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# FOOD SECURITY RESEARCH PROJECT ZAMBIAN SMALLHOLDER BEHAVIORAL RESPONSES TO FOOD RESERVE AGENCY **ACTIVITIES** by Nicole M. Mason, T. S. Jayne, and Robert J. Myers

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## ZAMBIAN SMALLHOLDER BEHAVIORAL RESPONSES TO FOOD RESERVE AGENCY ACTIVITIES

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Any views expressed or remaining errors are solely the responsibility of the authors. Comments and questions should be directed to the Project Director, Food Security Research Project, 26A Middleway, Kabulonga, Lusaka; Tel +260 (21)1261194; email: <a href="mailto:kabaghec@msu.edu">kabaghec@msu.edu</a>.

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#### **EXECUTIVE SUMMARY**

More than two decades after the initiation of agricultural market reforms in eastern and southern Africa (ESA), governments in the region are increasingly using parastatal grain marketing boards (GMBs) and/or strategic grain reserves (SGRs) to directly influence the prices faced by farmers and consumers. In Zambia, for example, the government through the Food Reserve Agency, a SGR/GMB, purchased nearly 400,000 metric tons (MT) of maize from smallholders in 2006/07 and 2007/08, or more than 50% of the maize marketed by this group. This marked a sharp increase in the level of FRA purchases: between its establishment in 1996 and the 2005/06 marketing year, FRA's annual maize purchases only once exceeded 100,000 MT. Then in 2010/11, the FRA purchased more than 80% of expected smallholder marketed maize (878,570 MT).

The FRA buys maize at a pan-territorial price that often exceeds market price levels. Private trade is legal and private buyers are allowed to buy maize at prices above or below the FRA price. Significant public resources are devoted to the FRA. During budget years 2004 through 2011, the Agency's budget allocation averaged 25% of the total allocation to Poverty Reduction Programmes (PRP) in Zambia. The vast majority of the remaining PRP funds were allocated to the main government fertilizer subsidy program, the Farmer Input Support Programme (formerly the Fertilizer Support Programme).

Despite the re-emergence or continuation of GMBs/SGRs as important players in grain markets in ESA, little is known about how these agencies' scaled-up activities are affecting fertilizer use and crop production by smallholder households. In this paper, we use nationally-representative household-level panel survey data from Zambia to estimate the marginal effects of the FRA's maize purchase price and quantities purchased on smallholder behavior, while controlling for the effects of the Government of the Republic of Zambia (GRZ) fertilizer subsidy programs and other factors. The panel data cover the 1999/2000, 2002/03, and 2006/07 agricultural seasons, and therefore capture years before and during the recent scaling-up of the FRA's activities. The smallholder behavioral responses examined are fertilizer demand (kilogram (kg) of fertilizer applied per hectare (ha) of maize) and crop output supply (total, maize, and non-maize area planted, crop output per hectare, and crop output).

The empirical models are estimated in two stages. In the first stage, we estimate the marginal effects of FRA maize purchase and pricing policies on the mean and variance of farmgate maize market and FRA prices at the next harvest and on the probability that a household will sell to the Agency at the next harvest. Predicted values from the first stage regressions are used to construct an expected maize price for each household and agricultural year in the panel survey. The expected maize price is then included as an explanatory variable in the second stage fertilizer demand and output supply regressions.

The empirical results point to three key findings. First, an increase in the volume of maize purchased by the FRA in a household's district in previous years or an increase in the effective FRA maize price faced by the household at the previous harvest has a positive effect on the household's expected maize price at the next harvest. A 1% increase in past FRA maize purchases increases households' expected maize price in 2006/07 by 0.10%. The magnitude of this elasticity is larger for smallholders that cultivate two or more hectares of land or are located in areas that are well suited for low input rainfed maize production. The elasticity of the expected maize price with respect to the lagged effective FRA price is also positive and statistically significant (p<0.10) for these households.

Second, an increase in the expected maize price has a positive effect on total and maize area planted, a negative effect on maize yields, and no statistically significant effect on the intensity of fertilizer use on maize, non-maize area planted, total and non-maize output per hectare, and total, maize, and non-maize output. The positive maize area effect and the negative maize yield effect offset each other, and as a result, there is no statistically significant change in maize quantity harvested. The negative marginal yield effect may be because the additional area planted to maize is of poorer quality or in areas that are agroecologically ill-suited for maize.

Third, the first- and second-stage results combined show that for 2006/07, increases in past FRA district-level maize purchases and in the lagged effective FRA price are associated with:

- household-level increases in total and maize area planted,
- a decrease in maize yield, and
- no significant change in maize quantity harvested, total crop output, or the other dimensions of smallholder behavior examined.

Raising rural incomes, improving national food security, and stabilizing crop prices are core FRA objectives. Although we do not estimate the effects of past FRA behavior on food security or incomes *per se*, the finding of no statistically significant impact of FRA activities on maize or total crop output does not support the conclusion of improvement in food security or incomes.

A large proportion of Zambia's public resources are devoted to the FRA. For example, in the 2010/11 marketing season, spending on the FRA amounted to approximately 2% of the nation's GDP. Between 2004 and 2011, GRZ allocated an average of 25% of its annual Poverty Reduction Programmes budget to the FRA. The failure of FRA policies to increase smallholder maize and total crop output, and the fact that it is mainly relatively well-off smallholders who benefit from the high FRA purchase price, calls into question the efficacy of maize price supports as a poverty reduction tool in Zambia. Indeed, at approximately 80%, rural poverty rates remain stubbornly high and there has been no substantive reduction in rural poverty since the FRA was established in 1996.

GRZ and donor funds devoted to the FRA come at a high opportunity cost. Limiting FRA involvement in the maize market to securing the national strategic food reserve, its original mandate, would free up resources that could be invested in the known drivers of pro-poor agricultural growth such as agricultural research, development and extension, rural infrastructure, and education

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#### **ACRONYMS**

AE Average Elasticity

AFRE/MSU Agricultural, Food, and Resource Economics at Michigan State University

APE Average Partial Effect
CFS Crop Forecast Survey
CRE Correlated Random Effects
CSO Central Statistical Office
ESA Eastern and Southern Africa

FE Fixed Effects

FEWSNET Famine Early Warning Systems Network

FIQI Fisher Ideal Quantity Index

FISP Farmer Input Support Programme

FRA Food Reserve Agency

FSP Fertilizer Support Programme FSRP Food Security Research Project

GMB Grain Marketing Board

GRZ Government of the Republic of Zambia

ha Hectare kg Kilogramme

MACO Ministry of Agriculture and Cooperatives

MT Metric Ton

PHS Post-Harvest Survey

POLS Pooled Ordinary Least Squares PRP Poverty Reduction Programme

SGR Strategic Grain Reserve SS Supplemental Survey WFP World Food Programme

ZMK/K Zambian Kwacha

#### 1. INTRODUCTION

More than two decades after the initiation of agricultural market reforms in eastern and southern Africa (ESA), several governments in the region continue to be directly engaged in staple food marketing (Jayne and Jones, 1997; Jayne et al., 2002; Jayne, Chapoto, and Govereh 2007). While the recent re-introduction or scaling-up of fertilizer subsidy programs, particularly in Malawi, has received much attention in the popular press and from policy makers and researchers (see, for example, Denning et al. 2009; Duflo, Kremer, and Robinson 2009; Ricker-Gilbert, Jayne, and Chirwa 2011; Dugger 2007; Kapekele, 2010), governments in ESA are also increasingly using parastatal grain marketing boards (GMBs) and/or strategic grain reserves (SGRs) to directly influence the prices faced by farmers and consumers. <sup>1</sup>

Zambia is a key example. Not only has the GRZ since 2002/03 distributed large quantities of subsidized fertilizer to smallholders through its Fertilizer Support Programme/Farmer Input Support Programme (FSP/FISP), but it has also become the major buyer of smallholder maize in the country. During the 2006/07 and 2007/08 agricultural marketing years, the GRZ strategic food reserve/maize marketing board, the Food Reserve Agency (FRA), purchased nearly 400,000 MT of maize from smallholders, or more than 50% of the maize marketed by this group. This marked a sharp increase in the level of FRA purchases: between its establishment in 1996 and the 2005/06 marketing year, FRA's annual maize purchases only once exceeded 100,000 MT. The FRA purchased 878,570 MT of maize or 83% of expected smallholder maize sales in 2010/11.

The FRA buys maize at a pan-territorial price that often exceeds market price levels. Private trade is legal and private buyers are allowed to buy maize at prices above or below the FRA price. Together, FRA and FSP/FISP accounted for over 90% of the GRZ budget allocation to Poverty Reduction Programmes in budget years 2006 to 2011.

Despite the re-emergence or continuation of GMBs/SGRs as important players in grain markets in ESA, little is known about how these agencies' scaled-up activities are affecting fertilizer use and crop production by smallholder households. The literature on the impacts of GMBs in the region focuses mainly on the decades prior structural adjustment and on the effects of the dismantling or downsizing of these entities during the 1980s and 1990s (e.g., Jansen 1991; Krueger 1991; Schiff and Valdés 1991; Masters and Nuppenau 1993; Krueger 1996). This paper revisits the impacts of GMBs/SGRs on smallholder behavior in light of recent events, modern conditions, and new, more detailed and disaggregated data.

More specifically, we use nationally-representative household-level panel survey data from Zambia to estimate the marginal effects of the FRA's past maize purchase price and quantities purchased on smallholder behavior, while controlling for the effects of GRZ fertilizer subsidy programs and other factors. The panel data cover the 1999/2000, 2002/03, and 2006/07 agricultural seasons, and therefore capture years before and during the recent

<sup>&</sup>lt;sup>1</sup> A marketing board is a state-controlled or state-sanctioned entity established to direct the market and marketing of specific commodities within a given country or other geographic area (Staatz 2006; Barrett and Mutambatsere 2008). A strategic grain reserve is a "public stock of grain used to meet emergency food requirements, to stabilize food prices, and [or] to relieve temporary shortages while commercial imports or food aid are being arranged" (Minot 2010). Some entities that refer to themselves as SGRs, e.g., the Zambian Food Reserve Agency, have functions such as grain marketing and market facilitation that are more characteristic of GMBs.

<sup>&</sup>lt;sup>2</sup> Smallholder households are those cultivating less than 20 ha. The agricultural marketing year in Zambia, henceforth referred to as *marketing year*, is from May to April. The agricultural year is from October through September.

scale-up of FRA maize purchases. In addition to measuring the marginal effects of changes in FRA domestic maize purchase policies on smallholder fertilizer use on maize, crop area planted, output per hectare, and output, the paper's other main objective is to identify the policy implications of the findings.

The remainder of the paper is organized as follows. Section 2 is an overview of FRA activities with particular emphasis on the Agency's domestic maize purchases during the 1996/97-2007/08 marketing years. Sections 3 and 4 describe the data and methods, respectively. Results are presented in section 5, and the conclusions and policy implications are discussed in section 6.

#### 2. THE FOOD RESERVE AGENCY

#### 2.1. Overview of FRA Activities

The FRA, a parastatal, was established in 1996 with the enactment of the Food Reserve Act of 1995. The FRA's original primary function was to establish and administer a national food reserve and the Agency was to be involved in crop marketing only as necessary to perform this function (GRZ 1995). Crop marketing and market facilitation were officially added as FRA functions when the Food Reserve Act was amended in 2005 (GRZ 2005). Raising rural incomes, improving national food security, and stabilizing crop prices are core FRA objectives (FRA n.d.). Maize is the most important crop in Zambia and the Agency's emphasis has been almost exclusively on maize. For example, in the 2005/06 marketing year, 95% of the FRA's budget for crop purchases was for maize (FRA 2005).

