



Root for the Tubers: Extended-Harvest Crop Production and Productivity Measurement in Surveys

HEATHER MOYLAN

Survey Specialist

[Living Standards Measurement Study](#)

Development Data Group – Survey Unit – World Bank

hmoylan@worldbank.org

Co-Authors: **TALIP KILIC, JOHN ILUKOR, CLEMENT MTENGULA and INNOCENT PANGAPANGA PHIRI**

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The Root of the Measurement Problem



- Challenges in producing reliable agricultural statistics for smallholder systems, despite the importance of the sector
- Root and tuber crops, including cassava, are no exception - notwithstanding their role in hedging against seasonal crop failure and/or food insecurity during the lean season
- Primary concern around smallholder statistics on production and yields of roots and tubers: Reliance on farmer-recall in surveys
 - Crop harvests throughout the year, as needed, often in small quantities
 - With the typical reference period of 12 months or an agricultural season, farmer-recall expected to underestimate production
- Other concerns include:
 - Use of non-standard measurement units
 - Different measurement units of varying sizes along the value chain, crops appearing in different conditions
 - Development of conversion factors to express product-condition-NSU combos in KG equivalent terms in its infancy
 - Control of plots by household members different than respondents
- Clear need to develop improved approaches to microdata collection on root and tuber production in large household and farm surveys

Our Contribution

- Provides empirical evidence regarding the relative accuracy and cost-effectiveness of recall-based methods vis-à-vis their diary-based counterparts for household-level annual cassava production estimation
- Assesses the relative accuracy of implementing diary-visit versus diary-phone options, and the scale-up feasibility of the daily diary keeping with supervisory phone calls
- Compares the annual cassava yield estimates obtained under diary and recall survey treatments to the crop cutting-based cassava yield estimates and their national and international counterparts
- First comprehensive study undertaken on continuous crop production in Malawi

CVIP: Methodological Experiment on Measuring Cassava Production, Productivity, and Variety Identification

Funding

- LSMS Minding the (Agricultural) Data Gap Research Program, funded by UKAid
- Global Strategy to Improve Agricultural and Rural Statistics

Objectives

- Test subjective approaches to measurement vis-à-vis objective methods for land area; cassava production and productivity; & cassava variety identification

Technical Partnerships

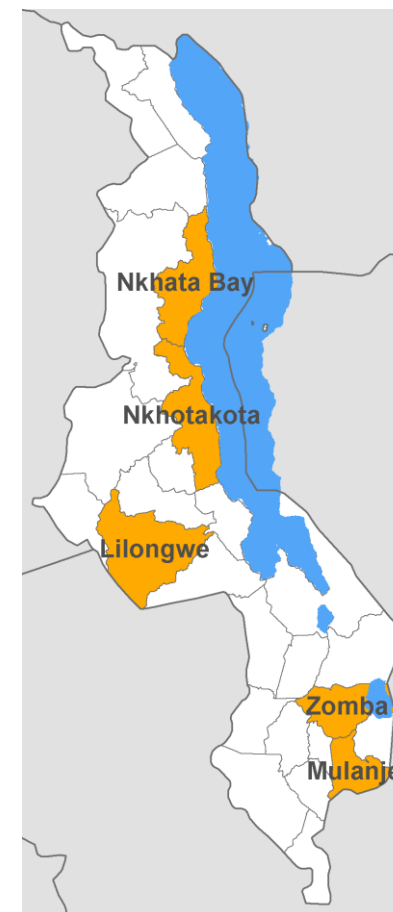
- National Statistical Office (Implementing Agency)
- CGIAR Standing Panel on Impact Assessment (Variety Identification)

CVIP: Context

- **Along lakeshore in North & Central Regions:** Cassava is used as a staple food crop along the shores of Malawi (Nkhatabay, Nkhotakota)
- **Non-cassava belt areas in Southern & Central:** Cassava is mainly grown for sale or use as a snack (Lilongwe, Zomba, Mulanje)

