

Hoping to Win, Expected to Lose: Theory and Lessons on Microenterprise Development

Dean Karlan, Ryan Knight, and Christopher Udry

Abstract

We show how financial and managerial constraints impede experimentation and thus limit learning about the profitability of investments. Imperfect information about one's own type, but willingness to experiment to learn one's type, leads to short-run negative expected returns to investments, with some outliers succeeding. We find in an experiment that entrepreneurs invest randomized grants of cash and adopt advice from randomized grants of consulting services, but both lead to lower profits on average. In the long run, they revert back to their prior scale of operations. In a meta-analysis, results from 19 other experiments find mixed support for this theory.

JEL Codes: D21, D24, D83, D92, L20, M13, O12

Keywords: entrepreneurship, credit constraints, business training, consulting, managerial capital.

Hoping to Win, Expected to Lose: Theory and Lessons on Microenterprise Development

Dean Karlan
Yale University and MIT Jameel Poverty Action Lab

Ryan Knight
Yale University

Christopher Udry
Yale university

Contact information: dean.karlan@yale.edu (Yale University, Innovations for Poverty Action, M.I.T. Jameel Poverty Action Lab, and NBER); ryan.knight@yale.edu (Yale University and Innovations for Poverty Action), and christopher.udry@yale.edu (Yale University). The authors thank USAID-BASIS and the Bill and Melinda Gates Foundation for funding, Matt Hoover for project management and research assistance, the field staff at Innovations for Poverty Action (IPA) for survey and project management, and the IPA Ghana country directors, Justin Oliver, Kelly Bidwell and Jessica Kiessel. The authors thank the Ernst and Young Ghana office for their collaboration, including subsidizing the consulting rates. Institutional Review Board approval received from both Yale University and Innovations for Poverty Action. The authors retained full intellectual freedom to report the results throughout the study. All opinions herein are our own and not those of any of the donors or partners.

CGD is grateful to its funders and board of directors for support of this work.

Dean Karlan, Ryan Knight, and Christopher Udry. 2012. "Hoping to Win, Expected to Lose: Theory and Lessons on Microenterprise Development." CGD Working Paper 312. Washington, DC: Center for Global Development.
<http://www.cgdev.org/content/publications/detail/1426733>

Center for Global Development
1800 Massachusetts Ave., NW
Washington, DC 20036

202.416.4000
(f) 202.416.4050

www.cgdev.org

The Center for Global Development is an independent, nonprofit policy research organization dedicated to reducing global poverty and inequality and to making globalization work for the poor. Use and dissemination of this Working Paper is encouraged; however, reproduced copies may not be used for commercial purposes. Further usage is permitted under the terms of the Creative Commons License.

The views expressed in CGD Working Papers are those of the authors and should not be attributed to the board of directors or funders of the Center for Global Development.

I. Introduction

In developing countries, firm size within an industry often varies all the way from single-person firms to large firms. Naturally, this leads many entrepreneurs to aspire to grow, but if special managerial talent is necessary to succeed at larger scales, how do individuals learn whether they have what it takes to manage a larger enterprise? We start off with a model that incorporates heterogeneity in entrepreneurial talent, unobserved to all, to help understand the experimentation and learning process for micro-entrepreneurs about *their* optimal size. We show how financial and managerial capital market imperfections can impede experimentation, and thus limit learning about the profitability of alternative ways of organizing one's business.

The assumptions and the model generate a simple prediction: on average most businesses will not, in fact, do better after attempting to grow, but a few will succeed. Specifically, relaxing credit or managerial capital constraints may encourage some entrepreneurs to experiment, but such experimentation will not necessarily lead to success and in fact on average will not succeed. This is consistent with the stylized evidence that few firms transform from microenterprises into small or medium enterprises. This stagnation comes despite a plethora of effort from government, NGOs and social businesses, through for example microcredit and training. We have learned that microcredit generates important impacts but not transformational positive impacts on firm size (for credit targeted at informal sector entrepreneurs, see Attanasio et al. 2011; Augsburg et al. 2012; Banerjee et al. 2011; Karlan and Zinman 2011; for credit targeted at individuals with some formal sector employment, see Karlan and Zinman 2010). Micro-training programs similarly generate positive but not transformational impacts (Berge, Bjovatt and Tungodden 2011; Bruhn and Zia 2011; Drexler et al. 2011; Karlan and Valdivia 2011).

We present several sources of evidence to test the model, both primary (an experiment in Ghana conducted by the authors) and secondary (a series of experiments by others, reported elsewhere and summarized here), and find mixed support empirically. The primary data source is a randomized controlled trial conducted in Ghana with microentrepreneurs, specifically tailors. We provide inputs to the tailors in the form of financial capital (a cash grant) and/or managerial capital (consulting services), to catalyze adoption of investments and practices aimed towards enterprise growth. We find that entrepreneurs invest the cash and take the advice, but both lead to lower profits on average. In the long run, they revert back to their prior operations. We do not have a large enough sample size to detect with statistical significance any positive outliers, but we present anecdotal evidence of such. We then discuss secondary evidence from other recent, similar experiments. We examine two types of experiments: those that relax financial constraints with cash grants or improved

access to loans; and those that provide training, and find evidence supporting this model (although not every result in the other papers lines up with the predictions in our model).

In the Ghana experiment, 160 tailors were randomly assigned to one of the three treatment groups or a control group. The first treatment group tests investment behavior after relaxing capital constraints by providing 200 cedi grants (about US \$133) to 38 small tailors and seamstress in and around Accra, Ghana. The second treatment group tests the managerial ability theory by providing one year of management consulting services from Ernst & Young, a major international consulting firm, to 41 tailors. The third treatment group, containing 36 tailors, received both the cash grant and the managerial training. The control group contained 45 tailors.

Working with managerial consultants was not intended to test a policy *per se*, as their fees would likely be too high for a scalable intervention. Rather, the intent was an enterprise experiment: let four talented, creative individuals, who know the local business environment, provide mentorship and consulting services to micro-entrepreneurs to see if they could generate transformative change.

At the baseline, the microenterprises did not appear to be well managed by standards in the managerial performance literature (Bloom et al. 2012). Only 17% of the respondents reported keeping any written financial records, 7% reported spending any money on marketing in a year and only 30% of shops were rated as very organized by our enumerators.

The context and dichotomy of experiences is perhaps well illustrated by stories of two of the respondents.

“Jess” was 26 years old, had attended vocational school to be a seamstress, and financed her start-up capital herself. She was single, with no children, and cared for a sick mother. She had a bank account but had never applied for a loan from a bank or microfinance institution. She sewed out of a wooden kiosk, and the fair value of her total capital was 765 Cedis (\$510). She carried all of her materials back and forth from her home to the shop every day because she was worried they would be stolen from her shop, which lacked a secure padlock, and had been broken into before. A strong padlock would cost about 25 Cedis (\$17), but she had drained all of her working capital from the business caring for her mother. She had recently stopped sewing for an extended period of time because caring for her mother took so much of her time, and when she returned she found that her primary clients had found another seamstress during her absence. She wanted to rebuild her customer base, but did no marketing and had no signs advertising her shop. She spoke softly, did not make eye contact and was shy with new people, but spoke briskly to well-known clients.

Across town, “Sarah” was 28 years old, had attended a polytechnic school for fashion, and inherited her business four years before the baseline. She had two bank accounts, one for business and one personal, and unlike Jess had previously received a loan. The fair value of her capital was 2730 Cedis (\$1840). Sarah had two good sewing machines and a couple of

special purpose machines, which she kept in her concrete shop. The quality of her sewing was good, and she was already keeping transaction records at the baseline. However, her shop was on an out-of-the-way street in a tough neighborhood, so she slept on the floor of her shop to protect her machines. She identified a new site on a main road that she wanted to move to, but she was having trouble saving up enough money. She had a natural ease with customers, but her relationships with her employee and apprentice were tense. The consultants judged Sarah to have great potential and they wanted to help her start marketing, but were concerned her location and ability to effectively manage her employees as she grew.

Both of these women appeared to face capital constraints. Jess had liquidated her business money for a personal emergency, and could not afford a small amount for a padlock to protect her investment. Sarah believed that a new location would be more profitable, but she could not save enough to make the move.

Both also faced managerial challenges. Jess needed to work on her customer service and needed to develop a plan to reconnect with her old clients and attract new clients. Sarah needed to learn to be a more effective manager and begin doing marketing.

Jess and Sarah both received the double treatment of the mentoring and the capital grants. At the end of the study, Jess was mourning her lost mother and hardly working. She had not reclaimed her old clients or launched any new marketing campaigns. She tried out record keeping for a time, but stopped keeping any records. She invested the capital grant in fabrics that she hoped to sell from her kiosk, but still had no padlock and was still carrying her material back and forth from home every day she worked. The consultant worked on a plan to put a little money away every day for the padlock, but she was not saving. Her profit increased from 30 Cedis in December 2008 to 80 Cedis in December 2010, half of the average increase in control group profit of 109 Cedis over the same time period.

Sarah, on the other hand, stood out for how well she adopted the consulting. With her consultant's guidance, she began "sew and sell" – sewing products with no specific customer in mind and selling them from her shop. She saved the capital grant for improvements to her new shop and expanded her record keeping. She added a small dressing room area to her shop and gave purified water satchels and candies out to clients. She designed a label with her phone number on it that she started affixing to all of the items she sewed. She successfully helped an apprentice start her own business, found a new apprentice to replace her, and hired a second employee.

Sarah's experience shows that there is much that a micro-entrepreneur can do to expand her business and improve business practices. Sarah's efforts increased her profits from 90 Cedis in December 2008 to 333 Cedis in December 2010, a substantial increase that is more than twice the average control group increase of 109 Cedis. Jess' contrary experience shows that this is not always easy, and not everyone is capable of making large changes in their business model.

We found that, on average, the experience of the tailors was more similar to that of Jess than to that of Sarah. The consultants' recommendations were adopted for a time, but the tailors had abandoned them one year after the training stopped. On average, there was no positive impact on profit or revenue from the consulting and, if anything, there was a negative impact. The tailors who received the capital grant invested the money in their businesses, but these investments did not increase profits. In fact, one year after the capital grant, profit was lower among those who received the capital drop compared to the control group.

This paper proceeds as follows: Section II will put forward a theoretical model as described above, Section III will present the setting and experimental design, Section IV the data, and Section V the results from the Ghana experiment. Section VI will present the meta analysis of the other 18 experiments. Section VII concludes.

II. Financial Markets and Entrepreneurial Experimentation

Imperfect financial markets, combined with non-convexities in the production technology, are the classic foundation for poverty trap arguments in the informal sector and provide a formal foundation to motivate many financial market interventions. We combine this classic model with uncertainty about the profitability of moving to a larger scale. This helps us understand why entrepreneurs in a competitive market might aggressively invest when financial market constraints are relaxed, yet achieve on average negative profits from these investments. A parallel model helps us to understand a similar pattern for business training, in which entrepreneurs at least temporarily adopt suggested new techniques that turn out to be unprofitable.

Consider two business techniques which cost $x_l < x_h$. The revenue of the low technique is $\pi(x_l)$ and we assume that this technique is profitable, i.e., $\pi(x_l) - x_l > 0$. Every existing entrepreneur has repeatedly used technique l and knows $\pi(x_l)$. Technique l is equally profitable for all entrepreneurs. Technique h , however, is profitable only for some: if you are a 'good' entrepreneur, you'll get $\pi^g(x_h)$ such that $\pi^g(x_h) - x_h > \pi(x_l) - x_l$. On the other hand, if you are a 'bad' entrepreneur you'll earn $\pi^b(x_h) - x_h < \pi(x_l) - x_l$. The key is that entrepreneurs do not know their type until they invest x_h and thus try h . Before trying h the entrepreneur believes that her likelihood of being type g is p . Once she tries h , she knows with certainty if she is of type g .¹ The entrepreneur gets instantaneous utility from

consumption of $u(c)$ and maximizes the simple expected utility $E_t \sum_{\tau=t}^{\infty} \delta^\tau u(c_\tau)$. The

¹ The assumption that the entrepreneur learns his/her type with a single try at technique h is extreme but inconsequential for the purposes of the arguments below. A richer model would have uncertain profits from technique h for each type, with the distribution of returns being better for type g . The entrepreneur would gradually learn his or her type with repeated attempts at technique h .

entrepreneur has no access to financial markets, so if she has current assets w her value function is

$$(1) \quad V(w, p) = \max_{x \in \{x_l, x_h\}} \left\{ \begin{array}{l} u(w - x) \\ + 1[x = x_h] \delta \left[pV(\pi^g(x_h), 1) + (1 - p)V(\pi^b(x_h), 0) \right] \\ + 1[x = x_l] \delta V(\pi(x_l), p) \end{array} \right\},$$

where $1[\cdot]$ is the indicator function.² The first term is current consumption. $x_h > x_l$, so consumption falls if the entrepreneur tries b . The second term is the future value associated with experimenting with b . With probability p the entrepreneur realizes $\pi^g(x_h)$ and (perhaps more importantly) updates $p=1$. But with probability $(1-p)$ she realizes $\pi^b(x_h)$ and updates $p=0$. The third term is the value associated with continuing to choose $x = x_l$.

