



Feeding the world while reducing farmer poverty? Analysis of rice relative yield and labour productivity gaps in two Beninese villages

Paresys, L., Saito, K., Dogliotti, S., Malézieux, E., Huat, J., Kropff, M. J., & Rossing, W. A. H.

This is a "Post-Print" accepted manuscript, which has been published in "European Journal of Agronomy"

This version is distributed under a non-commercial no derivatives Creative Commons



(CC-BY-NC-ND) user license, which permits use, distribution, and reproduction in any medium, provided the original work is properly cited and not used for commercial purposes. Further, the restriction applies that if you remix, transform, or build upon the material, you may not distribute the modified material.

Please cite this publication as follows:

Paresys, L., Saito, K., Dogliotti, S., Malézieux, E., Huat, J., Kropff, M. J., & Rossing, W. A. H. (2018). Feeding the world while reducing farmer poverty? Analysis of rice relative yield and labour productivity gaps in two Beninese villages. *European Journal of Agronomy*, 93, 95-112. DOI: 10.1016/j.eja.2017.10.009

You can download the published version at:

<https://doi.org/10.1016/j.eja.2017.10.009>

1 **Feeding the world while reducing farmer poverty? Analysis of rice relative yield and**  
2 **labour productivity gaps in two Beninese villages**

3

4 Paresys, Lise<sup>1,2\*</sup>, Saito, Kazuki<sup>4</sup>, Dogliotti, Santiago<sup>3</sup>, Malézieux, Eric<sup>2</sup>, Huat, Joël<sup>2,4</sup>, Kropff,  
5 Martin J.<sup>5,6</sup>, Rossing, Walter A.H.<sup>1</sup>

6

7 <sup>1</sup> Farming Systems Ecology, Wageningen University, PO Box 430, 6700 AK Wageningen,  
8 The Netherlands. lise.paresys@wur.nl. walter.rossing@wur.nl

9 <sup>2</sup> CIRAD, UPR HORTSYS, F-34398 Montpellier, France. eric.malezieux@cirad.fr.  
10 joel.huat@cirad.fr

11 <sup>3</sup> Departamento de Producción Vegetal, Facultad de Agronomía, Universidad de la  
12 República, Av. Garzón 780, 11200 Montevideo, Uruguay. ssandog@gmail.com

13 <sup>4</sup> Africa Rice Center (AfricaRice), 01 B.P. 2031, Cotonou, Benin. K.Saito@cgiar.org

14 <sup>5</sup> Crop Systems Analysis, Wageningen University, PO Box 430, 6700 AK Wageningen, The  
15 Netherlands

16 <sup>6</sup> CIMMYT, Apdo. Postal 6-641 06600 México, D.F., México. M.KROPFF@cgiar.org

17

18 \* Corresponding author

19

20 **Abstract**

21

22 Improvements in agricultural land and labour productivity are needed to meet the  
23 growing food demand and reduce farmer poverty in sub-Saharan Africa. The objectives of  
24 this study were to (i) quantify variation in labour inputs, yield and labour productivity among  
25 rice fields; (ii) elicit factors associated with this variation; and (iii) identify opportunities for  
26 improving yield and labour productivity. The study was carried out in two contrasting  
27 Beninese villages: Zonmon in the south and Pelebina in the north-west.

28 In Zonmon 82 irrigated rice fields were surveyed during the 2013 and 2014 dry  
29 seasons. In Pelebina 50 rainfed lowland rice fields were surveyed over three rainy seasons  
30 (2012-2014). Data on farmer field management practices and field conditions were recorded  
31 through interviews with farmers, on-farm observations and measurements. Stepwise  
32 regression analyses were used to identify variables associated with variation in yield, labour  
33 inputs and labour productivity.

34 Average yields were  $4.8 \pm 2.0$  t ha<sup>-1</sup> in Zonmon and  $2.3 \pm 1.2$  t ha<sup>-1</sup> in Pelebina.  
35 Average labour productivity, however, was larger in Pelebina (17 kg of paddy rice person-  
36 day<sup>-1</sup>) than in Zonmon (8 kg of paddy rice person-day<sup>-1</sup>). Relative yield gaps (43-48%) and  
37 labour productivity gaps (59-63%) were similar in the villages. There was no trade-off  
38 between yield and labour or labour productivity within the villages, suggesting that in many  
39 cases rice yields can be increased without additional labour inputs. The major labour-  
40 demanding farming operations were bird scaring in Zonmon and harvesting and threshing in  
41 Pelebina.

42 We identified opportunities to improve rice yield and labour productivity, given current  
43 farmer knowledge and resource endowment. Based on the statistical models fitted per  
44 village, increasing the average hill density would result in up to 1.2 t ha<sup>-1</sup> more yield, and up  
45 to 4 kg person-day<sup>-1</sup> greater labour productivity for Zonmon. Increasing the average field size  
46 and avoiding rice shading would result in up to 0.8 t ha<sup>-1</sup> more yield, and up to 17.1 kg  
47 person-day<sup>-1</sup> greater labour productivity for Pelebina. Further enhancing yield and labour  
48 productivity will require (i) introducing small-scale mechanisation and other labour-saving  
49 innovations, in particular for labour-demanding farming operations such as bird scaring in  
50 Zonmon and harvesting and threshing in Pelebina; and (ii) combining analyses of yields and  
51 labour productivities at field level with detailed analyses of labour use and labour productivity  
52 at farm level. We found that, on average, one hectare in Zonmon contributed twice as much  
53 to Beninese rice production than one hectare in Pelebina but with a two times smaller reward  
54 for farmer labour. This paradox of higher yields but lower labour productivity in such different

55 rice growing environments and farming systems should be addressed in elaborating  
56 development policies.

57

## 58 **Keywords**

59 Rice; Yield gap; Labour productivity gap; Management practices; Labour-saving technologies

60

## 61 **1. Introduction**

62

63 The first and the second Sustainable Development Goals address eradicating  
64 extreme poverty and achieving global food security by 2030. Achieving these goals requires  
65 improvement in agricultural land and labour productivity as a source of growth based on  
66 agriculture and improvement of farmers' livelihoods (Byerlee et al., 2008; Thirtle et al., 2003;  
67 UN, 2015a). This is especially the case for sub-Saharan Africa, which was identified as  
68 particularly affected by extreme poverty and undernourishment (UN, 2015b). Many recent  
69 studies focused on land productivity, i.e., crop yield gaps (Anderson et al., 2016; Beza et al.,  
70 2017; Hengsdijk and Langeveld, 2009; Ittersum et al., 2013; Silva et al., 2017; Stuart et al.,  
71 2016), while largely ignoring labour input and labour productivity. With growing land scarcity,  
72 increasing yield is needed to meet the growing food demand (Conceição et al., 2016; Koning  
73 et al., 2008; Nonhebel and Kastner, 2011). Increases in land productivity should, however,  
74 be accompanied by and may in specific cases be subsidiary to increases in farmer labour  
75 productivity as a key to reducing farmer poverty.

76 Labour productivity is commonly measured as the gross margin per worked hour or  
77 person-day (8-hour day) or approximated as the gross margin per worker (Byerlee et al.,  
78 2008; Freeman, 2008; ILO, 2015). In sub-Saharan Africa, 65% of the labour force is involved  
79 in agriculture (ILO, 2008) and agricultural labour productivity is the lowest in the world  
80 (Byerlee et al., 2008; Haggblade and Hazell, 2010; Thirtle et al., 2003; van den Ban, 2011).  
81 Low labour productivity in this region was attributed to low yields (Tittonell and Giller, 2013)  
82 and high labour requirements due to lack of use and access to animal or fuel-based

83 mechanisation (Ashburner and Kienzle, 2011; Diao et al., 2016, 2014; Fonteh, 2010; Houmy  
84 et al., 2013; Onwude et al., 2016).

85           Increasing labour productivity may have several impacts. When labour rather than  
86 land is a major limiting factor for crop production, improvement in labour productivity may  
87 allow (i) an increase in the cultivated area by the family as a whole, which is an important  
88 determinant of farm income and food security (Sender and Johnston, 2004; Tiftonell and  
89 Giller, 2013); (ii) an increase in area cultivated by individual household members, which  
90 determines individual development opportunities (Paresys et al., 2016); and/or (iii) a  
91 decrease in casual labour use and its associated costs (Diao et al., 2016; Leonardo et al.,  
92 2015). In a context of lack of good off-farm job opportunities, increased labour productivity  
93 may allow poor farmers not to sell their labour to other farms, getting them out of 'poverty  
94 traps' (Tiftonell, 2014). Improvement in labour productivity may also simply free up time and  
95 improve farmer health and quality of life (De and Sen, 1992; Netting, 1993). Finally, it may  
96 free children from labour in favour of schooltime thus improving their future opportunities  
97 (Byerlee et al., 2008; Ellis and Freeman, 2016; Frelat et al., 2016; van den Ban, 2011; van  
98 der Ploeg, 2008; Woodhouse, 2010).

99           Rice is the most important food crop of the developing world and the staple food of  
100 more than half of world's population (Seck et al., 2012). In sub-Saharan Africa, rice  
101 consumption is growing fast and rice production needs to be increased in order to decrease  
102 or at least halt the increase in country dependencies on food imports (Demont, 2013; Saito et  
103 al., 2014). Increasing rice production is possible through increasing rice yield and through  
104 expansion of the area cultivated in wetlands, which are currently underexploited (Saito et al.,  
105 2013). This is the case for Benin, where by 2009 only between 12 and 15% of arable  
106 wetlands were under rice cultivation (Diagne et al., 2013; Gruber et al., 2009). Benin has one  
107 of the largest untapped potentials for irrigation in sub-Saharan Africa (Saito et al., 2013; Seck  
108 et al., 2012; You et al., 2011).

109           Wetland crops, rice included, are labour-demanding (Balasubramanian et al., 2007;  
110 Guirkingner et al., 2015; Selim, 2012). A recent study in two villages in Benin showed that

111 labour availability constrains farm expansion in wetlands (Paresys et al., 2018). Land was not  
112 a limiting factor in these two villages. Consequently farmers tended to adopt land-demanding  
113 and labour-saving production activities: they maximized labour productivity by giving priority  
114 to upland crops rather than to wetland crops. Improving labour productivity on rice fields  
115 would stimulate the expansion to wetlands (Paresys et al., 2018). In order to understand the  
116 main causes of variability in yield, labour input and labour productivity among rice fields, and  
117 to identify opportunities for improving yield and labour productivity, we collected and  
118 analysed detailed survey data from rice fields of two Beninese case-study villages  
119 contrasting in terms of rice growing environments.

120

## 121 **2. Materials and methods**

122

### 123 *2.1. Case-study villages*

124

125 The selection of villages was based on a rapid regional assessment of the various  
126 wetland agro-ecosystems from south to north in Benin. Two case-study villages were  
127 selected that were close to an urban market and experienced markedly different agro-  
128 ecological and socio-economic conditions; Zonmon in the south and Pelebina in the north-  
129 west (Paresys et al., 2018). Farming systems and types of farms differed greatly between  
130 villages.

131 In Zonmon, food production mainly involved maize and cash crops included  
132 groundnut and rice. Based on data from a random sample of 38% of farms, rice accounted  
133 for 14% of the total farmed area during the 2012-2013 agricultural season (Paresys et al.,  
134 2018). Area under rice was a key distinguishing factor among farm types. Larger areas were  
135 found in the wealthier farms, i.e., in farms with larger labour availability, particularly due to  
136 hired labour.

137 In Pelebina, food production involved tubers (yam and cassava) and cereals (maize  
138 and sorghum). Cash crops mainly included cotton, soya and groundnut. Based on data from

139 a random sample of 34% of farms, rice accounted for 1% of the total area farmed during the  
140 2012-2013 agricultural season (Paresys et al., 2018). The area under rice was not a key  
141 distinguishing factor among farm types.

142 The access to inputs for rice cultivation and the rice growing environments differed  
143 between villages (Figure 1). In Zonmon, agricultural services provided farmers with improved  
144 seeds (IR841) and credits for fertilizers and casual labour. Rice was mainly cultivated in the  
145 bottom and lower fringes of one lowland with a mixed flood regime, i.e., subjected to both  
146 rainwater runoff and floodwater of the Oueme river (Figure 2). The rice cropping season  
147 started at the end of January, i.e., in the middle of the dry season and ended in mid-May, i.e.,  
148 in the middle of the long rainy season. An irrigation scheme had been developed in 1975  
149 under the Benin-China cooperation (Djagba et al., 2014). Although operated and maintained  
150 with difficulty by farmers (Totin et al., 2012), this scheme allowed intermittent irrigation from  
151 stream water on rice fields.

152 In Pelebina, rice seeds were either bought on local markets or self-produced. Original  
153 variety names could not be identified. Rice fields were scattered across 11 different lowlands.  
154 The rice cropping season started at the end of June, i.e., at the beginning of the rainy season  
155 and ended at the beginning of December, i.e., at the beginning of the dry season. Water on  
156 rice fields was not controlled.

157

## 158 *2.2. Field survey*

159

160 We determined the total number of farms for each village with the help of village  
161 authorities using social mapping (Rim and Rouse, 2002): 134 farms in Zonmon and 146  
162 farms in Pelebina (Paresys et al., 2018). In Pelebina, we surveyed all rice fields found in the  
163 village during the 2012, 2013 and 2014 rainy seasons. In Zonmon, we surveyed all rice fields  
164 in a random sample of 21 farms during the 2013 and 2014 dry seasons. In total, we surveyed  
165 50 rice fields found in 26 farms in Pelebina and 82 rice fields found in 21 farms in Zonmon  
166 (Table 1).

167

168

**Table 1: Number of farms, farmers and rice fields sampled**

169

**for each studied season and over the study period.**

	Zonmon		2012 rainy season	Pelebina	
	2013 dry season	2014 dry season		2013 rainy season	2014 rainy season
Number of farms	18	13	18	12	8
Number of farmers	22	14	23	16	8
Numer of rice fields	61	21	23	19	8
Total number of farms	21			26	
Total number of farmers	21			34	
Total number of rice fields	82			50	

170

171 At the start of the growing season, we conducted semi-structured interviews with  
 172 farmers to (i) identify whether rice fields were family rice fields, i.e., fields controlled by the  
 173 family management unit to satisfy family needs, or individual rice fields, i.e., fields controlled  
 174 by one family member to satisfy individual needs (Paresys et al., 2018); (ii) evaluate their  
 175 experience with rice cultivation; (iii) identify the soil type and the flooding period (by rainwater  
 176 runoff in Zonmon and Pelebina as well as floodwater of the Oueme river in Zonmon) on  
 177 fields; and (iv) identify the preceding crop.

178 During the growing season, we conducted semi-structured interviews with farmers on  
 179 a bimonthly basis to monitor their management practices, evaluate the duration and timing of  
 180 farming operations as well as to identify the workers involved in each farming operation until  
 181 harvest. We cross-validated interview data by our own on-field observations.