Sample Means by District

	Overall	Nkhatabay	Nkhotakota	Lilongwe	Zomba	Mulanje
Total GPS-Based Land Area Cultivated with Cassava (Ha)	0.25	0.31	0.2 ***	0.28	0.2 ***	0.23 ***
# of Cassava Plots	1.4	2.1	1.2 ***	1.7 ***	1.2 ***	1.2 ***
% of Cassava Plots Intercropped	50	39	23 ***	7 ***	81 ***	96 ***
Household Sold Any Cassava†	38	12	20	96 ***	40 ***	22 *
% of Diary-Based Production Allocated to Consumption	56	94	87 ***	9 ***	61 ***	27 ***
Length of Harvest Period (Months)	3.5	6.5	5.8 ***	1.3 ***	2.1 ***	1.7 ***
Harvested # of Cassava Plants in Crop Cut Sub-Plot	26	46	35 ***	31 ***	12 ***	6 ***
Observations	1218	245	243	233	248	249



CVIP: Methods

Methods Tested:

Cassava Production	<ul style="list-style-type: none">• Crop-cutting (5mx5m subplot) with balance scales<ul style="list-style-type: none">• One plot/household for all 1,241 households• Crop diaries with enumerator visits twice/week (D1)• Crop diaries with telephone calls twice/ week (D2)• Farmer-reported harvest (two visits, 6-month recall) (R1)• Farmer-reported harvest (single visit, 12-month recall) (R2)<ul style="list-style-type: none">• Prevailing approach in Malawi Integrated Household Survey
Land area	<ul style="list-style-type: none">• GPS measurement• Farmer-reported area
Variety	<ul style="list-style-type: none">• DNA fingerprinting of leaf samples• Farmer-reported varieties & attributes w/ photo aid
CAPI	<ul style="list-style-type: none">• Questionnaires administered on <i>Survey Solutions</i>

5
Districts

45
Enumeration
Areas

1217
Households

~ 305
Households
per treatment



Incentives Provided to CVIP Households by Treatment Arm

Incentive	MWK	USD	Diary - Visit (D1)	Diary - Phone (D2)	6-Month Recall (R1)	12-Month Recall (R2)
Weighing Scale	6,780	9.69	X	X		
Sacks	2,544	3.63	X	X		
Mobile Phone	11,000	15.71		X		
Solar Charger	9,000	12.86		X		
Airtime	5,000	7.14		X		
Cash	5,000	7.14	X	X*	X	X
Total Incentive (USD)			20.46	52.61	7.14	7.14
Observations			305	307	304	302

Note: *Cash disbursement to each D2 household was MWK 2,500.

Measurement of Production and Yield

- Production measured as **total kilograms harvested per household** across the 12-month period
 - Diary Arms:
 - Sum of all daily records of “fresh” cassava harvests, across all plots, weighed directly upon harvest
 - Recall Arms:
 - Total production solicited in recall interviews –reported in two visits for R1; single visit for R2
 - Collected at the plot-level (in line with the existing IHS approach) - summed across plots
 - Allow for the use of non-standard harvest units
 - Existing conversion factors vs. alternatives from diary sample (region-, district-, EA-, month-specific)
- Gold-standard for annual household-level production: D1 vs. D2
 - Well-implemented diary is the gold standard for *household-level production* measurement because recall decay and respondent bias are minimized but still depends on
 - Supervision/field staff efforts
 - Respondent participation/motivation
 - Respondent literacy

Measurement of Production and Yield (2)

- Annual household-level yield: measured by dividing household-level annual cassava production (in kilograms) with the household-level GPS-based land area cultivated with cassava (in hectares), across all cassava plots cultivated by the household
- Gold-standard for annual household-level yield: **Crop cutting**
 - Recognized as the gold standard for *plot-level seasonal crop yield* measurement since the 1950s
 - Extrapolated from sub-plot to (GPS-measured) total area under cassava cultivation
 - Should be understood as an upper-bound for the cassava yield realized on the farm
 - Should be higher, by design, than the average diary and recall yields

Estimation of Survey Treatment Effects

$$(1) \text{Production}_i = \alpha + \beta_1 D2_i + \beta_2 R2_i + \beta_3 R1_i + \gamma C + \varepsilon_i$$

$$(2) \text{Yield}_i = \alpha + \beta_1 D1_i + \beta_2 D2_i + \beta_3 R2_i + \beta_4 R1_i + \gamma C + \varepsilon_i$$

