## **Maintaining understory vegetation in oil palm plantations supports**

## 2 higher assassin bug numbers

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4	Jake Stone <sup>1*</sup> , Andreas Dwi Advento <sup>2</sup> , Michael D. Pashkevich <sup>1</sup> , Anak Agung Ketut Aryawan <sup>2</sup> ,				
5	Jean-Pierre Caliman <sup>2</sup> , Amelia S. C. Hood <sup>3</sup> , William A. Foster <sup>1</sup> , Mohammad Naim <sup>2</sup> , Pujianto <sup>2</sup> ,				
6	Dedi Purnomo <sup>2</sup> , Suhardi <sup>2</sup> , Ribka Sionita Tarigan <sup>2</sup> , Tuani Dzulfikar Siguga Rambe <sup>2</sup> , Rudy				
7	Harto Widodo <sup>2</sup> , Sarah H. Luke <sup>1,4</sup> , Jake L. Snaddon <sup>5,6</sup> , Edgar C. Turner <sup>1</sup>				
8					
9	<sup>1</sup> Department of Zoology University of Cambridge Downing Street Cambridge UK				
10	<sup>2</sup> Sinar Mas Agro Resources Technology Research Institute (SMARTRI), Libo Estate, Kandis, Riau, Indonesia				
11	<sup>3</sup> Centre for Agri-Environmental Research (CAER). School of Agriculture. Policy and Development. University				
12	of Reading, Whiteknights, Reading, RG6 6EU, UK				
13	<sup>4</sup> School of Biosciences, University of Nottingham, Sutton Bonington Campus, Nr. Loughborough, LE12 5RD,				
14	UK				
15	<sup>5</sup> School of Geography and Environmental Science, University of Southampton, University Road, Southampton,				
16	UK				
17	<sup>6</sup> University of Belize, Environmental Research Institute, Price Center Road, Belmopan, Belize				
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19	*Corresponding author E-mail: js2453@cam.ac.uk				
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40 **Abstract** (English language version)

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1. The expansion of oil palm agriculture across Southeast Asia has caused significant biodiversity losses, with the reduction in habitat heterogeneity that accompanies the conversion of forest to oil palm being a major contributing factor. However, owing to their long commercial lifespan, oil palm plantations can support relatively high levels of vegetation complexity compared to annual crops. There is therefore potential for the implementation of management strategies to increase vegetation complexity and associated within-plantation habitat heterogeneity, enhancing species richness and associated ecosystem functioning within productive oil palm landscapes.

49 2. This study focusses on two species of assassin bugs *Cosmolestes picticeps* and *Sycanus dichotomus*, 50 which are important agents of pest control within oil palm systems. Using a Before-After Control-51 Impact experimental manipulation in Sumatra, Indonesia, we tested the effect of three alternative 52 herbicide spraying regimes and associated vegetation complexity treatments on assassin bug numbers. 53 Our treatments encompass a range of current understory vegetation management practices used in oil 54 palm plantations and include removing vegetation only in areas key to harvesting ("Normal"), removing 55 all understory vegetation ("Reduced"), and allowing native vegetation to regrow naturally 56 ("Enhanced"). We assessed both the long-term (18 months) and short-term (within 2 weeks) effects of 57 our treatments following herbicide spraying.

3. Pre-treatment, we found high numbers of assassin bugs of both species in all plots. Long-term posttreatment, the abundance of both *C. picticeps* and *S. dichotomus* declined in Reduced understory plots,
although this decline was only significant for *C. picticeps* (98%). In contrast, there were no significant
differences in the post-treatment abundance of either species in the short-term.

4. These results suggest that the long-term decline in assassin bug abundance was likely to be caused
by loss of vegetation, rather than any immediate effects of the herbicide spraying. Our findings have
clear management implications as they demonstrate that maintaining vegetation in oil palm understories
can benefit an important pest control agent.

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*Keywords:* assassin bugs (Reduviidae); biological control agents; habitat heterogeneity; integrated
pest management (IPM); oil palm agroecology; tropical agriculture; understory vegetation

- 70 (Indonesian language version)
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1. Ekspansi pertanian kelapa sawit di Asia Tenggara telah menyebabkan hilangnya keanekaragaman hayati secara signifikan, dengan berkurangnya heterogenitas habitat yang menyertai konversi hutan menjadi kelapa sawit menjadi salah satu faktor penyebabnya. Namun, karena umur komersialnya yang panjang, perkebunan kelapa sawit dapat mendukung tingkat kompleksitas vegetasi yang relatif tinggi dibandingkan tanaman tahunan. Oleh karena itu, terdapat potensi penerapan strategi pengelolaan untuk meningkatkan kompleksitas vegetasi dan heterogenitas habitat perkebunan, meningkatkan kekayaan spesies dan fungsi ekosistem terkait dalam lanskap kelapa sawit yang produktif.

80 2. Penelitian ini berfokus pada dua spesies kepik pembunuh Cosmolestes picticeps dan Sycanus 81 dichotomus, yang merupakan agen penting pengendalian hama dalam sistem kelapa sawit. Dengan 82 menggunakan manipulasi eksperimental Sebelum-Sesudah Kontrol-Dampak di Sumatera, Indonesia, 83 kami menguji pengaruh tiga cara penyemprotan herbisida alternatif dan perlakuan kompleksitas 84 vegetasi yang terkait terhadap jumlah kepik pembunuh. Perlakuan kami mencakup serangkaian praktik 85 pengelolaan vegetasi lantai yang saat ini digunakan di perkebunan kelapa sawit, termasuk 86 menghilangkan vegetasi hanya di area yang penting untuk dipanen ("Normal"), menghilangkan semua 87 vegetasi lantai ("Reduced"), dan membiarkan vegetasi asli tumbuh kembali secara alami ("Enhanced"). 88 Kami menilai efek jangka panjang (18 bulan) dan jangka pendek (dalam 2 minggu) dari perlakuan yang 89 kami berikan setelah penyemprotan herbisida.

