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Keeping the Doctor Away: Experimental Evidence on Investment in Preventative Health Products*

Jennifer Meredith Jonathan Robinson Sarah Walker Bruce Wydick

Abstract

January 29, 2013

Household investment in preventative health products in developing countries is typically low even though the returns to such products are high. In this paper, we experimentally estimate demand curves for health products and test whether (1) information about health risk, (2) cash liquidity, (3) peer effects, and (4) intra-household differences in preferences affect demand. In our main experiment in Kenya involving children's shoes - critical for preventing hookworm infection - price is by far the most important predictor of purchase. Providing liquidity and targeting women also increased demand. Information had no effect even though we find that genuine learning occurred. We find no peer effects even though people discussed the product purchase decision extensively. We find similar results for price and information in three smaller studies in Guatemala, India, and Uganda in experiments involving soap and multivitamins.

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1. Introduction

In many developing countries, investment in preventative health products is persistently low at market prices even though the return to these products appears to be quite high. What prevents households from investing in preventative health products? While there is no unique explanation, numerous papers have presented evidence on the effects of specific interventions. In this paper, we present results from field experiments in four countries designed to test various hypotheses against each other simultaneously.²

A number of factors have been identified as potential impediments to investments in preventative health products. First, households may lack health information: they may not be fully aware of the health risks they face, or of the role that a product can have in mitigating such risks.³ Second, households may lack liquidity. In a fully frictionless model, households who choose not to invest in preventative health products (even if the return to investment is high) do not do so because the return to some other type of investment is even higher. However, if households face credit constraints (Tarozzi et al., 2011; Devoto et al., 2011), lack secure places to save (Dupas and Robinson, 2013), or do not save as much as they planned to for behavioral reasons (e.g. Ashraf et al. 2006; Duflo et al., 2011), immediate liquidity constraints may be relevant. Third, peer effects may substantially influence investment in preventative health products, creating situations where multiple, Paretorankable equilibria may exist, and where sub-optimal levels of health product adoption are possible if there are few early adopters. Lastly, there may be intra-household conflict in spending on health (particularly for children). Numerous studies have provided evidence that women are more likely to invest in children's health than men (e.g. Thomas 1990, Duflo 2001), suggesting that targeting preventative health products at female household heads may be important.⁴

In this paper, we overlay several interventions to the methodology of Kremer and Miguel (2007), Dupas and Cohen (2009), Dupas (2012), and Ashraf, Berry, and Shapiro (2010), who estimate

¹ A partial list of technologies with high returns includes chlorine for water (Fewtrell et al. 2005; Arnold and Colford 2007), deworming drugs (Miguel and Kremer, 2004), insecticide-treated bed nets (Lengeler, 2004), and iron supplementation (Thomas et al., 2006; Bobonis et al. 2006). Many recent studies demonstrate strong price sensitivity for health products, including Cohen and Dupas (2010), Dupas (2009, 2010), Kremer and Miguel (2007) and Ashraf et al. (2010). See Kremer and Holla (2008) for a review article.

² Another recent study which considers multiple constraints simultaneously, as this paper does, is Miller and Mobarak (2011).

 $^{^3}$ For example, Cairncross et al. (2005) and Luby et al. (2004, 2005) show large effects of intensive education campaigns on hygiene. Luoto et al. (2011) show effects from information campaign and commitment devices that are more moderate.

⁴ Both Kremer and Holla (2008) and Dupas (2011) provide excellent and more amplified reviews of these issues.

experimental demand curves for health products. Our experiments take place in four countries – three smaller studies in Guatemala, India, Uganda, conducted in 2008, and a larger study in Kenya conducted in 2010. In the underlying methodology, we provide coupons to households with randomly selected product discounts which could be redeemed in exchange for the given health product. The randomization of prices allows us to directly estimate a demand curve for the product. We then crosscut this price randomization with other treatments to test the hypotheses listed above, and ascertain whether the respective treatments shift the demand curve.

Our main experiment in Western Kenya focuses on a particular health technology that could have potentially significant health impacts: rubber shoes for children.⁵ The main channel through which shoes may affect health is by preventing infection by hookworm, which is typically transmitted through contact with the soil. People become infected when their skin comes into contact with contaminated soil (typically through bare feet). While worms can be easily treated after infection (see Miguel and Kremer, 2004), initial infection can be avoided by wearing shoes.⁶

The prevention of hookworm infection has been shown to have important health effects. A well-known deworming intervention in this part of Kenya showed notable short-term health impacts (Miguel and Kremer, 2004) as well as longer-term human capital improvements (Baird et al., 2011). Spillovers from this treatment also had important cognitive effects on young children (Ozier, 2011). In a different context, Bleakley (2007) finds large effects of a hookworm-specific eradication program on school enrollment and literacy in the US South in the early 20th century. Given the serious and lasting consequences of hookworm, preventing infection by wearing shoes is likely to have a substantial direct health effect. There are also large positive externalities to shoe wearing, because wearing shoes prevents the spread of hookworm to others within the community.

Our shoe experiment was conducted in 2010 among a representative sample of 999 households in two districts of Western Kenya (Busia and Samia) in which worm infection is prevalent. While we did not perform parasitological tests for worms in this study, self-reported worm infection was quite high - respondents report that 23% of their children had worms in the past year. While much of this is

⁵ The shoes were too small for most adults to wear, and so could only be worn by children.

⁶ Though there are no randomized controlled trials on the effect of shoe wearing that we are aware of, several non-experimental studies show that regular shoe usage is associated with reduced hookworm infection when controlling for other risk factors (Phiri et al. 2002, Erosie et al. 2002). This seems plausible given the transmission pathway for the disease.

⁷ In a particularly infected area near Lake Victoria in this part of Kenya, Miguel and Kremer (2004) found that 92% of surveyed children had at least one type of helminth infection and 37% had at least one moderate-to-heavy helminth infection.

due to poor sanitation, low shoe usage is also a major risk factor: in our sample, only 17% of children owned shoes and a smaller percentage wore them regularly.⁸

In order to test our primary hypotheses, we implemented four experimental treatments in conjunction with our basic price treatment. To measure the impact of health product information, we provided a randomly selected subset of households with an information script on the dangers of worm infection, transmission pathways, and on the importance of wearing shoes in hookworm prevention. To assess the role of liquidity constraints, we gave households a randomly determined amount of cash. To test for peer effects, we stratified the intensity of our low-price treatments geographically to ascertain whether households surrounded by heavy adoption are more likely to purchase the shoes. We are also able to use random variation to examine whether information spilled over to the neighbors and other peers of treated households. Finally, to examine whether demand varied by parental gender, we randomly selected either the husband or wife (among married couples) for participation. This person was the one to receive the coupon, cash, and information script. Each of these interventions has important policy implications for understanding how to best stimulate household investment in preventative health products in developing countries.

An important result from our set of experiments is that, despite the importance often given to information dissemination in health campaigns in developing countries, we find that information alone has no impact on the ultimate purchase decision. The informational script substantially increased knowledge about worms, but this did not translate into increased demand. Our estimates are precise enough that we can rule out large effects, suggesting that information alone is unlikely to be a panacea for underinvestment in preventative health products. We also do not find any evidence that peer effects play a significant role in household purchases of the shoes.

By contrast, we find strong evidence that liquidity is important. We also find that women are more likely to redeem their coupons (by about 9 percentage points). This result is closely related to earlier studies on intra-household investment such as Thomas (1990), who shows that the propensity to invest in children increases more strongly with female than male income, or Duflo (2004) who uses an exogenous change in pension eligibility in South Africa and finds similar results. However, our study is different because the experiment did not change relative incomes (and by extension, general

⁸ While preventing hookworm infection might be the most important health benefit of shoes, it is not the only one. Wearing shoes reduces foot injuries and the chance of infection from such injuries.

⁹ The cash payment was very small relative to lifetime income. The average payout was 35 Ksh, relative to weekly income of 900 Ksh and asset ownership of around 23,000 Ksh (see Table 1). Thus, the payout had a negligible effect on household income and should only have affected cash-on-hand.

bargaining power). Instead, the experiment only varied whether the husband or wife was offered the coupon.

That the gender of the parent receiving the coupon in our study matters suggests that the flow of information within the household may be limited. In this study, it appears that mothers value health investment in children more than fathers, and that there is intra-household conflict over the allocation of resources between health investment in children and other expenditures. If the mother receives a coupon for a discount on the price for children's health investment, the household may invest more in children at the expense of other items. This decision increases the mother's welfare, but may increase her husband's welfare by less, or even reduce it. Thus, if the husband receives the coupon, he may not choose to redeem it and withhold knowledge of it from his wife. This result is similar to Ashraf (2009), who finds evidence of intra-household communication barriers in a field experiment on savings in the Philippines.

The most important result from this set of experiments, however, is that indisputably the most important predictor of investment in our preventative health products is price: about 78% of the variation in health-product purchase is explained through variation in price alone, overwhelming liquidity and gender effects. This result is particularly striking in that people had to redeem their coupons at a nearby shop – in spite of these travel costs, nearly everyone who received a low-priced coupon redeemed it. This result is consistent with the many other recent studies on the demand for preventative health products (many of which are summarized in Dupas, 2011). That price matters far more than other factors has powerful policy implications, suggesting that subsidies of preventative health products may be justifiable by virtue of their high price elasticity and the positive externalities they exhibit within a community.