- i represents household, α & ε are constant & error terms, respectively
- Equation 1 – Outcome: Annual Cassava Production (KGs) – Comparison Category: **D1**
- Equation 2 – Outcome: Annual Cassava Yield (KGs/Ha) – Comparison Category: **CC**
- D2, R1 & R2 represent identifiers for diary-phone, 6-month recall & 12-month recall, respectively
- C is a vector of household attributes – inclusion of which has no bearing on our findings
- Standard errors clustered at the EA-level for Equation 1, at the household-level for Equation 2

Results

Selected Coefficients from Production and Yield Regressions

	Panel A		Panel B		Panel C	
	Total Production (Kg)		Yield (Kg/Ha, GPS)		Yield (Kg/Ha, GPS)	
	Mean	Coefficient‡	Mean	Coefficient‡	Mean	Coefficient#
Diary - Visit †	1,072	N/A	5,208	N/A	5,208	-3582*** (507)
Diary - Phone †	1,391	295*** (80)	6,618	1431*** (430)	7,717	-2211*** (591)
6-Month Recall †	1,102	37 (68)	5,798	561 (400)	5,798	-2990*** (434)
12-Month Recall †	844	-221*** (61)	4,671	-617*** (337)	4,671	-4187*** (444)
Comparison Category	Diary - Visit †		Diary - Visit †		Crop Cutting	
Comparison Category Mean	1,072		5,208		8,958	
Controls Included?	YES		YES		YES	
Observations	1,218		1,218		2,345	
R2	0.45		0.36		0.44	
Tests of Equality of Coefficients						
D1 = D2	--		--		0.00	
D1 = R1	--		--		0.35	
D1 = R2	--		--		0.03	
D2 = R1	0.00		0.04		0.06	
D2 = R2	0.00		0.00		0.00	
R1 = R2	0.00		0.01		0.01	

Notes: † denotes a dummy variable. Constant estimated but not reported. ***/**/* denote statistical significance at the 1/5/10 percent level, respectively. ‡ denotes standard errors clustered at the enumeration area-level. # denotes standard errors clustered at the household-level.

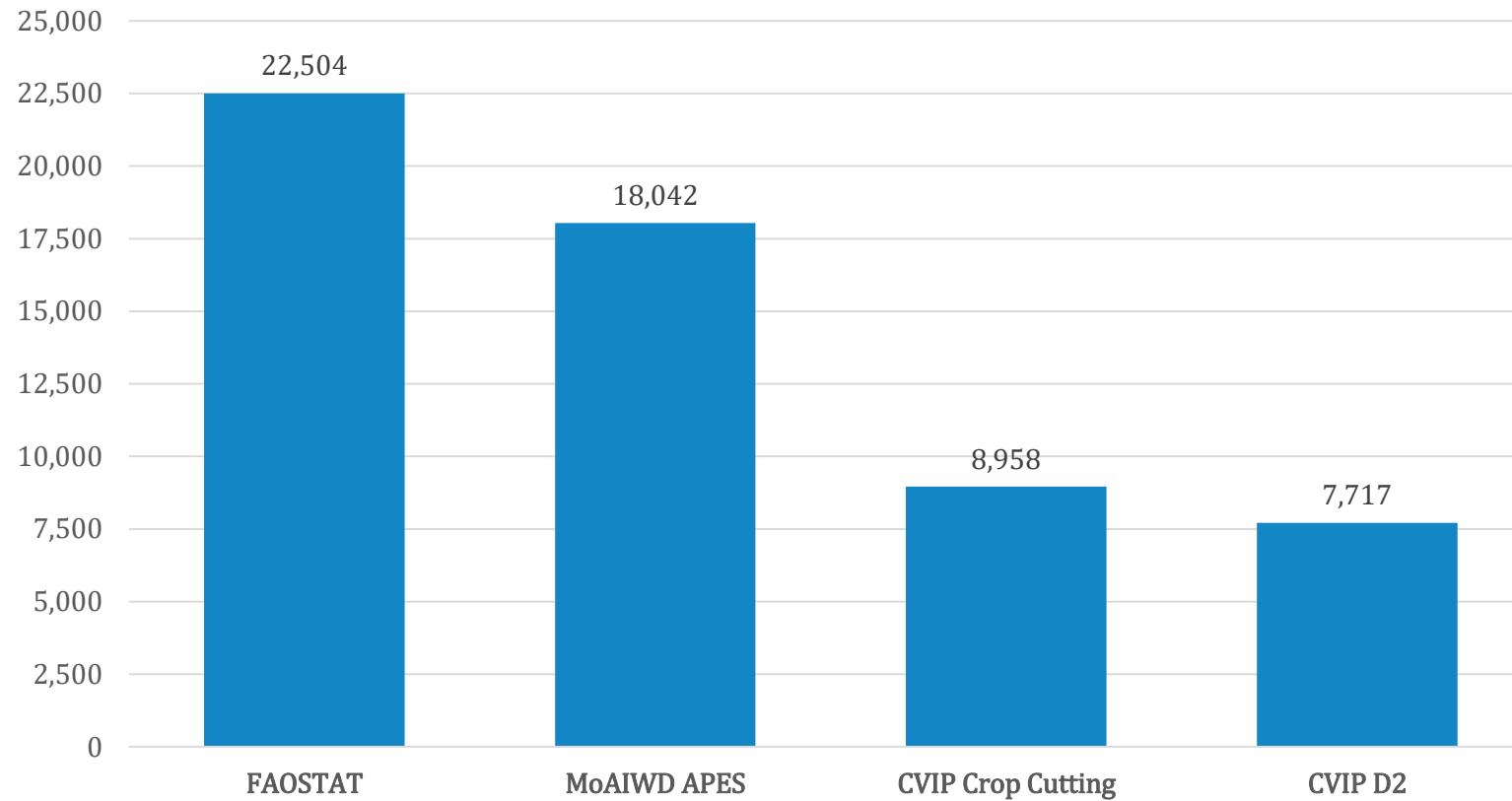
Results (2)

