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Soil fertility regulates invasive herbivore performance and top-down control in tropical agroecosystems of Southeast Asia

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38 Abstract

In terrestrial ecosystems, changes in soil nutrient availability, plant growth or natural enemies 39 can generate important shifts in abundance of organisms at various trophic levels. In 40 41 agroecosystems the performance of (invasive) herbivores and their impacts on crops is of particular concern. Scientists are presently challenged with making reliable inferences on invader 42 success, natural enemy performance and efficacy of biological control, particularly in tropical 43 agroecosystems. In this study, we assess how trophic regulatory forces (bottom-up vs. top down) 44 influence the success of three globally important pests of cassava. We examine the mealybug 45 species (Hemiptera: Pseudococcidae) of differing host breadth and invasion history: 46 Phenacoccus manihoti, Paracoccus marginatus, and Pseudococcus jackbeardsleyi. Potted plant 47 fertilizer trials were combined with a regional survey in Vietnam, Laos and Cambodia of 65 48 49 cassava fields of similar size and age, but with varying soil fertility. Relative abundance of each mealybug invader was mapped along a soil fertility gradient, and contrasted with site-specific 50 measures of parasitism. Potted plant trials revealed strong bottom-up effects for *P. manihoti*, 51 52 such that impacts of nitrogen and potassium additions were propagated through to higher trophic 53 levels and substantially boost development and fitness of its specialist parasitoid, Anagyrus *lopezi* (Hymenoptera: Encyrtidae). Field surveys indicate that mealybug performance is highly 54 species-specific and context-dependent. For example, field-level abundance of P. jackbeardsleyi 55 56 and *P. marginatus*, was related to measures of soil fertility parameters, soil texture and plant 57 disease incidence. Furthermore, for *P. manihoti*, in-field abundance is equally associated with 58 soil texture (i.e., silt content). Principal component analysis (PCA) and regression suggested that 59 P. manihoti and P. marginatus are disproportionately favored in low-fertility conditions, while P. 60 *jackbeardsleyi* prospers in settings with high organic carbon and phosphorus. Parasitism of P. 61 manihoti by A. lopezi varied greatly with field and soil fertility conditions, and was highest in

soils with intermediate fertility levels and where management practices include the addition of fertilizer supplements. Our characterization of the relative performance of invasive mealybugs and strength of parasitism across variable soil fertility conditions will help guide parasitoid release programs and soil management practices that enhance mealybug biological control.

Keywords: classical biological control, trophic dynamics, soil fertility, biotic resistance,invasive species

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1. Introduction

Around the globe, impacts of human-mediated biodiversity loss, land-use change, and global 70 warming are proceeding at an unrelenting pace, with profound effects on ecosystems and 71 associated food webs (e.g., Vitousek et al., 1997; Newbold et al., 2016). Such changes are 72 particularly relevant for smallholder agriculture in the tropics, where soil fertility (and resulting 73 plant communities) is drastically altered by a variety of management practices and larger-scale 74 patterns in land-use change. In Southeast Asia, cassava (Manihot esculenta) production has 75 expanded considerably over the past few decades and now occupies more than 4 million ha 76 77 throughout the region (Cramb et al., 2016; Mahanty & Milne, 2016). Cassava is typically managed as an annual crop and grown under a range of biophysical and socio-economic 78 conditions, from shifting cultivation in the uplands of Laos and Cambodia, to large-scale 79 monocultures in the lowlands of southern Vietnam (e.g., Howeler et al., 2011). This crop 80 produced especially well in the early years of cultivation, due to an overall absence of limiting 81 pests and diseases. However, over the past decade, a series of non-native mealybug (Hemiptera: 82 Pseudococcidae) species have colonized Asia's prime cassava-growing regions (Graziosi et al., 83 2016). These include (1) *Phenacoccus manihoti* Matile-Ferrero, a Neotropical parthenogenetic, 84 85 oligophagous herbivore (9 host records) with broad climatic adaptability (Yonow et al., 2017) and global distribution (33 countries); (2) Paracoccus marginatus Williams & Granara de 86 Willink, a Nearctic sexual, polyphagous herbivore (133 host genera), reported from 33 different 87 88 countries; and (3) *Pseudococcus jackbeardsleyi* Gimpel & Miller, a Neotropical polyphagous species (98 host genera), found in 46 countries worldwide. Invasion history is variable between 89 90 species, with respective colonization processes in mainland SE Asia presumably initiated around 91 2008, 2010, and 1987 respectively (Ben-Dov et al., 2016), and biological control with parasitic

wasps such as Anagyrus lopezi De Santis (for P. manihoti, released in 2009), Acerophagus 92 papayae Noyes & Schauff (for P. marginatus, colonized post-2010) and a set of endemic and 93 exotic generalists wasps for *P. jackbeardsleyi* (Muniappan et al., 2009). 94 Soil fertility and overall quality has been shown to be a principal determinant of plant health 95 and resistance to pests and disease (e.g., Amtmann et al. 2008), however, the impact of 96 97 belowground processes on aboveground interactions is varied and often difficult to predict (Wardle et al. 2004). Understanding how these invasive herbivores and their associated 98 parasitoids interact and respond to soil fertility conditions offers a number of possible benefits 99 100 for managing pests. For example, such information could help target parasitoid releases, identify 101 context-specific needs for integrated pest management and help improve our overall understanding of linkages between above and below-ground processes. So far, little research has 102 103 been conducted on trophic regulation and associated invader success along gradients of ecosystem productivity or soil fertility (e.g., Zarnetske et al., 2013). While some suggest that 104 highly fertile sites disproportionately favor invaders, regardless of top-down forces such as 105 106 parasitoids (see Hovick & Carson, 2015), evidence also exists to the contrary. Alterations in resource availability or species abundance are transmitted through trophic 107 108 chains, and affect the relative role of resource ("bottom-up") versus consumer ("top-down") forces in the structuring of ecological communities (Hunter & Price, 1992; Ives & Carpenter, 109 2007). Changes in top predators or basal resources, e.g., through fertilizer addition, can shift the 110 111 equilibrium abundances of various trophic levels and affect the relative success of certain species (native or exotic) Comparatively few empirical studies have concurrently assessed the relative 112 effect of top-down, bottom-up and interactive processes on ecological communities (Moran & 113 114 Scheidler, 2002; Gruner, 2004; Garibaldi et al., 2010) and population-level processes under field

115 conditions are rarely considered in addressing such issues (Walker et al., 2008; Zaugg et al., 116 2013; Rzanny et al., 2013). Success rates of invasive species are explained through a range of hypotheses linked to trophic processes, in which community productivity, disturbance, species 117 diversity and natural enemy action are all posed as important determinants. As these hypotheses 118 are non-exclusive, interactions between mechanisms are increasingly employed to predict 119 120 invasion outcomes and invader success (e.g., Parepa et al., 2013; Mallon et al., 2015; Peltzer et al., 2016). Certain theories simultaneously account for the role of resource availability (e.g., soil 121 fertility) and natural enemies (Blumenthal, 2005; Center et al., 2014). 122 123 Particularly for sessile invasive herbivores, such as mealybugs, plant nutritional quality strongly determines species abundance and performance, shaping entire herbivore feeding guilds 124 (Shurin et al., 2002; Carcamo et al., 2005; Rzanny et al., 2013). Also, soil fertility and plant 125 126 nutrients may lead to differential, species-specific responses amongst invaders (Peltzer et al., 2016). Invader success and trophic regulation have previously been linked to single-nutrient 127 (e.g., soil N, P, K, Zn) measures (e.g., Walter & DiFonzo, 2007; Chen et al., 2010). However, 128 129 increasing attention is being paid to overall plant quality and more universal measures of soil fertility (e.g., Ode, 2006; Bardgett & van der Putten, 2014). Thus, composite soil fertility indices 130 131 potentially can help explain relative success of invasive mealybugs and associated biological control processes in fields with differing resource availability. 132 In this study, we assess soil-plant-herbivore-parasitoid interactions through both manipulative 133 134 and observational approaches to better understand the relative influence of top-down vs. bottom up forces on herbivore pest performance. We evaluate the effect of resource quality on the 135 success of invasive mealybug species, in a controlled laboratory setting as well as, in cassava 136 fields along a soil fertility gradient. More specifically, we address the following three research 137