The household panel survey data used in this paper cover the 1999/2000, 2002/03, and 2006/07 agricultural years and subsequent marketing years (2000/01, 2003/04, and 2007/08). Table 1 summarizes FRA domestic maize purchase activities during the 1996/97 through 2010/11 marketing years. During its first two years in operation (1996/97 and 1997/98), the FRA contracted small-scale traders to buy maize from smallholders on its behalf. The quantities purchased were small and only made in four to five districts. The price paid by the Agency to contracted traders varied across districts to reflect different market conditions<sup>3</sup>. The FRA did not purchase maize in Zambia from 1998/99 to 2001/02 due to lack of funding. Therefore, at planting time in the 1999/2000 agricultural year (captured in the first wave of the panel survey), the FRA had not purchased maize in Zambia in two years and had no plans to do so for the foreseeable future.<sup>4</sup>

In July 2002 following drought-related poor harvests in many areas of Zambia, GRZ allocated K12 billion to the FRA to buy 15,000 MT of maize directly from smallholders in eight surplus districts (FEWSNET and WFP 2002). Sourcing maize directly from smallholders rather than through private traders marked a distinct change in FRA procurement practices. By the end of October 2002, the FRA had purchased 9,059 MT in eight districts. The Agency continued buying maize through March 2003 and purchases for the 2002/03 marketing year totaled 23,535 MT from 10 districts. Thus, at planting time in the 2002/03 agricultural year (captured in the second wave of the panel survey), the FRA was buying maize directly from smallholders for the first time since its establishment but only in eight of Zambia's 72 districts.

In May 2003, the FRA announced its 2003/04 marketing year plans to purchase 205,700 MT of maize directly from smallholders in 37 districts at a pan-territorial price of K30,000 per 50-kg bag. This was the first time since 1992 that GRZ announced a pan-territorial price for maize (FEWSNET 2003a; FEWSNET 2003b). The Agency ultimately only purchased 54,847 MT (15-19% of smallholder maize sales) due to funding shortfalls but its ambitious purchase target signaled its intention to become a major player in the Zambian maize market.

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<sup>&</sup>lt;sup>3</sup> Chance Kabaghe. Personal communication, 5 March 2010.

<sup>&</sup>lt;sup>4</sup> Here and throughout the rest of the paper, we use *planting time* as shorthand for the period during which households make land preparation, fertilizer use, and planting decisions.

<sup>&</sup>lt;sup>5</sup> In order to sell to the FRA, smallholders are required to be members of a cooperative or other farmer group (FRA various years). Smallholder sellers deliver their maize to satellite depots set up by the FRA in targeted districts and are to be paid within ten days, although payment delays are common.

Table 1. FRA Maize Prices and Purchases, and Estimated Smallholder Maize Production and Sales, 1996/97-2010/11 Marketing Years

	FRA pan-		FRA			FRA	
	territorial	# of districts	domestic	Estimated		purchases	Production
	price	with FRA	maize	smallholder maize:e		as % of	and sales
Marketing	(ZMK*/50	maize	purchases	Production	Sales	smallholder	data
year	kg)	purchases <sup>d</sup>	(MT)	(MT)	(MT)	maize sales	source
1996/1997	11,800 <sup>a</sup>	5	10,500	1,117,955	280,955	3.7	PHS
1997/1998	$7,880^{a}$	4	4,989	804,626	206,557	2.4	PHS
1998/1999	N/A	0	0	724,024	175,515	0	PHS
1999/2000	N/A	0	0	929,304	242,753	0	PHS
2000/2001	N/A	0	0	1,253,722	303,738	0	PHS
				1,282,352	323,387	0	SS
2001/2002	N/A	0	0	957,437	209,326	0	CFS
				938,539	197,915	0	PHS
2002/2003	$40,000^{b}$	10	23,535	673,673	143,453	16.4	CFS
				947,825	195,407	12.0	PHS
2003/2004	30,000	36	54,847	970,317	260,885	21.0	CFS
				1,126,316	291,462	18.8	PHS
				1,365,538	370,332	14.8	SS
2004/2005	36,000	46	105,279	1,364,841	331,006	31.8	CFS
				1,216,943	356,750	29.5	PHS
2005/2006	36,000	50	78,667	652,414	151,514	51.9	CFS
				800,574	206,092	38.2	PHS
2006/2007	38,000	53	389,510	1,339,479	454,676	85.7	CFS
				1,388,311	674,020	57.8	PHS
2007/2008	38,000	58	396,450	1,419,545	533,632	74.3	CFS
				1,960,692	762,093	52.0	SS
2008/2009	45,000°	58	73,876	1,392,180	522,033	14.2	CFS
2009/2010	65,000	59	198,630	1,657,117	613,356	32.4	CFS
2010/2011	65,000	62	878,570	2,463,523	1,062,010	82.7	CFS

Sources: FRA; MACO/CSO Crop Forecast Surveys (CFS); MACO/CSO Post-Harvest Surveys (PHS); CSO/MACO/FSRP Supplemental Surveys (SS). \* Zambian Kwacha

Notes: <sup>a</sup>Not a pan-territorial price but the average price paid by FRA to private traders, who procured from smallholders. <sup>b</sup>Not a pan-territorial price but the price paid by FRA directly to smallholder farmers in the districts where it was purchasing; initial FRA price of K30,000 was raised to K40,000 in August 2002. <sup>c</sup>FRA price increased to 55,000 in September 2008. <sup>d</sup>There are 72 districts in Zambia. <sup>c</sup>Smallholder maize production and sales based on CFS data are expected, not realized, levels.

The FRA increased its market share in 2004/05 and 2005/06, accounting for 30% and 38% of smallholder maize sales, respectively (Table 1). At harvest time in 2006, the FRA planned to purchase 80,000 MT of maize in 55 districts at K38,000 per bag. Following a surge of sales from smallholders, in July the Agency increased its purchase target to 200,000 MT. By the time buying ended on September 30, 2006 (two days after presidential and parliamentary elections), FRA purchases totaled nearly 360,000 MT. The Agency re-entered the market in November and December, and total FRA purchases for 2006/07 were 389,510 MT (58% of smallholder maize sales).

Therefore, at planting time in the 2006/07 agricultural year (captured in the third wave of the panel survey), the FRA was the dominant buyer of smallholder maize in Zambia and had purchased maize directly from smallholders in five consecutive years. At K38,000 per 50-kg bag, the FRA 2006/07 buy price was well above wholesale maize market prices, which ranged from K23,000 to K31,000. The Agency's buying presence had increased from 10

districts in 2002/03 to 53 districts in 2006/07. The FRA purchased nearly 400,000 MT again in 2007/08.

## 2.2. Smallholder Maize Sales to FRA and Socioeconomic Characteristics of Sellers vs. Non-Sellers

The FRA did not buy maize in Zambia during the marketing year captured by the first wave of the panel survey (2000/01) but it did purchase maize during the marketing years captured in the second and third waves (2003/04 and 2007/08). Table 2 summarizes the rate and level of smallholder participation in selling maize to the FRA in these two years and contrasts the socioeconomic characteristics of sellers and non-sellers. Less than 1% of smallholder households sold maize to the Agency in 2003/04. This percentage rose to nearly 10% in 2007/08 as the FRA scaled up its activities. In 2007/08, participating households sold an average of 2.76 MT to the FRA (1.25 MT at the median). Households that sold maize to the Agency had considerably larger landholdings, more farm assets, and heads with higher educational attainment, and were less likely to be female-headed than households that did not (Table 2).

Table 2. Smallholder Socioeconomic Characteristics by Participation in FRA

	Marketing	Sold maiz	e to FRA?
Descriptive result	year	Yes	No
Share of smallholder			
households	2003/2004	0.8%	99.2%
	2007/2008	9.7%	90.3%
Mean kg of maize sold to FRA	2003/2004	2,315	0
	2007/2008	2,764	0
Median kg of maize sold to			
FRA	2003/2004	600	0
	2007/2008	1,250	0
Mean landholding size (ha)	2003/2004	3.65	2.11
	2007/2008	3.65	1.84
Mean value of farm assets	2003/2004	59.4	23.1
(100,000 ZMK, 2007/08=100)	2007/2008	65.7	18.8
Share female-headed	2003/2004	8.6%	21.9%
	2007/2008	14.0%	25.0%
Median education of HH head	2003/2004	8	5
(highest grade completed)	2007/2008	7	5

Sources: CSO/MACO/FSRP 2004 and 2008 Supplemental Surveys

Notes: Farm assets are plows, harrows, and ox carts.

<sup>&</sup>lt;sup>6</sup> See Mason (2011, Appendix F) for additional details on the FRA and for information on GRZ fertilizer subsidy programs.

#### 3. DATA

The data used in this paper are drawn mainly from a three-wave, nationally representative longitudinal survey of rural smallholder households in Zambia. The first wave was done in two parts: the 1999/2000 Post-Harvest Survey (PHS9900) conducted by the Zambian Central Statistical Office (CSO) and Ministry of Agriculture and Cooperatives (MACO) in August-September 2000, and the linked CSO/MACO/FSRP (Food Security Research Project) Supplemental Survey conducted in May 2001 (SS01). The second and third waves were the Supplemental Surveys (SS) conducted in May 2004 (SS04) and June-July 2008 (SS08). PHS9900 and SS01 covered the 1999/2000 agricultural year and 2000/01 marketing year. A total of 7,699 rural households from 70 districts were interviewed for PHS9900. Households were selected using a stratified three-stage sampling design. See Megill (2005) for details. PHS9900 focused on households' agricultural activities. For SS01, attempts were made to revisit all PHS9900 households to collect information on household demographics, off-farm income and remittances, and other details. 6,922 of the 7,699 PHS9900 households were successfully re-interviewed in SS01 (89.9% re-interview rate).

A second attempt was made to revisit PHS9900 households for SS04, which covered the 2002/03 agricultural year and 2003/04 marketing year. SS04 included questions comparable to those on PHS9900 and SS01 plus additional questions. 5,358 SS01 households were successfully re-interviewed (77.4% re-interview rate). The third re-interview of PHS9900 households was SS08, which covered the 2006/07 agricultural year and 2007/08 marketing year. SS08 questions mirrored SS04 and 4,286 SS04 households were successfully revisited (a re-interview rate of 80.0%). Unless otherwise noted, we use the unbalanced panel of households that were interviewed in at least SS01 and SS04, if not SS08. Given non-trivial attrition rates between rounds of the SS, attrition bias is a potential problem. However, tests for attrition bias as described in Wooldridge (2002: p. 585) fail to reject the null hypothesis of no attrition bias in all cases (0.20 ).

Other data used in the study are: (i) FRA administrative records on yearly district-level maize purchases from 1996/97 to 2006/07; (ii) dekad (10-day period) rainfall data covering the 1990/91 to 2006/07 growing seasons and collected from 36 stations throughout Zambia by the Zambia Meteorological Department; (iii) crop prices from MACO/CSO Post-Harvest Surveys for 1998/99, 2001/02, and 2005/06; (iv) constituency-level data on the percentage of votes won by the ruling party and opposition parties during the 1996, 2001, and 2006 presidential elections from the Electoral Commission of Zambia; and (v) monthly maize wholesale prices from trading centers in each of Zambia's nine provinces from MACO's Agriculture Market Information Center.

#### 4. METHODS

For a detailed discussion of the conceptual framework, empirical models, and estimation strategy used in the paper, see Mason (2011, Chapter 2). In this section, we provide an overview of the methodology.

#### 4.1. Conceptual Framework

In modeling the marginal effects of the FRA's maize pricing and purchases on smallholder fertilizer demand and crop output supply, four key features of the decision-making environment need to be taken into consideration. First, at planting time farmers do not know the price at which the FRA will buy maize and the prices at which private traders will buy maize and other crops at the next harvest. Second, households do not know if the FRA will be buying maize in their area during the next marketing year. Third, the FRA pan-territorial buy price is not a floor price. Private sector buyers can legally buy maize for more or less. Fourth, the effective FRA price (i.e., the FRA pan-territorial price adjusted for transfer costs from the homestead to an FRA satellite depot) varies across households.

