

Savings Constraints and Microenterprise Development: Evidence from a Field Experiment in Kenya

Author(s): Pascaline Dupas and Jonathan Robinson

Source: *American Economic Journal: Applied Economics*, Vol. 5, No. 1 (January 2013), pp. 163-192

Published by: American Economic Association

Stable URL: <https://www.jstor.org/stable/43189422>

Accessed: 02-03-2020 04:56 UTC

---

JSTOR is a not-for-profit service that helps scholars, researchers, and students discover, use, and build upon a wide range of content in a trusted digital archive. We use information technology and tools to increase productivity and facilitate new forms of scholarship. For more information about JSTOR, please contact [support@jstor.org](mailto:support@jstor.org).

Your use of the JSTOR archive indicates your acceptance of the Terms & Conditions of Use, available at <https://about.jstor.org/terms>



JSTOR

*American Economic Association* is collaborating with JSTOR to digitize, preserve and extend access to *American Economic Journal: Applied Economics*

## Savings Constraints and Microenterprise Development: Evidence from a Field Experiment in Kenya<sup>†</sup>

By PASCALINE DUPAS AND JONATHAN ROBINSON\*

*Does limited access to formal savings services impede business growth in poor countries? To shed light on this question, we randomized access to noninterest-bearing bank accounts among two types of self-employed individuals in rural Kenya: market vendors (who are mostly women) and men working as bicycle taxi drivers. Despite large withdrawal fees, a substantial share of market women used the accounts, were able to save more, and increased their productive investment and private expenditures. We see no impact for bicycle-taxi drivers. These results imply significant barriers to savings and investment for market women in our study context. (JEL D14, G21, J16, J23, O12, O14, O16)*

Hundreds of millions of people in developing countries earn their living through small-scale business (World Bank 2004; de Soto 1989). Many of these entrepreneurs do not have access to even the most basic of financial services, such as a simple bank account in which they can save money.<sup>1</sup> Given that many entrepreneurs need to save up daily profits for lumpy investments or set aside some money to use for unexpected shocks, is it possible that not having a place to save securely impedes business success?

In this paper, we test this directly by expanding access to bank accounts for a randomly selected sample of small informal business owners in one town of rural Western Kenya. The sample is composed primarily of market vendors (the great majority of whom are women) and bicycle taxi drivers (all of whom are men),

\* Dupas: Economics Department, Stanford University, 579 Serra Mall, Stanford, CA 94305 (e-mail: [pdupas@stanford.edu](mailto:pdupas@stanford.edu)); Robinson: Economics Department, University of California at Santa Cruz, 457 Engineering 2, Santa Cruz, CA 95064 (e-mail: [jmrtwo@ucsc.edu](mailto:jmrtwo@ucsc.edu)). For helpful discussions and suggestions, we are grateful to Orazio Attanasio, Jean-Marie Baland, Leo Feler, Fred Finan, Sarah Green, Seema Jayachandran, Dean Karlan, Ethan Ligon, Craig McIntosh, David McKenzie, John Strauss, Dean Yang, Chris Woodruff, anonymous referees, and participants at numerous seminars and conferences. We thank Jack Adika and Anthony Oure for their dedication and care in supervising the data collection, and Nathaniel Wamkoya for outstanding data entry. We thank Eva Kaplan, Katherine Conn, Sefira Fialkoff, and Willa Friedman for excellent field research assistance, and we thank Innovations for Poverty Action for administrative support. We are grateful to Aleke Dondo of the K-Rep Development Agency for hosting this project in Kenya, and to Gerald Abele for his help in the early stages of the project. Dupas gratefully acknowledges the support of a Rockefeller Center faculty research grant from Dartmouth College and Robinson gratefully acknowledges the support of an NSF dissertation improvement grant (SES-551273), a dissertation grant from the Federal Reserve Bank of Boston, and support from the Princeton University Industrial Relations Section. We also gratefully acknowledge the support of the World Bank. All errors are our own.

<sup>†</sup> To comment on this article in the online discussion forum, or to view additional materials, visit the article page at <http://dx.doi.org/10.1257/app.5.1.163>.

<sup>1</sup> Though there is little evidence for entrepreneurs specifically, several studies show extremely low levels of financial access for the broader population in developing countries (Chaia et al. 2009; Kendall, Mylenko, and Ponce 2010). With regard to Africa more specifically, Aggarwal, Klapper, and Singer (2011) use the Gallup World Poll to show that only 15 percent of people in sub-Saharan Africa have a bank account.

and includes 250 individuals in total. We use two main data sources to measure impacts: administrative data from the bank on account usage, and a rich dataset constructed from daily logbooks that were kept by respondents. The logbooks include detailed information on many outcomes, including formal and informal savings, business investment, and expenditures.<sup>2</sup>

There are three main findings. First, market women in the treatment group used the bank accounts quite actively, and increased their total savings on average. Treated bicycle taxi drivers (all of whom were men) used the accounts much less and did not increase their total savings. The high account usage rate among market women is especially noteworthy because the account did not pay out any interest and included substantial withdrawal fees, so that the *de facto* interest rate on deposits was negative (even before accounting for inflation).<sup>3</sup> Clearly, if female vendors did not have trouble saving on their own, they should not have paid the bank for the right to save. That they voluntarily did so suggests that they face negative private returns on the money they save informally.

Second, market women in the treatment group substantially increased their investment in their business relative to the control group. Our most conservative estimate of the effect is equivalent to a 38–56 percent increase in average daily investment for market women after 4–6 months. While this point estimate is very large, the standard errors are also quite large, and the confidence interval includes both reasonable and less reasonable effect sizes. Our focus is thus on the fact that we see a substantial positive impact, rather than on its exact magnitude.<sup>4</sup>

Third, market women in the treatment group had significantly higher expenditures than market women in the control group. After 4–6 months, daily private expenditures were about 37 percent higher for market women in the treatment group.

This study is the first randomized field experiment estimating the effect of expanding access to basic savings accounts. There have, however, been a number of recent randomized controlled trials that look at the effects of increased access to *credit*. Our findings contrast with those studies in two ways. First, studies exploiting the randomized expansion of microcredit have observed relatively low take up: 27 percent of households in urban India (Banerjee et al. 2009) and 16 percent of households in Morocco (Crépon et al. 2011) took out a loan when barriers to access were lowered. In rural Kenya, less than 3 percent of individuals initiate a loan application even after receiving assistance with the collateral requirement (Dupas et al. forthcoming). In contrast, 87 percent of people took up the savings account we offered, and 41 percent made at least two transactions within the first six months of getting the offer.<sup>5</sup>

<sup>2</sup>The logbooks are similar to the financial diaries used in Collins et al. (2009).

<sup>3</sup>Inflation in Kenya was between 10 and 14 percent at the time of this study (International Monetary Fund (IMF) 2010).

<sup>4</sup>Note, however, that qualitative debriefing interviews with women who saw large increases in business size supported the quantitative estimates.

<sup>5</sup>This higher demand for saving rather than credit supports the results of earlier observational studies, such as Johnston and Morduch (2008), who show that 90 percent of Bank Rakyat Indonesia clients save but do not borrow; or Bauer, Chytilová, and Morduch (2010), who argue that some women in India take up microcredit schemes as a way of forcing themselves to save through required installment payments (rather than to access credit for use in a business).

Second, while we find evidence that savings access helps increase business investment, evidence on the impact of credit on microentrepreneurs so far has been quite mixed. Karlan and Zinman (2010a, b) exploit randomized access to credit in an urban area in the Philippines, and see no effect of microcredit access on business investment. Rather, they find some evidence that the size and scope of businesses shrink when their owner gets a loan.<sup>6</sup> In contrast, Banerjee et al. (2009) find positive (though still quite small in absolute magnitude) impacts on business creation and purchase of business durables by business owners. Finally, Kaboski and Townsend (2011) evaluate a natural experiment that increased credit access in rural Thailand. They find large consumption impacts, but no change in overall investment. The only randomized controlled trial to find large, positive impacts thus far is Attanasio et al. (2012) in Mongolia.

There have also been a few nonexperimental studies estimating the impact of providing comprehensive financial services (i.e., both savings and credit) on income (Burgess and Pande 2005, in India; Bruhn and Love 2009, and Aportela 1999, in Mexico; and Kaboski and Townsend 2005, in Thailand). Our paper adds to this literature by providing experimental evidence that providing basic saving services alone might be an important tool in poverty alleviation.

Our findings raise a number of issues that remain to be explored. First, what are the key savings barriers that bank accounts help overcome? Do people have difficulty saving because they have present-biased preferences and over-consume cash on hand, as has been shown to be the case for at least 10 percent of women in the Philippines (Ashraf, Karlan, and Yin 2006)? Or do they have difficulty protecting their savings from demands from others (Platteau 2000)?

Second, and relatedly, while the private return on savings at home appears to be negative, the social return could be zero. Every dollar given out to a relative or social contact who asks for it is ultimately spent. Savings accounts only improve welfare if they make it more likely that money is spent where it has the highest return (for example, if it allows a relatively high-return entrepreneur to increase investment) or if it reduces money spent on consumption that people later regret (temptation goods, for example). This implies that the welfare implications of increasing access to formal saving services to a subset of the population are ultimately unclear—while market women in the treatment group were clearly better off, the impact on other members of their social network is uncertain. They could benefit in the long run from the higher resources generated by women through their expanded businesses, but they may suffer in the short run from receiving lower transfers.

Third, how generalizable are these results? Within our own sample, we find important heterogeneity by occupation, with no effect for bicycle taxi drivers and large effects for female market vendors (we lack precision to estimate the importance and impact of saving constraints for male vendors). How would other segments of the population (for example, farmers) be affected by access to savings services? We leave more thorough investigation of these issues to future work.

<sup>6</sup>The authors explain this negative impact as follows: increased access to credit reduced the need for favor-trading within family or community networks and thereby enabled business owners to shed unproductive workers.

The remainder of the paper is as follows. We first describe the experiment and the data in Section I, before presenting the main results in Section II. Section III discusses possible mechanisms. Section IV discusses potential mechanisms and open questions, and Section V concludes.

## I. Experimental Design and Data Collection

### A. Study Location and Study Population

The study took place in and around Bumala Town in Busia district, Kenya. Bumala Town is a rural market center located along the main highway connecting Nairobi, Kenya to Kampala, Uganda, and it has a population of around 3,500, making it the fifth largest town in Busia district and the 189th largest town in Kenya.<sup>7</sup>

As this project was focused on nonfarm microenterprises rather than on a more general population, our sample consisted solely of daily income earners. We decided to focus in particular on vendors and on bicycle taxi drivers, which are two popular types of own enterprises in Bumala Town. Though there are many other types of businesses in the area, we focused on these two types because the production function is similar across businesses within each type.

The scale of operations for individuals in our sample is quite small. For those involved in vending, the mean number of items traded is just below two, and the median is one (the majority of vendors sell just one item, such as charcoal or a food item like dried fish or maize). Mean daily investment is just US\$6 per day. For bicycle taxi drivers, mean investment is limited to bicycle repairs, which amount to only US\$1 per day on average. Most of the individuals in our sample own a small plot of land and are involved in subsistence farming in addition to their business. The main staple crop cultivated is maize.