3. Dari masa pra-perlakan, kami menemukan sejumlah besar kepik pembunuh dari kedua spesies di
seluruh plot. Setelah perlakuan dalam jangka panjang, kelimpahan *C. picticeps* dan *S. dichotomus*menurun pada plot vegetasi lantai "Reduced", meskipun penurunan ini hanya signifikan pada *C. picticeps* (98%). Sebaliknya, tidak ada perbedaan signifikan dalam kelimpahan kedua spesies setelah
perlakuan dalam jangka pendek.

4. Hasil ini menunjukkan bahwa penurunan kelimpahan kepik pembunuh dalam jangka panjang
kemungkinan besar disebabkan oleh hilangnya vegetasi, dan bukan akibat langsung dari penyemprotan
herbisida. Hasil studi kami menunjukkan bahwa memelihara vegetasi lantai dalam lahan kelapa sawit
dapat memberikan manfaat bagi agen pengendalian hama yang penting.

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- 102 **1 Introduction**
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104 A growing human population and increasing per-capita demand for cheaper vegetable oil has 105 led to the rapid expansion and intensification of vegetable oil-producing crops globally (Foley 106 et al., 2005; Phalan et al., 2013; Wilcove & Koh, 2010). Due to its versatile uses and high 107 productivity in comparison to other oil crops, palm oil has become the most widely produced 108 vegetable oil worldwide, with the crop playing an increasingly important role in global food 109 security and biofuel supply (Tan et al., 2009; Tilman et al., 2011). Nowhere is the growth in 110 oil palm agriculture more evident than in Southeast Asia, a region that produces 89% of the 111 world's palm oil, and where oil palm plantation area has increased almost fourfold since the turn of the 21<sup>st</sup> century (FAO, 2023). Indonesia, the world's leading producer of palm oil, is at 112 113 the forefront of this production boom; here the palm oil industry has grown to become an 114 invaluable contributor to the country's economic growth and national development 115 (Gatto et al., 2015; Purnomo et al., 2020). However, as plantations are commonly established 116 at the direct expense of biodiverse rainforest habitat, this expansion has also caused major 117 deforestation and associated biodiversity loss in the region (Edwards et al., 2014; Fitzherbert 118 et al., 2008; Gaveau et al., 2019; Turubanova et al., 2018). It is estimated that 54% of 119 Indonesia's 14.6 million hectares of oil palm plantations have been directly established on 120 previously forested land (Vijay et al., 2016).

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While retaining remaining forest habitats is vital for supporting tropical biodiversity (Gibson et al., 2011; Phalan et al., 2011), an increased awareness of the negative impacts of palm oil production means there is growing pressure on the oil palm industry to develop sustainable management practices that improve biodiversity within plantations (Austin et al., 2017; Roundtable on Sustainable Palm Oil (RSPO), 2020). One of the major drivers of biodiversity loss resulting from habitat conversion is the simplification of vegetation, both in terms of overall species richness and structural complexity (Drescher et al., 2016; Foster et al., 2011). 129 Although oil palm plantations are significantly less complex than forests, their long 25–30 year 130 commercial lifespan and infrequent tillage (only occurring immediately pre-replanting) means 131 they have the potential to develop considerably higher levels of understory vegetation 132 complexity in comparison to annual vegetable oil-producing crops, such as soybean and 133 rapeseed (Barcelos et al., 2015; Corley & Tinker, 2015; Luskin & Potts, 2011; Meijaard et al., 134 2018). For example, Luke, Purnomo et al. (2019) found that mature oil palm plantations in 135 Sumatra, Indonesia can support an understory vegetation layer consisting of 120 different fern 136 and flowering plant species. An established understory may act as a nectar source for 137 pollinators, a food source for herbivores, provide cover for predatory species and benefit 138 temperature-sensitive taxa by buffering the ground-level microclimate (Hinsch, 2013; Luskin 139 & Potts, 2011; Norman & Basri, 2010), potentially having a net positive impact on overall 140 levels of biodiversity and ecosystem functioning.

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142 Few studies have investigated the impacts on biodiversity of local-scale management practices 143 that enhance understory complexity in oil palm plantations. Instead, the majority of research 144 that has been carried out on management for heterogeneity within oil palm has focussed on 145 increasing complexity at the landscape-scale, such as through retaining or replanting native 146 trees in fragments (as in Lucey & Hill, 2012; Lucey et al., 2014; Teuscher et al., 2016; Zemp 147 et al., 2019) or along rivers (as in Gray et al., 2015, 2016; Luke, Slade et al., 2019; Woodham 148 et al., 2019; Mullin et al., 2020; Pashkevich et al., 2022; Williamson et al., 2020). Given that 149 guidance on local-scale management practices is already included in certain sustainability 150 certification guidelines (such as those highlighted within Principle 7 of the Roundtable on 151 Sustainable Palm Oil's Principles and Criteria (RSPO, 2018)), and that such practices are likely 152 to be relatively easily and cheaply adapted to fit with future updated guidelines, it is of key 153 importance that the outcomes of such practices are better understood. This is important not only to maximise yield, but to also minimise the costs of production to biodiversity and thewider environment.

