

## **Title Page**

### **Article Type**

Letters

### **Title**

Competing for blood: the ecology of parasite resource competition in human malaria-helminth co-infections

Short title: Resource competition in malaria-worm co-infection

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### **Statement of Authorship**

AEW, FH, LJW, MMMK, LL, ES, TS & MY carried out the deworming trial. SAB & ALG analyzed the data in discussions with ES and MY. SAB and ALG wrote the manuscript. AEW, LJW, MMMK, LL, ES, & MY provided editorial feedback.

**Data Accessibility**

Data available from the Dryad Digital Repository: [https:// doi.org/10.5061/dryad.v08p7](https://doi.org/10.5061/dryad.v08p7)

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1 **Abstract**

2

3 Ecological theory suggests that co-infecting parasite species can interact within hosts  
4 directly, via host immunity and/or via resource competition. In mice, competition for red  
5 blood cells (RBCs) between malaria and bloodsucking helminths can regulate malaria  
6 population dynamics, but the importance of RBC competition in human hosts was  
7 unknown. We analyzed infection density (i.e. the concentration of parasites in infected  
8 hosts), from a 2-year deworming study of over 4,000 human subjects. After accounting  
9 for resource-use differences among parasites, we find evidence of resource competition,  
10 priority effects, and a competitive hierarchy within co-infected individuals. For example,  
11 reducing competition via deworming increased *Plasmodium vivax* densities 2.8-fold, and  
12 this effect is limited to bloodsucking hookworms. Our ecological, resource-based  
13 perspective sheds new light into decades of conflicting outcomes of malaria-helminth co-  
14 infection studies with significant health and transmission consequences. Beyond blood,  
15 investigating within-human resource competition may bring new insights for improving  
16 human health.

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## 22 **Introduction**

23 Ecology offers the tools and theory to study species interactions, but it has only  
24 recently been applied to parasites co-occurring within hosts. Two main ecological modes  
25 of parasite interactions are predicted, via the host's immune system or via resource  
26 competition (Graham 2008). Immune-mediated interactions have been demonstrated in  
27 numerous laboratory, wildlife, and human studies (Pedersen & Fenton 2007; Graham  
28 2008). These interactions frequently occur in helminth-microparasite co-infections  
29 because the immune responses required to clear these disparate parasite types are  
30 mutually inhibitory (Abbas *et al.* 1996; Yazdanbakhsh *et al.* 2002) and often lead to an  
31 indirect, facultative interaction between helminths and microparasites. Yet, the  
32 frequency, strength, and consequences of bottom-up, resource competition for  
33 understanding infectious diseases has received far less attention. Within hosts,  
34 competition for a shared resource (e.g., red blood cells (RBCs)) could restrict growth of  
35 either or both parasite species. Indeed, when mice are co-infected with anemia-inducing  
36 helminths, interspecific competition for RBCs limits malaria population growth (Griffiths  
37 *et al.* 2015).

38 However, in human hosts, the impact of RBC resource competition even in the  
39 well-studied malaria-helminth co-infections is unclear. Malaria and soil transmitted  
40 helminth infections remain two of the most prevalent groups of human parasites (Brooker  
41 2010; Murray *et al.* 2012). They co-occur in the same regions and often concurrently  
42 infect the same individuals (Salgame *et al.* 2013). Yet, despite dozens of studies over the  
43 past 40 years, the individual and public health consequences of malaria-helminth co-  
44 infection remain unresolved (Nacher 2011; Naing *et al.* 2013). Numerous studies have

45 found that helminths reduce malaria incidence, a possible consequence of resource  
46 competition. Yet comparable numbers of studies have documented that helminths  
47 increase or have no effect on malaria infections in people (Adegnika & Kremsner 2012).  
48 Here, we take a resource ecology approach in order to explain such varied outcomes.

49       Even in free-living systems, competition can be variable and difficult to detect.  
50 Competitive interactions are often complex, depending upon environmental conditions,  
51 order of establishment (i.e. priority effects), and the presence of multiple species (e.g.  
52 dominance hierarchies) (Clements 1938; Paine 1984). These same ecological principles  
53 can apply to parasite co-infections; for example, larval trematodes have competitive  
54 hierarchies within their snail intermediate hosts (Kuris 1990; Kuris & Lafferty 1994).  
55 Detecting such competition, however, relies on the proper scale of investigation. Most  
56 previous human co-infection studies have primarily focused on effects of helminths on  
57 the population-scale prevalence of malaria (i.e. proportion of hosts infected, reviewed in  
58 (Nacher 2011; Adegnika & Kremsner 2012; Naing *et al.* 2013), while far fewer have  
59 studied individual-level metrics like within-host density or infection intensity (i.e.  
60 number of parasites within each host (Bush *et al.* 1997), (Degarege *et al.* 2009; Kirwan *et*  
61 *al.* 2010; Kepha *et al.* 2016)), or infection severity (Nacher *et al.* 2002; Hesran *et al.*  
62 2004; Degarege *et al.* 2009; Njua-Yafi *et al.* 2016). Although more frequently applied to  
63 macroparasites like helminths and ticks, the intensity or density of protozoan, bacterial,  
64 viral, and fungal parasites can also be quantified and may be important for individual  
65 health and disease transmission (Råberg 2012; Westerdahl *et al.* 2013; Cizauskas *et al.*  
66 2015; Langwig *et al.* 2015; Carneiro Dutra *et al.* 2016). Like free-living species in the  
67 same habitat patch, interactions among parasites can only occur within co-infected

68 individual hosts. Thus, we postulate that density of each parasite species in infected hosts  
69 will be a more valuable measure of species interactions within a host than either  
70 prevalence or mean abundance, which include uninfected hosts (i.e. unoccupied habitat  
71 patches; (Bush *et al.* 1997)).

