Co-infection is ubiquitous in people in the developing world but little is known regarding the potential for one parasite to act as a risk factor for another. Using generalized linear mixed modelling approaches applied to data from school-aged children from Zanzibar, Tanzania, we determined the strength of association between four focal infections (i.e. Ascaris lumbricoides, Trichuris trichiura, hookworm and self-reported fever, the latter used as a proxy for viral, bacterial or protozoal infections) and the prevalence or intensity of each of the helminth infections. We compared these potential co-infections with additional risk factors, specifically, host sex and age, socioeconomic status and physical environment, and determined what the relative contribution of each risk factor was. We found that the risk of infection with all four focal infections was strongly associated with at least one other infection, and that this was frequently dependent on the intensity of that other infection. In comparison, no other incorporated risk factor was associated with all focal infections. Successful control of infectious diseases requires identification of infection risk factors. This study demonstrates that co-infection is likely to be one of these principal risk factors and should therefore be given greater consideration when designing disease-control strategies. Future work should also incorporate other potential risk factors, including host genetics which were not available in this study and, ideally, assess the risks via experimental manipulation.
response [1,30,31] (e.g. hookworm-induced suppression of the pro-inflammatory cytokine IFN-γ causing increased parasitaemia with *Plasmodium* parasites [32]). Therefore, a second parasite species encountering an already infected host experiences a different environment than if that host was uninfected. Such changes to the host environment could potentially predispose, or protect, that host from a second infection, and/or or modulate the intensity of that infection. There is increasing evidence from both laboratory investigations [33–35], and in particular from field studies of animals [36–38], that interspecific parasite interactions can be a powerful influence on parasite dynamics. However, in humans, co-infection is often considered as the co-incident result of other infection risk factors and it is rarely considered that one infection could alter the risk of infection by a second species.

There have been a few recent studies that consider the role of co-infection alongside other potential infection risk factors, focusing largely on helminth and *Plasmodium* infections [4,39–42]. However, these studies generally consider co-infection in terms of co-exposure, describing the geographical co-incident overlap of the parasite species’ infectious stages, vectors or intermediate hosts, resulting from their shared requirements for particular climatic and geographical conditions. Despite this ‘co-incident overlap’ focus, these studies do provide evidence that associations between co-infecting species can remain, even after controlling for geographical and environmental attributes [39,40], suggesting that simple co-exposure is not a full explanation for observed parasite co-infections. Further, even where these studies incorporated behavioural and socioeconomic data, there was evidence that some positive associations between parasites persisted [39,40].

Traditional analytical approaches for detecting potential associations between infections (e.g. seeking simple correlations between infection intensities within hosts) do not allow for the effect of other potential infection risk factors to be considered [43,44]. In natural systems, many different factors can potentially act (either alone or together) to change a person’s probability of becoming infected with a particular parasite. Therefore, in order to determine the relative importance of the different potential risk factors, advanced statistical methods, such as generalized linear mixed modelling (GLMM), must be used, which enable the simultaneous assessment of multiple factors and have a greater chance of detecting negative relationships between infections [43].

Here, we have used GLMMs applied to a dataset of infections with three common soil-transmitted helminths (STHs, i.e. *Ascaris lumbricoides*, *Trichuris trichiura* and hookworm) and self-reported fever in school-aged children from Zanzibar, Tanzania [20]; these data also included other potential infection risk factors (i.e. physical environment, demography, behaviour and socioeconomic status). GLMMs have previously been used to determine (or infer) the presence of both positive and negative interactions between parasites, in both simulated and wild animal parasite datasets [36,37,43]. We used this integrated approach to investigate the role of co-infection in infection risk after accounting for other infection risk factors.