Average Cassava Production by Month & Survey Treatment

	Diary - Visit (D1)			Diary - Phone (D2)						6-Month Recall (R1)				
	HHs Reporting Any Harvest		Monthly Average‡	Semi-Annual Average#	HHs Reporting Any Harvest		Monthly Average‡	Difference Significant?	Semi-Annual Average#	Test of Mean Difference wrt D1	Semi-Annual Average#	Test of Mean Difference wrt D1	Test of Mean Difference wrt D2	
	Observations	%			Observations	%								
August	23	0.08	307	706	17	0.06	295	0.910	603	0.285	584	0.098	0.795	
September	145	0.53	317		138	0.50	305	0.830						
October	113	0.41	247		117	0.42	311	0.344						
November	90	0.33	333		103	0.37	408	0.274						
December	79	0.29	407		91	0.33	462	0.587						
January	55	0.20	221	69	0.25	309	0.067	977	0.000	586	0.463	0.000		
February	63	0.23	215	80	0.29	281	0.021							
March	56	0.20	195	69	0.25	295	0.018							
April	48	0.17	202	59	0.21	255	0.146							
May	31	0.11	219	41	0.15	310	0.036							
June	32	0.12	258	641	46	0.17	242	0.682	262		265			
July	21	0.08	343		31	0.11	297	0.667						
Observations	259				262							265		

Note: ‡ For a given month, the average is computed only based on households reporting positive harvest. # Semi-annual averages are not conditional on households reporting positive harvest.

Competing Malawi Cassava Yield Estimates for 2015/16



Conclusions

- Given the contribution of cassava farming to food security and agricultural commercialization, evidence underscores critical need for survey practitioners to...
 - Adopt improved survey methods to collect better data on cassava production and productivity
 - Avoid using seasonal or 12-month reference periods, given the significant underestimation of production and yield
- **Recommendation: Diary-phone**
 - Provided the most accurate information on annual cassava production – sustained participation in diary-keeping and potentially connected to in-kind incentives
 - Significantly cheaper than diary-visit, but still more resource- and supervision-intensive compared to recall
 - More feasible if packaged within a broader effort to collect more frequent data through mobile phone calls
- **Second-Best: 6-Month Recall**
 - Performs as well as Diary-Visit (i.e. the traditional gold standard)
 - A viable alternative to existing methods when D2 considered too costly



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