72         Crucially, our ecological approach to within-host competition also depends upon  
73 species' resource-use traits. Because resource needs vary according to life history and  
74 resource acquisition strategies of different parasites, taking a species specific approach is  
75 increasingly recognized as a key to understanding co-infection outcomes (Knowles 2011;  
76 Ramiro *et al.* 2016). Within hosts, it can be difficult to discern precisely what nutrient or  
77 tissue parasites are competing for, so the interactions among malaria, bloodsucking  
78 helminths, and host RBCs provide an opportune case study. Human malaria species  
79 utilize different resources (Simpson *et al.* 1999); for example, *Plasmodium vivax* (Grassi  
80 and Filetti) is a specialist on young RBCs (reticulocytes) and *P. falciparum* (Welch) is a  
81 generalist that can infect any age RBCs (Simpson *et al.* 1999). Helminths also differ in  
82 resource acquisition strategies that could have implications for co-infection interactions;  
83 for example, hookworms feed on blood while the giant roundworm *Ascaris lumbricoides*  
84 (L.) does not. Yet, in human co-infection studies, malaria species are frequently not  
85 identified or are pooled for analysis (Naing *et al.* 2013), and considering different types  
86 of helminths alone leads to conflicting outcomes across studies (Nacher 2011).  
87 Meanwhile, a meta-analysis of mouse malaria revealed that co-infection effects on both  
88 peak parasitemia and host mortality are malaria- and helminth-species specific (Knowles  
89 2011). For instance, averaged across multiple studies, helminths increase mouse mortality  
90 risk due to *P. yoelii* by 7-fold, but cut mortality risk due to *P. berghei* by almost half.

91 Thus, we predict that considering resource-use characteristics of malaria and helminth  
92 species has the potential to provide new insight into the contradictory reports in human  
93 co-infection studies.

94 To test this prediction, we used a two-pronged study design that held promise for  
95 quantifying interactions among parasite species, despite the difficulty of detecting such  
96 interactions in nature (Fenton *et al.* 2014). Parasite interactions can be detected through  
97 controlled co-infection experiments. Indeed, such studies have made great contributions  
98 to our understanding of the strength and mechanisms of parasite interactions (Holmes  
99 1961; Christensen *et al.* 1987; Behnke *et al.* 2001), but they are limited in their ability to  
100 capture a realistic environmental context. Field studies can provide this natural context,  
101 but then differentiating real interactions from processes like correlated exposure is  
102 challenging (Kuris & Lafferty 1994), and even when real interactions are occurring, they  
103 can be difficult to detect given the typically over-dispersed macroparasite distributions  
104 (Fenton *et al.* 2010, 2014). Here, we combine the strengths of a parasite removal  
105 experiment for differentiating true interactions from spurious correlations with the  
106 realism of a longitudinal study in a natural population. Though rarely applied, this  
107 combined approach has proved to be powerful for studying parasite interactions in natural  
108 populations (Jolles *et al.* 2008; Telfer *et al.* 2010; Johnson & Buller 2011).

109 Our “parasite removal experiment” was actually a placebo-controlled deworming  
110 trial in 3,491 human subjects on Flores Island, Indonesia. This work first established that  
111 deworming with albendazole had no lasting effect on malaria prevalence (Wiria *et al.*  
112 2013), despite significantly altering immune regulatory molecules which resulted in  
113 enhanced anti-*P. falciparum* responses in dewormed individuals (Wammes *et al.* 2016).

114 The present study focuses on the individual-host scale, parasite density within infected  
115 hosts, and key features of parasite life histories to reveal whether, when, and how these  
116 parasites interacted within that group of human hosts. We estimate parasite density as the  
117 concentration of malaria DNA in the blood and worm egg DNA the feces, which are  
118 highly correlated with traditional blood smear and fecal egg counts (Verweij *et al.* 2007;  
119 Wampfler *et al.* 2013), respectively. We then explore the hypothesis that RBC resource  
120 competition affects co-infection outcomes by testing for effects of helminths on malaria  
121 parasite density and vice versa. We highlight the importance of a species-specific  
122 approach by comparing aggregated and helminth species-specific analyses.

123         If competition for RBCs drives malaria-helminth interactions, we predict that co-  
124 infected individuals will have lower parasite infection densities and interactions will be  
125 strongest for bloodsucking hookworms. This is because, like emigrating young animals  
126 trying to find new territory when the number of appropriate habitat patches has been  
127 reduced on the landscape, we hypothesize that RBC competition with co-infecting  
128 hookworms will decrease the success rate of merozoites (i.e. the RBC seeking stage of  
129 malaria) finding and infecting susceptible RBCs, thereby reducing malaria density. We  
130 further hypothesize that malaria will decrease the food availability (i.e. RBCs) to co-  
131 infecting hookworms, potentially reducing worm growth, survival, and reproduction,  
132 with a net reduction in total egg output that will be captured by our measure of worm  
133 infection density. Finally, we predict that experimentally removing helminths will relieve  
134 RBC competition, allowing malaria to replicate more and achieve higher densities in  
135 albendazole-treated individuals. Instead, if immune cross-regulation drives malaria-



136 helminth interactions, we predict higher parasite densities in co-infected individuals and  
137 reduced malaria density in dewormed individuals.

138

### 139 **Materials and methods**

140 As previously described for this clinical trial (Wiria *et al.* 2010, 2013), individuals  
141 ages two to adult were cluster-randomized by household to a deworming treatment (400  
142 mg albendazole; n = 1729 individuals) or placebo (n = 1762 individuals) administered  
143 every three months over the study period (September 2008 to July 2010). To assess  
144 malaria and helminth infections, blood and fecal samples were collected at 0, 9, and 21  
145 months after initial albendazole treatment.