Consider the situation where the entrepreneur knows she is a 'bad' type:

$$(2) \quad V(w, 0) = \max_{x \in \{x_l, x_h\}} \left\{ \begin{array}{l} u(w - x) \\ + \delta \left[1(x = x_l)V(\pi(x_l), 0) + 1(x = x_h)V(\pi^b(x_h), 0) \right] \end{array} \right\},$$

She chooses $x = x_l$ and consumption converges to $\pi(x_l) - x_l \equiv c_l$.

$$V(\pi(x_l), 0) = \frac{1}{1 - \delta} u(c_l).$$

² The assumption that the entrepreneur can neither save nor borrow simplifies the analysis tremendously, but is obviously extreme. If the entrepreneur can save at a fixed interest rate, little changes in our analysis

$$r < \frac{1 - \delta}{\delta}$$

provided that interest rate is sufficiently low (specifically, as long as $r < \frac{1 - \delta}{\delta}$). Saving is only undertaken to smooth expected declines in consumption; it therefore lowers the cost of experimentation, but changes none of

$$r = \frac{1 - \delta}{\delta}$$

the qualitative features of the model below. Permitting borrowing as well (and setting $r = \frac{1 - \delta}{\delta}$) is a more substantive change to the interpretation of the entrepreneur's situation, but is less realistic. Miao and Wang (2007) provide a related model with both borrowing and lending in a two-armed bandit model with risk aversion. Many of the qualitative features of their model with no liquidity constraints are similar to our model. In particular, the entrepreneur may experiment with the high risk technique even when it has negative expected value because of its option value. They also show (when preferences are CRRA) that even when there are no liquidity constraints, increases in the wealth of the entrepreneur can induce experimentation with the risky technique. This result has implications for the interpretation of our findings, so we return to it below.

In contrast, if $p=1$

$$(3) \quad V(w,1) = \max_{x \in \{x_l, x_h\}} \left\{ u(w-x) + \delta \left[1(x=x_l)V(\pi^g(x_h),1) + 1(x=x_h)V(\pi(x_l),1) \right] \right\}.$$

As long as x_h is sufficiently productive, $V(\pi^g(x_h),1) = \frac{1}{1-\delta}u(c_h)$,

where $c_h \equiv \pi^g(x_h) - x_h$ and the entrepreneur who has sufficient capital maintains the more costly, more profitable technique.³ Obviously, $V(w,1) \geq V(w,0)$.

The nonconvexity in the production technology and financial market imperfection have the standard implication that a potentially profitable discrete investment may not be made. Uncertainty about the profitability of that investment helps us to understand additional patterns of behavior.

Comment 1: Sufficiently optimistic entrepreneurs will experiment with the risky, costly technique. We consider a set of entrepreneurs indexed by i , with varying priors regarding their likelihood of being the 'good' type p_i . Each has wealth $\pi(x_l)$. Entrepreneur i will experiment with the high cost technique if

$$(4) \quad u(c_l) - u(\pi(x_l) - x_h) \leq p_i \frac{\delta}{1-\delta} u(c_h) + (1-p_i)\delta \left[u(\pi^b(x_h) - x_l) + \frac{\delta}{1-\delta} u(c_l) \right] - \frac{\delta}{1-\delta} u(c_l).$$

The LHS is the one-shot cost of trying out the high technique; the RHS is the long-term gain. The RHS of (4) is strictly increasing in p_i , and if the cost of investing in h is not too high ($\pi(x_l) - x_h$ is not too small) then there exists a $p^* < 1$ such that (4) is satisfied. All entrepreneurs with $p_i \geq p^*$ will experiment with the h technique. The implication is that entrepreneurs using technique l in any dataset will be those with $p_i < p^*$, which will include some fraction of those who have tried h in the past and learned that they are not type g .

³ $u(\pi^g(x_h) - x_l) - u(\pi^g(x_h) - x_h) \leq \frac{\delta}{1-\delta} \left[u(\pi^g(x_h) - x_h) - u(\pi(x_l) - x_l) \right]$ is sufficiently productive.

Comment 2: There is an option value to trying the risky, costly technique. Suppose that $p\pi^s + (1-p)\pi^b - x_h < \pi(x_l) - x_l$, so trying the high technique has a negative expected value this period. The entrepreneur will choose b if and only if

$$(5) \quad V(w, p) < u(w - x_h) + \delta pV(\pi^s, 1) + \delta(1-p)V(\pi^b, 0).$$

Rearranging (5), the entrepreneur will choose b if

$$(6) \quad \begin{aligned} & (u(w - x_l) - u(w - x_h)) + \delta \left[u(c_l) - (pu(c_h) + (1-p)u(\pi^b(x_h) - c_l)) \right] \\ & \leq p \frac{\delta^2}{1-\delta} (u(c_h) - u(c_l)). \end{aligned}$$

The first term on the LHS of the inequality is the immediate cost of the investment, and the second is the one-time expected loss because of the likely failure of the attempt.⁴ The RHS is the option value of the potential long run gain from the entrepreneur learning that she can manage a large-scale enterprise. As δ approaches 1, this option value dominates the short term costs and option b is chosen.

Comment 3: Increases in the wealth of an entrepreneur reduce the critical prior belief in the likelihood of success required for that entrepreneur to experiment with the risky, costly technique. As in comment 1, if we consider at any given level of wealth w a range of entrepreneurs with prior beliefs p_i about the likelihood that they would be successful at running a larger scale enterprise, there is a $p^*(w)$ such that all entrepreneurs with wealth w and $p_i < p^*(w)$ choose l and those with higher p_i choose b . The LHS of (6) is strictly decreasing in w , so $\frac{dp^*(w)}{dw} < 0$.

Increases in w increase the share of entrepreneurs choosing b . The randomized capital grants will generate investment in the enterprise, even if the immediate expected return of those investments is negative.

Comment 4: A reduction in x_h increases the share of entrepreneurs choosing technique b . The LHS of (6) is strictly decreasing in x_h (because $c_h = \pi^s(x_h) - x_h$), while the RHS is strictly increasing.

So $\frac{dp^*(x_h)}{dx_h} > 0$. The randomized provision of consulting services lowers the cost of adopting the set of techniques associated with operating at a larger scale, so a broader set of entrepreneurs will experiment with b .

$$_4 \quad p\pi^s + (1-p)\pi^b - x_h < \pi(x_l) - x_l \text{ implies that } pc_h + (1-p)(\pi^b(x_h) - c_l) < c_l.$$

Concavity of $u(\cdot)$ ensures that $u(c_l) - (pu(c_h) + (1-p)u(\pi^b(x_h) - c_l)) > 0$.

III. Sample Frame and Experimental Design

The study participants are 160 urban tailors and seamstresses in Accra, Ghana, and were randomly selected from a census we conducted of tailors and seamstresses in eight neighborhoods in/around Accra who had five or fewer total employees and apprentices. If two or more tailors were immediate neighbors, we randomly selected at most one to be in the sample frame.

We chose to work with microenterprises in the same industry because it would allow the consultants to develop some expertise in that sector, and it would allow us to gather more precise data on business practices by asking industry-specific questions in our surveys. We then wanted an industry which was geographically dispersed across Accra (to minimize possible spillovers to control groups), and also diverse in size so that there were plausibly different firm sizes that could be sustained in competitive equilibrium. One-person tailoring shops are common, but many 10-person small tailor firms also exist. We constrained our sample to tailors with 5 or fewer employees at the baseline: 35% of our sample had zero employees, and 94% had three or fewer employees. Thus, our sample frame includes very small, urban tailors and seamstresses, most of who work directly in their shops. Also, 82.5% of our sample frame had not previously accessed formal credit markets.

We employed a 2x2 experimental design involving a 200 cedi capital grant and/or consulting services from Ernst & Young. Figure 1 shows a full timeline of the interventions, and data collection. The consulting treatment began first, and then after eight months the second randomization assigned individuals to either receive the capital grant or not. More details are below on each treatment.

Five of the tailors passed away over the course of the study, leaving a final sample of 155. We located 149 of the 155 tailors for the final follow-up in December 2009. Attrition is not correlated with treatment status⁵. We saw no tailors permanently exit the tailoring business by selling off their machines. We did see tailors temporarily stop sewing, for health or other reasons. These individuals would be counted as having zero profit or negative profit if they had business expenses but not income. All businesses operated from the same premise by the same individual were counted in financial outcomes, so if a respondent diversified out of tailoring and into the selling of goods, income from selling the goods is counted in our data.

Consulting Treatment

We worked with one partner, a director and four consultants from Ernst & Young in Ghana. The Ernst & Young consultants typically work on business advisory engagements in a variety of areas including training, human resources, monitoring and evaluation and project management. Consultant biographies and examples of prior engagements are in Appendix B.

⁵ Appendix Table 1 details the sample attrition.

The consultants received a two-day training on microenterprise coaching from Ghana's National Bureau of Small Scale Industries, which frequently provides training to microenterprises in Ghana, on the Bureau's method for training micro-entrepreneurs.

The consultants largely followed an adapted version of this framework (outlined in Appendix C) but were also encouraged to think creatively, to discuss important business decisions facing the tailors, and to provide *ad hoc* advice that they felt would be beneficial. Examples of this *ad hoc* support can be seen in the consultants' notes in Appendix D. The training modules were twelve-fold: (1) Record Keeping, (2) Procurement, (3) Operational Activities, (4) Motivation of workers, (5) Value addition, (6) Costing, (7) Customer service, (8) Security of shop, (9) Sales and marketing, (10) Lifestyle in relation to work/life balance, (11) Financing of business and savings, and (12) Business growth.

The training took place at the tailors' shops over the course of one year, from February 2009 to February 2010. It began with lessons on the importance of record keeping, used the new records to help the tailors calculate their profit margin on each item they sew, then taught how to calculate a monthly income statement. Lessons on customer service and managing employees were discussed throughout. For example, if the consultants observed impolite behavior to customers while in the shop, they might take the opportunity to discuss customer service. The training moved at the pace of the tailors, such that some never moved past record keeping, while others began preparing cash flow statements and developing detailed plans to finance expansion.

The training involved simple, targeted lessons like, "keep your business and personal money separate"; "Buy a second wallet to keep your business money in, so you don't mix it with personal money"; and "it is better to finance expansion through savings than through loans." For those who moved past these basic lessons, there were more detailed lessons on a variety of topics, like how you should calculate how much to save to replace aging machines.

The consultants gave the tailors two record books: a standard cash book to record daily transactions; and a second book they developed to record capital stock, available materials, customer contact information, revenue, expenses and other items. The emphasis was placed first on simply recording every transaction in the cash book, then recording in the more complicated book if they were successfully tracking transactions.

As with other studies on business training, there was a surprising degree of reluctance among some tailors to make time for the consultants, and the tailors covered fewer modules than expected. The average total time spent interacting with each tailor was 10 hours over the course of the study (Figure 2). Each available tailor was visited 1-4 times per month, with each visit lasting 30 minutes to 1 hour. One of the consultants was unavailable after November 2009 and was replaced by a consultant from the National Bureau of Small Scale Industries for the final two months – the same consultant who provided the initial two-day training for the E&Y team. The randomization into consulting/non-consulting was done in January 2009, stratifying only on the community in which the tailors lived.

The tailors did report valuing the consulting, and in particular the training they were receiving. In a follow-up survey, the tailors reported being willing to pay 5.9 cedis per hour for the same consultants to come and continue the training, 2.8 cedis per hour for other consultants to continue the same training (p value of equality to our consultants, 0.001), 4.2 cedis per hour for another training of their choice (p value of equality to our consultants, 0.014).

Capital Grant

The capital grant randomization was done in October 2009, eight months after the consulting began, and was stratified on existing treatment status and community only. Deceased respondents and respondents who had permanently moved out of the study area in the first eight months of the study were excluded from the randomization, leaving 154 respondents eligible for the capital drop randomization. Of these, 75 were randomly selected to receive capital (37 from the consulting group and 38 from the no consulting group).

The capital grant was 200 Cedis (approximately US \$133) and unconditional. Approximately two weeks before distributing the capital grants, IPA field workers visited all the respondents to inform them that we were doing a raffle with various prizes, one of which was 200 Ghana Cedis. The respondents were given a sealed envelope that had a picture of their prize inside. The runner-up prizes were an IPA-branded keychain, t-shirt and mug. The field workers then explained that they would return in about two weeks with the prize. If they won the capital, we asked that they spend the money on their business, but explained that they would not have to repay the money if they spent it on personal items, and that no repayment would be required under any circumstances.

We included the two week buffer between notification and delivery for the consultants to meet with the winning respondents to help them plan for how to use the money. However, not all consultants and tailors were available in this two week window, so not every tailor developed a plan before receiving the money.

The 200 Cedi capital drop is a little more than the average baseline working capital, defined as all cash, savings and on-hand money. The capital drop therefore represents, on average, a doubling of the reported cash available for investment. 200 Cedis is about twice baseline monthly income, about equal to one month's business expenses, and about equal to 13% of average fair market value of all baseline fixed assets.

Table 1 reports baseline values for various relevant metrics and shows that assignment to the capital or consulting groups is not correlated with baseline characteristics.