138	questions: (1) do fertilizer supplement studies reveal the effects of single-element additions of
139	nitrogen (N) and potassium (K) on <i>P. manihoti</i> performance and top-down forces (i.e., parasitism
140	by a recently-introduced natural enemy); (2) does abundance of different invasive species vary
141	along a soil fertility gradient, and do particular measures of soil fertility explain invader success;
142	(3) do top-down forces (i.e., parasitism by a recently-introduced natural enemy) shift in
143	importance between contexts of varying resource quality, as determined by soil fertility.
144	
145	2. Materials and Methods
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147	2.1. Potted plant fertilizer trials
148	2.1.1. Plant cultivation
149	In this set of trials, we assessed the extent to which single-element nutrient additions affected
150	different development parameters of P. manihoti, and its primary parasitoid, A. lopezi. During
151	2014-2015, assays were established at Hue University of Agriculture and Forestry (HUAF), in
152	Hue, Vietnam. Soil was collected from an uncultivated plot at the HUAF experimental campus,
153	and was homogenized for use in a controlled pot experiment. A sub-sample of this soil analyzed
154	at the HUAF laboratory of Agronomy was determined to have a pH of 5.2, an organic carbon (C)
155	content of 1.5%, and available concentrations of K_2O , N and P_2O_5 of 4.59 mg, 0.65 mg and 10.5
156	mg per 100 g of soil, respectively. Approximately 10 kg of this soil was placed in pots (30 dia. x
157	20 cm deep) and a single vegetative cutting (approx. 20 cm in length) of cassava (variety KM94,
158	a popular cassava variety, widely cultivated across the region) was planted vertically in each pot.
159	KM94 is. Pots were placed outside in a screen-house and watered daily. After two weeks, plants
160	were randomly assigned to five fertilizer treatments: 1) no fertilizer (i.e., untreated controls), 2)

low N addition (90 kg N ha⁻¹), 3) high N addition (180 kg N ha⁻¹), 4) low K addition (90 kg K₂O 161 ha⁻¹), and 5) high K addition (180 kg K_2O ha⁻¹). This was equivalent to application rates of 0.65 162 g and 1.30 g N and 0.50 and 1.00 g K₂O per pot (respectively for medium and high fertilizer 163 treatments) and represents fertilizer rates commonly applied by Asian cassava growers (e.g., 164 Howeler, 2011). We focused on N and K additions in the potted plant fertilizer trials, as cassava 165 166 is most responsive to these nutrients and has comparatively high capacity to mobilize P from tropical soils via root association with mycorrhizae and other mechanisms (Nguyen et al., 2007; 167 Howeler, 2011). Both N (as urea) and K (as K₂O) were dissolved in water and applied in liquid 168 169 form. After six weeks, the plants were moved into a climate-controlled chamber (ambient RH, 30 $\pm 1^{\circ}$ C and 12L: 12D). 170

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172 2.1.2. Mealybug and parasitoid colony maintenance

In mid-2014, a starter laboratory culture of P. manihoti was established from field-collected 173 individuals from Hue and Quang Tri, central Vietnam and reared on cassava stems grown in 174 175 glass jars with a diluted fertilizer solution inside 60 x 160 x 180 cm cages. Prior to initiation of the trials, a total of five P. manihoti sub-colonies were concurrently established in a climate-176 177 controlled chamber, on plants subjected to each of the above five experimental fertilizer treatments. Each sub-colony was initiated at the same time with approx. 100 mealybugs (mixed-178 age population), as obtained from the starter colony. Mealybug populations were maintained on 179 180 these plants for two to three generations prior to use in experiments, to mitigate the influence of parental trophic feeding history and eventual other maternal effects. A colony of A. lopezi was 181 established with field collected individuals obtained in mid-2015 from fields near Hue, Vietnam. 182 183 The laboratory colony was kept on cassava plantlets infected with *P. manihoti* in cages with the

following dimensions: $40 \ge 50 \ge 60$ cm. All of the mealybug and parasitoid colonies were maintained at $30 \pm 1^{\circ}$ C and 12L: 12D photoperiod, and colonies were regularly refreshed by adding (unspecified, yet small numbers of) field-collected individuals. Voucher specimens of mealybugs and *A. lopezi* wasps were deposited at Hue University of Agriculture and Forestry (VNUA), Vietnam.

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2.1.3. Experimental assays & data processing

At the onset of the experiment, a *P. manihoti* ovisac (egg batch) was collected from each 191 192 mealybug sub-colony and allowed to hatch. Upon emergence, ten first-instar nymphs were transferred to the 3rd youngest leaf of an experimental plant grown in the same fertilizer 193 treatment as the sub-colony. We used 20 un-fertilized control plants and 10 plants for each of the 194 195 N and K-addition treatments (N=60). Nymphs on each experimental plant were enclosed in one single 5 x 10 x 20 cm clip-cage. Clip-cages were constructed out of transparent, plastic 196 polypropylene (PP) containers and equipped with a mesh lid to allow sufficient ventilation. 197 198 Development and embryonic mortality of all nymphs (N=600) was thus assessed within each 199 fertility regime, following protocols by Tertuliano et al. (1993). Development parameters were 200 thus recorded for ten different cohorts (i.e., replicate clip-cages) under each fertilizer treatment, and cohort trials for the separate treatments were run simultaneously. Size and weight measures 201 were recorded for young females (stage L4, prior to oviposition) obtained from ten unfertilized 202 203 plants and five plants for each of the N and K-addition treatments (N= 300). Adult reproduction and mortality were recorded for each of the plant fertilizer treatments in a 204

separate experiment, using a new set of experimental potted cassava plants. Young females

206 (stage L4) were collected from each of the five sub-colonies, and transferred to clip cages on the

3rd youngest leaf of an experimental plant with the same fertilizer treatment as the sub-colony, 207 208 thus establishing a cohort of 10 females per clip-cage. Daily reproduction and mortality were recorded for all females per fertilizer treatment (N= 600). Furthermore, duration of the pre-209 210 reproductive period, fecundity and adult weight were assessed on 10 unfertilized control plants and five plants for each of the fertilizer treatments (N= 300) (e.g., Tertuliano et al., 1993). 211 212 Reproductive output for each adult was recorded on a daily basis by removing newly-laid ovisacs from the clip cage and counting the number of eggs under a stereomicroscope. 213 In a second set of laboratory assays, we assessed A. *lopezi* parasitoid fitness, development and 214 215 survival rates under the same fertilizer treatments used above. P. manihoti ovisacs were collected from each mealybug colony/fertilizer treatment combination, and one ovisac was placed in a 5 x 216 10 x 20 cm clip-cage on 10 unfertilized control plants and five plants for each of the fertilization 217 218 treatments (N=300). At nymphal emergence, a total of 70 first-instar nymphs were allowed to 219 establish within the cage, and the number was then reduced to 50 at the L3 stage (e.g., Van Driesche et al., 1987). Subsequently, a 1-day old adult, mated and naïve female A. lopezi wasp 220 221 was introduced into each clip-cage together with one adult male A. lopezi for a 24 h period and 222 allowed to oviposit. After the allotted time, the adult female parasitoid was transferred to another 223 clip cage with another 50 third-instar nymphs on a different plant, but at the same fertilizer treatment. By transferring each parasitoid on a daily basis to a new clip-cage with ample new 224 hosts, we were able to assess total lifetime reproductive output. A total of 20 female A. lopezi 225 226 were assessed on unfertilized controls, and 10 for each of the fertilization treatments (N = 60). This process was repeated on a daily basis until death of the female, regularly replacing male 227 wasps that had died. Daily parasitism rate was calculated as the average parasitism (number of 228 229 mummies/50 nymphs) within each cage every day, until death of the female. For each wasp,