182 On each field, we staked five randomly selected 1 × 1 m plots after transplanting (in  
 183 Zonmon) or sowing (in Pelebina) for additional observations and to estimate rice yield. We  
 184 made observations at harvest, including hill density; weed cover below the rice canopy; weed  
 185 cover above the rice canopy; rat damage; bird damage; and water level. Weed cover was  
 186 scored from 0 to 4 using the following classes: no weeds (0); weed cover below 10% (1, low  
 187 infestation); weed cover between 10 and 30% (2, moderate); weed cover between 30 and  
 188 60% (3, high); weed cover above 60% (4, very high). We harvested plots at the same time as  
 189 fields were harvested by farmers and we weighed rice total aboveground biomass using a

190 hand-held scale. We estimated filled grain weight and grain moisture content on a subsample  
191 of about 1 kg.

192

### 193 *2.3. Calculations and statistical analyses*

194

195 Rice yields were corrected to 14% moisture content. Labour productivity was  
196 calculated as the ratio of the yield to the amount of labour used in person-days (8-hour days).  
197 Relative yield and labour productivity gaps (Ernst et al., 2016) were estimated for each  
198 village following Stuart et al. (2016) and Tanaka et al. (2015):

199

$$200 \text{ Relative yield gap} = (Y_L - Y_A) / Y_L \quad (1)$$

201

$$202 \text{ Relative labour productivity gap} = (LP_L - LP_A) / LP_L \quad (2)$$

203

204 where  $Y_L$  and  $LP_L$  are the locally attainable yield and labour productivity levels defined as the  
205 average yield and labour productivity of the highest decile;  $Y_A$  and  $LP_A$  are the average yield  
206 and labour productivity from the full sample of rice fields; and  $Y_L - Y_A$  and  $LP_L - LP_A$  are the  
207 exploitable yield and labour productivity gaps.

208 Stepwise regression analyses with Bayes Information Criterion (BIC) were used to  
209 select and identify variables associated with variation in labour for each (group of) farming  
210 operation(s) as well as variables associated with variation in yield. Candidate independent  
211 variables for each regression analysis are displayed and numbered in Table 2. Regression  
212 models used in stepwise procedures are displayed in Appendix A. Variables identified by  
213 stepwise procedures were subsequently used as candidate independent variables to identify  
214 variables associated with variation in labour productivity (Figure 3). When necessary, Box-  
215 Cox transformation of the dependent variable was performed to satisfy normality  
216 assumptions and homogeneity of variance of residuals (Barker and Shaw, 2015; Box and  
217 Cox, 1964). Collinearity diagnoses were performed according to Belsley's guide (1991).

Table 2: Candidate independent variables for regression analyses of rice yield and labour use in Zonmon and Pelebina.

Means  $\pm$  standard deviations are displayed for continuous variables while proportions are displayed for categorical variables. Reference categories are indicated in italics.

Zonmon				Pelebina			
			n				n
X <sub>1</sub>	Field size (ha)	0.14 $\pm$ 0.20	82	X <sub>1</sub>	Field size (ha)	0.19 $\pm$ 0.14	50
	Preceding crop				Preceding crop		
	<i>Rice</i>	40	33	X <sub>2</sub>	Tubers	54	27
X <sub>2</sub>	Fallow	29	24		<i>Rice</i>	32	16
X <sub>3</sub>	Market gardening	28	23	X <sub>3</sub>	Fallow	6	3
X <sub>4</sub>	Other (maize, sugercane)	2	2	X <sub>4</sub>	Market gardening	8	4
	Residues management				Residues management		
	<i>Exported</i>	78	64		<i>Incorporated</i>	56	28
X <sub>5</sub>	Burned	18	15	X <sub>5</sub>	Burned	34	17
X <sub>6</sub>	No residues	4	3	X <sub>6</sub>	Exported	10	5
					Herbicide application prior to land preparation		
				X <sub>7</sub>	<i>Yes</i>	34	17
					<i>No</i>	66	33
	Land preparation method				Land preparation method		
	<i>Tillage +puddling</i>	73	60		<i>Mound breaking</i>	52	26
X <sub>7</sub>	No land preparation	16	13	X <sub>8</sub>	Tillage	42	21
X <sub>8</sub>	Tillage	4	3	X <sub>9</sub>	Ridging	2	1
X <sub>9</sub>	Puddling	7	6	X <sub>10</sub>	No land preparation	4	2
					Sowing method		
					<i>Hill sowing</i>	90	45
				X <sub>11</sub>	Broadcasting	6	3
				X <sub>12</sub>	Sowing in rows using a rope	4	2
X <sub>10</sub>	Plant age at transplanting (days)	16 $\pm$ 7	82				
X <sub>11</sub>	Transplanting date (Julian days)	30 $\pm$ 38	82	X <sub>13</sub>	Sowing date (Julian days)	174 $\pm$ 29	50
X <sub>12</sub>	Hill density (hills m <sup>-2</sup> )	26 $\pm$ 5	82	X <sub>14</sub>	Hill density (hills m <sup>-2</sup> )	14 $\pm$ 6	50
	First weeding date (DAT)				First weeding date (DAS)		
X <sub>13</sub>	No weeding	9	7	X <sub>15</sub>	No weeding	6	3
X <sub>14</sub>	10-20	12	10	X <sub>16</sub>	0-20	18	9
	20-30	33	27	X <sub>17</sub>	20-40	22	11
X <sub>15</sub>	30-40	23	19	X <sub>18</sub>	40-60	38	19
X <sub>16</sub>	> 40	23	19	X <sub>18</sub>	> 60	6	3
	Frequency of weeding				Frequency of weeding		
X <sub>17</sub>	No weeding	9	7	X <sub>19</sub>	No weeding	6	3
	<i>Hand-weeding once</i>	57	47		<i>Hoe-weeding once</i>	58	29
X <sub>18</sub>	Herbicide once	5	4	X <sub>20</sub>	Herbicide once	12	6
X <sub>19</sub>	Hand-weeding twice	12	10	X <sub>21</sub>	Hoe-weeding twice	10	5
X <sub>20</sub>	Herbicide once +Hand-weeding once	13	11	X <sub>22</sub>	Herbicide once +Hoe-weeding once	10	5
X <sub>21</sub>	Herbicide once +Hand-weeding twice	4	3	X <sub>23</sub>	Hoe-weeding three times	4	2
X <sub>22</sub>	Applied N (kg ha <sup>-1</sup> )	54 $\pm$ 45	82				
X <sub>23</sub>	Applied P (kg ha <sup>-1</sup> )	13 $\pm$ 14	82				
X <sub>24</sub>	Applied K (kg ha <sup>-1</sup> )	9 $\pm$ 10	82				
	First fertilizer application date (DAT)						
X <sub>25</sub>	No fertilizer application	11	9				
X <sub>26</sub>	0-20	6	5				
	20-40	35	29				
X <sub>27</sub>	40-60	35	29				
X <sub>28</sub>	> 60	12	10				
	Frequency of fertilizer application				Frequency of fertilizer application		
X <sub>29</sub>	No fertilizer application	11	9		<i>No fertilizer application</i>	96	48
	<i>Once</i>	65	53	X <sub>24</sub>	<i>Once</i>	4	2
X <sub>30</sub>	Twice	20	16				
X <sub>31</sub>	Three times	5	4				
	Partial netting						
	<i>Yes</i>	57	47				
X <sub>32</sub>	No	43	35				
X <sub>33</sub>	Casual labour (%)	30 $\pm$ 26	82	X <sub>25</sub>	Casual labour (%)	9 $\pm$ 19	50
X <sub>34</sub>	Harvesting date (Julian days)	132 $\pm$ 40	82	X <sub>26</sub>	Harvesting date (Julian days)	338 $\pm$ 12	50
X <sub>35</sub>	Rice cycle length (DAT)	103 $\pm$ 13	82	X <sub>27</sub>	Rice cycle length (DAS)	164 $\pm$ 27	50
	Type of management unit				Type of management unit		
	<i>Family</i>	77	63		<i>Family</i>	62	31
X <sub>36</sub>	Individual	23	19	X <sub>28</sub>	Individual	38	19
X <sub>37</sub>	Experience with rice cultivation (years)	2 $\pm$ 1	82	X <sub>29</sub>	Experience with rice cultivation (years)	10 $\pm$ 9	50

Sampling year				Sampling year			
2013				2012			
X <sub>38</sub>	2014	74	61	X <sub>30</sub>	2013	46	23
		26	21	X <sub>31</sub>	2014	38	19
						16	8
Soil type				Soil type			
X <sub>39</sub>	'Ado' (sandy-loam soil)	4	3	X <sub>32</sub>	'Burum' (sandy soil)	36	18
X <sub>40</sub>	'Veyssa' (sandy soil)	1	1	X <sub>33</sub>	'Vete' (sandy-clay soil)	56	28
	'Kozo holo' (loamy soil)	60	49		'Sewer' (loamy soil)	8	4
X <sub>41</sub>	'Kozo dide' (heavy clay soil)	35	29				
Flooding period				Flooding period			
X <sub>42</sub>	Never flooded	5	4	X <sub>34</sub>	Never flooded	30	15
	<i>Flooded from the long rainy season</i>	71	58		<i>Flooded during the rainy season</i>	70	35
X <sub>43</sub>	Flooded from the short rainy season	22	18				
X <sub>44</sub>	Always flooded ('Towewe' pond)	2	2				
Soil moisture at transplanting				Soil moisture at sowing			
	<i>Wet</i>	57	47	X <sub>35</sub>	Dry	2	1
X <sub>45</sub>	Standing water	43	35		<i>Wet</i>	92	46
				X <sub>36</sub>	Standing water	6	3
X <sub>46</sub>	Weed cover below the rice canopy at harvest (score)	1.2 ± 0.6	80	X <sub>37</sub>	Weed cover below the rice canopy at harvest (score)	2.1 ± 0.6	50
X <sub>47</sub>	Weed cover above the rice canopy at harvest (score)	0.4 ± 0.5	80	X <sub>38</sub>	Weed cover above the rice canopy at harvest (score)	0.5 ± 0.7	50
X <sub>48</sub>	Bird damage at harvest (% of panicles)	3.4 ± 4.3	82	X <sub>39</sub>	Bird damage at harvest (% of panicles)	3.7 ± 5.8	50
X <sub>49</sub>	Rat damage at harvest (% of panicles)	2.7 ± 4.4	82	X <sub>40</sub>	Rat damage at harvest (% of panicles)	1.4 ± 3.3	50
X <sub>50</sub>	Water level at harvest (cm)	9 ± 13	82	X <sub>41</sub>	Water level at harvest (cm)	0 ± 2	50

223

224 Differences in the amount of labour required for each (group of) farming operation(s)

225 were assessed using Friedman tests followed by Nemenyi tests. Differences in the average

226 total amount of labour required for rice production, yield and labour productivity between

227 villages were assessed using Kruskal-Wallis tests. Differences in recorded variables among

228 groups of rice fields (e.g., weed cover below and above the rice canopy associated with

229 different frequencies of weeding) were assessed using Kruskal-Wallis tests followed by Dunn

230 tests with Bonferroni as *p* value adjustment method.

231

### 232 3. Results

233

#### 234 3.1. Description of rice cropping systems

235

236 In Zonmon, rice cultivation started with field cleaning, i.e., clearing weeds and

237 residues of the preceding crop, together with bund making. In most fields, residues were

238 piled onto the bunds (Table 2). Subsequently, the land was usually prepared by combining

239 manual tillage and puddling. After land preparation, rice was transplanted. Farmers worked

240 on a field-by-field basis, resulting in a range of transplanting dates across their fields. On

241 average, farmers managed 2 fields with different transplanting dates and these fields were

242 usually adjacent to each other. The first weeding operation was completed within 40 days

243 after transplanting (DAT) in most fields. Weed control consisted of hand-weeding and/or

244 applying herbicide. A single hand-weeding operation was the most frequent weeding method.  
245 Fertilizers, comprising urea and/or a compound NPK fertilizer, were applied in most fields  
246 right after weeding and only once. Bird damage during the ripening phase was controlled by  
247 chasing away birds. From dawn until nightfall workers would scare the birds by shouting and  
248 running after them. Harvesting and threshing methods were manual for all farmers.

249 In Pelebina, rice cultivation started either with field cleaning and/or land preparation.  
250 In slightly more than half of the fields, rice was preceded by tubers (yam or cassava)  
251 cultivated on mounds and thus, weeds and/or crop residues could be directly incorporated  
252 into the soil while breaking the mounds (Table 2). Herbicides were used prior to land  
253 preparation in around one third of the fields. Rice was usually sown on hills, occasionally  
254 broadcasted or sown in rows and never transplanted. Weed control consisted of hoe-  
255 weeding and/or applying herbicide. A single hoe-weeding operation was the most frequent  
256 weeding method; herbicides were used in 44% of fields. No bird control activities were  
257 performed. Harvesting and threshing methods were manual for all farmers.

258

### 259 3.2. Variation in labour use

260

261 The average amount of labour required for rice production was 727 person-days ha<sup>-1</sup>  
262 in Zonmon and 168 person-days ha<sup>-1</sup> in Pelebina (Table 3), i.e., 4 times less than in Zonmon  
263 ( $p < 0.001$ ). Labour use in Zonmon varied from 267 to 2413 person-days ha<sup>-1</sup>, while in  
264 Pelebina it varied from 40 to 410 person-days ha<sup>-1</sup>. In Zonmon, bird scaring was the most  
265 labour-demanding operation, accounting for nearly half of the total labour input. Weeding  
266 was less labour-demanding than field cleaning and bund making, or than land preparation  
267 and transplanting (Table 3). In Pelebina, labour requirements were similar and relatively low  
268 for sowing and weeding, and intermediate for field cleaning and land preparation.

