

# Biodiversity Can Help Prevent Malaria Outbreaks in Tropical Forests

Gabriel Zorello Laporta<sup>1</sup>\*, Paulo Inácio Knegt Lopez de Prado<sup>2</sup>, Roberto André Kraenkel<sup>3</sup>, Renato Mendes Coutinho<sup>3</sup>, Maria Anice Mureb Sallum<sup>1</sup>

1 Departamento de Epidemiologia, Faculdade de Saúde Pública, Universidade de São Paulo, São Paulo, São Paulo, Brazil, 2 Departamento de Ecologia, Instituto de Biociências, Universidade de São Paulo, Brazil, 3 Instituto de Física Teórica, Universidade Estadual Paulista Júlio de Mesquita Filho, São Paulo, São Paulo, Brazil

#### **Abstract**

Background: Plasmodium vivax is a widely distributed, neglected parasite that can cause malaria and death in tropical areas. It is associated with an estimated 80–300 million cases of malaria worldwide. Brazilian tropical rain forests encompass host-and vector-rich communities, in which two hypothetical mechanisms could play a role in the dynamics of malaria transmission. The first mechanism is the dilution effect caused by presence of wild warm-blooded animals, which can act as dead-end hosts to Plasmodium parasites. The second is diffuse mosquito vector competition, in which vector and non-vector mosquito species compete for blood feeding upon a defensive host. Considering that the World Health Organization Malaria Eradication Research Agenda calls for novel strategies to eliminate malaria transmission locally, we used mathematical modeling to assess those two mechanisms in a pristine tropical rain forest, where the primary vector is present but malaria is absent.

Methodology/Principal Findings: The Ross-Macdonald model and a biodiversity-oriented model were parameterized using newly collected data and data from the literature. The basic reproduction number  $(R_0)$  estimated employing Ross-Macdonald model indicated that malaria cases occur in the study location. However, no malaria cases have been reported since 1980. In contrast, the biodiversity-oriented model corroborated the absence of malaria transmission. In addition, the diffuse competition mechanism was negatively correlated with the risk of malaria transmission, which suggests a protective effect provided by the forest ecosystem. There is a non-linear, unimodal correlation between the mechanism of dead-end transmission of parasites and the risk of malaria transmission, suggesting a protective effect only under certain circumstances (e.g., a high abundance of wild warm-blooded animals).

**Conclusions/Significance:** To achieve biological conservation and to eliminate *Plasmodium* parasites in human populations, the World Health Organization Malaria Eradication Research Agenda should take biodiversity issues into consideration.

Citation: Laporta GZ, Prado PIKLd, Kraenkel RA, Coutinho RM, Sallum MAM (2013) Biodiversity Can Help Prevent Malaria Outbreaks in Tropical Forests. PLoS Negl Trop Dis 7(3): e2139. doi:10.1371/journal.pntd.0002139

Editor: Edwin Michael, University of Notre Dame, United States of America

Received May 4, 2012; Accepted February 12, 2013; Published March 21, 2013

**Copyright:** © 2013 Laporta et al. This is an open-access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

**Funding:** MAMS received financial support from Fundação de Amparo à Pesquisa no Estado de São Paulo (process n. 05/53973-0). GZL is a recipient of a FAPESP postdoctoral fellowship n. 2012/09939-5. RMC is a recipient of a FAPESP doctorate fellowship n. 2010/09464-1. The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Competing Interests: The authors have declared that no competing interests exist.

\* E-mail: gabrielzorelo@usp.br

### Introduction

The dynamics of malaria transmission involve a tritrophic interaction among vector mosquitoes (*Anopheles* species), protozoan parasites (*Plasmodium* species), and vertebrate hosts. Malaria is endemic in tropical and subtropical regions [1–3]. The Global Malaria Eradication Program adopted in the 1950s has failed to meet expectations for malaria control in tropical and subtropical countries. One of the causes of that failure was the lack of an indepth knowledge of the ecology of malaria-parasite transmission [4]. In addition, *Plasmodium vivax* malaria has been neglected as a chronic disease [5].