230 lifetime fecundity (# mummies), oviposition period (d) and rate (mummy/d) were calculated. 231 After removal of the parasitoid from the clip-cage, each cassava plant was incubated at 30°C and mealybug mortality, parasitoid development time (egg deposition-mummification, and adult 232 233 emergence) and sex ratio were recorded. A total of 10 replicate female wasps were assayed from each fertilizer treatment and 20 replicates for the non-fertilized controls. Upon offspring 234 emergence, a subset of 60 wasps of each sex for the fertilized treatments, and 120 for the 235 controls, were isolated in Eppendorf vials and provided daily access to honey mixed with water 236 (50%). To assess longevity of wasps from each fertilizer treatment, we recorded daily mortality 237 238 rates

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240 2.2. Observational studies

241 2.2.1. Field-level arthropod survey

In a second experiment, a geographically widespread survey was conducted to assess the extent 242 to which mealybug abundance relates to soil fertility in a set of cassava fields, representative of 243 244 each of the target regions. During February-March 2015, a total of 65 fields were randomly chosen across three countries, with 20 fields in southern Vietnam, 18 in eastern Cambodia, and 245 246 27 in southern and south-central Laos. Fields were chosen within primary cassava-growing regions in each of the above countries, with assistance from local extension personnel. Plants 247 within each field were 6-9 months old, and were located in the countries' primary cassava-248 249 growing regions. Survey activities covered two provinces in Vietnam (Binh Thuan / Ba Ria Vung Tau, Dak Lak), two in Cambodia (Kracheh, Tboung Khmum), and four in Laos 250 (Bolikhamxay, Vientiane, Salavanh, Champasak). All survey work was carried out during the 251 252 region's main dry season, when mealybug populations are generally increasing (e.g., Graziosi et

253 al., 2016). Nearly 80% of the fields were planted with one of two popular cassava varieties 254 (KM94 and Rayong 72), while in the other fields, less common varieties were cultivated or varietal mixes were used. Five representative linear transects (approx. 10 m in length; covering 255 256 10 plants) were assessed for the presence of arthropods, and the number of resident mealybug species per field transect. We also examined plants for symptoms of cassava witches broom 257 disease (CWB), a phytoplasma disease that is commonly found in local fields (Alvarez et al., 258 259 2013; Graziosi et al., 2016). Mealybug species identity was determined according to morphological characteristics such as coloration and presence of abdominal waxy filaments (i.e., 260 261 short- or long-tailed). This permitted field identifications of the most common invasive mealybugs in Asia's cassava crops, including *P. manihoti*, *P. marginatus*, and *P. jackbeardsleyi*. 262 Also, in mixed-species infestations of long-tailed mealybugs, P. jackbeardsleyi tends to be the 263 264 prevalent species in Vietnam and Laos (Graziosi et al., 2016). Average abundance or incidence levels for each of the different species were then calculated at a field level and used for 265 subsequent analyses. 266

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2.2.2. Soil sampling and sample analysis

Leaf chemistry of mid- to late-season cassava is largely reflective of soil fertility status at early growth stages (e.g., Schulthess et al., 1997). In this experiment, we relate mealybug abundance to soil texture and fertility measures from samples collected at the time of the arthropod surveys (see Section 2.2.1; on 7-9 month old plants in the dry season). By doing so, we likely overlook eventual impacts of fertilizer supplementation at the time of planting, but do capture the effect of background soil fertility. This approach though is suitable given that fertilization practices are relatively uniform across the study region (except for Tay Ninh, Vietnam). One soil sample was collected along each of the five survey transects in each field. For each transect, two soil subsamples were collected from within the planting row (5-10 m apart) at two depths (0-20, 20-40
cm) using a 5 cm dia. corer. Soils from each transect were composited by depth, while rocks,
roots and other debris were removed prior to air-drying of each composite sample. Once all
samples were collected and dry, they were submitted to the soil diagnostics laboratory of the Soil
and Fertilizer Research Institute (SFRI) in the Vietnam Academy of Agricultural Sciences
(VAAS), in Hanoi, for nutrient analysis.

A suite of measurements of soil fertility and texture were conducted. Soil texture was assessed 283 284 according to the Bouyoucos method (Gee & Bauder, 1986). Other variables include pH (1:1, soil:water solution), electrical conductivity (EC; 1:5, soil:water solution), and exchangeable Ca, 285 Mg and K (extracted with ammonium acetate (NH₄CH₃CO₂) at pH 7 and measured by atomic 286 287 absorption spectrometry (AAS, Perkin Elmer 3100; Perkin Elmer, Norwalk, CT) and flame photometry (Elex 6361; Eppendorf, Hamburg, Germany) (Herrmann, 2005). Additionally, we 288 measured total organic C using the Walkley-Black method and total N using the Kjeldahl 289 290 method. Total P was measured using sulfuric acid-hydrogen peroxide-hydrofluoric acid digestion 291 with 18M H_2SO_4 , while total K was determined using hydrofluoric acid (HF) and either H_2SO_4 292 or HClO₄ (Sparks, 1996). Finally, available P was determined using Bray and Kurt (Bray II) method and acidity (Al3+, H+) was measured through titration with a KCl 1M solution (Sparks, 293 1996). 294

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296 2.3.Comparative evaluation of *P. manihoti* parasitism

297 *2.3.1. Field sites*

298 In a third set of experiments, we conducted a comparative field-level assessment of the strength 299 of top-down regulation of *P. manihoti* by parasitism. Cassava fields of different developmental stages and varying soil fertility were selected. During 2014 and 2016, targeted sampling was 300 performed during the dry season (January-March) in plots in Tay Ninh, Ba Ria Vung Tau and 301 Binh Thuan (Vietnam) and Kracheh (Cambodia). In 2014, fields were visited as part of a larger, 302 303 region-wide survey of *P. manihoti* parasitism, in which no particular attention was paid to soil variables. Fields that were visited in 2016 took into account observed trends in soil texture and 304 fertility from earlier site visits (Section 2.2). In these surveys, soil fertility and crop 305 306 intensification schemes were not specifically evaluated but rather inferred based on province- or 307 district-level trends (as equally reflected in the PCA; Fig. 1). Cassava crops in Ba Ria Vung Tau and Binh Thuan were 7-9 months old, established at low-fertility sites with sandy soils. Cassava 308 309 crops in Tay Ninh were either 2-3 months old (crop development status similar to the potted plant fertilizer assays) or 7-9 months old, and established at intermediate-fertility sites under 310 intensified cropping schemes (i.e., with substantial input of fertilizer and herbicides). Lastly, 311 312 crops in Kracheh were 7-9 months old, established under relatively high soil fertility conditions and with low-intensity management schemes (i.e., little or no fertilizer supplementation at 313 314 planting). Multiple of the fields in Kracheh were equally visited for the 2015 arthropod survey 315 (see Section 2.2).

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7 2.3.2. Sample collection and assessment of parasitism levels

Within each region, up to eight different fields were visited and 10-20 mealybug-infested tips
were collected from each field. Plant tips were placed in sealed paper bags and transferred to the
laboratory. Before bagging, apparent predators such as ladybeetles and lacewing larvae were

removed (see Meyhofer & Klug, 2002). Sample bags with plant material were kept in a cooler 321 322 while being transported to the laboratory. In the laboratory, cassava tips were examined, the total number of *P. manihoti* was counted, and tips with >10 individuals were further processed. Other 323 324 mealybug species were discarded. Mealybug individuals from each tip were gently brushed onto a young cassava plant, placed in a transparent, 40 x 25 cm polypropylene (PP) plastic container 325 that was provided with a mesh screen on the side. Daily collections of emerging parasitoids were 326 327 made with an aspirator for 18 days. In Ba Ria Vung Tau and Binh Thuan, local collaborators adopted a slightly modified methodology to record field-level parasitism rates that proved 328 329 equally effective. Specifically, field-collected cassava tips were transferred to 95 mm diameter 330 transparent PET plastic cups (390 ml), with each tip inserted into humidified floral foam. Each cup was closed with a lid, provided with a mesh screen to permit air circulation. Cassava tips 331 with >10 *P. manihoti* individuals were transferred to the cups, placed within a field laboratory at 332 ambient temperature, and kept for 14 days (until full emergence of parasitoids). Parasitoid 333 emergence was evaluated on a regular basis, and emerged wasps were removed from cups. For 334 335 each site and field, P. manihoti abundance on field-collected cassava tips was recorded, and field-level parasitism rates and parasitoid sex ratio were subsequently computed. 336

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338 2.4.Statistics

In experiment #1, *P. manihoti* and *A. lopezi* development, reproductive and survival measures
were tested for normality (PROC UNIVAR) and Analysis of Variance (ANOVA) on logtransformed data was used to evaluate the effect of fertilization on these parameters (PROC
GLM; SAS version 9.4).