IV. Data

All surveys were administered using paper/pencil questionnaires, and data entry was done in the IPA offices by Project Associates or locally-hired data entry operators. All surveys after the baseline were audited by re-administering select questions from 5-10 questionnaires by each surveyor. Surveyors were hired and monitored by IPA.

Baseline survey: (1) December 2008 and (2) January 2009

The baseline survey was conducted in two visits to minimize the intrusion (a particular concern in the first visit because it was conducted in December, during a peak season). The first, administered in December 2008, focused on financial outcomes, and the second, administered in January 2009, focused on business processes and attitudes. Each survey took about 40 minutes to one hour.

The first follow-up after the consulting began was conducted six months later, in July 2009 (Survey #3), and primarily included questions on business processes.

In August 2009 (Survey #4), we visited the respondents every other day to record how much money they received, how much they spent and how many sales they made. The goal of these visits was to get a measure of profitability that is unaffected by changes in the consulting group's understanding of how to calculate profit and ability to recall revenue/expenses.

Then in September 2009 (Survey #5), we recorded the financial outcomes for expenses, revenue and profit.

We repeated the format from the baseline, and split measures between December 2009 (Survey #6), focused on financial outcomes, and January 2010 (Survey #7), focused on business process outcomes.

In December 2010 we conducted a long-term follow-up focused on financial outcomes and business processes. This survey occurred 14 months after the capital drop and 11 months after the consulting stopped.

V. Estimation Models and Results

The experimental design simplifies analysis. We examine a series of outcomes related to the interventions: knowledge of business practices in the consulting curriculum, adoption of these practices, investment and savings behavior, and business income and profits. This series of indicators is collected over the 8 rounds of data (although no single indicator is available for all 8 of the rounds because the questionnaires were varied to reduce respondent fatigue). A typical column in the tables that follow reports the results of a cross-sectional regression of the form

$$(7) \quad y_{it} = \alpha + T_i \beta_1 + y_{i0} \beta_2 + N_i \beta_3 + \varepsilon_{it},$$

where y_{it} is the outcome for tailor i in round t , T_i is a vector of indicators of the intent-to-treat status of tailor i , y_{i0} is the value of the outcome for tailor i in the baseline (either round 1 or round 2, depending upon the measure) and N_i is a vector of dummy variables corresponding to the neighborhood in which i operates. This specification permits a flexible examination of the timing of responses to the treatments. To estimate average effects across rounds, we pool all follow-up rounds, add round dummies (“R”), and report robust standard errors clustered at the individual level.

$$(8) \quad y_{it} = \alpha + T_{it} \beta_1 + y_{i0} \beta_2 + N_i \beta_3 + R_t \beta_4 + \varepsilon_{it},$$

Results

We divide the results into three categories: (1) business literacy and business practices; (2) investments, savings and loans, and; (3) profitability.

Business literacy and practices

The consulting treatment apparently succeeded in generating knowledge among treated tailors about the business practices that were a focus of the curriculum. In Table 2, column 1 we report the results of estimating (7) where y_{it} is a measure of business literacy. In this instance, $y_{i0} = 0$, because we did not ask about business literacy until the final survey in December 2010. Eleven months after the end of the consulting, we find that being assigned to consulting (irrespective of capital treatment status) increased business literacy knowledge by an average of 0.3 questions on a 4-question quiz, which is 0.52 standard deviations.

We find that tailors who received the consulting treatment adopted the practices discussed in the curriculum, at least temporarily. Columns 3-5 report the results of estimating (7) where y_{it} is an index of the business practices encouraged by the consultants at three different times after consulting began. Business practices were measured by self-reported responses to 35 questions on various practices advocated by the consultants. Not all of the questions were asked in every round. y_{it} for columns 3 through 5 is generated by taking the percentage of questions answered correctly in that round.

In the 6 month follow-up (July 2009), there is a strong impact of 5.65% of business practices, significant at the 1% level. At the 12-month follow-up (January 2010), this effect had diminished to 2.95%, although the reduction from the 6-month treatment effect to the 12-month treatment effect is not statistically significant. At the two-year follow-up (December 2010), the treatment effect further diminished, 0.8% (although still not significantly different from that estimated in the six month follow-up).

In column 2, we estimate (8), the average effect of the consulting treatment on business practices over all post-consulting rounds. The pooled index for Column 2 was generated by taking the average number of practices adopted across all post-consulting rounds. As can be expected, the average effect falls within the range described above for each round and it is statistically significant at the 10% level.

The consultants' foundational lesson was record keeping. The most tailors received this lesson, and this lesson was returned to most often. If the tailors learned anything from the consulting, we would expect it to be record keeping. We do indeed find a strong impact on record keeping, significant at the 1% level, with the tailors who received consulting being 45% more likely to report keeping records in July 2009 and 23% more likely to keep records in January 2010. By December 2010, however, this point estimate had decreased to 6.6%, which is statistically distinguishable from the initial 45% impact at the 1% level.

Overall, we conclude that the consulting was successful in changing both business knowledge and behavior, although the effect on behavior diminished over time such that one year after the consulting ended there were no statistically significant differences in behavior between the consulting group and the control group.

Investment

Table 3 shows estimates of equation (7) when y_{it} is investment flow over the previous 12 months. Our preferred investment measure is the amount of investment in the category the tailor stated he or she would invest in when asked how they would spend an extra 200 Cedis at the baseline (details shown in Appendix Table 2). This measure has the highest power, given that we would not expect everyone to invest in the same asset class, so any average impact in an asset class would be diluted by those who preferred to invest in a different type of investment. The categories that make up the "investment in preferred category" variable are machines, property and expenses on materials.

In column 1, we see that capital grant group invested an average of 179 Cedis more than the control group by December 2009 (about two months after the grants were made in cash). The point estimate for the investment response of the consulting plus capital group is lower, only 90 Cedis. These two estimates are jointly significantly different from zero (they are not significantly different from each other). However, one year later in December 2010 (Column 2), we no longer see any additional investment (no new capital grant was provided, so this would only likely occur if higher profits from year one led to higher investment in year two).

Columns 3-10 break the investment results down into one year results (Col 3-6) and two year results (Col 7-10), and then within each year into four outcome measures: total investment, machines, property/shop and inputs. Converting the outcome measure to investment in a particular category, rather than investment in what each tailor said they would do in the baseline, leads understandably we believe to a loss of statistical power as more noise is introduced. However, the general pattern persists and is consistent with columns 1 and 2. The first year results are generally positive, and the second year results are generally negative,

although out of eight specifications only two are significant statistically. The results are very similar when examining stocks of assets as opposed to flows, results not reported in tables.

Table 4 shows our results on savings. In lieu of investing the capital, the recipients could have saved the money (or if the capital led to an increase in profits, saved a portion of the increase in profits). We find no statistically significant impacts on total savings or bank savings when pooling all rounds, but find an impact on susu savings in the capital & consulting group, whose average monthly susu savings is almost twice the baseline value of 18.6 Cedis a month (point estimate 16.6, standard error 8.4). Looking at the cross-sectional impacts, we find that total savings was higher in the capital plus consulting group in the December 2009 follow-up, about two months after the capital drop (point estimate 75.1, standard error 35.7). We also find a statistically significant difference in total savings between the capital only and capital plus consulting groups, with the capital only group having lower total savings, significant at the 10% level. This might explain the higher point estimate on investment in goals seen the capital only group – the consultants reported encouraging the capital winners to top up the capital drop with their own money to make larger purchases, saving to do so if necessary.

Table 5 examines net financial flows, in order to examine the net use of funds in the short run, and also long term impact on all investment and savings (or reduction in borrowing). In the short run (Column 1, one-year), we find a reduction in take-up of loans for those in the capital group in the months following the capital drop. We find no long term impact on borrowing (Column 2). This is evidence at least partially that the capital grant satisfied liquidity needs, and that at least some individuals had alternative (and presumably more costly, since they would have to repay them) sources of capital if necessary.⁶

Adding together all of the potential uses for the money (investing, saving, replacing loans), except for dividends, we find no statistically significant impacts, unless we look at investment in their goal category, savings and loan replacement, in which case we find point estimates similar in magnitude to total investment, but with much smaller standard errors, leading to statistically significant, positive impacts from receiving any capital in December 2009. These results are shown in Columns 3-6. The point estimates on capital and capital plus consulting are greater than 200, but are not significantly different from 200. Total uses for the money one year later in December 2010 are primarily negative and not significant.

Profitability

Our results so far show short run impacts of the consulting and capital grant treatments on behavior: knowledge and business practices improve in the consulting group and investments are made in the capital grant group. The tailors do seem to be learning about new types of techniques from the consultants (or modifying their prior beliefs about the

⁶ To examine if we are measuring debt at a high borrowing season (and thus may be at a peak of liquidity constraints), we examine seasonality of borrowing and find that borrowing over the three months from September to November is roughly equal to borrowing over the six months from January to June.

profitability of these techniques). And the tailors are responding to the capital grant as though they are capital constrained in their business. However, in both cases we find that these changes in behavior are short-lived. After a year there is no significant difference between the capital grant or consulting groups and the control group of tailors.

An examination of profits provides an explanation for why the tailors abandoned these changes in behavior. Table 6, column 1 reports the results of estimating (7) where y_{it} is the tailor's stated income from his or her business. There is no evidence that the consulting treatment is associated with higher profits. Worse, the capital grant seems to have *lowered* profit. The point estimate is that post-treatment income fell by 45 Cedis from a base of 110 Cedis for the capital only treatment. There is a smaller (and statistically not significant) drop of 20 Cedis in income of the consulting plus capital grant group. The capital only and capital plus consulting point estimates are jointly statistically significant at the 10% level.

The standard errors on profit are large, relative to the means. For example, the standard error on the consulting treatment is 21.4 Cedis. To have detected an effect at the 5% level, we would have needed to observe an average change of $1.96 \times 21.4 = 41.9$ Cedis, or 37% of the average baseline profit of 112 Cedis.

We find no statistically significant impacts on revenue. Both the consulting and the consulting & capital groups have positive point estimates, which are large relative to the baseline average revenue, but we note fairly large standard errors. At the baseline, we asked only for average weekly revenue, weekly revenue in a "good" week and weekly revenue in a bad week. In the follow-ups, we asked for revenue in the previous month to ensure that we were measuring only post-treatment outcomes that were separate from our previous surveys.

We find no evidence of changes in hours worked by the entrepreneur him or herself as a consequence of any of the treatments (column 5 of Table 6). Nor is there a statistically significant impact on total staff, apprentice use, or paid employees of any of the treatments (columns 6-8).

Table 6 examined the average impact of the capital, consulting and combined treatments on post-treatment profits and employment. An examination of the time path of the impacts is revealing (shown in Figure 3). Recall from our earlier examination of business practices that tailors in the consulting group had adopted the advocated practices by round 3, but that the use of these practices dropped off in round 7 and then again in round 8. We find in column 1 of Table 7 that by round 3, monthly income in the consulting group is 25 Cedis lower than in the control group. By round 5, income is (almost) statistically significantly higher in the consulting group, but in later rounds there is no difference in income between the consulting group and the control group.

In round 7, after the first post-grant holiday season, the point estimate on the capital is 50 Cedis lower income than the control and the capital plus consulting group is 16 Cedis lower, but these estimates are not statistically significant. One year later, both groups have large

drops in income relative to the control group (point estimates -75 and -98, standard errors 46 and 46, for capital versus capital plus consulting, respectively). Our revenue and expense measures, reported in columns (6-11) are too noisy to permit conclusions to be drawn.

These results, regrettably, are consistent with the model we presented above. Capital-constrained tailors respond to the relaxation of their budget constraint upon receipt of the capital grant by investing more. But why invest in activities that yield, on average, negative profits? Similarly they respond to the intensive consulting intervention by attempting a set of new business practices, and again are rewarded with declines in profits. Were they fooled in both instances? Perhaps, but this pattern is consistent with entrepreneurs exploring new techniques and new levels of investment in a tentative manner in order to learn about the profitability of these innovations for themselves, knowing that on average such experiments yield a negative immediate return. Nevertheless, the option value of experimentation is sufficiently high that it is worth taking the risk. On average, as perhaps expected, the experiments yielded negative results and the innovative techniques were abandoned.

Table 8 reports our impact on profitability tails, i.e., likelihood of having profits above the 10th percentile (columns 1-6) and 5th percentile (columns 7-12) from the baseline distribution. We do not find any systematic statistically significant results, but also have large standard errors. If the impact of either consulting or grants was to generate one or two positive outliers, such as one of the positive anecdotes we observed and reported in the introduction, then we did not have sufficient sample size to detect such impacts.

VI. Supporting Evidence from Other Studies

We started by examining the universe of papers we are aware of that employ a randomized financial capital infusion (either through a grant or credit) to a microenterprise. This yields seven papers, three unconditional cash grant experiments and four credit experiments.⁷ We then examine papers with experimental infusion of managerial or entrepreneurship training. This yields 11 papers, with a wide range of intensity of intervention as well as sample frames.

From each of these papers, we test three hypotheses: (a) did the study find an average positive impact on investment, (b) conditional on finding a positive impact on investment, did the study find an average negative impact on profits for the firm, and (c) did the study find evidence of a fat right tail, i.e., of treatment leading to a small set of individuals doing considerably better than the control. Table 9 summarizes the results from these tests.