### B. Background on Formal and Informal Savings in Western Kenya

Most self-employed individuals in rural Kenya do not have a formal bank account. At the onset of this study, only 2.2 percent of individuals we surveyed had a savings account with a commercial bank. The main reasons given for not having an account were that formal banks typically have high opening fees and have minimum balance requirements (often as high as Ksh 500, or around US\$7). Savings accounts are also offered by savings cooperatives, but the cooperatives are usually urban and employment based, and therefore rarely available for rural self-employed individuals.

Instead, individuals typically save in the form of animals or durable goods, in cash at their homes, or through Rotating Savings and Credit Associations (ROSCAs), which are commonly referred to as merry-go-rounds.<sup>8</sup> Most ROSCAs have periodic meetings, at which members make contributions to the shared saving pool, called the “pot.” The pot money is given to one member every period, in rotation until

<sup>7</sup> See [http://kenya.usaid.gov/sites/default/files/profiles/Busia\\_Dec2011%2020.pdf](http://kenya.usaid.gov/sites/default/files/profiles/Busia_Dec2011%2020.pdf).

<sup>8</sup> It is very common for people around the developing world to use these types of mechanisms as primary savings mechanisms (Rutherford 2000).

everyone has received the pot. ROSCA participation is high in Kenya, especially among women, and many people participate in multiple ROSCAs (Gugerty 2007).

In our sample, 87 percent of respondents report that “it is hard to save money at home,” and ROSCA participation is widespread, especially among women (Table 1).

### C. The Village Bank

We worked in collaboration with a village bank (also called a Financial Services Association, or FSA) in Bumala Town. The Bumala FSA is a community-owned and operated entity that receives support (in the form of initial physical assets and ongoing audit and training services) from the Kenya Rural Enterprise Development Agency, an affiliate of the Kenyan microfinance organization KREP. The FSA is the only financial institution present in the study area. Commercial bank branches are available in the next town (Busia), located about 25 kilometers away.

At the time of the study, opening an account at the village bank cost Ksh 450 (US\$6.40). The village bank did not pay any interest on the savings account. However, the bank charged a withdrawal fee (of US\$0.50 for withdrawals less than US\$8, \$0.80 for withdrawals between \$8 and \$15, and \$1.50 for larger withdrawals), thus generating a *de facto* negative interest rate on savings. The bank was open from Monday to Friday from 9 AM to 3 PM, and did not provide ATM cards or any opportunity to deposit or withdraw money at any time outside these working hours, making bank savings somewhat illiquid—savings could not be accessed for emergencies which occurred on the weekend or after 3 PM.

The village bank opened in Bumala Town in October 2004. By the time this study began in early 2006, only 0.5 percent of the daily income earners that we surveyed around Bumala Town had opened an account at the village bank. The main reasons given by respondents for why they did not already have an account were inability to pay the account opening fee, and lack of information about the village bank and its services.<sup>9</sup>

Note that access to credit is also extremely limited in the study area. At the time of the study, there was no microcredit agency lending to people in our sample. Only those with a bank account at the Village Bank could potentially be eligible for a loan, but the eligibility criteria were extremely stringent. Consequently, very few people in our study received credit during the sample period.

### D. Sampling

The sampling was done in three waves, in 2006, 2007, and 2008, respectively. Given that we had only a limited budget for data collection, in each wave we sampled people up to the point that we had enough staff to oversee the daily logbook data collection exercise (the logbooks, as we discuss below, were costly to administer because they required a high ratio of well-trained enumerators to respondents). To draw the sample, enumerators were assigned specific areas in and around

<sup>9</sup>Cole, Sampson, and Zia (2011) combine experimental and survey evidence from India and Indonesia to argue that the demand for bank savings accounts is not constrained by lack of financial literacy, but rather by high prices.

Bumala town, and asked to identify market vendors and bicycle-taxi drivers called *boda-bodas* in Swahili operating there. They administered a background survey to these individuals upon identifying them.<sup>10</sup> Those that already had a savings account (either at the village bank itself or some other formal bank) were excluded from the sample. This criterion excluded very few individuals. As mentioned, only 2.2 percent of individuals had accounts in a commercial bank and 0.5 percent had accounts in the FSA. After excluding these individuals, our final sample frame consisted of 392 individuals: 262 female vendors, 92 male bicycle taxi drivers, and 34 male vendors (see Appendix Table A1). This represents only a small share of the total population in Bumala Town, and a small share of vendors and bicycle taxi drivers.<sup>11</sup>

### *E. Experimental Design and Timeline*

Individuals in the sample frame were randomly divided into treatment and control groups, stratified by gender and occupation (gender and occupation are very highly correlated in the sample, since all women in the sample are market vendors and 89 percent of market vendors in the sample are female). Those sampled for treatment were offered the option to open an account at the village bank at no cost to themselves—we paid the account opening fee and provided each individual with the minimum balance of Ksh 100 (US\$1.43), which they were not allowed to withdraw. Individuals still had to pay the withdrawal fees, however. Those individuals that were sampled for the control group did not receive any assistance in opening a savings account (though they were not barred from opening one on their own).<sup>12</sup>

The timing was as follows. In Wave 1, the background survey was administered in February and March 2006, and accounts were opened for consenting individuals in the treatment group in May 2006. In Wave 2, the background survey was administered in April and May 2007, and accounts were opened in June 2007. In Wave 3, the background survey was administered in July and August 2008, and accounts were opened in June 2009.<sup>13</sup>

### *F. Data*

We use four sources of data. First, our background survey includes information on the baseline characteristics of participants, such as marital status, household composition, assets, and health. Second, we have administrative data from the village bank on every deposit and withdrawal made in all of the treatment accounts.<sup>14</sup>

<sup>10</sup>We did not keep track of the number of individuals that were approached but refused to be surveyed, but reports from enumerators suggest that refusals were very rare at the enrollment stage.

<sup>11</sup>In a census of ROSCA participants around Bumala Town that we conducted for a separate study (Dupas and Robinson forthcoming), we identified over 800 female vendors. Records kept by Bumala's Boda association indicate that over 300 bodas were registered in 2007.

<sup>12</sup>Within the study period, three individuals in the control group opened accounts in the village bank on their own.

<sup>13</sup>After the data had been collected, control individuals in each wave were given the option to open a savings account free of charge as compensation for participating in the study, but this was not anticipated.

<sup>14</sup>We obtained consent from respondents to collect these records from the bank.

Third, we elicited time and risk preferences from respondents, as well as cognitive ability measures.<sup>15</sup> The time preference questions asked respondents to decide between Ksh 40 now (US\$0.57) and a larger amount a month later. To measure time consistency, we also asked respondents to choose between Ksh 40 in 1 month and a larger amount in 2 months. The risk preference questions were similar to Charness and Genicot (2009) and asked respondents how much of Ksh 100 (US\$1.43) they would like to invest in an asset that paid off four times the amount invested with probability 0.5 and that paid off 0 with probability 0.5.<sup>16</sup> To measure cognitive ability, we asked respondents to complete a “Raven’s Matrix” in which they had to recognize patterns in a series of images.

Fourth, and most importantly, we collected detailed data on respondents through daily, self-reported logbooks. These logbooks included detailed income, expenditure, and business modules, as well as information on labor supply and on all transfers given and received (including between spouses).

Because the logbooks were long and complicated to keep, trained enumerators met with the respondents twice per week to verify that the logbooks were being filled correctly. One significant challenge was that many respondents could neither read nor write (33 percent of women and 9 percent of men who agreed to keep the logbooks could not read nor write Swahili). To keep these individuals in the sample, enumerators visited illiterate respondents every day to help them fill the logbook.

To keep data as comparable as possible, respondents kept logbooks during the same time period in each wave, from mid-September to mid-December. Logbooks were kept in 2006 for Wave 1, 2007 for Wave 2, and 2009 for Wave 3. To encourage participation, the logbooks were collected every four weeks, and respondents were paid Ksh 50 (US\$0.71) for each week the logbook was properly filled out (as determined by the enumerator).<sup>17</sup> Though respondents were asked to fill the logbooks for up to three months, some were only willing to keep the logbooks for a shorter period, and so we do not have three full months’ worth of data for all respondents.

The logbook data makes up the bulk of the analysis. For each respondent, we compute the average daily business and household expenditures across all the days that the respondent filled the logbook, and then compare these averages between the treatment and control groups.

The logbooks included a module designed to estimate respondents’ investment, hours worked, and sales. From this, we planned to back out profits. However, the imputed profits are ultimately unusable. This is because the quality of the data on revenues from the business (mostly retail sales) is very poor. Many respondents did not keep good records of their sales during the day, in part because they did not have time to record each small retail transaction that they had. In contrast, the data on business investments (mostly wholesale purchases) is relatively reliable, albeit

<sup>15</sup>This type of data was collected from all study participants in 2008. This means that, for respondents in Waves 1 and 2, the data was collected after the treatment had been implemented, whereas for respondents in Wave 3 it was collected at baseline. Since the treatment (getting a bank account) might have affected risk and time preferences among subjects, we do not make any strong conclusions regarding the heterogeneity of the treatment effect by these measures, but instead consider them as purely suggestive.

<sup>16</sup>To encourage truth-telling, one of the risk and time preference questions was randomly selected for actual payment.

<sup>17</sup>This figure is equivalent to about one-third of daily total expenditures for respondents in this sample.



somewhat noisy. As a result, total business revenues are systematically smaller than total investment, and so total profits are, on average, very negative in the sample. What is problematic for us is that under-reporting of revenues appears to increase with the size of the business (the more sales, the higher the share of unrecorded sales). Given this, we estimate impacts on investment and revenues separately.<sup>18</sup>

### G. Attrition

There were two main sources of attrition. The first is that some respondents could not be found and asked to keep the logbooks (because they had moved or could not otherwise be traced). The second is that, as might be imagined from the length of the logbooks and the relatively small compensation given to participants, some people refused to fill the logbooks. Of those who could be traced and offered logbooks, 17 percent refused to fill them (7 percent of women and 21 percent of men).

We document attrition in Appendix Table A1. Among female vendors, we had more difficulty tracing those in the treatment group, but acceptance to fill the logbook was not differential (conditional on being traced). But *bodas*, who were much more likely to attrit than market women, attrited differentially. *Bodas* in the treatment group were both more likely to be found and more likely to accept the logbooks if found, than those in the control group. Male vendors were more likely to attrit from the treatment group. As we show in the next section, the post-attrition treatment and control groups that make it into the final analysis do not differ along most observable characteristics, but the differential attrition patterns make it impossible to rule out unobservable differences between treatment and control groups among *bodas*, who represent 80 percent of the men in our sample. While this attrition limits confidence in the results, it is unlikely that *bodas* could have benefited from the accounts since the amounts they deposited on their accounts were very modest (according to the bank administrative records, which do not suffer from an attrition problem. See Section IIA.)

