Rosca Participation in Benin: a Commitment issue

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Abstract

In the light of first-hand data from a Beninese urban household survey in Cotonou, we investigate several motives aiming to explain participation in Rotating Savings and Credit ASsociations. We provide anecdotal pieces of evidence, descriptive statistics, FIML regressions and matching estimates which tend to indicate that most individuals use their participation in a rosca as a device to commit themselves to save money and to deal with self-control problems.

JEL-Classification: G2, O16, O17

Key-words: ROSCA, self-control, commitment device, Benin

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1 Introduction

As put and emphasized by Rutherford (2000), the poor need, can and want to save and although often understated, savings should play an important part in the elaboration of strategies aiming at poverty alleviation. Therefore understanding through what means the poor manage to save and what motivates them to do so can have important policy implications. This research aims at enhancing our knowledge of one of the most pervasive savings vehicles in the developing world. Indeed, numerous studies underline the importance of rotating savings and credit associations (roscas) in developing countries where, they channel a considerable part of individuals' savings (see Bouman, 1995).

A basic description of these associations can be given as follows: A group of individuals gather on a regular basis for a cycle of meetings. At each meeting, all members contribute a fixed amount of money to a common pot allocated to one of them. The latter is then excluded from the reception of the pot in subsequent meetings but is still obliged to put in her contributions up until the end of the cycle. This process repeats itself until each member has received the pot, marking the end of a cycle. The rosca may then renew another cycle or choose to break up. Except for this basic principle, groups vary widely in terms of amount of contributions, number of members, frequency of meetings and functioning. The pot can be attributed either according to a random process (*random roscas*), based upon a decision imposed by the governing body of the group (*decision roscas*) or through a bidding process (*bidding roscas*).

Rosca members are mostly poor individuals who have little access to formal savings and credit markets because of high transaction costs and incomplete markets.¹ In the literature, roscas are usually regarded as a means for poor people to save money in order to make an indivisible expense (Handa and Kirton (1999) and van den Brink and Chavas (1997)). However, roscas present certain drawbacks: they do not provide interest on the money contributed. Moreover, participants are subject to other members defaulting and enjoy less flexibility than when saving on their own. Despite these flaws, these groups are very popular in developing countries which produces evidence of it being beneficial to their members. This raises the question as to *why individuals would decide to join a rosca instead of saving on their own*.

¹Conditions for opening an account in any public or private bank of Cotonou - such as fixed guarantee deposit, possession of an identity card (the costs of which are prohibitive) and literacy skills - all act as strong deterrents against the poor.

This important matter has brought about various answers in the literature. In the light of our evidence it appears that, in Cotonou, the main reason for enrolling in a rosca is the need to commit due to self-control problems. If people have present-biased preferences or suffer from short-term temptations and are aware of their consequences, it is likely they will prefer to limit the set of options available to them. This rationale was proposed by Aliber (2001) and Gugerty (2007) who indicate that in the absence of alternative commitment saving strategies, people mindful of their time-inconsistency problem, would turn to roscas.

Our paper contributes to the literature in several ways. First, it documents that Beninese spouses evolve in a non-cooperative framework and that, as a consequence, the decisions to join and how much to contribute to a rosca are individual. This, along with other econometric results, enables us to discard the intra-household commitment motive and to put forward the self-control commitment rationale for rosca participation in Benin. Finally, we provide original findings from an indirect test on the hypothesis of commitment against selfcontrol problems, using matching estimates of the average effect of rosca participation on savings and non-essential (frivolous) expenditures.

In the following section, we lay out field evidence that describes how husband and wife interact with each other and the survey on which our analysis is based. Next, Section 3 investigates the commitment issue, Section 4 presents our hypotheses and Section 5 deals with empirical estimates to support them. Before concluding in Section 7, we review in Section 6 some reasons for participation, previously given in the literature and other explanations compatible with our econometric results.

2 Field Evidence and Data

Several informal meetings with locals, carried out during our survey, showed us that, regarding money matters, secrecy is the rule between spouses. Partners do not pool income, have independent financial spheres and contribute to household public goods following social norms which allocate budget items within the household according to gender. LeMay-Boucher and Dagnelie (2009) substantiate this characteristic of Beninese couples and provide an empirical analysis of the determinants of spouses' patterns of consumption using the same sample. This feature grants Beninese spouses latitude in managing personal income and enables them to retain control over their personal expenditures. In order to take account of the fact that a household is a collection of separate and individual economies, we had to survey husbands, wives and all other adult members of a household separately and in private so as to ensure confidentiality.

Our data gathering took place in 2004 in three survey areas located on the outskirts of Cotonou (a city of about 1.1 million inhabitants): Vossa, Enagnon and Enagnon-plage known to be the poorest of the city. No formal savings and investment institutions, whether public or private, such as banks and NGOs were present in these three zones. 497 households were randomly selected to be part of our survey: 110 in Vossa, 273 in Enagnon and 114 in Enagnon-plage. Enumerators were required to collect data on each and every household member older than fifteen, not only regarding their socio-economic status but also on the roscas in which all the adult household members were active. Since all the households were randomly selected, the selection process of roscas included in this analysis is also random.

All 497 households we surveyed represent 2083 individuals of which 894 are aged less than sixteen. Our sample thus includes information at the individual level for 1179 adults, divided into 604 women and 575 men. We show in Table 1 relevant statistics according to gender and participation status and use these variables in our econometric analysis. Women appear to be less educated than men since a significantly smaller proportion of them has got a primary degree. A larger percentage of males is salaried, this remaining true whatever the participation status. Differences in monthly income show that rosca members are significantly richer than non-members. It also seems that rosca members have more dependents than non-members.

3 Commitment Devices

Recent studies emphasize that roscas can be used as a commitment device against two categories of potential risks. Agents could be willing to secure their income against internal threats such as temptations and present-biased preferences. Alternatively, individuals could join roscas to protect themselves against external threats such as pressure from their spouse. Our analysis aims at disentangling one from the other.