The first question, examining changes in either investment or business practice, yields a fairly consistent answer: capital does get invested, and business advice does get followed. This is

⁷ We excluded two papers which are close, but do not fit as precisely: de Mel et al. (2012) which provides grants to microentrepreneurs conditional on completing formalization process in Sri Lanka (and they do find that this creates positive outliers), and Karlan and Zinman (2010) which randomly assigned credit to individuals, but with no enterprise targeting component as with more traditional microcredit.

true for 16 out of the 18 studies (albeit 2 of the 16 positive results are not statistically significant).

The second question, the impact on average profits, is far less clear. For capital infusions, 2 out of 7 find positive and statistically significant results, 3 find positive but not statistically significant results, one finds close to a null result, and one finds negative but not statistically significant results. Clearly this is more of a muddled pattern, indicating that while there are some cases where positive returns are strong it is not a systematic result. For training infusions, the variation in the results is much higher than the capital infusions. Out of 11 experiments, 4 report statistically significant and positive average impacts (although Valdivia (2012) on revenues, profits not measures), 3 report positive but not statistically significant average impacts, and 3 report negative but not statistically significant average impacts, and one reports mixed impacts.

The third question, the creation of positive outliers, many of the studies do not report. For those that do, for capital infusion we find positive results for 3 out of 3 studies. For training studies however we are only able to examine two studies, and in neither study do we observe positive and statistically significant impacts on creation of positive outliers. However, each of these studies is typically not designed with sufficient power to detect effects on outliers, such as we are examining. Furthermore, pooling of data across studies will suffer from lack of comparability of interventions and measurement (see McKenzie and Woodruff (2012) for a discussion of this literature and similar conclusions regarding the state of knowledge across such studies).

VII. Conclusion

Canonical theories of development suggest that credit and managerial capital constraints inhibit investment and thus profits. This misallocation of resources in the economy has important implications for growth. Yet in many (but certainly not all) situations we see interventions that infuse capital or training not actually lead to higher profits, and we also see many examples of seemingly unprofitable firms, including farms (e.g., see Anagol, Etang, and Karlan 2012; Morduch, Ravi and Bauchet 2011; Duflo, Kremer, and Robinson 2011; Karlan, Osei, Osei, and Udry 2012).

We put forward a simple learning model, with heterogeneous types of enterprises, which helps illuminate why we may see failure on average, as well as positive outliers. Clearly no one model, particularly a simple model, accurately captures the complex reality of business operations in developing countries. Likewise, not all of the predictions in our model are borne out consistently in the data of the experiment reported here, nor of the 18 studies we examined in a small meta-analysis. However, there is evidence to suggest this model provides a useful framework for thinking about the dynamics between micro and small enterprises, and the choice individual enterprise owners make when deciding to experiment with expansion or diversification.

Critical questions remain, as the meta-analysis, and also the literature review in McKenzie and Woodruff (2012), documents a wide variety of outcomes across studies. We suggest four directions for further research that apply to theorists, meta and re-analysis of existing data, as well as design of future studies: (1) heterogeneity with respect to type of entrepreneur and individual, (2) dynamics and determinants of learning (which includes, e.g., differences in program design), (3) market selection for interventions, and (4) general equilibrium and competitive effects. Obviously no one study, model or analysis, will produce a complete picture that explains all of the observed heterogeneity in results. We discuss each of the four directions briefly.

What are the individual factors that should be incorporated into the model? Most importantly for both policy and modeling, what are the critical characteristics that help predict what type of individual has potential to be an outlier? In our model, neither we nor entrepreneurs themselves can predict who profits the most after relaxing a constraint. Are there diagnostics that could substitute for the costly experimentation otherwise required to distinguish the minority who can flourish at larger scale from those who will not? For policy, such diagnostics could be used to target more efficiently, which is particularly critical if the intervention is great for some and bad for others.

Further related questions pertain to the process of learning. Here, we have focused entirely on learning by doing and learning from formal trainers. Clearly there are many channels for learning: from one's own experience, from that of a teacher in a classroom setting, from a paid consultant, from an NGO, from a mentor with experience in one's own industry, etc. How do these different channels of learning differ in effectiveness, and why? For example, are some more credible than others, do some provide better information, are some more inspirational on a psychological level thus more likely to trigger behavior change even if the underlying information is the same, etc. Lastly, and critically, how important is it for people to see results (and how do individual entrepreneurs determine causality from process changes to outcomes), rather than merely receive information on suggested processes, in order to change behavior?

Third, markets differ in terms of competitiveness, and such interventions as discussed here should generate different impacts depending on the competitive landscape. Take the tailor experiment in Ghana as an example: perhaps the tailor industry is in perfectly competitive equilibrium, but some other industry is less so in the same geography. Understanding, and then testing, the underlying market factors that are necessary for success is important both for validating our models and for establishing diagnostics for policymakers and institutions interested in improving the industrial performance. For example, markets with potential product differentiation or skilled and available supply of labor may be ripe for such interventions, but those with fully competitive markets less so or even damaging.

Lastly, few if any studies have satisfactorily tackled the impact of improving one set of firms' performance on general equilibrium outcomes. The challenge is simple and obvious: if helping one firm improve its performance greatly yields a smidgeon of negative impacts for

100 other firms, it will be difficult to have sufficient statistical power to measure the smidgeons. Theory can help, as well as a focus on collecting data about the mechanisms of changes within the firm and thus the actual changes in services that customers receive. For example, if the intervention primarily teaches better persuasive marketing, but not informative marketing, then business is likely simply being shifted from one firm to another. If, on the other hand, product quality has increased, or costs have been lowered, then general equilibrium benefits are likely accruing. We believe this is a gaping hole in the entrepreneurship development literature.

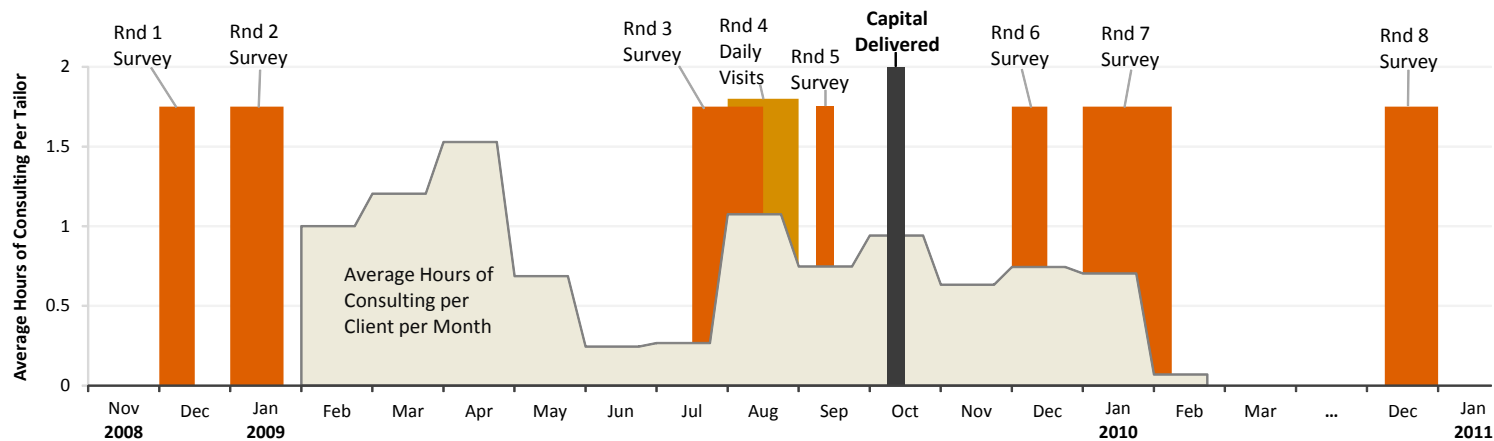
VIII. References

- Anagol, Santosh, Alvin Etang, and Dean Karlan (2012). "Continued Existence of Cows Disproves Central Tenets of Capitalism," working paper.
- Attanasio, Orazio, Britta Augsburg, Ralph De Haas, Emla Fitzsimons, and Heike Harmgart (2011). "Group lending or individual lending? Evidence from a randomised field experiment in Mongolia," European Bank for Reconstruction and Development Working Paper No. 136.
- Augsburg, Britta, Ralph De Haas, Heike Harmgart, and Costas Meghir (2012). "Microfinance at the margin: experimental evidence from Bosnia and Herzegovina," European Bank for Reconstruction and Development Working Paper No. 146.
- Banerjee, Abhijit, and Esther Duflo (2008). "Do Firms Want to Borrow More: Testing Credit Constraints Using a Targeted Lending Program," BREAD Working Paper No. 005, 2004, revised 2008.
- Banerjee, Abhijit, Esther Duflo, Rachel Glennerster and Cynthia Kinnan (2011). "The miracle of microfinance? Evidence from a Randomized Evaluation," mimeo, MIT.
- Berge, Lars Ivar Oppedal, Kjetil Bjorvatn, and Bertil Tungodden (2011). "Human and financial capital for microenterprise development: Evidence from a field and lab experiment," CMI Working Papers 1, CMI (Chr. Michelsen Institute), Bergen, Norway.
- Bloom, Nicholas, Benn Eifert, Aprajit Mahajan, David McKenzie, and John Roberts (2012). "Does Management Matter? Evidence from India," *Quarterly Journal of Economics*, forthcoming.
- Bruhn, Miriam, and Bilal Zia (2011). "Stimulating managerial capital in emerging markets: the impact of business and financial literacy for young entrepreneurs," Policy Research Working Paper Series 5642, The World Bank.
- Bruhn, Miriam, Dean Karlan, and Antoinette Schoar (2012). "The Impact of Consulting Services on Small and Medium Enterprises: Evidence from a Randomized Trial in Mexico," Yale Economics Department Working Paper No. 100.
- Calderon, Gabriela, Jesse M. Cunha, and Giacomo de Giorgi (2011). "Business Literacy and Development: Evidence from a Randomized Trial in Rural Mexico," working paper.
- Cole, Shawn, Thomas Sampson, and Bilal Zia (2009). "Money or Knowledge? What drives demand for financial services in emerging markets?" Harvard Business School Working Paper No. 09-117.
- Cole, Shawn and Guari Kartini Shastry (2009). "Smart Money: The Effect of Education, Cognitive Ability, and Financial Literacy on Financial Market Participation," Harvard Business School Working Paper No. 09-071.
- de Mel, Suresh, David McKenzie, and Christopher Woodruff (2008). "Returns to Capital in Microenterprises: Evidence from a Field Experiment," *The Quarterly Journal of Economics*, 123(4), 1329-1372, November.
- de Mel, Suresh, David McKenzie, and Christopher Woodruff (2009). "Measuring Microenterprise Profits: Must We Ask How the Sausage Is Made?" *Journal of Development Economics*, 88(1): 19-31.

- de Mel, Suresh, David McKenzie, and Christopher Woodruff (2012). "The demand for, and consequences of, formalization among informal firms in Sri Lanka," NBER Working Paper No. 18019.
- Drexler, Alejandro, Greg Fischer, and Antoinette Schoar (2011). "Keeping it Simple: Financial Literacy and Rules of Thumb," CEPR Discussion Paper No. DP7994.
- 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.
- Fafchamps, Marcel, David McKenzie, Simon R. Quinn, and Christopher Woodruff (2011). "When is capital enough to get female microenterprises growing? Evidence from a randomized experiment in Ghana," NBER Working Paper No. 17207.
- Giné, Xavier, and Ghazala Mansuri (2011). "Money or Ideas? A Field Experiment on Constraints to Entrepreneurship in Rural Pakistan," mimeo.
- Karlan, Dean, Isaac Osei-Akoto, Robert Osei, and Chris Udry (2012). "Agricultural Decisions after Relaxing Credit and Risk Constraints," working paper.
- Karlan, Dean and Martin Valdivia (2011). "Teaching Entrepreneurship: Impact Of Business Training On Microfinance Clients and Institutions," *Review of Economics and Statistics*, 93(2):510-527.
- Karlan, Dean, and Jonathan Zinman (2010). "Expanding Credit Access: Using Randomized Supply Decisions To Estimate the Impacts," *Review of Financial Studies*, 23(1), January 2010.
- Karlan, Dean, and Jonathan Zinman (2011). "Microcredit in Theory and Practice: Using Randomized Credit Scoring for Impact Evaluation," *Science*, 332(6035):1278-1284.
- Mano, Yukichi, Alhassan Iddrisu, Yutaka Yoshino, and Tetsushi Sonobe (2011). "How Can Micro and Small Enterprises in Sub-Saharan Africa Become More Productive? The Impacts of Experimental Basic Managerial Training," Policy Research Working Paper Series 5755, The World Bank.
- McKenzie, David and Christopher Woodruff (2008). "Experimental Evidence on Returns to Capital and Access to Finance in Mexico," *The World Bank Economic Review* 22(3):457-482, 2008.
- McKenzie, David, and Christopher Woodruff (2012). "What are we learning from business training and entrepreneurship evaluations around the developing world?" working paper.
- Morduch, Jonathan, Shamika Ravi and Jonathan Bauchet (2011). "Failure vs. Displacement: Why an Innovative Anti-Poverty Program Showed No Net Impact" working paper.
- Sonobe, Tetsushi, and Aya Suzuki (2011). "KAIZEN for Managerial Skills Improvement in Small and Medium Enterprises: An Impact Evaluation Study," working paper.
- Udry, Christopher, and Santosh Anagol (2006). "The Return to Capital in Ghana," *American Economic Review Papers & Proceedings*, vol. 96(2), pages 388-393, May.
- Valdivia, Martin (2012). "Training or Technical Assistance for Female Entrepreneurship? Evidence from a Field Experiment in Peru," GRADE working paper.