The prevalence of malaria remains high, especially in Africa, the Americas, Asia, and the western Pacific. In those regions collectively, the prevalence was 2% in 2011, most cases occurring in children [6]. Recently, Murray et al. suggested that, although malaria mortality rates have remained stable worldwide, the World Health Organization underestimated malaria mortality for the last two decades, purporting that the number of deaths from malaria among adults in Africa, as well as among adults and children outside of Africa, was substantially higher than that reported [7]. Because of the suffering caused for malaria to humans mainly in developing countries, elimination of this disease is a challenge for the Malaria Eradication Research Agenda [8]. According to the World Health Organization agenda for vector control, there is an urgent need to identify key knowledge gaps in vector ecology and biology [9]. Such knowledge will be important to define strategies for mosquito control, as well as to reduce the

### **Author Summary**

Plasmodium vivax malaria is a neglected infectious disease that can cause severe symptoms and death in tropical regions. It is associated with an estimated 80-300 million cases of malaria worldwide. Brazilian tropical rain forests are home to a rich community of animals that can participate in the dynamics of malaria transmission. In this study, we used real data and computer simulation to study two aspects of biodiversity (an increase in the abundance of wild warm-blooded animals; and an increase in the abundance of non-malarial mosquitoes) and the effects they have on malaria outbreaks. We found that both aspects can help prevent malaria outbreaks in tropical forests. We also found that a decrease in the abundance of wild warm-blooded animals can increase the population of malarial mosquitoes and thus increase the chances of malaria outbreaks. Forest conservation and malaria control are not incompatible and thus biodiversity issues should be included in the World Health Organization Malaria Eradication Research Agenda in order to achieve the desirable goals of biological conservation and maintenance of low malaria transmission.

number of infective bites and the basic reproduction number [8]. The basic reproduction number  $(R_0)$  is the expected number of secondary cases arising from a single case in a given susceptible population and is used as a measure of malaria-parasite transmission, as well as of the impact of control programs.

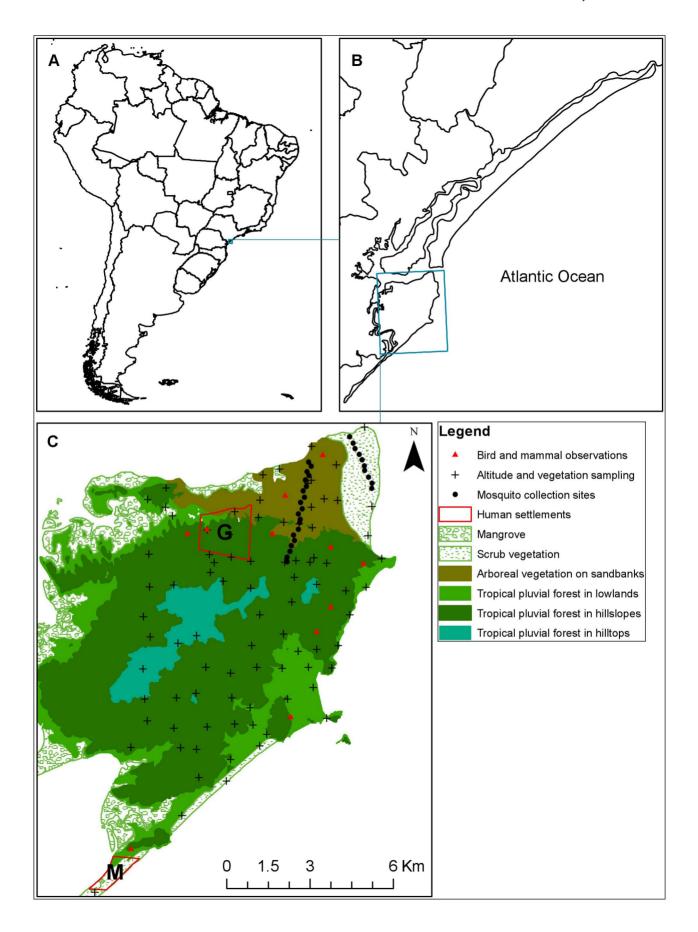
In the forested areas of the biogeographical subregion known as the Serra do Mar (mountain range), within the Atlantic Forest of southeastern Brazil [10], where the levels of insect and vertebrate richness are high [11,12], malaria is hypoendemic [13-16], and the primary malaria parasite being *Plasmodium vivax* [17]. In the Atlantic forest, species of the Anopheles subgenus Kerteszia are the primary malaria vectors. The majority of Kerteszia species use bromeliad-phytotelmata as larval habitats [18], and it has been suggested that Kerteszia spp. participate in the dynamics of malariaparasite transmission in Trinidad [19] and along the Atlantic coast of Brazil [20,21]. Between 1944 and 1951, there were malaria epidemics in the southern Atlantic Forest within the states of Santa Catarina and Paraná, the overall incidence for the period being 5% [21]. Such epidemics mainly ceased because of deliberate deforestation that eliminated 3,800 km<sup>2</sup> of native forest [22], removing bromeliads and reducing the number of resting sites for adult mosquitoes within the forest [21].