Our findings therefore suggest that the most fruitful policy avenue for increasing investment is to address price and liquidity barriers. While subsidies are the most straightforward way of doing this, another alternative might be to provide people with devices which allow them to acquire the necessary liquidity to overcome the price barrier to invest in such products. For example, Dupas and Robinson (2012) experiment with several simple savings mechanisms designed to allow people to save for health, and find that people save in the devices quite readily. In that study, providing even the simplest savings technology (a box with a lock) increased investment in preventative health by 68%. Other interventions along these lines might well prove effective in increasing investment.

2. Experimental Design, Kenya

2.1. Background

Worldwide, over 2 billion people are infected with soil-transmitted helminths (STHs), the most common of which include hookworm, roundworm, and whipworm. Ouch infections are also very prevalent in Western Kenya, where this study takes place. STHs may affect all portions of the population, but school-aged children and pregnant women are especially vulnerable sub-groups (Harhay et al., 2010; Brooker, 2009; Bethony et al., 2006). While mild infection typically has limited health consequences, more severe infections can have effects on morbidity (Brooker et al., 2009; Hotez et al., 2009; Bethony et al., 2006; Chan et al., 1994), and are also suspected to increase vulnerability to other illnesses, such as malaria, HIV, tuberculosis, and anemia (Bethony et al., 2006; Specht et al., 2007; Stoltzfus et al., 1997). A number of studies have demonstrated important health and education effects of reducing worm infections (Miguel and Kremer, 2004; Baird et al., 2011; Ozier, 2011; Bleakley, 2007).

Once infected with hookworm, children can be dewormed through the use of the relatively inexpensive drug albendazole. Another pathway to reduce worm infection is to prevent children from getting infected in the first place. When an infected person defecates in the soil, hookworm eggs hatch and develop into larvae, which are able to live in the contaminated ground for up to a month before requiring a human host to survive (Stoltzfus et al., 1997 Brooker et al., 2006). Hookworm helminths are most commonly contracted through the skin (typically through bare feet), after which they migrate into the circulatory system, passing through the trachea and on to the esophagus where they are swallowed and passed into the intestines (Bethony et al., 2006; Stoltzfus et al., 1997). Thus, in areas where people do not have access to pit latrines or flush toilets, hookworm is likely to be a problem.

An important way to prevent hookworm infection is to limit skin contact with infected soil. Since infection is often through the feet, the simplest technology to prevent infection is to wear shoes. Several studies have documented a strong correlation between regular shoe-wearing and a decreased incidence of worms. For instance, Phiri et al. (2002) and Erosie et al. (2002) estimate odds ratios of 7.1

 $^{^{10}}$ See Riesel et al. (2010), Brooker et al. (2006, 2009); Hotez et al. (2006, 2007, 2009), Bethony et al. (2006), and Harhay et al. (2010).

¹¹ In a study conducted in the Rongo district of Western Kenya, Riesel et al. (2010) found that 30% of children between the ages of 2 and 18 were infected with hookworm alone, and 68% were infected with at least one hookworm, roundworm, or whipworm parasite. Similarly, Pullan et al. (2011) estimate that 54% of the population of Busia (the district of study) resides in a STH hyperendemic area, while the combined STH (i.e. hookworm, roundworm, and whipworm) prevalence rate across Western province is 80.7%.

and 1.8, respectively, to regular shoe wearing among school children in Malawi and Ethiopia (while controlling for other risk factors). While these studies cannot document a causal relationship between the lack of shoes and incidence of STH infection, the findings suggest that wearing shoes should reduce infection given the transmission pathway.

While there are obvious non-health benefits to wearing shoes, the public health evidence suggests that, overall, shoes are likely to have large direct effects on health (not only by preventing hookworm infections, but also by keeping children clean and by preventing potentially very painful foot injuries). In addition, the social return to shoe-wearing will be even higher because of spillovers to other individuals living nearby. In our sample, health is a major reason that people report for why they wear shoes; in our data, 74% reported health as the most important reason to buy shoes while 26% reported that it is to have children properly dressed. Similarly, 76% and 54% list worm and injury prevention, respectively, as reasons to purchase shoes. Another 43% report keeping children clean as a reason (which can be related to health as well).¹²

2.2 Sampling

Our main experiment was conducted in the Busia and Samia Districts of Western Kenya from February to May, 2010. Busia is a rural area near the Ugandan border with an estimated population of about 44,000 (Central Bureau of Statistics, 2001). Worm infection is very common.

In our study, parents reported that 23% of their children had a worm infection in the previous year (Table 1). This is due in part to the fact that shoe ownership is so low: parents report that only 17% of children own shoes, and an even smaller proportion of children were actually observed to be wearing shoes by an enumerator during home visits (13%).

There are several types of shoes available in Western Kenya. The most expensive are dress shoes, which cost about 750 Kenyan shillings (US\$10) per pair.¹³ These types of shoes are typically worn by adults or by children on more formal occasions, such as going to church. They are far less likely to be worn around the home by children, where worm infection is probably most likely to take place. A more common type of shoe is open-toed rubber shoes (flip-flops or rubber sandals), which are

¹² Conceivably, households could instead avoid worms by treating their children with albendazole, which costs about US \$0.70 at local pharmacies and which needs to be taken every 6 months. Since shoes cost about \$1.13, and assuming shoes last 1 year, then the shoes would have to prevent 80% as many worm infections as albendazole to be cost-effective solely on health costs. Note, however, that this is a very conservative estimate since shoes have other benefits, and since albendazole has unpleasant side effects. Even with this conservative assumption, however, it's likely that shoes would be close to cost-effective. In Miguel and Kremer (2004), deworming children decreased moderate-to-heavy prevalence from 51% to 24%, a reduction which is in the range of the odds ratio in the non-experimental listed above.

¹³ The exchange rate was roughly 75 Ksh to \$1 during the sample period.

less expensive, costing about 85 Kenyan shillings (US\$1.13) per pair at market prices, and which are more likely to be worn around the home. For this reason, we focused on the latter product for this study.

To obtain as representative a sample of households as possible, a door-to-door census was conducted with 1,547 households in two villages located roughly 11 kilometers apart (Ikonzo and Bhukulungu). The census collected basic information, including whether the household had a male or female head, the number of children in the household, and the GPS location of the household. With this data, we created 51 geographic clusters based on the GPS coordinates, and randomly selected 1,068 households for project participation, stratified by geographic cluster. We were able to interview 999 of these (93.5%).

2.3. Experimental Treatments

We implemented four main experimental treatments, all cross-cut against each other. All treatments were conducted after administering a baseline survey (discussed below), and obtaining informed consent. First, we estimate an experimental demand curve by implementing a methodology based on Kremer and Miguel (2007), Cohen and Dupas (2010), Dupas (2009, 2010), and Ashraf, Berry, and Shapiro (2010). In particular, we visited households and provided them with a coupon offering a random discount on the shoes. The market price at the time was about 85 Ksh (\$1.13), and we provided households with coupons at 5, 15, 25, 35, 55, or 65 Ksh. The coupon was valid for a period of about 2 months.

Second, to measure the impact of information on health investment, we randomly selected half of the households to receive an information script on the symptoms of worms, transmission pathways, and on several strategies to prevent infection, including wearing shoes, using pit latrines, and maintaining proper hygiene. In addition to its emphasis on prevention, the script also stressed the dangers of untreated hookworm infection in children (anemia in particular) and the accompanying issues of growth retardation and delayed cognitive development. We used a script, rather than a more involved educational seminar, because results from our earlier studies in Guatemala, India, and Uganda suggested similar results from a script as a seminar (as we will discuss later).

Third, to measure the role of liquidity, we provided households with randomly varying cash payments. As part of our baseline survey, we elicited risk and time preferences for all households using standard laboratory techniques. For the risk preference questions, households were given a

¹⁴ These methodologies are very similar to that used to estimate demand for microcredit by Karlan and Zinman (2008).

series of choices in which they could decide how much to invest (out of 40 Ksh or 100 Ksh) in an asset which paid out three times the amount invested with probability 0.5 and nothing with probability 0.5. For the time preference questions, households were given the option of accepting 40 Ksh immediately or a larger amount in the future.

To incentivize truth-telling, we implemented a Becker-Degroot-Marschak elicitation mechanism in which one of the questions was randomly selected for payout. Though all questions had a positive probability of being picked, the odds of being a lower-stakes question were higher. This was implemented by picking a numbered piece of paper out of a bag, which indicated the question that would be paid out. If a risk question was picked, a colored ball was drawn to determine whether the amount invested would be tripled or lost and the respondent was given his money. If a time preference question was picked and the respondent chose to take the smaller amount in the present, he was paid immediately. If he chose to take the larger amount in the future, he was revisited later to receive the payout. To minimize the need to revisit households and to maximize the chance that households got cash immediately, the odds of picking a risk preference question were higher. Our empirical strategy is based on the fact that, conditional on risk and time preferences, the cash payout is random. We can therefore use variation in the amount paid out to estimate the effect of liquidity on purchase (while controlling for risk and time preferences).

Fourth, to measure whether there are differences within the household in the willingness to invest in health technology in households with both a female and male head, we randomly selected either the husband or the wife for the intervention.¹⁶

Finally, we can causally estimate externalities in this setup. For any given pre-existing social group, it is random how many people in that group received the script, lower-priced coupons, or any of the other experimental treatments. Thus, by random chance, the intensity of treatment varies within any social network. We have two measures of social networks. The first is geography (as measured by GPS location), as in Dupas (2012). Furthermore, to create additional variation, we stratified intensity by geographic cluster (so that the variance across clusters exceeds that obtainable by random chance). At baseline, we also collected the names of three self-identified contacts. We asked people to identify the three people whom they spoke with most often, and matched these names

¹⁵ Ultimately, only 1% of households were selected for time preferences questioned in which they elected to wait – the remaining 99% received cash immediately.