Several key assumptions are made en route to deriving fertilizer demand and output supply functions. First, assume that the agricultural producer in question is risk-neutral and maximizes expected profit. Second, suppose there is a single (private sector) marketing channel for non-maize crops and that there are two potential marketing channels for maize: private sector and FRA. Third, assume that the household sells maize to only one marketing channel – the one with the higher effective price. Fourth, assume that the private sector channel is always available but the FRA channel is available at harvest with probability  $E(\gamma)$ , which is between zero and one and is unknown to the farmer at planting time. (E(.)) is the expectations operator.) Let  $p_f$ ,  $p_p$ , and  $p_o$  be, respectively, the effective FRA and private sector maize prices and a vector of other crop prices at the next harvest. These prices are unobserved to the farmer at planting time. Fifth, assume that variable input prices ( $\mathbf{w}$ ) are known at planting time, and let  $\mathbf{z}$  be a vector of production shifters.

Under these assumptions, a representative household's fertilizer demand or crop output supply function (y) is:

$$y = y \left[ p^*, E(\mathbf{p_o}), \mathbf{w}; z \right]$$
 (1)

where

$$p^* = E(\gamma)E[\max(p_f, p_p)] + [1 - E(\gamma)]E(p_p), \tag{2}$$

is the expected (effective) maize price. Equation (2) shows that the expected maize price is a weighted average of the expected maximum of maize prices in the FRA and market channels,  $E[\max(p_f, p_p)]$ , and the expected private sector price,  $E(p_p)$ . The weights on these two prices are a function of the probability that the FRA channel will be available to the

<sup>&</sup>lt;sup>7</sup> This is consistent with household survey evidence from Zambia. In the 2007/08 and 2009/10 marketing years, only 5% of maize-selling smallholder households sold maize to both private sector buyers and the FRA. More than 80% of maize-selling smallholder households had only one maize sale transaction.

<sup>&</sup>lt;sup>8</sup> The additional assumptions that  $\gamma$  is independent of  $p_f$  and  $p_p$  but that  $p_f$  and  $p_p$  are not independent are also required.

household at the next harvest,  $E(\gamma)$ . Note that if the FRA channel will definitely *not be* available, i.e.,  $E(\gamma) = 0$ , then the expected maize price is simply the expected private sector price. Conversely, if the FRA channel will definitely *be* available, the expected maize price is the expected maximum of prices in the two marketing channels. To further evaluate  $E[\max(p_f, p_p)]$ , we need to make an assumption about the joint distribution of  $p_f$  and  $p_f$ . We assume bivariate log normality as an approximation. Under this assumption,  $E[\max(p_f, p_p)]$  is a function of the means, variances, and covariance of the natural logs (ln) of the two prices (Lien 2005).

In the empirical application, the challenge is to first measure these means, variances, and covariance, as well as the probability that the FRA channel will be available at the next harvest. Past FRA domestic maize purchases and prices are hypothesized to influence these values. Next, an expected maize price,  $p^*$ , is constructed per equation (2) and we can measure the marginal effects of past FRA policies on a household's expected maize price. Then, the expected maize price is included as an explanatory variable in the household's fertilizer demand or output supply function per equation (1). From this equation, we can measure the marginal effect of the expected maize price on household behavior. Finally, we take the product of these two marginal effects ((i) the marginal effect of FRA policies on the expected maize price, and (ii) the marginal effect of the expected maize price on household behavior) to obtain an estimate of the marginal effect of FRA policies on smallholder behavior.

#### 4.2. Empirical Models

In the sub-sections that follow, we first describe how we estimate households' subjective means, variance, and covariance of harvest-time prices in the FRA and private sector maize marketing channels, and households' subjective probabilities that the FRA channel will be available to them come harvest time. The general approach is to regress, for example, the farmgate FRA price received by households that sold to the Agency at the next harvest on variables observed *by all households at planting time* and hypothesized to influence the maize price they receive and their price expectations. These variables include FRA policies during the previous marketing year. We then use the regression results to compute predicted farmgate FRA prices at the next harvest *for all households in the sample*, regardless of if they ultimately sold to FRA at the subsequent harvest or not.

Next, we specify the empirical fertilizer demand and crop output supply equations and describe how these equations are estimated. Readers not interested in the details of the empirical models and estimation strategy used in the study may wish to skip to the Results (section 5).

#### 4.2.1. Expected Values for FRA and Private Sector Log Maize Prices

Estimates of a household's subjective expected values for log effective maize prices in the FRA and market channels ( $E(\ln p_j) = \mu_j$ , j = f, p) are obtained by first estimating

$$\ln p_{j,i,t} = \mathbf{\Omega}_{i,t-1} \boldsymbol{\beta}_j + c_i + \varepsilon_{j,i,t}$$
(3)

where  $p_{j,i,t}$  is the effective channel j maize price received by household i in harvest year t (the price at the point of sale minus estimated transportation costs from the homestead/farm to the point of sale);  $\mathbf{\Omega}_{i,t-1}$  is a vector of information observed by the household at planting time and hypothesized to influence the maize price it receives and inform its expectation of harvest time maize prices;  $\beta_i$  is a vector of parameters to be estimated;  $c_i$  is time invariant household-level unobserved heterogeneity; and  $\varepsilon_{i,i,t}$  is the error term.  $\Omega_{i,t-1}$  includes, among other things, maize prices in the two marketing channels at the previous harvest, and the volume of maize purchased by the FRA in the household's district in the previous marketing year(s). See Tables A.1 and A.2 in Appendix A for a list of the variables included in  $\Omega_{i,t-1}$  and associated summary statistics.

Equation (3) is estimated by correlated random effects-pooled ordinary least squares (CRE-POLS) using data from households that sold maize to marketing channel j and for which the effective maize price received can be estimated from the SS data. See Wooldridge (2002) for details on the CRE approach. This estimator is used because it allows us to control for time invariant unobserved household effects ( $c_i$ ) that may be correlated with the explanatory variables in equation (3). If not controlled for,  $c_i$  can render inconsistent the estimates of the parameters in the equation.

Because the variables in  $\Omega_{i,t-1}$  are observed for all households whether or not they sold maize to marketing channel j, once estimated, equation (3) can be used to obtain predicted values for all households in the sample. These predicted values are used as households' subjective values for expected log maize prices in the two marketing channels.<sup>10</sup>

#### 4.2.2. Variances for FRA and Private Sector Log Maize Prices

The (conditional) variance of the log maize price in marketing channel j is equal to the expected value of the squared error term in equation (3). We estimate this expected value using an approach similar to the one described in the previous section. We first regress the log squared residuals from equation (3) on  $\Omega_{i,t-1}$ , the vector of information observed by the household at planting time and hypothesized to influence its maize price expectations:

$$\ln \hat{\varepsilon}_{j,i,t}^2 = \mathbf{\Omega}_{i,t-1} \boldsymbol{\delta}_j + c_i + v_{j,i,t} \tag{4}$$

 $v_{j,i,t}$  is the error term. Equation (4) is estimated using CRE-POLS and observations for households that sold maize to marketing channel j. Then the estimated equation is used to obtain predicted values  $\hat{\varepsilon}_{j,i,t}^{\perp}$  for all households in the sample. These predicted values are

<sup>9</sup> Insufficient information was collected in SS01 to calculate effective maize prices, hence maize prices at the

point of sale are used for that year.

10 Predicted log maize prices obtained for all smallholder households from parameter estimates based on data for those that sold maize to marketing channel j could therefore be plagued by selection bias. However, tests as described in Wooldridge (2002) fail to reject the null hypothesis of no sample selection bias in all cases for the expected values and variances of maize prices in the two marketing channels.

used as households' subjective values for the variance of the log maize prices in the two channels.

#### 4.2.3. Covariance of FRA and Private Sector Log Maize Prices

The (conditional) covariance of the effective log maize prices in the two channels is a function of the (conditional) variances and correlation coefficient ( $\rho$ ) of these prices:

$$Cov(\ln p_f, \ln p_p) = \rho \sqrt{Var(\ln p_f)} \sqrt{Var(\ln p_p)}$$
(5)

We assume that the correlation coefficient is a constant and estimate it as the sample correlation between  $\hat{\varepsilon}_{f,i,t}$  and  $\hat{\varepsilon}_{p,i,t}$  (the residuals from the log effective maize price equations for households that sold to both the FRA and private buyers in year t). The household's subjective covariance is then calculated per equation (5) using this correlation coefficient and the household's subjective variance estimates.

#### 4.2.4. The Probability that the FRA Channel Will Be Available at Harvest

SS04 and SS08 did not ask respondents if the FRA channel was available in their area during the 2003/04 and 2007/08 marketing years, respectively, but we do know if a given household sold maize to the FRA in these years. In the empirical application,  $\gamma_{i,t} = I$  if the household sold maize to the FRA, and zero otherwise. A household's subjective probability that  $\gamma_{i,t} = I$  is defined as the predicted probability from the probit model:

$$E(\gamma_{i,t} \mid \mathbf{\Omega}_{i,t-1}) = \Pr(\gamma_{i,t} = 1 \mid \mathbf{\Omega}_{i,t-1}) = \Phi(\mathbf{\Omega}_{i,t-1}\boldsymbol{\omega})$$
(6)

where  $\omega$  is a vector of parameters to be estimated. Equation (6) is estimated by CRE probit. All 1999/2000 households and 2002/03 households outside of the eight districts where the FRA had purchased maize as of planting time in 2002 are excluded from the probit and assigned zero probability of selling to the FRA at the next harvest.

Given the estimates of the expected values, variances, and covariance of log effective maize prices in the FRA and private sector channels, as well as the estimated probability that a household will sell to the FRA at the next harvest, an expected maize price,  $\hat{p}_{i,t}^*$ , can be constructed for each household and agricultural year per equation (2).

#### 4.2.5. Expected Prices for Non-maize Crops, $E(\mathbf{p_o})$

Non-maize crop prices in harvest year *t-1* are used as proxies for expected year *t* prices. The commonly marketed crops for which lagged prices are available are groundnuts, mixed beans, and sweet potato.

#### 4.2.6. Empirical Factor Demand and Output Supply Equations

The empirical factor demand and output supply equations analogous to equation (1) are:  $y_{i,t} = \alpha_0 + \alpha_1 \hat{p}_{i,t}^* + p_{o,k,t-1} \alpha_2 + \alpha_3 w_{i,t} + z_{i,t} \alpha_4 + \alpha_5 govt fert_{i,t} + c_i + u_{i,t} \qquad (7)$  where  $\hat{p}_{i,t}^*$  is the expected maize price (ZMK/kg);  $p_{o,k,t-1}$  is a vector of median groundnut, mixed bean, and sweet potato prices in province k at the previous harvest in ZMK/kg;  $w_{i,t}$  is the effective fertilizer market price in ZMK/kg paid by households that purchased fertilizer from commercial sources and the district median effective fertilizer market price otherwise;  $z_{i,t}$  is a vector of other production shifters such as quasi-fixed factors of production, rainfall, and household characteristics affecting production;  $govt fert_{i,t}$  is the kilograms of government-subsidized fertilizer acquired by the household;  $c_i$  is time invariant household-level unobserved heterogeneity; and  $u_{i,t}$  is the error term. Price data on variable inputs other than fertilizer are not available. See Tables A.1 and A.2 in Appendix A for summary statistics for the explanatory variables in equation (7).

A factor demand equation is estimated for the intensity of fertilizer use on maize (kg/ha). Output supply equations are estimated for area planted and crop output per hectare. Since crop output is equal to area planted times yield, we apply the product rule to estimation results for area planted and crop output per hectare to compute the average partial effects of key variables of interest on crop output, rather than estimating a separate equation for crop output. Equations are estimated for total, maize, and non-maize output per hectare. For area planted, equations are estimated for total area and maize area, and then partial effects on nonmaize area are calculated as the difference of the partial effects on total area and maize area. Total refers to maize and the 16 non-maize crops covered by all three SSs: cassava, sweet potato, sorghum, millet, groundnut, mixed bean, cotton, rice, sunflower, soyabean, Irish potato, ground bean, cowpea, velvet bean, tobacco, and coffee. Total crop output and nonmaize crop output are Fisher-Ideal Quantity Indexes (FIQI) (Diewert 1992; Diewert 1993). (See Mason (2011, Appendix B) for details.) Total and non-maize crop output per hectare are defined as the associated crop output FIQI divided by hectares planted to the crops included in the FIQI. See Table A.3 in Appendix A for summary statistics for the various dependent variables.