3.1 Commitment Device Against Self-control Problems

Two different economic theories suggest that agents might prefer to commit themselves and limit the set of options available to them. According to the temptation theories, agents undergoing short-term temptations in conflict with their long run self-interest would be 'unambiguously better off when ex ante undesirable temptations are no longer available' (Gul and Pesendorfer, 2001, p.1406). In this case, the preference for commitment stems from a desire to avoid temptation rather than a change in preferences.

The second approach, see among others Laibson (1997), departs from the dynamic consistent preferences hypothesis and corresponds to higher discount factors for earlier than for future periods. Psychological experiments reveal that people are inclined to have present-biased preferences and discount time at a non-constant rate - higher in the very short than in the longer term. An individual exhibiting such time inconsistency problems as well as being sophisticated - aware of the problem and its consequences - would prefer to commit herself by restricting the set of choices available to her future selves.

Even if the underlying motives are slightly different according to each of the two theories presented above, their implications appear to be similar in terms of rosca participation. Roscas indeed show signs of responding to a need of commitment against one's time-inconsistent preferences and temptations. According to Gugerty (2007), in the absence of alternative commitment savings strategies, sophisticated people experiencing self-control problems turn to roscas since they would indefinitely renegotiate with themselves if attempting to save money on their own. Ashraf et al. (2006) use empirical evidence from a randomized experiment in the Philippines to highlight that women with time-inconsistent preferences value commitment savings devices and roscas.

Besides rendering the current savings illiquid and secure, roscas restrict the set of future options as long as the end of the cycle is not reached, compelling the individual to go on saving. Our data do not allow us to identify whether individuals in our sample manifest time inconsistency. Hence, we cannot formally test the hypothesis according to which hyperbolic discounters are more likely to join roscas. However, matching estimates of expenditures made on goods which generate temptations, presented in section 5.2, allow us to indirectly test this hypothesis. Moreover, our empirical evidence suggests that the need of commitment device is a major motive for membership. Indeed, 89% of the rosca members' responses (198 out of 222) were that they enlisted in order to discipline themselves to save. 'Discipline' or 'the willingness to bring themselves to

save' being by far the most frequent answers suggests that a vast majority of members use the rosca as a means to commit themselves to save.

This is further substantiated by the fact that the end of the cycle is the favoured moment for pot reception of 60% of rosca members.² 78% of the latter value this reception timing since it enables them to avoid any sense of debt towards the group, see Aliber (2001). This aversion to debt reinforces the inciting and disciplining role of the group, exerted through peer pressure. An early reception of the pot exposes the individual to the risk of a negative shock throughout the cycle which might prevent her from paying back her 'loan'. Moreover, considering that sanctions in case of default are more severe after pot reception, a preference for late reception may simply be due to the agent's risk aversion towards her own default and not the need for commitment device. In this respect, we would expect the salaried individuals of our sample, who receive a regular and certain income, to be less risk-averse than the self-employed. We find, however, that both types of agents have similar preferences regarding the timing of pot reception. Furthermore, among the people favouring an early pot reception, the most regularly given use for the savings is 'small business' investment (46%), which is the only risk-bearing pot use. Although these pieces of evidence give more credit to the commitment story, we believe that both reasons are likely to be intertwined. Informal interviews reveal that apart from minimizing the threat of sanctions, receiving the pot at the end of a cycle provides in itself additional motivation to make payments and successfully complete a cycle.

Fear of sanctions and credibility of threats are important factors influencing preferences on the timing of pot reception³ and are key elements for making roscas a good commitment device. Should members attach too much value to potential sanctions, they would leave the group and try saving on their own, this in turn leading to high turnovers. We observe, however, that the average membership duration of those favouring an early pot is 47 months while only 4.4% claimed that they joined the group for a fixed number of cycles (the vast majority not knowing how long they were to stay members for). All this tends to demonstrate that for a substantial number of individuals, benefits resulting from an early pot reception are outweighed by a mix of risk and debt aversions and the need for commitment.

²This preference is not correlated to the duration of the group membership and therefore unlikely to be related to any learning effect.

³Multinomial logit regressions show that severe sanctions (eg: seizure, police) and a gradation of sanctions with respect to the pot reception, increase the probability of preferring the end of the cycle.

3.2 Commitment Device Within The Household

Anderson and Baland (2002) present a model of intra-household conflicts in consumption decisions. In their cooperative bargaining framework, men and women sharing a common budget, exhibit asymmetric preferences for household goods. Those asymmetries drive their model of intra-household conflict over an indivisible good: women have always a larger preference for the indivisible good and therefore want to save at a higher rate than men. In Kenya, members being of an overwhelming majority female would join a rosca in order to hide or secure their savings from their husband. They could then buy an indivisible good whereas men would rather opt for present consumption. By joining a rosca, women thus commit part of the household's income against the husband's preferences.

This, however, does not seem to comply with the evidence we collected in Benin. Our dataset exhibits that women seem to participate less in roscas than men: while they represent 51% of all adults, women form a minority (45%) of all rosca members. According to our sample, 15% of the women in Cotonou take part in roscas. This increases to 21% if they are in couple and 22% if they have a job - 24% if the two are combined. In comparison, 19% of the men are members of such groups, 32% if in couple and 31% if working - 35% if both. Moreover, group composition is not biased towards women: 18% of all roscas surveyed were exclusively composed of women while 26% solely of men. As for the remaining groups, 63% have a majority of male members. In addition, roscas are not primarily oriented towards women's needs. We met no group displaying clear primary objectives such as assisting women, or empowering them in their interactions with their husbands. Thus, gender does not appear to be an important variable in the explaining of rosca participation. Furthermore, given the Beninese household structure where spouses do not make consumption and savings decisions on a common budget, this rationale seems even less likely to apply in our case. We provide further empirical evidence on these two points in Section 5.

