1	Effects of Leucaena biochar addition on crop productivity in
2	degraded tropical soils
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### 21 Abstract

22 Biochar has the potential to increase crop yields on degraded, tropical soils. It can be readily produced in rural community settings using low-cost technology and is most economically 23 feasible if produced from local biomass or waste residues. Biochar was produced from 24 Leucaena biomass using low-cost pyrolysis and sequential pot experiments were then 25 conducted in Malaysia on three degraded soils. We first evaluated the effect of Leucaena 26 27 biochar on yields of *Amaranthus*, a leafy vegetable crop and measured changes to soil pH and 28 nutrient availability over two growth cycles. We then tested whether any yield response to biochar was dependent upon the rate of biochar or fertilizer application. We found that biochar 29 application at 30 t ha<sup>-1</sup> with maximal fertilizer increased yields between 17-53 % on very 30 strongly acidic soil. Biochar added at 15 t ha<sup>-1</sup> with maximal fertilizer increased yield by 54 % 31 on strongly acidic soil whilst there was no significant yield response on fertilized, slightly 32 33 acidic soil. Unfertilized biochar treatments showed small yield responses across all soils over 2 growth cycles (9-11 %), but yields were much lower than in fertilized treatments. Biochar 34 also decreased short-term N availability when applied with fertilizers, which may improve 35 36 nitrogen retention and substantially increased soil pH. This may reduce mobility of Fe, Mn and Al ions, which were negatively associated with yield. Our results suggest that Leucaena biochar 37 can elicit a positive crop yield response but only when combined with fertilizer additions on 38 very strongly to strongly acidic tropical soils. 39

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# 43 Keywords:

44 Biochar, Malaysia, Yield, Degraded Tropical Soils, Soil pH, Food Security

### 45 **1. Introduction:**

Global human population is expected to increase to over 9 billion by 2050 with food demand 46 projected to rise by 70 - 100 % as a result [1]. In developing countries, at current levels of 47 productivity, agricultural land area under cultivation will need to increase substantially to 48 meet this demand, with severe implications for natural ecosystems, particularly in tropical 49 50 regions [2-4]. Closing the current yield gap between potential and realized crop yields could dramatically reduce the requirement for further agricultural expansion, whilst also providing 51 a pathway to poverty alleviation. Biochar has attracted significant interest as an agricultural 52 soil amendment due to its potential for increasing crop productivity, with additional benefits 53 in terms of improved soil fertility and mitigation of climate change [5]. Given the possible 54 benefits from biochar, its potential for supporting a range of the Sustainable Development 55 Goals (SDG) of the United Nations is widely recognised [6]. 56

When applied to soils, biochar interacts with soil physical, chemical and biological 57 58 properties, potentially conferring improvements to soil quality and crop productivity [7]. It also can provide long term carbon (C) sequestration due to the stable, recalcitrant nature of 59 organic C relative to the original biomass [8]. Biochar addition to soils can improve soil 60 physical properties and water retention by increasing aggregate stability, reducing bulk 61 density and hydraulic conductivity [9, 10]. This may promote nutrient retention by reducing 62 63 leaching of nutrients in soil solution [11]. Biochar may also ameliorate soil acidity, which in turn can alleviate ion toxicity and increase availability of many soil nutrients [12]. These 64 effects on soil properties have been suggested as a mechanism for the average  $\sim 10$  % increase 65 in crop yields as a result of biochar addition [13, 14]. 66