269

270

**Table 3: Labour requirement (average  $\pm$  standard deviation) for each (group of) farming operation(s). Medians are**

271

**displayed in italics. Different letters indicate differences in labour requirements among farming operations at the 5% level.**

Farming operation	Zonmon					Farming operation	Pelebina				
	% of total	Labour (person-days ha <sup>-1</sup> )		Casual labour (person-days ha <sup>-1</sup> )			% of total	Labour (person-days ha <sup>-1</sup> )		Casual labour (person-days ha <sup>-1</sup> )	
		Mean $\pm$ SD	Median	Mean $\pm$ SD	Median			Mean $\pm$ SD	Median	Mean $\pm$ SD	Median
Field cleaning +bund making	15	109 $\pm$ 88	89 c	60 $\pm$ 72	28 c	Field cleaning +land preparation	23	39 $\pm$ 28	32 bc	6 $\pm$ 12	0 a
Land preparation +transplanting	17	126 $\pm$ 78	115 c	74 $\pm$ 75	58 c	Sowing	18	31 $\pm$ 26	21 b	1 $\pm$ 6	0 a
Weeding	9	66 $\pm$ 61	50 b	29 $\pm$ 49	0 b	Weeding	22	36 $\pm$ 34	26 b	0 $\pm$ 1	0 a
Fertilizer application	0	2 $\pm$ 2	2 a	0 $\pm$ 0	0 a	Fertilizer application	0	0 $\pm$ 2	0 a	0 $\pm$ 0	0 a
Bird scaring	45	324 $\pm$ 280	240 d	49 $\pm$ 235	0 ab	Harvesting +threshing	37	62 $\pm$ 34	52 c	0 $\pm$ 0	0 a
Harvesting +threshing	14	100 $\pm$ 62	82 bc	20 $\pm$ 39	0 b	Total	100	168 $\pm$ 86	146	7 $\pm$ 16	0
Total	100	727 $\pm$ 352	667	231 $\pm$ 315	132						

272

273 In Zonmon, the amount of labour used for field cleaning and bund making was less (i)  
274 on fields where no residues were found compared to fields where residues were found and  
275 piled on bunds; (ii) on never-flooded fields compared to fields flooded from the beginning of  
276 the long rainy season; (iii) and on individual fields compared to family fields. The amount of  
277 labour used for field cleaning and bund making was positively related to the proportion of  
278 casual labour. The amount of labour used for land preparation and transplanting was less (i)  
279 on fields where land was not prepared compared to fields where tillage was combined with  
280 puddling; (ii) when farmers had more experience with rice cultivation and (iii) when fields  
281 were larger. Labour used for land preparation and transplanting increased on fields where  
282 there was no tillage and only puddling compared to fields where tillage was combined with  
283 puddling. Labour used for land preparation and transplanting was positively correlated to the  
284 proportion of casual labour. The amount of labour used for weeding was less (i) on fields  
285 where herbicides were applied once compared to fields that were hand-weeded once; and (ii)  
286 when fields were larger. More labour was required for weeding on fields where hand-weeding  
287 was done twice compared to once. Labour used for weeding was positively correlated to the  
288 proportion of casual labour. The amount of labour used for bird scaring was less (i) at greater  
289 hill density and (ii) when fields were larger. Labour used for bird scaring was more (i) on  
290 fields where rice was preceded by market gardening in the rotation, and (ii) on rice fields  
291 preceded by sugarcane or maize (other crops) compared to fields where rice was preceded  
292 by rice (Table 4). We found no effect of yield on the amount of labour used for harvesting and  
293 threshing. The amount of labour used for harvesting and threshing was less (i) in 2014

294 compared to 2013; (ii) when fields were larger; and (iii) at greater weed cover below the rice  
295 canopy.

296 In Pelebina, the amount of labour used for field cleaning and land preparation was  
297 lower (i) on individual fields compared to family fields; (ii) when fields were larger; and (iii) on  
298 fields where land was tilled compared to fields where mounds were broken. The amount of  
299 labour used for sowing was higher (i) on fields where rice was preceded by market gardening  
300 and (ii) on fields where rice was preceded by rice compared to fields where rice was  
301 preceded by tubers. The amount of labour used for weeding was lower (i) on individual fields  
302 compared to family fields; (ii) on fields on sandy soils compared to fields on sandy-clay soils;  
303 and (iii) when fields were larger. Labour used for weeding increased (i) on fields where hoe-  
304 weeding was done twice or (ii) three times compared to fields that were hoe-weeded once  
305 (Table 5). The amount of labour used for harvesting and threshing increased with yield ( $r^2 =$   
306  $0.09$ ,  $p < 0.05$ ) but we found no effect of candidate variables on this amount of labour.

307

### 308 3.3. Variation in rice yield

309

310 The average rice yield was  $4.8 \pm 2.0$  t ha<sup>-1</sup> in Zonmon and  $2.3 \pm 1.2$  t ha<sup>-1</sup> in Pelebina,  
311 i.e., half of that in Zonmon ( $p < 0.001$ ). Average yields of the top decile were 8.4 and  
312 4.4 t ha<sup>-1</sup>, resulting in a relative yield gap of 43 and 48% for Zonmon and Pelebina,  
313 respectively (Figure 4A). There was no clear relationship between labour use and yield in  
314 both villages ( $p = 0.27$  for Zonmon and  $p = 0.42$  for Pelebina). Yields were not higher at  
315 larger labour allocation to rice.

316 In Zonmon yields were higher (i) at greater hill density and (ii) on larger fields. Yields  
317 were lower (i) at higher rat damage; and (ii) at later harvesting dates (Table 4). The inclusion  
318 of weed cover below and above the rice canopy as explanatory variables in the regression of  
319 yield did not modify the above-mentioned results.

320 In Pelebina, yields were higher on fields where residues were burned or exported  
321 compared to fields where residues were incorporated into the soil; (ii) in 2014 compared to

322 2012; and (iii) when fields were larger. Yields were lower (i) on fields where land was not  
323 prepared compared to fields where mounds were broken; (ii) at greater weed cover above  
324 the rice canopy; (iii) at greater bird damage; and (iv) at later sowing dates (Table 5).

325

Table 4: Results of regression analyses for Zonmon. Reference categories are displayed in italics.

Asterisks indicate level of significance:  $p < 0.10$  (.),  $p < 0.05$  (\*),  $p < 0.01$  (\*\*),  $p < 0.001$  (\*\*\*)

	Field cleaning +bund making (person-days ha <sup>-1</sup> )	Land preparation +transplanting (person-days ha <sup>-1</sup> )	Weeding (person-days ha <sup>-1</sup> )	Bird scaring (person-days ha <sup>-1</sup> )	Harvesting +threshing (person-days ha <sup>-1</sup> )	Yield (kg ha <sup>-1</sup> )	Labour productivity (kg person-day <sup>-1</sup> )
Transformation	ln(Y +0,001)	ln(Y)	sqrt(Y)	ln(Y)	ln(Y)	sqrt(Y)	ln(Y)
Multiple R-squared	0.9191	0.6277	0.5973	0.4087	0.3133	0.3500	0.5656
Intercept	4.4798 ***	4.8000 ***	7.4194 ***	6.3990 ***	4.9830 ***	56.8950 ***	1.1780 **
Type of management unit ( <i>Family</i> )							
Individual	-0.5497 **						
Sampling year ( <i>2013</i> )							
2014					-0.6348 ***		
Experience with rice cultivation		-0.1632 ***					
Weed cover below the rice canopy					-0.2682 *		
Rat damage at harvest						-1.3333 ***	-0.0489 **
Field size		-0.0001 ***	-0.0004 *	-0.0002 ***	-0.0001 *	0.0016 *	0.0002 ***
Flooding period ( <i>Flooded from the long rainy season</i> )							
Never flooded	-1.3906 ***						
Flooded from the short rainy season	-0.1767						
Always flooded ( <i>Towewe'</i> pond)	0.6863						
Preceding crop ( <i>Rice</i> )							
Fallow					-0.0739		-0.1904
Market gardening					0.6246 ***		-0.7328 ***
Other					0.8087 *		-1.1820 **
Residues management ( <i>Exported</i> )							
Burned	-0.0289						
No residue	-11.6415 ***						
Land preparation method ( <i>Tillage +puddling</i> )							
No land preparation		-0.6049 ***					
Tillage		-0.1605					
Puddling		0.7433 ***					
Hill density					-0.0320 *	1.0023 **	0.0403 **
Frequency of weeding ( <i>Hand-weeding once</i> )							
No weeding				-7.7609 ***			
Herbicide once				-5.9860 ***			
Hand-weeding twice				3.5358 ***			
Herbicide once +Hand-weeding once				-0.7875			
Herbicide once +Hand-weeding twice				3.1703			
Harvesting date						-0.1041 **	
Casual labour	0.0075 *	0.0106 ***	0.0280 *				

Table 5: Results of regression analyses for Pelebina. Reference categories are displayed in italics.

Asterisks indicate level of significance:  $p < 0.10$  (.),  $p < 0.05$  (\*),  $p < 0.01$  (\*\*),  $p < 0.001$  (\*\*\*)

	Field cleaning +land preparation (person-days ha <sup>-1</sup> )	Sowing (person-days ha <sup>-1</sup> )	Weeding (person-days ha <sup>-1</sup> )	Yield (kg ha <sup>-1</sup> )	Labour productivity (kg person-day <sup>-1</sup> )
Transformation	ln(Y)	Y	Y	sqrt(Y)	sqrt(Y)
Multiple R-squared	0.3324	0.2547	0.7128	0.6053	0.4349
Intercept	3.6540 ***	30.5991 ***	18.9680	66.9305 ***	3.3664 ***
Type of management unit ( <i>Family</i> )					
Individual	-0.4539 *		-19.2139 *		
Sampling year ( <i>2012</i> )					
2013				5.5847	
2014				12.7306 *	
Soil type ( <i>'Vete', sandy-clay soil</i> )					
' <i>Burum</i> ' (sandy soil)			-19.1335 *		
' <i>Sewer</i> ' (loamy soil)			-18.0372		
Weed cover above the rice canopy				-6.9309 **	-0.5753 *
Bird damage at harvest				-0.8813 **	-0.0722 *
Field size	-0.0002 **	-0.0047 .	-0.0052 *	0.0026 *	0.0005 ***
Preceding crop ( <i>Tubers</i> )					
Rice		17.5288 *			
Fallow		5.0092			
Market gardening		37.9857 **			
Residues management ( <i>Incorporated</i> )					
Burned				13.9658 ***	
Exported				11.5234 *	
Land preparation method ( <i>Mound breaking</i> )					
Tillage	0.7375 ***			5.7296	
Ridging	0.5364			-11.7678 .	
No land preparation	0.1951			-18.3504 *	
Sowing date				-0.1770 **	
Frequency of weeding ( <i>Hoe-weeding once</i> )					
No weeding			-16.9685		
Herbicide once			-15.3183		
Hoe-weeding twice			72.0079 ***		
Herbicide once +Hoe-weeding once			19.3659		
Hoe-weeding three times			45.9041 **		
Rice growing cycle length			0.2084 .		

332 3.4. Variation in labour productivity

333

334 The average labour productivity was  $8 \pm 5$  kg person-day<sup>-1</sup> in Zonmon and  $17 \pm 12$  kg  
335 person-day<sup>-1</sup> in Pelebina (Figure 4B). Observed variation in labour productivity was affected  
336 by both labour use ( $r^2$  0.42 in Zonmon and  $r^2$  0.30 in Pelebina,  $p < 0.001$ ) and yield ( $r^2$  0.55 in  
337 Zonmon and  $r^2$  0.53 in Pelebina,  $p < 0.001$ ) in both villages (Figure 4B and 4C). The higher  
338 yields obtained in Zonmon did not compensate for the larger labour input, resulting in lower  
339 labour productivity compared to Pelebina ( $p < 0.001$ ). The estimated relative labour  
340 productivity gaps were similar, i.e., 59% in Zonmon and 63% in Pelebina. Relative labour  
341 productivity gaps were larger than relative yield gaps in both villages.

342 In Zonmon, five variables had a significant effect on labour productivity (Table 4).  
343 Yield and consequently labour productivity decreased with increasing rat damage. Labour  
344 productivity was less for fields where rice was preceded by market gardening, sugarcane or  
345 maize (other crops) as labour for bird scaring was more than for fields where rice was  
346 preceded by rice. Finally, labour productivity increased with an increase in field size and hill  
347 density, as yield increased while labour used for land preparation and transplanting, weeding  
348 and/or bird scaring decreased with increases in both variables.

349 In Pelebina, three variables had a significant effect on labour productivity (Table 5).  
350 Similar to Zonmon, labour productivity increased with increases in field size as yields were  
351 higher on larger fields while labour used for field cleaning and land preparation and weeding  
352 was less. Labour productivity decreased with an increase in weed cover above the rice  
353 canopy as yield decreased with increases in weed cover above the rice canopy. Finally,  
354 labour productivity was lower at greater bird damage as yield decreased with increases in  
355 bird damage.

356

357

## 358 4. Discussion

359

360 In order to understand the main causes of variability in yield, labour input and labour  
361 productivity among rice fields, and to identify opportunities for improving yield and labour  
362 productivity, we studied a total of 132 fields during two or three growing seasons in two  
363 villages illustrative of rainfed and irrigated lowlands in Benin. Our results showed a huge  
364 variation between and within villages in rice yield, labour input and labour productivity, which  
365 suggests the existence of ample opportunities to improve farmer benefits from rice  
366 production and its attractiveness as a cash crop within smallholder farm systems in Benin.

367

### 368 4.1. Strategies to reduce labour

369

370 The literature reveals a large variation in labour used for rice cultivation depending on  
371 management practices, rice growing environments and levels of mechanisation (Kriesemer,  
372 2013; Ministère des Affaires étrangères et al., 2003). Our data were consistent with those  
373 reported in the literature, i.e., 20 to 140 person-days ha<sup>-1</sup> for manual land preparation  
374 (Ministère des Affaires étrangères et al., 2003; Ndiaye, 2011; Pingali et al., 1997); (ii) 30 to  
375 60 person-days ha<sup>-1</sup> for transplanting (Krupnik et al., 2012; Ministère des Affaires étrangères  
376 et al., 2003; Senthilkumar et al., 2008); (iii) 80 person-days ha<sup>-1</sup> for hand-weeding  
377 (Senthilkumar et al., 2008) and 30 to 60 person-days ha<sup>-1</sup> for hoe-weeding (Ministère des  
378 Affaires étrangères et al., 2003); (iv) 20 to 90 person-days ha<sup>-1</sup> for harvesting (Ministère des  
379 Affaires étrangères et al., 2003; Ndiaye, 2011; Pingali et al., 1997; Senthilkumar et al., 2008);  
380 and (v) 7 to 10 person-days ha<sup>-1</sup> for threshing (Ministère des Affaires étrangères et al., 2003).  
381 Field cleaning, i.e., clearing weeds and residues of the preceding crop was not mentioned in  
382 the literature we reviewed. Our observations in Zonmon indicate that the amount of labour  
383 required for bird scaring by one adult on a field of average size (0.14 ha) and a ripening  
384 phase of IR841 of 30 days (IRRI, 2007) is 210 person-days ha<sup>-1</sup>. This indicative value is

385 much higher than the average of 23 person-days ha<sup>-1</sup> reported for irrigated rice farmers in the  
386 Senegal River Valley (Mey et al., 2012).