Besides, were roscas used as a means to put money out of the husband's reach, membership would have to be kept secret from him.⁴ However, 40% of

⁴It can be argued that once a member rosca, the wife could use the threat of social sanctions to convince her husband to let her continue participating. However, this reasoning is valid only in the course of one cycle. Once it is completed, one can freely choose to exit from the group, which is commonly accepted. A recalcitrant husband could easily pressure his wife to leave the group at the end of a cycle without incurring social sanctions. Nevertheless, reasons provided

the groups in our sample that allow female membership, impose spouse's approval for new members. Moreover, among the 56% of groups sharing the financial leftovers, a majority advertise their group by organising yearly celebrations involving dances and folklore to which friends and neighbours are invited.

4 Hypotheses

Important implications can be derived from the intra-household consumption decision process briefly depicted earlier. Secrecy protects to a large extent individual earnings from spouse pressure and grants husband and wife a very limited ability to bias his/her partner's choice. In the absence of a common decision over an aggregated household budget, spouses have the latitude to manage their income and make decisions regarding their savings as though they were single. We can thus formulate a hypothesis to test the validity of the household decision process that we put forward:

Hypothesis 1 *The probability of joining a rosca does not depend on whether an individual is single or in couple.*

Should our data validate this hypothesis, doubts would be cast as to the relevance in Benin of the intra-household commitment motive à la Anderson and Baland.

In their theoretical work, Ambec and Treich (2007) investigate the formation of stable informal agreements in developing countries. They depict an economy where individuals are tempted by the purchase of a superfluous good and exhibit an interest in joining roscas and committing to regular payments in order to resist such temptations. They predict that rosca contribution increases with member's income as self-control problems intensify. So, should the commitment motive be valid, we would expect to find contributions to increase with individual income. It is likely, however, that rosca participation and contributions are concave in income as less risky and more flexible opportunities (i.e. bank account) become available when income rises. This forms a second hypothesis:

Hypothesis 2 At least at low levels of income, payments made to roscas by individuals in need of a commitment device, will be positively linked to income.

for members departing from a group are not related to that motive in our sample, (Dagnelie, 2009).

However, this represents a necessary but not sufficient condition for certifying our commitment hypothesis as it does not rule out alternative motives for joining a rosca, namely protection of savings against social pressure and risk of theft. We discuss those in details below.

5 Empirical Results

5.1 Rosca Participation

We check the empirical validity of our hypotheses by estimating participation and contributions with a single procedure: Heckman Full Information Maximum Likelihood. Since people self-select their participation in a group, the observations taken into account in the structural equation are not a random sample. In fact, we suspect unobserved individual characteristics to influence both the probablility to join and the size of the contribution. We have therefore to tackle the problem of selection bias, producing inconsistent estimates, induced by the correlation between the error term and the regressors. Heckman FIML addresses this problem by simultaneously estimating the selection and structural equations, allowing residuals to be correlated.

Considering correlation between observations coming from the same environment, we cluster our standard errors at the household level. Furthermore, the design of our survey was such that the chances of being selected in our sample were different in the three studied areas. We therefore introduce sampling weigths for our estimates to be independent of the sample design and consistent.

The first part of Table 2 displays empirical estimates with respect to participation, the dependent variable of the selection equation being a dummy variable for participating in at least one rosca (only 6% of all rosca members in our sample have multiple memberships). We regress alternatively on the whole sample and on a subset incorporating only members in couple. The only difference between the first two columns and the last two is the addition of two regressors, namely 'Female share of household income' and its square.

We control for ethnic affiliation even though we suspect that it plays a minor role in rosca participation in Cotonou, as only a minority of groups are designed along ethnic patterns. These variables can be seen as very rough proxies for social identification and networking⁵. All the regression results show that

⁵Time spent in a neighbourhood could also represent a proxy for trustworthiness. However,

ethnic identity is never significant, which confirms our intuition. We include additional regressors such as the dummies for having a primary degree, being salaried (not self-employed) and owning a house. None of these are significant. The effect of the number of dependents - a proxy for household expenses - on the probability of joining a rosca is a priori ambiguous. Indeed, a larger number of children could increase the parents' incentives to save in order to meet indivisible expenses. Conversely, more children could imply additional expenses and reduce potential savings. Since this variable is not significant, none of these two interpretations can be confirmed. Stability in one's job, which we measure based on whether one has kept one's present job for at least 24 months, positively and strongly affects the probability of joining a rosca. Individuals with more stable income flows in the past expect to commit more easily to regular payments. Since our survey was carried out in three different areas, we introduce area-specific effects. The district dummies, Vossa and Enagnon, are strongly significant suggesting that unobserved factors, specific to each neighbourhood, are important.

But mostly these estimates allow us to validate our first hypothesis. In the first column, the coefficients displayed show that neither 'Couple' nor the interaction variable between female and couple are significant. An alternative regression displayed in the third column confirms these results since 'Female share of household income' and its square are not significant at 10%. This provides evidence in favour of our framework where the decision to join a rosca is individual and independent of marital status considerations⁶.

As anticipated, rosca participation is quadratic in income⁷. However, the maximum is reached at a very high level of income indicating that for most of our sample the probability increases in income. Indeed, only five individuals out of 1179 have a larger income than the maximum of this quadratic function. When regressing on the whole sample, age also exhibits an inverted U shape, the maximum being 51 years. This tends to show that the need to save is increasing

problems of convergence with the FIML technique prevented us from using this variable. When introduced in the traditional Heckman two-step estimation, it was never significant.

⁶We also ran tests of joint significance on the coefficients of 'Couple' and 'Female * Couple' and on 'Female share' and its square. We cannot reject joint non-significance at a 10% level for both tests.

⁷Our measure of individually earned income includes all income-generating activities, from formal and informal sectors, and earnings from interest on loans made, rents on houses or apartments and received transfers.

among young agents and decreasing as they get older⁸. The significance of both age variables disappears when restricting the sample to individuals in couple. This could be explained by very similar age distributions among individuals in couple and rosca members, as confirmed by kernel density estimates.