Although malaria epidemics are currently uncommon, temporal and spatial clustering of cases can occur in the Atlantic Forest. One low-incidence outbreak occurred among outdoor workers in the forested highlands of the state of Espírito Santo between 2001 and 2004 [23]. In 2006, another epidemic occurred in the southern periphery of the city of São Paulo, where residents of the Marsilac district invaded the Serra do Mar Natural Forest Reserve to construct houses [24]. Given the presence of *Anopheles* vector species, as well as that of infected and susceptible hosts, together with the circulation of *Plasmodium*, it is hypothesized that ecological interactions among *Anopheles* (*Kerteszia*) cruzii, *Plasmodium* species, and the local biodiversity are modulating malaria transmission in the Serra do Mar.

Forested areas offer a diverse range of habitats for mosquito species [25]. Consequently, high levels of mosquito species richness and abundance are expected [11]. This scenario can decrease the number of infective bites, because multiple vector and non-vector mosquito species would try to feed on a defensive host [26,27], decreasing the chances of successful bites by the vector population. In addition, malaria parasite transmission could be affected by an abundance of non-competent hosts that would prevent mosquitoes from transmitting *Plasmodium* parasites to humans [28]. This would represent a dilution effect of wild warmblooded animals, which act as dead-end hosts [29]. Therefore, diffuse mosquito vector competition and dead-end transmission of parasites are mechanisms in the dynamics of malaria transmission in tropical forests that, consequently, can alter the chances of malaria emergence.

The insight that ecological mechanisms can influence the dynamics of malaria parasite transmission supports arguments against human occupation of protected natural areas. Current theory says that biodiversity can have an impact on the emergence and transmission of infectious diseases, which is a new focus of conservation studies [30]. Some authors have shown that when biodiversity declines, there is an increased risk of humans contracting schistosomiasis [31], West Nile fever [32], hantavirus infection [33], or Lyme disease [34]. Similarly, diseases that affect coral reefs become more widespread when biodiversity is reduced by human activities [35]. The relationship between a decline of biodiversity and an elevated risk of vector-borne disease might be attributable to changes in the abundance of hosts and vectors or to modified host, vector, or parasite behavior [30]. In the Brazilian Amazon, gradual and continuous changes in the natural ecosystems can create ecological conditions that favor a rapid increase in abundance of Anopheles darlingi, which have been associated with an increased risk of malaria. Sawyer and Sawyer coined the term "frontier malaria" to define the dynamics of malaria transmission in recently deforested areas of the Amazon Forest [36]. In those areas, malaria transmission decreases when the natural ecosystem is highly modified, to the point that the maintenance of vector species and Plasmodium circulation are not ecologically supported [36,37]. Therefore, malaria in Amazon and in the Atlantic Forest are both associated with biodiversity, because the larval habitats of An. darlingi, the primary vector in Amazon Region, and An. cruzii, the primary vector in Atlantic Forest, depend on the presence of forested areas.

Historically, tropical regions have been considered economically underdeveloped hotspots of biodiversity [38]. However, Brazil is now becoming an emerging global economy, which suggests that its forest cover, along with its biodiversity, will decline rapidly [39]. If this occurs, frontier malaria will be eliminated, which would increase the risk of rural and urban malaria alike, because Anopheles marajoara could become a vector of Plasmodium parasites [40,41]. Given that malaria cannot be completely eliminated and that there is an urgent need for conservation/restoration of tropical biodiversity, it is important to understand interactions between the dynamics of malaria transmission and the diversity of vertebrates and mosquitoes. Here, we employed a mathematical model to develop a theoretical framework that might explain how biodiversity can modulate malaria epidemics in a tropical rain forest. Our case study site is a protected area within the Atlantic Forest, inhabited by indigenous peoples and fishermen, where An. cruzii is present but no malaria cases have been reported in the last 30 years. Our objectives were to propose a novel mathematical model for malaria transmission with explicit mechanisms of diffuse mosquito vector competition and dead-end transmission of parasites, applying this model to this case study site, as well as assessing how diffuse competition among mosquito vectors and dead-end transmission affect malaria epidemics.