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157 The use of herbicides to control weeds, as a means to improve access for harvesting, as well as 158 to maximise light, water, and nutrient availability for the crop, is common practice in oil palm 159 agriculture. This typically involves either targeted spraying around individual palms and along 160 pathways, as is common practice in industrial plantations, or non-targeted blanket spraying 161 which is common in small-holding plantations (Corley & Tinker, 2015; Lee et al., 2014; 162 Rutherford et al., 2011; Wibawa et al., 2007). In addition to impacting understory vegetation 163 (e.g., Luke, Purnomo et al. (2019) reported that understory floral species richness increased by 164 as much as 43% in non-sprayed plantation plots), there is evidence that reduced herbicide 165 application can lead to higher faunal abundance and diversity. This includes increased web-166 building spider abundance (Spear et al., 2018), ground-dwelling ant abundance (Hood et al., 167 2020), understory insect family richness (Darrass et al., 2019), leopard cat activity (Hood et 168 al., 2019), and more abundant and diverse belowground macrofauna (Ashton-Butt et al., 2018). 169 With many of these taxa being directly associated with important ecosystem services, such as 170 pest control, decomposition, and nutrient cycling, reduced herbicide application also has the 171 potential to enhance the level of ecosystem functioning within plantations. Therefore, reducing 172 herbicide application within oil palm agriculture is not only a potentially practical and cost-173 effective way to increase plantation-wide understory vegetation heterogeneity, but also has the 174 potential to positively impact wider biodiversity and alleviate some of the negative ecological 175 impacts associated with agricultural expansion.

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The Reduviidae (assassin bugs) are a large and biologically diverse family of predacious insects, with approximately 7,000 species described globally (Gil-Santana et al., 2015). Many of these species play important roles as pest control agents within tropical agriculture, including in oil palm plantations, where, due to their polyphagous nature, they prey on a wide variety of 181 insect pests, including the two main groups of oil palm defoliators present in Southeast Asia: 182 nettle caterpillars (Lepidoptera: Limacodidae) and bagworms (Lepidoptera: Psychidae) (Ambrose, 2003; Cheong et al., 2010; Jamian et al., 2016; Wood, 2019; Zulkefli 183 184 et al., 2004). For many years, synthetic pesticides were used to control pest numbers in oil 185 palm, however, their usage has now been largely phased out due to the wide-scale development 186 of pest resistance, secondary poisoning of non-target organisms, and potential risks to human 187 health (Gill & Garg, 2014; Wilby & Thomas, 2002). Integrated Pest Management (IPM) has 188 become an increasingly important alternative strategy for pest control in oil palm agriculture 189 (Wood, 2002). IPM ultimately aims to complement, reduce, or replace the application of 190 pesticides, through careful monitoring of pests, targeted control strategies, and enhanced 191 natural biocontrol by key native predator species (Kogan, 1998; Toth, 2009), including assassin 192 bugs. It is therefore important from both a conservation and yield perspective to understand 193 how understory vegetation complexity within oil palm plantations affects assassin bugs.

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195 In this paper, we investigate the impacts of three oil palm understory management strategies 196 on two species of assassin bugs (Cosmolestes picticeps Stål, 1859 and Sycanus dichotomus 197 Stål, 1866), both of which are generalist predators and widely cited as effective pest control 198 agents within Southeast Asian agroecosystems (Norman et al., 1998; Sulaiman & Talip, 2021). 199 To do this, we use a large-scale and long-term Before-After Control-Impact (BACI) 200 management experiment that has varied levels of herbicide applications with resultant effects 201 on understory vegetation complexity in mature industrial oil palm. As applications of 202 herbicides could affect assassin bug communities both long-term (through impacts on 203 understory vegetation structure), and in the immediate short-term (through direct toxicity of 204 herbicide exposure), we specifically investigate both long- and short-term effects, asking the 205 following key questions:

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What are the long-term (18 months after treatment) effects of varying understory
 vegetation treatments on the abundance of *Cosmolestes picticeps* and *Sycanus dichotomus*?

2) What are the short-term (within two weeks after treatment) effects of herbicide

application on the abundance of *Cosmolestes picticeps* and *Sycanus dichotomus*?

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## 214 2 Materials and Methods

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216 **2.1 Study Site** 

218 Data for this study were collected in industrial oil palm plantations owned and managed by PT 219 Ivo Mas Tunggal, a subsidiary company of Golden Agri Resources (GAR), with technical input 220 from Sinar Mas Agro Resources and Technology Research Institute (SMARTRI) in Riau 221 Province, Sumatra, Indonesia (N0 55.559, E101 11.619) (Figure 1). The area surrounding the 222 plantations is dominated by oil palm agriculture and human infrastructure; the nearest intact 223 forest (Siak Kecil Forest) is 60 km away, and the nearest degraded forest is 15 km away. The 224 region has a wet tropical climate, with an average annual rainfall of 2,350 mm (average 225 monthly rainfall figures for the data collection period are shown in Supplementary Figure 1 226 (SF1)).