The second part of Table 2 displays estimates with contributions to roscas being the dependent variable. Contributions, in 1000 CFA francs, are expressed in monthly equivalent of the payments made to all the roscas in which a member participates.⁹ Regressors such as ethnic dummies and district fixed effects are overall non-significant. Other personal characteristics: age, female share of household income, house ownership and the number of dependents have no significant effect on contributions. Although significant at 10% in the first specification, as a whole, gender seems to have no impact on contributions.¹⁰ Since neither 'Female' nor 'Female * Couple' variables are significant in both the selection and structural equations, members in couple do not appear to exhibit asymmetric preferences with respect to savings decisions. This, in addition to Beninese spouses seeming to make individual decisions regarding budget matters, makes it unlikely for roscas to be used as a commitment tool against intrahousehold conflicts.

It clearly stands out from our four regressions that only two variables have a consistently significant influence on rosca contributions: 'Income' and its square. Rosca contributions are quadratic in income, and only two rosca members have an income larger than the maximum value of this curve. Overall, income has thus a positive effect on contribution for the members of our sample, which complies with our second hypothesis and the self-control explanation. It is only at very high levels of income that alternative savings opportunities look interesting enough for the contributed amount to decrease with income. These regressions, however, cannot rule out alternative motives for joining a rosca, which we discuss below.

Another explanation for our results could be that agents make different kinds of expenses at different levels of income (e.g. wealthier individuals would tend to buy more expensive goods). However, this does not seem to be the case. In

⁸Note that the 2005 Worldbank estimate for life expectancy at birth in Benin is 55 years.

⁹Moreover, a member can contribute several times in one rosca and therefore be given the pot more than once during the same cycle. This is allowed in 29% of the roscas in our sample. Thus, our dependent variable takes into account both multiple memberships and multiple contributions within one rosca.

¹⁰For the first specification, joint non-significance with the variable 'Female * Couple' could not be rejected.

fact, there is no clear income pattern with respect to the type of expenses made using the pot¹¹. Moreover, regardless of their level of income, members do not claim to have joined a rosca in order to buy specific durable goods and only 2% of the groups impose spending agreements.

Estimates of the structural equation are in accordance with our two hypotheses: secrecy and non-cooperation enable spouses to make individual decisions as to their expenditures - net of household public goods spending - and hence, to commit themselves according to their available income. The decisions regarding participation and the amount of money contributed seem to be individual. By way of robustness checks, we ran other regressions, changing the specification and also following the traditional Heckman two-step procedure. Our hypotheses were always verified.

In order to ensure that our results are not an artefact due to omitting to consider the different kinds of roscas people join (community roscas, workmate roscas, friend or relative roscas), we ran regressions correcting selection bias with a multinomial logit for the participation equation, exploiting this stratification of roscas by type. Both our hypotheses remain valid across all specifications.

5.2 Average Effects of Rosca Participation

If agents join roscas to deal with their self-control problems, their expenditure pattern is expected to reflect this. Sophisticated agents might participate in roscas since their long-term self would prefer them to reduce their impulsive spending and rather save money to make indivisible expenses. If this assertion is correct, we should be able to find an effect of rosca participation on the following variables: the shares of individual non-essential (frivolous) expenses and savings over total monthly money uses¹². Alternatively, the difference in transfers given between rosca members and non-members could tell us whether

¹¹Although descriptive statistics do not show any income effect in the pot uses, we cannot exclude that agents buying a plot or building/repairing a house, are in general wealthier than the rest of the members. However, once we consider the size of the pot, the coefficient of income becomes insignificant revealing that poorer agents could afford large expenses by joining large groups.

¹²We define respectively: frivolous expenses as the sum of expenditures made on alcohol, cigarettes, meals out and entertainment; savings as the sum of money invested in four different savings vehicules namely money collectors, informal indemnity groups, roscas and formal savings accounts; and total monthly money uses include expenses made on durable and non-durable goods, savings and transfers made.

members use their participation as a means to protect their savings against social pressure.

As people self-select their rosca participation and we do not have experimental, longitudinal data or valid instruments, the only way to evaluate the impact of rosca participation is to turn to matching, selecting on observables. Two conditions have to be satisfied for this approach to be valid: assignment to treatment must be independent from outcomes, conditional on the covariates - i.e. conditional independence assumption (CIA)- and the probability of treatment must be bounded away from 0 and 1 - i.e. overlap or support assumption.

We estimate the average effect of treatment for the treated (ATT), τ^t , :

$$\tau^{t} = \mathbb{E}[Y_{i}(1) - Y_{i}(0)|W_{i} = 1]$$

where $Y_i(1)$ and $Y_i(0)$ are outcomes respectively when receiving and not receiving treatment and W is the treatment variable: rosca participation. What ultimately matters to estimate the average effect for the treated is the following condition: $Y_i(0) \perp W | X$. If unobservables explain the treatment status but are not related to the outcomes to be estimated, the conditional independence assumption remains valid (Imbens, 2004). Although this hypothesis allowing identification is not directly testable we acknowledge that it may be strong in our case. Hence, we verify the extent to which our results depend on the CIA by running a sensitivity analysis on the ATT estimates when the latter assumption is relaxed as put forward by Ichino et al. (2008) and Nannicini (2007). As is common in similar analyses, they consider that the CIA does not hold unless an unobserved binary variable, U, is introduced in a way that: $Y_i(0) \perp W|(X,U)$. The distribution of this binary variable is defined by the four probabilities that U = 1 in the four groups characterized by the treatment status and outcome value.¹³ U is then added to the set of covariates X for estimating the propensity score and computing the ATT. Simulating different distributions of U therefore allows us to test the sensitivity of the ATT estimates in different cases of the CIA failure.