### 2. Methods

#### (a) Participants and study design

The study design, description of the population studied, and field and laboratory procedures used have been reported elsewhere [20]. Briefly, in 2008, a community-based, cross-sectional epidemiological survey was carried out in two shehias (administrative areas) of Unguja, the main island of the Zanzibar archipelago. The Bandamaji shehia is located in the rural north of the island, whereas the peri-urban shehia Dole is located in the west of Zanzibar Town in the centre of Unguja. In this study, only infection data of school-aged children were examined. Helminth-control interventions (e.g. preventive chemotherapy) are primarily targeted at this age group [13], yet co-infection’s influence on these children has been understudied. Approximately 330 individuals (adults and children) were enrolled in the main village of each shehia; 180 children, aged 5–16 years, provided complete information with 17 children providing one faecal sample, 51 providing two samples and the remaining 112 providing three samples, collected over a 3-day period.

Faeal egg counts (FECs) of *A. lumbricoides*, *T. trichiura* and hookworm were recorded for each child in the study; stool samples were examined using the Kato–Katz technique [45]. *Strongyloides stercoralis* and *Schistosoma haematobium* infections were also recorded using appropriate diagnostic techniques [20], but these infections were rare and therefore excluded from the present analysis. Malaria is close to elimination in Zanzibar [46–48], and hence was not assessed in this study.

For all children, a pre-tested, standardized questionnaire was used to record a wide range of commonly acknowledged infection risk factors, i.e. an individual’s age, sex, soil-eating and shoe-wearing behaviour; their family’s socioeconomic status and physical environment. In addition, self-reported status of (i) coughs, (ii) colds and (iii) fevers were recorded using a two-week recall period [20]. Fever was non-specific aetiology but is a symptom usually associated with viral, bacterial or protozoal infection rather than helminth infection. Malaria is unlikely to make a notable contribution to these self-reports of fever, owing to its rarity in Zanzibar.

#### (b) Statistical analyses

We investigated the association of the potential infection risk factors, detailed earlier, together with co-infection, on the presence or absence of four focal infections (i.e. *A. lumbricoides*, *T. trichiura*, hookworm and self-reported fever). These focal infections were examined in four separate GLMMs using a binomial error structure and a logit link function in the statistical package ASReml v3 (VSN International Ltd., Hemel Hempstead, UK). In all models, repeated measures of FEC (i.e. from patients providing two or more faecal samples) were controlled for by incorporating each child’s individual identification code in the random model. A cubic smoothing spline was fitted to age in all initial random models, which allowed potential nonlinear relationships between age and physical environment to be assessed. Fitting the cubic spline controlled for any age-associated correlations in infection intensity, because apparent associations between infections can arise simply as a result of correlated host age-specific patterns of infection [43].

The initial detailed structure of each model is described in the electronic supplementary material, table S1, and the database used in the analyses is given in the comma separated value file ‘S2.csv’. In brief, all models contained the fixed effects of host age, sex, behaviour, physical environment and socioeconomic status; the infection data were in the form of ln(FEC + 1) for *A. lumbricoides* and *T. trichiura*, and presence/absence for hookworm and self-reported fever. Presence/absence data rather than FEC were used for hookworm because of low prevalence (i.e. many uninfected individuals) which meant that normalization of these data was not possible by any attempted transformation. Where a STH was used as the
dependent variable, presence/absence data on self-reported colds and coughs were also included as explanatory variables; where self-reported fever was the dependent variable, coughs and colds were excluded from the analysis as they are also symptoms of several of the causes of fever and, as such, would be confounding factors.

Likelihood ratio tests were used to compare the random model in each analysis. Following simplification of the random model, the fixed model was refined by stepwise deletion of insignificant terms (i.e. \( p > 0.05 \)) using the Wald test and evaluation of the conditional \( F \)-statistics. Predictions from the final models are presented as prevalence of infection with a STH or self-reported fever, with the significant risk factors from each model. Section (i) of each graph presents the significant non-infection terms, with predictions made at a value of faecal egg counts (FECs) \( 0 \) and no self-reported fever for model (a). Section (ii) of each graph presents the significant infection terms. Predictions for the infection terms were made with village set to Bandamaji for models (a) and (b), sex set to male for model (c) and no soil consumption for model (d). Error bars show the 95% confidence limits of the predictions.

