IMPACT OF
IMPROVED
COMMON BEAN
VARIETIES ON
HOUSEHOLD
FOOD SECURITY
ON ADOPTERS IN
TANZANIA

E. Letaa¹, E. Katungi¹, C. Kabungo², and A. Ndunguru²

¹International Center for Tropical Agriculture (CIAT), Uganda

²Agricultural Research Institute – Uyole, Tanzania









Outline

■ Introduction

■ Data and methods

Results

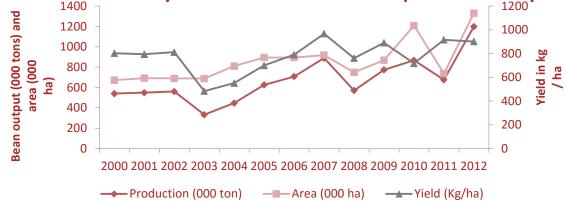
☐ Conclusion and recommendations

Introduction

- □ Common bean is an important grain legume crop in Tanzania
 − constitutes 7.37 % of food consumption expenditure.
- ☐ It is highly vulnerable to biotic and abiotic stresses.
 - Common Bacterial Blight (yield losses of up to 75%)
 - Angular Leaf Spot (> 50% yield loss)









- Bean improvement research- breeding and promotion of varieties,
 - 18 varieties released between 2001 and 2013 with multiple to biotic and abiotic stresses.

Introduction Cont.

- ☐ There is increasing uptake and diffusion of the improved (Letaa et al., 2015).
- ☐ Previous research analyzed impact of beans using binary Propensity Score Matching (Larochelle and Alwang, 2014).
- ☐ We use the continuous treatment impact evaluation Generalized Propensity Score (GPS) methodology (Hirano and Imbens, 2004).
 - Evaluate the effect of heterogeneity in adoption levels of improved bean varieties on household food security (doseresponse).
 - Assess determinants of intensity of adoption.



Method

- ☐ GPS implementation: 3 steps
- Step 1: Estimate the conditional distribution of the treatment given the covariates.

$$\widehat{R}_{i} = \frac{1}{\sqrt{2\pi\widehat{\sigma}^{2}}} \exp\left[\left(-\frac{1}{2\pi\widehat{\sigma}^{2}} \left(\ln (T_{i}) - \widehat{\beta}_{o} - \widehat{\beta}_{i} \widehat{X}_{i}\right)^{2}\right)\right]$$

• Step 2: Model conditional expectation of outcome given the treatment, estimated GPS and a flexible function of the two.

$$\beta(t,r) = g([Y_i|T,\widehat{R}_i]) = \alpha_o + \alpha_1 T_i + \alpha_2 \widehat{R}_i + \alpha_3 T_i^2 + \alpha_4 \widehat{R}_i^2 + T_i \widehat{R}_i$$

 Step 3: Averaging the estimated regression function over the score function evaluated at the desired level of the treatment.

$$\mu(t)E(Y_i(t)) = \frac{1}{N} \sum_{i=1}^{N} g^{-1} (\widehat{\alpha}_o + \widehat{\alpha}_1.t + \widehat{\alpha}_2.t^2 + \widehat{\alpha}_3.\widehat{r}(t,X_i) + \widehat{\alpha}_4.\widehat{r}(t,X_i)^2 + \widehat{\alpha}_5.t.\widehat{r}(t,X_i)$$

Data sources and collection

- ☐ The study was conducted in Southern Highlands Zone which constitutes 24.3% of national bean area.
- ☐ A representative sample of 750 households from 75 villages were selected though multistage sampling procedure to collect data on:
 - Socioeconomic characteristics (age, gender, education level etc.)
 - Plot characteristics (plot distance, soil fertility)
 - Bean production and marketing
- □ 75 community questionnaire were also administered through Focus Group Discussions, one in each village.
 - Distance to nearest market
 - Availability of farmer co-operatives
 - Availability of input distribution centers
 - Road accessibility



Data sources and collection Cont.

- ☐ Food security measures
 - Per capita food expenditure: Household consumption expenditure on food in a year/ family size.
 - Household Dietary Diversity Score: The sum of 9 food groups consumed in a period of 7 days (Kennedy and Nantel. 2006).
- ☐ Treatment variable- Intensity of adoption (acre).