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228 The study was conducted across two neighbouring plantation estates (Ujung Tanjung and 229 Kandista) (Figure 1), both of which are RSPO certified, with GAR being an active member of the RSPO since 2005. The plantations were planted between 1988 and 1993 (see 230 231 Supplementary Table 1 for exact planting dates for each experimental plot), meaning oil palms 232 were mature (aged 20 - 27 years) at the time of data collection in 2013, 2014 & 2015. Across 233 the two estates, oil palms were planted in staggered rows at a density of 136 palms/ha, or 234 approximately 8 m apart. The sites used in this study make up the Biodiversity and Ecosystem 235 Function in Tropical Agriculture Understory Vegetation Project (BEFTA-UVP). The BEFTA-236 UVP is a long-term ecological experiment that investigates the effects of understory vegetation

237 management in oil palm on biodiversity, ecosystem functioning, and yield (Luke et al., 2020). 238 Project sites consist of eighteen plots, arranged into six triplets. Each plot measures  $150 \times 150$ 239 m and is made up of a central  $50 \times 50$  m core section and an outer buffer region. All plots are 240 located at the ends of three neighbouring  $300 \times 1,000$  m plantation planting blocks, such that 241 the middle plot in each triplet is 155 m from each of the outer plots within the triplet. Triplets 242 are separated by at least one kilometre (Figure 1). Each plot is established on flat ground, 10 -243 30 m above sea level, and is bordered by an unpaved road and drainage ditch on one end, and by neighbouring oil palm on the remaining three sides. A stream runs through two of the plots. 244



Figure 1. Location of BEFTA-UVP plots within SMARTRI estates (Riau, Sumatra, Indonesia). The 18
 plots (orange squares) are arranged in triplets throughout the Ujung Tanjung, and Kandista Estates
 (coloured in green). The maps were created using ArcMap 10.5.1 (Environmental Systems Research
 Institute, 2017), and library "maps" in R statistical package (Brownrigg, 2021), with reference to maps
 produced by SMARTRI. [This figure has been adapted, with the permission of the authors, from a figure
 included in Luke et al. (2020)].

Plots were established in October 2012, with understory management treatments implemented in February 2014. The three plots within each of the six triplets were randomly allocated to one of three understory treatments (hence, there were a total of six plots for each understory treatment) (SF2), representing the range of common management strategies used within industrial and smallholder oil palm plantations:

1. Normal understory vegetation complexity (hereafter referred to as "Normal"): This is standard industry practice used within the GAR estates and is how all plots were managed pretreatment. It involves an intermediate level of herbicide spraying, with harvesting paths and circles (1.5 m radius areas around individual palm bases) being sprayed three to five times annually. All other vegetation elsewhere in the plots is allowed to regrow naturally, except for woody shrubs and young trees, which are removed manually.

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281 2. Reduced understory vegetation complexity (hereafter referred to as "Reduced"): This
282 is the highest intensity of understory vegetation management. It involves a high level of
283 herbicide spraying, with all understory vegetation throughout the plots being sprayed three to
284 five times annually, effectively killing all understory vegetation.

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3. Enhanced understory vegetation complexity (hereafter referred to as "Enhanced"): This is the lowest intensity of understory vegetation management. It involves no herbicide spraying and only limited hand-cutting of woody vegetation to keep harvesting paths and areas around palm bases open and accessible. Cutting first took place one year after treatments started and was then carried out at the same frequency as herbicide application in the other treatments. For full details of the effects of the BEFTA-UVP experiment set-up and effects of the treatments on understory plant communities, see Luke, Purnomo et al. (2019) and Luke et al.

294 (2020). Herbicides used included Glyphosate (Rollup 480 SL), Paraquat Dichloride (Rolixone

295 276 SL), metsulfuron-methyl (Erkafuron 20 WG), and Fluroxypyr (Starane 290 EC). Barring 296 six days of geographically restricted pyrethroid based canopy fogging (see Pashkevich et al. 297 (2022)) no insecticides were used in the plots throughout this study. Data collection was carried 298 out during three separate time periods. To assess long-term effects of treatment, we collected 299 pre-treatment data in September 2013 and post-treatment data in September 2015 in all 300 eighteen plots. To assess short-term effects of treatment, we collected data in February 2014, 301 just before (within two weeks, and hereafter referred to as 2014-Pre) and just after (within two 302 weeks, and hereafter referred to as 2014-Post) herbicide application in each of the six Normal 303 and six Reduced treatment plots (SF2). We did not survey the six Enhanced treatment plots at 304 this time, as Enhanced and Normal plots were the same at this point, owing to not enough time 305 passing for our Enhanced treatment to take effect.

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307 2.2 Assassin Bug Surveys

309 We surveyed adult Reduviidae of the species Cosmolestes picticeps and Sycanus dichotomus 310 (the two most common/conspicuous assassin bug species found within the plantation sites 311 according to local counterparts) along transects in the core of each study plot. Transect walks 312 consisted of a recorder walking at a steady pace, counting any adult C. picticeps or S. 313 *dichotomus* that were visible or flew up in front of the recorder (without deliberately disturbing 314 vegetation) within a 5-m-sided cube of space in front of them. This meant that it was important 315 that both species could be easily distinguished visually from each other and from other 316 Reduviidae present within the plantations. This was only achievable for adult C. picticeps and 317 S. dichotomus (Figure 2), meaning that earlier developmental stages (eggs and nymphs) were 318 not recorded. Identifications were made following guidance from local counterparts. The 319 transect was 200 m in length and followed the edge of the central 50 x 50 m core section within 320 each plot, although we did not re-record areas of overlap at the end of the transect. Transects 321 were walked between 9:00 and 17:00 and were not conducted when it was raining. Two repeat 322 surveys of each plot were carried out on separate days in each sampling period, with total 323 counts for each of the plots being averaged and rounded to the nearest whole number for analyses, except for 2014-Pre and 2014-Post, when time constraints meant that only one visit 324 325 was possible per transect before and after treatment. Therefore, for our long-term analyses, the 326 response variable was mean number of assassin bugs per 50 x 50 m transect over two days of sampling. For our short-term analyses, the response variable was number of assassin bugs per 327 328 50 x 50 m transect. We found that there was variation in counts between the two repeat surveys in each plot, but with a significant correlation between counts (SF3). By averaging surveys, we 329 330 therefore reduced some of the stochastic variation related to individual surveys.