However, crop productivity responses to biochar addition are highly variable, with some
studies showing positive effects whilst others found neutral to negative effects [13, 15]. The

inconsistencies in crop yield responses may be attributable to variation in the properties of 69 70 biochar applied (due to feedstocks used and specific pyrolysis conditions) and the time since 71 application [16-18]. However, initial soil properties have shown to be stronger predictors of yield response with pH, cation exchange capacity (CEC) and organic carbon negatively 72 correlated and clay content positively associated with crop yield response to biochar addition 73 [15]. This is significant as 30 % of the world's soils are classified as acidic, which includes 74 75 over 50 % of potential arable land [19]. These soil characteristics are also typically associated with highly weathered and degraded soils across the humid tropics, with a recent meta -76 77 analysis showing that biochar addition resulted in a ~25 % increase in crop yields in the tropics whilst there was no significant effect of addition on temperate soils [20]. 78 Despite the potential for biochar application on tropical soils, for its adoption by rural 79 smallholder farmers in developing countries to be economically feasible, small-scale 80 decentralised pyrolysis technology must be utilised with feedstocks obtained locally and a 81 focus on higher-value (non-cereal) crop yield improvement [21, 22]. We therefore tested 82 whether a low-cost, locally produced biochar, using Leucaena leucocephala biomass, could 83 elicit a crop yield response in Amaranthus across three degraded agricultural soils from 84 85 Malaysia with low fertility and a range of soil pH. Leucaena is a ruderal, fast-growing, tropical leguminous tree, which is drought tolerant, capable of growing across a wide range 86 87 of soils, pH and is currently utilised for forage and fuelwood production in tropical regions [23, 24]. This adaptability to a wide range of edaphic conditions and ability to grow on 88 degraded lands makes it useful as a tool for land restoration and as a feedstock for biochar 89 production [25]. Using a series of sequential pot experiments, we tested the following 90 hypotheses: 91

*H1:* Addition of *Leucaena* biochar to tropical, degraded soils will increase crop yield
irrespective of fertilizer addition, with greater yield responses at higher biochar addition rates.

94 *H2:* Crop yield response will be driven by the effects of *Leucaena* biochar on soil nutrient
95 availability.

96

### 97 2. Methods:

# 98 2.1 - Soil Collection and Biochar Production

Agricultural soils were collected from the Crops for the Future field research centre 99 (CFFRC), Malaysia (2.933162 N, 101.878028 W) located east of the town of Semenyih, 100 101 Malaysia (Figure S1). The research centre agricultural land covers 12.8 ha and forms part of the Balau Estate, which is mainly planted with oil palm. The surrounding estate was first 102 planted with rubber followed by two further rotations of oil palm. The sampling area was 103 104 subject to one rotation of oil palm prior to being used as an oil palm nursery up until 2014. This was then cleared and used to grow maize, Bambara groundnuts and Napier grass. This 105 area is low lying with high rates of surface runoff and soil erosion, resulting in low soil 106 fertility (Personal Communication - Gin Teng Ooi). The climate is tropical and aseasonal 107 with an average annual temperature of 27.2 °C. Eleven year mean annual rainfall ranged from 108 109 1454-2808mm with a mean of 1987mm (unpublished data). Three soils were sampled from this area representing a range of low fertility, degraded tropical soils. Two soils were taken 110 from the Rengam series (Nitisol) which is a coarse, sandy clay derived from acid igneous 111 112 parent material whilst one soil was a fine sandy clay loam derived from quaternary alluvium parent material. ~200 kg (Exp 1) and ~ 400 kg (Exp 2) of each soil were collected from the 113 top 0 - 10 cm by hand. Five subsamples of each soil type were collected for initial physico-114 115 chemical analysis and field bulk density (using a 7.5 cm diameter ring to 5cm depth).

Biochar was produced from *Leucaena leucocephala* woody biomass in a custom made, low
cost retort kiln (Model CR-570, Kenaboi Nature Resources, Puchelong Selangor, Malaysia)

(Figure S2 - S3) with a final pyrolysis temperature of 600-700°C held for 4 hours. This wasthen homogenized to pass through a 2mm sieve prior to application.