### 3. Results

Overall risk of infection (i.e. predicted prevalence) with *T. trichiura* was 0.40, *A. lumbricoides* 0.49, hookworm 0.26 and self-reported fever 0.43. Co-infection state was associated with a significant change in infection risk for all four focal infections. Conversely, none of the other factors (i.e. host age, sex, behaviour, socioeconomic status or physical environment) were significant risk factors for all infections, although at least one of these factors was significant in each of the four infection models.

#### (a) Focal infection with *Trichuris trichiura*

Both a child’s village of residency (\( F_{1,451} = 10.6, p = 0.001 \)) and shoe-wearing behaviour (\( F_{1,451} = 4.95, p = 0.028 \)) were associated with a significant change in the risk of *T. trichiura* infection. Children resident in rural Bandamaji had substantially higher risk (OR = 4.06) of infection than those from the village in the peri-urban shehia of Dole (figure 1(i)). Similarly, children who did not wear shoes had a higher risk of infection (OR = 2.25) than those who did (figure 1(i)). By combining these two risks, the difference between a child living in Dole and wearing shoes compared with one living in Bandamaji and not wearing shoes gave an OR of 9.13.

Co-infection with *A. lumbricoides* was associated with a significantly higher risk of *T. trichiura* infection (\( F_{1,451} = 30.7, p < 0.001 \)). Further, this risk was positively dependent on *A. lumbricoides* FEC (figure 1(ii)); comparing zero FEC with the mean FEC (\( z_{m} \)) of *A. lumbricoides*, and OR = 6.22 comparing zero with maximum *A. lumbricoides* FEC (\( z_{m} \)) OR = 24.57.

#### (b) Focal infection with *Ascaris lumbricoides*

A child’s village of residency was also a significant risk factor for *A. lumbricoides* infection (\( F_{1,451} = 29.58, p < 0.001 \)). Children
of Bandamaji had a substantially higher (OR = 30.24) risk of *A. lumbricoides* infection than those living in Dole (figure 1b(ii)).

Infection with *T. trichiura* (*F*_{1,451} = 14.94, *p* < 0.001) and self-reported fever (*F*_{1,451} = 5.31, *p* = 0.023) were associated with significant changes in the risk of *A. lumbricoides* infection. The *T. trichiura* FECs were positively associated with an increased risk of *A. lumbricoides* infection (figure 1b(ii); zm OR = 3.12 and zx OR = 54.07). Conversely, self-reported fever was associated with a lower risk of *A. lumbricoides* infection (figure 1b(ii), OR = 0.32). By combining these two risk factors, the difference between a child with fever and without *T. trichiura* infection and one without fever but with the mean for *A. lumbricoides* infection or maximum *T. trichiura* FEC gave ORs of 9.74 and 168.95, respectively.

(c) **Focal infection with hookworm**

A child’s sex was a significant risk factor (*F*_{1,452} = 4.19, *p* = 0.044) for hookworm infection, with boys at higher risk (OR = 2.14) of hookworm infection compared with girls (figure 1c(i)). *Trichuris trichiura* infection was a significant risk factor for hookworm infection (*F*_{1,452} = 5.14, *p* = 0.025). Increasing *T. trichiura* FEC was positively associated with an increased risk of hookworm infection (figure 1c(ii); zm OR = 1.6, zx OR = 5.16).

(d) **Focal infection of self-reported fever**

A child’s soil consumption behaviour was significantly associated with the risk of self-reported fever (*F*_{1,452} = 5.89, *p* = 0.016). Those who consumed soil had a substantially lower risk (OR = 0.04) of self-reported fever compared with those who did not consume soil (figure 1d(i)). *Ascaris lumbricoides* infection was significantly associated with self-reported fever (*F*_{1,452} = 8.89, *p* = 0.003) with increasing *A. lumbricoides* FEC associated with a decreasing risk of fever (figure 1d(ii); zm OR = 0.29, zx OR = 0.11).