### H. Final Sample Characteristics and Balance Check

Table 1 presents baseline characteristics of men and women that filled the logbooks by treatment status, and the *p*-values of tests that the differences between treatment and control are equal to zero.<sup>19</sup> We have 250 logbooks in total, 170 of which were filled by market women and 80 of which were filled by men (55 bicycle taxi drivers and 25 market men).<sup>20</sup> The background variables are mostly self-explanatory, but we briefly describe the time preference measures. We define as “somewhat

<sup>18</sup> While it is unfortunate that we do not have reliable profit measures, we note that it is notoriously difficult to measure profits for such small-scale entrepreneurs, especially since most do not keep records (Liedholm 1991; Daniels 2001). We did not ask respondents to report their profit directly, which, in hindsight, appears to have been a mistake. de Mel, McKenzie, and Woodruff (2009a) show that asking respondents to report profits is more reliable than trying to back out profits from business transaction details.

<sup>19</sup> Standard errors of the differences are clustered at the individual level to account for the fact that Wave 1 control individuals appear twice (as controls in 2006 and treatment in 2007).

<sup>20</sup> We have fewer observations for the time preference, risk preference, and cognitive ability module. In total, we have 220 observations for these variables.

TABLE 1—SAMPLE CHARACTERISTICS AND BALANCE CHECK

	Female vendors			Males (vendors and <i>bodas</i> )		
	Control group (1)	Treatment group (2)	<i>p</i> -val Treat = control (3)	Control group (4)	Treatment group (5)	<i>p</i> -val Treat = control (6)
<i>Stratification variables</i>						
Wave 1	0.17	0.14	0.57	0.36	0.51	0.17
Wave 2	0.31	0.32	0.87	0.54	0.49	0.66
Wave 3	0.52	0.54	0.80	0.10	0.00	0.04**
Occupation: <i>Boda</i>	0.00	0.00	—	0.62	0.76	0.18
<i>Demographics</i>						
Age	34.40 (11.43)	36.43 (10.14)	0.22	30.10 (8.45)	30.63 (8.96)	0.79
Married	0.65	0.68	0.69	0.80	0.83	0.70
Number of children	3.57 (2.18)	3.53 (2.20)	0.89	2.69 (2.19)	2.90 (2.34)	0.68
Education	5.95 (3.02)	5.77 (3.73)	0.74	6.56 (2.57)	8.07 (2.44)	0.01***
Literate (Swahili)	0.70	0.61	0.23	0.90	0.95	0.37
Participates in ROSCA	0.88	0.89	0.73	0.41	0.46	0.64
ROSCA contributions in last year (in Ksh)	4,216 (4,424)	5,244 (6,674)	0.25	1,172 (2,196)	2,524 (4,123)	0.07*
Value of animals owned (in Ksh)	4,556 (9,241)	4,791 (8,864)	0.87	4,149 (5,660)	6,265 (12,685)	0.35
Value of durable goods owned (in Ksh)	4,100 (12,065)	3,355 (6,385)	0.61	8,415 (11,931)	6,788 (11,750)	0.55
Total income in week prior to survey (in Ksh)	1,116 (1,285)	1,233 (1,563)	0.73	564 (464)	670 (634)	0.42
Received loan from bank in past year	0.04	0.06	0.76	0.03	0.03	0.93
Received loan from friend in past year	0.39	0.44	0.66	0.34	0.41	0.56
Self-reported health status <sup>1</sup>	3.37 (0.88)	3.29 (0.84)	0.70	3.54 (0.82)	3.56 (0.90)	0.93
Agrees with statement: "It is hard to save at home"	0.88	0.90	0.75	0.89	0.77	0.23
<i>Risk and Time Preferences<sup>2</sup></i>						
Amount invested (out of Ksh 100) in risky asset	64.40 (21.20)	63.57 (21.74)	0.81	60.65 (24.21)	66.13 (18.56)	0.32
Somewhat patient	0.10	0.09	0.78	0.16	0.19	0.75
Time-consistent	0.20	0.20	0.97	0.30	0.36	0.66
Present-biased	0.23	0.21	0.88	0.27	0.39	0.32
More patient in future than in present	0.18	0.26	0.25	0.03	0.07	0.58
Maximal discount rate in present and in future	0.39	0.33	0.40	0.40	0.19	0.08*
<i>Cognitive skills</i>						
Raven's matrix score (percent correct)	0.47	0.48	0.82	0.52	0.49	0.68
Observations	96	74	170	39	41	80

Notes: Sample restricted to respondents for whom we have logbook data. Columns 1, 2, 4, and 5 report means, with standard deviations in parentheses. Columns 3 and 6 report *p*-values obtained when testing the hypothesis that the difference between the treatment and the control means is equal to zero. Exchange rate was roughly Ksh 70 to the US dollar during the study period.

<sup>1</sup>Health Status is coded as: 1-very poor, 2-poor, 3-just OK, 4-good, 5-very good.

<sup>2</sup>The risky asset paid off 4 times the amount invested with probability 0.5, and 0 with probability 0.5. "Somewhat Patient" is a dummy equal to 1 if the respondent prefers Ksh 55 (or less) in a month to Ksh 40 now. "Time Consistent" is a dummy equal to 1 if the respondent exhibits the same discount rate between today and 1 month from today. "Present-Biased" is a dummy equal to one if the respondent exhibits a higher discount rate between today and one month from today than between one month from today and two months from today. "More Patient in Future than in Present" is a dummy equal to 1 if the respondent is more patient in 1 month than she is today, and "Maximum Discount Rate in the Present and in the Future" is a dummy equal to 1 if a respondent prefers Ksh 40 today to Ksh 500 in 1 month and Ksh 40 in 1 month to Ksh 500 in 2 months.

\*\*\*Significant at the 1 percent level. \*\*Significant at the 5 percent level. \*Significant at the 10 percent level.

patient” any respondent who preferred Ksh 55, or US\$0.79, (or less) in 1 month to Ksh 40 (US\$0.57) today. For measures of time consistency, we assign people to one of four categories: (1) “present-biased” respondents who are less patient in the present than in the future; (2) respondents who exhibit maximum possible discount rates in both the present and future (these individuals preferred Ksh 40 to Ksh 500 (US\$7.14) in 1 month, and Ksh 40 in 1 month to Ksh 500 in 2 months); (3) respondents who are more patient in the present than in the future; and (4) “time-consistent” individuals who have the same discount rate in the present and the future.

As can be seen in Table 1, around 21 percent of women and 5 percent of men were actually more patient in the present than in the future. Though this seems counterintuitive, previous studies have found similar results. About 10 percent of respondents in Bauer, Chytilová, and Morduch (2010) and 15 percent of respondents in Ashraf, Karlan, and Yin (2006) had preferences of this type in studies in India and the Philippines, respectively.<sup>21</sup>

For both market women and men, the treatment and control groups are balanced along most background characteristics. For women, the *p*-value of the difference between treatment and control is above 0.10 for all 24 baseline characteristics presented in Table 1. These figures suggest that attrition during the logbook exercise was not differential along observable characteristics for market women, and performing the analysis on the restricted sample for which we have data will not bias our estimates of the treatment effect.<sup>22</sup>

There is more reason for concern among men. Four background characteristics have statistically significant differences between treatment and control men (education, ROSCA contributions, extreme impatience in both present and future, and an indicator for Wave 3), and we know from Table A1 that there was differential attrition among *bodas* (which explains the imbalance between groups in terms of occupation, see row 4). This differential attrition means that there may well be unobservable differences between treatment and control *bodas*, and thus our estimates of the treatment effects on *bodas* may suffer from selection bias. On the other hand, our estimates of the treatment on male vendors suffer from a tiny sample size.

All in all, the sample of men for whom we have data has much lower validity (both internally and externally) than our sample of market women. To deal with this issue, we perform all our analyses with interaction terms between experimental treatment and type, and we focus our attention on the results for market women.

Finally, a natural question is how representative these individuals are of the general population in the area. Appendix Table A2 explores this, using data collected from a representative sample of unbanked households in a nearby area for

<sup>21</sup> At the same time, many respondents in our Kenya sample were extremely impatient compared to the samples in those two studies. This does not appear to be solely because people did not understand the questions they were asked, or because they did not trust that payouts in the future would be delivered (if chosen). In general, respondents showed similar levels of impatience in the future as in the present, even though all payouts for the future questions would be delivered later (in one or two months, depending on the answer to the question).

<sup>22</sup> One potentially important difference is income (which is higher in treatment than control), particularly since several of our key outcomes are proxies for post-treatment income. Note, however, that the standard deviations of the baseline means are extremely large, and the difference is nowhere close to significant. We do not control for this variable in most specifications because the variable is missing for several respondents. Including it as a control does not change the results, though we lose power due to the reduced sample size. Results with alternative control choices are available upon request.

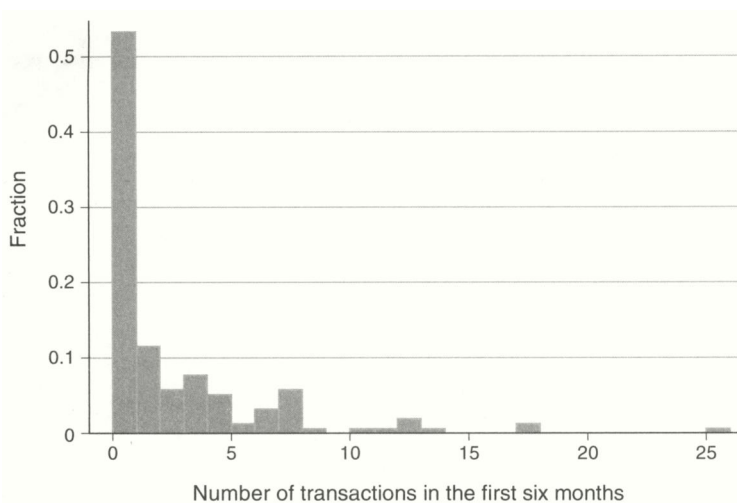


FIGURE 1. NUMBER OF TRANSACTIONS AT VILLAGE BANK IN FIRST SIX MONTHS

*Notes:* Data from 156 individuals offered an account. Those who refused to open an account are coded as having zero transactions.

Dupas et al. (forthcoming), as well as representative samples of unbanked households in rural Uganda and rural Malawi collected for ongoing projects. In column 1, we reproduce the summary statistics shown in Table 1 for our study sample, combining women and men. In columns 2–4, we show the summary statistics for the three other samples. Our respondents are somewhat younger, more likely to be literate, more likely to participate in ROSCAs, and somewhat poorer in terms of durable assets. They are indistinguishable in terms of risk preferences and access to formal credit. Overall, while we acknowledge that our sample is selected, our respondents seem to be relatively comparable to the average rural unbanked adult in East Africa.

## II. Results

### A. Take Up

A total of 156 respondents had the opportunity to open a savings account through this program. Twenty-one of them (13 percent) refused to open the account, while another 40 percent opened an account but never made a single deposit. Figure 1 shows the histogram of the number of transactions made by treatment individuals at the village bank within the first six months of being offered the account. As can be seen, many individuals never used the account or only used it rarely, though others used it regularly.