343 In the first field study, bivariate relationships between each mealybug species, corresponding soil fertility parameters and CWB infection status were investigated (using Kendall's rank 344 correlation analysis). Next, regression was performed to model the combined effect of soil 345 346 fertility parameters and plant quality measures on the incidence of individual mealybug species. For *P. manihoti*, a general linear model based on negative binomial distribution was adopted, as 347 the incidence data for this species was significantly zero-inflated. Simultaneous forward and 348 reverse stepwise selection on all 14 parameters up to 2-way interaction was performed on a 349 saturated model, starting with a null model (i.e., a model containing only the intercept), so as to 350 351 select the best models for each species. This analysis yielded only two models in total for P. marginatus and P. manihoti, while for P. jackbeardsleyi, three models were identified. To select 352 the best model, among the ones identified in the previous step, we employed a similar strategy as 353 354 in Noma et al. (2010). A model with the lowest Akaike information criterion (AIC) (Model 1, i.e. "best-fit" model in Table 4), and another model (Model 2, i.e. "competing-model" in Table 4), 355 with an AIC score that is within 2 units of the AIC score of Model 1 were selected. Diagnostic 356 357 checks such as assessment of heteroscedasticity (using Non-constant Variance Score Test) and 358 auto-correlating factors was also performed on the selected models. Correlation analysis, was 359 performed using the base function "cor" with the Kendall tau b method in R (version 3.3.1) statistics environment (R Development Core Team, 2016). Regression modeling and the 360 associated model fitting diagnostics was performed using the base function "step", the MASS 361 362 package (http://cran.r-project.org/web/packages/MASS) and the CAR package (https://cran.rproject.org/web/packages/car) in R (version 3.3.1) statistics environment (R Development Core 363 Team, 2016). 364

365 Since individual soil fertility measures tend to be strongly correlated (e.g., Fujita et al., 2013), we conducted Principal Component Analysis (PCA) to extract the main axes of variation. The 366 dataset that was subjected to multivariate analysis was composed of a total of 13 soil fertility 367 368 measures (i.e., crude sand, W silt, fine sand, pH, EC, Al, K, Ca, Mg, C, N, P, avail P) and fieldlevel incidence of cassava witches broom (CWB) disease, the latter as an additional index for 369 370 plant resource quality. Systemic pathogens can bring about important shifts in plant quality and secondary chemistry, which rarely get taken into account (Tack & Dicke, 2013). From the PCA, 371 factor loading scores (i.e. scores for each field) were extracted for the two main axes of variation 372 373 (PCA axis 1 and 2). A general linear model based on negative binomial distribution was used to 374 relate field-level abundance measures of P. manihoti, P. jackbearsleyi and P. marginatus with the factor loading scores. In addition, a Chi-square based test was performed on residual 375 376 deviance measures from the selected models, in order to obtain a goodness-of-fit measure. Multivariate analyses were performed using the base function "princomp", and the resulting 377 biplot was visualized with the ggbiplot package (https://github.com/vqv/ggbiplot), within the R 378 379 statistical environment. Eigen values for each component were extracted using the nFactors 380 package (https://cran.r-project.org/web/packages/nFactors/). Components with an Eigen value 381 lower than 2 were disregarded for further analysis. Regression modelling and model visualization was performed using the MASS and CAR packages within the R statistical 382 environment. In order to identify the effect of aggregated groups, each consisting of multiple 383 fertility measures on mealybug abundance, multivariate analysis of the 13 soil fertility measures 384 and CWB incidence was performed. 385

In experiment #3, ANOVA or non-parametric tests (e.g., Kruskal-Wallis, for data that did not
 meet normality assumptions) was used to compare parasitism rates, sex ratio and mealybug

abundance rates between different sites. Normality and homoscedasticity of the dataset was
checked, and the necessary data transformations (i.e., SQRT) were conducted prior to statistical
analysis.

391

392 3. Results

393 3.1. Potted plant fertilizer trials

Mealybugs feeding on fertilized plants developed more rapidly than those reared on the controls, 394 with the high N and medium K addition treatments having the strongest effects (Table 1a). 395 396 Nutrient addition did not affect *P. manihoti* survival, but N and the lower K regimes had positive effects on both insect weight and length. Total fecundity was highest for females on plants 397 treated with the lower N dose and lowest on control plants (Table 1a), while oviposition rate did 398 399 not vary among treatments. However, both pre-oviposition and oviposition periods were strongly affected by nutrient additions. Nitrogen additions led to the shortest pre-oviposition, followed by 400 K and then the controls, but no differences were observed between the two application rates for 401 402 either nutrient. Similarly, N applications extended the insects' oviposition period, but no clear impact of K on this parameter was recorded (Table 1a). 403

On N-fertilized plants, parasitism rates were significantly higher than for control or K-amended
treatments (Table 1b). Parasitoid females in the fertilized treatments attained higher fecundity
levels than with the un-fertilized controls, regardless of nutrient type and application rate.
Parasitoid oviposition rate was significantly higher on N-fertilized plants. Fertilizer treatments
also affected *A. lopezi* offspring, such that emergence rates were significantly higher in all

fertilizer treatments, and sex ratio was far more female-biased for either nutrient supplement,

410 particularly on N-fertilized plants (Table 1b).

412 3.2.Observational studies

413	All three species of mealybug were found in cassava fields across the surveyed region, with
414	field-level incidence and abundance exhibiting significant differences between fields and
415	countries. Mealybug incidence significantly varied between countries for <i>P. jackbeardsleyi</i> (F _{2,}
416	$_{62}$ = 7.431, p<0.001) and P. marginatus (F _{2, 62} = 11.832, p<0.001), while plant-level abundance
417	differed between countries only for <i>P. marginatus</i> ($F_{2, 58}$ = 3.532, <i>p</i> = 0.036) (Table 2). On
418	average, 31.2 ± 27.9 plants per field were affected and symptomatic for CWB, with disease
419	incidence levels significantly different between countries ($F_{2,62} = 7.556$, $p = 0.001$).
420	Bivariate correlations were found between field-level abundance levels of a given mealybug
421	species, and a set of single soil fertility measures (Table 3). More specifically, statistically-
422	significant negative correlations were found between P. manihoti abundance and silt content,
423	organic C, N and available P, while crude sand content demonstrated a significant positive
424	relationship. For P. jackbeardsleyi, in-field abundance was positively correlated with CWB
425	incidence, soil pH, EC, and available P, but negatively correlated with Al^{3+} content. For P.
426	marginatus, significant negative correlations were observed with Ca^{2+} content, Mg^{2+} content, soil
427	organic C and total N. Above values correspond to Kendall tau b (τB) correlation coefficients
428	(Table 3), indicating a measure of concordance between the measured variables.
429	When evaluating the combined effect of multiple soil fertility and plant quality measures,
430	different species-specific patterns were found (Table 4). Both the best-fitting model, and the
431	competing model showed that abundance of <i>P. marginatus</i> was negatively related to total soil N,
432	available P and the fine sand soil fraction, and positively related to <i>CWB</i> incidence. Similar to <i>P</i> .
433	marginatus, both CWB incidence (positive) and N (negative) were found to be related to P.

434 *jackbeardslevi* abundance. However, unlike in the case of *P. marginatus*, soil C was also positively associated with the abundance of *P. jackbeardsleyi*. In the stepwise multiple 435 regression analysis, only silt+clay content of the soil was negatively related to the abundance of 436 *P. manihoti*. Multiple \mathbb{R}^2 values were not obtained for the selected models of *P. manihoti*, as the 437 models were built using a negative binomial regression approach. For the regression analyses, 438 variation partitioning showed that, for P. marginatus, 34% of the variability was explained by N, 439 15% by Ca²⁺ and 13-14% each by EC and fine sand. Meanwhile, for *P. jackbeardsleyi*, 31% of 440 the variability was explained by CWB infection, 25% by Al^{3+} content, 20% by P, and <10% each 441 442 by N and K.