387 In Zonmon the average labour input was 4 times larger than in Pelebina, with lower  
388 and higher labour input fields differing 2146 person-days ha<sup>-1</sup>. Since there is room to reduce  
389 labour input without reducing yield (Table 4 and Figure 4A), reducing labour input in Zonmon  
390 appears the best strategy to increase labour productivity and rice area in this village.  
391 Increasing the average hill density up to 34 hills m<sup>-2</sup> would be viable and based on our  
392 regression models, would reduce labour by 49 person-days ha<sup>-1</sup> through its effect on bird-  
393 scaring (Table 6). Using post-emergence herbicides instead of one hand-weeding operation  
394 was an affordable alternative (2 800 FCFA on a field of average size) which would reduce  
395 labour by 56 person-days ha<sup>-1</sup>, but may pose risk to human health and wildlife (Culliney,  
396 2005). As village authorities delimited an area dedicated to rice production, most rice fields  
397 were already grouped in the same area of the lowland, which increased bird scaring  
398 efficiency. Some farmers even associated themselves with their neighbours and took turns at  
399 bird scaring to decrease the labour needed. Skills exchange with experienced farmers may  
400 speed up farmers' learning processes and reduce labour by 34 person-days ha<sup>-1</sup>. Doing  
401 away with casual labour would reduce labour by 64 person-days ha<sup>-1</sup> but casual labour was  
402 probably used because of a lack of family labour. Cultivating large areas (0.3 ha on average  
403 per farmer) with limited labour available led to working on a field-by-field basis for the labour-  
404 demanding field cleaning and bund making, and land preparation and transplanting. Working  
405 on a field-by-field basis was not a strategy to deal with climatic uncertainty (Milgroom and  
406 Giller, 2013) but a strategy to maximize the area with early transplanting. This strategy  
407 resulted in a range of transplanting dates and field sizes for fields managed by the same  
408 farmer. Therefore, increasing the average field size and constraining bird scaring to the  
409 critical period for bird damage (ripening phase) would first require reducing the transplanting  
410 period by saving labour for field cleaning and bund making as well as for land preparation  
411 and transplanting. Additional investments in the irrigation scheme would be needed to  
412 improve water management before and during the rice cropping season. At present, the

413 amount of weeds and crop residues cannot be controlled as (i) the flooding period is not  
414 controlled; and (ii) the period between the dropping water level and the start of field cleaning  
415 depends on the yearly collective digging of the main irrigation canal on the sandy fringes.  
416 Besides, the presence of a permanently flooded pond at the bottom of the lowland (*Towewe*  
417 pond) makes drainage difficult, not to say impossible on fields located near the bottom of the  
418 lowland. And yet, draining fields just before cleaning operations would (i) avoid working in  
419 muddy soils and thus, reduce labour by 83 person-days ha<sup>-1</sup>; and (ii) allow tillage before  
420 puddling and thus, reduce labour by 119 person-days ha<sup>-1</sup> on the 7% of fields where the  
421 water level was too high to till the soil. Finally, no land preparation instead of tillage and  
422 puddling may reduce labour by 49 person-days ha<sup>-1</sup> but we did not study water use efficiency  
423 on rice fields and puddling is usually recommended to reduce water loss (IRRI, n.d.).

424 In Pelebina, the variation observed in labour input was also high in percentage but the  
425 spread between lower and higher labour input fields was only 370 person-days ha<sup>-1</sup>. Still,  
426 there are opportunities to increase labour productivity by reducing labour input. Based on our  
427 regression models, sowing rice after tubers cultivated on mounds would require less labour  
428 for sowing and was already done in slightly more than half of the fields. Increasing the  
429 average field size up to 0.5 ha and sowing rice on sandy soils instead of sandy-clay soils  
430 would reduce labour by 27 person-days ha<sup>-1</sup> and 19 person-days ha<sup>-1</sup>, respectively (Table 7).  
431 These alternatives would be feasible as fallows were available through ownership and  
432 borrowing (Paresys et al., 2018) and rice fields were usually adjacent to fallows. Increasing  
433 field size from the current average size of 0.19 ha up to 0.5 ha would imply an increase in  
434 labour demand of 7.6 person-days at farm level, spread on the whole growth period of the  
435 crop. Increasing field size would not imply increasing the demand of cash spent on  
436 purchasing chemical inputs at farm level because currently most farmers do not use these  
437 inputs. Resulting increases in rice areas at village level would not affect lowland land use  
438 substantially. In 2012, rice was grown by 23 farmers on only 4.2 ha. Assuming that all 23  
439 farmers increase their field size to 0.5 ha, we estimated that the proportion of fallow land in  
440 the lowlands of Pelebina would decrease from 64% (Paresys et al., 2017) to 59%.

441 **Table 6: Ranking of variables based on the effect of a change in their value from the average to the average highest or lowest decile (for continuous variables) or from the base**  
 442 **category to an alternative category (for categorical variables) on the amount of labour used in Zonmon and related comments. Calculations were made using the regression models**  
 443 **of labour for field cleaning and bund making, labour for land preparation and transplanting, labour for weeding, and labour for bird scaring.**

Variables	Change in variable value from the average or from the base category	Effect on labour input (person-days ha <sup>-1</sup> )	Comments
Field size (m <sup>2</sup> )	+3546	-166	Greater incentives to complete farming operations in a timely manner on larger fields because the task was perceived of major importance; Free-riding on smaller fields because the task was perceived as of minor importance; Economies of scale on larger fields (e.g., not less than a full-time worker could be allocated to small fields for bird-scaring)
Exported residues	No residue	-111	Flooding after harvest (rainwater runoff and floodwater of the Oueme river) together with early field cleaning after the dropping of the water level helped controlling the amount of weeds (Rodenburg and Johnson, 2009) and crop residues
Flooded from the long rainy season	Never flooded	-83	More difficult work in the muddy soils of fields flooded from the long rainy season
Casual labour (%)	-30	-64	Moral hazard (Holmstrom, 1982), i.e., low effort on the part of casual labourers
Hand-weeding once	No weeding	-59	Lower weed pressure on non-weeded fields (no difference in the weed cover below and above rice canopy and in the first weeding date among fields with different frequencies of weeding; <i>p</i> values of 0.89, 0.16 and 0.15, respectively)
Hand-weeding once	Herbicide once	-56	Similar weed pressure on fields where herbicides were applied than on fields that were hand-weeded once
Hill density (hills m <sup>-2</sup> )	+8	-49	Birds are attracted to zones with plant densities much lower than in the immediate vicinity (de Mey and Demont, 2013; Tréca, 1977). At greater plant densities, farmers can respond to lower bird pressure by delaying the start of bird-scaring or decreasing the number of workers involved
Tillage+puddling	No land preparation	-49	No specific conditions identified for fields where land was not prepared (no relationship found between no land preparation and flooding period, soil type, residues management and preceding crop)
Family fields	Individual fields	-47	Less labour available on individual fields; Family fields may experience free-riding (Guirkingner and Platteau, 2014)
2013 as the sampling year	2014 as the sampling year	-45	More rainfall at the beginning of the rainy season, i.e., at harvesting time in 2013 compared to 2014 caused rice lodging, which made harvesting more labour-demanding
Experience with rice cultivation (years)	+2.3	-34	
Weed cover below the rice canopy	+1.1	-24	Competition with weeds led to a smaller number of panicles per m <sup>2</sup> (data not shown, <i>p</i> = 0.07); Farmers did not harvest areas with very high weed cover; Higher weed cover below the rice canopy was associated with lower water level at harvest ( <i>p</i> < 0.01) and thus, with easier harvesting conditions
Hand-weeding once	Hand-weeding twice	+67	Higher weed pressure on fields that were hand-weeded twice
Tillage+puddling	Puddling	+119	Tillage made puddling faster: when subsequent to tillage, farmers used a small hoe to break soil clods while without tillage, farmers used a machete which was much more labour-demanding to break the dense root systems and mash the soil; Puddling was done without tillage on fields where the water level was too high to till the soil
Rice as the preceding crop	Market gardening as the preceding crop	+185	Earlier start of bird-scaring, i.e., during the flowering phase ( <i>p</i> = 0.08) because fields where market gardening was the preceding crop were adjacent to fields where rice was the preceding crop, which were transplanted earlier ( <i>p</i> = 0.06) and managed by the same farmers
Rice as the preceding crop	Other crops as the preceding crop	+266	Higher bird pressure on isolated fields and the farmers' response to this by putting forward the start of bird-scaring or increasing the number of workers involved

444

445

446

447

**Table 7: Ranking of variables based on the effect of a change in their value from the average to the average highest or lowest decile (for continuous variables) or from the base category to an alternative category (for categorical variables) on the amount of labour used in Pelebina and related comments. Calculations were made using the regression models of labour for field cleaning and land preparation, labour for sowing, and labour for weeding.**

Variables	Change in variable value from the average or from the base category	Effect on labour input (person-days ha <sup>-1</sup> )	Comments
Family fields	Individual fields	-29	Less labour available on individual fields; Family fields may experience free-riding (Guirkinger and Platteau, 2014)
Field size (m <sup>2</sup> )	+2 957	-27	Greater incentives to complete farming operations in a timely manner on larger fields because the task was perceived of major importance; Free-riding on smaller fields because the task was perceived as of minor importance; Economies of scale on larger fields
'Vete', sandy-clay soil	'Burum' (sandy soil)	-19	Sandy soils are light and relatively easy to work while sandy-clay soils are hard under dry conditions and very sticky under wet conditions
Tubers as the preceding crop	Rice as the preceding crop	+18	The soil was tilled when rice was the preceding crop whereas mounds were broken when tubers were the preceding crop. In case of tillage, sowing included breaking soil clods, i.e., preparing a seedbed where the rice was to be sown. In case of mound breaking, soil structure enabled sowing rice without any additional operation; As preceding crop and not land preparation was selected by the stepwise procedure, there was an additional effect of preceding crop on sowing, which was probably related to crop residues
Mound breaking	Tillage	+29	Relatively light soil on mounds; Less activity as the soil was not turned over
Tubers as the preceding crop	Market gardening as the preceding crop	+38	See 'Rice as the preceding crop'
Hoe-weeding once	Hoe-weeding three times	+46	Either higher weed pressure on fields that were hoe-weeded twice or three times or hoe-weeding later and just once was an efficient labour-saving strategy to control weeds (no difference in the weed cover below and above rice canopy among fields with different frequencies of weeding; <i>p</i> values of 0.89, 0.16, respectively; first weeding completed earlier on fields weeded more than once; <i>p</i> < 0.001)
Hoe-weeding once	Hoe-weeding twice	+72	

448

#### 449 4.2. Strategies to improve yield

450

451 We found a yield difference of almost 4 and 2 t ha<sup>-1</sup> between the average and the top  
452 yielding fields in Zonmon and Pelebina, respectively, and we were able to relate part of that  
453 yield difference to crop management practices in both villages.

454 In Zonmon, the average yield (4.8 t ha<sup>-1</sup>) was identical to that found by Tanaka et al.  
455 (2013) in the same region of Benin and larger to that of 3.7 t ha<sup>-1</sup> found in irrigated lowlands  
456 in the sub-humid zone of sub-Saharan Africa (Niang et al., 2017; Tanaka et al., 2017). The  
457 average yield of the top decile (8.4 t ha<sup>-1</sup>) was close to the potential yield of 9.1 t ha<sup>-1</sup>  
458 simulated for irrigated systems of Guinea savanna (Becker et al., 2003). According to our  
459 regression model in Zonmon, yield would be improved by 1.2 t ha<sup>-1</sup> by increasing the average  
460 hill density up to 34 hills m<sup>-2</sup> (Table 8). Rat damage was not controlled and may be reduced  
461 like in nearby villages by individual actions (Tanaka et al., 2013) and/or collective actions  
462 (Palis et al., 2007; Thi My Phung et al., 2013), the former being less efficient but probably  
463 easier to be adopted than the latter. Increasing the average field size and earlier  
464 transplanting (second half of December) would improve yield by 1.5 t ha<sup>-1</sup> but would first  
465 require saving labour for field cleaning and bund making as well as for land preparation and  
466 transplanting. If such labour savings may allow earlier transplanting or help farmers to  
467 transplant seedlings onto large rice fields, farmers cultivating more than one field may  
468 choose to cultivate large fields on land which they perceived to be more productive and small  
469 fields on land which they perceived to be less productive. Thus, simultaneously transplant  
470 seedlings on the combination of large and more productive and small and less productive  
471 fields may overall not have the expected positive impact on the average yield at farm level.  
472 Increasing field size would then only have a positive impact for farmers having extra  
473 productive land available. Finally, late harvesting was probably due to competition in labour  
474 allocation between rice fields and upland fields at the beginning of the rainy season (Paresys  
475 et al., 2018).

476 In Pelebina, the average yield ( $2.3 \text{ t ha}^{-1}$ ) was within the range of that found by Danvi  
477 et al. (2016) in the same region of Benin and close to that of  $2.1 \text{ t ha}^{-1}$  found in rainfed  
478 lowlands in the sub-humid zone of sub-Saharan Africa (Niang et al., 2017; Tanaka et al.,  
479 2017). The average highest yield decile ( $4.4 \text{ t ha}^{-1}$ ) was within the range of 3.8 to  $4.4 \text{ t ha}^{-1}$   
480 found in an experiment in the same region of Benin (Worou et al., 2013). It was 70% of the  
481 potential yield of  $6.6 \text{ t ha}^{-1}$  simulated in rainfed systems (Van Oort et al., 2015) and was  
482 around half of the potential yield of  $9.1 \text{ t ha}^{-1}$  simulated in irrigated systems of Guinea  
483 savanna (Becker et al., 2003). According to our regression model in Pelebina, burning  
484 residues or exporting residues instead of incorporating them would improve yield by  $1.2 \text{ t ha}^{-1}$   
485 or  $0.9 \text{ t ha}^{-1}$ , respectively (Table 8). On the one hand, compared to exporting residues,  
486 burning residues would allow K recycling on rice fields. On the other hand, compared to  
487 burning residues, exporting residues would avoid emissions of carbon dioxide and their  
488 adverse effect on the environment (Sidhu et al., 1998) and may avoid nutrient losses if  
489 residues are recycled on other fields (e.g., incorporated or used in mulch form for drained  
490 fields where N is applied, or used in compost form). Increasing the average field size up to  
491 0.5 ha would improve yield by  $0.6 \text{ t ha}^{-1}$  and would be feasible as fertile land was available  
492 through ownership and borrowing. Besides, increasing field size would not imply substantial  
493 changes in labour and chemical inputs at farm level and in lowland land use at village level  
494 (see 4.1). Avoiding rice shading, i.e., removing the weed cover above the rice canopy would  
495 improve yield by  $0.2 \text{ t ha}^{-1}$ . Land should be prepared, as was the case on most fields. Moving  
496 forward the average sowing date to between the end of April and the beginning of May as  
497 well as introducing bird control may be constrained by labour availability and allocation at  
498 farm level as rice was cultivated during the rainy season when the labour demand by upland  
499 fields was high (Paresys et al., 2018).