Figure 2 plots the cumulative distribution functions of the total amount deposited in the account in the first six months, separately by gender. For readability, panel A plots the CDFs below the seventy-fifth percentile, while panel B plots the CDFs above the seventy-fifth percentile. The distribution for men is clearly dominated by the distribution for women, especially at the upper end of the distribution. While

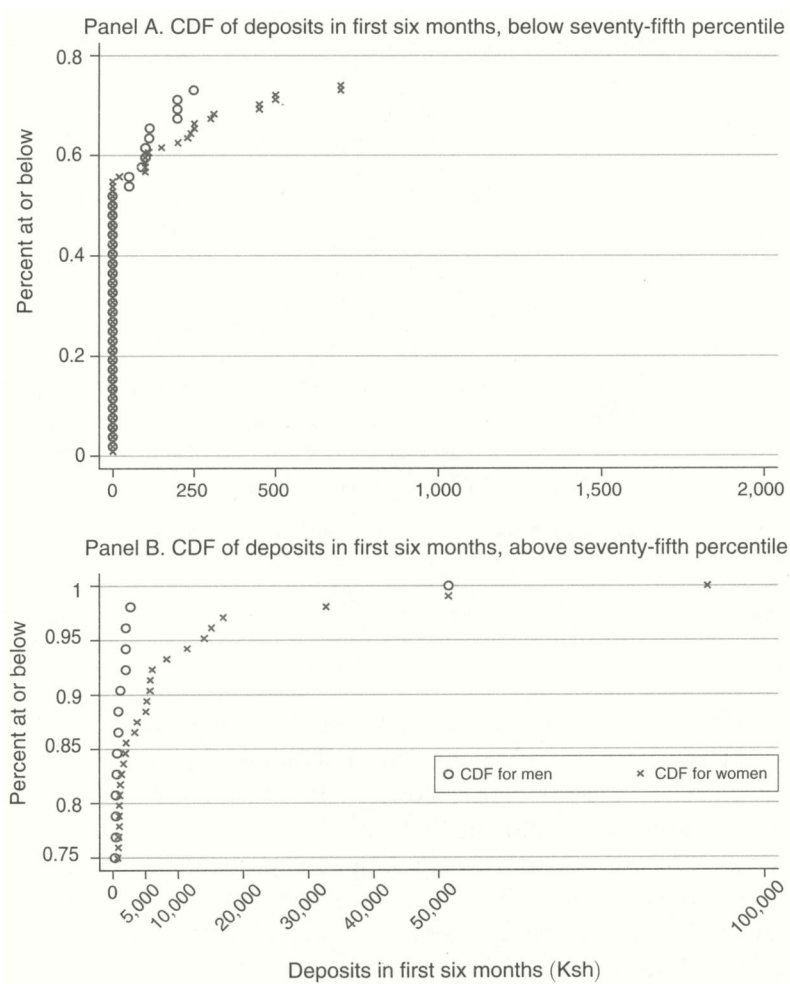


FIGURE 2. CDFs OF TOTAL AMOUNT DEPOSITED IN FIRST SIX MONTHS

*Notes:* Data from 156 individuals offered an account. Those who refused to open an account are coded as having zero deposits. The sample mean of the total deposited in the first 6 months is Ksh 2,500. The mean among those with a non-zero total is Ksh 5,000 (median: Ksh 700).

median deposits are actually Ksh 0 for both genders, the seventy-fifth and ninety-eth percentiles of total deposits are Ksh 350 (US\$5.00) and Ksh 1,200 (US\$17.14) for men, but Ksh 725 (US\$10.35) and Ksh 5,650 (US\$80.71) for women.<sup>23</sup> Mean deposits are more than twice as high for women. They are Ksh 1,290 (US\$18.42) for men and Ksh 2,840 (US\$40.57) for women.

<sup>23</sup>Formally, a Kolmogorov-Smirnov test of the equality of the two distributions returns a *p*-value of 0.12.

### B. Impact: Estimation Strategy

This section estimates the effect of the savings account on average daily savings, business investment, and expenditures. For each outcome, there are two level effects of interest: the intent-to-treat effect (ITT), the average effect of being assigned to the treatment group; and the average effect for those that actively used the account (the Treatment on the Treated or ToT effect).

We first estimate the overall average effect of being assigned to the treatment group (the intent-to-treat effect) on a given outcome  $Y$  using the following specification:

$$Y_{it} = \alpha_1 + \beta_1 T_{it} + \mathbf{X}_i' \phi_1 + \sum_{k=07,09} (\theta_1 year_{it}^k + \vartheta_1 M_i \times year_{it}^k + \lambda_1 M_i \times B_i \times year_{it}^k) + \varepsilon_{1it},$$

where  $T_{it}$  is an indicator equal to 1 if individual  $i$  had been assigned to the treatment group (sampled for an account) in year  $t$ ;  $\mathbf{X}_i$  is a vector of baseline characteristics (including gender and occupation); and  $year_{it}^k$  is a dummy equal to 1 if the logbook data was collected in year  $k$  (2006, 2007, or 2009 in our data). Since the randomization was done after stratifying by occupation, gender, and wave/year, we follow Bruhn and McKenzie (2009) and include the strata dummies  $year_{it}^k$ ,  $M_i \times year_{it}^k$ , and  $M_i \times B_i \times year_{it}^k$ , where  $M_i$  is an indicator equal to one for men and  $B_i$  is an indicator equal to one for bicycle-taxis (*bodas*).

We then add in interaction terms between the treatment and the occupation/gender cells:

$$Y_{it} = \alpha_2 + \beta_2 T_{it} + \gamma_2 T_{it} \times V_i + \delta_2 T_{it} \times B_i + \mathbf{X}_i' \phi_2 + \sum_{k=07,09} (\theta_2 year_{it}^k + \vartheta_2 M_i \times year_{it}^k + \lambda_2 M_i \times B_i \times year_{it}^k) + \varepsilon_{2it},$$

where  $V_i$  is an indicator equal to 1 if the respondent is a male market vendor and, as above,  $B_i$  is an indicator equal to 1 if the respondent is a *boda* (all of whom are males).

In this specification, the coefficient  $\beta_2$  measures the average effect of being assigned to the treatment group for women. The sum  $\beta_2 + \gamma_2$  measures the average effect of being assigned to the treatment group for male vendors, and the sum  $\beta_2 + \delta_2$  measures the average effect of being assigned to the treatment group for male bicycle taxi drivers. Given the random assignment to treatment,  $E(\varepsilon_{2it} | T_{it}) = 0$  and OLS estimates of  $\beta_2$ ,  $\gamma_2$ , and  $\delta_2$  will be unbiased as long as attrition is not differential. As discussed earlier, since attrition was differential for *bodas*, our estimates of  $\delta_2$  may be biased.

Finally, we estimate the average effect of actively using the account using an instrumental variable approach. Specifically, we instrument “actively using the account” with being assigned to the treatment group:

$$\begin{aligned}
 A_{it} &= a + bT_{it} + cT_{it} \times V_i + dT_{it} \times B_i + \mathbf{X}_i' \phi_3 + \omega_{it} \\
 Y_{it} &= \alpha_3 + \beta_3 A_{it} + \gamma_3 A_{it} \times V_i + \delta_3 A_{it} \times B_i + \mathbf{X}_i' \phi_3 \\
 &\quad + \sum_{k=07,09} (\theta_3 year_{it}^k + \vartheta_3 M_i \times year_{it}^k + \lambda_3 M_i \times B_i \times year_{it}^k) + \varepsilon_{3it},
 \end{aligned}$$

where  $A_{it}$  is an indicator of whether individual  $i$  actively used the account in year  $t$ , which we define as having made at least two deposits within six months. The very strong first stage for the IV estimation is presented in the first two columns of Table 2.<sup>24</sup> Overall, 41 percent of the treatment group actively used the account.

In all the tables that follow, panel A presents the ITT estimates, panel B presents the ToT estimates, and panel C presents the means and standard deviations of the dependent variables. For both the ITT and ToT estimates, and for each type of individuals in our sample, the  $p$ -value for the test that the treatment effect is zero is provided at the bottom of the panel. All regressions include the following baseline covariates: marital status, number of children, age, literacy status, ROSCA contributions in the last year, the stratification cells (gender/occupation/wave), and the share of days the log was filled in correctly.<sup>25</sup>

As might be expected, the data from the logbooks is relatively noisy. While most of our main outcomes are not particularly sensitive to extreme values, business outcomes are. For this reason, we present investment outcomes with and without trimming of the top 5 percent of values.<sup>26</sup>

Finally, all the effects for male vendors are very imprecisely estimated due to the very limited size of that subgroup. The confidence intervals for male vendors include both zero and very large effects, and to avoid putting unwarranted weight on these figures, we do not show the coefficient estimates for the interaction between treatment and male vendor ( $\gamma_2$  and  $\gamma_3$ ).

### C. Impact on Savings

Table 2 presents the effects of the account on savings. Columns 1–2 show the “first stage”: the impact of the treatment on being an “active” account user, where

<sup>24</sup>In a previous version of this paper, we used a weaker definition for actively using the account (making at least one deposit). We adopt a stronger approach here because it would be hard to benefit from using the account only once, unless simply having an account affected an individual’s ability to refuse requests for money (e.g., by pretending the money is in the bank and inaccessible, even if it is not). In any case, IV results look very similar with the weaker definition of actively using the account (results available upon request).

<sup>25</sup>The mean of this variable is 95.0 percent, with a standard deviation of 8.8. Reassuringly, this variable does not differ between the treatment and the control groups.

<sup>26</sup>Noise in measures of business outcomes is a common issue in studies of small firms. See, for example, de Mel, McKenzie, and Woodruff 2009a, 2009b; and McKenzie and Woodruff 2008.