**Figure 1. Study area.** A: South America and Brazilian States; B: The Iguape-Cananéia-Paranaguá estuarine lagoon region, southeastern coast of Brazil; and C: Parque Estadual da Ilha do Cardoso. G, The Guarani Mbya village; and M, Marujá. Source: Bird and mammal observations [45]; Altitude and vegetation sampling [46] (Figure S6). doi:10.1371/journal.pntd.0002139.q001

### **Materials and Methods**

### Study area

The Iguape-Cananéia-Paranaguá estuarine lagoon region is a coastal plain area of approximately 22,600-km², situated on the southeastern coast of Brazil (Figure 1A), between the Ribeira de Iguape River and the Atlantic Ocean (Figure 1B). Three great islands stretch along the coast a hundred kilometers from northeast to southwest, namely Comprida, Cananéia, and Cardoso [42]. Cardoso island, hereafter referred to as Parque Estadual da Ilha do Cardoso (PEIC), is a São Paulo State Park within the Atlantic Forest [43].

The PEIC is separated from the mainland by the Ararapira Channel, a body of water that is as narrow as 30 m wide at places. Therefore, even large animals, such as muriqui (Brachyteles) can cross [44]. Common wild warm-blooded animals include medium to large birds, such as quail (Odontophorus capueira), toucans (Ramphastos species), guans (Penelope species and Pipile jacutinga), tinamous (Tinamus solicarius), and mammals, such as howler monkeys (Alouatta species), agoutis (Dasyprocta leporina), and squirrels (Sciurus ingrami), as described by Bernardo [45]. Vegetation types form a successional gradient from sand dunes at the shore to higher and ancient terrains inland. Along the coastal plain, there is sand dune vegetation, scrubland, and low forests with sandy soil (arboreal restinga, or shoal vegetation). As can be seen in Figure 1C, tropical pluvial forest vegetation types are found on hillsides and hilltops [46].

Descendents of European colonists previously occupied what is now the PEIC, and the major local activities were fishing and family farming [47]. The population density is currently approximately 3.3 people/km², which has no relevant impact on local biodiversity. However, tourism has become one of the main sources of income, and thousands of tourists arrive every summer in the fishing village of Marujá, to the south (Figure 1C). In addition, the indigenous Guarani Mbya tribe has been settled in the northwestern part of the PEIC since 1992, having the right to engage in subsistence hunting and logging in the forest [48,49].

Anopheles cruzii, i.e., a primary malaria vector in the Atlantic Forest, is present in PEIC. Although no malaria cases have been reported in the last 30 years in PEIC, *P. vivax* is circulating in the immediate surrounding region [13,15,17] (Figure S1). Therefore, it is plausible to assume that introduction of *Plasmodium* species can occur in the region because of the thousands of tourists that visit the PEIC during the summer, including those traveling from endemic areas.

### Model of malaria transmission

The mathematical model proposed herein represents parasite transmission among four compartments that play specific roles in the dynamics of malaria transmission in the Atlantic Forest.

The first compartment is susceptible human populations in the Guarani and Marujá settlements, which were set at constant sizes. Considering that few humans are allowed to live in the PEIC, the size of the human population size remains approximately constant. However, malaria could emerge in the area because of its location in the Serra do Mar, where low-level endemic parasite transmission occurs [13,15]. In addition, it is also plausible to assume that introduction of *Plasmodium* species can occur in the region because of the 15,000 tourists that visit the PEIC during the summer [48],

including those traveling from endemic areas. Consequently, the human population from PEIC can be exposed to malaria parasites.

The human risk of *Plasmodium* infection in PEIC depends on the *An. cruzii* biting rate [50] and the probability of an infective bite [51,52]. Therefore, a proportion of susceptible humans are included in the second compartment, infected humans. For this simple vector-human malaria parasite transmission, however, ecological interactions can be added in order to create a more realistic scenario of malaria transmission. Other mosquito species and a diversified vertebrate community [12,45] (Table S1 and Table S2) are intermixed, competing for food and spatial resources with mosquito vectors and humans. Therefore, human malaria transmission may become difficult because of the increased abundance of non-vector mosquitoes and of vertebrate animals. Infectious humans can recover, becoming again susceptible to infection with malaria parasites. This assumption is based on the lack of human cross-immunity against *Plasmodium* species that circulate in the Atlantic Forest.