146

#### 147 *Parasite assessment*

148 To assess malaria infection status and estimate within-host density, blood samples  
149 were frozen until analysis by multiplex real-time Polymerase Chain Reaction (PCR)  
150 following established protocols (Wiria *et al.* 2010; Hamid *et al.* 2011; Kaisar *et al.* 2013).  
151 DNA was extracted from 200 µl of blood. Primers specific for *Plasmodium falciparum*,  
152 *P. vivax*, *P. ovale* (Stephens), and *P. malariae* (Laveran) were included in each PCR  
153 reaction (Wiria *et al.* 2010; Kaisar *et al.* 2013). Real time PCR assays of malaria  
154 infections are nearly 100% sensitive and specific (Roth *et al.* 2016), and are strongly  
155 correlated with traditional light microscopy blood smear counts (Wampfler *et al.* 2013).  
156 Samples were analyzed using the CFX real-time detection system (Bio-Rad Laboratories,  
157 USA) and CFX Manager™ software (Bio-Rad, version 1.0) (Kaisar *et al.* 2013). Lower  
158 cycle threshold (Ct) values indicate higher infection densities (Ct per µl blood or mg

159 feces) and each unit change indicates a 2-fold change in parasite density. Samples that  
160 failed to amplify by the 50 cycle count threshold were considered uninfected (Kaisar *et*  
161 *al.* 2013). As a second method of assessing malaria infection status, blood smears were  
162 examined for the presence of each malaria species using Giemsa staining and microscopy  
163 (Trape 1985; Petithory *et al.* 2005). Three species of malaria were detected: *P. vivax*, *P.*  
164 *falciparum*, and *P. malariae*. Prevalences of *P. falciparum* and *P. vivax* at the baseline  
165 (i.e. 2008) were 14.5 and 13.2%, respectively (Kaisar *et al.* 2013). For both malaria  
166 species, prevalences ranged between 3.6 and 15.2% for the remainder of the study with  
167 no significant differences between treated and control individuals (Wiria *et al.* 2013). *P.*  
168 *malariae* infections were too rare (1.9%) of samples (Kaisar *et al.* 2013)) to examine co-  
169 infection interactions.

170 Helminth infections were more common; over 80% of untreated individuals were  
171 infected and albendazole reduced prevalence to about 50% (Wiria *et al.* 2013). Using  
172 established protocols, helminth DNA was extracted from 100 mg of feces (stored at -  
173 20°C) suspended in 200 µl of PBS (Wiria *et al.* 2010) and analyzed using multiplex real-  
174 time PCR with species-specific primers (Verweij *et al.* 2007, 2009; Wiria *et al.* 2010;  
175 Hamid *et al.* 2011). Densities of two hookworms species: *Necator americanus* (Stiles)  
176 and *Ancylostoma duodenale* (Dubini), and *A. lumbricoides* and *Strongyloides stercoralis*  
177 (Bavay) were detected. Parasite quantification by real-time PCR is highly correlated with  
178 fecal egg counts of intensity (Verweij *et al.* 2007), the traditional way of determining  
179 infection intensity of these parasites. PCR can even be more sensitive at detecting low-  
180 intensity helminth infections than such microscopy techniques (Meurs *et al.* 2017). Real-  
181 time PCR quantifications of these helminths have not been compared with adult worm

182 counts, but fecal egg counts were not correlated with adult worm counts in one post-  
183 mortem study (Kannangara 1975). Nonetheless, helminth fecundity is correlated with  
184 worm size (Poulin 2007; Walker *et al.* 2009) and hookworm egg counts are associated  
185 with anemia across multiple studies (Smith & Brooker 2010), confirming that fecal egg  
186 quantification techniques are a reasonable way to assess hookworm RBC resource use.  
187 Low prevalences of *S. stercoralis* and *A. duodenale* precluded analysis of their individual  
188 interactions with malaria species. Hookworms were pooled in the analyses because *N.*  
189 *americanus* was found in over 98% of hookworm-positive samples, while *A. duodenale*  
190 was found in only 7% positive samples, with 5% of individuals co-infected with both  
191 hookworms. A fraction of each fecal sample was fixed in formalin (4%) for subsequent  
192 microscopic examination using the formal ether concentration (FEC) method to detect the  
193 helminth species noted above and *Trichuris trichura* (L.)(Allen & Ridley 1970; Wiria *et*  
194 *al.* 2010). Real-time PCR data were used to quantify infection density and the  
195 combination of real-time PCR-and microscopy were used to determine helminth infection  
196 status.

197

#### 198 *Red blood cell resources*

199 Red blood cell (RBC) counts were determined from blood samples collected at  
200 each sampling time point in heparinized tubes. RBC counts were performed by a blood  
201 analyzer (COULTER® Ac-T diff2™, Beckman Coulter, USA).

202

#### 203 *Statistical analysis*

204 We tested if the density of each *Plasmodium* species within infected hosts,  
205 quantified using real-time PCR Ct value, differed by helminth co-infection status using  
206 the longitudinal data. With the experimental data, we tested if deworming affected the  
207 density of each *Plasmodium* species. We used separate linear mixed models for the  
208 density of *P. vivax* and *P. falciparum*. Each model also included age, sex, and sampling  
209 date, and random effects of individual nested within household to account for repeated  
210 measures and the blocked study design (Wiria *et al.* 2013). To test whether filtering by  
211 the type of co-infecting helminth clarified the interaction, we ran separate models adding  
212 helminth, hookworms (*N. americanus* and/or *A. duodenale*), or *A. lumbricoides* co-  
213 infection status to the models. Interactions between age and co-infection status were  
214 initially included in these models to account for potential effects of age-density  
215 relationships, but were dropped due to lack of significance. All statistical tables describe  
216 relationships with real-time PCR cycle thresholds, but for clarity given the inverse,  
217 exponential nature of real-time PCR data, we converted effect size estimates to fold-  
218 changes in density (fold change =  $2^{\text{estimate}}$ ) for all figures (partial residual plots shown in  
219 supplemental materials).

