

Marketed Surplus and Demand for Improved Groundnut Varieties: Empirical Evidence From Smallholders in Central and Northern Malawi

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2 **smallholders in central and northern Malawi**

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15
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17
18 **Abstract**

19
20 The quest to increase marketed surplus prompts farmers to demand high-yielding crop varieties.
21 Understanding the farmers' challenges to increase marketed surplus would contribute to policy
22 intervention measures that increase crop yields. Using an Endogenous Switching Probit regression
23 (ESP) model, the study investigated the effect of marketed surplus on-demand for improved
24 groundnut varieties and determined the factors that affect marketed surplus. The study used data
25 collected from 416 farm households in some selected districts of central and northern Malawi. The
26 ESP estimates showed that marketed surplus had a positive impact on the demand for improved
27 groundnut varieties. The demand for improved groundnut varieties increased by 40% among
28 smallholders with a marketed surplus. Conversely, the demand for improved groundnut varieties

29 among farmers with no marketed surplus declined by 14%. Other findings suggest that increased
30 crop productivity, smallholders' engagement in off-farm economic activities, and enhanced access
31 to market information are critical in increasing marketed surplus. Therefore, policy intervention
32 measures that encounter the farmers' challenges in the output market are critical for the increased
33 marketed surplus to enhance the demand for improved varieties.

34

35 *Key Words:* Endogenous switching probit; High yielding crops; Marketed surplus; Smallholders.

36 **1 INTRODUCTION**

37 Low crop yields that farmers realize are, among others, attributed to the use of low-yielding
38 conventional crop varieties (Minde *et al.*, 2008). For example, FAOSTAT (2021) reports that
39 between 1980 and 2000, Malawi recorded negative national average annual growth rates in both
40 production and productivity (yield per hectare) of groundnuts. During that period, most farmers
41 cultivated low-yielding conventional groundnut varieties (Minde *et al.*, 2008). However, the
42 situation improved between 2001 and 2010 when average growth rates in production, productivity,
43 and seed supply of improved groundnut variety increased to record highs of 21%, 12%, and 3%,
44 respectively (FAOSTAT, 2021). Thus, in addition to expanding the cultivated land area for
45 groundnuts, high-yielding improved varieties injected into the production system played a role
46 (Minde *et al.*, 2008; Siambi *et al.*, 2015). At the farm level, the increase in production means
47 enough harvest for household consumption and sale. Therefore, the increase in the production of
48 marketable surplus is critical for enhanced commercialized crop production. Besides,
49 commercialized crop production also entails increased demand for highly productive agricultural
50 technologies, including improved crop varieties (Pingali and Rosegrant, 1995; Pingali, 1997).

51

52 The demand for particular crop varieties among producers is commensurate with their production
53 orientation. For example, farmers that produce food crops solely for consumption choose varieties
54 that address basic survival needs (Wale and Chianu, 2015). Such farmers would cultivate low-
55 yielding crop varieties since the production is purely for subsistence. Conversely, farmers that
56 consider farming as their primary source of income and are inclined to increase marketed surplus
57 demand high yielding improved varieties (Wale and Chianu, 2015; Wale and Holm-Mueller,
58 2017). Marketed surplus, which describes the actual quantities of produce sold (Govere *et al.*,
59 1999; Strasberg *et al.*, 1999; Chirwa, 2009), triggers farmers to participate in the market as sellers
60 of commodities (Lemi, 2020). Thus farmers with a high propensity to participate in the market
61 would demand high productive farm inputs (Alene *et al.*, 2000), such as improved crop varieties.

62
63 The preceding discussion associates the demand for improved varieties with the marketed surplus
64 of crops. However, empirical evidence of the impact of marketed surplus on-demand for improved
65 crop technologies among smallholders in sub-Saharan African (SSA) remains sparse. Nonetheless,
66 the empirical literature is awash with studies on the positive impact of adopting improved crop
67 varieties on various welfare indicators. These studies include Manda *et al.* (2018), Manda *et al.*
68 (2016) and Khonje *et al.* (2015) in eastern Zambia, Shiferaw *et al.* (2014) in Ethiopia, Bezu *et al.*
69 (2014) in Malawi, Asfaw *et al.* (2012) in Tanzania and Ethiopia and Kassie *et al.* (2011) in Uganda.
70 All these studies considered outcomes of interventions (welfare effects) as continuous variables.
71 Inquiry on such continuous variables requires that farm households recall actual events that
72 happened months or some years in the past. Therefore, it becomes a challenge for smallholders
73 who rarely keep records of their daily production undertakings. The consequence is that in some