TABLE 2—IMPACTS ON SAVINGS

	Active bank account usage (“first-stage”)		Bank savings (Ksh)		Animal savings (Ksh)		ROSCA contributions (Ksh)	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
<i>Panel A. Intention-to-Treat Estimates (ITT)</i>								
Sampled for savings account	0.41 (0.05)***	0.40 (0.06)***	9.36 (3.43)***	11.39 (4.42)**	16.79 (10.05)*	23.26 (14.03)*	7.81 (7.02)	12.57 (10.08)
Sampled for savings account $\times$ <i>Boda</i>		0.06 (0.11)		−12.43 (6.06)**		−20.00 (17.85)		−12.56 (14.10)
Observations	250	250	250	250	250	250	250	250
<i>p</i> -value for overall effect = 0	0.01***		0.01***		0.1*		0.27	
<i>p</i> -value for effect for female vendors = 0		0.01***		0.01**		0.1*		0.21
<i>p</i> -value for effect for <i>bodas</i> = 0		0.01***		0.82		0.75		1.00
<i>Panel B. Instrumental Variable Estimates (ToT)</i>								
Account is active			22.82 (8.51)***	28.77 (11.41)**	40.91 (24.41)*	58.37 (35.09)*	19.03 (17.08)	31.42 (25.11)
Account is active $\times$ <i>boda</i>				−29.35 (13.88)**		−49.40 (40.88)		−30.57 (31.87)
Observations			250	250	250	250	250	250
<i>p</i> -value for overall effect = 0			0.01***		0.1*		0.27	
<i>p</i> -value for effect for female vendors = 0				0.01**		0.1*		0.21
<i>p</i> -value for effect for <i>bodas</i> = 0				0.95		0.67		0.96
<i>Panel C. Mean and standard deviation of dependent variable in control group</i>								
Entire sample: mean			−1.95		3.81		26.30	
standard deviation			30.29		9.16		35.46	
Female vendors: mean				−2.33		3.58		33.27
standard deviation				33.78		9.13		38.76
<i>Bodas</i> : mean				3.96		3.66		5.07
standard deviation				16.61		9.01		7.25

*Notes:* Dependent variables are daily averages. Dependent variables expressed in Kenyan shillings. Controls include occupation, ROSCA contributions in year before baseline, marital status, number of children, age, literacy, the number of weeks in the diary data, and the wave/type stratification cells. Even-numbered columns also include an interaction term between “sampled for savings account” and “male vendor.” The first stage for the IV estimations in panel B are presented in panel A, columns 1–2. Exchange rate was roughly Ksh 70 to the US dollar during the study period. Standard errors in parentheses.

\*\*\*Significant at the 1 percent level.

\*\*Significant at the 5 percent level.

\*Significant at the 10 percent level.

we define active as having made at least two deposits onto the account within the first six months of account opening. Unsurprisingly, we find very large first-stage effects of the treatment assignment.

We then turn to total amounts saved. Columns 3–4 show results for savings in a bank (as measured from the logbook), and the remaining columns measure whether



TABLE 3—IMPACTS ON BUSINESS OUTCOMES

	Total hours worked		Business investment (no trimming)		Business investment (top 5% trimmed)		Business revenues (no trimming)	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
<i>Panel A. Intention-to-Treat Estimates (ITT)</i>								
Sampled for savings account	0.15 (0.37)	0.31 (0.44)	179.71 (105.17)*	203.23 (147.63)	87.37 (46.91)*	90.43 (61.38)	129.32 (100.32)	116.46 (133.34)
Sampled for savings account $\times$ <i>boda</i>		-0.58 (0.88)		-97.03 (222.92)		-30.08 (84.45)		-3.28 (203.17)
Observations	249	249	244	244	244	244	241	241
<i>p</i> -value for overall effect = 0	0.69		0.09*		0.06*		0.20	
<i>p</i> -value for effect for female vendors = 0		0.49		0.17		0.14		0.38
<i>p</i> -value for effect for <i>bodas</i> = 0		0.72		0.50		0.34		0.46
<i>Panel B. Instrumental Variable Estimates (ToT)</i>								
Account is active	0.36 (0.91)	0.77 (1.12)	425.20 (248.32)*	503.85 (365.57)	206.72 (112.18)*	224.49 (154.02)	304.44 (236.81)	289.71 (331.59)
Account is active $\times$ <i>boda</i>		-1.31 (1.94)		-258.45 (490.29)		-86.73 (187.01)		-41.68 (438.13)
Observations	249	249	244	244	244	244	241	241
<i>p</i> -value for overall effect = 0	0.69		0.09*		0.07*		0.20	
<i>p</i> -value for effect for female vendors = 0		0.49		0.17		0.15		0.38
<i>p</i> -value for effect for <i>bodas</i> = 0		0.74		0.44		0.28		0.41
<i>Panel C. Mean and standard deviation of dependent variable in control group</i>								
Entire sample: mean	6.09		296.83		191.08		343.89	
Standard deviation	2.96		487.83		224.20		518.63	
Female vendors: mean		5.78		363.84		239.80		403.43
Standard deviation		3.02		471.69		222.03		560.85
<i>Bodas</i> : mean		7.25		11.30		11.30		96.68
Standard deviation		2.68		8.81		8.81		48.04

Note: See Table 2 notes.

bank savings crowded out other types of savings (animals in columns 5–6 and ROSCA contributions in columns 7–8).<sup>27</sup>

Reported average daily bank savings are significantly higher in the treatment group (column 3), but the treatment effect is heterogeneous (column 4). There is an increase for market women, but not for *bodas*. Market women who accessed an account did not decrease their savings in animals or ROSCAs (if anything, they increased their animal stock), therefore their total savings appear to have increased significantly thanks to the treatment.

#### D. Impact on Business Outcomes

Table 3 presents estimates of the effect of the accounts on labor supply and business outcomes. Business investment for vendors is mostly in the form of inventory, but also includes transportation costs associated with traveling to various

<sup>27</sup> Animal savings are measured as animal purchases less sales, and ROSCA contributions are measured as contributions less payouts.

market centers or shipping goods. Investment for bicycle taxi drivers includes small improvements and repairs to their bicycles.<sup>28</sup>

We find no effect of the account on labor supply, measured as the average number of hours worked per day. However, we find a large effect of the account on the average daily amount invested in the business, significant at the 10 percent level. We find that treated respondents increase investment by Ksh 180, on a base of just Ksh 300. While the overall point estimate is only of marginal significance, it is extremely large (equivalent to a 60 percent increase in investment). Given that many people in the treatment group did not use the account, the IV estimate of the effect on active users is even larger (Ksh 425, or over a 100 percent increase). As with the effect on overall savings, this effect is concentrated among market women, though the treatment effect is not statistically significant at conventional levels for them alone (due to the smaller sample size in that group).

Columns 5 and 6 show the results when the business investment data is trimmed. Trimming of course lowers the mean of the dependent variable. It also attenuates the treatment effect, suggesting that most of the very large values are in the treatment group (as would be expected). Even this conservative estimate shows a very large effect for market women. The average daily investment of female vendors in the treatment group is Ksh 90 (US\$1.28) higher than that of female vendors in the control group (with a  $p$ -value of 0.14). Given the baseline average of Ksh 240 (US\$3.43) in the control group, this effect is equivalent to a 37.5 percent increase in investment. Again, the IV estimate is extremely large.

Overall, these results suggest that the treatment had a substantial effect on market women's ability to invest in their business. This is especially noteworthy given that only a minority of women used the accounts—the effect for those that actually used the accounts is extremely large. Thus, while it is important to further investigate these results in future work with bigger samples and more precise estimates, our results suggest potentially very large effects on business outcomes.

Interestingly, this increase in investment for women does not appear to come from a change in business type. We see no change in the category of items traded by women in the treatment group. We also did not observe a change in the scale (retail versus wholesale) of businesses among women in the treatment group. This means that the market women who benefited from the account simply purchased more from the wholesaler.

We also find an increase in revenues among market women (columns 7–8), but as discussed above, the amounts reported as revenues are typically smaller than the amounts reported for investments, and all in all taking the difference between the treatment impacts on revenues and investments would suggest that the treatment *reduced* profits for market women. We do not consider this as likely. Rather, it seems that revenues were systematically underreported and this underreporting was magnified in the treatment group.

<sup>28</sup> All *bodas* in our sample already owned their bike at baseline.

TABLE 4—IMPAIRS ON EXPENDITURES

	Daily total expenditure		Daily food expenditure		Daily private expenditure		Net transfers outside the household	Net transfers to spouse
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
<i>Panel A. Intention-to-Treat Estimates (ITT)</i>								
Sampled for savings account	23.93 (15.81)	31.17 (19.59)	10.67 (6.41)*	14.46 (8.47)*	8.94 (3.75)**	7.77 (3.98)*	−18.84 (20.86)	4.16 (7.06)
Sampled for savings account × <i>boda</i>		−9.70 (44.42)		−7.78 (15.61)		5.18 (11.63)	17.81 (22.65)	4.01 (9.71)
Observations	250	250	250	250	250	250	249	202
<i>p</i> -value for overall effect = 0	0.13		0.1*		0.02**			
<i>p</i> -value for effect for female vendors = 0		0.11		0.09*		0.05*	0.37	0.56
<i>p</i> -value for effect for <i>bodas</i> = 0		0.58		0.60		0.24	0.86	0.20
<i>Panel B. Instrumental variable estimates (ToT)</i>								
Account is active	58.33 (38.50)	77.97 (48.81)	26.00 (15.46)*	36.20 (21.02)*	21.79 (9.40)**	19.61 (10.18)*	−47.32 (53.01)	11.50 (19.48)
Account is active × male vendor		−141.64 (114.10)		−57.83 (39.79)		−0.22 (28.80)	56.99 (59.72)	−63.07 (75.94)
Account is active × <i>boda</i>	—	30.73 (96.51)		−21.09 (33.92)		8.62 (26.12)	43.53 (54.54)	4.69 (23.65)
Observations	250	250	250	250	250	250	249	202
<i>p</i> -value for overall effect = 0	0.13		0.09*		0.02**			
<i>p</i> -value for effect for female vendors = 0		0.11		0.09*		0.06*	0.37	0.56
<i>p</i> -value for effect for <i>bodas</i> = 0		0.56		0.57		0.25	0.75	0.22
<i>Panel C. Mean and standard deviation of dependent variable in control group</i>								
Entire sample: Mean	163.12		82.04		23.33		6.96	−9.02
Standard deviation	119.69		53.87		23.39		192.44	42.83
Female vendors: Mean		169.14		86.96		21.08	12.03	−26.44
Standard deviation		117.77		54.96		23.44	228.14	35.68
<i>Bodas</i> : Mean		131.21		59.24		25.12	−0.23	21.50
Standard deviation		106.84		31.43		23.77	10.53	18.96

Note: See Table 2 notes.

### E. Impact on Expenditures and Transfers

Table 4 presents estimates of the impact on the average expenditures reported in the logbooks. The first six columns present total, food, and private expenditures (private expenditures include meals in restaurants, sodas, alcohol, cigarettes, own clothing, hairstyling, and entertainment expenses).

We find a positive overall treatment effect. The point estimate for total expenditures is positive, though the *p*-value is only 0.13. More disaggregated expenditure categories reveal large increases for some items. Across the whole sample, food expenditures increased by 13 percent, while private expenditures increased

by 38 percent. These imply even larger effects for account users (of 32 percent and 93 percent, respectively).<sup>29</sup> As in the previous tables, these effects are driven by market women.

The last four columns of Table 4 look at the impacts on transfers to and from others. Transfers include both cash and in-kind transfers of goods and services (as valued by the respondent). We look at net transfers to individuals outside the household and net transfers to the spouse (for married/cohabiting respondents). The point estimates suggest a decrease in net transfers outside the household and no effect on interspousal transfers, but the results are very imprecise, with large standard errors, and even for interhousehold transfers, we cannot reject the null of zero effect.

### *F. Robustness Checks*

There are several possible threats to the internal validity of this study. In the Appendix, we consider two potentially important concerns: that the results might be driven by people who were anticipating a later loan from the village bank, and that the results might be driven by people making large deposits (who presumably do not have a problem saving in the first place since they deposit so much at any one time). We find no evidence for either of these alternatives, and so we feel confident that our main results reflect the impact of savings services alone for people who otherwise find it hard to save as much as they would like.