4. Discussion

In recent years, studies in wild animals have shown the importance of co-infection in driving disease dynamics [36–38], highlighting the need for parasite-community-based approaches in the creation of parasite control strategies. However, this perspective is not apparent in the human disease literature, despite the growing understanding of the, often negative, consequences of co-infection for disease severity and treatment efficacy [49–52]. A limited number of recent human disease studies do consider co-infection [39–42] but the focus is clearly weighted towards explaining the causes of co-infection in terms of factors such as spatial overlap of infective stages, rather than considering the potential of infection with one species as a risk factor for other infections. We believe our study to be unique in assessing the potential importance of co-infection as an infection risk factor in humans while simultaneously looking at a wide range of other potential risk factors. It is also novel in attempting to answer this question by applying statistical techniques previously used to successfully answer similar questions in wild animal systems.

Here, we have considered how risk factors such as host age, sex, behaviour, socioeconomic status and physical environment, together with co-infection, act to govern the prevalence of focal infections in school-aged children. This integrated approach has enabled us to determine both the significance and effect size of these risk factors, thus determining their relative importance. These analyses have shown, for each of four focal infections, that co-infection remains a significant risk factor, even when other established risk factors are accounted for. Moreover, on average, co-infection was associated with a greater change in the risk of focal infection than the non-co-infection risk factors. For three of the focal infections (the exception being self-reported fever), ORs calculated by comparing zero FEC with the maximum (zm) of *A. lumbricoides* or *T. trichiura* were higher than those of any non-co-infection risk factors. Further, even the mean *A. lumbricoides* FEC, is associated with a greater risk of *T. trichiura* infection than either the risk factors shehia- or shoe-wearing alone.

An important point to highlight is that the co-infection can also be associated with a decreased risk of infection, as seen in the relationship between fever and *A. lumbricoides* FEC. Although soil consumption is associated with the greatest change in risk for self-reported fever, the role of co-infection is still substantial, with a 55 per cent lower risk of self-reported fever associated with the mean value of *A. lumbricoides* FEC (zm) and an 80 per cent lower risk associated with maximum *A. lumbricoides* FEC (zx). The unknown aetiology of self-reported fever means that we must be particularly cautious in attempting to suggest a mechanism in this case. However, fever is often an immune-mediated consequence of viral or bacterial infections caused by T-helper 1 (Th1) type immune responses. Therefore, one possible explanation for the relationship between *A. lumbricoides* and fever could be antagonism between the Th1 and T-helper 2 (Th2) arms of the immune response [53]. The Th2 response acts against macroparasites, and the two branches of the immune response are mutually downregulatory. Notably, the role of co-infection is likely to be underestimated in our analysis, because our data consider only three STHs and self-reported fever, when in fact, many other infections are likely to occur in this study population. Overall, our results show that co-infection is a very important risk factor for childhood infection, particularly for STHs.

In comparison with the role of co-infection, host age, sex and behaviour were comparatively low risk factors for infection. However, soil-eating behaviour was associated with a substantially reduced infection risk for self-reported fever (figure 1f(ii)). This may at first seem counterintuitive because soil consumption is generally associated with ill-health [20,25,54–56] and geophagy behaviour will, presumably, expose individuals to a range of infections. However, clay-rich soils have also been associated with the binding of microbial toxins and with the colonization of normal gut flora [54], which may provide protection against some pathogenic infections [57].

Socioeconomic status and physical environment had no significant effect on either the prevalence of STHs or fever. Other studies did find such associations, for example, between housing type and either hookworm [58], or *A. lumbricoides* and *T. trichiura* [22] infections. However, unlike our work, the analyses in these studies did not account for such a wide range of potential infection risk factors, including co-infection, which might otherwise have altered the findings.