Fixed effects (FE) is used to estimate equation (7) for all dependent variables. Like CRE, FE controls for unobserved time invariant household effects that may be correlated with the explanatory variables in equation (7). Fertilizer use on maize and maize area planted are equal to zero for 64% and 20% of the observations in the analytical sample, respectively. Given these *pile-ups* at zero, a Tobit estimator might better characterize the full distributions of fertilizer use on maize and maize area planted. Therefore, CRE Tobit is also used to estimate equation (7) for these variables. See Wooldridge (2002) for additional information on the Tobit estimator.

FE and the CRE approach require that the explanatory variables in a regression be strictly exogenous. However, the quantity of government-subsidized fertilizer acquired by the household,  $govtfert_{i,t}$ , may be endogenous in equation (7). If it is, then all estimates of the

parameters in the equation may be inconsistent. To test and correct for the potential endogeneity of  $govtfert_{i,t}$ , we follow the approach in Ricker-Gilbert, Jayne, and Chirwa (2011). See that paper and Mason (2011, Chapter 2) for details.

#### 5. RESULTS

Sections 5.1. through 5.3. highlight the key findings of the analysis. In section 5.1., we discuss the results of the auxiliary regressions used to construct the expected maize price variable as well as the average partial effects (APEs) of the effective FRA maize price and district-level purchases on a household's expected maize price. In section 5.2., we report the estimated APEs of the expected maize price on fertilizer use on maize and crop output supply. In section 5.3., we present the estimated APEs of past FRA policies on smallholder behavior.

#### 5.1. Expected Maize Price Auxiliary Regressions and Marginal Effects of Past FRA Policies on a Household's Expected Maize Price

Table 3 reports the key results of interest from the log effective FRA and market maize price regressions and those for the associated log squared residuals per equations (3) and (4). See Table B.1 in Appendix B for the full regression results. Larger FRA district-level maize purchases at the previous harvest are associated with a higher effective maize market price at the upcoming harvest (Table 3, row A). For each additional 10,000 MT purchased by the FRA in a household's district, the harvest-time effective market price is expected to increase by 6.67% (p=0.024). This is consistent with a priori expectations. Once the FRA begins buying maize in a district, it generally returns to that district to buy maize in subsequent years. Higher FRA purchases in a given area are expected to put upward pressure on market prices there. Holding past FRA purchases in the household's district constant, the lagged FRA farmgate maize price has no statistically significant effect on the harvest-time maize market price (p>0.10). This may be because the FRA farmgate price is in large part determined by the FRA pan-territorial price. Changes over time in the pan-territorial price and other national-level policies and conditions are captured by the year dummies in the model. 11

The elasticity of the harvest time FRA price with respect to the lagged FRA price is 0.341 and significant at the 1% level (Table 3, row C). This result is consistent with the fact that it has proven difficult politically for the FRA to lower its pan-territorial buy price from one year to the next. In fact, the FRA price has either increased or stayed the same every year since it began setting a pan-territorial price in 2003/04. So higher FRA prices in one year lead to the expectation of higher FRA prices the following year. The partial effect of past FRA purchases in the household's district on the harvest time FRA price is not statistically different from zero at the 10% level. This suggests that expectations of future FRA prices are driven primarily by past FRA prices and not by the level of FRA activity in the district. This is reasonable since FRA pricing is pan-territorial.

Both the level and square of district-level FRA maize purchases during the previous harvest are statistically significant at the 5% level in the equation for the variance of maize market prices. The coefficient on the level term is negative while the coefficient on the squared term is positive (Table 3, row B).

<sup>11</sup> An interaction term is included in the regressions reported in rows A and B of Table 3 to allow the effect of

the FRA price variable to differ in 1999/2000 versus 2002/03 and 2006/07. The Agency did not buy maize in Zambia in 1999/2000 so there is no FRA price that year and the effective FRA price is set equal to the market price.

**Table 3. Key Results from Log Effective Maize Price and Log Squared Residuals Regressions** 

Key Explanatory Variables of Interest									
	FRA district-	FRA district-	Log	Log effective					
D 1	level	level	effective	FRA maize					
Dependent	purchases	purchases,	FRA maize	price (t-1)					
variable	('000MT, t-1)	squared	price (t-1)	× 1999/2000					
(A) Log effective maize	market price at ha	rvest							
Coefficient	6.67E-03		-0.0221	0.417					
p-value	0.024		0.811	0.056					
(B) Log squared residu	als from (A)								
Coefficient	-0.149	4.85E-03	1.116	0.0469					
p-value	0.007	0.033	0.101	0.989					
(C) Log effective FRA	maize price at harve	est							
Coefficient	-2.06E-03		0.341						
p-value	0.373		0.000						
(D) Log squared residi	uals from (C)								
Coefficient	0.0153		-4.021						
p-value	0.825		0.074						

Note: Standard errors computed using complex survey weights and Huber-White robust variance matrix estimator.

Together, these results suggest that past FRA maize purchases have a negative partial effect on the variance of maize market prices at volumes below 15,330 MT. At 9,890 MT, the 90<sup>th</sup> percentile of lagged FRA purchases over the three waves of the panel survey is well below this level. Larger FRA purchases in a given area are therefore associated with less variable maize market prices. In general, these findings are consistent with time series analyses for Zambia and Kenya, which indicate that GMB activities in the two countries have raised and stabilized maize market prices (Jayne, Myers, and Nyoro 2008; Mason and Myers 2011).

Key APEs from the probit to obtain a household's predicted probability of selling maize to the FRA at the next harvest are reported in Table 4. See Table B.2 in Appendix B for the full regression results. A 1% increase in the previous year's effective FRA price is associated with a small increase (0.003) in the probability that the household will sell to the FRA the following year (where probability  $\in [0,1]$ ). The long-run APE of a 1,000 MT increase in past FRA district-level purchases is a 0.032 increase in the probability that the household sells to Agency at the next harvest. As shown in Table 5, the actual and predicted probabilities of selling to the FRA at the next harvest are extremely low for the vast majority of smallholders.

Table 4. Key Results from CRE Probit: HH Sold Maize to FRA at Harvest =1; =0 Otherwise

o their wise		
Explanatory variables	APE	p-val.
FRA district-level purchases ('000 MT, t-1)	0.00303	0.427
FRA district-level purchases ('000 MT, t-2)	0.0146	0.158
FRA district-level purchases ('000 MT, t-3)	-0.00670	0.703
FRA district-level purchases ('000 MT, t-4)	0.00784	0.764
FRA district-level purchases ('000 MT, t-5)	0.0128	0.214
Log effective FRA maize price (t-1)	0.279	0.003
Joint significance of lagged FRA district-level purchases (F-stat.)	3.77	0.003
Long-run effect of FRA district-level purchases ('000 MT)	0.0315	0.058

Note: Standard errors computed using complex survey weights and Huber-White robust variance matrix estimator.

Table 5. Probability of Selling Maize to the FRA at the Next Harvest

	Predicted probabilities	Probabilities for	all sample HHs
Summary statistic	from probit	2002/03	2006/07
N	5,441	5,358	4,286
Mean	0.0796	0.00333	0.0969
Std. deviation	0.126	0.0172	0.136
Percentile:			
$1^{st}$	8.19E-6	0	7.55E-6
5 <sup>th</sup>	0.0000945	0	0.000139
$10^{\rm th}$	0.000414	0	0.00141
$25^{th}$	0.00464	0	0.0110
$50^{\mathrm{th}}$	0.0289	0	0.0445
$75^{\text{th}}$	0.0977	0	0.123
$90^{\mathrm{th}}$	0.226	0.00395	0.262
$95^{\mathrm{th}}$	0.343	0.0159	0.386
99 <sup>th</sup>	0.621	0.0751	0.664
Observed mean	0.0799	0.00761	0.0971

Average elasticities (AE) of a household's expected maize price with respect to an increase in past FRA district-level purchases and in the lagged effective FRA price are summarized in Table 6. In 2006/07, the AE with respect to past FRA district-level purchases is 0.103 (p=0.060). This means that a household's expected maize price increases by 0.103% when lagged FRA maize purchases increase by 1%. In contrast, in 2002/03 the AE of the expected maize price with respect to past FRA purchases is not statistically different from zero. This is expected given that 75% of households had zero probability of selling to the FRA and a 99<sup>th</sup> percentile of 0.075 in that year (Table 5).

The AE of the expected maize price with respect to past FRA district-level purchases is positive and statistically significant in 2006/07 overall and for all sub-groups examined. The relative size of the AEs is consistent with *a priori* expectations: it is larger among households that cultivate more land and in areas that are more suitable for low-input management rainfed maize production. Households in these two groups also have a positive and statistically significant AE of the expected maize price with respect to the lagged effective FRA maize price (Table 6).

In summary, results suggest that an increase in past FRA district-level maize purchases and, for certain groups of households, an increase in the lagged effective FRA price are associated with statistically significant increases in the household's expected maize price.

#### 5.2. Marginal Effects of the Expected Maize Price on Smallholder Behavior

APEs and AEs of fertilizer use on maize and crop output supply with respect to the expected maize price are summarized in Table 7. The full regression results are reported in Tables B.3 to B.5 in Appendix B. Contrary to *a priori* expectations, an increase in the expected maize price has no statistically significant impact on maize quantity harvested (rows L and M). The APE of the expected maize price is statistically significant and positive for maize area planted (rows D and E) but negative for maize yield (row I). The area and yield effects offset each other, the result being no significant change in maize quantity harvested. The APE of the expected maize price on the intensity of fertilizer use on maize (kg/ha) is not statistically

different from zero (rows A and B). This result coupled with the positive APE on maize area planted suggests that an increase in the expected maize price is associated with an increase in total fertilizer use on maize (kg).

Table 6. Average Elasticities of Expected Maize Price W.R.T. Past FRA Effective Maize Price and District-Level Purchases

	Average elasticity (AE) of expected maize price w.r.t.:								
	FRA distri	ct-level p	ourchases (t-1	to t-5)	Effect	ive FRA 1	maize price (1	t-1)	
	2002/03 & 2	2006/07	2006/07	only	2002/03 &	2006/07	2006/07 only		
Population	AE	p-val.	AE	p-val.	AE	p-val.	AE	p-val.	
All households	0.0456	0.062	0.103	0.060	0.0991	0.130	0.121	0.160	
Farm size category:									
< 2 ha cultivated	0.0352	0.067	0.0796	0.064	0.0872	0.212	0.0962	0.353	
>= 2 ha cultivated	0.0749	0.071	0.170	0.070	0.133	0.035	0.191	0.002	
Suitability of area for	· low input mo	anagemei	nt, rainfed ma	uize:					
High/moderate	0.0569	0.072	0.128	0.070	0.102	0.059	0.130	0.004	
Marginal/unsuitable	0.0311	0.071	0.0710	0.068	0.0961	0.327	0.109	0.532	
Agricultural year:									
2002/2003	-1.82E-4	0.861			0.0819	0.249			
2006/2007	0.103	0.060			0.121	0.160			

Notes: p-values based on 500 bootstrap replications. Results in **bold** are statistically significant at the 10% level.