Since our estimated ATT is negative, we simulate an unobserved variable which simultaneously decreases the superfluous expenses in case of no treatment and increases the probability of belonging to the treated group. Our analysis shows that the point estimates of the ATT are quite stable¹⁴ and that very

¹³We use a binary transformation of our continuous outcome.

¹⁴Results are available upon request. Ichino et al. (2006), mention that the stability of the point estimates is the criterion by which a sensitivity analysis should be assessed rather than the significance of the estimations.

large outcome and selection effects are required to drive the ATT estimates to 0. As we use a set of 15 control variables to compute the selection into treatment, we believe that the existence of such a confounder is not plausible. Therefore the validity and robustness of our results are confirmed. It is thus very unlikely that, in our context, selection on unobservables should drive the results derived under the CIA.

We consider several estimators of the average treatment effect on the treated: the bias corrected matching estimator put forward by Abadie and Imbens (2007), and three others based on propensity score matching, local linear regression, biweight kernel estimation and nearest neighbour with random replacement. The controls used to construct the propensity score or to correct bias are the variables included in the selection part of our Heckman FIML estimations with the exception of ethnic affiliations variables which violate the balancing properties. All of our estimates respect the balancing and common support properties.

As 284 non-rosca members present no frivolous expenses and therefore do not need to commit against temptations or time-inconsistent preferences, we decide to exclude these observations from the sample of interest. Using the whole sample, however, never produces contradictory results.¹⁵ As income is likely to be a key variable, we create another sample including all the adults of our survey whose individual income belongs to the restricted set of rosca members' income, removing the richest and poorest 5% of rosca members. The same conclusions apply to this case. We ran similar estimations on the sample of individuals in couple which corroborate the results presented in Table 3. Whichever the estimator and sample used, our results prove robust.

As displayed in Table 3, the 'total money uses' variable (1000 CFA) appears not to differ significantly between members and non-members. That being so, we can directly compare the different ratios between members and non-members and attribute the ratio differences to rosca participation. These estimations highlight that the proportion of frivolous expenses in total money uses is significantly lower for rosca participants. The magnitude of this effect is evaluated between 0.6 and 1.1 percentage points while the estimated average for nonmembers is 4.5%. This means that rosca members spend on average 13.3% to 24.4% less on temptation goods, which we assume their long-term self would prefer not to buy.¹⁶ As to the share of individual savings in total money uses,

¹⁵Taking the whole sample, the results are confirmed and of larger magnitude with the 'Abadie and Imbens' estimator; they are not significant with propensity score matching methods unless the estimates are restricted to the region of thick support (Black and Smith, 2004).

¹⁶As 'frivolous expenses' is a small budget item, the magnitude of this effect cannot solely

our results clearly exhibit that rosca members save around 10 percentage points more than non-members (the estimated average saving rate of non-members being 12.7%). From these two results, added to our previously displayed body of evidence, one is inclined to believe that roscas actually help agents discipline themselves to save.

Regarding the ratio of given transfers, if rosca members were to use their participation as a means to evade requests from friends and relatives, the estimated ratio difference would be negative. As the only weakly significant estimated effect exhibits a positive sign, this possibility seems to have to be discarded. These estimates admittedly prove difficult to reconcile with the protection from relatives hypothesis, which we discuss below at greater length. It rather brings additional credit to our self-commitment rationale. One could indeed object that our result is only a matter of simple accounting since if one item rises within a fixed budget, an equivalent decline in one or several others should be observed. But considering that the share of given transfers tends to increase with rosca participation, this mechanical justification does not seem at work here.

6 Other Motives for Participation

6.1 Quick Financing of the Purchase of Durable Goods

As argued by Besley, Coate and Loury (1993), roscas enable their members to make indivisible expenses sooner than if they had saved on their own. This applies to all members except the last one in the cycle. Ex-ante, saving through roscas having a non-predetermined order leads all members to improve over autarkic saving in expectation. Once the entire cycle order is known the last pot recipient is ex-post worse off, provided that the saving rate imposed by the rosca is not optimal for her. Observations collected in Benin do not seem to support that most individuals join roscas for this reason. For 50% of the 183 roscas of our dataset the entire order is known before the cycle begins, prior to any contribution. In such cases, when the cycle starts there is no uncertainty as to the timing of the pot reception. Thus as the cycle starts, the median cycle length being 11.54 months, the last recipient could decide to opt out, ex-ante knowing to be at a disadvantaged situation. Backwards induction would then

explain rosca participation.

predict the breakdown of the rosca.¹⁷

Another piece of evidence rendering the Besley et al. (1993) reasoning unfit to the Beninese case is that only 24% of the rosca members in our sample declared given the choice they would rather receive the pot at the beginning of the cycle while a majority of rosca members (60%) preferred the end. For those in favour of an early reception of the pot, we do not rule out the Besley, Coate and Loury rationale but it remains that this motive is more of an exception.

While the quick financing rationale does not seem supported by our data and is far from being the most cited motive for joining a rosca, our evidence points to the pot being used to make indivisible expenses. All rosca members were questioned about what they did or how they intended to use the pot during the present cycle. Nearly all of them mentioned making an indivisible expense: 49% reported investing in their small business (buying stocks of provisions for stores, motorcycle repairs for taxis, equipment for fishing, etc), 18% planned renovating or building a house, 11% reported plot purchasing, 7% paid for school tuitions, 5% planned to reimburse a personal debt and 14% to acquire a durable good (tv set, mobile phone, etc).

6.2 Insurance

Roscas can act as a substitute for insurance and this could be another motive for joining such an association. However, this interpretation is mainly valid for the case of bidding roscas which can best combine the allocation process and the timing of pot reception with respect to members' specific shocks. In our sample only random (64%) and decision roscas (36%) are represented. They can only provide insurance to a small extent. Nevertheless, a certain degree of flexibility can be offered by allowing a member in need to receive the pot at an earlier round. Of all the roscas surveyed, 26% stipulated in their rules that changes in the order were permitted. Moreover, 44% of all roscas allow two members to change the sequence without notifying the rosca's governing body.