220 Reciprocally, we investigated associations of each malaria species with the  
221 density of the two most prevalent helminths, *N. americanus* and *A. lumbricoides*. We  
222 used similar linear mixed models with real-time PCR Ct-values as the response. Models  
223 included age, sex, and sampling date, and a random effect of individual nested within  
224 household. To account for established effects of albendazole on helminth infections  
225 (Wiria *et al.* 2013), these models also included an interaction between deworming and

226 malaria co-infection. We also examined the evidence for interactions between the two  
227 worm species themselves (see Appendix S1 in Supporting Information).

228 To determine if there were any signatures of competition for red blood cells, we  
229 tested whether single and co-infections affected RBC counts. To investigate whether each  
230 parasite and experimental deworming (i.e. removing/reducing helminth competition)  
231 affected RBC counts, we used linear mixed models with a treatment-by-parasite status  
232 interaction, age, sex, and date. Individual nested within household was included as a  
233 random effect in this and all following hematological analyses. Next, the effects of  
234 parasite density on RBC count was examined with linear mixed models including  
235 treatment status, age, sex, and date as covariates. Original models included an interaction  
236 between treatment and parasite density, which was dropped due to lack of significance  
237 for all but the *P. vivax* model. Finally, for each *Plasmodium* species, we classified  
238 individuals as uninfected, infected with just malaria, infected with just hookworms, or  
239 infected with both malaria and hookworms. We then ran two linear mixed models testing  
240 if co-infection status affected RBC count. These models included an interaction with  
241 treatment, age, sex, and date as covariates.

242

## 243 **Results**

### 244 *Resource competition explained density during worm-malaria co-infection*

245 Interactions between helminths and *P. vivax* density were species-specific and  
246 aligned with our predictions under resource competition. Individuals co-infected with  
247 either of the bloodsucking hookworms had lower density *P. vivax* infections ( $t = 2.18$ ,  $df$   
248  $= 230$ ,  $p = 0.030$ ; Fig. 1, see Table S1 in Supporting Information). This competitive

249 interaction was specific to hookworms; *P. vivax* density was not affected by overall  
250 helminth co-infection status or co-infection with *A. lumbricoides*, a non bloodsucking  
251 species (Fig. 1, see Fig. S1 and Table S1). Moreover, the direction of these associations is  
252 opposite to predictions of immune-mediated facilitation. Notably, this pattern suggesting  
253 malaria-hookworm competition was corroborated by experimental deworming data;  
254 compared to control individuals, removing helminths with albendazole generated higher  
255 *P. vivax* densities ( $t = 2.19$ ,  $df = 222$ ,  $p = 0.029$ ; Fig. 2; see Table S2). Given the  
256 exponential nature of real-time PCR measures, the observed difference in mean density  
257 corresponds to a 2.75-fold increase in *P. vivax* density in dewormed individuals (Fig. 2;  
258 see Fig. S2).

259         Conversely, we detected no significant interactions between helminths and *P.*  
260 *falciparum*. Associations between *P. falciparum* density and helminth co-infection fit  
261 predictions of immune-mediated facilitation (i.e. higher density in co-infected  
262 individuals), yet none of these interactions were significant (all  $p > 0.18$ ; Fig. 1, see Fig.  
263 S1 and Table S1). Again, the experimental treatment supported the longitudinal  
264 association data; deworming with albendazole did not affect *P. falciparum* density (Fig.  
265 2, see Fig. S2 and Table S2). Thus, helminths had opposing associations with *P. vivax*  
266 and *P. falciparum* density. Only hookworms, and *N. americanus* in particular, were  
267 associated with reduced density of *P. vivax*.

268         Effects of malaria co-infection on helminth density also varied by parasite  
269 species. *P. vivax* co-infection was not associated with changes in the density of either  
270 helminth species (see Table S3), but *P. falciparum* co-infection was associated with  
271 lower *N. americanus* density (Fig. 3, see Table S3). Interestingly, in dewormed

272 individuals, the presence of *P. falciparum* was associated with a > 25-fold decrease in *N.*  
273 *americanus* density (see Fig. 3), but this interaction was marginally insignificant ( $p =$   
274 0.058, see Table S3).

275

#### 276 *Age-density relationships varied by parasite species*

277 Age-density relationships confirm that these parasites also differ in their  
278 interactions with the host's immune system. As previously reported in this population  
279 (Kaisar *et al.* 2013), *P. falciparum* density declined with age, a signature of acquired  
280 immunity. Conversely, *P. vivax* density was independent of age (see Fig. S3 and Table  
281 S1). The helminths also showed opposing age associations; *N. americanus* density  
282 increased with age, but *A. lumbricoides* declined with age (see Fig. S3 and Table S3).

283

#### 284 *RBC resources were affected by malaria and by helminth removal*

285 None of the four focal parasites affected RBC count (see Table S4), but a  
286 treatment by *P. falciparum* interaction was detected. Contrasts revealed that dewormed  
287 individuals had similar RBC counts regardless of *P. falciparum* infection status ( $p =$   
288 0.45), but control individuals infected with *P. falciparum* had lower RBC counts ( $p =$   
289 0.014; Fig. 4a). A similar pattern was observed for *N. americanus*, but the interaction was  
290 marginally insignificant ( $p = 0.060$ ; Fig. 4c; see Table S4). If parasite density within  
291 infected hosts rather than presence/absence was examined, a negative relationship  
292 between *P. falciparum* and RBC count was detected (Fig. 5a; see Table S5). *P. vivax*  
293 density interacted with treatment such that among control individuals there was a non-  
294 significant negative slope between density and RBC count, but among dewormed

295 individuals this relationship was slightly positive (Fig. 5b; see Table S5). The densities of  
296 the two helminths were not associated with RBC count (Fig. 5c,d; see Table S8). Effects  
297 of co-infection on RBC count were difficult to detect because treatment status interacted  
298 with infection status (i.e. none, only hookworms, only malaria, both parasites), prompting  
299 the need for 8 separate contrasts for each malaria species, none of which proved  
300 significant (see Figure S4, Table S6).