Table 7. Average Partial Effects and Average Elasticities of Fertilizer Use on Maize and Output Supply W.R.T. the Expected Maize Price

Output Supply While Expected Maize Trice								
Row	Outcome variable	Estimator	APE	AE	p-value			
A	Fertilizer use on maize (kg/ha)	FE	0.000230	0.000847	0.995			
В	Fertilizer use on maize (kg/ha)	CRE Tobit	0.0102	0.0509	0.817			
C	Total area planted (ha)	FE	0.00148	0.843	0.063			
D	Maize area planted (ha)	FE	0.000881	0.970	0.044			
E	Maize area planted (ha)	CRE Tobit	0.000626	0.639	0.063			
F	Non-maize area planted (ha)	Derived (C-D)	0.000595	0.615	0.158			
G	Non-maize area planted (ha)	Derived (C-E)	0.000850	0.884	$0.094^{a}$			
Н	Total output/ha (FIQI/ha)	FE	-0.000842	-0.037	0.897			
I	Maize yield (kg/ha)	FE	-1.388	-0.866	0.007			
J	Non-maize output/ha (FIQI/ha)	FE	0.0114	0.516	0.327			
K	Total output (FIQI)	Derived [f(C,H)]	0.0298	0.783	0.134			
L	Maize output (kg)	Derived [f(D,I)]	0.0573	0.096	0.935			
M	Maize output (kg)	Derived [f(E,I)]	-0.229	-0.232	0.715			
N	Non-maize output (FIQI)	Derived [f(F,J)]	0.0259	1.106	0.123			
O	Non-maize output (FIQI)	Derived [f(G,J)]	0.0328	1.359	$0.080^{b}$			

Notes: Results in **bold** are statistically significant at the 10% level. p-values based on 500 bootstrap replications. <sup>a</sup>Not statistically different from zero at the 10% level if estimate directly with CRE Tobit (APE=0.000432, p=0.260). <sup>b</sup>Not statistically different from zero at the 10% level if estimate directly with CRE Tobit (APE=0.00566, p=0.386) or if derive from directly estimated non-maize area planted (CRE Tobit) and non-maize output/ha (APE=0.0226, p=0.152).

What could explain the positive maize area effect but negative maize yield effect? The negative maize yield effect could be because additional land brought under maize may be of poorer quality and/or in areas less suitable for maize production. Even with the same intensity of fertilizer use, maize yields on such land would be expected to be lower. The result could also be due to constraints on other inputs. For example, the household may not have the necessary cash or credit to buy improved seed for the additional maize area; family time or financial resources to hire in labor to successfully weed and otherwise manage the additional acreage of maize could be lacking, etc.

The regression results do not suggest that the additional area planted to maize comes at the expense of area planted to non-maize crops. The APE of the expected maize price on total area planted is positive and significant (Table 7, row C) but the APE on non-maize area planted is not statistically different from zero (rows F and G; also see note (a)). Other factors constant, total and non-maize output (per hectare and overall) do not significantly change when the expected maize price increases (rows H, J, K, N, and O; also see note (b)).

## **5.3.** Marginal Effects of Past FRA Effective Prices and Purchases on Smallholder Behavior

The expected maize price is not statistically significant in the fertilizer use on maize, non-maize area planted, total and non-maize output/ha, and total, maize, and non-maize output equations, so the marginal effects of past FRA district-level purchases and of the lagged effective FRA price are not statistically different from zero. However, changes in these FRA policies do affect total area planted, maize area planted, and maize yield through their impacts on the expected maize price. The associated APEs and AEs are summarized in Table 8. The standard errors are large due to the multiple first stage regressions and bootstrapping to obtain valid standard errors. However, many of the p-values are less than 0.20 suggesting weak evidence of statistically significant FRA marginal effects.

As expected based on the results in the previous two sub-sections, increases in past FRA district-level purchases and in the lagged effective FRA price have weak positive effects on total and maize area planted. In absolute terms, the marginal increase in total and maize area planted for households cultivating two or more hectares is roughly double that of those cultivating less land (Table 8). This suggests that relatively larger farms are more responsive to changes in FRA policies, at least from an (absolute) area expansion perspective.

For maize yield, there is some evidence of significant negative impacts of increases in past FRA district-level purchases on maize yields among households cultivating less than two hectares. The marginal effects of the lagged effective FRA price are also negative and marginally significant for this group of smallholders and for those in areas that are poorly suited for low-input rainfed maize production (table 8). The latter finding is consistent with the hypothesis that an increase in the expected maize price (due in part to increases in past FRA purchases and effective prices) encourages the expansion of maize into areas that are not agro-ecologically suitable for it.

Table 8. APEs and AES of Total and Maize Area Planted and Maize Yield W.R.T. Past

FRA Policies, 2006/07 Agricultural Year

FRA Folicies, 2000/								
FRA distlevel purchases Outcome variable, ('000 MT, t-1 to t-5) (Log) effective FRA maize price								
Outcome variable,		`	<u> </u>					
population	APE	p-val.	AE	p-val.	APE <sup>a</sup>	p-val.	AE	p-val.
Total area planted (ha)								
All HHs	0.00868	0.166	0.0805	0.182	0.115	0.215	0.104	0.213
Farm size category:								
< 2 ha cultivated	0.00699	0.160	0.0905	0.176	0.0920	0.322	0.120	0.247
>= 2 ha cultivated	0.0135	0.186	0.0530	0.221	0.183	0.231	0.0579	0.179
Suitability of area for	low input i	managem	ent, rainfed i	maize:				
High/moderate	0.0110	0.154	0.0996	0.189	0.122	0.349	0.0994	0.408
Marginal/unsuitable	0.00565	0.233	0.0558	0.187	0.106	0.257	0.109	0.155
Maize area planted (ha)	- Fixed e	ffects						
All HHs	0.00518	0.129	0.0913	0.138	0.0689	0.136	0.121	0.069
Farm size category:								
< 2 ha cultivated	0.00417	0.123	0.103	0.132	0.0549	0.103	0.137	0.070
>= 2 ha cultivated	0.00809	0.151	0.0633	0.172	0.109	0.317	0.0825	0.181
Suitability of area for	low input i	managem	ent, rainfed i	maize:				
High/moderate	0.00658	0.116	0.110	0.142	0.0731	0.133	0.118	0.069
Marginal/unsuitable	0.00337	0.205	0.0665	0.151	0.0636	0.339	0.124	0.111
Maize area planted (ha)								
All HHs	0.00424	0.162	0.0734	0.179	0.0545	0.220	0.0865	0.117
Farm size category:								
< 2 ha cultivated	0.00316	0.147	0.0809	0.170	0.0394	0.163	0.0957	0.097
>= 2 ha cultivated	0.00733	0.190	0.0559	0.227	0.0977	0.388	0.0647	0.442
Suitability of area for								
High/moderate	0.00545	0.154	0.0886	0.186	0.0596	0.250	0.0861	0.154
Marginal/unsuitable	0.00268	0.220	0.0527	0.188	0.0479	0.435	0.0870	0.147
Maize yield (kg/ha)								
All HHs	-8.85	0.989	-0.139	0.894	-113.5	1.000	-0.133	1.000
Farm size category:		0.00	31223				31.22	
< 2 ha cultivated	-7.08	0.136	-0.114	0.215	-87.71	0.056	-0.110	0.102
>= 2 ha cultivated	-13.03	0.995	-0.196	0.953	-174.2	1.000	-0.189	1.000
Suitability of area for					1,2	2.000	0.107	
High/moderate	-11.10	0.943	-0.184	0.775	-121.1	1.000	-0.132	1.000
Marginal/unsuitable	-5.80	0.997	-0.0761	0.965	-103.1	0.082	-0.136	0.144
Marginal/ullsuitable								

Notes: p-values based on 500 bootstrap replications. <sup>a</sup> APE is with respect to log effective FRA price. APE divided by 100 is % change in outcome given a 1% increase in effective FRA price.

#### 6. CONCLUSIONS AND POLICY IMPLICATIONS

Over the last decade, there has been a resurgence in direct government participation in agricultural input and output marketing in ESA. After being scaled back or eliminated during the market reforms of the 1980s and 1990s, fertilizer subsidies, parastatal GMBs, and strategic grain reserves (SGRs) are once again en vogue in the region (Jayne and Jones 1997; Jayne et al. 2002; Jayne, Chapoto, and Govereh 2007). Private grain trade remains legal in most cases, thus an increasingly important feature of grain markets in ESA is dual marketing channels: government and private sector. However, little is known about how the reemergence of GMBs/SGRs is affecting input use and crop production by smallholder farmers in the region.

In Zambia, the FRA, a SGR/GMB, has become a major player in the domestic maize market in recent years. The FRA buys maize from smallholders at a pan-territorial price that typically exceeds market prices. In this paper, we use nationally-representative panel survey data covering more than 5,000 Zambian smallholder households in the 1999/2000, 2002/2003, and 2006/2007 agricultural years to estimate the marginal effects of FRA district-level maize purchases and the effective FRA maize price on household fertilizer use on maize, and total, maize, and non-maize area planted, crop output per hectare, and crop output.

The empirical models are estimated in two stages. In the first stage, we estimate the marginal effects of past FRA maize purchase and pricing policies on the mean and variance of (log) effective maize market and FRA prices at the next harvest and on the probability that a household will sell to the Agency at the next harvest. Predicted values from the first stage regressions are used to construct an expected maize price for each household and agricultural year in the panel survey. The expected maize price is then included as an explanatory variable in the second stage fertilizer demand and output supply regressions.

The empirical results point to three key findings. The empirical results point to three key findings. First, increases in past FRA maize purchases and effective prices are associated with a higher expected maize price at the next harvest. A 1% increase in past FRA district-level purchases increases households' expected maize price in 2006/07 by 0.10%. The magnitude of this elasticity is larger for households that cultivate two or more hectares of land or are located in areas that are well suited for low input rainfed maize production. The elasticity of the expected maize price with respect to the lagged effective FRA price is also positive and statistically significant for these households.

Second, the fertilizer demand and output supply regression results suggest that an increase in the expected maize price has a positive effect on total and maize area planted, a negative effect on maize yields, and no statistically significant effect on the intensity of fertilizer use on maize (kg/ha), non-maize area planted, total and non-maize output per hectare, and total, maize, and non-maize output. The marginal effects of the expected maize price on maize area planted and maize yield offset each other, the result being no significant change in maize quantity harvested. The additional area brought under maize production in response to an increase in the expected maize price may be of poorer quality and/or ill-suited for maize production, hence the decline in maize yields even with the same intensity of fertilizer use.

Third, results show that for 2006/07, increases in past FRA district-level maize purchases and in the lagged effective FRA price are associated with increases in total and maize area planted, a decrease in maize yield, and no significant change in maize quantity harvested, total crop output, or the other household-level outcome variables examined. However, FRA

impacts on smallholder behavior via general equilibrium effects on maize, fertilizer, or other prices are not captured in this paper. Furthermore, the FRA continued to ramp up its involvement in maize marketing after 2006/07, the most recent year of the panel. Smallholders may have become more responsive to FRA activities as the Agency became a more permanent fixture of the maize marketing landscape.

Part of the FRA's strategic mission is to ensure national food security and income (FRA n.d.). Although we do not estimate the effects of past FRA behavior on food security or incomes *per se*, the finding of no statistically significant impact of FRA activities on maize or total crop output does not support the conclusion of improvement in food security or incomes.

A large proportion of Zambia's public resources are devoted to the FRA. For example, in the 2010/11 marketing season, spending on the FRA amounted to approximately 2% of the nation's GDP (IMF 2011). Between 2004 and 2011, GRZ allocated an average of 25% of its annual Poverty Reduction Programmes budget to the FRA. The failure of FRA policies to increase smallholder maize and total crop output, and the fact that it is mainly relatively well off smallholders who benefit from the high FRA purchase price, calls into question the efficacy of maize price supports as a poverty reduction tool in Zambia. Indeed, at approximately 80%, rural poverty rates remain stubbornly high and there has been no substantive reduction in rural poverty since the FRA was established in 1996 (CSO 2010).

GRZ and donor funds devoted to the FRA come at a high opportunity cost. Limiting FRA involvement in the maize market to securing the national strategic food reserve, its original mandate, would free up resources that could be invested in the known drivers of pro-poor agricultural growth such as agricultural research, development and extension, rural infrastructure, and education (Fan, Gulati, and Thorat 2008; World Bank 2008).