# 120 2.2 - Experimental Design and Setup

Two sequential experiments were conducted in a shade house located at CFFRC, Malaysia 121 between 03 - 05/2018 (Exp 1) and 02 - 04/2019 (Exp 2). The first experiment explored the 122 crop and soil nutrient response to a single dose of biochar using a standard recommended 123 fertilisation rate. The second experiment expanded on this work to include two levels of 124 biochar applications in combination with standard and reduced fertilisation rates to assess the 125 potential for biochar to improve nutrient management. The three soils collected from CFFRC 126 were firstly homogenised using a trowel/spade and hand mixed with any large stones or 127 coarse woody debris removed. 9 kg of soil was added to 10 L plastic pots and treatments 128 129 (biochar and fertilizer applications) were applied in a fully factorial design with all combination of treatments being applied to all three soil types. For Exp 1, two rates of 130 biochar (0 and 30 t ha<sup>-1</sup>) and fertilizer (0 and 0.4 t ha<sup>-1</sup> NPK (15:10:10), 25 t ha<sup>-1</sup> poultry 131 manure) addition were applied to each soil (n = 60) (Table 1). For Exp 2, three rates of 132 biochar (0, 15 and 30 t ha<sup>-1</sup>) and fertilizer (0.4, 0.2 and 0.1 t ha<sup>-1</sup> NPK (15:10:10) and 25, 133 12.5, 6.25 t ha<sup>-1</sup> poultry manure) addition were applied to each soil (n = 135) (Table 1). 134 Fertilizer application rates were based on local growers guidelines [26]. 135

Both biochar and fertilizer were fully incorporated by hand mixing. Water was then added to achieve 75 % of maximum water holding capacity and pots were arranged in the shade house as 5 blocks of 12 (Exp 1: 3 soil types x 4 treatments) and 27 (Exp 2: 3 soil types x 9 treatments) for randomized complete block designs. 1 g of *Amaranthus Tricolor* seeds were dispersed across the soil surface, lightly covered in soil, watered and left to germinate. This plant was selected because it is grown as a leafy vegetable across the region. These were

thinned to 5 plants which were then left to grow to maturity over 35 days. Plants experienced 142 ambient photoperiod, but soil moisture was maintained throughout the experiment using an 143 automated drip feed system and weekly water additions back to initial pot weight. Air 144 temperature within the shade house was measured throughout the experiments using Hobo 145 pendant loggers (Onset Computer Corporation, MA, USA) (Table S1). During Exp 1 and 146 Exp 2 the mean air temperature was  $30.87 \pm 0.05$  °C and  $30.50 \pm 0.01$  °C respectively. After 147 148 35 days, mature *Amaranthus* plants were harvested by cutting aboveground biomass (AGB) level with the soil surface and drying in an oven at 40 °C until constant weight. For Exp 1, 1g 149 150 of Amaranthus Tricolor seed were re-sown as described above and a repeat application of inorganic fertilizer was applied as a top dressing (0.4 t ha<sup>-1</sup> NPK). These will subsequently be 151 referred to as Exp 1a (growth cycle 1) and Exp 1b (growth cycle 2). 152

## 153 2.3 – Soil Analysis

Maximum soil water holding capacity was measured for the three soils in triplicate, 154 calculated as the amount of water remaining in the soil after being saturated and left to drain 155 for 24 h in a fully humid airspace [27]. Soil bulk density was determined by drying at 105°C 156 after sieving to 2mm to remove roots and stones [28]. Subsamples of soil and biochar were 157 characterised for pH, total C, N, inorganic P and K. Soil pH was determined on 5 fresh soil 158 samples and biochar using a calibrated pH meter (Hanna Instruments, UK) in a soil - water 159 160 suspension (1:2.5 ratio of soil to deionised water) after stirring and standing for 30 min. The remaining soil was air dried. Inorganic P was extracted from air dried soils and biochar using 161 0.5M Sodium Bicarbonate, (Olsen P). K was extracted using 0.1M magnesium acetate. P and 162 163 K were then determined using a calibrated and blank corrected SoilTest 10 spectrophotometer (Palintest, Gateshead, UK). Subsamples for total C and N were dried at 105°C for 24 hours, 164 sieved to pass a 2mm sieve and ground to a fine powder using a pestle and mortar. These 165 were analysed using dry combustion at 980°C using a LECO Truspec Micro (LECO 166

167 Corporation, Michigan, USA). Following biomass harvesting at the end of the experiment,
168 fresh soil samples were collected from each pot and pH measured using the method described
169 above.