301

## 302 **Discussion**

303 Utilizing data from a two-year randomized, placebo-controlled deworming trial,  
304 we found experimental and longitudinal evidence for resource competition among  
305 malaria and bloodsucking hookworms in human hosts. Our approach of filtering by both  
306 malaria and helminth species identity and examining estimates of parasite density within  
307 infected hosts, rather than prevalence, was critical to detecting co-infection interactions.  
308 Both the longitudinal and experimental evidence support our prediction of resource  
309 competition between *P. vivax* and helminths, and the correlational data further suggest  
310 that this effect is due to hookworm co-infection. These interactions were likely of  
311 magnitudes significant enough to impact human health (Tripathy *et al.* 2007; Barber *et al.*  
312 2015); density of *P. vivax* infections was reduced 2.2-fold by hookworm infection, and,  
313 correspondingly, removing helminths with albendazole nearly tripled mean malaria  
314 density. Furthermore, RBC data suggest that *P. falciparum* has the largest effect on  
315 resource availability, which was reduced in the presence of *P. falciparum* and in an  
316 density-dependent manner. Providing further evidence for resource competition between  
317 malaria and hookworms, both *P. falciparum* infection status and *P. vivax* density



318 interacted with deworming treatment to affect host RBC counts. Supporting the  
319 hypothesis of resource competition, the lowest red blood cell counts were found in  
320 control (i.e. non-dewormed) individuals with malaria. For *P. falciparum*, this interaction  
321 was significant with infection status alone (yes/no), while for *P. vivax*, reduced RBC in  
322 control individuals was seen only during high density infections. Reciprocally, since  
323 deworming was associated with higher RBC counts during *P. falciparum* infection and  
324 high density *P. vivax* infections, there may be net health benefits to deworming despite its  
325 overall association with higher *P. vivax* density.

326 Further research would be required to identify the precise mechanism of *P. vivax*-  
327 hookworm resource competition. While hookworms could share the preference of *P.*  
328 *vivax* (Simpson *et al.* 1999) for reticulocytes, they are considered to be indiscriminant  
329 bulk feeders that cut open blood vessels and eat all RBCs that flow out (Brooker *et al.*  
330 2004), making this hypothesis unlikely. Hookworms may also ingest malaria-infected  
331 RBCs, but this ‘predatory’ hypothesis could only explain the opposing associations with  
332 the two *Plasmodium* species if hookworms prefer to prey upon *vivax*, which seems  
333 unlikely if they are indeed unselective bulk feeders (Brooker *et al.* 2004). Alternatively,  
334 hookworms could deplete RBCs at such a rate that hematopoiesis cannot keep up, or  
335 qualitatively alter the processes of hematopoiesis and blood cell turnover. Indeed,  
336 reticulocyte counts are reduced during severe *P. falciparum*-*N. americanus* co-infections  
337 (Nacher *et al.* 2001). This reticulocyte reduction could be a product of the chronic anemia  
338 and depleted iron stores typically caused by hookworms that can impair RBC production  
339 (Smith & Brooker 2010). Thus, hookworm-induced anemia could explain the lower  
340 density of the reticulocyte specialist, *P. vivax*, in hookworm co-infected hosts. Yet, we

341 found no evidence of RBC depletion in *N. americanus*-infected individuals in this  
342 population, but the marginal interaction with albendazole treatment suggests that longer-  
343 term hookworm infections may indeed reduce RBC counts. The *P. vivax* density-  
344 treatment interaction supports this hypothesis; RBC counts declined with *P. vivax* density  
345 in control hosts, but not dewormed hosts. A greater understanding of hookworm RBC  
346 usage and RBC production in chronically infected hosts will be key to explaining why  
347 they appear to be a superior competitor to *P. vivax*.

348         Conversely, density of *P. falciparum*, the RBC generalist, was not affected by  
349 resource competition with hookworms. However, density of the most common  
350 hookworm species was significantly reduced in *P. falciparum* co-infected hosts,  
351 suggesting that *P. falciparum* may outcompete *N. americanus* for RBCs. Indeed, *P.*  
352 *falciparum* infection was associated with reduced RBC counts, suggesting that species of  
353 malaria could limit resources available to *N. americanus* in co-infected hosts. This effect  
354 on *N. americanus* egg shedding could result from decreased larval establishment,  
355 increased mortality rate, and/or reduced fecundity in co-infected hosts. Further supporting  
356 that RBC-competition is mediating these interactions, a non-bloodsucking helminth, *A.*  
357 *lumbricoides*, was not associated with malaria density during co-infection or RBC counts.  
358 While nutrient limitation has long been suggested as a possible mechanism for human  
359 malaria-helminth interactions (Murray *et al.* 1978), this study provides the strongest  
360 evidence to-date that resource-mediated interactions, likely via host RBCs, can occur  
361 within co-infected people.

362         The opposing age-density patterns for *N. americanus* and *A. lumbricoides* match  
363 intensity and prevalence patterns from other endemic regions (Dunn *et al.* 2016), and

364 suggest that individuals can acquire at least partial immunity to *A. lumbricoides* or that  
365 exposure to this fecal-oral transmitted parasite declines with age. Reciprocally, the  
366 positive age-density relationship observed for *N. americanus* could suggest increased  
367 susceptibility or exposure to this parasite, acquired by contact with contaminated soil,  
368 with age. Age-intensity relationships for the two malaria species have been reported  
369 previously (Kaisar *et al.* 2013), but suggest that individuals develop some degree of  
370 protection that reduces *P. falciparum* intensity. Thus, as expected, the malaria and  
371 helminth species affecting this population represent diverse life histories, in terms of age-  
372 dependence of transmission and resource use, and tendency to achieve chronic, repeated,  
373 or relapsing infections. By accounting for host age statistically in our models, we were  
374 able to show that associations of within-host density, independent of host age, underlie  
375 the co-infection and deworming effects discussed above.