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Figure 2. Photo of adult A) *Cosmolestes picticeps* and B) *Sycanus dichotomus*, taken within the BEFTAUVP plots (credit Edgar Turner). *Cosmolestes picticeps* typically measures ~1.5 cm in body length and *Sycanus dichotomus* typically measures ~3 cm.

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### 343 2.3 Statistical Analyses

345 We carried out all statistical analyses in R version 4.1.2 (R Core Team, 2021) using R Studio

version 2021.09.1+372 (R Studio Team, 2021). For data wrangling and exploration, we used

- 347 readxl (Wickham & Bryan, 2023), tidyverse (Wickham, 2019), data.table (Dowle &
- 348 Srinivasan, 2023), and plyr (Wickham, 2016), following the data exploration procedure
- 349 outlined by Zuur et al. (2010). For data visualisation we used *cowplot* (Wilke, 2020), *lemon*
- 350 (Edwards et al., 2022), and *ggplot2* (Wickham, 2016).
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352 We separately analysed the long-term and short-term impacts of understory vegetation 353 treatment on C. picticeps and S. dichotomus using Bayesian generalised linear regression 354 models (hereafter, GLMMs). We fitted GLMMs using brms (Bürkner, 2017) and the No-U-355 Turn sampler (NUTS) algorithm in Stan (Carpenter et al., 2017). We fitted five candidate 356 models for each response: a parent model (Time\*Treatment), and four derivative models 357 (*Time+Treatment*, a *Time-*only model, a *Treatment-*only model, and a null model), with '*Time*' 358 being a categorical variable with two categories representing different sampling time points: 359 after treatment in Sept 2015 (A) and before treatment in Sept 2013 (B), and 'treatment' 360 representing one of the three vegetation management types: Normal (N), Reduced (R) or 361 Enhanced (E). We included *Triplet* as a random intercept effect in all models, to account for 362 potential spatial autocorrelation, triplet-specific differences in environmental conditions and 363 timing of sampling in our modelling. Triplet has six variables: UT1, UT2, UT3, K1, K2 K3, 364 corresponding to the six triplets of BEFTA-UVP plots in Ujung Tanjung (UT) and Kandista 365 (K) estates. As we were modelling count data, all models were fitted to Poisson distributions. 366 We checked Poisson models for over-dispersion and found that they were not over dispersed 367 (and therefore negative binomial models were not needed). We verified that negative binomial 368 distributions did not improve model fits by calculating and comparing the leave-one-out crossvalidation information criterion (LOOIC) of these models to that of our Poisson-distributed 369 370 models. Owing to the high proportion of zeros within our data set (particularly for S. 371 dichotomus, with no individuals recorded in 58% of transects in the long-term data set and 42% 372 of transects in the short-term data set), we also verified that zero-inflated models were not 373 required.

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We ran all GLMMs for 50,000 iterations using four chains and a thinning rate of 10. We discarded the first 8000 iterations as warmup/burn-in samples and controlled the behaviour of the NUTS algorithm to decrease the number of divergent transitions ( $adapt_delta = 0.99$ ). We 378 fitted normal (0,10) priors on model intercepts, normal (0,10) priors on fixed effects, and 379 *normal* (0,1) priors on the standard deviation of random effects. When testing negative binomial and zero-inflated models, we fitted gamma (0.01,0.01) priors on the negative 380 381 binomial shape parameter and *beta* (0.1, 0.1) priors on the zero-inflated parameter. We chose 382 weakly informative priors, to regulate the posterior distributions of our models such that they were kept within a reasonable range of values (i.e., they did not stray too far from the 383 384 underlying datasets). For details of each of the models fitted during analyses see Supplementary 385 Table 2.

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387 We determined that mixing was sufficient by inspecting Markov chain Monte Carlo (MCMC) 388 trace plots, ensuring that Rhat values were <1.1, the ratio of effect sample size to total sample 389 size was >0.1, and no autocorrelation was present within the MCMC chains (Muth et al., 2018). 390 We validated models by verifying that no patterns were present when Pearson residuals were 391 plotted against fitted values, included covariates, and random effect levels. We then used posterior predictive checks to ensure that attributes of data that were simulated from each 392 393 model accurately reflected the real dataset from which each model was generated. For example 394 model validation plots see SF4–SF9. Model validation and posterior predictive checks required 395 bayesplot (Gabry & Mahr, 2022) and tidybayes (Kay, 2023).