## **III. Discussion of Potential Mechanisms**

Overall, our results show that the informal savings mechanisms available in rural Kenya are ineffective in allowing a sizeable fraction of market women to save (and subsequently invest) as much as they would like. These results raise two questions: First, why do market women need a savings account when it seems like they could instead simply reinvest immediately in their business—why do they put money into the savings account at all? Second, why is the private return to informal savings so highly negative for a large fraction of the market women in our sample? Since our data does not enable us to conclusively answer these questions, we instead use this section to make some conjectures as to possible answers and areas to further investigate.

With regard to the first question, we see three possible reasons why business owners may have to save at home or in a bank account, even if the returns are negative, rather than continuously reinvest in their business. The first is that investment may be lumpy, so that entrepreneurs cannot reinvest in their business until they have saved up for the next discrete unit. Instead, they must save outside of the business for some time before they can reinvest.<sup>30</sup> The second is that business profits may be variable, but at least partially foreseeable by entrepreneurs, so that there

<sup>29</sup>The returns to capital would have to be implausibly large for this increase in expenditure to be entirely due to an increase in business income. Given this, the increase in expenditure likely comes from both an increase in income and an increase in the ability to shield income from others.

<sup>30</sup>For this channel to be at play, deposits have to be smaller than the investment “lump.” To check this, Figure 3 plots a CDF of average deposits, withdrawals, and investment (excluding zeros) for market women in our sample.

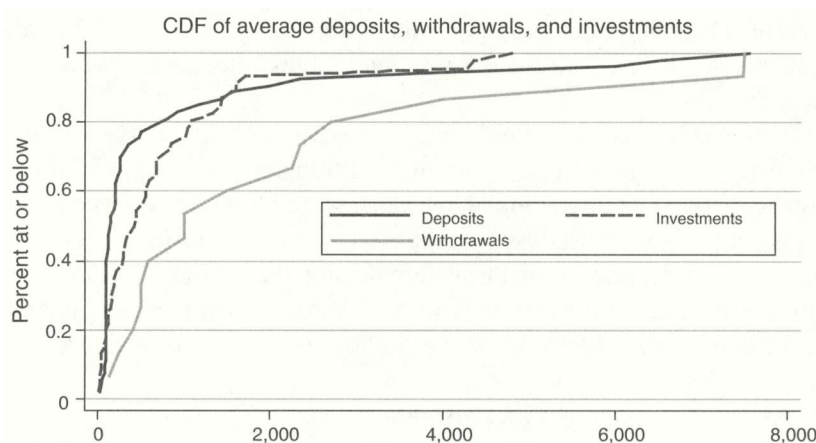


FIGURE 3. CDF OF DEPOSITS, WITHDRAWALS, AND INVESTMENTS (IN KSH) FOR FEMALE VENDORS

*Note:* Figure shows average deposits, withdrawals, and investments for female vendors in the treatment group.

are periods in which it is optimal to save money outside the business. The third is that it might not be possible to quickly and costlessly liquidate working capital if a shock were to occur. If people face credit constraints, the liquidity costs of holding capital uniquely in the business might make it necessary for people to save against unanticipated shocks (such as illness) outside the business.

With regard to the second question, we see two broad explanations for why market women in our sample could not save enough without formal savings devices. First, these women may have present-biased preferences, and thus may be tempted to spend any cash money that they hold (Laibson 1997; Gul and Pesendorfer 2001, 2004). Second, these women may face regular demands on their income from relatives or neighbors (Platteau 2000), or from their husbands (Ashraf 2009). In either case, keeping money at the bank, where it is not immediately accessible, might increase total savings.

Both phenomena have been shown to be at play in our study area. Duflo, Kremer, and Robinson (2011) show that time-inconsistent preferences limit profitable investments in fertilizer by farmers in Western Kenya. Also in Western Kenya, Dupas and Robinson (forthcoming) show that money demands from others form an important barrier to preventative health investments. However, the effectiveness of a savings product in overcoming these two barriers depends on the type of commitment or earmarking it provides. In Dupas and Robinson (forthcoming), we show that while pressure to share with others can be somewhat overcome with a simple savings technology, such as a box with a lock and key, overcoming time-inconsistent preferences requires a savings technology with a strong commitment feature, such as a ROSCA.

---

Average deposits are clearly dominated by investment (and investment is dominated by withdrawals). This suggests that market women in our sample saved up relatively small amounts to deposit, and then withdrew in bigger sums.

Which of these two barriers mattered in our sample? The way accounts were used provide some insights. The frequency of transactions was relatively low, and the median deposit size was relatively large (the average deposit size for the median woman who actively used the account was equivalent to about 1.6 days of average expenditures.) This, combined with the fact that the bank closed at 3 PM (well before work ends for most market vendors), makes it clear that market women did not build up savings balances by depositing small amounts of money every night after work, but instead saved up for some time and then deposited larger sums. This suggests that the basic savings accounts provided in the study were not likely to be useful to solve a hyperbolic discounting problem. Rather, market women may have been using the accounts to protect their income from demands from friends and family. For instance, women may get asked for money by extended family and may feel socially obligated to give something if the money is readily accessible, but these requests might be relatively infrequent (every few weeks, for example). If so, and if it is costly (in terms of time and effort) to go to the bank, it may be rational to only go to the bank every few weeks, rather than every day.<sup>31</sup>

To provide further evidence on potential mechanisms, Table 5 looks at determinants of account usage. We restrict the sample to those ever offered an account, and regress the log of the sum of total deposits in the first six months on baseline characteristics. To include those who made no deposits, we add one to the sum of total deposits, such that for those who made zero deposits, the dependent variable is zero. The coefficients on female vendor is large and significant (relative to the omitted category—*bodas*),<sup>32</sup> but its magnitude (and even sign) change as covariates are added, suggesting that the female vendor effect can be explained by observable characteristics. In particular, usage is very strongly positively correlated with ROSCA participation, which is higher among female vendors.<sup>33</sup> Account usage is also very strongly correlated with wealth (measured in the value of animals and

<sup>31</sup> In qualitative surveys, people report that it is easier to say “no” to friends and relatives asking for money when the money is saved in a bank than when money is saved in the house. This suggests that generosity toward friends and relatives might often be “involuntary”—people give money to avoid having to lie about money availability (to avoid a feeling of guilt), but if the money is truly not available at home, people do not feel guilty saying they have no money available. This is consistent with lab experiments showing that, in dictator games, dictators are willing to sacrifice part of the total prize to opt out of the game, provided that the decision is not revealed to recipients (Dana, Cain, and Dawes 2006). This opting-out behavior is particularly common among dictators who appear “generous” when the silent opt-out option is not available (Broberg, Ellingsen, and Johannesson 2007), suggesting that guilt or shame, rather than altruism, is at the source of the high generosity levels typically observed in dictator games.

<sup>32</sup> Note that a dummy for male vendor is included in this regression, but the coefficient is not shown.

<sup>33</sup> Given the correlation between ROSCA participation and active use of the account, the fact that ROSCA contributions among market women were not crowded out by the accounts (Table 2) could be surprising, especially since savings are more quickly and reliably accessible when placed in a formal account than with a ROSCA. We can think of various possible explanations for why this is the case, however. First of all, ROSCA cycles can be long (up to 18 months), so our data might be too medium-run to capture changes in participation. Secondly, ROSCAs typically offer more than just savings to their participants. In particular, many ROSCAs offer loans (in addition to the regular pot) to their participants, and often also provide some emergency insurance. A census of ROSCAs we conducted in the area of study suggests that 64 percent of ROSCAs offer loans to their members, and 54 percent offer insurance in case of a funeral or other catastrophic events (Dupas and Robinson forthcoming). Finally, while bank savings are made individually, ROSCA contributions are made in a group. The social aspect of ROSCAs may provide some form of commitment, either through social pressure to keep contributing (Gugerty 2007) or from the regular schedule of payments. For these reasons, a formal savings account might only be an imperfect substitute for ROSCA participation.

TABLE 5—DETERMINANTS OF ACCOUNT USAGE WITHIN SIX MONTHS OF ACCOUNT OPENING

	Log (1+ total deposited in Ksh)		
	(1)	(2)	(3)
<i>Background characteristics</i>			
Female vendor	1.600 (0.816)*	−0.805 (2.027)	−0.190 (2.042)
Years of education		−0.033 (0.121)	−0.082 (0.124)
Literate (can read and write Swahili)		−0.889 (0.865)	−0.728 (0.868)
Age		0.000 (0.034)	−0.016 (0.034)
Married		−1.870 (2.010)	−0.802 (2.033)
Female vendor × married		1.675 (2.133)	0.694 (2.159)
Value of ROSCA contributions in year prior to baseline (in Ksh 1,000)		0.140 (0.051)***	0.162 (0.053)***
Value of animals owned (in Ksh 1,000)		0.077 (0.031)**	0.063 (0.032)**
Value of durable goods owned (in Ksh 1,000)		0.103 (0.046)**	0.130 (0.047)***
<i>Risk aversion</i>			
Amount invested (out of Ksh 100) in risky asset			−1.788 (1.463)
<i>Patience (current period)</i>			
Somewhat patient			1.028 (1.129)
<i>Time-Inconsistency</i>			
Present-biased			−0.137 (1.073)
Observations	153	149	149
R <sup>2</sup>	0.08	0.25	0.31
Mean of dependent variable	3.150	3.156	3.156

*Notes:* The dependent variable is the log of the sum (in Kenyan shillings) of all deposits made within six months of account opening plus one (to include those who did not make any deposits). Sample restricted to respondents sampled for an account, and for whom we have logbook data. The risk aversion and time discounting questions are missing for 33 respondents, so we include them by assigning them a value of 0 and including a dummy for missing that question. See the notes to Table 1 for definitions of risk and time-preferences variables. The excluded time consistency category is “time consistent.” The regression includes dummies (not shown) for other time consistency categories. See Figure 1 for a histogram of total transactions. Standard errors in parentheses.

\*\*\*Significant at the 1 percent level.

\*\*Significant at the 5 percent level.

\*Significant at the 10 percent level.

durable goods owned), suggesting that the accounts were mostly useful for people somewhat further above subsistence.

We include controls for risk and time preferences in column 3 of Table 5.<sup>34</sup> Risk aversion is correlated with usage. Less risk-averse individuals were less likely to use the accounts, pointing to a possible consumption smoothing rationale for usage. More patient people appear more likely to save, although the effect is insignificant. In terms of the time consistency measures, we find that respondents who exhibit present-biased preferences were not more likely to deposit money than the omitted time-consistent group. This is not surprising since the savings account we subsidized offered a commitment device to avoid spending money once it had been deposited, but was not accompanied by a commitment to make regular deposits. Present-biased individuals might have had a difficult time committing themselves to making regular trips to the bank.

#### IV. Conclusion

The experiment described in this paper provides strong evidence that a sizeable fraction of micro-entrepreneurs in rural Kenya face major savings constraints. These constraints are so strong that around 40 percent of market women decided to take up savings accounts that offered a negative real interest rate. This result suggests that the alternative savings opportunities that market women face offer an expected return even more negative.