170 2.4 - Soil nutrient availability

At the end of Exp 1a, Exp 1b and Exp 2, soil nutrient availability was assessed using 171 commercial ion exchange membranes (PRS<sup>TM</sup> Probes, Western AG, Saskatoon, Canada) after 172 biomass harvesting [29]. Pairs of plastic probes (1 anion and 1 cation exchange) housing the 173 membranes were installed within every pot to 0-10cm depth for 24 hours to measure the 174 availability of N, P, K, Mg and micronutrient ions (S, Fe, Mn, Al) in soil solution. Once 175 removed, probes were washed thoroughly with deionised water and shipped to the 176 manufacturer for analysis. Probes were eluted using 0.5M HCl for 1 hour. NO<sub>3</sub><sup>-</sup> and NH<sub>4</sub><sup>+</sup> 177 178 were measured colorimetrically using automated flow injection analysis (FIA). All other elements were analysed using inductively coupled plasma-optical emission spectroscopy 179 180 (ICP-OES). Results are reported as supply rates per area of membrane available for ion exchange over the burial period ( $\mu g/10 \text{ cm}^2/\text{day}$ ). In the absence of competing sinks such as 181 plant roots, these membranes mimic plant root uptake dynamics and provide an estimate of 182 potential soil nutrient supply. 183

### 184 2.5 – Statistical Analysis

All statistical analyses were performed using R (Version 3.5.2). Differences between initial
soil properties were tested using one-way ANOVA and Tukey's honest significance
difference test. To test hypothesis 1 that addition of *Leucaena* biochar would stimulate crop
yield, we used ANOVA with AGB as a response variable, soil type, biochar application and
fertilizer application rate as explanatory variables and their interactions. Experimental block
was included as a covariate to account for potential differences in microclimatic conditions

and growth rates within the shade house. Normality was checked by inspecting Q-Q plots and
plotting residuals vs fitted values. For Exp 1a and Exp 1b, AGB was log transformed whilst
for Exp 2 it was square root transformed to achieve normality of residuals. Where significant
treatment effects were detected, post-hoc multiple pairwise comparisons were performed
using estimated marginal means (emmeans) [30] implemented in the R package emmeans
[31]. P-values were adjusted for multiple comparisons using the Tukey method.

To test hypothesis 2 that crop yield response would be driven by the effects of Leucaena 197 biochar on soil pH and nutrient availability we first determined the effect of biochar on soil 198 pH and nutrients using ANOVA with soil pH and each soil nutrient as response variables. 199 Soil type, biochar application and fertilizer application rate were included as explanatory 200 variables with interactions. We then used multiple linear regression with AGB as the 201 response variable, soil pH and nutrient availability (inorganic N, P, K, Mg, S, Fe, Mn, Al) as 202 explanatory variables. Fe and Mn were summed as their availability was highly correlated (r 203 >0.9). Biochar application rate was also specified as a factor within the models to account for 204 the unmeasured, potential physical effects of biochar application to soils and interaction 205 terms between nutrients and biochar were also included. Variables were selected using a 206 207 forward-backward stepwise procedure using AIC score as a selection criterion [32]. To determine the relative importance of predictors, averaging over order of regressors was 208 209 performed using the Relaimpo R package [33]. To visualise interactions within models, partial regression plots were produced using the visreg R package [34]. 210