376         Despite the decades of malaria-helminth studies (reviewed in (Nacher 2011;  
377 Adegnika & Kremsner 2012), only a small number are of similar study design and thus  
378 directly comparable to ours. First, there have been few deworming trials in human  
379 populations to study malaria-helminth interactions (Murray *et al.* 1978; Kirwan *et al.*  
380 2010; Kepha *et al.* 2016). Only one of these trials examined intensity and, like us, found  
381 no effect of helminths on *P. falciparum* (Kepha *et al.* 2016). Second, although cross-  
382 sectional studies are more numerous than deworming trials, most focus on prevalence  
383 rather than the quantity of parasites in infected hosts. We detected negative effects of  
384 hookworms on *P. vivax* density, while the only previous hookworm-malaria intensity  
385 study reported a positive interaction (Degarege *et al.* 2009). However, that study did not  
386 differentiate among malaria species (Degarege *et al.* 2009) and the reticulocyte bias of *P.*

387 *vivax* varies by strain (Lim *et al.* 2016), which could affect the strength of resource  
388 competition with hookworms. Not differentiating among malaria species may also  
389 explain why the three studies examining associations of *A. lumbricoides* and malaria  
390 intensity are in complete disagreement, reporting positive (Hesran *et al.* 2004), negative  
391 (Nacher *et al.* 2002), or no evidence of (Degarege *et al.* 2009) interactions. Overall, we  
392 suggest that more studies focusing on intensity or density within infected hosts,  
393 separately examining various malaria and helminth species, and considering their diverse  
394 resource and immunomodulatory traits, are necessary for testing the generalizability of  
395 the resource-mediated interactions we detected and further elucidating the helminth  
396 malaria co-infection patterns found over the past 4 decades.

397         Some of the more complex interaction patterns we observed make sense in light  
398 of community ecology competition theories. First, differential interactions among  
399 hookworms and the two malaria species suggest a competitive hierarchy. Such  
400 hierarchies are common in ecological communities, such as herbaceous plants (Keddy &  
401 Shipley 1989) and rocky intertidal invertebrates (Paine 1984), where, dependent upon  
402 environmental conditions, there is a predictable pecking order of competitive outcomes.  
403 The reductions in density in co-infected hosts suggest that *P. falciparum* is a dominant  
404 RBC competitor to hookworms, and that hookworms outcompete *P. vivax*, the  
405 reticulocyte specialist. The RBC data support the idea that *P. falciparum* is a dominant  
406 competitor in this system. Specifically, *P. falciparum* reduced RBC counts in a density-  
407 dependent manner, suggesting that hosts could not fully compensate for blood loss due to  
408 this parasite. Outside of larval trematodes in mollusks (Kuris 1990; Kuris & Lafferty  
409 1994), competitive hierarchies among parasites have rarely been investigated. Second,

410 the community ecology concept of priority effects can explain why *P. falciparum* effects  
411 on hookworm density were marginally stronger in dewormed hosts. Arriving first within  
412 a host (i.e., habitat patch) may confer a general competitive advantage. For example, toad  
413 tadpoles survive and grow larger when they arrive in a pond before the larger leopard  
414 frog tadpoles (Alford & Wilbur 1985). Similarly, *P. falciparum* may outcompete young  
415 hookworms, but have weaker effects on adult helminths. Priority effects during co-  
416 infection have been documented for strains of the same parasite (Devevey *et al.* 2015)  
417 and among parasite species (Hoverman *et al.* 2013). Thus, community ecology theories  
418 appear useful for understanding interactions among malaria and helminths, and may also  
419 provide new insight into other co-infecting taxa (Graham 2008).

420         Although parasite quantification in infected hosts (i.e. intensity or density) can  
421 provide new insights into co-infection interactions that prevalence information cannot,  
422 measuring infection quantity does pose challenges. For example, adult helminth density  
423 can only be approximated via reproductive metrics (such as fecal egg excretion) in live  
424 hosts. Furthermore, malaria genome copy number varies over the schizogonic cycle.  
425 Nonetheless, our real-time PCR methods of quantifying infection density have been  
426 technically validated and strong positive correlations between Ct scores and true infection  
427 intensities are demonstrable (e.g., (Verweij *et al.* 2007); for further discussion, see  
428 Appendix S1). Like all measurement errors, these challenges in quantifying helminth and  
429 malaria density make detecting interactions more difficult. Yet, despite these sources of  
430 variation, we were able to detect negative associations between hookworms and *P. vivax*  
431 density and *P. falciparum* and hookworm density, suggesting they are robust interactions.

432           Understanding the mechanistic underpinnings of malaria-helminth interactions is  
433 critical for improving human health and disease management outcomes. In our study  
434 population, deworming had minimal effects on malaria prevalence (Wiria *et al.* 2013),  
435 yet had strong effects on *P. vivax* density. Both immune- and resource-mediated  
436 interactions can affect density, arguing for wider inclusion of resource competition and  
437 species identities in co-infection studies, regardless of the interaction mechanism of  
438 interest to the researchers leading a given study. The greater than two-fold higher malaria  
439 densities observed in albendazole-treated hosts may affect symptom severity and  
440 mortality risk (Tripathy *et al.* 2007; Barber *et al.* 2015). However, treated individuals had  
441 higher RBC counts during *P. falciparum* infection, and did not experience the same  
442 degree of *P. vivax*-density related declines in RBC count as untreated controls. Thus,  
443 deworming may still provide net health benefits to this population. At the population  
444 scale, higher parasitemia can increase the likelihood of successful transmission to  
445 mosquito vectors (Ross *et al.* 2006). Reciprocally, low density infections, as observed  
446 with *P. vivax*-hookworm co-infection, can also contribute substantially to transmission by  
447 leading to longer infection duration because cases often go undetected and untreated  
448 (Roberts 2016). Hence, interactions between malaria and helminths not only have  
449 consequences for individual health, but also population-level disease transmission and the  
450 success of treatment and eradication programs. Although rapid, species-specific diagnosis  
451 of co-infections to inform treatment decisions may pose logistical challenges, the  
452 potential public health gains from being prepared to mitigate effects of deworming on  
453 non-target infections may ultimately justify this type of approach.  
454

455 **Supporting Information**

456 Additional Supporting Information will be available in the online version of the article.

457

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459

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469

470 **References**

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663



## Figure Legends

**Figure 1. Hookworm co-infection is associated with lower *P. vivax* density.** Fold-change in density ( $\pm 1se$ ) of *P. falciparum* and *P. vivax* in co-infected individuals compared to individuals without worms. Due to the inverse, doubling nature of real-time PCR cycle threshold (Ct) values, fold changes were quantified by exponentiating two to inverse of each general linear model estimate. Asterisks indicate significant differences from zero in *Plasmodium* density for each comparison of single versus co-infected individuals. To view partial residual plots see Figure S1 and for statistical details see Table S1.