#### **APPENDICES**

#### APPENDIX A: SUMMARY STATISTICS

Table A.1. Summary Statistics for Continuous Explanatory Variables

					Percentile				
Explanatory variables	(A)	(B)	Mean	Std. dev.	10 <sup>th</sup>	25 <sup>th</sup>	50 <sup>th</sup>	75 <sup>th</sup>	90 <sup>th</sup>
FRA maize purchases in district ('000 MT, t-1)	X		1.911	4.88	0	0	0	0.33	9.89
Effective FRA maize price (ZMK/kg, t-1)	X		495	219	219	249	611	700	733
Maize producer price (ZMK/kg, t-1)	X		447	186	219	249	498	609	661
Regional wholesale maize prices (pre-planting):									
October (ZMK/kg)	X		447	277	130	146	465	657	856
September (ZMK/kg)	X		426	266	140	180	401	587	793
August (ZMK/kg)	X		433	259	150	173	430	668	771
July (ZMK/kg)	X		422	240	156	178	390	550	742
June (ZMK/kg)	X		412	187	188	238	424	521	710
May (ZMK/kg)	X		365	122	218	263	379	439	530
April (ZMK/kg)	X		524	182	297	361	526	694	789
March (ZMK/kg)	X		697	295	352	416	750	847	1,186
February (ZMK/kg)	X		760	342	364	408	877	1,033	1,161
January (ZMK/kg)	X		727	294	363	446	832	956	1,157
December (ZMK/kg)	X		660	251	343	422	639	883	1,006
November (ZMK/kg)	X		597	264	299	347	555	849	890
Effective market price of fertilizer (ZMK/kg)	X	X	1,442	660	720	780	1,476	1,960	2,400
Kilometers from center of SEA to nearest (as of 2000):									
District town	X	X	34.5	22.6	9.8	16.0	28.9	47.0	70.2
Tarred/main road	X	X	25.5	35.7	0.9	4.0	12.0	29.2	69.8
Feeder road	X	X	3.3	3.3	0.6	1.1	2.4	4.3	7.7
Age of household head in 2001	X		46.1	15.4	28.0	33.0	44.0	58.0	69.0
Age of household head (time-varying)		X	48.3	15.3	30.0	36.0	46.0	60.0	70.0
Landholding size (ha, cultivated+fallow land)	X	$X^{a}$	2.1	2.6	0.5	0.8	1.5	2.5	4.0
Full-time equivalent # of prime-age (15-59) adults	X	X	2.8	1.7	1.0	2.0	2.2	3.9	5.0

Table A.1 (Cont'd)

					Percentile					
				Std.	415	415	415	415	4h	
Explanatory variables	(A)	(B)	Mean	dev.	10 <sup>th</sup>	25 <sup>th</sup>	50 <sup>th</sup>	75 <sup>th</sup>	90 <sup>th</sup>	
Expected growing season rainfall (mm, moving average of past 9 years)	X	X	896	184	660	757	877	1,059	1,167	
Expected moisture stress (20-day periods with <40mm rain, moving average of past 9 years)	X	X	1.8	1.0	0.6	0.9	1.9	2.4	3.1	
Rainfall variability (moving coefficient of variation of past 9 years, %)	X		22.5	6.9	13.7	17.5	21.8	26.6	30.7	
Growing season rainfall (mm)		$X^{b}$	969	254	639	788	943	1,140	1,258	
Moisture stress (20-day periods with <40mm rain)		$X^{b}$	1.4	1.4	0	0	1.0	2.0	4.0	
Groundnut price (ZMK/kg, t-1, prov. median)		X	1,139	355	769	900	1,053	1,400	1,667	
Mixed bean price (ZMK/kg, t-1, prov. median)		X	1,112	302	889	889	992	1,333	1,572	
Sweet potato price (ZMK/kg, t-1, prov. median)		X	214	102	100	145	193	232	386	
Cattle price (ZMK/head, provincial median)		X	519,656	301,918	160,000	230,000	589,388	789,138	953,272	
Value of plows and harrows ('00,000 ZMK)		X	0.649	2.753	0	0	0	0	2.000	
% of votes won by MMD in last pres. election <sup>c</sup>			52.2	23.9	16.8	33.5	54.7	72.5	83.6	
Pct. pt. spread between MMD and leading opposition party in last pres. election <sup>c</sup>			41.8	23.6	11.6	21.2	41.1	61.4	74.4	

Notes: Variables with X in column (A) included in auxiliary regressions for expected maize price. Variables with X in column (B) included in fertilizer demand and output supply equations. N=16,566. <sup>a</sup>Excluded from area planted equations. <sup>b</sup>Included in output/ha equations but not area planted equations. <sup>c</sup>Candidate instrumental variable in government-subsidized fertilizer reduced form Tobit. Sources: CSO/MACO/FSRP 2001, 2004, and 2008 Supplemental Surveys.

Table A.2. Summary Statistics for Binary Explanatory Variables

			Share of households (%)			
Explanatory variables	(A)	(B)	1999/2000	2002/2003	2006/2007	
HH owns radio (=1)	X		34.2	47.0	57.6	
HH owns cell phone (=1)	X		0	0	21.1	
HH does not own but has access to cell phone (=1)	X		0	0	45.7	
HH owns bicycle (=1)	X		41.7	46.0	55.6	
HH owns motorcycle (=1)	X		0.5	1.1	0.9	
HH owns car, pick-up, van, truck/lorry, or tractor-trailer (=1)	X		1.1	0.8	1.1	
HH owns ox-cart (=1)	X		5.1	7.1	8.3	
HH owns a water pump (=1)		X	0.7	0.7	0.8	
Lower primary (grades 1-4) (=1)	X	X	23.0	25.6	27.0	
Upper primary (grades 5-7) (=1)	X	X	36.2	34.0	34.5	
Secondary (grades 8-12) (=1)	X	X	19.3	18.3	19.4	
Post-secondary education (=1)	X	X	2.5	2.7	1.8	
Female-headed with non-resident husband (=1)	X	X	0.6	0.9	0.4	
Female-headed with no husband (=1)	X	X	20.8	21.8	23.6	
Disease-related PA male head/spouse death in last 3-4 years (=1)		X	1.2	1.8	0.1	
Disease-related PA female head/spouse death in last 3-4 years (=1)		X	1.0	2.1	1.3	
Disease-related PA male non-head/spouse death in last 3-4 years (=1)		X	3.3	2.9	4.4	
Disease-related PA female non-head/spouse death in last 3-4 years (=1)		X	5.0	3.6	3.7	
SEA is suitable for low input management maize production (=1)	X	X	55.3	56.0	56.4	
Agro-ecological region I (low rainfall, less than 800 mm) (=1)	X	X	5.6	5.1	5.4	
Agro-ecological region IIa (moderate rainfall, 800-1000 mm, clay soils) (=1)	X	X	40.4	42.1	44.1	
Agro-ecological region IIb (moderate rainfall, 800-1000 mm, sandy soils) (=1)	X	X	9.6	9.5	8.6	
Agro-ecological region III (high rainfall, over 1000 mm) (=1)	X	X	44.4	43.3	41.9	
MMD won the constituency in the last presidential election (=1) <sup>a</sup>			92.8	44.0	59.1	
Total number of households in sample			6,922	5,358	4,286	

Notes: Variables with X in column (A) included in auxiliary regressions for expected maize price. Variables with X in column (B) included in fertilizer demand and output supply equations. <sup>a</sup>Candidate instrumental variable in government-subsidized fertilizer reduced form Tobit. Sources: CSO/MACO/FSRP 2001, 2004, and 2008 Supplemental Surveys.

Table A.3. Summary Statistics for Dependent Variables

							Percentile				
Dependent variable	Ag. year	Obs.	Mean	Std. dev.	10 <sup>th</sup>	25 <sup>th</sup>	50 <sup>th</sup>	75 <sup>th</sup>	90 <sup>th</sup>		
Auxiliary regressions for expected maiz								_			
Effective maize market price	All	4,475	427.899	237.007	179.105	243.478	375.000	560.462	695.652		
Effective FRA maize price	2002/03	48	530.021	63.958	420.000	488.000	537.500	596.000	600.000		
	2006/07	482	687.684	55.852	640.000	660.000	690.000	720.000	745.000		
HH sold maize to FRA (=1)	2002/03	5,358	0.00761								
	2006/07	4,286	0.0971								
Reduced form Tobit for kg of gov't-subsidized fertilizer acquired by the HH											
HH acquired gov't fertilizer (=1)	All	16,566	0.099								
Kg of gov't fertilizer acquired	All	16,566	29.294	143.258	0	0	0	0	0		
Factor demand and output supply equations											
HH used fertilizer on maize (=1)	All	13,095	0.322								
Fertilizer use on maize (kg/ha)	All	13,095	85.113	176.275	0	0	0	114.286	327.869		
Total area planted (ha)	All	16,566	1.520	1.514	0.375	0.650	1.125	1.990	3.000		
HH planted maize (=1)	All	16,566	0.792								
Maize area planted (ha)	All	16,566	0.746	1.085	0	0.155	0.500	1.000	1.620		
HH planted non-maize crop(s) (=1)	All	16,566	0.794								
Non-maize area planted (ha)	All	16,566	0.774	0.949	0	0.180	0.500	1.013	1.820		
Total output/ha (FIQI/ha)	All	16,148	20.994	18.781	5.693	9.903	16.598	26.476	39.549		
Maize yield (kg/ha)	All	13,092	1568.644	1208.216	402.000	744.444	1240.741	2010.000	3130.328		
Non-maize output/ha (FIQI/ha)	All	13,087	24.316	26.741	4.763	9.511	17.329	30.025	48.091		
Total output (FIQI)	All	16,148	31.044	47.925	4.319	9.265	19.404	37.019	64.550		
Maize output (kg)	All	13,092	1504.640	2934.940	172.500	345.000	804.000	1608.000	3162.500		
Non-maize output (FIQI)	All	13,087	21.328	31.929	2.001	5.176	12.794	27.232	48.023		

Notes: "All" refers to all three agricultural years (1999/2000, 2002/03, and 2006/07). Obs. is the number of unweighted observations. 16,566 is the total number of observations in the SS panel dataset (6,922 for SS01; 5,358 for SS04; 4,286 for SS08).

Sources: CSO/MACO/FSRP 2001, 2004, and 2008 Supplemental Surveys.