74 cases, one may understate or overstate the situation leading to bias or measurement of error (Beegle
75 *et al.*, 2011)

76
77 Because of the above, the current study closes the gap in empirical literature by investigating the
78 impact of marketed surplus on-demand for improved varieties. The study employs an Endogenous
79 Switching Probit (ESP) econometric technique. In the ESP model, both selection and outcome
80 variables are binaries (Aakvik *et al.*, 2000). The ESP estimates the treatment's actual effects on
81 the outcome response variable by controlling for selection biases of treatment decision
82 (Wooldridge, 2010). Application of the ESP, in this paper, addresses the following questions:

- 83 1. What is the overall impact of marketed surplus on the probability that smallholders would
84 demand improved groundnut varieties?
- 85 2. What are the factors that affect smallholders' marketed surplus of groundnuts?

86 The study adds to existing empirical studies, other factors that affect marketed surplus. The study
87 also contributes to the policy formulation of strategies that would address the challenges
88 smallholders encounter to increase marketed surplus. The rest of the paper proceeds as follows.
89 Section 2 presents a brief overview of groundnuts in Malawi. The empirical model estimation
90 procedure is presented in section 3. Section 4 presents the definition of variables and data sources
91 used in the study. The study results and discussion are reported in section 5, followed by the
92 conclusion and policy recommendations in the final section.

93 **1.1 Overview of Smallholder Groundnut Subsector in Malawi**

94
95 In Malawi, groundnut (*Arachis hypogea*) is one of the legume crops widely cultivated by
96 smallholders, mainly women (Simtowe *et al.*, 2010; Msere *et al.*, 2015; Tsusaka *et al.*, 2016a). In
97 this case, a policy promotion of its production has implications on women's economic

98 empowerment. Further, the Malawi Government promotes its increased production for its potential
99 contribution to sustainable food security and increased agricultural incomes (Malawi-Government,
100 2011; Gourichon and Mkomba, 2014; Malawi-Government, 2016). Farmers cultivate both
101 conventional and improved varieties. Popular conventional and improved varieties are Chalimbana
102 and CG7, respectively (Chiyembekeza *et al.*, 1998; Goyder and Mang'anya, 2009). The latter is a
103 relatively higher-yielding variety than the former, with a potential yield superiority of 60%
104 (Derlagen and Phiri, 2012). The Agro-processing industry demand Chalimbana for confectionary
105 making, while CG7 is suitable for processing cooking oil (Chiyembekeza *et al.*, 1998; Tsusaka *et*
106 *al.*, 2016b). Similarly, farm households prefer the former for home consumption while cultivating
107 the latter for the market.

108

109 Like in any other developing country, smallholders in Malawi own an average of fewer than 0.5
110 hectares of land to cultivate a diverse number of food and cash crops (Malawi-Government, 2005),
111 thus resulting in low levels of total crop production. In addition, the use of rudimentary agricultural
112 technologies (Mwangi and Kariuki, 2015) contributes to low crop production among the
113 smallholders. Because of the low yields, the smallholders are also less likely to increase their
114 market participation intensity, affecting the crop subsector's commercialization (Collier and
115 Dercon, 2014a). Low crop yields, coupled with limited commercialisation, are linked to
116 smallholder farm households with high poverty incidences (Diao *et al.*, 2010). Groundnut
117 productivity among the smallholders is also relatively low, with smallholders' yields below the
118 potential levels (Siambi *et al.*, 2015). One of the underlying reasons for low productivity is that
119 the smallholder continues to utilize low productive crop technologies, such as conventional
120 groundnut varieties (Simtowe *et al.*, 2010b). With such low yields, it is not surprising to see a low

121 commercialization drive among the smallholder subsectors. The smallholders consume much of
122 the groundnuts they produce with little to offer to the market (Derlagen and Phiri, 2012).

123

124 2 METHODS

125 2.1 Empirical Model Estimation Procedure

126 The study adopts an Endogenous Switching Probit (ESP) model to investigate the impact of
127 marketed surplus on farmers' demand for improved varieties of groundnuts in central and northern
128 Malawi. The ESP controls for endogeneity biases in the treatment effect framework (Lokshin and
129 Sajaia, 2011). Other econometric models that control endogeneity biases include Heckman's two-
130 step, double hurdle, endogenous switch regression, and conditional mixed process (Cragg, 1971;
131 Heckman 1979; Roodman, 2009). The difference between the ESP and the other models is that the
132 former is appropriate in modelling decisions where both the selection and outcome response
133 variables are binaries (Carrasco, 2001; Lokshin and Glinskaya, 2009; Lokshin and Sajaia, 2011).
134 For the other models, only the treatment response variable is binary, while the outcome is
135 continuous.