211 **3. Results:** 

# 212 3.1 – Initial soil and biochar properties

213 The three soils used in the mesocosm experiments varied predominantly in terms of their pH

214 (F<sub>2,12</sub> = 32.58, p = <0.001), being classified as very strongly acidic (pH - 5.08 ± 0.13),

strongly acidic ( $5.45 \pm 0.06$ ) and slightly acidic ( $6.14 \pm 0.08$ ) (Table 2) [35]. Total C ( $F_{2,12} =$ 40.72, p = <0.001), N ( $F_{2,12} = 14.45$ , p = <0.001) and K content ( $F_{2,12} = 35.06$ , p = <0.001) also varied between land uses. However, the magnitude of differences were small and all soils had extremely low soil C and N (<1.38 % and N < 0.11 %), indicating low soil quality [36]. Soil P concentrations ( $F_{2,12} = 0.75$ , p = 0.49) and field bulk density ( $F_{2,12} = 2.75$ , p = 0.10) did not vary between soils (Table 2). *Leucaena* biochar was strongly alkaline with high C, N and K concentrations relative to all soils (Table 2).

# 3.2 - The effect of Leucaena biochar application rate and fertilization on aboveground biomass

During Exp 1a, biochar addition was a significant predictor of AGB (Figure 1A, Table 3) (p 224 225 = 0.009). Post-hoc pairwise comparisons revealed that the response to biochar addition varied 226 according to soil type. A significant crop yield response was observed when added to the very strongly acidic soil with AGB increased by  $\sim 17$  % from  $15.99 \pm 0.90$  to  $19.24 \pm 1.08$  g, in 227 combination with fertilizer addition (*emmeans*: p = 0.02) (Figure 1A). However, there was no 228 effect of biochar addition on AGB when added to strongly acidic (No Biochar:  $18.65 \pm 1.05$ , 229 Biochar:  $18.98 \pm 1.07$ , p = 0.83) or slightly acidic soil (No Biochar:  $16.64 \pm 0.94$ , Biochar: 230  $16.53 \pm 0.93$ , p = 0.94) with fertilizer addition (Figure 1A). Averaged across all soils, biochar 231 addition increased AGB without fertilizer by ~11 % (No Biochar:  $6.74 \pm 0.22$ , Biochar: 7.56 232 233  $\pm 0.25$  g dry weight biomass, *emmeans*: p = 0.02) but yields were less than half of those in fertilized treatments (Figure 1A). During Exp 1b the effect of biochar on AGB was dependent 234 on fertilization (biochar x fertilizer: p = 0.01) (Table 3) as biochar increased AGB yield 235 across all soils without fertilizer addition (~9 %) (No Biochar:  $3.98 \pm 0.10$ , Biochar:  $4.37 \pm$ 236 0.12 g dry weight biomass, *emmeans*: p = 0.02) but did not influence yield when combined 237 with fertilizer (Figure 1B). Exp 2 showed that biochar application, fertilizer addition and soil 238 type were all significant predictors of Amaranthus AGB (Table 3). However, a three-way 239

interaction between biochar, fertilizer and soil type indicated that the effect of biochar on 240 AGB was dependent upon fertilizer addition and this effect varied between soils (p = 0.03) 241 (Table 3). Post-hoc pairwise comparisons showed that biochar increased AGB by  $\sim$ 53 % 242 (relative to no biochar application) when applied to very strongly acidic soil at 30 t ha<sup>-1</sup> in 243 combination with the highest rate of fertilizer application (No Biochar:  $7.81 \pm 1.52$ , 30 t ha<sup>-1</sup> 244 Biochar:  $16.25 \pm 2.22$  g dry weight biomass, *emmeans*: p = 0.006) (Figure 1C). Biochar 245 application also increased AGB by ~54 % (relative to no biochar application) when applied to 246 the strongly acidic soil at 15 t ha<sup>-1</sup>, in combination with the highest rate of fertilizer addition 247 (No Biochar:  $7.95 \pm 1.54$ , 15 t ha<sup>-1</sup> Biochar:  $17.30 \pm 2.29$  g dry weight biomass, *emmeans*: p 248 = 0.003) (Figure 1C). There was no significant effect of biochar application on the slightly 249 acidic soil, irrespective of the rate of biochar or fertilizer addition (Figure 1C). 250