Market women use these accounts to save up to increase the size of their business and increase their private expenditures. However, the accounts had minimal effects for the other group of daily income earners in our sample (bicycle-taxi drivers), who did not use the accounts at all. One interpretation of this finding is that these men were able to save at home more securely, and so did not need accounts with such low returns. However, we prefer not to draw any conclusions regarding that subgroup, because there was differential attrition between the treatment and control arms among them, and we cannot rule out that there were differences in unobservable characteristics between the two arms.

Given the large impacts we estimate for at least a third of the market women in our sample, a natural question is why market women did not open up accounts on their own, prior to our study. This seems to be because the bank we worked with (the only bank in town) was relatively new and poorly known at baseline. This is consistent with recent evidence that levels of familiarity with and trust in financial institutions are relatively low in rural Kenya, due to a long history of financial scandals of various sorts, as well as unreliable service provision (Dupas et al. forthcoming). The bank we partnered with was reliable, however, and therefore take-up of accounts should have increased over time. Indeed, the number of account holders at the bank increased by 200 percent between 2007 and 2011, from around 1,300 to 4,000.

Overall, our findings suggest that extending basic banking services could have large effects at relatively small cost, especially relative to credit alone. However,

<sup>34</sup> As discussed earlier, note that these measures should be taken with some caution as they were measured ex post for a large part of the sample.



there are several major caveats to this result. The most important is that our sample is relatively small and composed entirely of two specific types of income earners, so more work needs to be done to examine whether the results generalize to other individuals in other settings.

Another important caveat is that while we document savings constraints at the individual level, the general equilibrium effects of extending savings to the entire unbanked population remain unclear. It is possible that the market women in our treatment group grew their business at the expense of neighboring businesses. Even beyond this, the accounts could have changed the nature of informal insurance networks. For example, if informal insurance is constrained by a limited commitment constraint, the accounts could have changed participation in informal insurance by effecting the value of autarky for treatment individuals (Ligon, Thomas, and Worrall 2000). To estimate such general equilibrium effects, one would have to randomize access to financial services at the village level (rather than the individual level), or to exploit gradual expansion of formal saving services across villages (which is difficult since bank expansion typically brings both saving and credit services at the same time, as in Burgess and Pande 2005, or Bruhn and Love 2009). This is outside the scope of this study, which aimed to first establish the extent to which saving constraints are binding at the individual level, but we believe that studying the importance of savings constraints at a more aggregate level is an important issue for future work.

Our findings also raise a number of issues about the pathways through which formal bank accounts helped market women in our sample. First, are the savings constraints implied by our results due primarily to social pressure to share resources, or to self-control problems? Second, to what extent do intra-household (interspousal) conflicts in preferences explain our results?

Finally, a particularly important question is why more than half of the individuals in the treatment group did not actively take up these accounts. Is it because they do not have savings problems, or is it because this particular saving device was not well suited to their needs, for example, because it did not offer a strong commitment feature? One clue is that 92 percent of those that were offered accounts but who did not actively use them report that “it is hard to save at home,” which suggests that they, too, face barriers to savings. Given the dearth of savings and credit opportunities currently available in sub-Saharan Africa, more work is needed to understand which saving services or devices are best suited to these individuals.

## APPENDIX: ROBUSTNESS CHECKS

### *A. Excluding Those Who Might Have Anticipated Receiving a Loan*

Like many microfinance institutions, the village bank we worked with offers both savings and credit products. Once people have an account with the bank, they can become eligible for a loan. To qualify for a loan, an individual must first purchase a share in the bank. Three months after purchasing a share, an individual is eligible to apply for a loan (the maximum amount is a multiple of the amount

of share capital owned). Clearly, if many treatment individuals had gotten loans during the study period, this would likely bias our estimated impacts of expanding access to savings alone. Since only a small number of individuals in our sample actually got loans (only 1.6 percent of respondents got loans within a year), this is not a major concern.

That said, it remains theoretically possible that some individuals in our treatment group expected such loans in the future and were able to borrow working capital from friends and relatives in the short run, in anticipation of a bank loan (and presumably, higher future profits) later. This is probably very unlikely in this case, since it is difficult for people to access credit informally even if they have physical assets as collateral, and possible future access to credit was not at all guaranteed by getting access to an account. Nevertheless, we formally explore the impact of these individuals on our estimated impacts in Appendix Table A3. In this Table, we replicate the analysis presented in Tables 3 and 4, after excluding from the sample those who received a loan from the bank within a year after the account opening (note that this is overly strong, since the logbooks were collected four to six months after opening). This reduces the sample size and increases the size of the standard errors, but all the coefficients have the same magnitude and sign as they do in Tables 3 and 4, suggesting that the effects observed on investment and expenditures are not driven by loans or the anticipation of loans.

### B. *Size of Deposits*

As can be inferred from Figure 1, even those individuals who actively used the account did not make many transactions. For instance, the median number of deposits made in the first 6 months among respondents who actively used the account was just 4.6. This means that the average deposit size was large. The median among active women was about Ksh 300 (US\$4.30), which is equivalent to about 1.6 days of mean expenditures for women in the sample. For some women, the average deposit size was much larger than this.

By definition, those who make very large deposits must be able to save up at home, and therefore should not particularly benefit from the accounts. To check this, we run our main regressions while excluding those whose average deposit size was larger than the median deposit in the sample. The results are presented in Appendix Table A4. Although removing half of the treatment group considerably reduces statistical power, we obtain coefficients on the treatment effects of similar magnitude in this specification as in Tables 3 and 4.

## APPENDIX

TABLE A1—SAMPLING FRAME

	"Female vendors" (1)	Bicycle taxi drivers ("bodas") (2)	Male vendors (3)	Total (4)
<i>Panel A. Sample Frame: Total number of people interviewed at baseline</i>				
TOTAL	262	96	34	392
Assigned to Control	132	48	17	197
Assigned to Treatment	130	48	17	195
Wave 1	46	64	0	110
Assigned to Control	23	32		55
Assigned to Treatment	23	32		55
Wave 2	65	32	23	120
Assigned to Control	33	16	12	61
Assigned to Treatment	32	16	11	59
Wave 3	151	0	11	162
Assigned to Control	76		5	81
Assigned to Treatment	75		6	81
<i>Panel B. Number of people still in the sample at the time the Logbooks were introduced</i>				
TOTAL	200	74	27	301
Control	111	34	17	162
Treatment	89	40	10	139
Wave 1	32	43	0	75
Control	16	18		34
Treatment	16	25		41
Wave 2	65	31	22	118
Control	33	16	12	61
Treatment	32	15	10	57
Wave 3	103	0	5	108
Control	62		5	67
Treatment	41		0	41
<i>Panel C. Study Sample: Total number of people that completed Logbooks</i>				
TOTAL	170	55	25	250
Control	96	24	15	135
Treatment	74	31	10	115
Wave 1	26	35	0	61
Control	16	14		30
Treatment	10	21		31
Wave 2	54	20	21	95
Control	30	10	11	51
Treatment	24	10	10	44
Wave 3	90	0	4	94
Control	50		4	54
Treatment	40		0	40
<i>Panel D. Compliance with Treatment among those assigned to Treatment Group</i>				
Total that could not be traced for account offer	26	8	5	39
Total offered account	104	40	12	156
Total that refused account offer	15	4	2	21
Total that opened account	89	36	10	135

*Notes:* Attrition from the sample between the baseline and the introduction of the logbook (the drop from panel A to panel B) was due to relocation of respondents outside of the study area. This type of attrition was higher for Wave 3 and Wave 1 than Wave 2, because the gap between baseline and the rollout of the logbook was much longer (14 months on average for Wave 3 and 9 months for Wave 1) compared to Wave 2 (5 months). Attrition in the logbook sample (the drops from panel B to panel C) was due to refusals.

TABLE A2—COMPARISON BETWEEN STUDY SAMPLE AND REPRESENTATIVE SAMPLES OF UNBANKED HOUSEHOLDS IN RURAL EAST AFRICA

	Our study sample 2006–2008 (1)	Western Kenya: census of unbanked households in 3 villages Fall 2009 <sup>a</sup> (2)	Central Uganda: unbanked households in 19 parishes Fall 2010 <sup>b</sup> (3)	Southern Malawi: unbanked households in 72 villages Spring 2011 <sup>b</sup> (4)
<i>Demographics</i>				
Age	33.71 (10.48)	40.15 (16.72)	36.29 (12.00)	39.55 (19.07)
Married	0.71	0.70	0.71	0.73
Number of children	3.31 (2.23)	3.35 (2.34)	5.05 (3.04)	2.67 (1.74)
Education	6.34 (3.19)	5.95 (3.38)	5.50 (2.97)	5.60 (2.91)
Literate	0.74	0.51	0.76	0.61
Participates in ROSCA	0.74	0.40	0.23	0.06
ROSCA contributions in last year (in USD)	53.83 (72.88)	60.07 (102.22)	36.65 (58.36)	33.15 (49.48)
Value of animals owned (in USD)	69.01 (132.62)	69.99 (171.45)	122.88 (612.20)	61.52 (120.35)
Value of durable goods owned (in USD)	71.13 (152.96)	126.30 (131.36)	269.57 (1054.84)	123.48 (362.68)
Received loan from bank in past year <sup>c</sup>	0.04	0.05	0.06	0.06
<i>Risk preferences</i>				
Percent invested in risky asset <sup>d</sup>	0.64	0.59	0.63	0.72
<i>Cognitive skills</i>				
Raven's matrix score (percent correct)	0.49	—	—	0.44
Observations	250	2,390	2,160	2,252

<sup>a</sup> Data from Dupas et al. forthcoming.<sup>b</sup> Data from ongoing projects by authors.<sup>c</sup> In Uganda, this is coded as whether the respondent ever applied for a loan.<sup>d</sup> Size of risky asset varied across surveys: Kenya—\$1.25; Uganda—\$0.44; Malawi—\$0.80. The amount invested in the risky asset was multiplied by 4 with probability 0.5 and was lost with probability 0.5.

TABLE A3—EXCLUDING THOSE INDIVIDUALS THAT WERE PLANNING FOR A LOAN

	Amount invested in business			Total expenditures		Food expenditures	Private expenditures
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Trimming	None	None	Top 5%	None	None	None	None
<i>Panel A. Intention-to-Treat Estimates (ITT)</i>							
Sampled for savings account	188.19 (106.09)*	219.53 (150.66)	86.50 (62.54)	20.30 (15.46)	24.82 (18.74)	12.50 (7.91)	6.58 (3.90)*
Sampled for savings account $\times$ <i>boda</i>		-128.51 (229.88)	-25.56 (86.20)		-0.01 (43.11)	-5.43 (14.74)	7.25 (11.53)
Observations	240	240	240	246	246	246	246
<i>p</i> -value for overall effect = 0	0.077*			0.191			
<i>p</i> -value for effect for women = 0		0.146	0.168		0.187	0.115	0.093*
<i>p</i> -value for effect for <i>bodas</i> = 0		0.567	0.337		0.517	0.570	0.207
<i>Panel B. Mean and standard deviation of dependent variable in control group</i>							
Female vendors:	352.01		240.84	167.13		84.42	21.22
Mean							
Standard deviation	(460.03)		(224.20)	(115.77)		(48.19)	(23.66)
<i>Bodas</i> : Mean	11.30		11.30	131.21		59.24	25.12
Standard deviation	(8.81)		(8.81)	(106.84)		(31.43)	(23.77)

Note: See Table 2 notes.