## APPENDIX B: FULL REGRESSION RESULTS

Table B.1. Results from Log Effective Market and FRA Maize Price and Log Squared Residuals Regressions

Table B.1. Results from Log Eff			<del></del>				nt variable						
	(A) L	og effe	ctive				(C) Lo	g effec	etive				
	maize	market	price	(B) L	og squ	ared	FRA 1	naize p	rice	(D) L	og squa	red	
	at	harves	t	residua	als fron	n (A)	at	harvest	ţ	residua	residuals from (C)		
Explanatory variables	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	
FRA dist. purch. ('000MT, t-1)	6.67E-3	**	0.024	-0.149	***	0.007	-2.06E-3		0.373	0.0153		0.825	
FRA district purchases, sqd.				4.85E-3	**	0.033							
Log effective FRA price (t-1)	-0.0221		0.811	1.116		0.101	0.341	***	0.000	-4.021	*	0.074	
Log eff. FRA price×1999/2000	0.417	*	0.056	0.0469		0.989							
Log maize producer price (t-1)	-0.0221		0.803	-14.434		0.539	1.68E-3		0.968	-1.499		0.337	
Log maize producer price, sqd.				1.0156		0.580							
Log regional wholesale maize pric	e (pre-plan	ting):											
October	0.127		0.365	1.058		0.257							
September	0.0354		0.809	-1.850	*	0.063							
August	0.0854		0.418	-0.884		0.265							
July	0.0637		0.707	-2.596	**	0.034							
June	-0.236		0.187	3.127	**	0.010							
May	-0.0318		0.675	-0.790		0.200							
April	-0.155		0.446	2.306	*	0.055							
March	-0.119		0.546	1.845		0.173							
February	0.0270		0.930	-2.016		0.345							
January	0.0419		0.904	0.886		0.726							
December	-0.723	***	0.005	1.658		0.287							
November	0.377	***	0.005	-2.422	**	0.029							
Log eff. market fertilizer price	-0.0163		0.754	-0.521		0.168	0.0250		0.451	-2.029		0.107	
HH owns radio (=1)	0.0289	*	0.079	0.0435		0.729	0.0122		0.137	0.572		0.174	
HH owns cell phone (=1)	3.78E-3		0.888	0.195		0.425	7.88E-4		0.925	-7.46E-3		0.984	
HH access to cell phone (=1)	3.97E-3		0.861	0.0948		0.682	-1.20E-3		0.884	-0.542		0.139	
HH owns bicycle (=1)	0.0220		0.165	-0.120		0.345	-0.0111		0.211	0.0528		0.863	

Table B.1. (Cont'd)

					]	Dependent	t variable					
	(A) Lo	g effec	ctive				(C) Lo	g effec	ctive			
	maize r			(B) L	og squa	red		naize p		(D) Lo	og squa	ared
	at ]	harvest	t	residua	als from	ı (A)	at	harvest	t	residua	ls fron	ı (C)
Explanatory variables	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.
HH owns motorcycle (=1)	5.82E-3		0.922	0.639		0.117	0.0404		0.381	-0.855		0.466
HH owns car/truck (=1)	0.0300		0.647	0.401		0.353	0.0135		0.402	-0.753		0.143
HH owns ox-cart (=1)	-3.86E-3		0.891	0.393	*	0.075	-1.38E-3		0.880	-1.15E-3		0.847
Kilometers from center of SEA	to nearest (a	s of 20	00):									
District town	8.00E-5		0.840	4.54E-3	*	0.060	2.56E-4		0.239	8.64E-3		0.287
Tarred/main road	-5.07E-4		0.216	-4.95E-4		0.829	5.88E-5		0.535	-1.81E-3		0.634
Feeder road	-5.90E-3	**	0.036	-5.70E-3		0.633	1.07E-3		0.392	-0.0293		0.618
HH head age in 2001	-5.58E-4		0.141	-0.0275		0.106	3.21E-5		0.893	-0.0107		0.293
HH head age, sqd.				1.91E-4		0.259						
Highest level of education com	pleted by HH	I head	(base is no	formal edu	cation)	:						
Lower primary (gr1-4) (=1)	0.0371		0.197	0.221		0.364	0.0488	***	0.009	-0.503		0.512
Upper primary (gr5-7) (=1)	0.0548	*	0.052	0.421		0.106	0.0332		0.103	-0.594		0.415
Secondary (gr8-12) (=1)	0.0350		0.362	0.385		0.180	0.0567	***	0.007	-0.451		0.563
Post-secondary (=1)	0.102	*	0.077	0.768		0.139	0.0148		0.531	-2.240	*	0.063
Gender and residence status of	f HH head (no	on-resi	dent if <6	months; ba	se is re	sident mal	'(e):					
Female, non-res. husb. (=1)	-0.108		0.129	0.608		0.285	-0.0642	**	0.011	0.760		0.628
Female, no husband (=1)	9.54E-04		0.973	0.240		0.409	0.0383	***	0.007	0.354		0.630
Landholding size (ha)	-2.94E-4		0.901	-0.0140		0.476	5.76E-4		0.756	0.0118		0.883
Landholding size, sqd.	-1.06E-5		0.302	1.78E-5		0.837	-1.21E-5		0.731	-6.39E-4		0.691
FTE PA adults	-2.94E-4		0.952	-6.35E-3		0.858	4.90E-4		0.857	-0.0661		0.529
Expected rainfall ('00 mm)	0.229		0.160	-0.0379		0.861	-1.07E-4		0.995	-0.891		0.136
Expected rainfall, sqd.	-0.0145	*	0.083									

Table B.1. (Cont'd)

	Dependent variable											
	(A) Lo	g effe	ctive				(C) Lo	g effec	etive			
	maize n	narket	price	(B) L	og squa	ared	FRA n	naize p	rice	(D) L	og squ	ared
	at l	narves	t	residuals from (A)			at l	narvest	t	residuals from (C)-		
Explanatory variables	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.
Exp. moisture stress	0.0770	*	0.075	0.668	*	0.068	-0.0128		0.716	-1.019		0.381
Rain. variability (%)	-5.38E-4		0.854	-0.0349		0.153	-1.88E-3		0.180	0.0563		0.195
SEA suitable for low	-1.69E-3		0.923	-0.159	*	0.057	9.71E-3	*	0.069	0.609	**	0.034
input mgt maize (=1)												
Agricultural year (base	e is 2006/20	007):										
1999/2000 (=1)	-3.499	***	0.003	-3.285		0.870						
2002/2003 (=1)	-0.400	***	0.002	1.138		0.180	-0.224	***	0.000	0.699		0.468
Constant	2.069		0.661	45.193		0.693	4.205	***	0.000	9.101		0.674
District dummies	Yes			Yes			No			No		
Prov., AER dummies	No			No			Yes			Yes		
Time averages (CRE)	Yes			Yes			Yes			Yes		
Observations	4,405			4,405			492			492		
R-squared	0.694			0.079			0.608			0.130		
Overall model F-stat.	82.94	***	0.000	7.62	***	0.000	21.34	***	0.000	3.88	***	0.000
Unbiased prediction F	0.00		1.000	0.00		1.000	0.00		1.000	0.00		1.000
Theil inequal. coef.	0.800						0.541					

Notes: See Tables A.1 and A.2 in Appendix A for more complete explanatory variable descriptions. FTE PA adults = full time equivalent prime age (15-59 years old) adults. AER=agro-ecological region. \*\*\*, \*\*, \* significant at the 1%, 5%, and 10% levels. Complex survey weights and Huber-White robust variance matrix estimator used in computation of standard errors. The analytical sample for the effective maize market price regression (column A) excludes the bottom and top one percent of observations in each panel survey year. For the effective FRA price regression (column B), the bottom one percent of observations in each year are excluded.

Table B.2. CRE Probit Results: HH Sold Maize to FRA at Harvest =1; =0 Otherwise

Table B.2. CRE Probit Results: HH Sold Maize to FRA at Ha	rvest =1; =0		rwise
Explanatory variables	APE	Sig.	p-val.
FRA district-level purchases ('000 MT, t-1)	0.00303		0.427
FRA district-level purchases ('000 MT, t-2)	0.0146		0.158
FRA district-level purchases ('000 MT, t-3)	-0.00670		0.703
FRA district-level purchases ('000 MT, t-4)	0.00784		0.764
FRA district-level purchases ('000 MT, t-5)	0.0128		0.214
Log effective FRA price (t-1)	0.279	***	0.003
Log maize producer price (t-1)	-0.180	***	0.005
Log effective market fertilizer price	-0.0721		0.168
HH owns radio (=1)	0.0146		0.150
HH owns cell phone (=1)	0.0173		0.164
HH does not own but has access to cell phone (=1)	0.0145		0.126
HH owns bicycle (=1)	0.0245	**	0.029
HH owns car/truck (=1)	0.0382		0.440
HH owns ox-cart (=1)	0.0282		0.188
Km from center of SEA to nearest district town (as of 2000)	0.000415		0.187
Km from center of SEA to nearest tarred/main road (as of 2000)	0.000104		0.640
Km from center of SEA to nearest feeder road (as of 2000)	-0.00561	***	0.002
HH head age in 2001	-0.000122		0.631
Highest level of education completed by HH head (base is no form		):	
Lower primary (grades 1-4) (=1)	-0.0187	,	0.274
Upper primary (grades 5-7) (=1)	-0.0163		0.353
Secondary (grades 8-12) (=1)	-0.00323		0.883
Post-secondary (=1)	-0.0201		0.500
	0.000		0.00
Female HH head (=1)	-0.0208		0.193
Landholding size (ha) <sup>a</sup>	0.0107	***	0.000
Full-time equivalent prime-age adults (ages 15-59)	0.00209		0.434
Expected growing season rainfall ('00 mm) <sup>b</sup>	0.00678		0.734
Expected moisture stress (# of 20-day periods)	-0.0260		0.502
Rainfall variability (%)	0.00436	*	0.060
SEA suitable for low input mgt rainfed maize production (=1)	0.00514		0.641
2002/2003 agricultural year (=1) (2006/2007 is base year)	-0.0384		0.170
Province and agro-ecological region dummies	Yes		
Time averages (CRE)	Yes		
Time averages (CILL)	105		
Observations	5,441		
Number of observations with dependent variable =1	503		
Overall model F-stat.	15.49	***	0.000
Joint significance of lagged FRA district-level purchases (F-stat.)	3.77	***	0.003
Long-run effect of FRA district-level purchases ('000 MT)	0.0315	*	0.058
Notes: *** * * significant at the 1% 5% and 10% levels Com			

Notes: \*\*\*, \*\*, \* significant at the 1%, 5%, and 10% levels. Complex survey weights and Huber-White robust variance matrix estimator used in computation of standard errors. <sup>a</sup>APE includes effect of squared and cubed terms. <sup>b</sup>APE includes effect of squared term.

Table B.3. Fertilizer Use on Maize (kg/ha) Regression Results

Tube Bio. Terminor obe on Mance (ng/ma) Reg	Fertilizer use on maize (kg/ha)										
Estimator:	Fixe			CRI		it					
Explanatory variables	Coef.	Sig.	p-value	APE	Sig.	p-value					
Expected effective maize price (ZMK/kg)	0.000230		0.995	0.0102		0.817					
Kg of government-subsidized fertilizer	0.208	***	0.000	0.106	***	0.000					
Tobit residuals from gov't fertilizer reduced form	-0.0959	***	0.000	-0.113	***	0.000					
Groundnut price (ZMK/kg, t-1)	-0.00560		0.750	0.00820		0.526					
Mixed bean price (ZMK/kg, t-1)	0.0114		0.653	0.00778		0.692					
Sweet potato price (ZMK/kg, t-1)	0.0309		0.325	0.0512	*	0.059					
Effective market fertilizer price (ZMK/kg)	0.00768		0.346	0.00312		0.732					
Cattle price (ZMK/head)	0.0000846	**	0.012	0.0000471	*	0.072					
Landholding size (ha)	-8.839	***	0.000	$-4.285^{a}$	***	0.000					
Landholding size, sqd.	0.0788		0.202								
Plows and harrows ('00,000 ZMK)	2.324	**	0.011	$2.190^{a}$	***	0.004					
Plows and harrows, sqd.	-0.0288	*	0.064								
HH owns a water pump (=1)	53.914	**	0.021	35.397	*	0.069					
Full-time equivalent prime-age (15-59) adults	1.831		0.263	1.834		0.248					
Age of HH head	-0.310		0.303	-0.274		0.367					
Highest level of education completed by HH head	(base is no fo	ormal (	education,	) <i>:</i>							
Lower primary (grades 1-4) (=1)	6.292		0.236	9.977	*	0.098					
Upper primary (grades 5-7) (=1)	1.314		0.853	3.931		0.529					
Secondary (grades 8-12) (=1)	1.034		0.911	3.739		0.663					
Post-secondary (=1)	21.595		0.376	25.035		0.168					
Gender and residence status of HH head (non-res	ident if <6 m	onths;	base is re	sident male):							
Female, non-resident husband (=1)	16.682		0.535	4.513		0.817					
Female, no husband (=1)	4.036		0.656	-0.432		0.958					
Disease-related prime-age death in last 3-4 years:	•										
Male head/spouse (=1)	3.002		0.903	11.328		0.546					
Female head/spouse (=1)	-32.708	**	0.015	-12.573		0.235					
Male non-head/spouse (=1)	-10.211		0.275	-5.874		0.450					
Female non-head/spouse (=1)	-1.714		0.829	-7.717		0.232					

Table B.3. (Cont'd)

	Fertilizer use on maize (kg/ha)										
Estimator:	Fix	ed effe	ects	C	RE To	bit					
Explanatory variables	Coef.	Sig.	p-value	APE	Sig.	p-value					
Km from center of SEA to nearest (as of 2000):											
District town				-0.577	***	0.000					
Tarred/main road				0.0979		0.263					
Feeder road				-0.921		0.467					
Expected rainfall ('00 mm)	-0.858		0.881	-2.506		0.659					
Expected moisture stress (#20-day periods)	-15.520	**	0.044	-4.894		0.585					
SEA suitable for low input management maize (=1)				0.696		0.908					
Agricultural year (base is 2006/2007):											
1999/2000 (=1)	85.532	***	0.004	71.691	*	0.056					
2002/2003 (=1)	40.287	***	0.003	32.684	*	0.022					
Constant	100.052		0.196								
Province and agro-region dummies	N/A			Yes							
Time averages (CRE)	N/A			Yes							
Observations	11,953			11,953							
Within R-squared (pseudo R-squared for Tobit)	0.087			0.054							
Overall model F-stat.	9.30	***	0.000	26.56	***	0.000					
Hansen J test for over-identifying restrictions	2.086		0.352								

Notes: \*\*\*, \*\*, \* significant at the 1%, 5%, and 10% levels. p-values from standard errors based on 500 bootstrap replications to account for generated regressor (Tobit residuals from government fertilizer reduced form). <sup>a</sup>APE includes effect of squared term.