Roscas can also provide insurance by offering loans to their members as 20% of all roscas do. For the majority of those associations (94%), a loan can only be offered to a member who has not yet received the pot; the latter acting as collateral.

¹⁷In our sample, 93% of all roscas change the order after each cycle is completed. The order of pot reception is therefore rarely repeated from cycle to cycle. However, this does not alter our argument. Interestingly, analyses reveal that there is no significant difference between a representative member of a rosca with or without uncertainty with respect to the order.

Half of the decision roscas set the reception order by considering individual member's needs. This insurance aspect is enhanced for roscas based on meeting-to-meeting decision. As for roscas whose order is determined before the cycle begins, the insurance they can provide is limited to foreseable shocks.

Even though roscas can incorporate some insurance aspects in their functioning, once the pot is received and a shock occurs, there is little if anything available. Beninese roscas are therefore an imperfect substitute for insurance.¹⁸ Moreover, surveyed individuals tend to resort to informal indemnity funds, specifically designed to provide insurance services (LeMay-Boucher, 2008).

6.3 Alternative Explanations

From the intra-household decision framework depicted in section 2, one can imagine that roscas are merely a tool to conceal money from one's partner and help spouses reduce their contribution to the provision of household public goods. This rationale is not supported, however, since the variables 'Couple', 'Female' and 'Female share of the household income' are never significant in our regressions. Moreover, only 15% of the members in couple (23/157), mostly male, admit that their spouse is not aware of their rosca membership, respectively 29% and 54% declare that the amount contributed and the time of pot reception are unknown to their partner. Although roscas can be a means to support money-related secrecy between partners, these figures do not suggest it is a widespread motive for joining a rosca¹⁹.

In our sample, 20% of the members mentioned that they joined a rosca to protect their savings. This can indicate two things that cannot be disentangled. On the one hand, members wish to avoid social pressure (financial help being requested on a regular basis from family, friends and neighbours) and potential requests from their spouses. As to the former, one might argue that by joining a rosca, one opts for a socially accepted alibi to safeguard one's savings against all types of social pressure. However, estimates of subsection 5.2 tend to grant less weight to this motive. Regarding requests from the spouse, the household budget structure and secrecy within the couple are such that these kinds of claims are greatly reduced. On the other hand, it can also imply protection against risks of theft, fire or other catastrophies which were also brought up during informal

¹⁸Contrary to our field observations, Calomiris and Rajaraman (1998) evoke a prevalence of bidding roscas in India and stress their insurance role.

¹⁹When asked: 'What is the fundamental reason why you joined a rosca?', not a single of the 222 members provided us with an answer to that effect.

interviews. In order to reduce these risks and preserve cash money against such adversities, people would prefer not to save at home but rather secure their savings in a rosca. Far from being the most important answer explaining members' participation, the fact that one out of five members emphasizes protection gives credit to this alternative rationale. Moreover, savings protection is a motive for participation which also satisfies our second hypothesis. Indeed, an individual facing a fixed probability of theft and an increasing demand in income from relatives, can be strictly better off by joining a rosca at higher levels of income (Anderson et al. 2002).

Although our evidence leads us to think that people join a rosca to commit themselves against self-control problems, we cannot rule out that their participation may be also driven by the need to protect savings from hazards: theft, fire, etc.

7 Conclusion

Our empirical evidence shows that rosca participation is not a gender issue in Cotonou. Owing to secrecy and the household budget structure, each spouse retains control over his/her spendings and therefore, individually decides to join a rosca.

Recent studies have emphasized that roscas can be used as a commitment device against two categories of potential threats. Individuals could join roscas to protect themselves against external threats such as pressure from their spouse stemming from asymmetric preferences, from the household expenses pattern or social pressure (assistance to relatives or friends). Alternatively, agents could be willing to secure their income against internal threats such as temptations and present-biased preferences. This commitment motive is in line with our findings.

Our investigations lead us to think that, in Cotonou, most of the agents participate in roscas to discipline themselves to save. Our body of evidence and matching estimates suggest that self-control problems are widespread and that people, living in the poor districts covered by our survey, value savings commitment mechanisms as roscas.