¹⁶ Appendix Figure A1 summarizes the experimental design.

to their assigned treatment group (if they were in the study area). Of the 966 people willing to give the name of at least one contact, we matched 68.9% of the named contacts to our census list.

We can therefore estimate network effects by comparing the probability of purchase across people with randomly varying treatment intensities among their friends or neighbors.

3. Data

There are three main pieces of data that we use to evaluate the program. First, at baseline, we administered a background survey to all sampled households. In addition to standard demographic questions, we collected information on child health, worm exposure, and shoe ownership. We also collected information on household knowledge of worms, transmission pathways, and prevention strategies at the end of the survey.¹⁷ As this was collected *after* reading the script for those sampled for it, this allows us to test treatment-control differences in knowledge at the time of administration. We use the follow-up survey discussed below to measure retention over the project period.

After the survey, we paid households their random cash payout and gave them a coupon which could be redeemed at a local shop for the price indicated. The shops were located in market centers that households would typically visit regularly for shopping (approximately 1.5 kilometers away from the average household). The coupon was pre-printed with the household's ID number on it, so that any redeemed coupon could be matched to our household data. We also hired an enumerator to supervise the redemption and maintain a log containing the name of the person redeeming the coupon, the number of coupons redeemed at one time, and the sizes of the shoes purchased. We rely on these administrative records from the shop to examine purchase decisions.

Lastly, we conducted a follow-up survey with a randomly selected subset of the households once the redemption period had ended (about 3 months after the first coupons had been given out).
The follow-up survey included questions on shoe usage, as well as the same module used to measure worm knowledge in the baseline. In addition, after some qualitative piloting, we added in a number of questions about why people redeemed their coupons, which we use to support our main empirical findings.

We can summarize predictions of the experiments below:

¹⁷ Note that the worm knowledge questions were asked in an open-ended way (that is, the codes were not read out).

¹⁸ Participation in the follow-up appears to be orthogonal to all the treatments (see Appendix Table A1).

- (1) **Providing information on the health value of the product**. If utility from the health product is increasing in information about its benefits, then providing information will increase investment in children.
- (2) **Providing Liquidity**. If the budget constraint is binding with respect to cash on hand, providing cash will shift out the budget constraint and may increase investment.
- (3) **Peer Effects**. If a household witnesses other households investing in the preventative health product, then it is also more likely to invest in the product.
- (4) **Targeting the husband or wife.** If differences in household preferences exist such that the wife prefers investing in children, targeting the wife may increase investment.

4. Empirical Methodology

Since all treatments were randomized, we can obtain an unbiased effect of each of the main experimental effects on the purchase of shoes with the following specification:

$$Y_{i} = \sum_{i=5}^{65} \beta_{j} P_{ij} + \gamma S_{i} + \delta C_{i} + \mu G_{i} M_{i} + X'_{i} \phi + \varepsilon_{i}$$
(3)

where $P_{ij} = 1$ if household *i* received a coupon at price *j*, $S_i = 1$ if the household received the script, C_i is the cash payout the household received, and $G_i = 1$ if the husband was sampled to receive the coupon. G_i is interacted with M_i (a dummy for whether the household has both a male and female head) because the gender of the sampled respondent is only random for such households (81% of households are dual-headed). Finally, X_i is a minimal vector of controls consisting only of M_i and G_i (so that μ is interpretable), controls for risk and time preferences (since the experimental payout is only random conditional on risk and time preferences), and dummies for the stratification clusters (which we include to improve precision, as discussed in Bruhn and McKenzie, 2009).

In dual-headed households, we were not always able to enroll the sampled respondent in the project and so instead enrolled the spouse (mostly because the male was the selected spouse but he worked away from home during the day). We therefore also present an Instrumental Variables specification in which we instrument the male participating in the project with being sampled to participate.

Finally, as discussed in the previous section we are able to causally estimate externalities in this setup, for both geographical neighbors and self-identified baseline peers. For geographical neighbors, intensity was stratified by geographic cluster to create more variation in saturation across geographical areas. With this design, we can estimate geographical spillovers with the following regression:

$$Y_i = \sum_{j=1}^{J} \beta_j T_{ijr} + \gamma N_{ir} + X'_i \phi + \varepsilon_i$$
 (4)

where T_{ijr} is the proportion of people within a radius r from person i who received the given treatment T. There are J such treatments (the prices, script, cash payout, and gender treatments). Here X_i includes the same controls as the previous regression, but also includes all the individual level treatments. We also include the total number of people in the cluster (N_{ir}) in order to account for possible scale effects.

We can perform a similar regression for self-identified baseline contacts. While the total number of contacts named is not random, nor is the number of contacts who could be matched (as those who could not be matched are likely to be outside the study area), conditional on the number of contacts that were matched, the number receiving any treatment is random. Thus the following regression can be used:

$$Y_i = \sum_{j=1}^{J} \beta_j T_{ij} + \gamma C_i + X'_i \phi + \varepsilon_i$$
 (5)

where T_{ij} is the proportion of contacts who are treated, and C_i is the total number of contacts.

5. Results

5.1. Background Statistics and Randomization Check

Background statistics for the sample are presented in Table 1. For each variable, Column 1 presents the sample mean, while the remaining columns test whether the treatments are orthogonal to that variable. To do this, we regress each variable on indicators for all the experimental prices, the script and gender treatments, and the amount won in payments from the experimental games. As the experimental payments are only random conditional on risk/time preferences, we include those in the regressions as controls (for all variables but the risk/time preferences themselves). We split the table into household (Panel A) and individual (Panel B) variables, as we expect the individual variables to differ between men and women (one of the experimental treatments).

From Panel A, Column 1, 81% of households are dual-headed, and the average household has 3.5 children. As mentioned previously, health problems are common – respondents reported that 23% of their children had worms in the past year, and the average child's health is rated 2.53 on a scale of 1-5 (where 1 is "very good" and 5 is "very poor"). Shoe ownership is low (parents report that 17% of their children have shoes, though this may be an overestimate as only 13% of those present were wearing shoes at the interview), and it is common for children to use the "bush" instead of a latrine – 92% of children do this at least occasionally. This is consistent with low average income – total household income is just 900 Ksh (US \$12) per week, putting these households around the \$1 per day level.

Turning to Panel B, only 28% of respondents are men. This is because we sampled the male for the interview in only half of the households, and we were only able to successfully interview 61% of those men (the remainder lived away from the home most of the time or were away from home during our interviews). In addition, there are very few unmarried men - the vast majority of single-headed households are widowed females. The average respondent is 39 years old and has 5.6 years of education, and 67% of the sample is fluent in Kiswahili. Shoe ownership is low and worms are prevalent among adults as well: 34% own shoes and 26% report having worms in the past year.

Turning to the randomization check in Columns 2-5, we find very few differences between treatment groups. The experimental payout is negatively correlated with child shoe ownership and positively correlated with adult health status, but coefficients on script, gender, and price treatments are all insignificant for all variables. We conclude from Table 1 that treatment is orthogonal to baseline characteristics.

5.2. Experimental Treatments

5.2.1 Estimating Demand for Children's Shoes

Our first main result is to estimate the demand curve for children's shoes. We present this graphically in Figure 1 (without any controls) and in the first column of Table 2. As can be seen, demand falls off relatively quickly with the price. While 93% of households buy when the price is 5 Ksh, only 77% buy at 35 Ksh, 51% at 55 Ksh, and 42% at 65 Ksh. As the market price is around 85 Ksh, these results suggest that the majority of people value shoes at a price lower than the market

price. 19 Note also that although we never provided coupons to receive the shoes for free, the fact that 93% redeem at 5 Ksh suggests that there is not a discontinuity in demand at 0 Ksh.

Even without any other controls, the R-squared in Column 1 shows that 78% of the variation in the purchase decision can be explained by the price alone. This finding is in line with other recent studies which show that demand is very price sensitive in developing countries.²⁰ The primacy of price in this setting is particularly striking in that households had to go to a nearby shop to redeem the coupon, and most did not redeem until a few days later – thus, households had to hold the money for a few days, and would have had many chances to spend the money on something else.

5.2.2 Effects of Interventions on Demand

In Figure 2, we plot demand curves for the group that received the script and the group that did not (note that results in this figure are not regression adjusted with any controls). Panel A shows how demand varies with the script payment. We find that there is no discernible effect from the script. The two demand curves lie virtually on top of one another, crossing each other three times. Table 2, Column 3 confirms these basic results in a regression framework with controls. Note that the standard errors are relatively small, so that we can confidently rule out large positive effects of the script.

Panel B shows how demand differs by the gender of the respondent. Since gender is only randomly determined for those households which have two heads, this regression is restricted to the 81% of households which are dual headed. Though the standard errors are relatively large (especially when comparing demand at each particular price), there is evidence that women are more likely to redeem coupons than men. Note that these are Intent-to-Treat comparisons – the gender differences are bigger for those households in which we were able to successfully interview the sampled spouse.

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¹⁹ Note that these redemption figures are upper bounds on true demand at these prices. This is because the other experimental treatments, in particular the cash payout, tended to increase demand (as we will show later). It is also possible that the program tended to create a general excitement for the product, which increased demand at all prices. In addition, since households talked with others about the prices they received for their coupons (as we will show in the spillover effects section), it is possible that people were particularly price sensitive because they were aware of whether they got a favorable price or not. Finally, since the vouchers had an expiration date, it's possible that they encouraged some people to redeem who would otherwise have procrastinated.