Principal component analysis extracted important degrees of variation and the associated 443 loading values (Table 5) in a combined dataset of soil fertility profiles and CWB incidence levels 444 (reflecting overall plant resource quality), with the first two components representing 55.8% of 445 the overall variance. The first PCA axis represented 36.3% of variance and was largely reflective 446 of overall nutrient availability, as determined by major (N, P, Ca, Mg) elements, organic C and 447 448 soil texture (Fig. 1). Fields in the left side of the PCA panel (i.e., with negative PC1 values) were characterized by conditions of high soil fertility, including recently cleared and burned plots in 449 Cambodia, where cassava had been grown for 2-5 years with limited external inputs. On the right 450 side of the PCA were fields from Binh Thuan provinces with sandy soils. Plots with 451 intermediate soil fertility, staggered growing cycles and occasionally more intensive agro-452 production schemes (i.e., ample N usage, high-quality planting materials, herbicide use) were 453 454 located towards the center of the fertility gradient defined by PC1, and included fields from Dak 455 Lak (Vietnam) and Laos.

456 The second PCA axis represented 19.5% of variance, and was largely reflective of Ca, Mg, Al, 457 EC, sand content and pH. Fields in the upper side of the biplot (i.e., positive values) were characterized by sandy soils with high EC and high levels of elements such as Ca or Mg, while 458 459 more weathered fine textured (silt or clay) soils with high levels of Al oxides were found in the lower part of the PCA panel. Incidence of CWB (as additional determinant of plant resource 460 quality) was associated with N content, organic C levels and % silt and clay fractions. The PCA 461 analysis also differentiated fields from the different countries, with Cambodia's flat alluvial soils 462 generally high pH, Ca and Mg content, Vietnamese plots typified by sandy texture and low soil 463 464 fertility, and Lao soil differentiated by comparatively higher levels of Al oxides (Fig. 1). Principal component regression was then carried out on aggregate measure of soil fertility (as 465 reflected by PC1 and PC2 axes). Given that several soil fertility measures (and plant disease 466 467 infection status) exhibited high levels of correlation, abundance of specific mealybug invaders appears to be associated with a combination of several variables. Field-level incidence patterns 468 of all three mealybug species were significantly related to the first PCA axis (Fig. 2), with 469 470 positive relationships for P. marginatus and P. manihoti, and negative trends for P. *jackbeardsleyi*. The second PCA axis showed significantly positive relationship with only P. 471 472 *manihoti* abundance and not with the other mealybug species. 473

474 3.3.Comparative evaluation of top-down pressures

In the third experiment, we specifically examined parasitism rates of *P. manihoti* for three
different sites as positioned along the soil fertility spectrum, reflective of the PC1 axis. Nearly
400 *P. manihoti*-infected cassava tips were collected over the course of the 2014 and 2016 dry
seasons. Out of these, 205 tips had >10 mealybug individuals and were monitored for parasitoid

479 emergence. In 2-month old crops at intermediate soil fertility, mealybug abundance showed high 480 levels of variability between individual tips, with a coefficient of variation (CV) of 1.77, especially as compared to the CV values of 0.73 in fields in low-fertility settings. Mealybugs 481 482 reached average abundance levels of 41.0 ± 30.0 , 50.6 ± 89.7 , 71.5 ± 123.7 and 101.2 ± 158.9 individuals per tip in Binh Thuan on 7-9 month old cassava, Tay Ninh on 2-3 month old cassava, 483 Tay Ninh on 7-8 month cassava, and Kracheh on 7-9 month old cassava, respectively. 484 Associated parasitism levels (proportion) were 0.10 ± 0.15 , 0.52 ± 0.40 , 0.57 ± 0.32 and 0.32 ± 0.32 485 0.27, respectively, for the four samplings. Parasitoid communities were largely dominated by the 486 487 parasitic wasp A. lopezi. Mealybug numbers did not differ between sites and field conditions (Kruskal-Wallis, $X^2 = 5.96$, p = 0.114), but parasitism rates were significantly higher in the 488 intermediate fertility site (i.e., Tay Ninh), than at other locales (Kruskal-Wallis, $X^2 = 74.41$, 489 *p*<0.001; Fig. 3). 490 Total number of parasitoids (per tip) significantly differed between sites (Kruskal-Wallis, X^2 = 491 52.05, p < 0.001). Regression analyses revealed that parasitoid abundance was closely related to 492 493 *P. manihoti* infestation pressure, with different patterns of density-dependence for each of the soil fertility conditions as such: Kracheh ($F_{1,18}$ = 10.781, p < 0.01), Tay Ninh 2 months ($F_{1,85}$ = 494 77.183, p < 0.01), Tay Ninh 8 months (F_{1.38}= 83.602, p < 0.001) and Binh Thuan (F_{1.54}= 8.625, p < 0.01) 495 0.01; Fig. 3). Positive density dependence was recorded in all sites, with the strongest parasitoid 496 response at intermediate fertility sites (i.e., Tay Ninh). Although no data were obtained from 497 Binh Thuan and Ba Ria Vung Tau provinces, parasitoid sex ratio from sites in Cambodia and 498

499 Tay Ninh were not significantly different (Kruskal-Wallis, X^2 = 3.13, p=0.209).

500

501 **4. Discussion**

502 Much remains to be learned about the regulatory forces that shape ecological communities in 503 terrestrial systems (Gruner, 2004; Borer et al., 2006; Allen & Wesner, 2016). The agroecosystems studied here provide a unique and highly-relevant opportunity to evaluate 504 trophic regulation processes. In tropical agroecosystems in particular, soils tend to be highly 505 506 weathered and thus plant resource or bottom-up effects can exert strong effects on herbivore 507 communities that may either overshadow the role of top-down regulation (Ritchie, 2000) or influence herbivores by affecting the strength of top-down forces. While past research has 508 examined how fertilizer addition impacts particular feeding guilds and plant-herbivore 509 510 interactions (Sipura, 1999; Forkner & Hunter, 2000; Ritchie, 2000; Garibaldi et al., 2010; 511 Rzanny et al., 2013), much of this work has been conducted in perennial ecosystems. Our study is unique in the extent to which it relies upon community ecology approaches, to assess invader 512 success mitigated by plant resource constraints in a rapidly-expanding tropical agricultural 513 system. 514

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4.1 Soil fertility impacts on herbivore and parasitoid performance

Plant chemistry, largely determined by soil fertility, affects life history and physical 517 518 characteristics of herbivores as well as higher trophic orders (Ode, 2006; Chen et al., 2010; Stam et al., 2014). Plant stoichiometry, defense mechanisms (constitutive or induced), and primary 519 productivity are all factors that affect plant-herbivore interactions and impacts on parasitoids or 520 521 predators. Through our manipulated "microcosm" studies, we gained an initial appreciation of how soil fertility and/or availability of key limiting nutrients impacts such interactions between 522 523 plants, the herbivore, *P. manihoti*, and the parasitoid, *A. lopezi*. Nitrogen fertilization led to a 524 reduction in *P. manihoti* development time along with an increase in body size, adult weight and

525 total fecundity. Meanwhile, K addition had less pronounced effects, and only intermediate 526 fertilization levels seemed to benefit *P. manihoti* growth and reproduction. These findings are in line with results from other herbivore-plant systems, in which sap-feeders such as aphids 527 528 increase their populations on short-season crops when soils are deficient in K, or under N supplements (Noma et al., 2010). While both nutrients influence phloem content of dietary N, a 529 530 limiting nutrient for the development of homopterans such as mealybugs (Dixon, 1998), the effect of K fertilization may only be apparent when plants are K-stressed (e.g., Walter & 531 DiFonzo, 2007). For A. lopezi, laboratory trials corroborate previous findings that its 532 533 development rate and sex ratio are shaped by the size of its host (van Dijken et al., 1991; 534 Schulthess et al., 1997). The microcosm studies conducted here, thus indicate that *P. manihoti* (and indirectly A. lopezi) abide to Price's (1991) 'plant vigor hypothesis', in which vigorously-535 growing plants are better hosts for herbivores and N disproportionally supports herbivore growth 536 as it is the basis for protein synthesis. This is aligned with P. manihoti feeding habits, as this 537 insect prefers nutrient-rich, actively growing tissues (White, 2009). Laboratory findings reported 538 539 here are also reflected by the strong parasitoid response to high *P. manihoti* population levels that was evident from the field samplings in Tay Ninh (i.e., at settings with intermediate soil 540 541 fertility and N enrichment, based on farmer discussions; Fig. 3). Our microcosm studies could thus constitute a first step towards defining a crop-specific range of N concentrations that benefit 542 plant growth and boost a plant's immune responses or optimize biological control (Chen et al., 543 544 2010).