## 251 3.3 – Biochar effects on soil nutrients and pH as drivers of aboveground biomass

Soil pH was significantly increased by both biochar application and fertilizer addition (Figure 252 253 2, Table 4) although an interaction between biochar and fertilizer indicated that biochar increased soil pH more strongly in the absence of fertilizer than in combination (Exp 1a: p = 254 0.02, Exp 1b: p = 0.001, Exp 2: p = 0.05). Addition of *Leucaena* biochar increased soil 255 inorganic N availability without fertilizer addition and decreased N availability with fertilizer 256 (Exp 1a: p = 0.07, Exp 1b: p = 0.009, Exp 2: p = 0.001) (Table S2, Figure 3A, D, Figure 4A). 257 258 In contrast, soil K availability was significantly increased by biochar addition (Exp 1a: p = <0.001, Exp 1b: p = <0.001, Exp 2: p = <0.001) and accounted for  $\sim15-73$  % of explained 259 variation (Table S3, Figures 3C, F, Figure 4C). Soil P availability was not explained by 260 biochar addition and was explained overwhelmingly by the rate of fertilization throughout 261 both experiments (Exp 1a: p = <0.001, Exp 1b: p = <0.001, Exp 2: p = <0.001) (Table S4, 262 Figures 3B, E, Figure 4B). Soil Mg was increased by biochar in Exp 1a and Exp 1b although 263 the effect was greatest without fertilizer (Biochar x Fertilizer: Exp 1a: p = 0.02, Exp 1b: p =264

<0.001) (Table S5, Figure 3D, H). Soil S, Fe, Mn and Al were not influenced by biochar</li>
addition.

267 Variance in AGB was positively related to Mg availability (Exp 1a: p = <0.001, Exp 1b: p =0.02, Exp 2:  $p = \langle 0.001 \rangle$  and negatively associated with Fe + Mn availability (Exp 1a: p =268 0.03, Exp 1b:  $p = \langle 0.001, Exp 2: p = 0.005 \rangle$  across all experiments (Table 5). Mg availability 269 explaining between 12.35-37.85 % of explained variation in AGB whilst Fe + Mn explained 270 between 3.39-7.45 % (Table 5). Biochar addition was also a significant predictor of AGB 271 ((Exp 1a, Exp 1b, Exp 2: p = <0.001) and explained between 2.35-10.71 % of explained 272 variation in AGB (Table 5) whilst interactions between inorganic N, S (Exp 1b), Mg, Al (Exp 273 2) and biochar also explained variation in AGB. In Exp 1b, greater inorganic N availability 274 was associated with increased AGB without biochar and reduced AGB with biochar (p =275 0.005) (Figure S6) whilst the positive effect of S on AGB was stronger with biochar addition 276 (p = 0.005) (Figure S7). In Exp 2, higher soil Al was associated with lower AGB without 277 biochar but had little effect on AGB with biochar added at 30 t ha<sup>-1</sup> (p = 0.04) (Figure S8), 278 whilst the positive effect of Mg on AGB was marginally stronger with higher rates of biochar 279 addition (p =0.09) (Figure S9). Across Exp 1a and Exp 2, AGB was positively related to soil 280 P whilst, K availability was negatively related to AGB (Table 5). 281

# 282 Discussion

Biochar has been proposed as a potential soil amendment to improve soil quality and increase crop yields, particularly on degraded or highly weathered tropical soils [20, 37, 38].