IX. Tables and Figures

Figure 1: Timeline



Survey Modules								
<u>All Modules</u>	<u>Rnd 1</u>	<u>Rnd 2</u>	<u>Rnd 3</u>	<u>Rnd 4</u>	<u>Rnd 5</u>	<u>Rnd 6</u>	<u>Rnd 7</u>	<u>Rnd 8</u>
Income	Income		Income		Income	Income	Income	Income
Biz Overview	Biz Overview		Biz Overview			Biz Overview		Biz Overview
Staff	Staff					Staff		Staff
Assets	Assets					Assets		Assets
Finance	Finance		Finance			Finance		Finance
Operations	Operations		Operations				Operations	
Rev/Expense	Rev/Expense				Rev/Expense	Rev/Expense		Rev/Expense
Products		Products	Products		Products	Products		Products
Marketing		Marketing					Marketing	
Skills/Formality		Skills/Formality					Formality	
Household		Household					Household	
Financial Literacy		Financial Literacy						Financial Literacy
Attitudes		Attitudes					Attitudes	
Social Networks		Social Networks						
Games		Games					Games	
Bookkeeping			Bookkeeping				Bookkeeping	Bookkeeping
Quality of Consulting								Quality of Consulting
Daily Logs				Daily Logs				

Figure 2: Histogram of hours of consulting per tailor

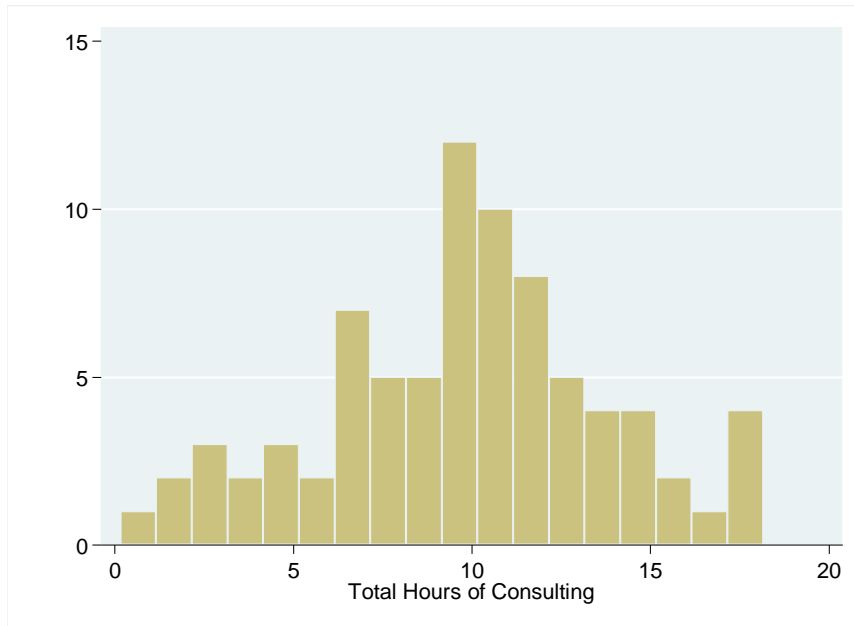


Figure 3: Mean Income by Month

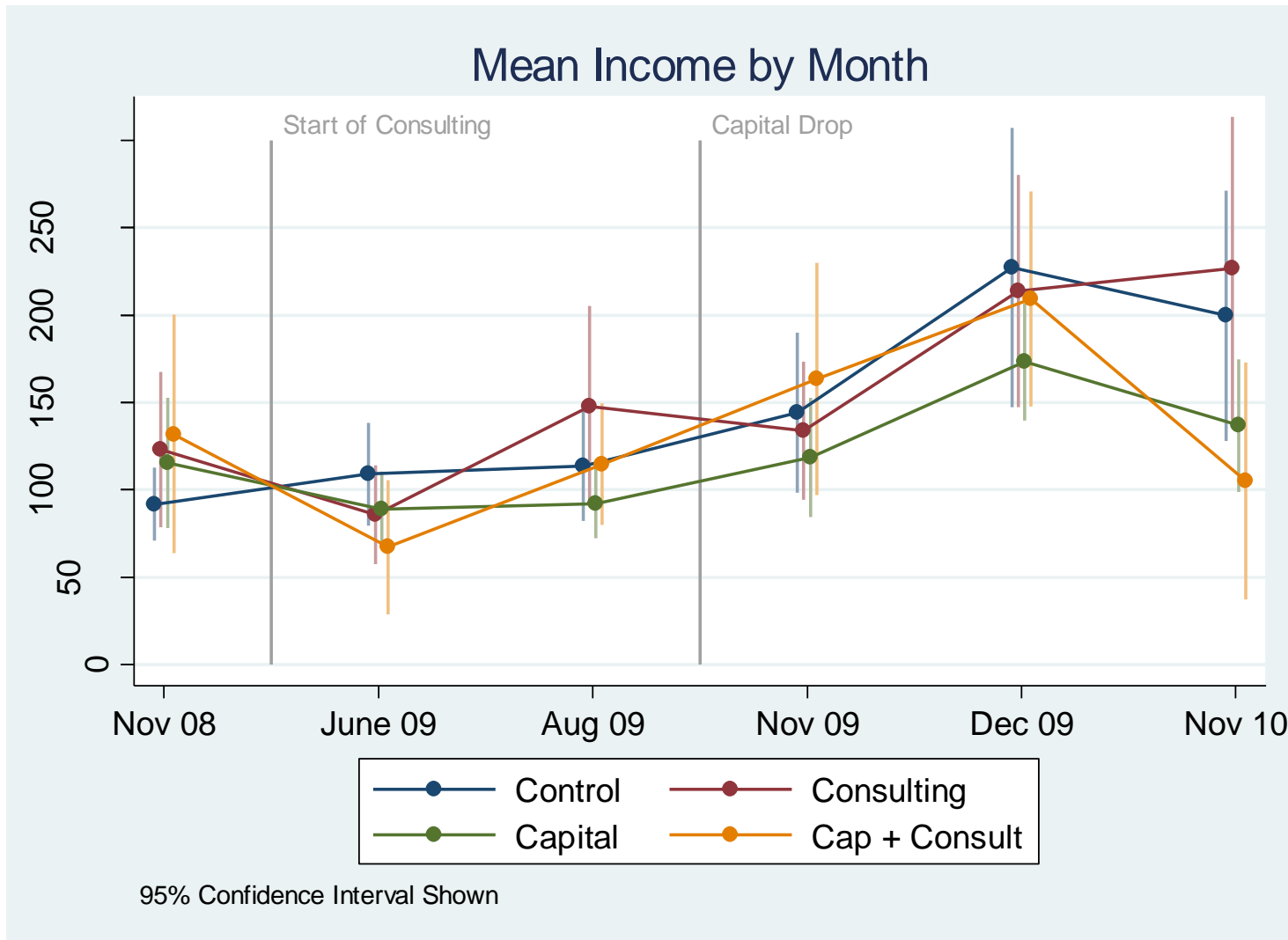


Table 1: Baseline Summary Statistics and Randomization Check

	Baseline Sample Stats			Randomization Check: Differences from Mean					
	Mean	Min	Max	Control	Consulting Only	Capital Only	Capital & Consulting	Model F-Stat	Prob > F
	(std dev)			(std err)	(std err)	(std err)	(std err)		
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
Male	0.43 (0.5)	0	1	0.00777 (0.0549)	-0.0166 (0.0549)	0.0424 (0.0570)	-0.0424 (0.0586)	0.297	0.880
Age	35.29 (7.8)	22	76	0.125 (1.181)	-1.655 (1.181)	1.816 (1.227)	-0.204 (1.278)	1.048	0.385
Married	0.56 (0.5)	0	1	0.120 (0.0772)	0.0229 (0.0772)	-0.115 (0.0802)	-0.00694 (0.0824)	1.148	0.336
Literate	1.30 (1.0)	1	5	0.101 (0.166)	0.0421 (0.164)	-0.0561 (0.172)	-0.0708 (0.177)	0.175	0.951
Number of Children	1.24 (1.3)	0	6	0.343* (0.205)	-0.120 (0.205)	-0.103 (0.219)	-0.0420 (0.222)	0.853	0.494
Shop is cement	0.21 (0.4)	0	1	0.0620 (0.0630)	0.0620 (0.0630)	-0.0484 (0.0654)	-0.0951 (0.0672)	1.123	0.348
Income last month	113.99 (122.9)	0	1000	-22.20 (19.94)	8.924 (20.75)	1.570 (22.01)	17.84 (22.74)	0.511	0.728
Ave Monthly Revenue	240.21 (224.9)	12	2000	3.392 (35.79)	61.50* (35.35)	-36.21 (38.26)	-32.62 (38.81)	1.160	0.331
Monthly Expenses	247.66 (262.9)	3	1712	33.66 (41.63)	-16.56 (41.63)	6.848 (43.24)	-19.59 (44.42)	0.258	0.904
Apprentices	0.86 (1.1)	0	5	-0.204 (0.171)	0.430** (0.171)	-0.205 (0.178)	-0.0292 (0.183)	2.263	0.0649
Employees	0.35 (0.6)	0	4	-0.00854 (0.0984)	-0.0329 (0.0984)	0.124 (0.102)	-0.1000 (0.105)	0.623	0.647
Fixed Assets	1566.01 (1975.8)	110	20230	-72.22 (312.1)	-125.3 (312.1)	457.0 (324.2)	-260.8 (333.0)	0.704	0.590
Working Capital	184.02 (263.6)	0	2000	48.96 (41.23)	42.38 (41.74)	-68.07 (44.00)	-16.59 (44.62)	1.243	0.295
Keeps Records	0.17 (0.4)	0	1	-0.0224 (0.0594)	-0.0468 (0.0594)	0.0681 (0.0617)	0.0257 (0.0634)	0.536	0.710
Registered Business	0.53 (0.5)	0	1	0.0297 (0.0788)	0.00534 (0.0788)	0.0214 (0.0818)	-0.00347 (0.0841)	0.0543	0.994
Has Ever Taken a Loan	0.11 0.3	0	1	-0.0331 (0.0479)	-0.0575 (0.0479)	0.131*** (0.0498)	-0.0229 (0.0511)	2.251	0.0662
Social Network Size	2.81 (2.6)	0	13	-0.0808 (0.289)	0.0168 (0.289)	-0.0757 (0.300)	0.271 (0.308)	0.230	0.922
Digits Backward	3.11 (0.9)	1	6	-0.0881 (0.0997)	-0.0637 (0.0997)	0.0980 (0.104)	0.0264 (0.106)	0.537	0.709

Notes: Standard errors and F-Stat are from a regression of de-measured baseline values against all four groups with no constant. Baseline standard deviations are reported below baseline means.

Table 2: Business Literacy and Practices

	Business Literacy	Business Practices				Record Keeping			
	Rnd 8 Dec-10 ols (1)	Pooled (2)	Rnd 3 Jul-09 ols (3)	Rnd 7 Jan-10 ols (4)	Rnd 8 Dec-10 ols (5)	Pooled (6)	Rnd 3 Jul-09 probit (7)	Rnd 7 Jan-10 probit (8)	Rnd 8 Dec-10 probit (9)
Consulting	0.309** (0.120)	0.0363* (0.0200)	0.0565*** (0.0216)	0.0295 (0.0211)	0.00807 (0.0312)	0.220*** (0.0519)	0.448*** (0.0786)	0.227*** (0.0777)	0.0663 (0.0713)
Test Consulting = Consulting in Rnd 3									
Chi-sq				0.86	1.74			3.70	9.12
p				0.355	0.187			0.055	0.003
Observations	149	749	150	153	149	452	150	153	149
Rounds with Data		1, 2, 3, 5, 6, 7, 8				1, 3, 7, 8			
Individuals		154				154			
Outcome Mean at Baseline	None	0.398	0.398	0.398	0.398	0.169	0.169	0.169	0.169
Control for Outcome Value at Baseline	No	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Number of items in practices index		35	19	20	23				

*p < . 10, **p < .05, ***p < . 01

Standard errors in parenthesis

All regressions include dummies for which neighborhood the tailors lived in at the baseline.

Consulting in this table includes both individuals assigned to Consulting and individuals assigned to Consulting and Capital

Business literacy is the number of answers correct on a 4 question test of business literacy

Business Practices is the percentage of all practices recommended by the consultants that were adopted in that round. All practices were not measured in all rounds.

Record Keeping is whether the respondent stated that they keep financial records.