545 While microcosm studies are valuable and informative, it's often difficult to extrapolate their 546 results to field conditions particularly when considering short-term pot assays for semi-perennial 547 woody plants, such as cassava, which can have 2-m long roots (Connor et al., 1981). Also,

548 performance of herbivores such as mealybugs is determined by the nutritional content and quality of above-ground plant parts, but addition of single-element fertilizer does not necessarily 549 affect those. For example, K fertilization regularly causes minor variation in leaf nutrient 550 content, while leaf N content can concurrently be controlled by multiple soil fertility parameters, 551 e.g., soil pH, P content or water availability (e.g., Lower & Orians, 2003; Fujita et al., 2013). 552 553 Hence, the effect of a single nutrient addition on host-parasitoid systems can easily be obscured by other plant growth-limiting factors. In fertilizer supplement studies, the strongest effects are 554 often found when nutrient limitation is alleviated (see Elser et al., 2007). As our microcosm 555 556 studies were conducted using relatively fertile, nutrient-rich soil instead of inert media (e.g., 557 sand), thus some of the envisaged effects on herbivore-parasitoid complexes may have been dampened (see Gutierrez et al., 1988). Similar to work by Denno et al. (2002), we observe a 558 559 correspondence between laboratory studies and field surveys for *P. manihoti*, both of which suggest a dominance of bottom-up controls. While we cannot draw conclusions for the other two 560 species of mealybugs, bottom-up impacts are likely determined by their particular traits and 561 562 associated parasitoid (complex). We can infer that improved mealybug performance is related to increased leaf N content, though this was not measured, so this conclusion is somewhat 563 564 speculative. In the meantime, it should be noted that individual-level measurements of the effect of soil fertility and plant nutritional quality on herbivore or parasitoid performance may not 565 necessarily translate into population effects (Zaugg et al., 2013). 566 567 In our study, field observations indicated that population levels for the three invasive herbivores across the various sampling sites were correlated to a soil fertility with distinct soil 568 fertility parameters. Our findings suggest species-specific relationships with single measures of 569

soil fertility, texture and disease infection status. While correlations don't necessarily entail

571 causality, observed patterns do differ substantially between the three invaders. For *P. manihoti*, 572 in-field incidence was positively correlated with sand content, and negatively with silt, soil C, N and P (Table 3). This supports previous work in Africa suggesting that P. manihoti achieves high 573 574 population levels on low-fertility, sandy soils, even in the presence of effective parasitoids 575 (Neuenschwander et al., 1990). On the other hand, the abundance of *P. jackbeardsleyi* appeared to follow a distinct pattern and was largely associated with pH, EC and CWB-infestation status. 576 Given the multi-dimensional usage of resources by plants, herbivores and parasitoids, an 577 aggregate measure (e.g., obtained through PCA) may be more suitable to capture species' 578 579 responses to soil- or resource-based conditions (see also Drenovsky et al., 2012; Fujita et al., 2013). Nevertheless, various single soil fertility measures did correlate significantly with field-580 level abundance for all three mealybug species (Table 3) and both approaches are likely valuable 581 582 for understanding soil impacts on herbivore performance.

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4.2 Life history and field management drivers for invader success

Differential life history traits and invasion history of the three invaders might help explain 585 some of observed disparate response trends. As globally successful invaders, all three mealybug 586 587 species could benefit from similar high phenotypic plasticity or adaptation potential (e.g., Dawson et al., 2012), but may still differ in myriad other aspects. Although there's no single trait 588 that reflects invasiveness, so-called 'invader attributes' tend to comprise competitive ability, 589 590 phenotypic plasticity, niche construction and phenological niche separation (e.g., Perkins & Nowak, 2013). Amongst others, the outcome of invasions is set by the interaction of the above 591 species' traits with nutrient availability over short and long time periods (Mata et al., 2013). 592 593 Competitively-inferior invaders capable of rapid population growth, such as *P. manihoti*, can

594 capitalize on short-term nutrient pulses, while competitively-superior or dominant invaders are 595 easily disrupted by disturbance-related resource heterogeneity. In our study, such disturbancerelated heterogeneity was indirectly measured through the soil fertility measurements in the field 596 survey, but only qualitatively inferred for the specific case of *P. manihoti* and *A. lopezi*. Life 597 history traits and feeding behavior can also explain comparative performance of specific 598 herbivores in given varying resource quality or soil fertility (White, 2009). For P. manihoti, the 599 'plant vigor hypothesis' possibly may apply, with this species benefiting greatly under crop 600 management schemes with important levels of nutrient addition. On the other hand, species such 601 602 as *P. jackbeardsleyi* that feed preferentially on older senescing tissues and on CWB-affected 603 plants, might follow the 'plant stress hypothesis' and experience a niche opportunity on debilitated plants with sub-optimum nutrition for other mealybug species. In studies with plant 604 605 hoppers, Denno et al. (2002) also pointed at mobility as a prime mediator of top-down vs. bottom-up impacts for a given species. However, for largely sedentary species such as 606 mealybugs, mobility and specifically a species' ability to elude aggregative responses of natural 607 608 enemies may be of limited relevance. Lastly, history of the invasion process can bring about species-specific shifts in top-down forces. For a long-time invader such as *P. jackbeardsleyi* 609 610 (first reported from Asia in 1987), parasitoid communities possibly have had comparatively more time to assemble, diversify or adapt (e.g., Shea & Chesson, 2002), and exert stronger top-down 611 pressures. Also, recent invaders relatively less burdened by natural enemies, such as P. manihoti 612 613 or *P. marginatus*, may outperform long-time invaders in high-resource settings (Blumenthal, 2005), or cassava might simply be a far superior host for them as compared to *P. jackbeardsleyi*. 614 615 Sites along the soil fertility continuum vary in historic land-use, current management practices, 616 as well as a range of important environmental parameters (e.g., climate, landscape

617 heterogeneity). More specifically, sites on the left side of the continuum (Fig. 1) include recently-cleared swidden agriculture plots and fields under rotation with other crops (e.g., 618 soybean). Under less intensive agricultural systems, C storage and soil quality can be 619 620 substantially higher than under continuous annual cropping systems (Bruun et al., 2009), although these patterns can also be greatly influenced by soil fertility management and inherent 621 622 properties, such as soil texture. Land-use legacies can persist for decades and have profound impacts on herbaceous species composition, biodiversity and resulting parasitoid communities 623 (Stahlheber et al., 2015; Stuhler & Orrock, 2016). This may be particularly relevant, as Lao and 624 625 Cambodian fields under swidden agriculture regimes and less intensive management had far greater weed cover (Wyckhuys, unpublished). On the other hand, several plots in the central 626 portion of the soil fertility continuum (Fig. 1) were under more intensive crop management 627 practices (e.g., tillage, herbicide use, high-quality planting materials) and frequent additions of 628 N-P-K fertilizers. Actions such as N fertilization are not necessarily reflected in soil fertility 629 metrics, and fertilizer N additions are even likely to amplify N-loss pathways (see Lu et al., 630 631 2011). Nevertheless, they can augment plant nutritional status, and subsequent herbivore population growth and/or parasitoid development. Invader performance appeared to differ under 632 633 these varying contexts, and suggests that soil fertility (measured), disturbance frequency (inferred, but not measured), and community composition or maturity (inferred, but not 634 measured) all contributed to shape invasion and invader dynamics (e.g., Mattingly & Orrock, 635 636 2013). While certain species were more successful in plots with high soil fertility, others thrived under more resource-limited settings (see also Funk & Vitousek, 2007). Increased abundance of 637 *P. marginatus* and *P. manihoti* at sites with intensified agro-production and intermediate (or low) 638 639 soil fertility (Fig. 2) may hint that these species benefit primarily from nutrient pulses (inferred