136

137 Let MP_i (treatment variable) denote a binary taking 1 for smallholders who are inclined to increase
138 a marketed surplus, 0 otherwise. Similarly, DI_i (outcome variable), also a binary, with 1 indicating
139 smallholders that demand for improved varieties and 0 otherwise. The selection and outcome
140 equations are, in turn, specified in equations (1), (2), and (3).

$$141 \quad MP_i = 1 \text{ if } \gamma Z_i + \mu_i > 0; MP_i = 0 \text{ if } \gamma Z_i + \mu_i \leq 0 \quad (1)$$

$$142 \quad DI_{1i}^* = \alpha_1 X_{1i} + \varepsilon_{1i}; DI_{1i} = I(DI_{1i}^* > 0); DI_{0i}^* = \alpha_0 X_{0i} + \varepsilon_{0i}$$

143
$$DI_{0i} = I(DI_{0i}^* > 0) \tag{2}$$

144 DI_i is observable when $DI_i = DI_{1i}$ if $MP_i = 1$;

145
$$DI_i = DI_{0i} \text{ if } MP_i = 0, \tag{3}$$

146 Where DI_{1i}^* and DI_{0i}^* are the latent variables that determine the binary outcomes DI_1 and DI_0 , X_1
 147 and X_0 are vectors of weakly exogenous variables, Z is a vector of variables that determine a switch
 148 between and α_0 γ are vectors of parameters; and μ_i , ε_{1i} and ε_{0i} are the error terms. The observed
 149 demand for improved varieties DI_i is a dichotomous realization of DI_i^* if the farmer has no
 150 marketed surplus.

151
 152 The assumption made in this type of model is that farmers' decision to demand improved varieties
 153 is endogenous to having a marketed surplus. Some unobservable characteristics that influence the
 154 probability that a farmer would have marketed surplus could also influence improved varieties'
 155 demand. Neglecting this endogeneity in the unobservable covariates in both treatment and outcome
 156 regression equations is likely to yield biased estimates of the impact of marketed surplus on-
 157 demand for improved varieties. The use of instrumental variables in the selection equation
 158 overcomes biased estimates' problems (Makate *et al.*, 2016). A falsification test is conducted on
 159 the outcome equation's probit regression to identify the correct instrumental variables. The chi-
 160 squared's insignificance p -value indicates that the variables are the suitable instruments used in
 161 the selection equation but not in the outcome.

162
 163 A post estimation is conducted to find parameters that measure the treatment variables' effects on
 164 the desired outcome (Heckman and Vytlacil, 2000). In this study, marketed surplus of groundnuts
 165 is the treatment or selection variable, while the demand for improved varieties of groundnuts is the

166 outcome variable. The most relevant post estimation parameters are the average treatment effect
 167 on the treated (ATET), which estimates the effect of marketed surplus on-demand for improved
 168 varieties for smallholders with the marketed surplus. The effect of farmers with no marketed
 169 surplus on-demand for improved varieties estimates the average treatment effect on untreated
 170 (ATU). Other parameters are the average treatment effect (ATE) and the average marginal
 171 treatment effect (MTE). The former is the average effect of marketed surplus for groundnuts on-
 172 demand for improved varieties for smallholders selected at random from the population. The latter
 173 describes the treatment effect for smallholders that are indifferent as to whether to increase
 174 marketed surplus or not. Lokshin and Sajaia (2011) and Aakvik *et al.* (2000) provide more details
 175 of the ESP model.

176
 177 Estimating the parameters that indicate the impact of marketed surplus on-demand for improved
 178 varieties proceeds with determining factors that affect marketed surplus. Denote the marketed
 179 surplus as $MP_i = Q_i - X_i'$, where MP_i is a marketed surplus, Q_i is the total household output, X_i is
 180 a vector of household consumption that includes part of the harvest used as seed and given away
 181 as gifts. In autarky, nothing is traded, $MP = 0 \forall_i \in$ not traded. However, when the farmer sells
 182 part of the harvest, then $MP_i > 0 \forall_i \in$ is traded. Then the selection equation with its determinants
 183 is given as,

$$\begin{aligned}
 184 \quad MP_i = & \alpha_0 + \alpha_1 AGERESS + \alpha_2 AGERESSQD + \alpha_3 PCWORK + \alpha_4 OXCART \\
 & + \alpha_5 PGNUTHA + \alpha_6 YIELD + \alpha_7 SEEDCOST + \alpha_8 OUTPUTMARK \\
 186 \quad & + \alpha_9 MOBP + \alpha_{10} SEEDLOAN + \alpha_{11} EXT + \alpha_{12} SEEDMULT \\
 187 \quad & + \alpha_{13} PRDBUYERS + \alpha_{14} RODST + \alpha_{15} DISTMARK + \varepsilon_i \quad (4)
 \end{aligned}$$

188 where all the variables are as defined in Table 1 and ε_i are the unobservable covariate.