Round-by-round record keeping regressions are probit models with marginal effects reported

Test Consult = Consult in Rnd 3 reports the result of a Wald test that the coefficient on Consulting in Round 1 is equal to the coefficient on Consulting in Round 3.

Table 3: Investment Flows

	Actual Investment in Category of Likely Use for 200 Cedi Grant at Baseline		Investments Made During Previous Year							
	Dec-09	Dec-10	Dec-09				Dec-10			
			Total Investment	Machines	Property/ Shop	Inputs	Total Investment	Machines	Property/ Shop	Inputs
	ols	ols	ols	ols	ols	ols	ols	ols	ols	ols
(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	
Consulting Only	11.33 (90.89)	-72.74 (85.75)	151.6 (270.8)	-61.56 (72.66)	211.8 (226.5)	-5.396 (27.49)	-175.9 (184.5)	-32.57 (57.09)	-36.55 (106.1)	-35.76 (59.94)
Capital Only	179.3* (92.13)	-13.70 (88.96)	73.52 (274.7)	-85.88 (73.75)	166.8 (229.5)	46.35* (27.52)	-378.3* (191.6)	-106.0* (59.31)	-123.9 (110.0)	-21.52 (61.30)
Consulting & Capital	89.57 (93.34)	-64.92 (88.00)	269.0 (278.7)	54.75 (74.66)	199.4 (232.8)	21.12 (28.16)	-66.51 (189.7)	-13.64 (58.62)	63.45 (108.9)	9.693 (61.37)
p value on tests of joint significance										
Consulting & Capital with Consulting	0.53	0.36	0.38	0.96	0.30	0.75	0.46	0.65	0.89	0.81
Consulting & Capital with Capital	0.10	0.61	0.47	0.81	0.36	0.16	0.18	0.24	0.75	0.91
p value on tests of equality of means										
Consulting & Capital = Consulting	0.40	0.93	0.67	0.12	0.96	0.34	0.56	0.74	0.35	0.45
Consulting & Capital = Capital	0.34	0.57	0.49	0.06	0.89	0.37	0.11	0.13	0.10	0.61
Observations	153	149	153	153	153	153	149	149	149	149

*p < . 10, **p < .05, ***p < . 01

Standard errors in parenthesis

All variables winsorized at the highest 1%

See Appendix Table 3 for breakdown of likely investment categories at baseline.

All regressions include baseline asset controls and dummies for community

Table 4: Savings

	Total Savings				Bank Savings				Susu Savings			
	Rnd 3 Jul-09	Rnd 6 Dec-09	Rnd 8 Dec-10	Pooled	Rnd 3 Jul-09	Rnd 6 Dec-09	Rnd 8 Dec-10	Pooled	Rnd 3 Jul-09	Rnd 6 Dec-09	Rnd 8 Dec-10	Pooled
	ols (1)	ols (2)	ols (3)	ols (4)	ols (5)	ols (6)	ols (7)	ols (8)	ols (9)	ols (10)	ols (11)	ols (12)
Consulting Only	8.842 (14.27)	36.61 (34.89)	3.233 (46.43)	10.46 (18.28)	9.592 (13.24)	20.65 (30.56)	7.693 (38.92)	10.83 (16.80)	8.244 (5.444)	16.55* (9.439)	13.21 (15.98)	8.547 (6.203)
Capital Only		11.61 (31.05)	6.639 (42.17)	3.159 (29.49)		6.999 (28.81)	-2.228 (37.37)	0.742 (26.45)		2.783 (8.368)	10.81 (14.48)	2.158 (8.081)
Consulting & Capital		75.13** (35.68)	8.617 (47.44)	28.96 (21.99)		47.42 (31.31)	-2.079 (39.83)	19.33 (18.31)		28.38*** (9.649)	22.75 (16.34)	16.63* (8.448)
p value on tests of joint significance												
Consulting & Capital with Consulting		0.08	0.89	0.24		0.22	0.94	0.30		0.01	0.22	0.04
Consulting & Capital with Capital		0.14	0.84	0.41		0.29	0.95	0.57		0.05	0.21	0.16
p value on tests of equality of means												
Consulting & Capital = Consulting		0.22	0.89	0.42		0.36	0.79	0.66		0.16	0.50	0.33
Consulting & Capital = Capital		0.06	0.97	0.45		0.19	1.00	0.52		0.01	0.44	0.14
Observations	150	153	149	452	150	153	149	452	150	153	149	452
Outcome Mean at Baseline	79.4	79.4	79.4	79.4	53.3	53.3	53.3	53.3	18.6	18.6	18.6	18.6

*p < . 10, **p < .05, ***p < . 01

Standard errors in parenthesis

Controls for baseline value and community in all regressions

Table 5: Change in Net Financial Flows, All Channels

	Loan Amounts		Investment in Goal, Savings, and Avoided Loans		Total Investment, Savings, and Avoided Loans	
	Dec-09	Dec-10	Dec-09	Dec-10	Dec-09	Dec-10
	ols (1)	ols (2)	ols (3)	ols (4)	ols (5)	ols (6)
Consulting Only	-55.82 (55.47)	-31.71 (88.69)	67.35 (113.1)	-42.43 (113.9)	211.6 (286.7)	-54.14 (149.3)
Capital Only	-135.6** (55.40)	21.75 (90.56)	326.2*** (114.6)	-43.32 (118.2)	191.5 (290.6)	-245.6 (154.9)
Consulting & Capital	-85.09 (56.99)	13.12 (91.06)	229.3* (116.3)	-69.13 (117.1)	400.0 (294.9)	17.27 (153.4)
p value on tests of joint significance						
Consulting & Capital with Consulting	0.15	0.91	0.14	0.58	0.23	0.89
Consulting & Capital with Capital	0.02 **	0.82	0.01 ***	0.58	0.24	0.39
p value on tests of equality of means						
Consulting & Capital = Consulting	0.60	0.61	0.16	0.82	0.52	0.64
Consulting & Capital = Capital	0.38	0.93	0.41	0.83	0.48	0.10 *
Observations	153	149	153	149	153	149

*p < . 10, **p < .05, ***p < . 01

Standard errors in parenthesis

Columns 1 and 2 winsorized at the highest 1%. Columns 3-5 winsorized at highest and lowest 1%

See Appendix Table 3 for breakdown of likely investment categories at baseline.

Controls for baseline value and community in all regressions

Columns 3 and 4 are investment in goal category plus savings minus loans taken

Columns 5 and 6 are total investment plus savings minus loans taken

Table 6: Profitability Pooled

	<u>Stated Income</u> Pooled (1)	<u>Revenue</u> Pooled (2)	<u>Expenses</u> Pooled (3)	<u>Revenue less Expenses</u> Pooled (4)	<u>Hours Worked per Month</u> Pooled (5)	<u>Total Staff</u> Pooled (6)	<u>Apprentices</u> Pooled (7)	<u>Paid Employees</u> Pooled (8)
Consulting Only	0.905 (21.42)	-33.34 (38.76)	-18.24 (29.97)	-15.89 (22.35)	2.325 (11.40)	0.0565 (0.205)	0.0687 (0.157)	0.0474 (0.106)
Capital Only	-45.43** (21.99)	29.24 (86.31)	12.52 (49.82)	-23.41 (32.50)	4.284 (10.89)	-0.158 (0.205)	0.0166 (0.146)	-0.169 (0.112)
Consulting & Capital	-23.23 (20.06)	-29.94 (39.43)	7.778 (34.36)	-42.33* (24.07)	-12.87 (11.63)	-0.0159 (0.192)	-0.0376 (0.155)	0.104 (0.117)
p value on tests of joint significance								
Any Consulting	0.52	0.34	0.85	0.12	0.58	0.91	0.91	0.44
Any Capital	0.06 *	0.99	0.77	0.15	0.65	0.61	0.93	0.74
p value on tests of equality of means								
Consulting & Capital = Consulting	0.29	0.93	0.42	0.34	0.25	0.73	0.53	0.61
Consulting & Capital = Capital	0.30	0.49	0.92	0.59	0.17	0.49	0.74	0.02 **
Observations	747	445	447	444	452	302	302	302
Rounds with Data	1,3,5,6,7,8	1,5,6,8	1,5,6,8	1,5,6,8	1,3,6,8	1,6,8	1,6,8	1,6,8
Individuals	154	154	154	154	154	153	153	153
Outcome Mean at Baseline	111.9	235.0	244.9	1.2	243.0	1.3	0.9	0.4

*p < . 10, **p < .05, ***p < . 01

Standard errors in parenthesis

Revenue, expenses and revenue less expenses all include both baseline revenue and baseline expenses as a control for consistency

Profit, Revenue less expenses and profit per hour are winsorized (capped) at highest and lowest 1%

Revenue, expenses and hours worked are winsorized (capped) at the highest 1%

Controls for baseline value and community in all regressions

Table 7: Profitability by Round

	Income					Revenue			Expenses		
	Rnd 3 Jul-09	Rnd 5 Sep-09	Rnd 6 Dec-09	Rnd 7 Jan-10	Rnd 8 Dec-10	Rnd 5 Sep-09	Rnd 6 Dec-09	Rnd 8 Dec-10	Rnd 5 Sep-09	Rnd 6 Dec-09	Rnd 8 Dec-10
	ols (1)	ols (2)	ols (3)	ols (4)	ols (5)	ols (6)	ols (7)	ols (8)	ols (9)	ols (10)	ols (11)
Consulting Only	-25.83* (13.39)	25.67 (16.74)	-17.04 (29.91)	-15.83 (40.02)	11.35 (44.69)	24.25 (26.24)	-7.319 (47.73)	-131.2 (114.0)	5.541 (13.02)	-0.327 (33.30)	-68.33 (73.77)
Capital Only			-29.21 (30.31)	-52.62 (40.58)	-74.61 (46.28)		-3.283 (48.30)	45.69 (118.4)		52.67 (33.73)	-25.61 (76.64)
Consulting & Capital			6.597 (30.83)	-16.06 (41.29)	-98.46** (46.09)		35.79 (48.90)	-143.8 (116.9)		34.62 (34.14)	-0.459 (75.63)
p value on tests of joint significance											
Consulting & Capital with Consulting			0.84	0.65	0.27		0.73	0.17		0.56	0.59
Consulting & Capital with Capital			0.67	0.33	0.03 **		0.70	0.63		0.14	0.84
p value on tests of equality of means											
Consulting & Capital = Consulting			0.43	1.00	0.02 **		0.37	0.91		0.31	0.37
Consulting & Capital = Capital			0.24	0.37	0.61		0.42	0.11		0.60	0.74
Observations	149	144	152	153	149	144	151	149	145	153	149
Outcome Mean at Baseline	111.9	111.9	111.9	111.9	111.9	235.0	235.0	235.0	244.9	244.9	244.9

*p < .10, **p < .05, ***p < .01

Standard errors in parenthesis

Controls for baseline value and community in all regressions

Consulting includes all 80 individuals assigned to the consulting group in rounds 3 and 5

Revenue and expenses include both baseline revenue and baseline expenses as a control for consistency

Revenue and expenses are winsorized at the highest 1% and income is winsorized at the highest and lowest 1%

Table 8: Profitability Tails

	Top 10% of Income						Top 5% of Income					
	Pooled	Rnd 3	Rnd 5	Rnd 6	Rnd 7	Rnd 8	Pooled	Rnd 3	Rnd 5	Rnd 6	Rnd 7	Rnd 8
	(1)	Jul-09	Sep-09	Dec-09	Jan-10	Dec-10	(7)	Sep-09	Dec-09	Dec-10	Jan-10	Dec-09
Consulting Only	0.00275 (0.0515)	-0.0737 (0.0507)	0.0620 (0.0584)	-0.0491 (0.100)	-0.0195 (0.111)	0.0192 (0.0999)	0.0161 (0.0427)	-0.0166 (0.0371)	0.0623 (0.0429)	-0.00323 (0.0695)	-0.115 (0.0934)	0.0821 (0.0783)
Capital Only	-0.0644 (0.0636)			-0.0857 (0.102)	-0.0119 (0.112)	-0.141 (0.103)	-0.0650 (0.0460)			-0.0701 (0.0704)	-0.173* (0.0947)	-0.0159 (0.0810)
Consulting & Capital	-0.0659 (0.0517)			0.0324 (0.103)	-0.0178 (0.114)	-0.295*** (0.103)	-0.0337 (0.0425)			0.00947 (0.0716)	-0.113 (0.0963)	-0.113 (0.0807)
p value on tests of joint significance												
Consulting & Capital with Consulting	0.47			0.92	0.85	0.12	0.80			0.96	0.17	0.82
Consulting & Capital with Capital	0.17			0.76	0.88	0.02 **	0.18			0.62	0.09 *	0.36
p value on tests of equality of means												
Consulting & Capital = Consulting	0.22			0.42	0.99	0.00 ***	0.31			0.86	0.98	0.01 **
Consulting & Capital = Capital	0.98			0.25	0.96	0.14	0.53			0.26	0.53	0.23
Observations	747	149	144	152	153	149	747	149	144	152	153	149
Individuals	154						154					

*p < .10, **p < .05, ***p < .01

Standard errors in parenthesis

Controls for baseline value and community in all regressions

Consulting includes all 80 individuals assigned to the consulting group in rounds 3 and 5

Table 9: Results from Comparable Studies

Type of study	Citation	Change in average investment /practices?	Change in average profits?	Increase in likelihood of extreme positive profits?
Grant	de Mel et al. (2008)	Increase	Increase	Yes ⁸
Grant	Fafchamps et al. (2012)	Increase ⁹	Increase ¹⁰	Yes ¹¹
Grant	Berge, Bjorvatn, Tungodden (2011)	Increase (n.s.) ¹²	Increase (n.s.) ¹³	Not reported
Credit	Karlan and Zinman (2011) ¹⁴	No	Increase (n.s.)	Yes ¹⁵
Credit	Banerjee et al. (2011)	No	No	Not reported
Credit	Attanasio et al. (2012)	Increase	Decrease (n.s.) ¹⁶	Not reported
Credit	Augsburg et al. (2012)	Increase ¹⁷	Increase (n.s.)	Not reported
Skills and principles training	Karlan and Valdivia (2011)	Increase ¹⁸	Increase (n.s.) ¹⁹	Yes (n.s.) ²⁰

8 Data available online on Chris Woodruff's website. Any treatment led to an increase in the probability of being in the top 5% of profits by 1.4% (s.e. 0.88%, p=0.105)

9 Figure 3 (males) and Figure 4 (females), and Table 5

10 Table 3, positive and statistically significant effects for in-kind grants and positive but not statistically significant effects for cash grants.