²⁰ It is possible that households sold the shoes (or the coupon) after purchasing them. However, the data suggests this is unlikely: at follow-up, the enumerator asked to see the shoes and record their condition. Ninety percent of households that purchased shoes could produce them, and most of the remainder reported that the child was away from the home and wearing them. Thus, an extreme upper bound on resale would be 10%. Of the households who could produce the shoes, 94% of the shoes appeared used, which suggests that most coupons were redeemed and used by the sampled household (especially given that it would be hard to produce another pair of shoes not acquired through the program, since baseline ownership is so low).

To measure the gender difference quantitatively, we include a treatment indicator for the male being sampled in Table 2, Column 3. Since this is only relevant for dual-headed households, we interact the indicator with a dummy for whether the household is dual headed. To be able to interpret this result directly, we also include (but do not show) a dummy for being in a dual-headed household, and the interaction between *not* being in a dual-headed household and the male being sampled for treatment. We find that when the male is offered the coupon, the household is 5 percentage points less likely to buy shoes (significant at 10%). Since we were not able to treat all the men sampled for the interview, we run an IV specification in Column 5 and find a 9 percentage point effect, again significant at 10% (see Appendix Table A2 for the first stage).²¹

Figure 2, Panel C shows the effect of the cash payout.²² For simplicity, this graph does not control for risk/time preferences (the results look very similar with those controls). As the payout is continuous, we graph the γ_i coefficients from the following regression

$$Y_i = \sum_{P_j=5}^{65} (\beta_j P_{ij} + \gamma_j P_{ij} * R_i) + \varepsilon_i$$
(6)

where R_i is the cash payout (in 100s of Kenyan shillings).

The mean and median cash payout were 35 Ksh and 30 Ksh, respectively. They thus represent a very small fraction of weekly income (which from Table 1 is around 900 Ksh per week), and an even smaller fraction of total households wealth (again from Table 1, the average household owns 23,000 Ksh worth of animals and durable goods). Thus, if these payouts affect demand, they work through a cash-on-hand effect, rather than because they have any effect on total income. We find strong evidence of a liquidity effect, particularly at intermediate or high prices (the smaller effect at lower prices is because demand is already so high to begin with). Table 2, Column 3 shows the regression results with controls for risk/time preferences. On average, every additional 100 Ksh in randomized cash payout increases the probability of purchase by 22 percentage points. Note that it is relatively unlikely that people felt that the coupon and the cash payout were directly linked in any way, since they had to redeem the coupon at the shop on their own, after the field officer had left. In addition,

²¹ Though not shown in the table, we do not observe any interaction between gender and receiving the information script (results on request).

²² We do not have accurate records of experimental payouts for 3 of the 999 households. To avoid losing these households in the regressions (such that direct comparison across columns is possible), we create a dummy for having missing information for this variable and then code their cash payout as zero. Thus the experimental payout coefficient is identified off of only those for whom we have non-missing data. We omit the dummy for "missing experimental payout information" for space.

respondents were informed that the cash payouts were as compensation for their time, not to help them buy the product.

Column 4 includes the same variables as Column 3, but also includes an interaction between the script and the cash payout. Interestingly, while the coefficient on that interaction is insignificant, it is positive and relatively large. While we can only speculate given the standard errors, this result may suggest that knowledge can have an effect, but only when other constraints are simultaneously loosened (in this case, cash on hand). We will revisit this issue in the Section 5.

5.3. The Script and Worm Knowledge

One important finding thus far is that the worm education script has no effect on the purchase decision. Is this because the script was ineffective in conveying knowledge? To address this question, we gave a nine-question worm quiz (at both baseline and follow-up) to test the effect of the script on knowledge about worms and worm prevention. In Table 3, we regress the percentage of questions answered correctly on the script treatment. We find large effects: in the baseline, respondents who were given the script scored 34 percentage points higher on the quiz (on a low base of just 29% in the control group). In the follow-up survey, the difference was somewhat smaller but still highly significant: a 24 percentage point difference, against a base of 37%. Thus, health knowledge did indeed increase, but the increase in knowledge did not increase demand for the shoes.²³

5.4. Peer Effects

There were strong reasons to expect that there might be spillover effects in our experiment. Several studies in agriculture find large spillover effects (e.g. Foster and Rosenzweig, 1995; Conley and Udry, 2010). Health-specific studies also tend to find spillover effects, though these effects can either serve to increase adoption (e.g. bednets in Kenya in Dupas 2012, menstrual cups in Nepal in Oster and Thornton 2011) or decrease it (e.g. deworming drugs in Kenya in Kremer and Miguel, 2007), depending on relative costs and benefits, as well as health externalities.

There are three possible channels through which spillovers may occur in the context of this experiment. First, people may talk to each other about the health benefits of the shoes from

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²³ A possible confounding factor for why information does not lead to purchase is that shoes have other non-health benefits, and people buy shoes only for these other reasons. However, we have two pieces of evidence to suggest this is not the case. First, when asked, a significant portion of people report health as an advantage of wearing shoes. Second and more robustly, we also find no evidence of information effects in the smaller studies we conducted in Guatemala, India, and Uganda which focused on products with minimal non-health benefits (soap and multivitamins). These results are discussed in more detail in Section 7.

information they got from the script. Second, if shoes are an experience good, people who were exogenously induced to buy shoes because they received a low-priced coupon may learn from using and may then discuss benefits with contacts. Third, exogenously increasing usage among friends and neighbors might stimulate demand through an imitative channel, since shoes are readily observable and carry a certain prestige value.

Despite expectations to the contrary, we find very little evidence of imitative peer effects (either positive or negative) for either geographical neighbors or health contacts in the purchase decision (Table 4). First, Panel A presents geographical spillovers across different radii (300, 500, and 1,000 meters). For each specification, we report the percentage of contacts receiving the script, the percentage receiving a low-priced coupon (which we define as less than 35 Ksh here),²⁴ and the total number of people living within the radii. Although many of the point estimates are positive, none are significant and many are quite small (given that the independent variable is measured as a percentage). Panel B does the same for the matched informational contacts and, again, there is no discernible positive effect (if anything, the effect for the script is negative, though small and significant at only 10%).

Why don't we observe any spillovers (either positive or negative)? One important reason is that the scope for social learning (either through the script or through experience with the product) might be limited in this case. In particular, since information did not have a first-order effect on the individual sampled to receive it, it is unlikely that we would find second-order informational conformity across households.²⁵ Furthermore, while it might be possible to learn about the protective benefits of shoes from wearing them, this process might be very noisy, making it difficult to extract a signal. Shoes have been around for a long time and the benefit of wearing the shoes is not immediately obvious (as is more apparent with brand new technologies with which people are unfamiliar).

Thus, unlike most studies of spillover effects in development (which focus on social learning), the main role for externalities in this experiment is likely through imitative peer effects. We might expect these in our study because shoes are often desirable for children, and seeing other children wearing shoes may increase the demand for children to have and wear them. There is considerable evidence that such effects can be relevant in human capital (e.g. Borjas, 1995, Sacerdote, 2001). Munshi and Myaux (2006) provide one of the few pieces of evidence for pure imitative effects for a health product (contraceptives) in a developing country.

²⁴ The results are not sensitive to defining this variable differently.

²⁵ We also do not find evidence of knowledge spillovers on the worm quiz (results upon request).

To shed more light on why we find no imitation, we present responses to the follow-up debriefing survey we conducted at the end of the project in Table 5. Interestingly, the Table shows that the lack of spillover effects is not because people do not place value on imitation or relative wealth. From Panel A, the majority of people report that seeing their peers' children with the shoes made them (and their children) want them more. Most people also report that they would feel poor if the neighbors bought the shoes and they did not, and they also report that they would value certain prestige items more if their neighbors had them (such as a TV). Furthermore, Panel B shows that people do report talking about the program with others: 72.5% of people who received the script reported talking to somebody else about the health effects of worms and 51.7% of people who didn't receive the script reported hearing from others about worms.

Why then didn't people who saw many of their neighbors purchase shoes buy them themselves? We asked those parents who purchased shoes what factor was most important in redeeming the coupon. Forty-two percent reported that the price was the biggest factor and 33% reported health (including worms and other injuries). However, only 10.8% reported responding to pressure from children and 7.5% reported some influence of neighbors. Thus while "keeping up with the Joneses" may well be an important consideration for people, the primary barrier is clearly price.

Moreover, social interactions were actually so strong that they might have mitigated the desire to imitate. From Panel B, 78.9% of people report that their neighbors knew what priced coupon they got. In Panel C, we asked people if they would be seen as a "bad parent" if they did not buy the shoes at different prices. While 77.9% of parents report that they would be seen as a bad parent if they didn't buy the shoes at a low price, only 50.3% reported that they would be if they didn't buy the shoes at a high price. Thus, imitative peer effects may have actually been mitigated by the strength of social connections.²⁶

6. External Validity

While the results thus far have been for one product in Kenya, we provide some evidence in this section that most of our basic experimental results are unlikely to be specific to that context. Before the Kenya experiment, we conducted smaller-scale studies in three different countries with different products that could be used by both children and adults (hand soap and multivitamins). These studies were carried out in 2008 in the small village of Panyebar, Guatemala (pop. 2,031), the

²⁶ Another possibility which we are not able to rule out is that spillovers extended beyond a given social network. For instance, the program might have created excitement in the entire study area.

town of Busia, Uganda (pop. 36,600),²⁷ and the large city of Chennai (Madras), India (pop. 4,700,000)²⁸. These studies were more limited in scope than the Kenya experiment: all respondents were women, and we did not conduct long interviews with households, we did not measure knowledge, and we did not measure externalities. Nevertheless, the general results concur strongly with those in Kenya.