189

190 **2.2 Data Sources and Definition of Variables**

191

192 Table 1 defines the variables used in the study. Dependent variables comprised a selection variable,
193 marketed surplus (*MP*), and an outcome variable, demand for improved varieties (*DI*). In the
194 former case, farm households indicated, in local measurements, the quantity of the crop harvest
195 that they sold in 2015/16. According to Patnaik (1975), this is the marketed surplus. The marketed
196 surplus was then converted as the proportion of the total harvest. Because it is the produce sold,
197 such proportion indicates the household's commercialization index (Govere *et al.*, 1999;
198 Strasberg *et al.*, 1999; Chirwa, 2009). According to Strasberg *et al.* (1999) and Govere *et al.*
199 (1999), a commercialization index of close to 0 means that crop production is purely for
200 subsistence. The index close to 1 implies that the household produces for the market. In this study,
201 all index values equal to and above 0.5 were considered to be marketed surplus. Commercialization
202 indices below 0.5 were considered to be non marketed surplus. A binary variable was generated
203 for marketed surplus with 1 and 0 otherwise. For the outcome variable, farmers who replaced
204 conventional varieties with improved ones in 2016/17 were considered to have expressed demand
205 for the latter. Consequently, the variable was coded 1 for the demand, 0 otherwise.

206

207 Explanatory variables hypothesized to explain a marketed surplus of groundnuts were identified
208 based on past empirical work (Alene *et al.*, 2008; Zanello, 2012; Adenuga *et al.*, 2013; Burke *et al.*,
209 2015). These variables were categorized as socio-economic characteristics, market access-
210 related factors, institution factors, and market transaction cost factors

211

212 **2.2.1 Socio-economic characteristics**

213
214 Farmers' age (AGERESS and AGERESSQD) is expected to have a nonlinear relationship with a
215 marketed surplus. Young farmers are more inclined to increase marketed surplus than older ones
216 (Gebremedhin and Jaleta, 2010; Mirie and Zemedu, 2018; Das, 2020). Involvement in piece work
217 jobs (PCWORK), known as 'ganyu' in Malawi, is an income diversification strategy for farm
218 households (Ellis, 1998). However, Whiteside (2000) pointed out that *ganyu* is counterproductive
219 to household productivity as it competes with its labour demand. Because *ganyu* contributes to
220 low household crop productivity, the marketed surplus is also expected to decline. The oxcart is
221 the most used means of transporting inputs and produce to and from the market in some of SSA
222 countries' rural areas. Therefore, it is expected that farm household that own oxcarts (OXCART)
223 to increase marketed surplus.

224
225 Households' productive assets, such as the proportion of land allocated for the cultivation of crops
226 (PGNUTHA), are expected to increase production, hence marketed surplus (Goyal and Berg, 2004;
227 Faris *et al.*, 2018). An increase in yield per hectare of land (YIELD) increases the marketed surplus
228 (Wambua *et al.*, 2019). The seed for modern varieties, especially groundnuts, are costly. Their
229 supply is low because private traders consider the enterprise to have narrow profit margins (Minde
230 *et al.*, 2008; Siambi *et al.*, 2015). Therefore, their demand falls with an increase in cost
231 (SEEDCOST). The decline in the demand for certified seed reduces crop productivity, negatively
232 affecting marketed surplus.

233 **2.2.2 Market access related factors**

234
235 Farmers with access to output market information (OUTPUTMARK) are more likely to intensify
236 their participation in the market (Aslam *et al.*, 2019), hence increase marketed surplus due to the
237 prospects of finding buyers that offer better prices.