11 Figure 1 (males) and Figure 2 (females)

12 Table 5A, Column 3

13 Table 4A, Columns 1-6

14 The 2010 working paper version published online as a Yale University Economic Growth Center working paper, and not the final published version, includes the relevant results for this analysis here.

15 Supplemental Table 4, available online, provides the result for average increase in profits (6.7%, s.e. 9.7%). In analysis conducted from the downloaded data, but not reported in the published paper, we find access to credit made individuals 3.2 percentage points (s.e. of 1.6 percentage points) more likely to have log profits above 11, which corresponds to the top 5% of the sample frame

16 Table 6, Column 5 shows a negative but not significant impact on profits on average for both group and individual liability, albeit with very large standard errors

17 Table 3, Column 1 reports an increase of 5.3 (se=2.0) percentage points likelihood of ownership of inventory

18 Table 2

19 Table 1

20 Not reported in paper. Data available at <http://karlan.yale.edu/p/>. In analysis conducted from the downloaded data, but not reported in the published paper, we find training led to an increase of 0.6 percentage points (s.e. 0.9) in the likelihood that normal week profits are in the top 5% of the sample frame.

Rules of thumb cash management training	Drexler, Fischer, and Schoar (2011) ²¹	Increase ²²	Increase (n.s.) ²³	Not reported
Type of study	Citation	Change in average investment /practices?	Change in average profits?	Increase in likelihood of extreme positive profits?
Principles of accounting training	Drexler, Fischer, and Schoar (2011) ²⁴	Increase (n.s.)	Decrease (n.s.)	Not reported
Eight-day training session on business fundamentals with hands-on activities.	Giné and Mansuri (2011) ²⁵	Increase ²⁶	Decrease (n.s.) ²⁷	Not reported
Twenty-one sessions of forty-five-minute business training classes with case studies and role play.	Berge, Bjorvatn, Tungodden (2011) ²⁸	Increase ²⁹	Increase for males, decrease for females (n.s.) ³⁰	Not reported
Six modules on the basics of accounting, investment, and other business fundamentals.	Bruhn and Zia (2011) ³¹	Increase ³²	Decrease (n.s.) ³³	Not reported

21 <http://www.mit.edu/~aschoar/KIS%20DFS%20Jan2011.pdf>

22 The rule-of-thumb course had significant and positive impacts on business practices; the accounting course had no significant impact. Table 3, column 5 shows significant impacts (at the 5% level or lower) on the order of 6-12% for the likelihood of separating business and personal cash, keeping accounting records, separating business and personal accounts, setting aside cash for business expenses, and calculating revenues formally for participants in the rule-of-thumb course. Additionally, Table 10, column 3 shows a decrease of 9% in financial reporting inconsistencies, significant at the 10% level for the rule-of-thumb treatment group.

23 Table 3 columns 5 and 3 show that sales increased more than expenses for the rule-of-thumb treatment, while expenses decreased less than sales did for the accounting principles treatment.

24 <http://www.mit.edu/~aschoar/KIS%20DFS%20Jan2011.pdf>

25 http://siteresources.worldbank.org/DEC/Resources/Money_or_Ideas.pdf

26 Panel A of Table 3 shows significant and positive increase of 0.131 standard deviations in an index of business practices.

27 Panel A of Table 3 shows negative but not statistically significant impact on average sales and profits (-0.021 standard deviations, s.e. 0.054).

26 <http://www.nhh.no/Admin/Public/DWSDownload.aspx?File=%2ffiles%2ffiler%2fstitutter%2fsam%2fDiscussion+papers%2f2011%2f01.11.pdf>

29 Table 5C columns 1-3 show that training increased indices of business practices around marketing, commerce and record-keeping, ($p < 0.05$). Table 6A column 2 shows that business knowledge increased ($p < 0.05$).

30 Table 4A, columns 1-6 show that male participants in business training increased profits by 20-30% ($p < 0.05$), while female participants had decreased profits (n.s.).

31 http://econ.worldbank.org/external/default/main?pagePK=64165259&piPK=64165421&theSitePK=469372&menuPK=64216926&entityID=000158349_20110427082512

Five-months of free management consulting to randomly selected plants of large Indian textile firms.	Bloom et al. (2012) ³⁴	Increase ³⁵	Increase ³⁶	Not reported
Three modules of business training administered over fifteen days.	Mano et al. (2011) ³⁷	Increase ³⁸	Increase ³⁹	Not reported
Classroom and on-site business training.	Sonobe and Suzuki ⁴⁰ (2011)	Increase ⁴¹	Mixed (n.s.) ⁴²	Not reported
Forty-seven hours of basic business training for female entrepreneurs.	Calderon, Cunha, and Giorgi (2011) ⁴³	Increase ⁴⁴	Increase (n.s.) ⁴⁵	Not reported
Type of study	Citation	Change in average investment /practices?	Change in average profits?	Increase in likelihood of extreme positive profits?

32 Table 11 column 1 shows a significant decrease of 21% in the likelihood of using a personal account for business.

33 Table 9 column 1 shows a decrease (n.s.) in net profits.

34 <http://www.stanford.edu/~nbloom/DMM.pdf>

35 Table A1 shows a p-value below .01 for a positive difference in difference between the treatment and control group management practices before and after the treatment.

36 Table A2 shows an estimated impact of \$325, 000 on plant profitability for significant improvements in plant performance, tested in columns 1-8 of Table 2.

37 <http://www->

wds.worldbank.org/external/default/WDSContentServer/IW3P/IB/2011/08/09/000158349_20110809112532/Rendered/PDF/WPS5755.pdf

38 Table 6 columns 1-3 show significant increases in visiting customers, record keeping, and record analysis.

39 Table 6 column 6 shows positive impacts of training on profits for both fabricators and machinists. The impact is significant and large for the fabricators but not significant for the machinists.

40 Note: this study is ongoing and the results presented are preliminary.

<http://siteresources.worldbank.org/DEC/Resources/VolumeIVPart2.pdf>

41 Table 3-7-6 part 3 shows a positive and significant increase in total KAIZEN practices for both trainings in Tanzania. Table 4-10 shows a positive and significant impact on KAIZEN practices for both trainings in Ethiopia. Tables 5-13a & 5-13b show a positive and significant impact on the total business practice score for both trainings in Vietnam. Tables 6-13a and 6-13b show positive and significant impact on the total score for management practices for both trainings, also in Vietnam.

42 Table 3-8 column 3 shows a decrease (n.s.) in gross profits for both trainings in Tanzania. Further study is required to identify causal impacts on profits in Ethiopia (p. 324). Table 6-5 shows an increase in profits in the latest round of surveying for training groups in Ethiopia.

43 http://www.stanford.edu/~gabcal/financial_literacy.pdf. Note this study is ongoing and the results are for seven months only.

44 Table 3 columns 1 and 2 show positive and significant increases in keeping formal business accounts and positive increases in knowing daily and weekly profits.

45 Table 3 columns 1 and 2 show positive, but not significant increases in daily and weekly profits.

One year of weekly consulting services from local consulting firms	Bruhn, Karlan and Schoar (2012)	Increase	Increase	No (not reported in paper, analysis available from authors)
General business training (+ technical assistance sub-treatment group)	Valdivia (2012)	Increase	Increase (revenues, not profits, reported)	Not reported

X. Appendix A: Additional Tables

Appendix Table 1: Attrition

Round	Found	Not Found	Reasons Not Found			Not Found by Treatment			
			Deceased	Permanently Moved	No Info/Temporary	Control	Consulting	Capital ^{^^}	Capial and Consulting
1) Dec 2008	160	0	0	0	0				
2) Jan 2009	160	0	0	0	0				
3) July 2009	150	10	2	4	4	5	5		
4) Aug 2009	150 [^]	10	2	4	4	7	4		
5) Sept 2009	145	15	2	4	9	7	8		
6) Dec 2009	153	7	3	4	0	3	4	0	0
7) Jan 2010	153	7	3	4	0	3	4	0	0
8) Dec 2010	149	11	5	6	0	3	4	3	0

[^] Found on at least one day

^{^^} Note that capital group randomization excluded 6 individuals not found in any of rounds 3-5.

Appendix Table 2: Baseline Characteristics

	Mean	SD	Min	Median	Max	N
Income Last Month	114	123	0	80	1000	141
Average Monthly Revenue	240	225	12	200	2000	154
Monthly Expenses Excluding Rent	237	261	3	151	1712	160
Working Capital	184	264	0	100	2000	156
Fair Value of Fixed Assets	1566	1976	110	1140	20230	160
Number of Paid Employees	0.4	0.6	0.0	0.0	4.0	160
Keeps Financial Records	0.2	0.4	0.0	0.0	1.0	160
Has Ever Taken a Loan	0.1	0.3	0.0	0.0	1.0	160

Appendix Table 3: Stated Uses of Capital

Hypothetical Likely Use for 200 Cedi Grant (at baseline)	Actual Use for 200 Cedi Grant (self reported after capital drop)				Total Baseline Likely Uses
	Machines	Property	Inputs	Other	
Consulting & Capital					
Machines	0	0	1	3	4
Property	0	2	2	0	5
Inputs	7	1	9	12	27
Other	0	0	0	0	0
Total Consult & Capital	7	3	12	15	36
Capital Only					
Machines	2	2	1	0	5
Property	0	1	1	1	3
Inputs	5	4	17	7	30
Other	0	0	0	0	0
Total Capital Only	7	7	19	8	38
Overall					
Machines	2	2	2	3	9
Property	0	3	3	1	8
Inputs	12	5	26	19	57
Other	0	0	0	0	0
Overall Total	14	10	31	23	74

Note: Some people split the money into different categories,

so reported uses are greater than the number baseline likely uses

Other uses includes saving, domestic use and paying down debt

Chi2 that distribution of Consulting & Capital uses = Capital Only uses = 7.5, p = .19

XI. Appendix B: Ernst & Young Team

The four Ernst & Young consultants were supervised by a Director and a Partner at Ernst & Young – Ghana, and monitored by field staff at Innovations for Poverty Action - Ghana.

Consultant A

Consultant A is an assistant manager in the Business Advisory Service line of Ernst & Young, Ghana. He has 6 years of experience in business process reviews, monitoring and evaluation, financial re-engineering, fund management, monitoring and evaluation and internal audit. He has been involved in number of Performance Improvement related assignments in both private and public sectors. He joined Ernst & Young in 2007 and is currently based in the Accra Office. Prior to joining Ernst & Young, Consultant A worked with TOTAL Petroleum Ghana Limited as Internal Auditor.

Consultant A was team leader in the 'Returns to Business Management Consulting Study' engagement undertaken for Innovations for Poverty Action (IPA). Consultant A holds a Bachelors degree in Administration (Accounting) from the University of Ghana and a MBA in Financial Management from the University of Hull. He is a member of the Association of Chartered Certified Accountants (UK).

Consultant B

Consultant B is a Manager in Advisory Service Line and engaged in the provision of performance improvement services, including monitoring and evaluation (M&E) for clients in the public and private sector. Consultant B has over 6 years of experience in diverse areas, including Monitoring and Evaluation, Policy Analysis, Project Management, Training, Strategy Planning, Communication, Advocacy and Campaigns and Fundraising, Knowledge Management and consultancy. He joined Ernst & Young Ghana in 2008 and is based in the Accra office. He has work experience in Ghana, Sierra Leone and Liberia before joining Ernst & Young.

Consultant B holds a Master of Science in Development Policy and Planning and a Bachelor of Science in Development Planning. He is a member of Ghana Monitoring and Evaluation forum.

Consultant C

Consultant B Mensa is a Manager with Ernst & Young and has experience in Human Resource Management. Her areas of focus include HR Reorganization and Management, Training, Human Resource Policies and Procedures, Salary Surveys and Performance Management. She has highly developed research abilities and has led and supported Capacity Development and Institutional Strengthening assignments for clients both in the Public and Private Sectors. Consultant B has been involved in various roles, from support to managing, in a number of engagements. She joined Ernst & Young in 2004 and is based in the Accra office.