500

501

502

**Table 8: Ranking of variables based on the effect of a change in their value from the average to the average highest or lowest decile (for continuous variables) or from the base category to an alternative category (for categorical variables) on yield and related comments. Calculations were made using the regression models of yield fitted per village.**

	Variables	Change in variable value from the average or from the base category	Effect on yield (kg ha <sup>-1</sup> )	Comments
Zonmon	Hill density (hills m <sup>-2</sup> )	+8	+1 181	The average highest decile of hill density was 34 hills m <sup>-2</sup> , a value equivalent to a spacing of 17.2 cm × 17.2 cm, which is narrower than the recommended spacing of 20 cm × 20 cm (Bell et al., n.d.; Nwilene et al., 2008)
	Field size (m <sup>2</sup> )	+3546	+785	Farmers may decide to allocate more labour, i.e., to cultivate larger fields, to land which they perceived to be more productive (Tittonell and Giller, 2013); We found a direct relationship between field size and yield and not an inverse relationship as established between farm size and land productivity for Africa (Ali and Deininger, 2015; Frelat et al., 2016; Woodhouse, 2010) as (i) there may be no relationship between rice field size and farm size in this study; (ii) in Zonmon, farmers cultivated more than one field and small fields were usually cultivated in addition to large fields; (iii) agricultural production on farms was not rice-based but relied on a diversity of crops (Paresys et al., 2018)
	Harvesting date (Julian days)	-51	+743	Earlier harvesting was associated with earlier transplanting (high correlation between harvesting date and transplanting date, $r$ 0.95) and transplanting earlier has been found to be associated with greater yield (Stuart et al., 2016); In addition, on-time harvesting, i.e., harvesting when rice reached the maturity date avoided grain losses (Mejía, 2003)
	Rat damage (% of panicles)	-2.7	+506	Effect also reported by Tanaka et al. (2013) in the same region of Benin. In Zonmon, however, rat damage was not controlled.
Pelebina	Incorporating residues	Burning residues	+1 161	Burning residues may avoid N immobilization and reduction of N uptake and crop growth (Thuy et al., 2008; Xu et al., 2010), especially as N was not applied in 26 of 28 fields (93%) (Huang et al., 2013); Accumulation of phytotoxic substances as 75% of fields (21 of 28) were flooded during the rainy season and never drained (Bijay-Singh et al., 2008; Gao et al., 2004)
	2012 as the sampling year	2014 as the sampling year	+1 043	Year 2014 considered as a relatively normal year; In 2012, some rice fields were flooded after sowing due to an excess in rainfall; In 2013, there was a lack of rainfall during the month of June.
	Incorporating residues	Exporting residues	+930	See 'Burning residues'; K recycling when residues were burned compared to K depletion when residues were exported may explain differences in magnitude and significance level between the two residues management practices.
	Sowing date (Julian days)	-63	+889	See 'Harvesting date' in Zonmon
	Field size (m <sup>2</sup> )	+2 957	+586	See 'Field size' in Zonmon
	Bird damage (% of panicles)	-3.7	+234	Bird damage not controlled in Pelebina; Rice fields vulnerable to birds as often located in remote areas and surrounded by attractive fallows (de Mey and Demont, 2013)
	Weed cover above the rice canopy	-0.5	+228	Shading decreased grain production (Caton et al., 2001; Efthimiadou et al., 2009; Zimdahl, 2004)
Mound breaking	No land preparation	-932	Negative effect of no land preparation on N uptake and crop growth as fields were located in sandy and sandy-clay soils and N was not applied (Huang et al., 2015, 2012)	

503

504 *4.3. Strategies to improve labour productivity*

505

506 *4.3.1. The need to prioritise labour-saving technology development*

507

508 We found a striking difference in labour productivity between the two case-study  
509 villages. The average labour productivity and the average labour productivity of the top decile  
510 were two times higher in Pelebina than in Zonmon, although the average yield and the  
511 average yield of the top decile in Pelebina were half of those in Zonmon (Figure 4A, 4B and  
512 4C). The difference in labour productivity may be explained by differences in rice growing  
513 environments. In Zonmon, rice was cultivated during the dry season, which required  
514 irrigation. Irrigation implied bund making, puddling, transplanting rather than sowing, and  
515 hand-weeding rather than hoe-weeding. Field cleaning and harvesting may be more labour-  
516 demanding in an environment where fields are flooded and drainage is not controlled. Bird  
517 pressure may be higher on rice fields at a period of time when other cereals are not grown.  
518 Combined, this may have caused rice cultivation in Zonmon to require more labour than in  
519 Pelebina and thus, resulted in lower labour productivity.

520 In both case-study villages, within-village variation in yield and labour productivity  
521 indicated there was room for farmers to learn from other farmers' practices. Practices to  
522 improve labour productivity on rice fields included practices to increase yield as well as  
523 practices to decrease the amount of labour used. In each village, we found a synergy  
524 between gains in labour productivity and gains in yield (Figure 4C). In other words, practices  
525 increasing yield did not imply additional labour (i.e., earlier transplanting and on-time  
526 harvesting in Zonmon; earlier sowing in Pelebina) or even reduced the labour input (i.e.,  
527 increasing field size and hill density in Zonmon; increasing field size in Pelebina). In the  
528 literature, failures in the uptake of yield-enhancing, potentially yield-enhancing or yield-  
529 sustaining practices have been attributed to labour constraints (Asfaw and Lipper, 2015;  
530 Baudron et al., 2015; Byerlee et al., 2008; Gabre-madhin and Haggblade, 2004;  
531 Gebremedhin et al., 2003; Leonardo et al., 2015; Nicol et al., 2011; Ortega et al., 2016;

532 Vissoh et al., 2004) while some successes were attributed to labour savings (Diao et al.,  
533 2016; Franke et al., 2010; Gabre-madhin and Haggblade, 2004; Haggblade and Hazell,  
534 2010; Vandeplas et al., 2008). These results are supported by our findings and point to the  
535 need to combine yield analyses with analyses of labour use and labour productivity and to  
536 focus on labour-saving approaches rather than on yield-increasing approaches if they  
537 demand more labour.

538 Using detailed local agronomic information allowed us to identify best viable  
539 practices. Based on our regression model, labour productivity would be improved by 4 kg  
540 person-day<sup>-1</sup> by increasing the average hill density up to 34 hills m<sup>-2</sup> in Zonmon and by  
541 17.1 kg person-day<sup>-1</sup> by increasing the average field size up to 0.5 ha and avoiding rice  
542 shading in Pelebina (Table 9). Beyond these local best viable practices there is still room to  
543 improve labour productivity on rice fields. Research has been carried out on factors  
544 impacting labour use efficiency for weeding (N'Cho, 2014; Ogwuiké et al., 2014) as well as  
545 labour-saving technologies for weeding such as herbicides (Gianessi, 2013; Lawrence and  
546 Dijkman, 1997) and mechanical weeders (Gongotchame et al., 2014; Rodenburg et al.,  
547 2015). Weeds, dates of weeding and weeding frequencies, however, were not identified as  
548 variables explaining yield and labour productivity in Zonmon, suggesting weeds were well  
549 controlled by farmers. Besides, weeding was less labour-demanding than (i) field cleaning  
550 and bund making, or than land preparation and transplanting and greatly less labour-  
551 demanding than bird scaring in Zonmon; and (ii) harvesting and threshing in Pelebina.

552 In Zonmon, saving on the amount of labour used for field cleaning and bund making  
553 as well as for land preparation and transplanting may (i) allow earlier transplanting; (ii) help  
554 farmers decrease differences in transplanting dates among their rice fields, or even to  
555 transplant seedlings onto large rice fields, which in return would save labour, in particular  
556 labour used for bird scaring, and based on our regression model, would increase labour  
557 productivity by up to 8.6 kg person-day<sup>-1</sup> (Table 9). In addition, the amount of casual labour  
558 may be decreased (Table 3) and consequently, the gross margin of rice production may be  
559 increased.

560

561 **Table 9: Ranking of variables based on the effect of a change in their value from the average to the**  
 562 **average highest or lowest decile (for continuous variables) or from the base category to an alternative**  
 563 **category (for categorical variables) on labour productivity. Calculations were made using the regression**  
 564 **models of labour productivity fitted per village.**

	Variables	Change in variable value from the average or from the base category	Effect on labour productivity (kg ha <sup>-1</sup> )
	Field size (m <sup>2</sup> )	+3 546	+8.6
	Hill density (hills m <sup>-2</sup> )	+8	+4.0
Zonmon	Rat damage at harvest (% of panicles)	-2.7	+1.5
	Rice as the preceding crop	Market gardening as the preceding crop	-5.3
	Rice as the preceding crop	Other crops as the preceding crop	-7.1
	Field size (m <sup>2</sup> )	+2 957	+15.0
Pelebina	Weed cover above the rice canopy	-0.5	+2.1
	Bird damage at harvest (% of panicles)	-3.7	+2.1

565

566 In Asian rice systems, the adoption of mechanical power reduced labour  
 567 requirements, costs and ensured the timely completion of land preparation (Biggs and  
 568 Justice, 2015; Pingali, 2007). In sub-Saharan African rice systems, mechanical power for  
 569 land preparation (e.g. power tillers in Zonmon) or threshing (e.g. threshers in Pelebina) may  
 570 be adopted provided that technologies are made affordable, adapted to the growing  
 571 environment and spare parts are made available (Seck et al., 2012). Failures in the adoption  
 572 of large-scale equipment such as tractors (Diao et al., 2016, 2014; Fonteh, 2010; Onwude et  
 573 al., 2016) suggest that massive introduction of purchased large-scale equipment must be  
 574 avoided (Mmari and Mpanduji, 2014; Seck et al., 2012). Instead, building on the gradual and  
 575 so-called 'silent revolutions' that occurred in some Asian countries (Biggs and Justice, 2015),  
 576 small-scale equipment should be targeted. Research and development agencies should  
 577 engage in testing and adapting equipment (Biggs and Justice, 2015; Seck et al., 2012) and  
 578 local manufacturing and maintenance of equipment needs to be stimulated (Curfs, 1976;  
 579 Douthwaite and Gummert, 2010; Onwude et al., 2016; Seck et al., 2012).

580 Bird scaring was the most labour-demanding operation in Zonmon, accounting for  
 581 around half of the total labour input. In this village, the Oueme river transcended its banks at  
 582 the beginning of the short rainy season and flooded part of the village territory. Thus, during

583 the short rainy season, farmers focused on cultivating groundnut and cowpea on sandy hills  
584 and on fishing. Acrylic nets used for fishing were recycled on rice fields for protection against  
585 birds. Farmers' interest for partial netting, i.e., netting part of the sides or top of fields, was  
586 reflected by a 37% increase in use of nets from the 2013 to the 2014 dry season. Farmers  
587 observed that partial netting helped in diverting and gathering birds together on a particular  
588 side of the fields. Although we did not find a quantitative effect of partial netting on yield and  
589 on the amount of labour used for bird scaring, it may have had a qualitative effect, i.e., it may  
590 have made the task less laborious. Previous studies showed that complete enclosure of rice  
591 fields during the ripening phase can effectively reduce bird damage (Ajayi et al., 2007;  
592 Bishop et al., 2003) and its implementation may be tested in Zonmon. Nets were available on  
593 the market and acrylic nets were relatively affordable. Research should not only evaluate  
594 trade-offs between costs and gains of complete enclosure netting of a rice field but also  
595 consequences at a whole farm level as labour demand for bird scaring competed with labour  
596 demand for upland fields at the beginning of the long rainy season (Paresys et al., 2018),

597

#### 598 *4.3.2. The need to optimise labour allocation at farm level*

599

600 In addition to rice growing environments, differences in labour productivity between  
601 the two villages may be explained by differences in labour allocation at a farm level during  
602 the rice growing season and thus, of labour availability for rice production. In Zonmon, rice  
603 was cultivated during the dry season, when the labour demand on upland fields was low. In  
604 Pelebina, rice was cultivated during the rainy season, when the labour demand on upland  
605 fields was high. Herbicides were used prior to land preparation and around a third of rice  
606 fields were located in never flooded areas. Even on the two thirds of fields flooded during the  
607 rainy season, farmers chose not to control water levels, i.e., bunds were not made, puddling  
608 was not performed, transplanting was not used, and weeding was done using a hoe. Finally,  
609 birds were not controlled. In Pelebina, farmers may have developed highly labour-productive

610 strategies in order to be able to add rice production to major cash crop (cotton and legume)  
611 and staple crop (tubers and cereals) production in uplands.

612 Our research supports the hypothesis that farmers' practices, yields and labour  
613 productivities at field level are shaped by the availability and allocation of resources,  
614 including labour, at farm level (Beza et al., 2017; Dzanku et al., 2015; Leonardo et al., 2015;  
615 Rusinamhodzi et al., 2016; Tittonell and Giller, 2013; Vissoh et al., 2004; Wijk et al., 2009).  
616 Based on our regression model in Pelebina, rice labour productivity was 2.1 kg person-day<sup>-1</sup>  
617 higher when there was no bird damage (Table 9). The absence of bird control may be  
618 explained by labour constraints and priority given to upland fields at a farm level. In Zonmon,  
619 the use of casual labour was probably due to a lack of family labour and late harvesting was  
620 probably due to competition in labour allocation between rice fields and upland fields at the  
621 beginning of the rainy season. This points to the need to combine rice field analyses with  
622 analyses of labour use and labour productivity for farms with different levels of resource  
623 endowment and resource use strategies (Paresys et al., 2018). Such farm level analyses  
624 would provide new insights on how to further enhance rice yield and labour productivity,  
625 while maximising total farmer income.

626

## 627 **Conclusion**

628

629 The common analysis of relative yield gap at the field level was extended with an  
630 analysis of the relative labour productivity gap and variability in labour input in two villages  
631 illustrative of rainfed and irrigated lowlands in Benin. The approach was based on the  
632 assumptions that increases in farmer labour productivity constitute a key to reducing farmer  
633 poverty, and that increases in rice labour productivity is a key to stimulating expansion to  
634 wetlands.

635 Relative yield and labour productivity gaps were similar in the two villages (43-48%  
636 and 59-63%, respectively), but with great variation between and within the villages  
637 ( $4.8 \pm 2.0$  t ha<sup>-1</sup> in Zonmon and  $2.3 \pm 1.2$  t ha<sup>-1</sup> in Pelebina, and  $8 \pm 5$  kg person-day<sup>-1</sup> in

638 Zonmon and  $17 \pm 12$  kg person-day<sup>1</sup> in Pelebina, respectively). We found no trade-off  
639 between yield and labour or labour productivity within the villages, suggesting that in many  
640 cases rice yields can be increased without additional labour inputs. We identified  
641 opportunities to reduce labour, improve yield and labour productivity based on current farmer  
642 knowledge and resource endowment.

643 Rice yield and labour productivity could be improved considerably with the locally  
644 available technologies and knowledge. Further enhancing yield and labour productivity will  
645 require (i) introducing small-scale mechanisation and other labour-saving innovations, in  
646 particular for labour-demanding farming operations such as bird scaring in Zonmon and  
647 harvesting and threshing in Pelebina; and (ii) combining analyses of yields and labour  
648 productivities at field level with detailed analyses of labour use and labour productivity at  
649 farm level.

650 When comparing fields within the same village, we found that both labour use and  
651 yield affected labour productivity. However, when comparing case-study villages, we found  
652 that higher yields do not always result in higher labour productivity. Cultivating irrigated rice  
653 during the dry season in Zonmon with improved donated seeds and credited fertilizers  
654 resulted, on average, in higher yields but lower labour productivity compared to cultivating  
655 rainfed rice in Pelebina with self-produced seeds and without fertilizers. In other words, one  
656 hectare in Zonmon contributed twice as much to Beninese rice production compared to one  
657 hectare in Pelebina but with a two times smaller reward for farmer labour. Such differences in  
658 labour productivity would even be more striking when taking costs of chemical inputs and  
659 casual labour into account. The paradox of higher yields but lower labour productivity in such  
660 different rice growing environments and farming systems should be addressed in elaborating  
661 development policies. In villages similar to Pelebina, policies could focus on yield-increasing  
662 approaches that do not demand more labour (e.g., donated seeds and credited fertilizers)  
663 while in villages similar to Zonmon, policies could focus on labour-saving approaches that do  
664 not decrease yield (e.g., small-scale mechanisation).