238 Table 1: Definition of variables used in the study

<i>Dependent Variables</i>	Measurement	Expected Sign
Demand for Improved Varieties (DI)	1=Smallholder demand for improved groundnut varieties	
Marketed Surplus (MP)	1=Smallholder with marketed surplus	
<i>Independent Variables</i>		
<i>Socio-economic Characteristics</i>		
AGERESS	Age of the farmer in years	Positive
AGERESSQD	Age squared of the farmers in years	Negative
PCWORK	1=Household involved in piece work jobs	Negative
OXCART	1=Household owns an oxcart	Positive
PGNUTHA	The proportion of land planted with groundnuts	Positive
YIELD	The yield of groundnuts in kg ha-1	Positive
SEEDCOST	Cost of seed per hectare (Malawi Kwacha; MK730=1US\$)	Negative
<i>Market Access</i>		
OUTPUTMARK	1= Smallholder' access to market information	Positive
MOBP	1=Household possess a mobile phone	Positive
<i>Institutional Factors</i>		
SEEDLOAN	1=Household has access to seed loan	Positive
EXTS	1=Household has access to extension services	Positive
SEEDMULT	1=Household is located in areas with seed multiplication activities	Positive
PRDBUYERS	1=Smallholder sold produce to mobile grain buyers	Negative
<i>Transaction Costs Factors</i>		
RODST	1=Households resides in areas with poor road network	Negative
DISTMARKT	Time, in minutes, taken to reach the nearest market	Negative

239 Source: Farm household survey (2017); n=Total sample size

240 In addition, farmers who possess mobile phones (MOBP) can link with many prospective buyers
241 of produce (Aker, 2010; Aker, 2011; Zanello, 2012), leading to an increased marketed surplus.

242

243 **2.2.3 Institutional factors**

244

245 Mobile grain buyers (PRDBUYERS) are the informal market sources to which smallholders sell
246 produce. However, crop producers claim that such grain buyers cheat them by using
247 unstandardized weighing scales and offer lower prices (Pokhrel and Thapa, 2007). As a result,
248 groundnut producers, whose main buyers are mobile traders, are less inclined to increase marketed
249 surplus. On the other hand, agricultural extension agents (EXT) enable farm households to access
250 market information for their produce. Therefore, contacts with extension agents would positively
251 affect marketed surplus (Bahta and Bauer, 2012.; Faris *et al.*, 2018).

252

253 Most smallholder farmers cannot afford to purchase improved seed varieties because they are
254 expensive. To ease their access, some farmer organizations offer seed loans (SEEDLOAN) to
255 them. Access to the seed loans would increase production through farmers' access to viable seed,
256 hence would increase marketed surplus (Mmbando *et al.*, 2015).

257 **2.2.4 Market transaction cost factors**

258

259 Poor status of rural roads (RODST) increases transportation costs to bring produce to markets.
260 Therefore, not only would producers' transportation costs increase with poor road conditions, but
261 also buyers of produce. As a consequence, the marketed surplus would decline (Fentie *et al.*, 2017).
262 Similarly, smallholders who take a long time to reach markets (DISTMARKT) are also less likely
263 to decrease marketed surplus (Fentie *et al.*, 2017) due to increased transportation costs.

264

265 3 EMPIRICAL RESULTS AND DISCUSSION

266

267 3.1 Descriptive Statistics

268

269 Table 2 presents the descriptive statistics of the variables used in the analysis. About 74% of the
270 smallholders had a marketed surplus of groundnuts, while 41% demanded improved groundnuts
271 varieties. The farmers' mean age was about 46 years, and about 43% of them engaged in piece
272 work jobs. Most smallholders' engagement in piece work jobs indicates their importance as a
273 livelihood coping strategy (Whiteside, 2000) and income diversification avenue among rural
274 households (Ellis, 1998). A moderate percentage of the smallholders (31%) possessed oxcarts,
275 which they mostly use to transport farm inputs and produce.

276

277 The average land allocated to the cultivation of groundnuts was 0.33 ha, while the average yield
278 realized was about 890 kg ha⁻¹. Allocation of 0.33 ha of land to groundnut cultivation against a
279 mean landholding size of 1.5 ha indicates that smallholders perceive the crop as a potential cash
280 crop. Above 50% of farmers possessed mobile phones and had access to market information from
281 different sources. On average, the farmers take one and a half hours to travel to the nearest output
282 market, and 14% of them reside in areas with poor road conditions.

283

284 The poor road conditions and the long time that smallholders take to reach markets imply that they
285 incur more transportation costs, negatively affecting marketed surplus. A small percentage of the
286 farmers (18%) had access to seed loans, while most of them (84%) had access to extension
287 services. The small percentage of farmers who had access to seed loans shows that most of them
288 still face challenges to access better quality seeds. The percentage of smallholders that were aware

289 of improved groundnut varieties was 63%. Most smallholders (97%) sold their produce to mobile
 290 grain buyers.