**Figure 2. Deworming increases *P. vivax* density.** Effect of albendazole treatment on *Plasmodium* density shown by the fold-change in density ( $\pm 1se$ ) compared to untreated individuals. Due to the inverse, doubling nature of real-time PCR cycle threshold values, fold changes were quantified by exponentiating two to inverse of each general linear model estimate. Asterisks indicate significant differences from zero in malaria density. To view partial residual plots see Figure S2 and for statistical details see Table S2.

**Figure 3. *P. falciparum* co-infection is associated with lower hookworm density.** Density ( $\pm 1se$ ) of *N. americanus* (Na), quantified as the inverse of real-time PCR cycle threshold (ct) value, grouped by whether individuals were co-infected with *P. falciparum* (+ Pf) for control and albendazole-treated individuals. Data are partial residuals from a

general linear model including co-infection status, age, date, sex, and random effects of individual within household. For statistical details see Table S3.

**Figure 4. RBC was affected by infection status and treatment.** a) *P. falciparum* infection status interacted with albendazole treatment to affect red blood cell count (RBC;  $\times 10^6$  cells/ $\mu$ L). The analogous interaction was marginal for c) *N. americanus* ( $p = 0.06$ ). The interaction was not significant for b) *P. vivax* or d) *A. lumbricoides*. No main effects of parasite presence or treatment were detected for any species. For statistical details see Table S4.

**Figure 5. RBC was affected by infection density and treatment.** Red blood cell count (RBC;  $\times 10^6$  cells/ $\mu$ L) was negatively associated with a) *P. falciparum* density (cycle threshold (Ct)), and not associated with the density of c) *N. americanus* or d) *A. lumbricoides* (dashed lines = non-significant). The relationship between RBC and b) *P. vivax* density differed between control and albendazole treated individuals. Due to the inverse, doubling nature of real-time PCR cycle threshold (Ct) values, lower Ct values represent exponentially higher densities. Plots a, c, and d show partial residuals from general linear models including parasite density\*treatment, age, date, sex, and random effects of individual within household. Since partial residuals can not be calculated for interactions, plot b shows raw data. For statistical details see Table S5.

Figure 1.

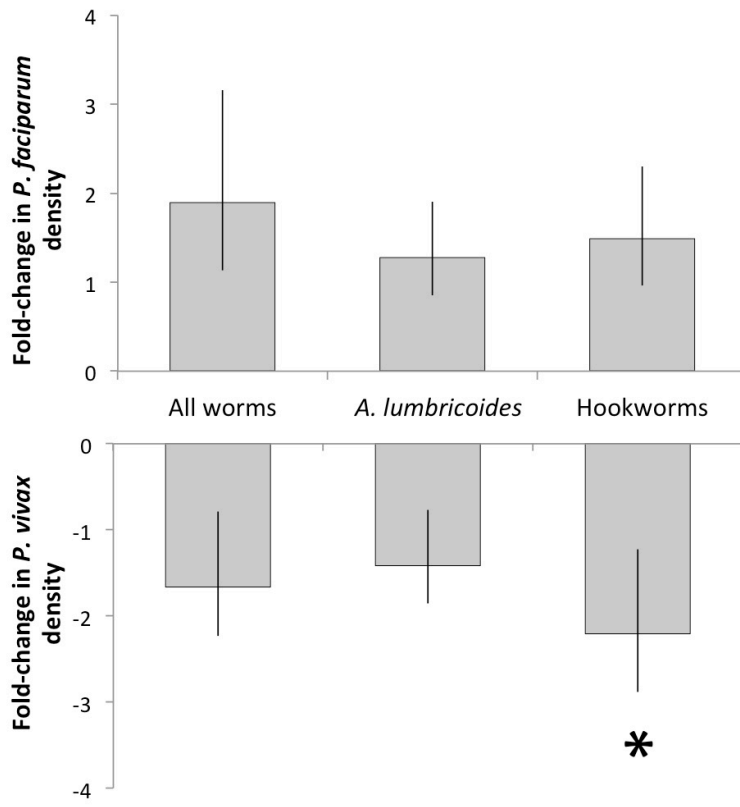


Figure 2.

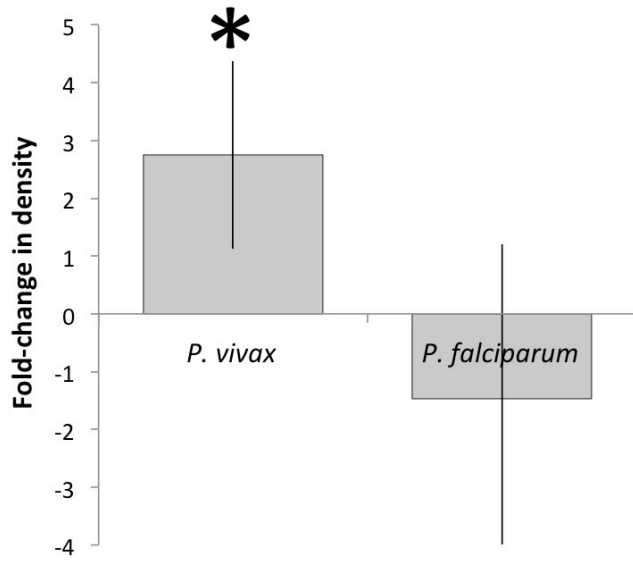


Figure 3.