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| | Total Sample | | W | omen | Men | | |
|----------------------------------|--------------|-----------------|-------------|-----------------|-------------|-----------------|--|
| | All Rosca | | All Rosca | | All | Rosca | |
| | | Members | | Members | | Members | |
| Rosca Participation | 0.17 (0.02) | 1.00 (0.00) | 0.15 (0.02) | 1.00 (0.00) | 0.19 (0.02) | 1.00 (0.00) | |
| Total monthly rosca contribution | 1.80 (0.25) | 10.5 (0.92) *** | 1.65 (0.32) | 10.9 (1.44) *** | 1.97 (0.31) | 10.2 (1.12) *** | |
| Female | 0.51 (0.01) | 0.45 (0.03) * | | | | | |
| Age | 33.1 (0.44) | 39.8 (1.07) *** | 32.9 (0.56) | 39.7 (1.42) *** | 33.3 (0.64) | 39.8 (1.20) *** | |
| In couple | 0.52 (0.02) | 0.74 (0.04) *** | 0.52 (0.03) | 0.69 (0.06) *** | 0.52 (0.03) | 0.79 (0.05) *** | |
| Primary degree | 0.29 (0.02) | 0.23 (0.04) | 0.18 (0.02) | 0.12 (0.06) | 0.40 (0.03) | 0.32 (0.06) | |
| Salaried | 0.12 (0.01) | 0.19 (0.03) ** | 0.03 (0.01) | 0.05 (0.03) | 0.22 (0.02) | 0.30 (0.05) * | |
| Monthly individual income | 48.2 (2.75) | 86.4 (10.6) *** | 40.6 (1.52) | 69.4 (4.77) *** | 56.2 (5.08) | 100 (18.6) *** | |
| Monthly individual expenditures | 30.8 (0.97) | 47.7 (2.46) *** | 27.7 (1.16) | 43.7 (3.33) *** | 34.0 (1.46) | 50.9 (3.45) *** | |
| Number of dependents | 1.91 (0.07) | 3.18 (0.19) *** | 2.05 (0.09) | 3.37 (0.22) *** | 1.77 (0.08) | 3.02 (0.23) *** | |
| House owner | 0.70 (0.03) | 0.72 (0.05) | 0.70 (0.03) | 0.77 (0.05) | 0.69 (0.03) | 0.68 (0.06) | |
| Number of months, same job | 85 (4) | 159 (14) *** | 82 (5) | 155 (13) *** | 88 (6) | 163 (19) *** | |
| Number of months, same block | 191 (8) | 226 (17) ** | 174 (9) | 183 (17) | 209 (10) | 261 (25) ** | |
| Native Language : Ashanti | 0.01 (0.00) | 0.01 (0.01) | 0.00 (0.00) | 0.01 (0.01) | 0.01 (0.00) | 0.01 (0.01) | |
| Native Language : Fon | 0.33 (0.03) | 0.29 (0.05) | 0.31 (0.03) | 0.23 (0.07) | 0.34 (0.04) | 0.34 (0.06) | |
| Native Language : Popo | 0.35 (0.03) | 0.43 (0.05) * | 0.37 (0.03) | 0.48 (0.07) * | 0.33 (0.04) | 0.38 (0.06) | |
| Native Language : Yoruba | 0.04 (0.01) | 0.04 (0.02) | 0.04 (0.01) | 0.06 (0.03) | 0.04 (0.01) | 0.03 (0.02) | |
| Native Language : Fulani | 0.03 (0.01) | 0.03 (0.01) | 0.02 (0.01) | 0.02 (0.01) | 0.04 (0.01) | 0.04 (0.02) | |
| Native Language : Goun | 0.23 (0.02) | 0.19 (0.03) | 0.24 (0.03) | 0.18 (0.04) | 0.22 (0.02) | 0.19 (0.04) | |
| Vossa | 0.58 (0.02) | 0.53 (0.04) | 0.58 (0.02) | 0.56 (0.06) | 0.58 (0.02) | 0.52 (0.05) | |
| Enagnon | 0.31 (0.01) | 0.25 (0.03) ** | 0.31 (0.01) | 0.23 (0.04) ** | 0.31 (0.02) | 0.27 (0.04) | |
| Enagnon-plage | 0.11 (0.01) | 0.22 (0.02) *** | 0.11 (0.01) | 0.22 (0.03) *** | 0.11 (0.01) | 0.22 (0.03) *** | |
| Share of Frivolous Exp. | 0.04 (0.00) | 0.04 (0.00) | 0.03 (0.00) | 0.03 (0.00) | 0.04 (0.00) | 0.04 (0.00) | |
| Share of Savings | 0.12 (0.01) | 0.23 (0.01) *** | 0.14 (0.01) | 0.25 (0.01) *** | 0.10 (0.01) | 0.22 (0.02) *** | |
| Share of Given Transfers | 0.02 (0.00) | 0.04 (0.00) *** | 0.02 (0.00) | 0.02 (0.00) ** | 0.03 (0.00) | 0.05 (0.01) *** | |
| Total Money Uses | 52.9 (2.20) | 93.8 (7.27) *** | 43.4 (2.01) | 78.6 (7.02) *** | 62.8 (3.69) | 106 (11.6) *** | |
| Number of observations | 1179 | 222 | 604 | 97 | 575 | 125 | |

standard errors in parentheses, statistics corrected with sampling weights and survey design Differences between members and non-members: *** significant at 1%, ** significant at 5%, * significant at 10%

Table 1: Individual characteristics with respect to rosca participation.

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| | All sample | | In couple | | All sample | | In couple | |
|-----------------------------------|-------------|--------------|------------------------|--------------|--------------|------------|-----------|--------------|
| Selection equation: participation | | | | | | | | |
| Female | -0.200 | (0.236) | -0.058 | (0.205) | 0.200 | (0.587) | -0.058 | (0.205) |
| Couple | -0.098 | (0.213) | | | 0.447 | (0.595) | | |
| Female * Couple | 0.200 | (0.229) | | | -0.205 | (0.595) | | |
| Individual income (1000 CFA) | 0.008 ** | ** (0.002) | 0.006 * | * (0.002) | 0.007 *** | * (0.002) | 0.006 | ** (0.003) |
| (Individual income) ² | -7.10e-06** | **(2.67e-06) | -5.07e-06 [*] | * (2.61e-06) | -7.16e-06 ** | (2.80e-06) | -5.11e-06 | * (2.78e-06) |
| Female share of household income | | | | | -2.080 | (2.370) | -2.416 | (2.247) |
| (Female share of household income | $(2)^{2}$ | | | | 1.677 | (2.366) | 1.988 | (2.279) |
| Age | 0.102 * | ** (0.034) | 0.038 | (0.046) | 0.105 *** | * (0.034) | 0.040 | (0.047) |
| $(Age)^2$ | -1.12e-03* | **(3.95e-04) | -4.36e-04 | (5.10e-04) | -1.14e-03*** | (4.00e-04) | -4.48e-04 | (5.24e-04) |
| Number of dependents | 0.018 | (0.040) | 0.019 | (0.048) | 0.017 | (0.042) | 0.017 | (0.050) |
| Primary degree | 0.109 | (0.259) | 0.104 | (0.343) | 0.106 | (0.239) | 0.099 | (0.313) |
| Same job for 24 months or more | 0.393 * | * (0.158) | 0.414 * | * (0.182) | 0.400 ** | (0.164) | 0.423 | ** (0.191) |
| Salaried | 0.301 | (0.263) | 0.292 | (0.309) | 0.320 | (0.260) | 0.332 | (0.313) |
| House owner | 0.183 | (0.157) | 0.077 | (0.195) | 0.181 | (0.154) | 0.079 | (0.194) |
| Ashanti | 0.289 | (0.520) | 0.782 | (0.593) | 0.079 | (0.542) | 0.593 | (0.609) |
| Fon | -0.166 | (0.320) | 0.130 | (0.350) | -0.155 | (0.317) | 0.155 | (0.329) |
| Goun | -0.157 | (0.298) | 0.204 | (0.344) | -0.156 | (0.295) | 0.214 | (0.326) |
| Роро | 0.033 | (0.299) | 0.392 | (0.338) | 0.026 | (0.296) | 0.386 | (0.317) |
| Fulani | 0.390 | (0.390) | -0.327 | (0.597) | 0.384 | (0.389) | -0.322 | (0.590) |
| Vossa | -0.525 * | ** (0.169) | -0.582 ** | ** (0.206) | -0.548 *** | * (0.165) | -0.624 ' | *** (0.202) |
| Enagnon | -0.641 ** | ** (0.142) | -0.785 ** | ** (0.172) | -0.660 *** | • (0.144) | -0.825 ' | *** (0.180) |
| Constant | -3.239 ** | ** (0.684) | -1.998 * | * (0.918) | -3.258 *** | * (0.678) | -1.380 | (1.117) |