291

292 Table 2: Socio-economic characteristics of smallholder groundnut producers (n=416)

<i>Dependent Variables</i>	Mean	Std. Dev.	Min	Max
Demand for Improved Varieties	0.411	0.493	0	1
Marketed Surplus	0.738	0.440	0	1
<i>Independent Variables</i>				
<i>Socio-economic Characteristics</i>				
AGERES	45.957	12.869	20	82
AGERESSQD	2277.231	1243.837	400	6724
PCWORK	0.433	0.496	0	1
OXCART	0.306	0.251	0	1
PGNUTHA	0.333	0.323	0.025	6.075
YIELD	892.429	537.049	49.180	2926.829
SEEDCOST	8.042	4.591	-4.605	11.711
<i>Market Access</i>				
OUTPUTMAKINFOR	0.596	0.491	0	1
MOBP	0.548	0.498	0	1
<i>Institutional Factors</i>				
SEEDLOAN	0.180	0.385	0	1
EXTS	0.841	0.366	0	1
SEEDMULT	0.632	0.483	0	1
PRDBUYERS	0.974	0.160	0	1
<i>Transaction Costs Factors</i>				
RODST	0.142	0.349	0	1
DISTMARKT	1.498	3.754	-4.605	5.991

293 Source: Farm household survey data (2017); n=Total sample size

294

295 **3.2 Farm Household Utilization of Groundnut Harvested in 2015/16**

296
 297 Table 3 presents farm household utilization of groundnut they harvested in the 2015/16 growing
 298 season. The mean productivity (yield per hectare) of the groundnut was about 890 kg ha⁻¹. The
 299 yield is slightly above what was previously reported (Simtowe *et al.*, 2010; Siambi *et al.*, 2015).
 300 Farm households' average commercialization index, which is the marketed surplus, was 0.58. The
 301 mean consumption and seed recycling indices were at 0.24 and 0.18, respectively. As indicated,
 302 the household commercialization index (HCI), the marketed surplus, was higher than what
 303 previous empirical literature observed (Gourichon and Mkomba, 2014). The change in the farmers'
 304 production orientation explains the increase in the marketed surplus.

305
 306 Table 3: Utilization of groundnut produced by smallholders in the study areas (n = 416)

Quantity of Groundnut	Min.	Max.	Mean	Std. Dev.
Total production (kgs)	15.00	2500.00	402.820	376.077
Productivity (kg ha ⁻¹)	49.18	2926.83	892.429	537.049
Marketed Surplus	0.00	1.00	0.580	0.270
Seed Index	0.00	1.00	0.180	0.156
Consumption Index	0.00	1.00	0.240	0.216

307 Source: Farm household survey (2017); n= Total sample size

308
 309 Over a decade ago, groundnut producers in Malawi consumed more of the harvest than what they
 310 sold (Diop *et al.*, 2004; Gourichon and Mkomba, 2014). During the same period, low-yielding
 311 varieties dominated the production system (Minde *et al.*, 2008). The increase in marketed surplus
 312 and household commercial index for groundnuts in Tables 2 and 3 suggests that the smallholders
 313 cultivate relatively more improved varieties than they previously did.

314

315 3.3 Impact of Marketed Surplus on-Demand for Improved Varieties

316
317 Table 4 shows the impact of the marketed surplus on-demand for improved varieties of groundnuts.
318 Parameters that summarize the impact of marketed surplus on-demand for improved varieties
319 appear in column 1 of the Table, while their mean effects are in column 3. The results in the Table
320 show that the probability of demand for improved varieties increased by 40% among smallholders
321 with a marketed surplus (ATET). Conversely, for smallholders that did not have a marketed
322 surplus (ATU), the probability of demand for improved varieties declined by 14%. Furthermore,
323 the average effect of marketed surplus on the probability to demand improved varieties among
324 smallholders picked at random in the population (ATE) increased by about 30%. The average
325 effect of marketed surplus on the probability for smallholders in the margin of increasing marketed
326 surplus (MTE) to demand improved groundnuts increased by 26%. The study's findings suggest
327 that marketed surplus had positive effects on increasing demand for improved groundnut varieties.
328

329 Table 4: Effect of marketed surplus on-demand for improved varieties

Variable	Obs.	Mean	Std. Dev.	Min	Max
ATET	307	0.407	0.185	-0.980	0.783
ATU	108	-0.141	0.292	-0.904	0.332
ATE	416	0.264	0.195	-0.980	0.759
MTE	100	0.295	0.043	0.224	0.372

330 Source: Output from data analysis

331
332 The positive impact of marketed surplus on-demand for improved varieties is a manifestation that
333 the farmers who are inclined to participate in the market demand relatively more high-yielding
334 varieties than those who do not participate. The current study's findings are consistent with Wale
335 and Holm-Mueller (2017), who suggest that farmers who get income mainly from crop production

336 demand high yielding improved crop varieties. Similarly, Derlagen and Phiri (2012) indicated that
337 improved varieties of groundnuts are relatively more superior in yield to conventional ones. Thus,
338 for increased marketable surplus and the desire to intensify market participation, crop producers
339 would indeed demand improved crop varieties.