However, for biochar to be an economically feasible and scalable solution, it must confer

crop productivity benefits, be produced from feedstocks available locally and using low-cost,

287 decentralized pyrolysis technologies [21]. We produced biochar from Leucaena using a low-

288 cost retort kiln which, although offering limited control over pyrolysis conditions, is

particularly suited for use in low and middle income countries and in smallholder farming
systems as a shared community resource [39]. We then performed a series of mesocosm
experiments to assess the potential of locally produced *Leucaena* biochar to improve soil
quality and crop yields across three degraded tropical soils in Malaysia.

Our findings did not support hypothesis 1 as we found that biochar addition at 30 t ha<sup>-1</sup> only 293 had a substantial yield benefit (+17-53 % in AGB across two sequential experiments) when 294 applied with fertilizer and on very strongly acidic soils (Figure 1). This agrees with many 295 previous studies that have shown the potential for biochar to increase crop yields is greatest 296 on the most acidic, tropical soils [15, 20, 40]. However, a previous study using biochar 297 produced from low-cost pyrolysis on tropical soil found a greater yield response to biochar on 298 acidic soils under nutrient limited conditions [41]. Our results contradict these findings as the 299 level of yield stimulation was highly dependent upon the rate of fertilization, with the greatest 300 yield response observed with a maximal dose of nutrients (Figure 1). When we applied 301 biochar and fertilizer at multiple rates (Exp 2), there was no clear relationship between 302 biochar addition rate and AGB (Figure 1). In very strongly acidic soils, biomass increased by 303 53 % at a rate of 30 t ha<sup>-1</sup> whilst crop yields were increased by 54 % on strongly acidic soils 304 at 15 t ha<sup>-1</sup> with no significant yield response on slightly acidic soils (Figure 1C). Previous 305 studies have demonstrated conflicting relationships between biochar application rate and crop 306 307 yields with positive, neutral or negative associations with yield being reported, with increased rates of biochar addition [14, 42-45]. The lack of relationship between biochar dose rate and 308 crop productivity may be related to soil-biochar interactions which can regulate soil pH and 309 nutrient availability [46]. 310

We hypothesised that any crop yield response would be driven by the positive effects of biochar on soil nutrient availability (Hypothesis 2). However, in disagreement we found that only soil K availability was consistently increased by biochar application (Figure 3-4) and

this was negatively associated with AGB (Table 5). Increased soil K availability likely
reflects direct supply from biochar addition as *Leucaena* biochar K concentrations were high
(Table 2) relative to all soils and studies of nutrient release dynamics from other biochar's
have shown that K is rapidly leached from biochar ash into soil solution [47, 48]. As we
found strong positive relationships between Mg availability and AGB across all experiments,
the negative relationship between K and AGB may be due to nutrient antagonism as high K
concentrations may interfere with root Mg uptake [49].

We did find that when biochar was applied with fertilizer, soil inorganic N was reduced and 321 there appeared to be a negative relationship between soil inorganic N and the rate of biochar 322 application (Figures 3A, Figure 4A, Table S2). As we used ion exchange membranes which 323 depend on equilibrium dynamics [29], this may be explained by a slower N release from 324 biochar amended soils. Our findings agree with previous studies that have observed higher 325 326 nutrient retention and lower soil available N after biochar additions to soil [50-52] and are 327 consistent with studies showing that biochar can act as a slow-release ion sink at low dose rates [53], whilst at higher application rates it may effectively immobilize N [53-57]. 328 In highly weathered tropical soils, Fe, Mn and Al commonly accumulate at levels which 329 cause toxicity to plants [58, 59]. We found that soil Fe, Mn and Al were negatively related to 330 AGB (Table 5). Although we did not find an effect of Leucaena biochar addition on soil Fe, 331 332 Mn or Al concentrations, the effect of Al on AGB was negated at the highest biochar application rate (Figure S8). As Al solubility decreases with increasing pH and the Leucaena 333 biochar used in this study was strongly alkaline (Table 1) (pH 10) (Figure 2, Table 4), its 334 335 application may therefore be useful to alleviate toxicity in strongly acidic tropical soils.