A child’s home shehia was associated with a significant change in infection risk for both *A. lumbricoides* and *T. trichiura*. The two shehias differ in the mix of religions, professions,.
educational level and socioeconomic status of the inhabitants, as well as in their physical environment (Bandamaji being rural with much vegetation and many streams, Dole peri-urban with limited vegetation and few streams) [20]. Dole is a little larger (approx. 9 km²) than Bandamaji (approx. 7 km²), while the estimated population of Dole was 2968 and that of Bandamaji was 1124 at the time of the study in 2008. The significance of the risk and size of the ORs associated with shehia suggests that some environmental, behavioural, socioeconomic or other factor (or a combination of factors), which differ between these shehias, is still unaccounted for in our analyses. The availability and use of a more developed sanitary infrastructure in Dole may be a contributing factor, because this is likely to reduce environmental contamination with STH eggs and larvae in Dole [20,59]. However, because co-infection effects are equally evident in both shehias, despite their differences, it is unlikely that any within- shehia variation would explain the role of co-infection in infection risk.

While our study provides strong preliminary evidence that co-infection can significantly change the risk of infection, rather than being a simple correlate of other risk factors, it cannot prove causation, because the data are both cross-sectional and observational. Therefore, intervention studies, to test for causation, should be the next step. The range of infections we have explored is limited and focuses mainly on helminths. Importantly though, adding further species to the analysis is likely to extend rather than diminish the co-infection associations. Further, the use of self-reported fever expands the applicability of our findings, because fever is likely to be caused by viral, bacterial or protozoal infections rather than helminths.

Perhaps the greatest limitation of this study is that we lack information on host genetics, which can have substantial effects on infection status [23,24]. In future research, such genetic effects should be considered alongside co-infection and the other potential drivers of infection heterogeneity, as it is possible that susceptibility to one parasite species may result in susceptibility to other pathogenic organisms, or alternatively to increased resistance. Finally, it will be important to confirm these findings in other communities and to ascertain whether the findings are robust to different socioeconomic and environmental settings.

Similar to previous human disease studies [39,40], we have demonstrated the use of advanced statistical techniques, such as GLMM for the simultaneous assessment of a wide range of potential risk factors. However, the statistical approaches used in these studies and in our current work differ, which may account for the differences in perception regarding the importance of co-infection. An important step in this field of research will therefore be to determine the most appropriate methods to enable a clear determination of the relative importance of co-infection in driving disease dynamics. Further, these studies were conducted across very different environmental scales and their findings may suggest that, while co-infection may not be a major influence on risk of infection at very broad spatial scales, it could be an essential consideration at smaller spatial scales.

Ultimately, this study has shown that among school-aged children in Zanzibar, co-infection is likely to be a major risk factor for four focal infections. However, future studies should incorporate host genetics along with other risk factors, because of the potential for differential susceptibility to parasites, which could give rise to some of the co-infection risk patterns observed. Ideally, future work should test the importance of these risks by undertaking experimental manipulation, e.g. through chemotherapeutic interventions. Both model experimental systems, and human field study observations have demonstrated, for specific cases, that co-infection can alter disease outcome, parasite transmission potential and susceptibility of hosts to other infections [60,61]. Given this knowledge and the evidence from our study, associations between parasite species should not be dismissed as mere correlation without further investigation. Simple correlated exposure is not a sufficient explanation for the observed associations between infections in our study, as many other potential explanations for simple co-incident infection were accounted for. We suggest that, given the ubiquity of co-infection in human populations, the consequence of one infection for other infections in a host population is likely to be widespread. Theoretical studies have already demonstrated that interactions between co-infesting pathogens can have profound effects (both positive and negative) on pathogen control (e.g. leading to vaccine failure) [37]. Therefore, considering and accounting for co-infection must become a central tenet in the study of infections that people face, which ultimately helps to improve public health.

The study was approved by the institutional research commission of the Swiss Tropical and Public Health Institute (Basel, Switzerland). Ethical clearance was obtained from the Ethics Committee of the Ministry of Health and Social Welfare, Zanzibar (reference no. 16) [20]. All participants in this study gave written informed consent, which was provided by the parent or guardian for the children involved. Additionally, children provided oral assent.

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