340

341 **3.4 Estimates of Endogenous Switching Probit Regression**

342

343

344 The ESP model's estimated results (Table 5) showed that the Wald chi-squared was highly
345 significant, suggesting the joint explanatory power of independent variables on the selection's
346 response variables and outcome equations. The ρ estimates indicate that the errors' correlation is
347 significantly different from zero at about a 5% level, indicating the unobserved covariates'
348 dependence in the two equations. Therefore, unobservable covariates in the equations for the
349 smallholders' marketed surplus and demand for improved varieties are associated, hence
350 estimating the equations jointly.

351

352 **3.5 Determinants of Marketed Surplus for Smallholder Groundnut Producers**

353

354 In the treatment effect framework, only determinants of the response variable of the selection
355 equation are relevant. Therefore, Table 5 reports the factors that determine the marketed surplus,
356 which is the treatment response variable, of this study. The results in the Table show that socio-
357 economics and market access factors had positive effects on marketed surplus.

358

359 **3.5.1 Socio-economic factors**

360

361 The proportion of land allocated to groundnut positively affected marketed surplus at a 1%
362 significance level.

363 Table 5: Estimates of determinants of marketed surplus for groundnuts (n=416)

Variables	Coef.	Std. Err	Z Score	P >Z
CONSTANT	-1.846	1.086	-1.700	0.089
<i>Socio-economic factors</i>				
AGERESP	0.019	0.041	0.460	0.643
AGERESPSQD	0.000	0.000	-0.650	0.514
PGNUTHA	2.105***	0.584	3.610	0.000
YIELD	0.001***	0.000	6.800	0.000
PCWORK	0.353**	0.155	2.270	0.023
OXCART	0.383	0.374	1.020	0.306
SEEDCOST	0.015	0.017	0.890	0.376
<i>Market access factors</i>				
OUTPUTMAKTINFOR	0.242*	0.136	1.780	0.075
MOBP	0.165	0.158	1.050	0.294
DISTRICT_DUMM	-0.101	0.261	-0.390	0.697
DISTMARKT	0.012	0.021	0.580	0.561
<i>Institution factors</i>				
PRDBUYERS	0.081	0.397	0.200	0.838
SEEDLOAN	-0.273	0.202	-1.350	0.177
EXTS	-0.037	0.212	-0.170	0.862
SEEDMULT	0.152	0.195	0.780	0.435
Number of Observations: 416		Wald Chi2(15)=80.5		
Log likelihood =-434.765		Prob>Chi2=0.000		
/athrho1		0.422(0.977)		
/athrho0		-13.043(506.626)		
Rho1		0.399(0.821)		
Rho0		-1.000(9.50e-09)		
Likelihood Ratio test of Independent equations rho1=rho0=0				
Chi2(2)=5.69		Prob> Chi2=0.058		
*, **, *** : Significance at 10%, 5%, 1%				

364 Source: Farm household survey data (2017), n=Total sample size

365 The positive effect of this coefficient estimate on marketed surplus suggests that as land for crop
 366 cultivation increases, crop production also increases. Similary, FAOSTAT (2021) reports that
 367 when the land area for cultivation of groundnuts increased, the crop's production increased by 21%

368 between 2001 and 2010. Further, Goyal and Berg (2004), Chinn (1976), and Belayneh *et al.* (2018)
369 attest to the positive effect of cultivated land area on marketed surplus. To this end, Bardhan (1970)
370 observed that the increase in production also entails an increase in marketed surplus. With
371 increased production, producers would have sufficient for consumption as well as for sale.
372 However, the expansion of land for the cultivation of crops is not feasible at the current moment
373 with the increase in the country's population (Malawi-Government, 2018). In this case, farmers
374 may reduce land for some crops and reallocate to those with high market demand at a particular
375 point in time.

376
377 Further results show that the coefficient estimates of the yield of groundnuts positively affected
378 marketed surplus at a 1% significance level. In Malawi, groundnut is an essential income source
379 (Minde *et al.*, 2008; Simtowe *et al.*, 2010; Makoka, 2012). In this case, an increase in marketed
380 surplus is a prerequisite for the farm households to increase the quantity of commodities they
381 would sell (Bardhan, 1970; Barrett, 2008; Belayneh *et al.*, 2018; Lemi, 2020). To increase yield,
382 hence marketed surplus, requires that farm households use high productive farm inputs or practice
383 good crop husbandry (Chinn, 1976; Baba *et al.*, 2010). The use of improved varieties and reduction
384 in pre-harvest losses, timely crop harvest could contribute to yield increase and marketed surplus.