665

666 **Acknowledgements**

667

668 We thank Seidou Ouorou Aliou and Gildas Edjrokinto for their contribution as  
669 translators and assistants in Pelebina and in Zonmon, respectively. We thank Giscard  
670 Hounha and Rémi Hountchouou for their contribution to recording data through on-farm  
671 observations in Pelebina and in Zonmon, respectively. We thank Charles Djigbenoude for his  
672 contribution to estimating filled grain weight and grain moisture content of rice samples. We  
673 are grateful to the rice farmers who participated in our research. We thank village authorities  
674 and villagers for the warm welcome they have given us. We acknowledge the comments of  
675 two anonymous reviewers and the editor that helped us to improve the manuscript. This work  
676 was supported by the European Commission through the International Fund for Agricultural  
677 Development and the project “Realizing the agricultural potential of inland valley lowlands in  
678 sub-Saharan Africa while maintaining their environmental services Phase 2” [COFINECG-65-  
679 WARDA]; and the Wageningen University INREF Fund (especially, Mr. Wim Andriessse and  
680 Mr Pieter Windmeijer).

681

682 **Appendix A.**

683

684 *Regression models used in the stepwise procedure*

685 For Zonmon, regression models took the following forms:

686

687  $Yield_i = \beta_0 + \sum_{j=1}^{50} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.1)

688

689  $Field\ cleaning\ \&\ bund\ making_i = \beta_0 + \sum_{j=1}^6 \beta_j X_{ji} + \beta_{33} X_{33i} + \sum_{j=36}^{44} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.2)

690

691  $Land\ preparation\ \&\ transplanting_i = \beta_0 + \sum_{j=1}^{12} \beta_j X_{ji} + \beta_{33} X_{33i} + \sum_{j=36}^{45} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.3)

692

693  $Weeding_i = \beta_0 + \sum_{j=1}^{31} \beta_j X_{ji} + \sum_{j=33}^{45} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.4)

694

695  $Bird\ scaring_i = \beta_0 + \sum_{j=1}^{45} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.5)

696

697  $Harvesting\ \&\ threshing_i = \beta_0 + \sum_{j=1}^{50} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.6)

698

699 where  $Yield_i$ ,  $Field\ cleaning\ \&\ bund\ making_i$ ,  $Land\ preparation\ \&\ transplanting_i$ ,  $Weeding_i$ ,  
700  $Bird\ scaring_i$ , and  $Harvesting\ \&\ threshing_i$  are the dependent variables;  $X_{1i}, X_{2i}, \dots, X_{50i}$  are  
701 the candidate independent variables as numbered in Table 2;  $\beta_0, \beta_1, \dots, \beta_{50}$  are the  
702 parameters to be estimated;  $\varepsilon_i$  is the error term; and n the number of sampled fields.

703

704 For Pelebina, regression models took the following forms:

705

706  $Yield_i = \beta_0 + \sum_{j=1}^{41} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.7)

707

708  $Field\ cleaning\ \&\ land\ preparation_i = \beta_0 + \sum_{j=1}^{10} \beta_j X_{ji} + \beta_{25} X_{25i} + \sum_{j=28}^{34} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.8)

709

710  $Sowing_i = \beta_0 + \sum_{j=1}^{14} \beta_j X_{ji} + \beta_{25} X_{25i} + \sum_{j=36}^{36} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.9)

711

712  $Weeding_i = \beta_0 + \sum_{j=1}^{31} \beta_j X_{ji} + \beta_{33} X_{33i} + \sum_{j=36}^{45} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.10)

713

714  $Harvesting\ \&\ threshing_i = \beta_0 + \sum_{j=1}^{41} \beta_j X_{ji} + \varepsilon_i, i = 1, \dots, n$  (A.11)

715

716 where  $Yield_i$ ,  $Field\ cleaning\ \&\ land\ preparation_i$ ,  $Sowing_i$ ,  $Weeding_i$ , and  $Harvesting\ \&$   
717  $threshing_i$  are the dependent variables;  $X_{1i}, X_{2i}, \dots, X_{41i}$  are the candidate independent  
718 variables as numbered in Table 2;  $\beta_0, \beta_1, \dots, \beta_{41}$  are the parameters to be estimated;  $\varepsilon_i$  is the  
719 error term; and n the number of sampled fields.

720

721 **References**

722

723 Ajayi, O., Nwilene, F.E., Gregorio, G., Okoruwa, V., Athanson, B., 2007. Demonstration and  
724 financial feasibility of the use of nets to prevent bird damage (Monograph Series # 35).  
725 Ibadan, Nigeria: Africa Rice Center (WARDA).

726 Ali, D., Deininger, K., 2015. Is there a farm size-productivity relationship in African  
727 agriculture? Evidence from Rwanda. *Land Econ.* 91, 317–343. doi:10.3368/le.91.2.317

728 Anderson, W., Johansen, C., Siddique, K.H.M., 2016. Addressing the yield gap in rainfed  
729 crops: a review. *Agron. Sustain. Dev.* 36, 1–13. doi:10.1007/s13593-015-0341-y

730 Asfaw, S., Lipper, L., 2015. Adaptation to climate change and its impacts on food security:  
731 evidence from Niger, in: *Agriculture in an Interconnected World*. International  
732 Conference of Agricultural Economists, 9-14 August 2015 in Milan, Italy.

733 Ashburner, J.E., Kienzle, J., 2011. Investment in agricultural mechanization in Africa.  
734 Conclusions and recommendations of a round table meeting of experts. Rome, Italy:  
735 FAO.

736 Balasubramanian, V., Sie, M., Hijmans, R.J., Otsuka, K., 2007. Increasing Rice Production in  
737 Sub-Saharan Africa: Challenges and Opportunities. *Adv. Agron.* 94, 55–133.  
738 doi:10.1016/S0065-2113(06)94002-4

739 Barker, L.E., Shaw, K.M., 2015. Best (but of t-forgotten) practices: checking assumptions  
740 concerning regression residuals. *Am. J. Clin. Nutr.* 102, 533–539.  
741 doi:10.3945/ajcn.115.113498.Best

742 Baudron, F., Thierfelder, C., Nyagumbo, I., Gérard, B., 2015. Where to target Conservation  
743 Agriculture for African smallholders? How to overcome challenges associated with its  
744 implementation? Experience from Eastern and Southern Africa. *Environments* 2, 338–  
745 357. doi:10.3390/environments2030338

746 Becker, M., Johnson, D.E., Wopereis, M.C.S., Sow, A., 2003. Rice yield gaps in irrigated  
747 systems along an agro-ecological gradient in West Africa. *J. Plant Nutr. Soil Sci.* 166,

748 61–67. doi:10.1002/jpln.200390013

749 Bell, M.A., Balasubramanian, V., Rickman, J.F., n.d. Manual transplanting [WWW  
750 Document]. IRRI Rice Knowl. Bank. URL  
751 [http://www.knowledgebank.irri.org/index.php?option=com\\_zoo&view=item&layout=item](http://www.knowledgebank.irri.org/index.php?option=com_zoo&view=item&layout=item)  
752 &Itemid=464 (accessed 11.8.17).

753 Belsley, D., 1991. A guide to using the collinearity diagnostics. *Comput. Sci. Econ. Manag.* 4,  
754 33–50. doi:10.1007/BF00426854

755 Beza, E., Silva, J.V., Kooistra, L., Reidsma, P., 2017. Review of yield gap explaining factors  
756 and opportunities for alternative data collection approaches. *Eur. J. Agron.* 82, 206–222.  
757 doi:10.1016/j.eja.2016.06.016

758 Biggs, S., Justice, S., 2015. Rural and agricultural mechanization. A history of the spread of  
759 small engines in selected Asian countries (IFPRI Discussion Paper 01443). Washington,  
760 USA: IFPRI.

761 Bijay-Singh, Shan, Y.H., Johnson-Beebout, S.E., Yadvinder-Singh, Buresh, R.J., 2008. Crop  
762 Residue Management for Lowland Rice-Based Cropping Systems in Asia. *Adv. Agron.*  
763 98, 177–199. doi:10.1016/S0065-2113(08)00203-4

764 Bishop, J., McKay, H., Parrott, D., Allan, J., 2003. Review of international research literature  
765 regarding the effectiveness of auditory bird scaring techniques and potential  
766 alternatives. London, UK: DEFRA.

767 Box, G.E.P., Cox, D.R., 1964. An Analysis of Transformations. *J. R. Stat. Soc.* 26, 211–252.

768 Byerlee, D., De Janvry, A., Sadoulet, E., Townsend, R., Klytchnikova, I., 2008. World  
769 development report 2008: agriculture for development. Washington, DC : World Bank  
770 Group. doi:10.1596/978-0-8213-7233-3

771 Caton, B.P., Mortimer, A.M., Foin, T.C., Hill, J.E., Gibson, K.D., Fischer, A.J., 2001. Weed  
772 shoot morphology effects on competitiveness for light in direct-seeded rice. *Weed Res.*  
773 41, 155–163. doi:10.1046/j.1365-3180.2001.00228.x

774 Conceição, P., Levine, S., Lipton, M., Warren-rodríguez, A., 2016. Toward a food secure  
775 future: ensuring food security for sustainable human development in sub-Saharan

776 Africa. *Food Policy* 60, 1–9. doi:10.1016/j.foodpol.2016.02.003

777 Culliney, T.W., 2005. Benefits of Classical Biological Control for Managing Invasive Plants.  
778 CRC. *Crit. Rev. Plant Sci.* 24, 131–150. doi:10.1080/07352680590961649

779 Curfs, H.P.F., 1976. Systems development in agricultural mechanization with special  
780 reference to soil tillage and weed control: a case study for West Africa. Wageningen,  
781 NL: Veenman.

782 Danvi, A., Jütten, T., Giertz, S., Zwart, S.J., Diekkrüger, B., 2016. A spatially explicit  
783 approach to assess the suitability for rice cultivation in an inland valley in central Benin.  
784 *Agric. Water Manag.* 177, 95–106. doi:10.1016/j.agwat.2016.07.003

785 De, A., Sen, R., 1992. A work measurement method for application in Indian agriculture. *Int.*  
786 *J. Ind. Ergon.* 10, 285–292. doi:10.1016/0169-8141(92)90095-H

787 de Mey, Y., Demont, M., 2013. Bird damage to rice in Africa: evidence and control, in:  
788 Wopereis, M.C.S., Johnson, D.E., Ahmadi, N., Tollens, E., Jalloh, A. (Eds.), *Realizing*  
789 *Africa's Rice Promise*. CABI: Wallingford, UK, pp. 241–249.  
790 doi:10.1079/9781845938123.0241

791 Demont, M., 2013. Reversing urban bias in African rice markets: A review of 19 national rice  
792 development strategies. *Glob. Food Sec.* 2, 172–181. doi:10.1016/j.gfs.2013.07.001

793 Diagne, M., Amovin-Assagba, E., Futakuchi, K., Wopereis, M.C.S., 2013. Estimation of  
794 cultivated area, number of farming households and yield for major rice growing  
795 environments in Africa, in: Wopereis, M.C.S., Johnson, D.E., Ahmadi, N., Tollens, E.,  
796 Jalloh, A. (Eds.), *Realizing Africa's Rice Promise*, 2013. CABI: Wallingford, UK, p. p 35-  
797 45. doi:10.1079/9781845938123.0188

798 Diao, X., Cossar, F., Houssou, N., Kolavalli, S., 2014. Mechanization in Ghana: emerging  
799 demand, and the search for alternative supply models. *Food Policy* 48, 168–181.  
800 doi:10.1016/j.foodpol.2014.05.013

801 Diao, X., Silver, J., Takeshima, H., 2016. *Agricultural mechanization and agricultural*  
802 *transformation (IFPRI Discussion Paper 01527)*. Washington, USA: IFPRI.

803 Djagba, J.F., Rodenburg, J., Zwart, S.J., Houndagba, C.J., Kiepe, P., 2014. Failure and

804 success factors of irrigation systems developments: A case study from the Oueme and  
805 Zou valleys in Benin. *Irrig. Drain.* 63, 328–339. doi:10.1002/ird.1794

806 Douthwaite, B., Gummert, M., 2010. Learning selection revisited: how can agricultural  
807 researchers make a difference? *Agric. Syst.* 103, 245–255.  
808 doi:10.1016/j.agsy.2010.01.005

809 Dzanku, F.M., Jirström, M., Marstorp, H., 2015. Yield gap-based poverty gaps in rural Sub-  
810 Saharan Africa. *World Dev.* 67, 336–362. doi:10.1016/j.worlddev.2014.10.030

811 Efthimiadou, A.P., Karkanis, A.C., Bilalis, D.J., Efthimiadis, P., 2009. Review: the  
812 phenomenon of crop-weed competition; a problem or a key for sustainable weed  
813 management? *J. Food, Agric. Environ.* 7, 861–868.

814 Ellis, F., Freeman, H.A., 2016. Rural livelihoods and poverty reduction strategies in four  
815 African countries. *J. Dev. Stud.* 40, 1–30. doi:10.1080/00220380410001673175

816 Ernst, O.R., Kemanian, A.R., Mazzilli, S.R., Cadenazzi, M., 2016. Depressed attainable  
817 wheat yields under continuous annual no-till agriculture suggest declining soil  
818 productivity. *F. Crop. Res.* 186, 107–116. doi:10.1016/j.fcr.2015.11.005

819 Fonteh, M.F., 2010. Agricultural mechanization in Mali and Ghana: strategies, experiences  
820 and lessons for sustained impacts. Rome, Italy: FAO.

821 Franke, A.C., Berkhout, E.D., Iwuafor, E.N.O., Nziguheba, G., Dercon, G., Vandeplass, I.,  
822 Diels, J., 2010. Does crop-livestock integration lead to improved crop production in the  
823 savanna of West Africa. *Exp. Agric.* 46, 439–455. doi:10.1017/S0014479710000347

824 Freeman, R., 2008. Labour productivity indicators. Paris, France: OECD.

825 Frelat, R., Lopez-ridaura, S., Giller, K.E., Herrero, M., Douxchamps, S., Andersson  
826 Djurfeldte, A., Erenstein, O., Henderson, B., Kassieb, M., Paulf, B.K., Rigolot, C.,  
827 Ritzemaa, R.S., Rodriguez, D., van Asteni, P.J.A., van Wijk, M.T., 2016. Drivers of  
828 household food availability in sub-Saharan Africa based on big data from small farms.  
829 *Proc. Natl. Acad. Sci. U. S. A.* 113, 458–463. doi:10.1073/pnas.1518384112

830 Gabre-madhin, E.Z., Haggblade, S., 2004. Successes in African agriculture: results of an  
831 expert survey. *World Dev.* 32, 745–766. doi:10.1016/j.worlddev.2003.11.004

832 Gao, S., Tanji, K.K., Scardaci, S.C., 2004. Impact of rice straw incorporation on soil redox  
833 status and sulfide toxicity. *Agron. J.* 96, 70–76. doi:10.2134/agronj2004.0070

834 Gebremedhin, B., Pender, J., Tesfay, G., 2003. Community natural resource management:  
835 the case of woodlots in Northern Ethiopia. *Environ. Dev. Econ.* 8, 129–148.  
836 doi:10.1017/S1355770X0300007X

837 Gianessi, L.P., 2013. The increasing importance of herbicides in worldwide crop production.  
838 *Pest Manag. Sci.* 69, 1099–1105. doi:10.1002/ps.3598

839 Gongotchame, S., Dieng, I., Ahouanton, K., Johnson, J., 2014. Participatory evaluation of  
840 mechanical weeders in lowland rice production systems in Benin. *Crop Prot.* 61, 32–37.  
841 doi:10.1016/j.cropro.2014.03.009

842 Gruber, I., Kloos, J., Schopp, M., 2009. Seasonal water demand in Benin's agriculture. *J.*  
843 *Environ. Manage.* 90, 196–205. doi:10.1016/j.jenvman.2007.08.011

844 Guirkinger, C., Platteau, J.-P., 2014. The Effect of Land Scarcity on Farm Structure:  
845 Empirical Evidence from Mali. *Econ. Dev. Cult. Change* 62, 195–238.