In all three of our smaller studies, we designed the experiment so that purchase occurred at the point of the household survey. This design negated any issues with cash liquidity since subjects used the money from the survey payout to pay for the health products, and was done to minimize any frictions related to product purchase. Of course this came at a trade-off of the more realistic scenario in which one typically must purchase such products at a local store.

6.1 Background on Soap and Multivitamins

Our health products for the smaller studies were hand soap and a multivitamin supplement. Both products could potentially have large health effects. The use of soap accompanied by regular hand washing is documented to decrease diarrhea in both children and adults in developing countries (Luby et al., 2004, 2005; Ray et al., 2011; Curtis and Cairncross, 2003). Similarly, women and children in resource-poor regions are known to suffer from nutritional deficiencies (Stein, 2009; Torheim et al., 2010), a possible solution to which may be the increased use of multivitamins and/or iron supplements in women of reproductive ages and/or children (Huffman et al., 1998, Yip, 1994; Ramakrishnan, 2004).

The specific products differed slightly across countries. In Guatemala, the hand soap was a three-pack of standard anti-bacterial soap bars, a product that was used among Guatemalan households, but not widespread. Soap products were similar in India, but differed slightly in Uganda, where the hand soap was a more common multi-purpose soap. In all three sites, the vitamin product was an 8-oz. bottle of multi-vitamin syrup primarily intended for children, but often used by adults. Instructions recommended once-daily use as a supplement to existing meals.

6.2 Experimental Design

6.2.1 Guatemala

²⁷ Busia, Uganda is located on the Ugandan side of the border with Busia, Kenya (Busia is a border district).

²⁸ Population sources: Panyebar, Guatemala: Ludwinski et al., (2011); Busia, Uganda: Uganda Bureau of Statistics (2002); Chennai, India: Census of India (2011).

The first of our smaller studies was in Panyebar, Guatemala located in the western Guatemalan highlands, approximately five miles southwest of Lake Atitlan. The village has approximately 350 households, and all villagers are of Mayan origin, speaking Quiché as a first language and Spanish as a second language. The village is quite poor, even by rural Guatemalan standards, with little economic opportunity aside from coffee growing and subsistence agriculture.

We conducted fieldwork between June and August of 2008, during which time 350 female heads of household were sampled for project participation. The sample was randomly divided into a treatment group of 197 and a control group of 153. The treatment group was invited to one of two five-day public health seminar lasting an hour and a half each morning. To encourage participation, each invited subject was given five tickets to use for entrance into the seminar and upon arrival the tickets were placed into a hat to be drawn for door prizes (e.g., blankets, pots and pans, machetes, etc.). In total, 84% of the randomly invited women attended the seminar. Of those who agreed to participate, we have complete follow-up data on all but one subject.

After the seminars, enumerators conducted a population survey of the village (including the full treatment group, whether they attended the seminar or not, as well as the control group), which lasted approximately 45 minutes. The primary respondent was the female head of household.

At the close of the survey we presented each female subject with Q16 (Guatemalan quetzales), in cash, or about \$2.00. The subject then drew one of six coupons from a black bag, which entitled her to a 25%, 50%, or 75% discount on one of two products: a bottle of vitamin syrup or a three-bar pack of anti-bacterial hand soap (the product was not chosen by the subject, but was randomly determined by the coupon draw.) Both products had an approximate retail value of Q16. In Guatemala (as in India and Uganda), the products were sold "Avon lady" style at the site of the household: women had to buy the product immediately from the enumerator at the conclusion of the interviewer. Subjects chose at that time whether to take the Q16, or whether to take the health product and the remaining change. The session then concluded.

6.2.2 Uganda

We conducted a nearly identical survey and experiment simultaneously in Busia, Uganda between May and August, 2008. Busia, Uganda shares a border with Busia, Kenya, and is a relatively busy commercial trading post. The sample frame for the study was constructed using enrollment lists from five elementary schools in the area. From roughly 2,000 children, 800 (randomly divided between treatment and control) were invited to an information session. Those selected for the

seminar were given invitations while others listed their tracking information. In total, 516 women (266 treatment and 250 control) participated in the project.

As an encouragement for the treatment group to attend the health seminar, women who came to the seminar were eligible for random door prizes, as in Guatemala. Of those invited to the seminar, 87% attended. The health seminar was shorter and more focused than the one in Guatemala (lasting one day), emphasizing basic hygiene, nutritional information, and preventative healthcare through the encouragement of hand washing and proper vitamin intake.

One to three weeks after the seminar, surveys similar to those used in Guatemala were issued to each of the members of the sample at the point of household. Since tracking information had already been obtained at the initial meeting, we were able to successfully follow up with 514 of the 516 women in the study. As in Guatemala, at the conclusion of the interview, respondents received a small amount of money (about 1600 Uganda shillings, or about \$1 in 2008), and were given the option to purchase the health investment good at the selected discounted price, or take the full cash payout.

6.2.3 India

Our third smaller study took place among 455 households in Chennai, India. The sample frame was an urban population of women who had been involved in, or were potential candidates for, a local microfinance program operated by Growing Opportunity Finance, Ltd., affiliated with the large microlender, Opportunity International.

Unlike the Guatemala and Uganda studies, subjects in the India sample did not attend a health seminar. Instead, during the survey (which was similar to those in the other countries, though it also contained a microfinance module), 208 of the 455 households were randomly chosen to be read a 120-word health script. For those randomly selected to be offered soap, the script reminded people that hand-washing with soap and clean water at the appropriate times (e.g., after using the toilet, touching an animal, sneezing or coughing) could prevent germs from spreading. A similar script was read for those offered vitamins which focused on the importance of broad vitamin intake for general health. At the end of the survey, the same procedure was used as in Guatemala and Uganda in which respondents were given a small amount of money and then randomly offered a discount on a health product (the stakes were 50 rupees, again around \$1).

6.3 Results

6.3.1 Background Statistics and Randomization Check

Appendix Table A3 presents background statistics as well as a check on the effectiveness of our randomization in each of the three countries. While we have few covariates to compare across samples, there are some stark differences across countries. For example, average years of education is just 1.94 in Guatemala, compared to 5.7 in Uganda and 5.5 in India. As expected, there are few differences between treatment groups. Taking the prices first (Column 7), the only differences with a *p*-value less than 0.10 are education in Uganda and India. There are a few differences in regards to the seminar or script treatments. In Guatemala, women in the treatment group are younger; in India, women in the treatment group are less educated. Finally, women in Uganda who received coupons for soap were less educated and more likely to have access to piped water than women offered vitamins. We control for these covariates in our regressions (though omitting them makes little differences to our estimates).

6.3.2 Experimental Results

The basic experimental results are summarized in Figure 3 and in Table 6. Each panel presents results from a different country, and each panel has two graphs which plot the treatment and control means (along with the standard error of the difference). The left graph shows soap, and the right shows vitamins.

Panels A (Guatemala) and B (Uganda) show the same pattern as Kenya: there is no discernible effect of the seminar on purchase, at any price, and demand tends to fall off rapidly for most products.²⁹ This is confirmed in the regressions in Table 6: the point estimate for the health seminar is small and insignificant. Although regressions without controls are not shown, the R-squared of regressions which include only prices also vary between 0.69 and 0.95, suggesting again that price is the most important factor. Panel C (India) shows a somewhat stronger effect of the script, especially for soap (though the effect is positive for both products). Though it is hard to definitively attribute a causal factor for this difference given differences in samples, one possibility is that because subjects had cash on hand and chose whether or not to redeem the coupons right after being read the script, the script served as a "nudge" toward coupon redemption. Though the result could be due to sampling variation (since only 1 of the 6 possible product-country pairs is statistically significant), we speculate that the nudge together with the absence of transportation costs and the provision of liquidity might have encouraged purchase.

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²⁹ The one exception is soap in Uganda. Redemption rates were high across our price treatments because the particular soap we used in the experiment was a recognized item to households and was apparently viewed as a bargain even at a 25% discount.

Taken together, the results from these smaller studies support the key findings of our main study in Kenya: investment in health products is highly sensitive to price and information about health products have small or negligible effects on their own, unless – perhaps – other frictions are also removed simultaneously.

7. Discussion: What Influences Investment in Preventative Health?

This paper is one of a number of recent studies on preventative health investment in developing economies. In this section, we compare our results to those of other recent experiments on health product adoption in LDCs. We do not attempt an exhaustive review and focus solely on preventative health investments.³⁰ We summarize our results in Table 7, where we identify the previous studies by author, country, and health product, and list results for four key outcomes: the effect of price changes, information campaigns, gender, and spillovers through peer effects.

Overall, we find a number of similarities with other studies. First, as in many other recent studies, we find that demand for our preventative health products is highly price sensitive. While it is impossible to make direct comparisons since the product and the range of subsidy varies across studies, our estimated elasticities (calculated at the mean price) fall in the -0.40 to -0.90 range. This is similar to the -0.37 mean elasticity reported in Cohen and Dupas (2010) for long-lasting insecticide-treated bed nets in Kenya, the -0.60 mean elasticity reported in Ashraf et al. (2010) for chlorine in Zambia, and the -0.50 elasticity reported by Miller and Mobarak (2011) for improved cook stoves. Our results are not as stark as those observed in the Kremer and Miguel (2007) study of deworming drugs, in which even a modest US \$0.30 cost-recovery fee decreased demand by 80%. Of course, differences in price sensitivity across products will be heavily influenced by how much household decision-makers expect to pay for these products, which may depend on previous availability and exposure to the product. Nevertheless our basic price results are very much in line with previous research finding that demand for health products is very price elastic in LDCs.