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397 After generating and validating all candidate models, we took an information criterion 398 approach to choose a model of best fit. This model selection process involved calculating and 399 comparing each model's LOOIC. We selected the model with the lowest LOOIC as the optimal 400 model (i.e., a model that explained the most variation in the data with the fewest parameters), 401 unless the standard errors of the LOOIC overlapped with that of another candidate model, in 402 which case we selected the model with fewer parameters as the optimal model (Gabry et 403 al., 2019). If the null model was not the optimal model, we report model estimates and 95% 404 credible intervals for fixed effect parameters, and used *emmeans* (Lenth et al., 2018) to conduct 405 post-hoc analyses by computing estimated marginal means for each factor level and comparing
406 these in a pairwise fashion. We concluded that factor levels were meaningfully different if the
407 95% highest posterior density interval of the median point estimate calculated from our
408 comparisons did not overlap with zero.

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### 410 **3 Results**

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Assassin bugs were relatively abundant throughout the plots, with a total of 622 individuals recorded across the three sampling periods (September 2013, February 2014, and September 2015), representing an average density of 104 assassin bugs recorded per hectare. Across the study, *C. picticeps* was far more abundant (542 individuals, and 87% of total abundance) than *S. dichotomus* (80 individuals, and 13% of total abundance).

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### **3.1 Long-term effects of understory vegetation treatments**

420 436 assassin bugs (394 C. picticeps and 42 S. dichotomus) were recorded for use in long-term treatment analyses; 264 (239 C. picticeps and 25 S. dichotomus) in 2013 and 172 (155 C. 421 422 *picticeps* and 17 *S. dichotomus*) in 2015. Per-plot abundance for *C. picticeps* was significantly 423 affected by the interaction between sampling period and treatment type, with the maximum model (*Cosmolestes Picticeps* ~ *Time*\**Treatment*+ (1/Triplet)) being the optimal model ( $R^2 =$ 424 425  $52.1 \pm 5.7\%$ ) (Figure 3A). Post-hoc analyses showed that there were no differences in pre- and 426 post-treatment abundances of C. picticeps for Enhanced (Model estimate (95% credible 427 interval) for pre-Enhanced = 5.669 (3.592 - 8.488); for post-Enhanced = 6.458 (4.206 - 9.765)) 428 and Normal (Model estimate (95% credible interval) for pre-Normal = 7.435 (4.886 - 10.884); 429 for post-Normal = 6.162 (3.993 - 9.238)) treatments. However, for the Reduced treatment 430 (Model estimate (95% credible interval) for pre-Reduced = 7.242 (4.681 - 10.832); for post-431 Reduced = 0.116221 (0.005 - 0.619), per-plot abundance of C. picticeps was 98% lower in 432 2015 than in 2013 (average abundances of 1 and 45 respectively, across the six plots; Figure

433 3E). In contrast, for *S. dichotomus* we found no significant effects of understory vegetation 434 treatment, season, or the interaction between these variables, with the Null model being the 435 optimal model ( $R^2 = 6.3 \pm 6.3\%$ ) (Figure 3B). This was despite per plot abundances of *S.* 436 *dichotomus* in the Reduced treatment plots being 86% lower in 2015 than in 2013 (average 437 abundances of 1 and 7 respectively, across the six plots; Figure 3E).



Figure 3. Average per-plot abundance of: A) *Cosmolestes picticeps* & B) *Sycanus dichotomus* both before
(6 months pre-treatment) and after (18 months post-treatment) treatment in Enhanced, Normal and
Reduced plots. Boxplots display median and interquartile ranges (IQR), and whiskers incorporate data that
are 1.5\*IQR. The mean abundance in each of the 18 plots (6 replicate plots per treatment) is represented
by a dot; the size of the dot is determined by how many plots share the same abundance. Stacked bar graphs
(C, D & E) illustrate total number of *Cosmolestes picticeps* and *Sycanus dichotomus* before and after
treatment in each of the three treatment types.

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### 460 **3.2 Short-term effects of understory vegetation treatment**

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462 186 individuals (148 *C. picticeps* & 38 *S. dichotomus*) were recorded in the 2014 season: 114

463 (91 C. picticeps & 23 S. dichotomus) immediately before treatment application, and 72 (57 C.

464 picticeps & 15 S. dichotomus) immediately after. For the immediate pre and post dataset, we found no effects of understory vegetation treatment, season, or the interaction of these variables 465 on either C. picticeps or S. dichotomus, as the null model was the optimal model for both 466 species ( $R^2 = 10.1 \pm 8.1\%$  and  $R^2 = 6.5 \pm 6.3\%$ ) (Figure 4). 467

468



485 Figure 4. Per-plot abundance of: A) Cosmolestes picticeps & B) Sycanus dichotomus for both immediately 486 pre- and immediately post-treatment in Normal and Reduced plots. Boxplots display median and 487 interquartile ranges (IQR), and whiskers incorporate data that are 1.5\*IQR. The abundance in the 12 plots 488 (6 replicate plots per treatment) is represented by a dot; the size of the dot is determined by how many plots 489 share the same abundance. Stacked bar graphs (C & D) illustrate total number of Cosmolestes picticeps 490 and Sycanus dichotomus before and after treatment in the two treatment types. 491

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### **4** Discussion 493

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495 In this study, we tested whether different levels of understory vegetation management ("Normal" - herbicide spraying to remove understory vegetation only in areas key to 496 harvesting, "Reduced" - spraying all understory vegetation, and "Enhanced" - no spraying and 497 allowing understory vegetation to regrow naturally) affected two species of assassin bug (C. 498 picticeps and S. dichotomus) in mature oil palm plantations. We found that assassin bugs were 499