Variable	Mean	Std. Dev
Per capita food expenditure (Tsh)	480237.40	244295.90
Household Dietary Diversity Score	6.25	1.09
Adoption intensity (acre)	0.65	0.97

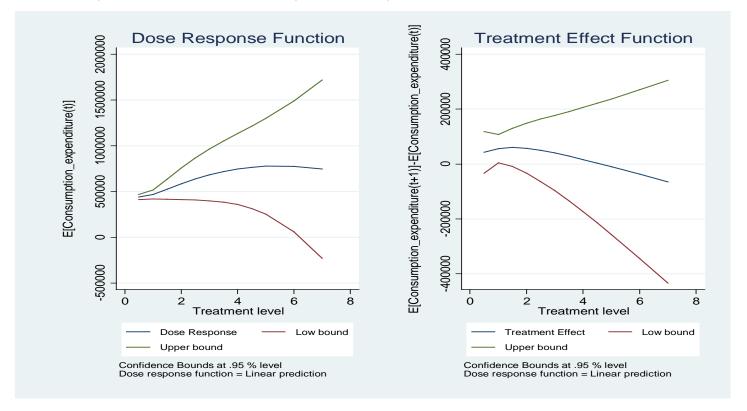
Results

☐ Determinants of intensity of adoption (GPS estimates)

Variable Coefficient Std. Err. Household head education 0.020 0.022 Household head gender 0.265 0.244 Experience – age ratio -0.052 0.295 Livestock units 0.187*** 0.050 Household size 0.126 0.176 Dependents 0.052 0.040 People sharing information 0.002 0.001 Farm size (acres) 0.007* 0.003 Off-farm activity 0.208* 0.123 Farmer group membership 0.253** 0.119 Soil fertility good 0.662 0.668 Soil fertility moderate 1.174* 0.637 Plot distance from home (walking minutes) 0.000 0.003 Extension visits 0.296* 0.153 Distance to nearest market (km) -0.037 0.036 Village road is accessible throughout the year 0.229* 0.126 Farmer associations/ co-operatives in the village 0.113 0.128 Input distribution center for improved seeds in the village of observations	Determinants of intensity of adoption (or	J Communic.	
Household head gender	Variable	Coefficient	Std. Err.
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Household size	Experience – age ratio	-0.052	0.295
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Village road is accessible throughout the year 0.229* 0.126 Farmer associations/ co-operatives in the village 0.339*** 0.148 Input distribution center for improved seeds in the village 0.113 0.128 Constant -4.539*** 0.963 Number of observations 222 Wald chi2 (2) 86.5***	Extension visits	0.296*	0.153
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Wald chi2 (2) 86.5***	Constant	-4.539***	0.963
	Number of observations	222	
Log likelihood -280,255	Wald chi2 (2)	86.5***	i.
200,200	Log likelihood	-280.255	

Results Cont.

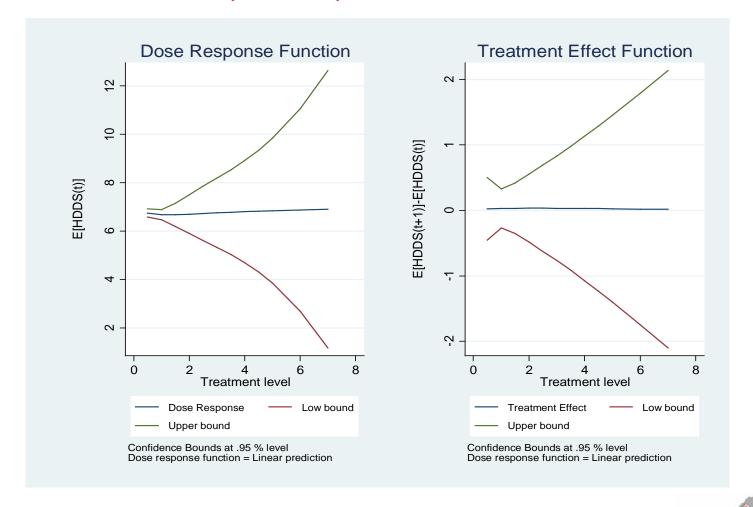
- ☐ Impact of intensity of adoption on food security: dose-response function
- Per capita food consumption expenditure



Average per capita food expenditure increases with intensity (up to 5 acres) and then starts to decline.

Results Cont.

Household Dietary Diversity Score



• Dietary Diversity Score increases remains almost constant a increases.

Conclusion and recommendation

- ☐ Household wealth, social capital, market access, soil quality and extension influence Intensity of adoption.
- ☐ The results of dose-response function reveal that food security increase with intensity of adoption.
- ☐ Policies that reduce seed access constraints and support dissemination of the improved bean seeds especially among smallholder farmers are central to improving household food security



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Thank you