846 Guirkinger, C., Platteau, J.P., Goetghebuer, T., 2015. Productive inefficiency in extended  
847 agricultural households: Evidence from Mali. *J. Dev. Econ.* 116, 17–27.  
848 doi:10.1016/j.jdeveco.2015.03.003

849 Haggblade, S., Hazell, P.B.R., 2010. *Successes in African agriculture: lessons for the future.*  
850 Baltimore, MD: The Johns Hopkins University Press.

851 Hengsdijk, H., Langeveld, J.W.A., 2009. Yield trends and yield gap analysis of the major  
852 crops in the world. Wageningen, NL: Wettelijke Onderzoekstaken Natuur & Milieu.

853 Holmstrom, B., 1982. Moral hazard in teams. *Bell J. Econ.* 11, 74–91. doi:10.2307/3003457

854 Houmy, K., Clarke, L.J., Ashburner, J.E., Kienzle, J., 2013. *Agricultural Mechanization in*  
855 *Sub-Saharan Africa: Guidelines for preparing a strategy.* Rome, Italy: FAO.

856 Huang, M., Zhou, X., Cao, F., Xia, B., Zou, Y., 2015. No-tillage effect on rice yield in China: a  
857 meta-analysis. *F. Crop. Res.* 183, 126–137. doi:10.1016/j.fcr.2015.07.022

858 Huang, M., Zou, Y., Jiang, P., Xia, B., Feng, Y., Cheng, Z., Mo, Y., 2012. Effect of tillage on  
859 soil and crop properties of wet-seeded flooded rice. *F. Crop. Res.* 129, 28–38.

860 doi:10.1016/j.fcr.2012.01.013

861 Huang, S., Zeng, Y., Wu, J., Shi, Q., Pan, X., 2013. Effect of crop residue retention on rice  
862 yield in China: a meta-analysis. *F. Crop. Res.* 154, 188–194.  
863 doi:10.1016/j.fcr.2013.08.013

864 ILO, 2015. Key Indicators of the Labour Market (KILM) 16. Labour productivity. Geneva,  
865 Switzerland: ILO.

866 ILO, 2008. Report IV. Promotion of rural employment for poverty reduction. Geneva,  
867 Switzerland: ILO.

868 IRRI, 2007. Growth stages of the rice plant [WWW Document]. Knowl. bank. URL  
869 [http://www.knowledgebank.irri.org/ericeproduction/0.2.\\_Growth\\_stages\\_of\\_the\\_rice\\_pla](http://www.knowledgebank.irri.org/ericeproduction/0.2._Growth_stages_of_the_rice_plant.htm)  
870 [nt.htm](http://www.knowledgebank.irri.org/ericeproduction/0.2._Growth_stages_of_the_rice_plant.htm) (accessed 11.8.17).

871 IRRI, n.d. Land preparation [WWW Document]. URL [http://www.knowledgebank.irri.org/step-](http://www.knowledgebank.irri.org/step-by-step-production/pre-planting/land-preparation)  
872 [by-step-production/pre-planting/land-preparation](http://www.knowledgebank.irri.org/step-by-step-production/pre-planting/land-preparation) (accessed 3.6.17).

873 Ittersum, M.K. Van, Cassman, K.G., Grassini, P., Wolf, J., Tittonell, P., Hochman, Z., 2013.  
874 Yield gap analysis with local to global relevance — A review. *F. Crop. Res.* 143, 4–17.  
875 doi:10.1016/j.fcr.2012.09.009

876 Koning, N.B.J., Ittersum, M.K. Van, Becx, G.A., Boekel, M.A.J.S. Van, Brandenburg, W.A.,  
877 Broek, J.A. Van Den, Goudriaan, J., Hofwegen, G. Van, Jongeneel, R.A., Schiere, J.B.,  
878 Smies, M., 2008. Long-term global availability of food: continued abundance or new  
879 scarcity? *NJAS - Wageningen J. Life Sci.* 55, 229–292. doi:10.1016/S1573-  
880 5214(08)80001-2

881 Kriesemer, S.K., 2013. Rice cropping systems and resource efficiency. Frankfurt, Germany:  
882 GIZ.

883 Krupnik, T.J., Shennan, C., Settle, W.H., Demont, M., Ndiaye, A.B., 2012. Improving irrigated  
884 rice production in the Senegal River Valley through experiential learning and innovation.  
885 *Agric. Syst.* 109, 101–112. doi:10.1016/j.agry.2012.01.008

886 Lawrence, P.R., Dijkman, J.T., 1997. The introduction of animal traction into inland valley  
887 regions. 2. Dry season cultivation and the use of herbicides in rice. *J. Agric. Sci.* 129,

888 71–75.

889 Leonardo, W.J., Ven, G.W.J. Van De, Udo, H., Kanellopoulos, A., Siteo, A., Giller, K.E.,  
890 2015. Labour not land constrains agricultural production and food self-sufficiency in  
891 maize-based smallholder farming systems in Mozambique. *Food Secur.* 7, 857–874.  
892 doi:10.1007/s12571-015-0480-7

893 Mejía, D.J., 2003. An overview of rice post-harvest technology: use of small metallic silos for  
894 minimizing losses, in: Duffy, R. (Ed.), *Sustainable Rice Production for Food Security*.  
895 FAO, Bangkok, p. 306.

896 Mey, Y. De, Demont, M., Diagne, M., 2012. Estimating Bird Damage to Rice in Africa:  
897 Evidence from the Senegal River Valley. *J. Agric. Econ.* 63, 175–200.  
898 doi:10.1111/j.1477-9552.2011.00323.x

899 Milgroom, J., Giller, K.E., 2013. Courting the rain: Rethinking seasonality and adaptation to  
900 recurrent drought in semi-arid southern africa. *Agric. Syst.* 118, 91–104.  
901 doi:10.1016/j.agsy.2013.03.002

902 Ministère des Affaires étrangères, Cirad, GRET, 2003. Le riz, in: *Mémento de L'agronome*.  
903 Ministère des Affaires étrangères, Centre de coopération internationale en recherche  
904 agronomique pour le développement (CIRAD), Groupe de recherche et d'échanges  
905 technologiques (GRET), pp. 799–811.

906 Mmari, D., Mpanduji, S., 2014. Frugal innovation for inclusive development: a case study on  
907 power tillers in Tanzania. Dar es Salaam, Tanzania: REPOA.

908 N'Cho, S.A., 2014. Socio-economic impacts and determinants of parasitic weed infestation in  
909 rainfed rice systems of sub-Saharan Africa. Wageningen, NL: Wageningen University.

910 Ndiaye, K., 2011. Boosting agricultural mechanization in rice-based systems in sub-  
911 Saharan Africa. St. Louis, Senegal: AfricaRice.

912 Netting, R.M., 1993. *Smallholders,householders: farm families and the ecology of intensive,*  
913 *sustainable agriculture.* Stanford, US: Stanford University.

914 Niang, A., Becker, M., Ewert, F., Dieng, I., Gaiser, T., Tanaka, A., Senthilkumar, K.,  
915 Rodenburg, J., Johnson, J., Akakpo, C., Segda, Z., Gbakatchetche, H., Jaiteh, F., Bam,

916 R.K., Dogbe, W., Keita, S., Kamissoko, N., Mossi, I.M., Bakare, O.S., Cissé, M., Baggie,  
917 I., Ablede, K.A., Saito, K., 2017. Variability and determinants of yields in rice production  
918 systems of West Africa. *F. Crop. Res.* 207, 1–12. doi:10.1016/j.fcr.2017.02.014

919 Nicol, A., Langan, S., Vitor, M., Gonsalves, J., 2011. Socioeconomic barriers to adoption and  
920 scaling-out of water-smart agriculture in Tanzania, in: Nicol, A., Langan, S., Vitor, M.,  
921 Gonsalves, J. (Eds.), *Water-Smart Agriculture in East Africa*. Colombo, Sri Lanka:  
922 International Water Management Institute (IWMI). CGIAR Research Program on Water,  
923 Land and Ecosystems (WLE); Kampala, Uganda: Cooperative for Assistance and Relief  
924 Everywhere (CARE), p. 352. doi:10.5337/2015.203

925 Nonhebel, S., Kastner, T., 2011. Changing demand for food , livestock feed and biofuels in  
926 the past and in the near future. *Livest. Sci.* 139, 3–10. doi:10.1016/j.livsci.2011.03.021

927 Nwilene, F.E., Oikeh, S.O., Agunbiade, T.A., Oladimeji, O., Ajayi, O., Sié, M., Gregorio, G.B.,  
928 Togola, A., Touré, A.D., 2008. *Growing lowland rice: a production handbook*. Cotonou,  
929 Benin: Africa Rice Center (WARDA).

930 Ogwuiké, P., Rodenburg, J., Diagne, A., Agboh-Noameshie, A.R., Amovin-Assagba, E.,  
931 2014. Weed management in upland rice in sub-Saharan Africa: impact on labor and  
932 crop productivity. *Food Secur.* 6, 327–337. doi:10.1007/s12571-014-0351-7

933 Onwude, D.I., Abdulstter, R., Gomes, C., Hashim, N., 2016. Mechanisation of large-scale  
934 agricultural fields in developing countries – a review. *J. Sci. Food Agric.* 96, 3969–3976.  
935 doi:10.1002/jsfa.7699

936 Ortega, D.L., Waldman, K.B., Richardson, R.B., Clay, D.C., Snapp, S., 2016. Sustainable  
937 intensification and farmer preferences for crop system attributes: evidence from  
938 Malawi's Central and Southern regions. *World Dev.* 87, 139–151.  
939 doi:10.1016/j.worlddev.2016.06.007

940 Palis, F.G., Singleton, G., Sumalde, Z., Hossain, M., 2007. Social and cultural dimensions of  
941 rodent pest management. *Integr. Zool.* 2, 174–183. doi:10.1111/j.1749-  
942 4877.2007.00057.x

943 Paresys, L., Malézieux, E., Huat, J., Kropff, M.J., Rossing, W.A.H., 2018. Between all-for-one

944 and each-for-himself: on-farm competition for labour as determinant of wetland cropping  
945 in two Beninese villages. *Agric. Syst.* 159, 126–138. doi:10.1016/j.agsy.2017.10.011

946 Paresys, L., Malézieux, E., Huat, J., Kropff, M.J., Rossing, W.A.H., 2016. Resource  
947 endowment and the greater good : balancing labour between family and individual fields  
948 on Beninese farms, in: *Social and Technological Transformation of Farming Systems:  
949 Diverging and Converging Pathways. Proceedings of the 12th European IFSA  
950 Symposium, 12-15 July 2016 in Harper Adams University, UK.* p. 14.

951 Pingali, P., 2007. Agricultural mechanization: adoption patterns and economic impact.  
952 *Handbooks Econ.* 3, 2779–2805. doi:10.1016/S1574-0072(06)03054-4

953 Pingali, P.L., Khiem, N.T., Gerpacio, R. V, Xuan, V.-T., 1997. Prospects for sustaining  
954 Vietnam's re-acquired rice exporter status 1. *Food Policy* 22, 345–358.  
955 doi:10.1016/S0306-9192(97)00023-7

956 Rim, J.-Y., Rouse, J., 2002. Knowing the village, in: Cook, J. (Ed.), *The Group Savings  
957 Resource Book.* pp. 60–66.

958 Rodenburg, J., Johnson, D.E., 2009. Weed management in rice-based cropping systems in  
959 Africa. *Adv. Agron.* 103, 149–218. doi:10.1016/S0065-2113(09)03004-1

960 Rodenburg, J., Saito, K., Irakiza, R., Makokha, D.W., Onyuka, E.A., Senthilkumar, K., 2015.  
961 Labor-saving weed technologies for lowland rice farmers in sub-Saharan Africa. *Weed  
962 Sci. Soc. Am.* 29, 751–757. doi:10.1614/WT-D-15-00016.1

963 Rusinamhodzi, L., Dahlin, S., Corbeels, M., 2016. Living within their means: reallocation of  
964 farm resources can help smallholder farmers improve crop yields and soil fertility. *Agric.  
965 Ecosyst. Environ.* 216, 125–136. doi:10.1016/j.agee.2015.09.033

966 Saito, K., Dieng, I., Toure, A.A., Somado, E.A., Wopereis, M.C.S., 2014. Rice yield growth  
967 analysis for 24 African countries over 1960-2012. *Glob. Food Sec.* 5, 62–69.  
968 doi:10.1016/j.gfs.2014.10.006

969 Saito, K., Nelson, A., Zwart, S.J., Niang, A., Sow, A., Yoshida, H., Wopereis, M.C.S., 2013.  
970 Towards a better understanding of biophysical determinants of yield gaps and the  
971 potential for expansion of rice-growing area in Africa, in: Wopereis, M.C.S., Johnson,

972 D.E., Ahmadi, N., Tollens, E., Jalloh, A. (Eds.), *Realizing Africa's Rice Promise*. CABI:  
973 Wallingford, UK, pp. 188–202. doi:10.1079/9781845938123.0000

974 Seck, P.A., Diagne, A., Mohanty, S., Wopereis, M.C.S., 2012. Crops that feed the world 7:  
975 Rice. *Food Secur.* 4, 7–24. doi:10.1007/s12571-012-0168-1

976 Selim, S., 2012. Labour productivity and rice production in Bangladesh: a stochastic frontier  
977 approach. *Appl. Econ.* 44, 641–652. doi:10.1080/00036846.2010.515203

978 Sender, J., Johnston, D., 2004. Searching for a weapon of mass production in rural Africa:  
979 unconvincing arguments for land reform. *J. Agrar. Chang.* 4, 142–164.  
980 doi:10.1111/j.1471-0366.2004.00075.x

981 Senthilkumar, K., Bindraban, P.S., Thiyagarajan, T.M., Ridder, N. De, Giller, K.E., 2008.  
982 Modified rice cultivation in Tamil Nadu, India: Yield gains and farmers' (lack of)  
983 acceptance. *Agric. Syst.* 98, 82–94. doi:10.1016/j.agsy.2008.04.002

984 Sidhu, B.S., Rupela, O.P., Beri, V., Joshi, P.K., 1998. Sustainability implications of burning  
985 rice- and wheat-straw in Punjab. *Econ. Polit. Wkly.* 33, A163–A168.