Though there are relatively few randomized experiments on how information affects preventative health investment (rather than behavior change more generally), those studies which do exist tend to find small effects, as we do. Kremer and Miguel (2007) find no effect of education targeted at children on worm-preventing behavior. Also, since they find extreme price sensitivity for deworming drugs among the parents of children in the program, the intervention did not increase

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³⁰ For a much more exhaustive review (including other health decisions such as choice of water source or handwashing behavior and other methodologies), see Dupas (2011).

subsequent demand for the drugs among parents. Similarly, Kremer et al. (2011) find that providing information has little effect on uptake of chlorine for water. In a study similar to this one, Ashraf et al. (2011), find that information does not affect the level of investment but does affect the slope of the demand curve. Dupas (2009) also finds that scripts to make health more salient have little effect (note however that those scripts did not convey health information).

Thus, although there are few studies to summarize, early results suggest that simply providing information is not often effective in these types of investment decisions. These results may differ from other studies summarized in Dupas (2011), likely for three main reasons. First, the information provided was not very specific to the household. This differs from, for instance, Jalan and Somanathan (2008) and Madajewicz et al. (2007), who find that informing households that their own water source is contaminated (with fecal bacteria or with arsenic, respectively) induces behavior change. Such targeted information is likely very salient. Second, the interventions in Table 7 simply provided information during a one-time-only visit and so did not intensively attempt to change behavior or to instill learning. This is very different from studies like Cairncross et al. (2005) or Luby et al. (2004, 2005), who find that intensive educational interventions conducted over many months were effective in improving hygiene. Third, the main outcome in the studies we summarize is whether households actually purchased the health product, which means that even if information increased the perceived value of the item, the household still had to gather enough money to buy the product. This is difficult for the very poor who do not have access to credit or to good savings products. By contrast, soap was provided as part of the intervention in Luby et al. (2004, 2005), while the main outcomes in Cairncross et al. (2005) were various measures of self-reported behavior. We believe these results have important implications for health practitioners in developing countries, where information campaigns have often played a leading role in trying to change health behaviors.

As mentioned previously, our estimates of the impact of peer effects differ greatly from other studies, almost certainly due to differences in products. The other study of which we are aware which focuses on imitative peer effects is Munshi and Myaux's (2006) study of contraceptive adoption in Bangladesh, in which women may have eschewed purchasing the contraceptives until there was evidence of their acceptability within their religious group, a case of pure conformity in which imitation may occur in the process of breaking social stigma. In the other studies (Miguel and Kremer, 2007; Dupas, 2010; Oster and Thornton 2011) peer effects are likely to be the product of a learning process, in which households begin to understand the private and social costs and benefits of a product, an effect unlikely with a well-known product such as shoes.

Another area in which our findings relate to previous studies is in the area of gender effects. As discussed in Section 2, since there were no income transfers, the result that preventative health investment is higher when the woman receives the coupon suggests not only intra-household differences in preferences, but also constraints on information sharing within the household. Our analytical framework suggests that husbands may simply not tell the wife (or may destroy the coupon) if he knows that she will be able to force him to reduce his own consumption to take advantage of the discount for children. A close paper in this respect is Dupas (2009), who randomized whether the female head, male head, or both heads jointly would receive a coupon for a bednet. While she finds no difference in takeup between the treatment in which the male gets the coupon individually and the treatment in which the female does, she finds that investment in both cases is lower than when both are given it simultaneously. Her result may also suggest some communication constraints. Miller and Mobarak (2011) also find that wives show a stronger preference for purchasing improved cook stoves in Bangladesh, but that this preference cannot be acted upon if the price is high or if their husband's decision contradicts their own.

8. Conclusion

To conclude, we attempt to synthesize and summarize the main finding from our paper and related experiments, and to offer a few suggestions for future research.

- 1. PRICE MATTERS. In keeping with numerous recent studies, in each of our four field experiments, and with all three of our health products, we find product take-up to be more sensitive to price than any other factor, and for the vast majority of the purchase decision to be determined by the price. This general finding is robust across all the other studies mentioned above.
- 2. Information campaigns of the Limited impact on their own. Compared to the effect of lower prices, the types of information campaigns we summarize here generally have little effect on the purchase of health products in recent experimental studies, including ours. While more intensive, long-term campaigns have been effective, more modest programs have very limited effects. In our study sites, providing information had no effect, except perhaps as a "nudge" when other constraints were simultaneously removed. More research should be done to ascertain the conditions under which health information campaigns might be more effective.
- 3. PEER EFFECTS WILL BE STRONGER FOR PRODUCTS WHICH HAVE BEEN AVAILABLE FOR A SHORTER TIME OR FOR WHICH SOCIAL ACCEPTABILITY IS IMPORTANT. We should expect peer effects in health

product adoption when we have a strong *a priori* theory for their existence. This ought to be when there is strong asymmetric information about product effectiveness between users and non-users or when bandwagon effects are socially important in the use of a product (such as contraceptives in the case of Munshi and Myaux, 2006). Otherwise, peer effects are likely to play a small role in adoption.

- 4. PARENTAL GENDER MATTERS FOR CHILDREN'S HEALTH PRODUCTS. Though such findings are likely very context-dependent, at least in this particular experiment, marketing health products to mothers increased investment. This appears to be driven both by differences in gender preferences and a limited flow of information within the household.
- 5. LIQUIDITY IS IMPORTANT FOR HEALTH INVESTMENT DECISIONS. Cash on hand appears to influence health product purchase. Our results suggest that this is not likely due to pure credit constraints (since even for these very poor households, the experimental payouts were small). Other work in this same part of Kenya shows that merely providing people with simple places to save greatly increases investment in preventative health (Dupas and Robinson, 2012). Designing products to help households accumulate necessary liquidity may be a fruitful avenue for future research.

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Percentage of Vouchers Redeemed

5

15

25

35

Price

Percentage Redeemed

Percentage Redeemed

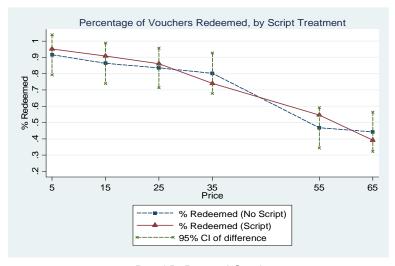
95% CI

Figure 1. Demand for Shoes

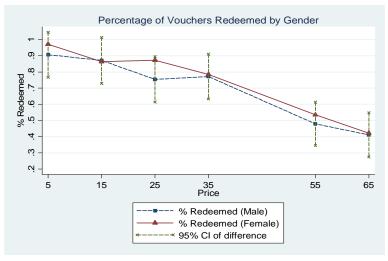
Notes: 95% Confidence Intervals in parentheses.

Figure 2: Experimental Treatments

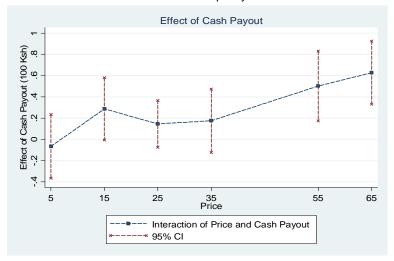
Panel A. Information



Panel B. Parental Gender



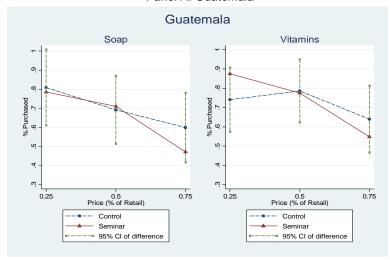
Panel C. Liquidity



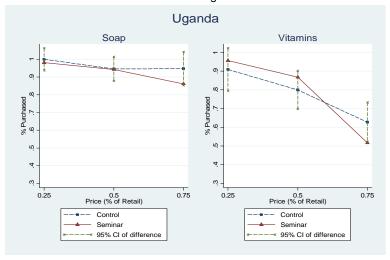
Notes: The confidence intervals reported are of the difference between the given experimental groups. All figures are Intent-to-Treat estimates.

Figure 3. Results from Smaller-Scale Projects in Guatemala, Uganda, and India

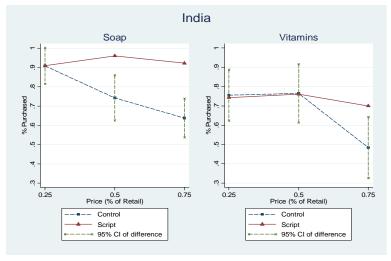
Panel A. Guatemala



Panel B. Uganda



Panel C. India



Notes: The confidence intervals reported are of the difference between the given experimental groups.

