73% between 1986 and 1991 in our sample compared to 37.8% according to calculation based on information in Khandker, Khalily and Khan, 1995.

²⁸ Respectively Prin (predicted principal with instrumental variables for the whole sample), Pprin1 (id for the BRAC), Pprin2 (id for the BRDB), Pprin3 (id for the Grameen Bank), Pprinrg3 (id for the whole sample but when rtg3 is the dependent variable).