Until infectious humans are cured of the infection, they can infect An. cruzü [50] with a given probability of infection [51,52]. In the third compartment, An. cruzü population was assumed to be in equilibrium, meaning that its mean mortality rate [50] was assumed to be lower than its hatch rate because of its high abundance in forested areas of the Atlantic Forest [14,21]. The An. cruzü hatch rate is dependent on successful bites on animals and humans. Biting success was expressed by the mean period of free biting until the occurrence of host defensive behavior (Figure S2). Susceptible An. cruzü in the third compartment may be infected by means of biting infectious humans. Non-vector mosquito species decrease the risk of human-vector contact, whereas increased numbers of animals and humans can increase vector abundance. In the forth compartment, An. cruzü is now infected by Plasmodium and can transmit it back to humans.

### Mathematical model of malaria transmission

To calculate the risk of malaria parasite transmission, we used our model and the Ross–Macdonald model for the two most populated human settlements, the Guarani village and Marujá (Figure 1C). With the Ross–Macdonald model, it was assumed that *An. cruzii* abundance was constant; that is, there were no ecological interactions [53]. Therefore, the model was mathematically expressed as follows [54]:

$$\frac{dX_h}{dt} = -\frac{bT_{hm}X_hY_m}{N} + \gamma Y_h \tag{1}$$

$$\frac{dY_h}{dt} = \frac{bT_{lm}X_hY_m}{N} - \gamma Y_h \tag{2}$$

$$\frac{dX_m}{dt} = \mu Y_m - \frac{bT_{mh}X_mY_h}{N} \tag{3}$$

$$\frac{dY_m}{dt} = \frac{bT_{mh}X_mY_h}{N} - \mu Y_m \tag{4}$$

where  $X_h$  = susceptible humans;  $Y_h$  = infected humans;  $X_m$  = susceptible mosquitoes;  $Y_m$  = infected mosquitoes;  $N = X_h + Y_h$ ; b = biting rate;  $T_{hm}$  = transmission probability from a biting infected mosquito to a human;  $T_{mh}$  = transmission probability from a infected

human to a biting mosquito;  $\gamma =$  recovery rate by humans; and  $\mu =$  mortality rate of vector mosquitoes.

To add ecological interactions, such as diffuse mosquito vector competition and dead-end transmission of parasites, we based our model on the Ross–Macdonald model [54]. First, we transformed the transmission factor in the Ross–Macdonald model (i.e.,

 $\frac{b \, T_{hm} X_h \, Y_m}{N})$  in another in which malaria-parasite transmission

can be blocked by defensive hosts and non-vectors (i.e., diffuse mosquito vector competition) and non-hosts (i.e., dead-end transmission of parasites):

$$\frac{bT_{hm}X_hY_m}{(B+N)\left(1+\frac{1}{h}\frac{C+M}{B+N}\right)}\tag{5}$$

where M = abundance of An. cruzii females, h = biting tolerance exhibited by vertebrate animal and human hosts; B = abundance of wild warm-blooded animals; and C = abundance of non-vector mosquito females. Second, we considered that population dynamics of An. cruzii females was present:

$$\frac{\alpha bM}{1 + \frac{1}{h} \frac{C + M}{B + N}}\tag{6}$$

where the rationale is that a successful bite is needed in order to start a new mosquito generation in the larval habitat in which density-dependent mechanisms can occur. It includes the following factors: female adult recruitment in the larval habitat  $(\alpha)$  and female adult activity plus interactions with hosts and non-

(
$$\alpha$$
) and female adult activity plus interactions with hosts and non-vectors ( $\frac{b}{1+\frac{1}{h}\frac{C+M}{B+N}}$ ). The  $\alpha$  parameter is a measure of

recruitment of adult female emergence and it can be fitted with abundance data collected in the field. Predation and competition which are strong components of mosquito populations in the larval habitat are implicitly considered in this  $\alpha$  parameter. Abundance of An. cruzii adult females was assumed to be associated with life conditions and interactions in the larval habitat to estimate  $\alpha$ . This association means that high abundance of adult females is expected when optimum physical, chemical and biological conditions are present in the larval habitat, or vice-versa. Abundance data was obtained with automatic CDC-CO $_2$  traps which collect a sample of species (i.e., host-seeking females) in mosquito community. This automatic trap do not mimic host defensive behavior and diffuse competition which were thus made explicit in the population dynamics of An. cruzii females

 $(\frac{b}{1+\frac{1}{h}\frac{C+M}{B+N}})$ . Third, we estimated  $\alpha$  considering that the

abundance of An.  $cruz\ddot{n}$  is in equilibrium  $(X_m^*)$  and utilizing the following equation:

$$X_m^* = \left(\frac{\alpha b}{\mu} - 1\right) h(B+N) - C \tag{7}$$

where the underlying assumption is that competition affects both  $An.\ cruz\ddot{u}$  and non-vector mosquito species, leading to a situation in which vector and non-vector mosquito species can coexist and  $An.\ cruz\ddot{u}$  is therefore not excluded by competition.