500 common across our plots, with 622 individuals recorded throughout our study. C. picticeps was 501 found to be far more abundant than S. dichotomus within the plots sampled (respective ratio 502 6.8: 1); this matches well with figures presented by Jamian et al. (2016), the only other study 503 that we could find to have recorded numbers of both species within oil palm agriculture. This 504 is potentially due to S. dichotomus being considerably larger than C. picticeps, with large-505 bodied insects often being rarer than smaller-bodied insects in ecosystems (Siemann et al., 506 1996). We found a significant negative long-term effect of reduced understory vegetation on 507 C. picticeps (per-plot abundance in Reduced vegetation treatments was 98% lower 18 months 508 post-treatment than it was pre-treatment), but not for S. dichotomus numbers, although there 509 was also a trend for S. dichotomus abundance to decline (86% decline over the same period). 510 In contrast, there was no significant observed effect of the Enhanced vegetation treatment 511 (where no herbicide was applied) on abundance of either species over the same time period. 512 We also recorded no significant changes in assassin bug numbers immediately post treatment 513 in 2014, indicating that there were no detectable immediate effects of herbicide spraying.

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### 515 **4.1 Long-term effects of understory vegetation treatment**

517 The strong declines we observed in the abundance of C. picticeps in Reduced vegetation 518 treatment plots, but not Normal or Enhanced vegetation plots, suggests that understory 519 vegetation plays a vital role in the survival of this species. This may be a direct result of the 520 structure provided by an established understory, as the leaves and stems of herbaceous plants 521 often provide the primary substrate for assassin bug oviposition (Ambrose & Livingstone, 522 1989). Furthermore, it is possible that eggs laid onto vegetation before herbicide application 523 may have experienced reduced hatching success if plants died before nymphs emerged, with 524 long-term effects on adult numbers. The lower abundance of C. picticeps in Reduced vegetation 525 plots may also be linked to the fact that understory vegetation likely supplies a vital food source 526 for assassin bugs, by providing resources for small invertebrate prey, as shown by previous

527 findings from the BEFTA-UVP (Ashton-Butt et al., 2018; Hood et al., 2020; Spear et al., 2018), 528 as well as work carried out by Darras et al. (2019) and Teuscher et al. (2016), who reported 529 that a more diverse and structurally complex oil palm understory promoted higher invertebrate 530 abundance and richness. The cover provided by understory vegetation may also be a factor, as 531 it can act as a refuge from predation, as well as creating more favourable microclimatic 532 conditions for assassin bugs, such as cooler temperatures and higher humidity. Finally, some 533 assassin bug species, including C. picticeps, are known to supplement their diet with extrafloral 534 nectar (Jamian et al., 2016); therefore, access to a more diverse floral understory might also 535 result in higher assassin bug numbers. Overall, it is likely that a combination of mechanisms 536 drive C. picticeps abundance within oil palm plantations, and that by removing understory 537 vegetation, assassin bug survival, reproductive and immigration rates decrease, while 538 relocation rates to more-favourable areas increase.

539

540 Although the abundance of C. picticeps is significantly associated with the presence of 541 understory vegetation, there was no clear observable difference between C. picticeps numbers 542 in Normal and Enhanced vegetation plots. This could be because Normal vegetation plots only 543 receive herbicide along access paths and in the area surrounding palms, and indicates that the 544 levels of understory maintained in Normal plots are sufficient to support assassin bugs at 545 abundances similar to those in Enhanced plots. This suggests that current herbicide 546 management regimes in GAR plantations are not having a negative impact on assassin bug 547 numbers. The lack of difference in understory vegetation complexity between Normal and 548 Enhanced plots has also been recorded in other BEFTA-UVP studies. Indeed, Luke, Purnomo 549 et al. (2019) found that the species richness and biomass of understory vegetation did not differ 550 between the two treatment types more than a year after treatment, while studies in the system 551 on different invertebrate taxa that recorded reduced abundance in Reduced vegetation plots

(Hood et al., 2020; Spear et al., 2018), have also reported a lack of difference between Normaland Enhanced vegetation treatments.

554

555 The lack of a significant difference in S. dichotomus abundance between treatments is most 556 likely related to the lower overall numbers of S. dichotomus observed throughout our plots, 557 making it harder to detect any significant effects of treatment. If true, this indicates that many 558 of the factors that influenced the reduction in C. picticeps abundance are also likely to impact 559 S. dichotomus. Indeed, previous research indicates that the ability to access, and preference for 560 different within-plantation vegetation stratum is similar for both species (Jamian et al., 2016; 561 Norman & Basri, 2010). However, it could also be that S. dichotomus, being considerably 562 larger than C. picticeps, is more dispersive and therefore less affected by the spatial scale at 563 which treatments were applied (150 x 150 m plots). Its size also means that its surface area to volume ratio is lower, potentially allowing it to be more robust to impacts mediated by changes 564 565 in microclimate, such as increased aridity (Kühsel et al., 2017).

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### 567 **4.2 Short-term effects of understory vegetation treatment**

569 There was no clear short-term effect of spraying herbicides on assassin bug numbers, 570 suggesting that the herbicide spraying itself does not have an immediate effect on assassin 571 bugs. This again indicates that factors associated with changes in understory vegetation 572 complexity are more likely to be driving differences in assassin bug numbers in oil palm 573 plantations. As we sampled very soon after spraying in the Reduced vegetation plots, much of 574 the vegetation, although dead or dying, was still present, providing some benefit for foraging 575 and as refuge from predation and microclimate. Similarly, any prey insects attracted by this 576 vegetation may still have been present. However, as adult assassin bugs readily fly when 577 disturbed, it is likely that many may have avoided direct contact with herbicides during 578 spraying, potentially explaining this lack of effect. Furthermore, as it was only adults that were recorded, any potential toxic impact of herbicide application on flightless nymphs would not have been picked up in our short-term abundance figures. It must also be noted that due to logistical constraints, we were unable to carry out two surveys pre and post treatment in 2014, so it is possible that the lower numbers in this analysis could have reduced the chance of detecting any differences. Indeed, *C. picticeps* numbers were lower immediately post-treatment in the Reduced plots, although this difference was not detected statistically in our modelling.