Table 1. Randomization Check

	(1)	(2)	(3)	(4)	(5)
			ients of OLS Regr		p-value for test of
	_	Given Trea	atment on Depend	ent Variable	joint significance of
	Overall Mean	Script	Male Sampled for Interview	Experimental Payout	All price dummies
Panel A. Household Level Variables					
Dual-Headed Household	0.81	0.00	-0.03	-0.09	0.16
	(0.39)	(0.02)	(0.02)	(0.06)	
Number of Children	3.52	-0.03	-0.03	0.20	0.87
	(1.74)	(0.11)	(0.02)	(0.26)	
Average child health (1-5 scale) ¹	2.53	0.03	-0.05	0.07	0.97
	(0.60)	(0.04)	(0.04)	(0.09)	
Percentage of children with	0.23	0.00	-0.01	0.00	0.63
worms in past year	(0.19)	(0.01)	(0.01)	(0.03)	
Proportion of Children	0.17	-0.01	0.02	-0.06	0.25
owning shoes	(0.19)	(0.01)	(0.01)	(0.03)**	
Percentage of children	0.13	0.04	0.02	-0.12	0.44
at interview wearing shoes	(0.44)	(0.03)	(0.03)	(0.07)	
Proportion of Children who do	0.92	0.02	0.00	0.00	0.97
not always use latrine/bathroom	(0.25)	(0.02)	(0.02)	(0.04)	
Value of Animals and Durable Goods	22.88	0.49	0.53	0.18	0.59
Owned (in 1,000 Ksh)	(17.95)	(1.22)	(1.22)	(2.85)	
Total household income	893.54	-39.51	-85.85	20.57	0.87
in past week	(1281.58)	(98.22)	(97.92)	(245.21)	
Panel B. Individual Level Variables					
Gender (1=male)	0.28	-0.04	-	0.07	0.42
	(0.45)	(0.02)	-	(0.06)	
Years Education	5.60	-0.07	-	-0.31	0.74
	(3.80)	(0.24)	-	(0.57)	
Literate (Swahili)	0.67	0.00	-	-0.03	0.77
	(0.47)	(0.03)	-	(0.07)	
Age	39.34	-0.61	-	3.45	0.43
	(14.57)	(0.93)	-	(2.18)	
Occupation = farmer	0.54	-0.01	-	-0.07	0.53
	(0.50)	(0.03)	-	(80.0)	
Self-reported health status	2.43	0.01	-	0.22	1.00
(1-5 scale)	(0.70)	(0.04)	-	(0.11)**	
Percentage of adults	0.34	-0.02	-	0.03	0.47
at interview wearing shoes ²	(0.46)	(0.03)	-	(0.07)	
Had worms in past year	0.26	-0.02	-	0.00	0.40
	(0.44)	(0.03)	-	(80.0)	
Amount invested (out of 100 Ksh)	52.47	1.77	-	-	0.41
in risky asset	(20.71)	(1.34)	-	-	
Somewhat Patient	0.08	0.00	-	-	0.62
	(0.27)	(0.02)	-	-	
Number of Observations	999				

Notes: In Column 1, the overall sample mean is reported (with the standard deviation in parentheses). Columns 2-5 report results from a regression of the given dependent variable on price dummies, an indicator for whether the household was sampled for the script, an indicator for whether the male was sampled to participate, and the experimental cash payout. Columns 2-4 report coefficients (standard errors in parentheses), while Column 5 report the p-values for the test of joint insignificance of all the price dummies. The table is broken into panels for household and individual level variables because individuals means would be expected to differ between men and women. The coefficient on the experimental payout is not included in the regressions for time/risk preferences as the payment is not orthogonal to those (and they are included in controls in all regressions - see text). See text for definitions of risk/time variables. Exchange rate was about 75 Ksh to \$1 US during this time period.

^{*} significant at 10%; ** significant at 5%; *** significant at 1%

¹One is "very good" and 5 is "very poor."

²This variable is listed as an individual level variable since men are more likely to wear shoes than women.

Table 2. Experimental Treatments

<u> </u>	(1)	(2)	(3)	(4)	(5)		
	Dependent Variable = 1 if Purchased Shoes						
Price = 5 Ksh	0.93	0.98	1.09	1.09	1.05		
	(0.03)***	(0.09)***	(0.42)***	(0.42)***	(0.42)**		
Price = 15 Ksh	0.88	0.94	1.05	1.05	1.01		
	(0.03)***	(0.09)***	(0.42)**	(0.42)**	(0.42)**		
Price = 25 Ksh	0.85	0.91	1.00	1.01	0.97		
	(0.03)***	(0.09)***	(0.42)**	(0.42)**	(0.42)**		
Price = 35 Ksh	0.77	0.84	0.93	0.93	0.88		
	(0.03)***	(0.09)***	(0.42)**	(0.42)**	(0.42)**		
Price = 55 Ksh	0.51	0.59	0.68	0.68	0.64		
	(0.03)***	(0.09)***	(0.42)	(0.42)	(0.42)		
Price = 65 Ksh	0.42	0.49	0.58	0.58	0.54		
	(0.03)***	(0.09)***	(0.42)	(0.42)	(0.42)		
Received Script			-0.02	-0.06	-0.06		
			(0.03)	(0.04)	(0.04)		
Experimental Payout (in 100 Ksh) ¹			0.22	0.16	0.17		
			(0.06)***	(0.08)**	(0.08)**		
Male Sampled to Receive Coupon			-0.05	-0.05			
(Double Headed Household only) ²			(0.03)*	(0.03)*			
Male Actually Received Coupon			, ,	, ,	-0.09		
(Double Headed Household only) ³					(0.05)*		
Received Script * Experimental Payout				0.13	0.12		
,				(0.12)	(0.12)		
Estimation	OLS	OLS	OLS	OLS	IV-TOT		
Cluster Dummies	N	Υ	Υ	Υ	Υ		
Observations	999	999	999	999	999		
R-squared	0.78	0.79	0.80	0.80	-		

Notes: Experimental payout is in 100 Ksh. Exchange rate roughly 75 Ksh to US \$1 during this time period. 3 of 999 househols are missing information on the experimental payout. To avoid dropping these, we code them as 0 and include dummies for having a missing value (so that the coefficients are relevant only for those with non-missing values). Clusters were calculated from GPS coordinates and sampling was stratified at that level. Standard errors in parentheses. * significant at 10%; ** significant at 5%; *** significant at 1%

¹Values of cash payout: mean - 35 Ksh, median - 30 Ksh, minimum - 0 Ksh, maximum - 200 Ksh.

²Regressions in Columns 3 and 4 include a dummy for whether the household was double headed, and an interaction between not being double headed and being sampled for the male treatment. This is because the gender of the respondent can only be random for dual headed households, so this coefficient should be interpreted as the difference in male and female purchases for dual headed households.

³The regression in Column 5 is an IV treatment-on-the-treated (TOT) regression, where an indicator for the male being interviewed is instrumented with whether the male was sampled for the interview. See Appendix Table A2 for the first stage regression

Table 3. World Knowledge		
	(1)	(2)
Panel A. Immediately after getting script		
Read Script	0.34 (0.01)***	0.34 (0.01)***
Extended Controls	` N [′]	` Y
Observations	989	989
R-squared	0.54	0.91
Mean in Control Group	0.29	0.29
Panel B. Three to Four Months Later		
Read Script	0.24	0.24
·	(0.02)***	(0.02)***
Extended Controls	N	Υ
Observations	377	377
R-squared	0.40	0.92
Mean in Control Group	0.37	0.37
Pogressions in Column 2 control for all experiment	al troatmonts	and the

Regressions in Column 2 control for all experimental treatments and the risk/time preferences. Some values of the experimental payout and gender of the respondent were missing. To avoid dropping these, we code them as 0 and include dummies for having a missing value (so that the coefficients are relevant only for those with non-missing values). Standard errors in parentheses.

^{*} significant at 10%; ** significant at 5%; *** significant at 1%

Table 4. Testing for Spillover Effects in Redemption

Table 4. Testing for Spillover Effects in Redemption	(1)	(2)	(3)	(4)	(5)	(6)
		(<i>≥)</i> Dependent '	` '	` '		
Panel A. Geographical Neighbors	<u> </u>				- ссерс	
Within 300m of household						
# of Neighbors	0.001	0.001				
	(0.001)	(0.001)				
% of Neighbors getting price less than 35 Ksh	0.073	, ,				
	(0.080)					
% of Neighbors getting script		0.057				
Within 500m of household		(0.117)				
# of Neighbors			0.000	0.000		
# Of Neighbors			(0.001)	(0.001)		
% of Neighbors getting price less than 35 Ksh			0.020	(0.001)		
σ σ.			(0.109)			
% of Neighbors getting script				0.295		
				(0.209)		
Within 1,000m of household					0.000	0.000
# of Neighbors					(0.001)	(0.001)
% of Neighbors getting price less than 35 Ksh					0.037	(0.001)
, a consequence germig processes many conserva-					(0.150)	
% of Neighbors getting script					,	0.058
						(0.657)
Observations	997	997	998	998	999	999
Panel B. Health Contacts						
# of Contacts in experiment	0.022	0.022				
	(0.017)	(0.017)				
% of Contacts getting price less than 35 Ksh	-0.015					
% of Contacts getting script	(0.039)	-0.07				
70 Of Cornacts getting script		-0.07 (0.0375)*				
Observations	868	868				

Notes: regressions control for all experimental treatments and include geographical (cluster) controls. Standard errors are clustered at that level. Standard errors in parentheses. * significant at 10%; ** significant at 5%; *** significant at 1%

Table 5. Mechanisms

Table 5. Mechanisms	(1)	(2)
	, ,	, ,
Panel A. Imitative Peer Effects		0=0
Were slipper popular among children?	0.926	353
Did your child ask you to buy slippers?	0.689	376
Did your child want them more because other children had them?	0.753	376
Did you want them more because other children had them?	0.705	376
Would you feel poorer if the neighbor's children had slippers but yours didn't?	0.699	376
Would your neighbor buying a TV make you want to buy one more?	0.532	376
Would you feel poorer if the neighbors had TV and you didn't?	0.629	377
Panel B. Social Interactions		
Did you talk to anybody else who had received a voucher?	0.799	378
Did neighbors know what price coupon you got?	0.789	360
If received script: did you talk to others about worms?	0.725	182
If didn't receive script: did anybody talk to you about worms?	0.517	178
Panel C. Reasons for Purchasing		
Would other parents think you were a bad parent if you didn't redeem at low price?	0.779	348
Would other parents think you were a bad parent if you didn't redeem at high price?	0.503	342
For those who redeemed, what is the main reason you redeemed	d?	
Price was low	0.416	279
Pressure from children	0.108	279
Neighbors	0.075	279
Health	0.330	279
Other Name of the Control of the Con	0.072	279

Notes: Means presented from follow-up interview at conclusion of project.