Therefore, our final model for abundance of individuals in each compartment is as follows:

$$\frac{dX_h}{dt} = -\frac{bT_{hm}X_hY_m}{(B+N)\left(1+\frac{1}{h}\frac{C+M}{B+N}\right)} + \gamma Y_h \tag{8}$$

$$\frac{dY_h}{dt} = \frac{bT_{hm}X_hY_m}{(B+N)\left(1 + \frac{1}{h}\frac{C+M}{B+N}\right)} - \gamma Y_h \tag{9}$$

$$\frac{dX_m}{dt} = \frac{\alpha bM}{1 + \frac{1}{h} \frac{C + M}{B + N}} - \mu X_m - \frac{bT_{mh} X_m Y_h}{(B + N) \left(1 + \frac{1}{h} \frac{C + M}{B + N}\right)} \tag{10}$$

$$\frac{dY_m}{dt} = \frac{bT_{mh}X_mY_h}{(B+N)\left(1 + \frac{1}{h}\frac{C+M}{B+N}\right)} - \mu Y_m,\tag{11}$$

where  $M = X_m + Y_m$ .

The Ross–Macdonald model is a special case of our model if we consider that wild warm-blooded animals are either absent or do not interact with  $An.\ cruzii\ (B=0)$ ; non-vector mosquito species are absent or do not interact with  $An.\ cruzii\ (C=0)$ ; humans do not react to mosquito bites  $(h\to\infty)$ ; and  $An.\ cruzii\ abundance$  is constant  $(\alpha b=\mu)$ . Analyses performed using our model had parameter values as inputs in order to calculate the basic  $R_0$  as an output (Text S1, Text S2). The goal of the analyses was to examine the relationship between malaria transmission dynamics (synthesized by  $R_0$  estimate) and hypotheses regarding ecological interactions (formalized into a model structure).

Finally, an intermediate model, in which both *An. cruzii* and non-vector mosquito species have constant populations, was elaborated (Text S3).

### Results

On the basis of collected data and data from the literature, the models described in the Materials and Methods section were completely parameterized for the case study site (Text S1). Empirical values were unavailable only for the host tolerance (h) parameter, which was set to a range of permissible values and submitted to a sensitivity analysis (Text S1).

The indigenous settlement in the study area (a village occupied by members of the Guarani Mbya tribe) is inhabited by 150 natives in a  $2.8\text{-km}^2$  area, whereas 165 people (fishermen and their families) live in Marujá in a  $0.8\text{-km}^2$  area (N parameter; Figure S3). As can be seen in Table 1 and in the Figure S4, Figure S5 and Table S1, the estimated abundance of wild birds and mammals (B parameter) was 172 in The Guarani Mbya village and 47 in Marujá. The estimated abundance of mosquitoes in The Guarani Mbya village and Marujá, respectively, was 1,514 and 300 for the malaria vector An.  $cruz\ddot{u}$  ( $X_m^*$  parameter), compared with 14,101 and 3,640 for non-vectors (C parameter), which were supported by Figure S6, Figure S7 and Table S3.

Data in the literature, from laboratory and field experiments, show that the estimated maximum *An. cruzii* biting rate (*b* parameter) is 0.5 bites/day (Table 1). In the laboratory, we found the estimated gonotrophic cycle to be four days, and our field experiments indicated gonotrophic discordance in natural populations (Table 1). In our laboratory experiments, *An. cruzii* 

Table 1. Parameters, descriptions, estimates and references of the mathematical model of malaria transmission.