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586 **4.3 Management implications** 

588 The results of this study have several management implications. As both C. picticeps and S. 589 *dichotomus* are known to be effective predators of several major oil palm pests, the relatively 590 high abundance we recorded indicates that both species are potentially important pest control 591 agents in the plantations we studied, reflecting findings in oil palm systems in other parts of 592 the tropics (Ahmad et al., 2020; Jamian et al., 2016; Norman & Basri, 2010). Given the drop 593 in assassin bug numbers we detected within Reduced vegetation treatment plots, it is our advice 594 that the blanket spraying of herbicides in oil palm plantations should be actively avoided. We 595 instead suggest that plantations in which blanket spraying is standard practice (e.g., in many 596 smallholdings (Lee et al., 2014)), should switch management practice to a targeted herbicide 597 approach as a matter of priority. There is also a growing body of research that highlights the 598 potential associated risk of herbicide application to human health (Abdul et al., 2021; Kim & 599 Kim, 2020; Myers et al., 2016), so such a reduction in application is also likely to come with 600 additional benefits for growers. Our findings also suggest that in order to enhance assassin bug 601 numbers in oil palm, the implementation of more proactive management strategies, such as the 602 planting of beneficial understory species, as highlighted in Jamian et al. (2016), are required. 603 Owing to the role of assassin bugs as pest control agents (Ambrose, 2003), it is likely that if 604 understory vegetation is maintained and assassin bug numbers are boosted, it could also result 605 in enhanced pest control services and lower herbivory, with potential benefits to palm oil yield.

606 This is in line with a growing pool of evidence that highlights the importance of floral diversity 607 and structural complexity of vegetation for increasing the abundance of invertebrate predators 608 and parasitoids of crop pests (Chaplin-Kramer et al., 2011; Landis et al., 2000; Langellotto & 609 Denno, 2004; Wratten et al., 2002). It is therefore our recommendation that clear directives 610 concerning reducing herbicide usage within oil palm crop matrices (either through limiting the 611 frequency of general application or limiting application to distinct zones, i.e., access pathways) 612 should be integrated within major certification and sustainability guidelines. For example, 613 under Principle 7 of the Roundtable on Sustainable Palm Oil's Principles and Criteria for the 614 Production of Sustainable Palm (RSPO, 2020), a new sub-point within section 7.1 (Section 615 criteria: Pests, diseases, weeds and invasive introduced species are effectively managed using 616 appropriate Integrated Pest Management techniques) could be created. This would provide 617 guidance on levels of herbicide usage, as well as highlight the importance of maintaining 618 understory vegetation in boosting pest control agents within oil palm agriculture, citing this 619 study as well as others published from the BEFTA UV Project (e.g., Spear et al., 2018, Hood 620 et al., 2019 & Hood et al., 2020).

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622 Our findings highlight the importance of understory vegetation for supporting biodiversity in 623 oil palm, as well as potential associated pest control benefits. Given that several ecological 624 factors are likely driving these results, further research that aims to provide a clearer 625 understanding of the weighting of such factors could help with directing future management 626 strategy. More work is also required urgently to assess the practicality of implementing such 627 lower intensity management across oil palm plantations, particularly the long-term impacts on 628 pest numbers and yield. As herbicide applications can constitute a significant component of the 629 costs of oil palm management (Levin et al., 2012), it is also possible that such a change could 630 benefit profitability, while reducing any negative external effects of chemical applications on 631 human health. With oil palm now grown on over 28 million hectares globally (FAO, 2022),

632	these relatively	v simple change	s to management	practices have the	e potential to	have widespread
	2		$\mathcal{O}$		1	1

633 ecological benefits.

- **Author Contributions** 662
- 663

Our study brings together authors from multiple countries, including researchers based in the 664 country where the study was carried out. Jake Stone led statistical analyses (with assistance 665 666 from Michael D. Pashkevich) and writing of the manuscript. Amelia S. C. Hood created the original template for code used in statistical analysis. Jean-Pierre Caliman, William A. Foster, 667 Jake L. Snaddon, Sarah H. Luke, and Edgar C. Tuner designed the study. Anak Agung Ketut 668 669 Aryawan, Mohammad Naim, Pujianto, Dedi Purnomo, Suhardi, Ribka Sionita Tarigan, Tuani 670 Dzulfikar Siguga Rambe, and Rudy Harto Widodo contributed to the sampling design and 671 experimental protocols. Andreas Dwi Advento and Edgar C. Turner collected field data. All authors reviewed and approved the manuscript. 672

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695	affiliation were employed by SMARTRI, the research division of Golden Agri Resources				
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697	Memorandum of Understanding that protects the intellectual property rights and data-use for				
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700					
701 702	Data Availability Statement				
703	Data available via the University of Cambridge Online Digital Repository				
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705					
706 707	Supporting Information				
708	Supplementary material associated with this article can be found (see attached).				
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