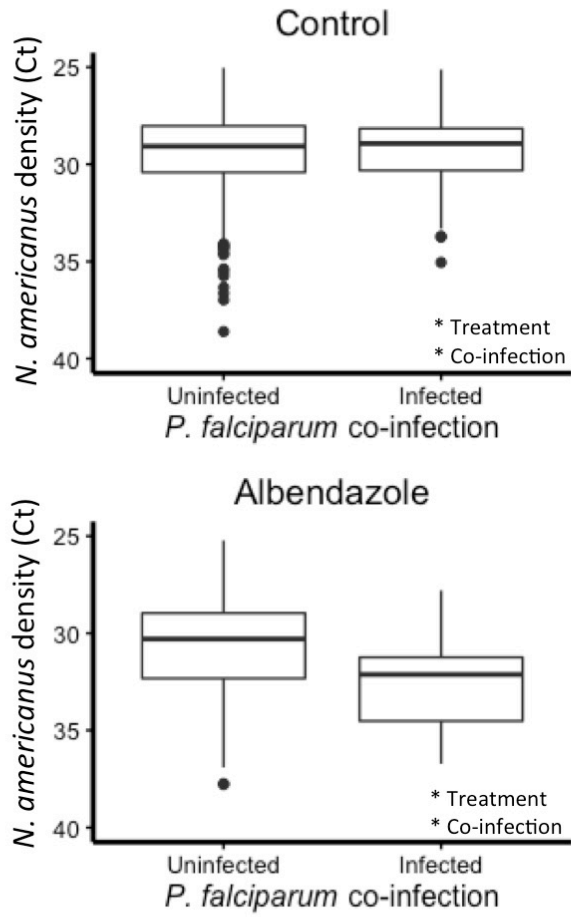


Figure 4.

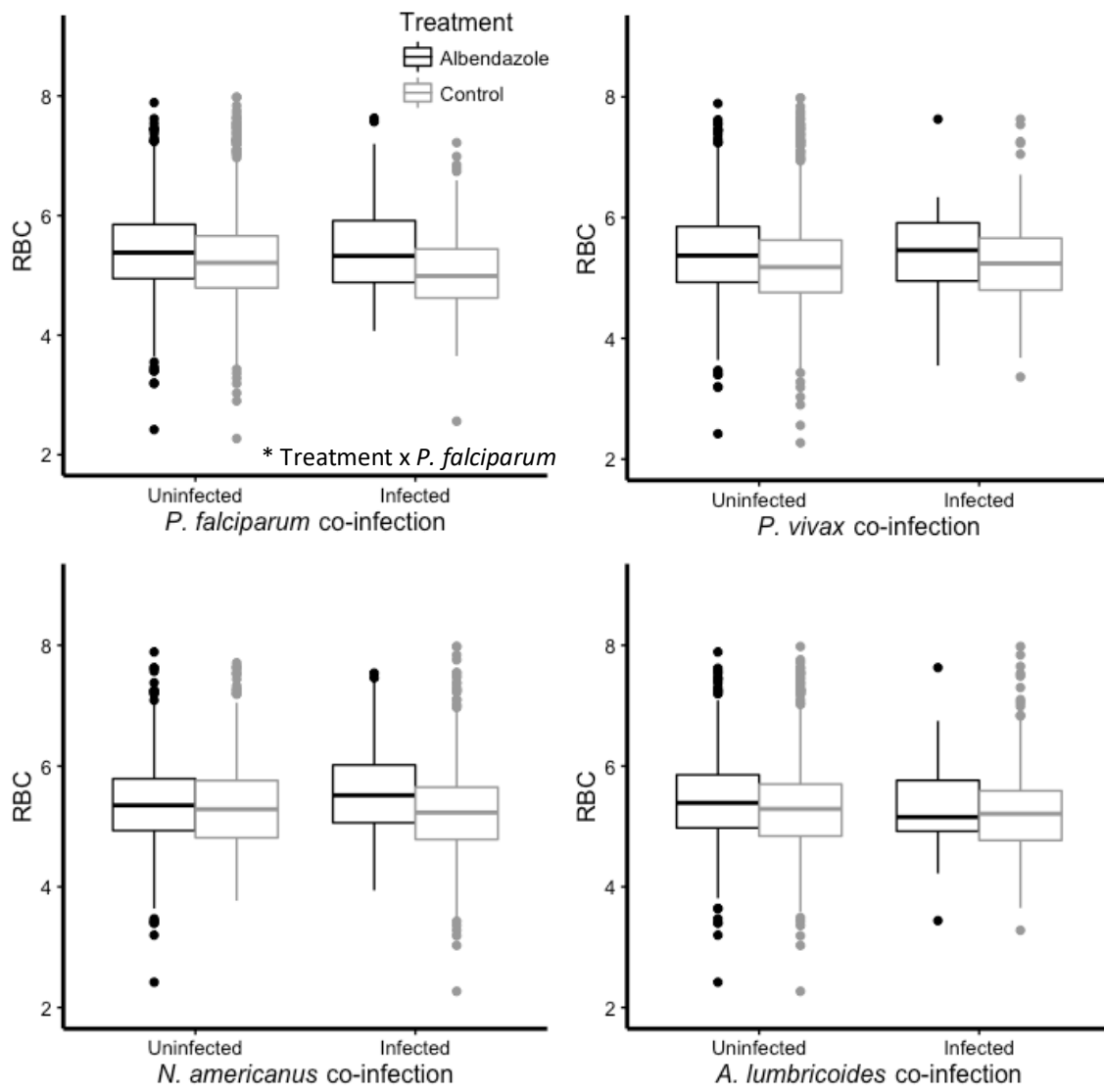


Figure 5.