## 336 4. Conclusions

337	Our results show that biochar produced locally using Leucaena biomass and low-cost
338	pyrolysis can elicit a positive crop yield response but only on very strongly to strongly acidic
339	tropical soils, in combination with fertilizer application. Biochar decreased short-term soil N
340	availability when applied with fertilizers, which may improve nitrogen use efficiency by
341	reducing rates of nitrogen leaching. Leucaena biochar also substantially increased soil pH.
342	This may benefit crop productivity as increased soil pH reduces the mobility of Fe, Mn and
343	Al ions, which we found were negatively associated with yield.

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### 347 **Conflict of Interest**

The authors declare no conflict of interest 348

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### 502 **Table Captions:**

Table 1 – Summary of the factors and number of replicates for each experiment. N = total
number of pots within each experiment.

Table 2 – Physical and chemical properties of three soils and chemical properties of biochar produced from *Leucaena* biomass in a low-cost, retort kiln. Soils data represent means (soil:  $n = 5) \pm 1$  standard error. Biochar pH, Total C and N represent means  $(n = 3) \pm 1$  standard error. Biochar extractable P and extractable K are n = 1.

509**Table 3** – Three-way ANOVA results for the effects of biochar addition, fertilizer addition510and soil type on above ground biomass of 5 *Amaranthus Tricolor* plants. The response511variable (above ground biomass) was log-transformed for results of Exp 1a and Exp 1b and512square root transformed for results of Exp 2 to achieve normality of residuals. Two and three-513way interaction terms were included, and experimental block was included as a covariate.  $R^2$ 514= adjusted  $R^2$ 

**Table 4** – Three-way ANOVA results for the effects of biochar addition, fertilizer addition and soil type on soil pH. The response variable (soil pH) was log-transformed to achieve normality of residuals. Two-way interaction terms were included, and experimental block was included as a covariate. Relative importance was calculated by averaging over orders of regressors and is presented as percentages of explained variation and sums to 100%.  $R^2 =$ adjusted  $R^2$ .

Table 5 – Multiple linear regression results for the effects of biochar addition and measured
soil variables on above ground biomass. The response variable (above ground biomass) was
log-transformed (Exp 1a and Exp 1b) and square root transformed (Exp 2) to achieve
normality of residuals. Two-way interaction terms between soil pH and soil nutrients were
included and experimental block was included as a covariate. Forward-backward stepwise

- 526 model selection was performed using AIC as a selection criterion. Relative importance was
- 527 calculated by averaging over orders of regressors and is presented as percentages of

528 explained variance which sum to 100%.  $R^2$  = adjusted  $R^2$ .

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530 Figure Captions:
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- 531 Figure 1 Dried above ground biomass of *Amaranthus Tricolor* after 35 days of growth
- during Exp 1a (A.), Exp 1b (B.) and Exp 2 (C.). Bars represent means (n = 5). Error bars

533 represent  $\pm 1$  standard error. Points represent overlaid raw data.

- Figure 2 Soil pH measured after harvesting of biomass during Exp 1a (A.), Exp 1b (B.) and
  Exp 2 (C.).
- 536 Figure 3 The availability of soil inorganic N, P, K and Mg measured using PRS ion

537 exchange membranes over a 1 day burial period. Measurements were made after harvesting

of biomass during Exp 1a (A-D) and Exp 1b (E-H). Bars represent means (n = 5). Error bars

- 539 represent  $\pm 1$  standard error.
- 540 Figure 4 Availability of soil inorganic N, P, K and Mg measured using PRS ion exchange
- 541 membranes over a 24 hour burial period. Measurements were made after harvesting of
- biomass during Exp 2. Bars represent means (n = 5). Error bars represent  $\pm 1$  standard error.