Consultant D

Consultant D is a Manager with Business Advisory Services within Ernst & Young focusing more on training and human resource management. She joined Ernst & Young in 2007 and

is based in the Accra office. She has over 18 years work experience and prior to joining Ernst & Young, Consultant D worked with the World Vision, SNV-Ghana (Netherlands Development Organisation), African Centre for Human Development and DANIDA Volta Region Water and Sanitation Project. She holds a BSc. Administration (Human Resource Management) from the Central University College, Ghana.

XII. Appendix C: Training Modules

	Module	Description
1	Record Keeping	<ul style="list-style-type: none"> • Gave respondents two books that covered procurement, sales, stock, cash in/out, wages, assets, etc. • Rationale for adopting bookkeeping: tracking revenue and expenses gives you a clearer picture of your financial situation • Remember to track indirect costs. Most were actually earning less than they thought they were before they started bookkeeping and including indirect costs • Monitored record keeping over the year • Took them through a monthly income statement for 1 month then monitored their own calculations of monthly income • Separation of business and personal finances • As the entrepreneur, you are both the owner of the business and an employee of the business. You are therefore entitled to both a share of the profits and a wage (wage is determined through costing)
2	Procurement	<ul style="list-style-type: none"> • Initially just-in-time buyers, purchasing what they need for each job • Advised to buy weekly stock to get bulk discounts and reduce time spent on travel • Also pay particular attention to the quality of bulk purchases – look out for high quality inputs
3	Operational Activities	<p>Very specific to the circumstances of each business. Some examples:</p> <ul style="list-style-type: none"> • Keeping your shop tidy can make customers more comfortable and more willing to pay a higher price if they can see that you are serious about the business • Need to assure consistent supply of electricity by applying pressure to the service providers • Try to charge advance every time, especially if the client is new, although it can be waived for reliable clients. (If business was slow, they were reluctant to charge advance)

		<ul style="list-style-type: none"> • Get insurance for both business and person (SSNIT) • Arrange your production process for efficiency: when should you do cutting? Who should do what? • Quality control: Monitoring of worker and apprentices • Where should you outsource knitting or other activities? Or is it better to save for a knitting machine yourself?
4	Motivation of workers	<ul style="list-style-type: none"> • How do you motivate your workers to get the best out of them? • Need to make their workers feel like they are part of the team • Reward them adequately: they have their own financial issues, just as you do • If there are any apprentices that you really want to keep, tip them some money regularly • Apprentices should be trained in customer service and should see themselves as more than just students • If your workers work particularly hard on something, give them something extra • Give workers training and teach them what you know so they can handle things when you are out of the shop • Advised to formalize agreements with employees
5	Value Addition	<ul style="list-style-type: none"> • Accept feedback and apply recommendations • Good finishing can be a source of sales, especially in conjunction w/ labels • Diversify from core business: add selling fabrics, selling inputs, buy knitting machine and take subcontracted jobs • Keep in touch w/ new designs, learn new skills and/or develop your own designs. You can then take subcontracted jobs as well if the knowledge/technique isn't common
6	Time management	<ul style="list-style-type: none"> • Planning for the business: set a time that you should be able to reach your investment goals (e.g., I will get a new container by April) • Having a consistent schedule is important so that customers know when they can stop by • Set realistic deadlines w/ customers that you can actually

		<p>meet</p> <ul style="list-style-type: none"> • Give an allowance when calculating customer deadlines in case there is a power outage. If timing is a consistent issue, leave one day a week open to handle emergencies • If you know you can't deliver on time, call the client in advance to let them know • If a customer is pushing for a tight deadline, charge a higher rate to compensate for you overtime
7	Costing	<p>A major exercise after bookkeeping was introduced.</p> <ul style="list-style-type: none"> • Took them through calculating the cost of making each product including indirect expenses, taxes & wages to determine how much they should charge for each one. • Many were undercharging, but found it difficult to raise the price if all the other tailors in the area are also undercharging • Introduced the need to account for their own time by asking how much they should charge for their own time (if you were to get someone like you to do this job, how much would you pay them? That is what you can set as your wage) • Need to add indirect costs such as rent and electricity (How many do you sew in a month? Divide the monthly rent/indirect cost by that number to get the cost per unit) • Need to add some profit as well
8	Customer Service	<ul style="list-style-type: none"> • How to receive customers: greeting them, saying thank you, accommodating their concerns with workmanship • Doing something different that will cause your customer to always come to you: give something over Christmas like a handkerchief w/ your business name printed on it, or dash them a dress if you are sewing plenty. • Know the individual customers and what they like • Create a database w/ customer names, phone numbers & where they live so you can call ones you haven't seen in a long time • Closely related to time management • Sewing well isn't enough: need to also meet deadlines, treat them nicely, make alterations for free, and so on • Be patient if the customers treat you w/ disrespect

		<ul style="list-style-type: none"> • Customer service is the key to building a base of loyal customers • Package things nicely for customers and use labels
9	Security of shop	<ul style="list-style-type: none"> • Have someone sleep in the store at night for security • Change the locks/buy more secure padlocks. • Keep valuables at home if possible. • If they have a wooden kiosk, can they save for a container?
10	Sales and Marketing	<p>Most viewed time spent marketing as competing with time spent sewing</p> <ul style="list-style-type: none"> • Market your products through labels, finishing, customer service, displaying sewn items • Buy fabrics so you can do sew & sell or let the customer buy their fabric right from your shop. • Help your customers to understand why you charge the prices you do if they think that the price is high • Go to offices/businesses/schools to let them know about your product • Tell people around about your abilities • Call customers that haven't visited in a while • Register business as this can be necessary for large contracts • When you get the contract, formalize terms of payment and deliverables • Get a signboard if you don't already have one. • Making sure you kiosk isn't an eyesore: look presentable!
11	Lifestyle in relation to work/life	<ul style="list-style-type: none"> • How do you balance child rearing/other household responsibilities and business? Do you need to work early or late or work from home sometimes? • Need to rest to maintain stamina • Dress professionally as if you come to work, not casually as if you're at home • Have a serious mind for work • See a doctor regularly and check your blood pressure

12	Financing of business/savings	<ul style="list-style-type: none"> • If you want to be able to grow, the best source for cash is retained profits. Identify how much you can save through your bookkeeping • Advised against getting a loan unless they have a concrete goal and plan to repay the principal and interest. <ul style="list-style-type: none"> ○ If you do to take a loan, top it up with savings to keep the amount borrowed low. ○ Pay particular attention to how much interest you will be paying. Ask them to calculate the amount of cash you will actually pay as interest instead of talking about it as a percentage • If you don't have a bank account, open one. If you don't have a separate business account, open one. • Don't dip hands into business money • Buy treasury bills for savings
13	Business Growth	<ul style="list-style-type: none"> • Identify concrete goals for expansion <ul style="list-style-type: none"> ○ How much will it cost to reach your goal? ○ How much would you have to save every week to get that much money? ○ If the savings goal is realistic, no need to take a loan ○ If the savings goal is unrealistic, a loan + savings might be worthwhile • If you consider a new location, be sure that the land rights are secure <ul style="list-style-type: none"> ○ Is a new location necessary or could your problems be solved through better marketing? • If you know that there is a weakness in your skills set, take a course with a fashion school or association • Objective setting; short term, medium term and long term • Apart from sewing, what else can you do? Add on other businesses to protect against the seasonality of sewing • Sell the raw materials you use • How will your grow your customer base? <ul style="list-style-type: none"> ○ As your customer base is growing, how do you keep meeting your deadlines? Additional workers? Better machines? • Model: build customer base, hire more workers, buy faster machines with savings • If you have a specific need that requires investments to meet your customer demands, you can go in for a loan

XIII. Appendix D: Examples of Mentorship

Client	Consultant's Notes
819	<p>Introduced bookkeeping and she adopted it and maintained records consistently. Wants to be a designer so advised her to seek a training course. Starting doing some more marketing but she is near the limit of her capacity so they developed plans to increase capacity by hiring a worker. Has expanded her shop a lot and took on an apprentice. Got connected to electricity and keeps a very clean shop. Adopted labels and sales of materials. Aims at a higher end customer. Responded to questions; client really embraced the consultancy.</p>
810	<p>Covered all models but he wasn't very interested in actually adopting new ideas. Wants to relocate his shop. Sews uniforms for school sports teams. Thinks that since he's approaching retirement it's not necessary to be aggressive about expanding and he wants to move his shop. Advised to do aggressive marketing for schools & use calling cards</p>
402	<p>Was suspicious of consultancy at first but really caught on. Registered her business, buys in bulk, keeps records, started using labels, dashes customers toffees. Developed plan to get a new apprentice. Wants to relocate to a place on the main road and discussed issues involved in moving. Will often ask questions about the decisions she's facing.</p>
415	<p>Has a second job sewing for industrial sewing shop so he's often not in the shop. Even when he's around he is not open regularly. Met him late in the year & didn't spend much time together.</p>
304	<p>Sews under a tree. Started well w/ bookkeeping although stopped along the line. Opened a bank account and was saving through account, also bought t-bills. No employees. Raised prices a bit before Christmas. Sews well & has good customer relations. Started insisting on advance.</p>
309	<p>Was big on record keeping before she feel sick. Very disciplined w/ finances. Help provide structure for her saving, separating business & personal expenses, paying self wage. Was sick, lost her mother, then got sick again, so we didn't have as much time together. Went through costing & value addition but doesn't have employees. Didn't cover sales/marketing. Already had good customer service. Lifestyle was an important topic. Started insisting on advance.</p>
709	<p>Initially difficult to convince of the value of consulting but became more receptive over time. Discussed diversifying away from sewing only suits. Tried</p>

	sewing shirts and was overwhelmed by their popularity. Has a huge potential if he can diversify his products and do enough marketing. Discussed bookkeeping but he stopped along the line, although he has a good memory. Discussed savings. Wants to move to a new place (w/ help in financing from one of his customers). Procurement: started buying enough for ~5 suits at once. Interested in labels for suits and branding on bags. Was sick for a month so discussed health issues.
713	Very unreceptive at the start but warmed up eventually. Started insisting on advance and changed prices based on costing. Had a special interest in selling raw materials and used the capital drop for this after some discussion. Is moving shops. Opened a bank account for the first time with the money from the money games (the 6 Cedis). Has also started saving. Didn't really take up bookkeeping at all (may be only semi-literate). Talked about value addition but she didn't implement it. Didn't really cover marketing at all.
509	Didn't spend much time on record keeping because she was already keeping records on a computer. Has several other businesses in addition to sewing. Discussed strategies to get more retailers to sew for and open up her own retail shop. Is taking a professional course in marketing.
515	Is considering taking a loan of GHc 1000 to buy knitting and babylocking machines so they discussed financing in detail. Covered all 13 modules. Learned a new sewing technique that she now does for other seamstresses. Advised to learn to sew men's clothes to expand market, which she did. Has a market stall in addition to shop that she isn't using so advised her to work from both locations at once.
217	Went beyond basic record keeping to the preparation of monthly income statement. She focuses on higher-end market and discussed where she can find workers who meet her quality standards. Decided to hire someone who just graduated polytechnic. Discussed using savings to purchase quality machines. Discussed her plans to return to school to study business, and developed plans to start taking on apprentices w/ an SSS education who want to become designers, almost as an academy.
209	Wants to buy an industrial machine w/ IPA grant so they worked on saving to top up the price and arranging her space so she can fit it. Her location is small so they worked on finding a second place (and leaving a worker at the current one). Expansion limited by the space that she had available
111	Is semi-literate so they covered bookkeeping using symbols. Main problem is w/ an unreliable worker. Consultant spoke with the worker about her dedication & advised owner to try to find another worker. Has a school next door who would

	give him a larger contract if he had more reliable help. Discussed banking, retirement and customer service. Wants to get a good worker who can manage the business so he can farm and stop sewing.
119	Sews in his house & doesn't have a signboard so his market is small. Discussed getting a signboard and focusing on getting larger contracts to anchor his business while his wife conducts marketing for him to try to grow individual customer base. Will complete tasks outside of meetings.
608	Implements advise very quickly! She made handkerchiefs for X-Mas and gave them out to customers. Started using dress labels. Got business registration forms but is yet to fill them out. Started offering customers minerals for free but then charges them a little bit extra for the sewing to cover the minerals cost. Hired a worker. Advised to get a computer for record keeping/customer database because she is growing very quickly
618	Got a contract recently that the consultant helped negotiate/review the details on. Semi-literate so he asked a brother to keep records for him, although the consultant also advised him to try to use symbols to write the way he understands. Focused on utilizing his bank account for savings. Also discussed labels. His brother will help him sew but isn't reliable so needs a worker. Used to sell shirts and the consultant advised him to restart this and do sew and sell.

XIV. Appendix E: Examples of Tailors

A tailor who shares his small wooden shop with another tailor



A tailor operating out of a crowded market stall, with several apprentices.



A tailor working out of a kiosk.



A tailor who owns rents space in a concrete building.



A tailor who shares a kiosk.



A seamstress who owns a converted shipping container



A tailor in his wooden shop.