Table B.4. Total and Maize Area Planted (ha) Regression Results

Table <b>b.4.</b> Total and Maize Area Planted (na) Regre	Total area		ed (ha)	Maize area planted (ha)					
Estimator:			, ,	Fixe			CR	E Tobit	
Explanatory variables	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	APE	Sig.	p-val.
Expected effective maize price (ZMK/kg)	0.00148	*	0.063	8.81E-4	**	0.044	6.26E-4	*	0.063
Kg of government-subsidized fertilizer	0.00147	***	0.000	0.00122	***	0.000	8.52E-4	***	0.000
Tobit residuals from gov't fertilizer reduced form	Excluded		0.559	Excluded		0.197	Excluded		0.150
Groundnut price (ZMK/kg, t-1)	-6.99E-4	***	0.000	-4.41E-4	***	0.000	-2.86E-4	***	0.000
Mixed bean price (ZMK/kg, t-1)	-1.16E-4		0.554	5.10E-5		0.696	3.43E-6		0.975
Sweet potato price (ZMK/kg, t-1)	2.83E-4		0.271	-2.88E-4	**	0.035	-2.59E-4	**	0.022
Effective market fertilizer price (ZMK/kg)	1.76E-4	**	0.026	3.64E-5		0.490	1.82E-5		0.650
Cattle price (ZMK/head)	0.000		0.885	0.000		0.422	0.000		0.403
Plows and harrows ('00,000 ZMK)	0.101	***	0.000	0.0700	***	0.000	$0.0455^{a}$	***	0.000
Plows and harrows, sqd.	-5.89E-4	*	0.071	-3.21E-4		0.277			
HH owns a water pump (=1)	0.452		0.202	0.0513		0.795	0.0300		0.825
Full-time equivalent prime-age (15-59) adults	0.0601	**	0.034	0.0361	*	0.076	$0.0370^{a}$	***	0.000
Full-time equivalent prime-age adults, sqd.	0.00301		0.399	0.00120		0.641			
Age of HH head	0.0555	***	0.000	0.0275	***	0.000	$0.00545^{a}$	***	0.000
Age of HH head, sqd.	-4.70E-4	***	0.000	-2.29E-4	***	0.000			
Highest level of education completed by HH head (base	is no formal e	educatio	on):						
Lower primary (grades 1-4) (=1)	0.0366		0.385	-0.00447		0.852	-0.00122		0.951
Upper primary (grades 5-7) (=1)	0.0439		0.417	-0.00357		0.907	0.0105		0.674
Secondary (grades 8-12) (=1)	0.115	*	0.100	0.0210		0.623	0.0250		0.467
Post-secondary (=1)	0.138		0.342	-0.0462		0.646	-0.0212		0.785
Gender and residence status of HH head (non-resident	if <6 months; i	base is	resident m	ale):					
Female, non-resident husband (=1)	0.144		0.223	0.148	**	0.037	0.178	***	0.009
Female, no husband (=1)	-0.306	***	0.000	-0.160	***	0.000	-0.129	***	0.000

Table B.4. (Cont'd)

Table B.4. (Cont u)	Total ar	ea plante	ed (ha)		M	aize area p	lanted (ha)		
Estimator:	Fix	ed effec	ets	Fixe	ed effects-		CR	E Tobit	;
Explanatory variables	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	APE	Sig.	p-val.
Disease-related prime-age death in last 3-4 years:									
Male head/spouse (=1)	0.0866		0.273	0.0986	*	0.060	0.0759		0.132
Female head/spouse (=1)	-0.0256		0.775	0.0362		0.460	0.0214		0.597
Male non-head/spouse (=1)	-0.0106		0.846	-1.92E-4		0.996	-0.00628		0.844
Female non-head/spouse (=1)	-0.0388		0.483	0.00855		0.801	0.0132		0.623
Km from center of SEA to nearest (as of 2000):									
District town							0.00113	*	0.070
Tarred/main road							-8.25E-4	***	0.002
Feeder road							0.00120		0.812
Expected rainfall ('00 mm)	1.102	***	0.000	0.0290		0.882	-0.0594 <sup>a</sup>	**	0.021
Expected rainfall, sqd.	-0.0549	***	0.000	-0.00455		0.650			
Expected moisture stress (#20-day periods)	0.303	***	0.000	0.0201		0.669	0.00559		0.873
SEA suitable for low input management maize (=1)	)						0.0728	***	0.009
Agricultural year (base is 2006/2007):									
1999/2000 (=1)	0.289		0.520	0.0774		0.773	0.00732		0.969
2002/2003 (=1)	-0.0200		0.907	-0.184		0.085	-0.151	**	0.044
Constant	-6.205	***	0.000	-0.0584		0.957			
Province and agro-region dummies	N/A			N/A			Yes		
Observations	14,999			14,999			14,999		
Within R-squared (pseudo for Tobit)	0.084			0.093			0.172		
Overall model F-stat.	17.16	***	0.000	9.88	***	0.000	38.56	***	0.000
Hansen J test for over-ID restrictions	0.323		0.851	1.158		0.560			

Notes: \*\*\*, \*\* significant at the 1%, 5%, and 10% levels. p-values from standard errors based on 500 bootstrap replications to account for generated regressor (expected maize price). <sup>a</sup>APE includes effect of squared term.

Table B.5. Total, Maize, and Non-maize Output per Hectare Regression Results

Table B.S. Total, Maize, and Non-maize Output per I		(FIQI/h		Maize	e (kg/ha	a)	Non-maize (FIQI/ha)			
Estimator	:Fixe	d effect	S	Fixed	d effect	S	Fixe	d effect	.S	
Explanatory variables	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	
Expected effective maize price (ZMK/kg)	-8.42E-4		0.897	-1.388	***	0.007	0.0114		0.327	
Kg of government-subsidized fertilizer	0.00912	***	0.000	0.739	***	0.000	0.00705	**	0.043	
Tobit residuals from gov't fertilizer reduced form	-0.00877	***	0.001	-0.421	**	0.045	-0.0142	**	0.014	
Groundnut price (ZMK/kg, t-1)	5.90E-4		0.778	0.795	***	0.000	-0.00405		0.401	
Mixed bean price (ZMK/kg, t-1)	0.0132	***	0.000	-0.285		0.310	0.0296	***	0.000	
Sweet potato price (ZMK/kg, t-1)	0.00210		0.611	-0.467	*	0.098	0.00873		0.245	
Effective market fertilizer price (ZMK/kg)	-0.00100		0.329	-0.109		0.160	-0.00286		0.195	
Cattle price (ZMK/head)	-3.70E-6		0.364	9.32E-4	***	0.004	-1.94E-5	***	0.005	
Landholding size (ha)	-1.815	***	0.000	-89.219	***	0.000	-2.380	***	0.000	
Landholding size, sqd.	0.0247		0.105	1.249		0.160	0.0286	*	0.081	
Plows and harrows ('00,000 ZMK)	0.311	**	0.020	10.506	*	0.068	0.364	**	0.035	
Plows and harrows, sqd.	-0.00221		0.340							
HH owns a water pump (=1)	2.120		0.325	267.771		0.161	-0.187		0.955	
Full-time equivalent prime-age (15-59) adults	-0.291		0.461	-22.516		0.437	0.435		0.176	
Full-time equivalent prime-age adults, sqd.	0.0634		0.182	5.291		0.119				
Age of HH head	0.305	*	0.065	-0.386		0.902	-0.120		0.171	
Age of HH head, sqd.	-0.00361	**	0.021							
Highest level of education completed by HH head (base i	s no formal edu	cation)	:							
Lower primary (grades 1-4) (=1)	0.382		0.621	78.831		0.165	0.451		0.510	
Upper primary (grades 5-7) (=1)	-0.839		0.355	62.985		0.350	0.106		0.193	
Secondary (grades 8-12) (=1)	-0.377		0.732	48.125		0.586	0.359		0.436	
Post-secondary (=1)	0.524		0.796	141.007		0.371	0.747		0.749	
Gender and residence status of HH head (non-resident if	<6 months; ba	se is re	sident mal	e):						
Female, non-resident husband (=1)	0.356		0.879	-204.135		0.187	0.776		0.802	
Female, no husband (=1)	-0.629		0.502	-33.844		0.660	0.464		0.446	

Table B.5. (Cont'd)

· · ·	Tota	ıl (FIQI/h	na)	Maize	e (kg/ha)		Non-ma	aize (F	[QI/ha)
Estimator:	Fix	ed effect	S	Fixed	d effects-		Fix	ed effe	cts
Explanatory variables	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.	Coef.	Sig.	p-val.
Disease-related prime-age death in last 3-4 years:									
Male head/spouse (=1)	1.845		0.373	189.818		0.178	0.702		0.682
Female head/spouse (=1)	-0.522		0.743	41.609		0.720	0.325		0.350
Male non-head/spouse (=1)	-0.682		0.551	40.470		0.619	0.232		0.277
Female non-head/spouse (=1)	0.659		0.518	1.319		0.985	0.080		0.122
Growing season rainfall ('00 mm)	4.100	***	0.000	110.969	*	0.052	11.418	***	0.000
Growing season rainfall, sqd.	-0.155	***	0.000	-6.063	**	0.011	-0.458	***	0.000
Moisture stress (# of 20-day periods)	0.611	**	0.048	-21.209		0.328	2.065	***	0.000
Expected rainfall ('00 mm)	-0.422		0.697	-1140.590	***	0.004	2.370		0.197
Expected rainfall, sqd.				65.257	***	0.001			
Expected moisture stress	-5.154	***	0.000	-328.891	***	0.000	-3.701		0.148
Agricultural year (base is 2006/2007):									
1999/2000 (=1)	10.680	**	0.019	634.031	*	0.059	11.114		0.258
2002/2003 (=1)	6.085	***	0.001	309.312	**	0.049	7.637		0.106
Constant	-3.638		0.990	6484.142		0.778	-64.659		0.915
Observations	14,629			11,957			11,984		
Within R-squared	0.047			0.051			0.060		
Overall model F-stat.	12.39	***	0.000	9.54	***	0.000	11.96	***	0.000
Hansen J test for over-ID restrictions	22.799	***	0.000	2.683		0.262	39.513	***	0.000
NT , skylyk skyly		1 0			<b>700.1</b>				-

Notes: \*\*\*, \*\* significant at the 1%, 5%, and 10% levels. p-values from standard errors based on 500 bootstrap replications to account for generated regressors (expected maize price and/or Tobit residuals from government fertilizer reduced form).

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