Table 6. External Validity: Pilot Experiments in Guatemala, India, and Uganda

	(1)	(2)	(3)	(4)	(5)	(6)
	Ì	Dependent	sed Product			
	Guate	emala	Uga	ında	Ind	dia
	Soap	Vitamins	Soap	Vitamins	Soap	Vitamins
Price = 25% Retail	0.82	0.80	1.00	0.93	0.85	0.73
	(0.08)***	(0.07)***	(0.03)***	(0.05)***	(0.04)***	(0.06)***
Price = 50% Retail	0.73	0.78	0.96	0.83	0.78	0.73
	(0.07)***	(0.07)***	(0.03)***	(0.04)***	(0.05)***	(0.06)***
Price = 75% Retail	0.55	0.59	0.91	0.58	0.69	0.56
	(0.07)***	(0.07)***	(0.03)***	(0.05)***	(0.05)***	(0.07)***
Invited to Health Seminar	-0.04	0.01	-0.03	0.01		
	(0.07)	(0.07)	(0.03)	(0.05)		
Read Script					0.14	0.05
					(0.05)***	(0.06)
Observations	174	175	233	281	234	221
R-squared	0.69	0.74	0.95	0.82	0.85	0.72

Notes: All respondents were women. Regressions include all the controls listed in Table A3. Standard errors in parentheses.

^{*} significant at 10%; ** significant at 5%; *** significant at 1%

Table 7. Comparative Results of Some Recent Experimental Health Studies

Study	Country	Product	Price Sensitivity ¹	Information Effects	Peer Network Effects	Gender Effects
	Kenya	Shoes (Rubber shoes)	e _s = -0.405	No effect of script	No friendship or geographical effects	Positive for mothers
Current	Guatemala	Hand soap and Vitamins	$e_s = -0.776$ $e_v = -0.547$	No effect from health seminar	NA	NA
Studies	India	Hand soap and Vitamins	$e_s = -0.345$ $e_v = -0.407$	Significant effect of script for 1 product	NA	NA
	Uganda	Hand soap and Vitamins	e = -0.156 $e_v = -0.883$	No effect from health seminar	NA	NA
Kremer and Miguel (2007)	Kenya	Deworming Treatment ²	Very high at $p = 0.3$	Education campaign (among children) had no effect	Negative peer effects on treatment uptake	NA
Ashraf, Berry, & Shapiro (2010)	Zambia	Chlorine water purification	e = -0.60 ⁴	NA	NA	Only Women
Cohen and Dupas (2010), Dupas (2009, 2012)	Kenya	Treated bed nets	e = -0.47 (Cohen and Dupas 2010)	No significant effect of scripts ⁵	Strong peer effects ⁶	No effect
Oster and Thornton (2010)	Nepal	Menstrual Cups	NA	NA	Strong peer effects	Only Women
Kremer et al. (2011)	Kenya	Chlorine water purification	Very high at p=0.7	Small effects from inform. campaign	Little evidence of peer effects	Only Women
Ashraf, Jack, & Kamenica (2011)	Zambia	Chlorine water purification	$e = -0.636.^{8}$	No level effect, but increases price elasticity.	NA	NA
Miller and Mobarak (2011)	Bangladesh	Improved cook stoves	e = -0.50	Information campaign via peers	Initial effect from respected peers	Moderately positive for wives

¹Column reports elasticities at mean price unless otherwise noted.

²Albendazole and praziquantel.

³Relative to a zero price, a \$0.30 fee cost-recovery fee decreased demand 80%.

⁴About 80 percent of respondents bought Clorin at 300 Kw with 50 percent buying at 800 Kw (3200 Kw = \$1US).

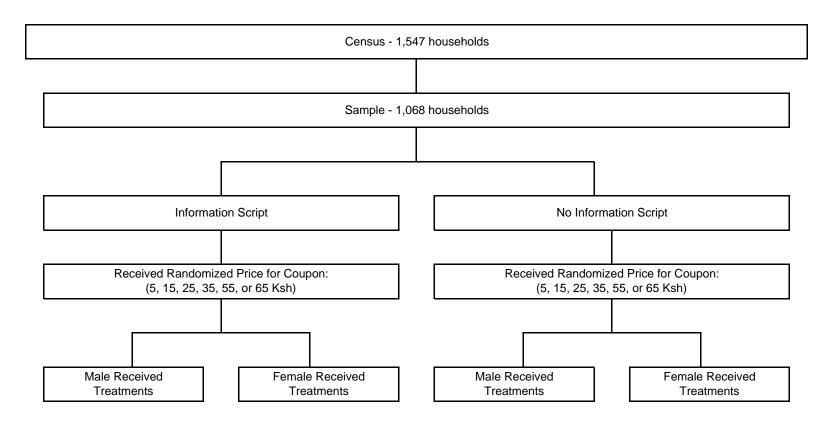
⁵Neither health nor financial encouragements significantly affected purchase.

⁶Households who were surrounded by other households receiving a low price in a first phase (who were much more likely to purchase bed nets) were more likely to purchase them in the second phase.

⁷Usage falls from 58% to 3.5% when price increases from zero to 20 Kenyan shillings and take-up is low at all positive prices.

⁸Taken at means of price and take-up. When provided consumer information, magnitude of elasticity increases to - 0.876.

Appendix Figure 1: Experimental Design



Note: Male/Female treatments only apply to dual-headed households

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Appendix Table A1. Background Characteristics of those Selected for Follow-up

	(1)
	Administered Follow-up Survey
Price = 5 Ksh	0.04
	(0.05)
Price = 15 Ksh	0.04
	(0.05)
Price = 25 Ksh	0.07
	(0.05)
Price = 35 Ksh	0.09
	(0.05)*
Price = 55 Ksh	0.00
	(0.05)
Sampled for Script	-0.03
	(0.03)
Male	-0.07
	(0.03)**
Risk Payout	-0.06
	(0.07)
p-value for joint test of all treatments	0.20
Mean of Dependent Variable	0.38
Number of Observations	999
R-squared	0.01

Notes: Omitted price category is 65 Ksh.

Standard errors in parentheses.

^{*} significant at 10%; ** significant at 5%; *** significant at 1%

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Appendix Table A2. First Stage for Randomization of Gender of Household Head

	(1)
	Male Interviewed
Male Sampled for Interview	0.57
	(0.03)***
Constant	0.04
	(0.02)**
Number of Observations	812
R-squared	0.37

Notes: No controls are included. Regressions is restricted to dual-headed households. Standard errors in parentheses.

^{*} significant at 10%; ** significant at 5%; *** significant at 1%

Appendix Table A3. Randomization Check for Pilots in Guatemala, Uganda, and India

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
	Coefficients of OLS Regression of Treatment						p-value for test of
			ndicators	joint significance of			
	Overall	50%	75%	Invited to	Read	Product	all price dummies
Daniel A. Overtamala	Mean	Retail	Retail	Seminar	Script	= Soap	•
Panel A. Guatemala	1.04	0.55	0.07	0.00		0.00	0.40
Years Education	1.94	-0.55 (0.24)*	-0.27	-0.36		-0.02	0.19
٨٥٥	(2.31) 37.53	(0.31)* 2.46	(0.31) 0.61	(0.25) -3.39		(0.25) -0.21	0.33
Age			(1.80)	-3.39 (1.43)**			0.33
Number of Children	(13.25) 3.48	(1.75) -0.06	0.34			(1.41) -0.14	0.20
Number of Children	(2.38)	(0.32)	(0.32)	0.05 (0.26)		-0.14 (0.26)	0.39
Household has Access to	(2.36) 0.89	0.04	0.06	-0.04		0.20)	0.30
Piped Water	(0.31)	(0.04)	(0.04)	(0.03)		(0.03)	0.30
Number of Observations	349	(0.04)	(0.04)	(0.03)		(0.03)	
Number of Observations	343						
Panel B. Uganda							
Years Education	5.70	-0.88	-0.30	0.10		-0.75	0.09*
	(3.98)	(0.40)**	(0.46)	(0.35)		(0.36)**	
Age	32.87	1.50	-0.23	0.53		0.71	0.17
	(9.31)	(0.95)	(1.07)	(0.83)		(0.84)	
Number of Children	4.17	-0.07	-0.30	-0.07		0.22	0.32
	(1.77)	(0.18)	(0.20)	(0.16)		(0.16)	
Household has Access to	0.05	0.01	0.02	0.01		0.08	0.75
Piped Water	(0.22)	(0.02)	(0.03)	(0.02)		(0.02)***	
Number of Observations	514						
Panel C. India							
Years Education	5.50	0.74	-0.46		-1.46	-0.10	0.07*
	(4.44)	(0.50)	(0.50)		(0.41)***	(0.41)	
Age	39.38	-0.52	1.14		-1.06	0.68	0.36
-	(9.82)	(1.11)	(1.12)		(0.93)	(0.93)	
Number of Children	1.25	0.03	0.01		0.03	-0.04	0.97
	(1.07)	(0.12)	(0.12)		(0.10)	(0.10)	
Household has Access to	0.42	0.04	0.07		0.06	-0.04	0.49
Piped Water	(0.49)	(0.06)	(0.06)		(0.05)	(0.05)	
Number of Observations	455						

Notes: Each row is a separate regression of the given dependent variable on all the treatments listed. The omitted price category is 25% of the retail price, and the omitted health product is adult multivitamins. All respondents were women. Standard errors in parentheses.

^{*} significant at 10%; ** significant at 5%; *** significant at 1%