TABLE A4—EXCLUDING THOSE MAKING LARGE DEPOSITS

	Amount invested in business			Total expenditures		Food expenditures	Private expenditures
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Trimming	None	None	Top 5%	None	None	None	None
<i>Panel A. Intention-to-Treat Estimates (ITT)</i>							
Sampled for savings account	161.17 (133.64)	249.18 (207.54)	91.77 (77.90)	28.19 (17.33)	34.37 (21.40)	14.08 (8.47)*	9.12 (4.71)*
Sampled for savings account $\times$ <i>boda</i>		-306.72 (242.83)	-93.71 (75.11)		7.63 (48.23)	1.47 (16.38)	9.56 (13.19)
Observations	211	211	211	217	217	217	217
<i>p</i> -value for overall effect = 0	0.229			0.105			
<i>p</i> -value for effect for women = 0		0.231	0.240		0.110	0.098*	0.054*
<i>p</i> -value for effect for <i>bodas</i> = 0		0.398	0.921		0.318	0.254	0.132
<i>Panel B. Mean and standard deviation of dependent variable in control group</i>							
Female vendors: Mean	363.84		239.80	169.14		86.96	21.08
Standard deviation	(471.69)		(222.03)	(117.77)		(54.96)	(23.44)
<i>Bodas</i> : Mean	11.30		11.30	131.21		59.24	25.12
Standard deviation	(8.81)		(8.81)	(106.84)		(31.43)	(23.77)

Note: See Table 2 notes.

## REFERENCES

- Aggarwal, Shilpa, Leora Klapper, and Dorothe Singer. 2011. "Financing Businesses in Africa: The Role of Microfinance." World Bank Policy Research Working Paper 5975.
- Aportela, Fernando. 1999. "Effects of Financial Access on Savings by Low-Income People." Unpublished.
- Ashraf, Nava. 2009. "Spousal Control and Intra-Household Decision Making: An Experimental Study in the Philippines." *American Economic Review* 99 (4): 1245–77.
- Ashraf, Nava, Dean Karlan, and Wesley Yin. 2006. "Tying Odysseus to the Mast: Evidence from a Commitment Savings Product in the Philippines." *Quarterly Journal of Economics* 121 (2): 635–72.
- Attanasio, Orazio, Britta Augsburg, Ralph De Haas, Emla Fitzsimons, and Heike Harmgart. 2012. "Group Lending versus Individual Lending in Mongolia." Working Paper.
- Banerjee, Abhijit, Esther Duflo, Rachel Glennerster, and Cynthia Kinnan. 2009. "The Miracle of Microfinance? Evidence from a Randomized Evaluation." <http://economics.mit.edu/files/4162>.
- Bauer, Michal, Julie Chytilová, and Jonathan Morduch. 2010. "Behavioral Foundations of Microcredit: Experimental and Survey Evidence." Institute for the Study of Labor (IZA) Discussion Paper 4901.
- Broberg, Tomas, Tore Ellingsen, and Magnus Johannesson. 2007. "Is Generosity Involuntary?" *Economics Letters* 94 (1): 32–37.
- Bruhn, Miriam, and Inessa Love. 2009. "The Economic Impact of Banking the Unbanked: Evidence from Mexico." World Bank Policy Research Working Paper 4981.
- Bruhn, Miriam, and David McKenzie. 2009. "In Pursuit of Balance: Randomization in Practice in Development Field Experiments." *American Economic Journal: Applied Economics* 1 (4): 200–232.
- Burgess, Robin, and Rohini Pande. 2005. "Do Rural Banks Matter? Evidence from the Indian Social Banking Experiment." *American Economic Review* 95 (3): 780–95.
- Chaia, Alberto, Aparna Dalal, Tony Goland, Maria Jose Gonzalez, Jonathan Morduch, and Robert Schi. 2009. "Half the World is Unbanked." Financial Access Initiative, October. <http://www.microfinancegateway.org/gm/document-1.9.40671/25.pdf>.
- Charness, Gary, and Garance Genicot. 2009. "Informal Risk Sharing in an Infinite-Horizon Experiment." *Economic Journal* 119 (537): 796–825.
- Cole, Shawn, Thomas Sampson, and Bilal Zia. 2011. "Prices or Knowledge? What Drives Demand for Financial Services in Emerging Markets?" *Journal of Finance* 66 (6): 1933–67.
- Collins, Daryl, Jonathan Morduch, Stuart Rutherford, and Orlanda Ruthven. 2009. *Portfolios of the Poor: How the World's Poor Live on \$2 a Day*. Princeton: Princeton University Press.
- Crépon, Bruno, Florencia Devoto, Esther Duflo, and William Parienté. 2011. "Impact of Microcredit in Rural Areas of Morocco: Evidence from a Randomized Evaluation." <http://economics.mit.edu/files/6659>.
- Dana, J., D. M. Cain, and R. M. Dawes. 2006. "What You Don't Know Won't Hurt Me: Costly (But Quiet) Exit in Dictator Games." *Organizational Behavior and Human Decision Processes* 100 (2): 193–201.
- Daniels, Lisa. 2001. "Testing Alternative Measures of Microenterprise Profits and Net Worth." *Journal of International Development* 13 (5): 599–614.
- de Mel, Suresh, David J. McKenzie, and Christopher Woodruff. 2008. "Returns to Capital in Microenterprises: Evidence from a Field Experiment." *Quarterly Journal of Economics* 123 (4): 1329–72.
- de Mel, Suresh, David J. McKenzie, and Christopher Woodruff. 2009a. "Measuring Microenterprise Profits: Must We Ask How the Sausage Is Made?" *Journal of Development Economics* 88 (1): 19–31.
- de Mel, Suresh, David J. McKenzie, and Christopher Woodruff. 2009b. "Are Women More Credit Constrained? Experimental Evidence on Gender and Microenterprise Returns." *American Economic Journal: Applied Economics* 1 (3): 1–32.
- de Soto, Hernando. 1989. *The Other Path: The Invisible Revolution in the Third World*. New York: Harper and Row.
- Duflo, Esther, Michael Kremer, and Jonathan Robinson. 2011. "Nudging Farmers to Use Fertilizer: Theory and Experimental Evidence from Kenya." *American Economic Review* 101 (6): 2350–90.
- Dupas, Pascaline, Sarah Green, Anthony Keats, and Jonathan Robinson. 2012. "Challenges in Banking the Rural Poor: Evidence from Kenya's Western Province." National Bureau of Economic Research (NBER) Working Paper 17851.
- Dupas, Pascaline, and Jonathan Robinson. Forthcoming. "Why Don't the Poor Save More? Evidence from Health Savings Experiments." *American Economic Review*.

- Dupas, Pascaline, and Jonathan Robinson. 2013. "Savings Constraints and Microenterprise Development: Evidence from a Field Experiment in Kenya: Dataset." *American Economic Journal: Applied Economics*. <http://dx.doi.org/10.1257/app.5.1.163>.
- Gugerty, Mary Kay. 2007. "You Can't Save Alone: Commitment in Rotating Savings and Credit Associations in Kenya." *Economic Development and Cultural Change* 55 (2): 251–82.
- Gul, Faruk, and Wolfgang Pesendorfer. 2001. "Temptation and Self-Control." *Econometrica* 69 (6): 1403–35.
- Gul, Faruk, and Wolfgang Pesendorfer. 2004. "Self-Control and the Theory of Consumption." *Econometrica* 72 (1): 119–58.
- International Monetary Fund. 2010. *World Economic Outlook Database*. <http://www.imf.org/external/pubs/ft/weo/2010/01/weodata/index.aspx>. (accessed November 7, 2012).
- Johnston, Don, Jr., and Jonathan Morduch. 2008. "Symposium on Access to Finance: The Unbanked: Evidence from Indonesia." *World Bank Economic Review* 22 (3): 517–37.
- Kaboski, Joseph P., and Robert M. Townsend. 2005. "Policies and Impact: An Analysis of Village-Level Microfinance Institutions." *Journal of the European Economic Association* 3 (1): 1–50.
- Kaboski, Joseph P., and Robert M. Townsend. 2011. "A Structural Evaluation of Large-Scale Quasi-Experimental Microfinance Initiative." *Econometrica* 79 (5): 1357–1406.
- Karlan, Dean, and Jonathan Zinman. 2010a. "Expanding Credit Access: Using Randomized Supply Decisions to Estimate the Impacts." *Review of Financial Studies* 23 (1): 433–64.
- Karlan, Dean, and Jonathan Zinman. 2010b. "Expanding Microenterprise Credit Access: Using Randomized Supply Decisions to Estimate the Impacts in Manila." Unpublished.
- Kendall, Jake, Nataliya Mylenko, and Alejandro Ponce. 2010. "Measuring Financial Access around the World." World Bank Policy Research Working Paper 5253.
- Laibson, David. 1997. "Golden Eggs and Hyperbolic Discounting." *Quarterly Journal of Economics* 112 (2): 443–77.
- Liedholm, Carl. 1991. "Data Collection Strategies for Small-Scale Industry Surveys." Growth and Equity through Microenterprise Investments and Institutions (GEMINI) Working Paper 11.
- Ligon, Ethan, Jonathan P. Thomas, and Tim Worrall. 2000. "Mutual Insurance, Individual Savings, and Limited Commitment." *Review of Economic Dynamics* 3 (2): 216–46.
- McKenzie, David, and Christopher Woodruff. 2008. "Symposium on Access to Finance: Experimental Evidence on Returns to Capital and Access to Finance in Mexico." *World Bank Economic Review* 22 (3): 457–82.
- Platteau, Jean-Philippe. 2000. "Egalitarian Norms and Economic Growth." In *Institutions, Social Norms and Economic Development*, edited by Jean-Philippe Platteau, 189–240. Amsterdam: Harwood Academic Publishers.
- Rutherford, Stuart. 2000. *The Poor and Their Money*. Oxford, UK: Oxford University Press.
- Strauss, John, and Duncan Thomas. 1995. "Human Resources: Empirical Modeling of Household and Family Decisions." In *Handbook of Development Economics*, Vol. 3A, edited by J. Behrman and T. N. Srinivasan, 1883–2023. Amsterdam: North-Holland Press.
- Thaler, Richard H., and Shlomo Benartzi. 2004. "Save More Tomorrow: Using Behavioral Economics to Increase Employee Saving." *Journal of Political Economy* 112 (1): S164–87.
- World Bank. 2004. *World Bank Development Report 2005: A Better Investment Climate for Everyone*. Oxford University Press. New York, September.