Parameter simbology	Description	Estimates	Reference
Human population size (N)	Total number of inhabitants in The Guarani Mbya village and Marujá	150 and 165, respectively	Text S1
Abundance of wild warm-blooded animals $(B)$	Estimates of abundance of avian and mammalian species in The Guarani Mbya village and Marujá	172 and 47, respectively	[45], Text S1
Abundance of non-vector mosquito species <sup>a</sup> (C)	Estimates of abundance of non-vector mosquito species in The Guarani Mbya village and Marujá	14,101 and 3,640, respectively	Text S1
Abundance of $Anopheles\ cruzit^b\ (X_m^*)$	Estimates of abundance of <i>An. cruzii</i> in The Guarani Mbya village and Marujá	1,514 and 300, respectively	Text S1
Anopheles cruzii biting rate (b)	Biting rate of each <i>An. cruzii</i> female upon a given host per day	0.50	[50], Text S1
Anopheles cruzii mortality rate (μ)	Mortality rate of An. cruzii female population per day	0.80	[50], Text S1
Anopheles cruzii convertion rate (2)	Convertion rate of a successful bite upon a host to the number of emerging females in The Guarani Mbya village and Marujá	5.5 and 3.1, respectively	Text S1
Probability of $Plasmodium$ transmission from $Anopheles\ cruzii\ $ to humans $(T_{hm})$	Probability of <i>Plasmodium</i> transmission from <i>An. cruzii</i> to humans in low-endemicity malaria transmission dynamics	0.022	[51,52]
Probability of <i>Plasmodium</i> transmission from humans to <i>Anopheles cruzii</i> $(T_{mh})$	Probability of <i>Plasmodium</i> transmission from humans to <i>Anopheles cruzii</i> in low-endemicity malaria transmission dynamics	0.24	[51,52]
Human recovery rate (γ)	Daily human recovery rate, which can be understood as the average duration of the infectious period	0.0035 (286 days)	[51,52] and Text S1
Host tolerance (h)	Number of bites per day before a host starts a defensive behavior divided by <i>An. cruzii</i> biting rate (0.5)	20, i.e., host defensive behavior occur after the $10^{th}$ bite in a given day	Text S1

<sup>&</sup>lt;sup>a</sup>: Aedes serratus, Limatus durhami, Runchomyia reversa and Wyeomyia quasilongirostris.

mortality ( $\mu$  parameter) was estimated to be 0.80/day (Table 1). Employing the previously mentioned data from the literature, we estimated the  $\alpha$  parameter, which indicates how many new adults will be generated from a single successful bite of *An. cruzii*, to be 5.5 in The Guarani Mbya village and 3.1 in Marujá (Table 1).

The estimated probabilities of *Plasmodium* species transmission and the human recovery rate correspond to the dynamics of transmission in a low-endemicity area (Table 1). Mosquitoes transmit malaria parasites to humans with a probability of 0.022 ( $T_{hm}$  parameter), humans infect mosquitoes with a probability of 0.24 ( $T_{mh}$  parameter), and the human recovery rate ( $\gamma$  parameter) is 0.0035/day, which means that average duration of the infectious period is 286 days (Table 1).

The h parameter was derived from two other values: the number of bites/day before a host starts a defensive action (assumed herein to be 10 bites/day), divided by the maximum biting rate (0.5 bites/ day for An. cruzii). Another way to interpret the h parameter is that host defensive behavior will be stronger when the average biting rate is greater than 10 bites/day (Table 1). On the basis of our field work experience in tropical forests (mainly the Atlantic Forest), we can state that neither humans nor animals can stand mosquito biting rates greater than approximately 10 bites/day before they begin to exhibit defensive behavior (e.g., shaking body parts or, in the case of humans, waving hands and swatting). Therefore, h was set at 20. Mosquito vector diffuse competition and dead-end parasite transmission patterns were assessed for h values within 20 and 30 (e.g., 21, 25, and 29) in the sensitivity analysis (Figure S8, Figure S9 and Figure S10). As a result, no qualitative changes could be made in the initial interpretations (see the following paragraphs).

The basic  $R_0$  (Text S2), as calculated by the Ross–Macdonald model is as follows:

$$R_0 = \frac{b}{N} \sqrt{\frac{T_{hm} T_{mh} N X_m^*}{\gamma \mu}}$$
 (12)

whereas the basic  $R_0$  predicted by our model is the following:

$$R_{0} = \frac{b}{(B+N)\left(1 + \frac{1}{h}\frac{C + X_{m}^{*}}{B+N}\right)} \sqrt{\frac{T_{hm}T_{mh}NX_{m}^{*}}{\gamma\mu}}$$

$$= \frac{\mu}{\alpha(B+N)} \sqrt{\frac{T_{hm}T_{mh}NX_{m}^{*}}{\gamma\mu}}$$
(13)

where no malaria cases are to be reported when  $R_0$  is < 1 and if it exceeds 1 ( $R_0 > 1$ ) then the disease can invade and there should be an epidemic episode.