HECKMAN FIML ESTIMATES OF PARTICIPATION AND MONTHLY CONTRIBUTION

| Structural equation: monthly contribution | on (1000 | CFA |) | | | | | | | |
|---|----------|--------|------------|-----------|----|------------|-----------|---------------|-----------|----------------|
| Female | 5.160 | * | (3.000) | 0.163 | | (1.602) | 0.361 | (6.520) | 0.102 | (1.573) |
| Couple | 0.876 | | (2.242) | | | | -0.555 | (7.203) | | |
| Female * Couple | -4.731 | | (3.320) | | | | 0.009 | (6.650) | | |
| Individual income (1000 CFA) | 0.061 | ** | (0.028) | 0.064 | ** | (0.028) | 0.065 | ** (0.027) | 0.069 | ** (0.031) |
| (Individual income) ² | -6.41e-0 | 5 ** (| (2.76e-05) | -6.78e-05 | ** | (2.93e-05) | -6.70e-05 | ** (2.82e-05) | -7.17e-05 | 5** (3.23e-05) |
| Female share of household income | | | | | | | 1.779 | (26.507) | 0.457 | (27.390) |
| (Female share of household income) ² | | | | | | | 3.045 | (23.566) | 4.455 | (23.789) |
| Age | -1.153 | | (0.825) | -0.545 | | (0.735) | -1.186 | (0.832) | -0.598 | (0.786) |
| $(Age)^2$ | 0.013 | | (0.009) | 0.006 | | (0.008) | 0.013 | (0.009) | 0.006 | (0.008) |
| Number of dependents | -0.419 | | (0.309) | -0.348 | | (0.403) | -0.436 | (0.321) | -0.357 | (0.421) |
| House owner | -0.596 | | (1.694) | -1.338 | | (2.035) | -0.577 | (1.740) | -1.281 | (2.068) |
| Ashanti | -5.624 | ** | (2.819) | -7.120 | * | (3.944) | -4.053 | (2.974) | -5.832 | (4.016) |
| Fon | 0.387 | | (2.835) | -3.012 | | (3.092) | 0.519 | (2.889) | -2.720 | (3.433) |
| Goun | 0.314 | | (2.407) | -1.295 | | (2.663) | 0.431 | (2.439) | -1.063 | (2.925) |
| Роро | -1.277 | | (2.097) | -1.965 | | (2.690) | -1.019 | (2.224) | -1.525 | (2.970) |
| Fulani | -4.600 | | (3.146) | 1.892 | | (4.291) | -4.334 | (3.337) | 2.804 | (4.619) |
| Vossa | 7.029 | ** | (3.092) | 7.460 | * | (3.824) | 7.204 | ** (3.372) | 7.750 | * (4.414) |
| Enagnon | 4.165 | | (2.861) | 4.487 | | (3.481) | 4.247 | (3.068) | 4.680 | (3.953) |
| Constant | 32.717 | | (20.739) | 22.421 | | (19.264) | 33.289 | (20.714) | 22.226 | (19.055) |
| | | | | | | | | | | |
| Number of observations | 1179 | | | 587 | | | 1174 | | 582 | |
| Number of censored observations | 957 | | | 530 | | | 953 | | 426 | |
| Number of uncensored observations | 222 | | | 157 | | | 221 | | 156 | |

standard errors in parentheses, *** significant at 1%, ** significant at 5%, * significant at 10%

Table 2: Heckman FIML.

| | Matching ^a | Biweight kernel ^b | LLR ^c | NNM ^d |
|--------------------------|-----------------------|------------------------------|------------------|------------------|
| Ratio of frivolous exp. | -0.011(0.003)*** | -0.006(0.003) ** | -0.006(0.003) ** | -0.009(0.003)*** |
| Ratio of savings | 0.116 (0.012)*** | 0.103 (0.012) *** | 0.101 (0.012)*** | 0.116 (0.014)*** |
| Ratio of given transfers | 0.010 (0.005) * | 0.005 (0.005) | 0.005 (0.005) | 0.007 (0.006) |
| Total money uses | -3.237(6.440) | 0.309 (6.422) | 1.112 (6.632) | 1.764 (7.581) |
| Number of observations | s 895 | | | |
| Controls | | 673 | 673 | 162 |
| Treated | | 218 | 218 | 222 |

standard errors in parentheses

*** significant at 1%, ** significant at 5%, * significant at 10%

^a Bias corrected matching estimator a la Abadie & Imbens - Stata command: nnmatch

^b Biweight kernel based on propensity score - Stata command: psmatch2

^c Local linear regression with biweight kernel and propensity score - psmatch2

^d Nearest neighbour with random draw, replacement and propensity score - pscore

Table 3: Matching estimations of average effect of rosca participation.