986 Silva, J.V., Reidsma, P., Laborte, A.G., van Ittersum, M.K., 2017. Explaining rice yields and  
987 yield gaps in Central Luzon, Philippines: An application of stochastic frontier analysis  
988 and crop modelling. *Eur. J. Agron.* 82, 223–241. doi:10.1016/j.eja.2016.06.017

989 Stuart, A.M., Ruth, A., Pame, P., Vasco, J., Dikitanan, R.C., Rutsaert, P., Julia, A.,  
990 Malabayabas, B., Lampayan, R.M., Radanielson, A.M., Singleton, G.R., 2016. Yield  
991 gaps in rice-based farming systems: insights from local studies and prospects for future  
992 analysis. *F. Crop. Res.* 194, 43–56. doi:10.1016/j.fcr.2016.04.039

993 Tanaka, A., Diagne, M., Saito, K., 2015. Causes of yield stagnation in irrigated lowland rice  
994 systems in the Senegal River Valley: application of dichotomous decision tree analysis.  
995 *F. Crop. Res.* 176, 99–107. doi:10.1016/j.fcr.2015.02.020

996 Tanaka, A., Johnson, J., Senthilkumar, K., Akakpo, C., Segda, Z., Yameogo, L.P., Bassoro,  
997 I., Mapiemfu, D., Allarangaye, M.D., Gbakatchetche, H., Bayuh, B.A., Jaiteh, F., Bam,  
998 R.K., Dogbe, W., Sékou, K., Rabeson, R., Rakotoarisoa, N.M., Kamissoko, N., Maïga,  
999 I., Bakare, O.S., Mabone, F.L., Gasore, E.R., Baggie, I., Kajiru, G.J., Mghase, J.,

1000 Ablede, K.A., Nanfumba, D., Saito, K., 2017. On-farm rice yield and its association with  
1001 biophysical factors in sub-Saharan Africa. *Eur. J. Agron.* 85, 1–11.  
1002 doi:10.1016/j.eja.2016.12.010

1003 Tanaka, A., Saito, K., Azoma, K., Kobayashi, K., 2013. Factors affecting variation in farm  
1004 yields of irrigated lowland rice in southern-central Benin. *Eur. J. Agron.* 44, 46–53.  
1005 doi:10.1016/j.eja.2012.08.002

1006 Thi My Phung, N., Brown, P.R., Leung, L.K.P., 2013. Use of computer simulation models to  
1007 encourage farmers to adopt best rodent management practices in lowland irrigated rice  
1008 systems in An Giang Province, the Mekong Delta, Vietnam. *Agric. Syst.* 116, 69–76.  
1009 doi:10.1016/j.agsy.2012.11.003

1010 Thirtle, C., Piesse, J., College, K., 2003. The impact of research-led agricultural productivity  
1011 growth on poverty reduction in Africa, Asia and Latin America 31, 1959–1975.  
1012 doi:10.1016/j.worlddev.2003.07.001

1013 Thuy, N.H., Shan, Y., Bijay-Singh, Wang, K., Cai, Z., Yadvinder-Singh, Buresh, R.J., 2008.  
1014 Nitrogen supply in rice-based cropping Systems as affected by crop residue  
1015 management. *Soil Sci. Soc. Am. J.* 72, 514–523. doi:10.2136/sssaj2006.0403

1016 Tittonell, P., 2014. Livelihood strategies, resilience and transformability in African  
1017 agroecosystems. *Agric. Syst.* 126, 3–14. doi:10.1016/j.agsy.2013.10.010

1018 Tittonell, P., Giller, K.E., 2013. When yield gaps are poverty traps: The paradigm of  
1019 ecological intensification in African smallholder agriculture. *F. Crop. Res.* 143, 76–90.  
1020 doi:10.1016/j.fcr.2012.10.007

1021 Totin, E., Mierlo, B. Van, Saïdou, A., Mongbo, R., Agbossou, E., Stroosnijder, L., Leeuwis,  
1022 C., 2012. Barriers and opportunities for innovation in rice production in the inland valleys  
1023 of Benin. *NJAS - Wageningen J. Life Sci.* 60–63, 57–66. doi:10.1016/j.njas.2012.06.001

1024 Tréca, B., 1977. Le problème des oiseaux d'eau pour la culture du riz au Sénégal. *Bull.*  
1025 *l'Institut Fondam. d'Afrique Noire série A* 39, 682–692.

1026 UN, 2015a. MDG Report 2015. Assessing progress in Africa toward the millennium  
1027 development goals. Addis Abada, Ethiopia: UN.

1028 UN, 2015b. Sustainable development goals. 17 goals to transform our world [WWW  
1029 Document]. URL [http://www.un.org/sustainabledevelopment/sustainable-development-](http://www.un.org/sustainabledevelopment/sustainable-development-goals/)  
1030 [goals/](http://www.un.org/sustainabledevelopment/sustainable-development-goals/) (accessed 4.12.16).

1031 van den Ban, A., 2011. Increasing labour productivity in agriculture and its implications. *J.*  
1032 *Agric. Educ. Ext.* 17, 401–409. doi:10.1080/1389224X.2011.596414

1033 van der Ploeg, J.D., 2008. The new peasantries: struggles for autonomy and sustainability in  
1034 an era of empire and globalization. London [etc.], GB: Earthscan.

1035 Van Oort, P.A.J., Saito, K., Tanaka, A., Amovin-assagba, E., Bussel, L.G.J. Van, 2015.  
1036 Assessment of rice self-sufficiency in 2025 in eight African countries. *Glob. Food Sec.* 5,  
1037 39–49. doi:10.1016/j.gfs.2015.01.002

1038 Vandeplass, I., Vanlauwe, B., Merckx, R., Deckers, J., 2008. Bridging the gap between  
1039 farmers and researchers through collaborative experimentation. Cost and labour  
1040 reduction in soybean production in South-Nyanza, Kenya, in: European Association of  
1041 Agricultural Economists International Congress, 26-29 August 2008 in Ghent, Belgium.

1042 Vissoh, P. V, Gbèhounou, G., Ahanchédé, A., Kuyper, T.W., Röling, N.G., 2004. Weeds as  
1043 agricultural constraint to farmers in Benin: results of a diagnostic study. *NJAS -*  
1044 *Wageningen J. Life Sci.* 52, 305–330. doi:10.1016/S1573-5214(04)80019-8

1045 Wijk, M.T. Van, Tittonell, P., Rufino, M.C., Herrero, M., Pacini, C., Ridder, N. De, Giller, K.E.,  
1046 2009. Identifying key entry-points for strategic management of smallholder farming  
1047 systems in sub-Saharan Africa using the dynamic farm-scale simulation model  
1048 NUANCES-FARMSIM. *Agric. Syst.* 102, 89–101. doi:10.1016/j.agsy.2009.07.004

1049 Woodhouse, P., 2010. Beyond industrial agriculture? Some questions about farm size,  
1050 productivity and sustainability. *J. Agrar. Chang.* 10, 437–453. doi:10.1111/j.1471-  
1051 0366.2010.00278.x

1052 Worou, O.N., Gaiser, T., Saito, K., Goldbach, H., Ewert, F., 2013. Spatial and temporal  
1053 variation in yield of rainfed lowland rice in inland valley as affected by fertilizer  
1054 application and bunding in North-West Benin. *Agric. Water Manag.* 126, 119–124.  
1055 doi:10.1016/j.agwat.2013.04.007

1056 Xu, Y., Nie, L., Buresh, R.J., Huang, J., Cui, K., Xu, B., Gong, W., Peng, S., 2010. Agronomic  
1057 performance of late-season rice under different tillage, straw, and nitrogen  
1058 management. *F. Crop. Res.* 115, 79–84. doi:10.1016/j.fcr.2009.10.005  
1059 You, L., Ringler, C., Wood-sichra, U., Robertson, R., Wood, S., Zhu, T., Nelson, G., Guo, Z.,  
1060 Sun, Y., 2011. What is the irrigation potential for Africa? A combined biophysical and  
1061 socioeconomic approach. *Food Policy* 36, 770–782. doi:10.1016/j.foodpol.2011.09.001  
1062 Zimdahl, R.L., 2004. *Weed crop competition: a review*. Oxford [etc.], GB: Blackwell.  
1063

1064 Figure 1: Location of case-study villages and photo impressions of the rice growing  
1065 environments.

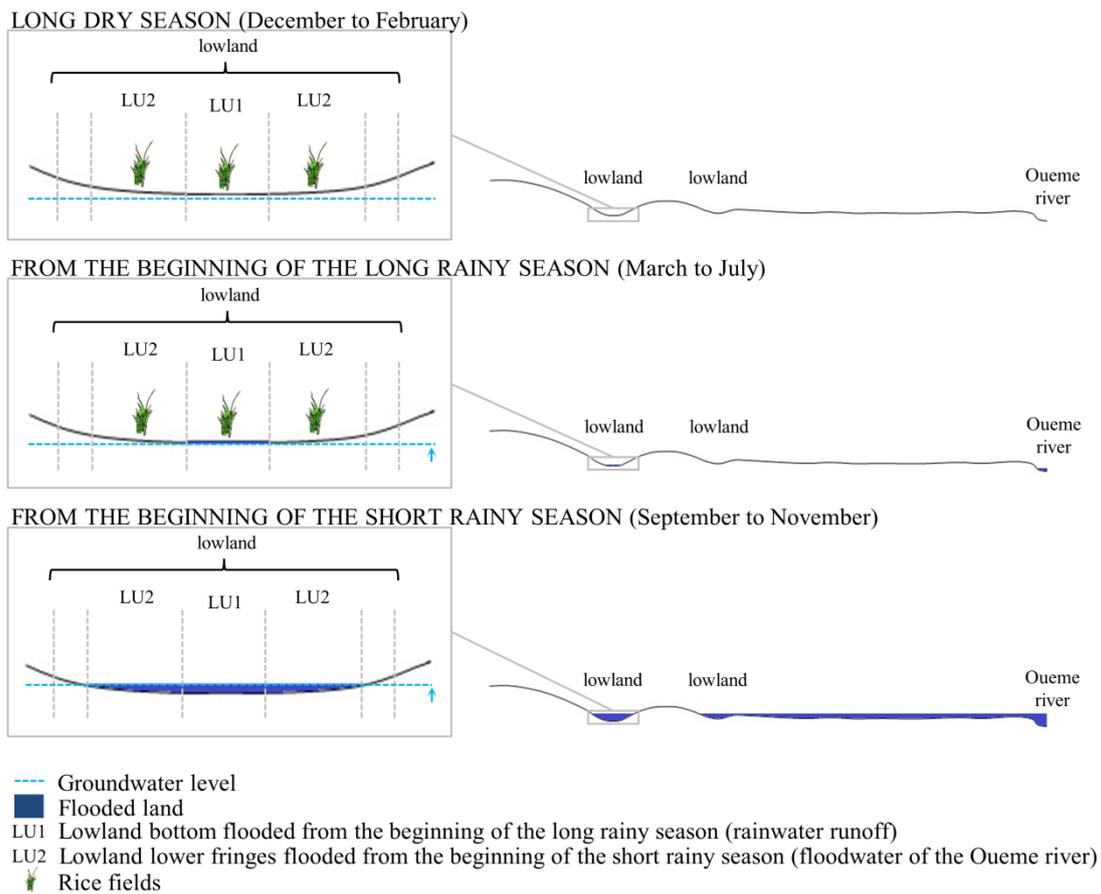
1066



1067

1068

1069 Figure 2: Flooding period and flood regime for the major landscape units (LU) where rice was  
 1070 cultivated in Zonnon.  
 1071

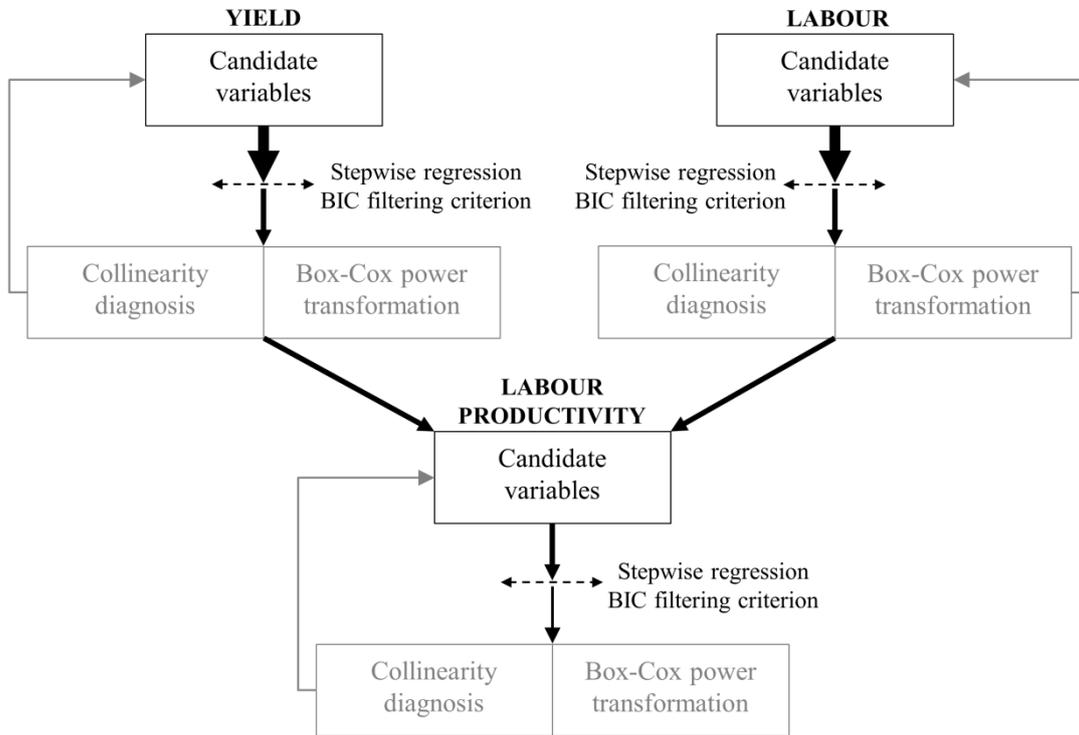


1072

1073

1074 Figure 3: Overview of the steps used in regression analyses. Steps for testing and validating  
1075 statistical assumptions are indicated in grey.

1076



1077

1078

1079 Figure 4: Yield and labour productivity gaps in the case-study villages. A. Relationship  
1080 between yield and labour. B. Relationship between labour productivity and labour. C.  
1081 Relationship between labour productivity and yield. Yield and labour productivity gaps are  
1082 symbolised by arrows (black arrows for Pelebina and grey arrows for Zonmon) and are  
1083 expressed as a percentage of the average highest yield and labour productivity decile.  
1084 Average yield and average labour productivity are displayed at the bottom of arrows.  
1085 Average highest yield decile and average highest labour productivity decile are displayed at  
1086 the top of arrows.  
1087