385
386 In other results, smallholders' involvement in piece work jobs was positive and affected marketed
387 surplus at a 5% significance level. However, the current study's findings on the positive effects of
388 piece work jobs and the increased marketed surplus are unexpected. By undertaking the piece
389 work, farm households experience reduced labour availability at their farms (Whiteside, 2000),
390 thus negatively affecting production and reducing the marketed surplus. Furthermore, farm

391 households use the income from piece work jobs to meet other home necessities (Ralitza *et al.*,
392 2010). Therefore, such income cannot be available to purchase productive farm inputs. Further,
393 households' wages from piecework jobs are always low (Ralitza *et al.*, 2010), making such income
394 inadequate for investment on the farm. However, the current study's finding suggests that farm
395 households opted to be paid in kind (farm inputs), which increased crop yields. Also, the
396 households might have undertaken the piecework jobs during off-peak periods of labour demand
397 in their fields which never affected them.

398

399 **3.5.2 Market access factors**

400

401 Access to market information positively affected marketed surplus at a 10% significance level. In
402 Malawi, farmers access market information from different sources, namely, extension agents,
403 farmer organizations, fellow farmers, and produce buyers. The expectation is that farmers with
404 access to various information sources would increase marketed surplus due to reduced market
405 transaction costs. Without access to market information, farm households would incur search costs
406 in finding the market of their produce through personal visits to the markets. Similarly, Omiti *et*
407 *al.* (2009) and Bukul and Washo (2018) suggest that access to market information increased market
408 participation intensity, increasing the marketed surplus among the smallholders in Kenya's peri-
409 urban areas and Ethiopia respectively.

410

411 **4 CONCLUSION AND POLICY IMPLICATIONS**

412

413 The study employed the Endogenous Switching Probit model to investigate the effect of marketed
414 surplus on-demand for improved varieties of groundnuts among smallholder groundnut producers
415 in Malawi. The ESP model was preferred to other econometrics models, such as the endogenous

416 switching regression because both the selection and outcome equations had response variables
417 which were binaries. The study also determined the factors that affect marketed surplus. The study
418 results indicated that despite groundnut production and productivity not changing much for over a
419 decade, the average commercialization index for groundnuts was higher than previously reported.
420 The ESP estimates results showed that increased marketed surplus positively impacted the demand
421 for improved varieties among the smallholders. In addition, the demand for improved varieties of
422 groundnuts increased among farmers that were inclined to increase marketed surplus. The positive
423 impact of marketed surplus on-demand for improved varieties suggests that farmers who want to
424 increase the intensity to participate in the market put more value on high-yielding traits of
425 groundnuts than any other varietal attributes.

426
427 Conversely, the demand for improved varieties among the farmers that had no marketed surplus
428 declined. The reduction in demand for improved varieties among smallholders with no marketed
429 surplus suggests that production for this category of farmers was purely for subsistence. Other
430 findings suggest that increased crop and land productivity, smallholders' engagement in off-farm
431 economic activities, and enhanced access to market information are critical for the marketed
432 surplus to trigger demand for improved groundnut varieties. The study's findings have policy
433 implications on the output market's performance as a catalyst to increase the demand for improved
434 varieties. Thus, policy interventions should not only focus on the input market but also on the
435 challenges farmers encounter in the output market that financially capacitates them to meet the
436 cost of improved seeds.

437
438

439 **DECLARATIONS**

440

441 **Availability of Data and Materials**

442

443 The data supporting the findings for this study can be obtained upon request from the
444 corresponding author.

445

446 **Competing Interests**

447 The authors declare that they have no competing interests.

448

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455

456 **Author's Contributions**

457 AK: Conceptualized the idea, handled the data analysis and the discussion of the results and
458 approved the final manuscript.

459

460 EWZ: Provided guidance from the research's conceptualization, data collection, analysis, and
461 discussion of the result and read and approved the final manuscript.

462

463 GFO: Proofread the manuscript to ensure its quality and approved the final manuscript.

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483
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488
489 **Ethics Approval and Consent to Participate**

490
491 The study received ethical clearance from the hosting institution (University of KwaZulu Natal)
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493
494 **Consent for Publication**

495 Not Applicable

496

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