640 from pot trials, but not measured in the field) and disturbance regimes (largely inferred, but not measured). In contrast, enhanced presence of *P. jackbeardsleyi* in high-fertility settings suggests 641 a strong bottom-up effect and a substantially shortened "window of vulnerability" to resident 642 643 natural enemies (see 'slow growth – high mortality' phenomenon; Benrey & Denno, 1997). For P. manihoti, bottom-up effects were evident and top-down forces appeared to be strengthened in 644 high-fertility soils or plots with external nutrient enrichment (Fig. 3). Such increases of top-down 645 forces with resource inputs have been recorded in several other systems (e.g., Hunter & Price, 646 1992; Forkner & Hunter, 2000; Walker et al., 2008). Our results also echo those of Ritchie 647 648 (2000), in which bottom-up influences are quite pronounced in resource-limited settings, while some herbivores can experience far stronger top-down forces within environments with fertile 649 soils and N-rich plant tissue. Though patterns are highly species-specific, soil nutrient profiles 650 651 and fertilizer additions shape host plant quality and either enhance or reduce an individual mealybug's relative niche opportunity (Stiling & Moon, 2005). 652

653

654 **5.** Conclusions

Our work points at differential trophic regulation for three invasive mealybugs in tropical 655 656 agroecosystems, and elucidates important species-specific and context patterns. The findings presented here emphasize how biological control is strongly dependent upon site fertility for the 657 particular case of P. manihoti (see Hovick & Carson, 2015), and illuminate resource-mediated 658 659 performance of two other key mealybug invaders. Microcosm experiments clearly emphasized the potential of plant nutrient availability, N in particular, for regulating the performance of 660 661 multiple trophic levels in cassava systems. Meanwhile, results from regional field studies show 662 important species-specific responses of invasive herbivores (and their parasitoids) to a gradient

663	in soil fertility and management intensity. Our results support the notion that soil fertility and
664	plant quality variables, either singly or as composite indices, should be taken into consideration
665	when setting priorities for invasive species management or planning biological control
666	interventions (Mace & Mills, 2016). Last but not least, our findings from smallholder systems in
667	the developing-world tropics provide renewed impetus for earlier calls to address agricultural
668	pest management in a more holistic and integrated fashion (e.g., Lewis et al., 1997).
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670	
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681	

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Table 1a. Development and reproductive outputs of the cassava mealybug (*P. manihoti*) feeding on plants treated with different fertilizer treatments. Means (\pm SD) followed by the same letter do not differ (ANOVA, $\alpha = 0.05$).

Parameter (P. manihoti)	Ν	control	N90	N180	K ₂ O90	K ₂ O180	Test statistic; P-value
Development time (d)	527	15.5 <u>+</u> 0.06 a	15.0 <u>+</u> 0.06 b	14.2 <u>+</u> 0.07 d	14.3 <u>+</u> 0.07 d	14.8 <u>+</u> 0.09 c	F _{4,522} =61.24; P<0.0001*
Survival per plant (%)	60	85.5 <u>+</u> 0.02	87.0 <u>+</u> 0.03	91.0 <u>+</u> 0.03	89.0 <u>+</u> 0.02	89.0 <u>+</u> 0.03	F _{4,55} =0.8; P=0.53
Adult ^a weight (mg)	300	4.76 <u>+</u> 0.26 b	5.85 <u>+</u> 0.52 a	5.54 <u>+</u> 0.69 ab	6.4 <u>+</u> 0.16 a	5.00 +0.24 b	F _{4,295} =3.78; P=0.016*
Adult length (mm)	300	2.01 <u>+</u> 0.02 c	2.15 <u>+</u> 0.02 b	2.14 <u>+</u> 0.02 b	2.32 <u>+</u> 0.04 a	1.98 <u>+</u> 0.05 c	$F_{4,295}=18.43; P<0.0001*$
Total fecundity (eggs)	279	369.0 <u>+</u> 8.6 c	438.0 <u>+</u> 11.3 a	419.6 <u>+</u> 9.0 ab	403.8 <u>+</u> 10.3 b	395.8 <u>+</u> 10.8 b	F _{4,274} =7.75; P<0.0001*
Oviposition rate (eggs/d)	279	23.4 <u>+</u> 0.5	24.4 <u>+</u> 0.5	24.0 <u>+</u> 0.5	23.9 <u>+</u> 0.8	23.6 <u>+</u> 0.5	F _{4,274} =1.04; P=0.389
Pre-oviposition period (d)	279	5.4 <u>+</u> 0.1 a	4.4 <u>+</u> 0.1 c	4.0 <u>+</u> 0.1 c	5.2 <u>+</u> 0.2 b	4.9 <u>+</u> 0.1 b	$F_{4,274}\!\!=\!\!20.51; P\!\!<\!\!0.0001*$
Oviposition period (d)	279	16.0 <u>+</u> 0.3 b	18.0 <u>+</u> 0.3 a	17.7 <u>+</u> 0.4 a	17.0 <u>+</u> 0.3 ab	16.8 <u>+</u> 0.4 b	F _{4,274} =5.13; P=0.0005*

^a Young females (stage L4, prior to oviposition)

Table 1b. Parasitism levels and reproductive output of *A*. *lopezi*, when developing on *P*. *manihoti* nymphs reared on plants with different fertilizer treatments. Means followed by the same letter do not differ (ANOVA, $\alpha = 0.05$), while an asterisk indicates statistical significance.

Parameter (A. lopezi)	Ν	control	N90	N180	K2O90	K2O180	Test statistic; P-value
Parasitism rate (proportion)	413	0.27 <u>+</u> 0.005 c	0.29 <u>+</u> 0.008 ab	0.30 <u>+</u> 0.008 a	0.27 <u>+</u> 0.008 bc	0.27 <u>+</u> 0.006 bc	F _{4,408} =3.42 P=0.009*
Lifetime fecundity (# mummies)	60	87.3 <u>+</u> 2.0 b	99.4 <u>+</u> 2.9 a	100.6 <u>+</u> 3.3 a	96.6 <u>+</u> 3.8 a	96.4 <u>+</u> 2.8 a	F _{4,55} =18.43; P<0.0001*
Oviposition period (d)	60	6.5 <u>+</u> 0.24	7 <u>+</u> 0.21	6.8 <u>+</u> 0.20	7.1 <u>+</u> 0.23	7.1 <u>+</u> 0.18	F _{4,55} =2.07 P=0.097
Oviposition rate (mummy/d)	60	13.5 <u>+</u> 0.3 b	14.2 <u>+</u> 0.2 ab	14.8 <u>+</u> 0.3 a	13.6 <u>+</u> 0.2 b	13.6 <u>+</u> 0.2 b	F _{4,55} =5.05 P=0.002*
Emergence rate (adults/mumm)	413	0.64 +0.01 c	0.72 +0.01 ab	0.71 +0.01 a	0.89 <u>+</u> 0.02 b	0.73 +0.01 ab	F _{4,408} =10.84 P<0.0001*
Offspring sex ratio (f/m)	413	0.60 <u>+</u> 0.02 c	0.69 <u>+</u> 0.03 ab	0.71 <u>+</u> 0.02 a	0.65 <u>+</u> 0.03 b	0.67 +0.02 b	F _{4,408} =3.06 P=0.017*
Offspring longevity (d)	360	10.41 <u>+</u> 0.2	9.97 <u>+</u> 0.3	9.97 <u>+</u> 0.2	9.92 <u>+</u> 0.2	10.35 <u>+</u> 0.2	F _{4,355} =1.05 P=0.38*

Table 2. Incidence frequency (% sampled plants) and plant-level infestation rates (mealybug densities per plant) of three invasive mealybug species (*P. jackbeardsleyi*, *P. manihoti*, *P. marginatus*) for 65 cassava plots that were visited during the 2015 dry season in Vietnam, Cambodia and Laos. Incidence and infestation levels are indicated as mean \pm SD. Means followed by the same letter do not differ between countries (ANOVA, $\alpha = 0.05$; Tukey post-hoc test).

	Field-leve				
– Mealybug species	Vietnam	Cambodia	Lao PDR	Regional	
-	<i>n</i> = 20	<i>n</i> = 18	<i>n</i> =27	<i>n</i> =65	
P. jackbeardsleyi	12.8 ± 9.1a	$33.7\pm24.3b$	$15.6 \pm 18.4a$	19.7 ± 20.0	
P. manihoti	$10.4 \pm 10.9 a$	$3.2 \pm 5.0a$	8.6 ± 13.7a	7.7 ± 11.3	
P. marginatus	$56.5\pm25.7a$	$24.0\pm23.5b$	$26.9\pm21.9b$	35.2 ± 27.3	
	Plant-leve	el infestation (individu	als/plant)		
P. jackbeardsleyi	$3.2 \pm 3.5a$	61.6 ± 137.1a	2.6 ± 2.1a	10.1 ± 47.8	
P. manihoti	$5.1 \pm 8.2a$	56.8 ± 136.8a	$14.6 \pm 21.5a$	17.4 ± 57.3	
P. marginatus	$29.0\pm21.6a$	$38.7\pm76.4ab$	$5.7 \pm 11.3 b$	22.0 ± 43.2	

Table 3. Bivariate relationships between the three invasive mealybug species and single soil fertility parameters and CWB pathogen infection status. Values correspond to Kendall *tau b* (τ_B) correlation coefficients, which indicate a measure of concordance between corresponding variables. A negative sign before the value indicates negative relationship, while no sign indicates positive correlation. Values marked with an asterisk are coefficients that were statistically significant (**P-value < 0.05**) for that particular comparison, when tested against a null hypothesis of no correlation ($\tau_B = 0$) between the variables.

		<i>P</i> .	
	P. manihoti	jackbeardsleyi	P. marginatus
crude_			
sand	0.15*	-0.07	0.04
Silt	-0.30*	0.08	-0.13
fine_sand	0.21	-0.04	0.08
pН	0	0.27*	-0.15
EC	-0.02	0.10*	0
Al	-0.09	-0.30*	0
Κ	-0.18	0.10	-0.18
Ca	-0.14	0.26	-0.25*
Mg	-0.13	0.28	-0.20*
OC	-0.17*	0.07	-0.17*
N	-0.24*	0	-0.25*
Р	-0.25*	0.16*	-0.16
P ₂ O ₅	0.10	0.10	0.08
CWB^{a}	-0.04	0.18*	-0.13

Soil fertility parameters are abbreviated as follows: coarse sand corresponds to % of > 0.02 mm soil particles, silt is well-graded silt + clay; fine sand is % soil particles 0.02-0.2 mm); pH is pH of soil suspension; EC is soil electron conductivity; Al is Al 3+ mg/100 g soil; K is K+ mg/100 g soil; Ca is Ca2+ mg/100 g soil; Mg is Mg2+ mg/100 g soil; OC is % of soil organic carbon); N is % nitrogen); P is % P_2O_5 ; P_2O_5 is mg $P_2O_5 / 100$ g soil.

^{*a*} *CWB* corresponds to field-level incidence of cassava witches broom disease, as recorded during transect walks.

Table 4. Stepwise multiple regression models for abundance of three different species of mealybug, in relation to soil fertility measures and pathogen-infection status (both measures reflecting plant resource quality). For each of the invasive mealybug species, two statistical models are represented, with their respective Akaike information criterion (AIC) and R^2 .

Mealybug species	Model equation*	AIC	Multiple R² value
Paracoccus marginatus	Model I**: 45.02 – 125.46 x N – 0.36 x fine_sand – 40.37 x P + 0.26 x CWB + 184.63 x EC – 1.09 x Ca	315.47	36.1%
	Model II**: 48.61 – 153.53 x N – 0.37 x fine_sand – 41.36 x P + 0.25 x CWB + 139.79 x EC	316.27	33.1%
Pseudococcus jackbeardsleyi	Model I**: 10.27 – 102.78 x N + 0.29 x <i>CWB</i> + 5.39 x <i>OC</i> + 21.42 x K Model II**: 12.55 – 10.54 X <i>AI</i> + 0.27 x <i>CWB</i> + 24.77 x <i>P</i> – 87.75 x N + 4.61 x <i>OC</i>	270.27 270.42	41.0% 38.9%
Phenacoccus manihoti	Model I**: 3.21 – 6.23 x <i>silt – 15 x EC</i> Model II**: 2.70 – 5.82 x <i>silt</i>	293.31 293.46	*** ***

* explanatory variables: N: nitrogen %; fine_sand: (0.02-0.2 mm fraction)%; P: P₂O₅ %; CWB: field-level incidence of cassava witches broom disease; EC: soil electron conductivity; OC: soil organic carbon %; silt: W silt + clay ** Model 1 corresponds to the model with the least AIC score ("best-fit model"), and model 2 ("competing model") corresponds to the model that obtained an AIC score, that is within 2 units of the AIC score of the "best-fit model".

*** Multiple R² values for the selected models of *P. manihoti* are not available, as the models were built using a negative binomial regression approach (see Materials & Methods section for more details).

Table 5. Loading values of all the measured soil variables and cassava witches broom –CWB-infestation (per field) obtained from the first two PCA components (PC1 and PC2) (see Figure 1 legend for explanation of the variables)

Variables	PC1	PC2
CWB	0.192	0.141
Crude sand (>0.02mm)	-0.133	-0.225
Wsilt and clay	0.326	0.355
Fine sand (0.02-0.2mm)	-0.302	-0.278
рН	0.302	-0.335
EC	-0.341	0.161
Al	-0.206	0.429
К	0.226	-0.157
Са	0.324	-0.29
Mg	0.362	-0.275
OC	0.35	0.171
Ν	0.359	0.231
Р	0.272	0.49
mgP2O5	-0.201	0.668

Figure legends

Figure 1. Principal component analysis (PCA) of 65 cassava fields, based upon soil fertility status and CWB pathogen-infection of host plants. Soil fertility status was determined through a total of 13 different measures, and CWB infection was assessed by recording disease symptomatology. Fields are classified per country, and soil fertility measures are abbreviates as follows: crude sand (% particles $630\mu m - 2mm$); W silt (well-graded silt + clay); fine sand (% particles $63\mu m - 200\mu m$); pH (pH of soil suspension); EC (soil electron conductivity); Al (Al 3+ mg/100 g soil); K (K+ mg/100 g soil); Ca (Ca2+ mg/100 g soil); Mg (Mg2+ mg/100 g soil); OC (% soil organic carbon); N (% nitrogen); P (% P₂O₅); P₂O₅ (mg P₂O₅ / 100 g soil).

Figure 2. Relationships between field-level abundance of *P. jackbeardsleyi*, *P. marginatus* and *P. manihoti*, as obtained through principal component regression. For each mealybug species, regression patterns are represented with the first and second PCA axis (i.e., PC1, PC2). Lines represent regression curves, with associated p values. Goodness-of-fit was assessed for each regression model, by testing for significant difference between the residual deviances of an ideal model (where the predicted values are identical to the observed) and the selected model using a chi-square test. None of the models yielded a significant p-value in the chi-square test, indicating that the selected model fit the data well.

Figure 3. Relationship between per-plant *P. manihoti* infestation level and parasitism rate in three different soil fertility contexts in four locations, as positioned along the PC1 axis. Locations include Kracheh (Cambodia) and Tay Ninh, Binh Thuan / Ba Ria Vung Tau (Vietnam), covering a high-fertility and intermediate fertility site, and a low-fertility site with sandy soils respectively. For the site in Tay Ninh, *P. manihoti* abundance and *A. lopezi* parasitism rates were assessed on 2-month and 8-months old crops. Regression curves represent statistically significant patterns, with the following coefficients of determination: Kracheh 7-9 months (R^2 = 0.375), Tay Ninh 2 months (R^2 = 0.476), Tay Ninh 8 months (R^2 = 0.688), and Binh Thuan 7-9 months (R^2 = 0.138). Parameter estimates for slopes of the regression curves were as follows: 56.44, 43.35, 24.87, and 7.95 respectively.



Figure 1.



Figure 2.



Figure 3.