If we employ the  $R_0$  estimate relative to the Ross–Macdonald model (eq. 12), The Guarani Mbya village would have an  $R_0$  of 2.18 and Marujá would have an  $R_0$  of 0.93. Using the model employed in the present study (eq. 13), we found the  $R_0$  to be 0.30 for The Guarani Mbya village and 0.39 for Marujá. If the abundances of non-vector mosquito and non-host vertebrate species were reduced by approximately 80% and 70%, respectively, the critical threshold level ( $R_0 = 1$ ) would be exceeded in The Guarani Mbya village (Figure 2). Similarly, a 50% reduction in the abundance of non-vector mosquito species could cause malaria invasion ( $R_0 > 1$ ) in Marujá (Figure 3). However, epidemics would not occur in Marujá even if there were local extinction of all non-host vertebrate species but would occur if the human population increased by approximately 50% (Figure 4).

b: Anopheles cruzii is the primary vector of malaria P. vivax and P. malariae parasites [13]. doi:10.1371/journal.pntd.0002139.t001

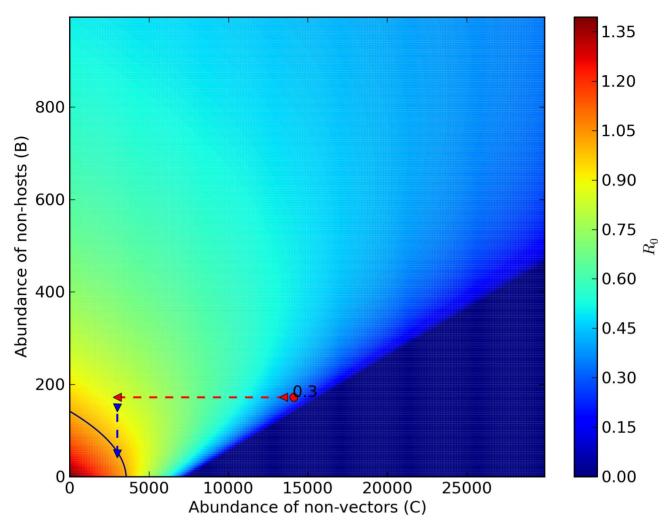


Figure 2. Predicting hypothetical scenarios I: dilution effect and diffuse mosquito vector competition in The Guarani Mbya village. Increase in abundance of non-vector mosquito species and in abundance of wild warm-blooded animals is correlated with decrease in the risk of malaria-parasite transmission. Reduction in abundance of wild warm-blooded animals (blue dashed arrow) and in abundance of non-vector mosquito species (red dashed arrow) can exceed the critical threshold level ( $R_0 = 1$ ). The red circle is  $R_0$  estimate of our model (0.3; eq. 13). The black isoline represents malaria transmission threshold ( $R_0 = 1$ ). Color legend shows a range of  $R_0$  values from 0.00 to 1.40. doi:10.1371/journal.pntd.0002139.g002

Additionally, new simulations utilizing the intermediate model (Text S3) supported the previous statements (Figure S11) and showed that the original results are robust.

### Discussion

Although scarce malaria cases are reported annually in the surrounding area [13,15,17], no malaria cases have been reported in the last 30 years, being assumed that *Plasmodium* transmission does not occur in Parque Estadual da Ilha do Cardoso. The estimated  $R_0$  provided by Ross–Macdonald model ( $R_0$ =2.18) suggests that malaria parasite transmission may be occurring in that region. Contrasting, based on the model proposed herein, estimated  $R_0$  for The Guarani Mbya village was 0.30, which is in accordance with assumption of no malarial transmission. This model simulations (i.e., predicting hypothetical scenarios) were performed in order to show what would happen with  $R_0$  estimate value if: 1) Non-vector populations increase (i.e., effect of diffuse mosquito vector competition), 2) Non-host populations increase (i.e., effect of dead-end transmission of parasites), and 3) Human

population increases (effect of over-encroachment of human populations). Simulation results provide support for biodiversity preventing the circulation of P. vivax in human settlements embedded in natural ecosystems. The absence of malaria cases can be explained by the diffuse mosquito vector competition and dead-end transmission of parasites provided by high abundances of mosquitoes and vertebrates. Greater abundances of mosquitoes and vertebrates can be correlated with higher levels of biodiversity, which increase ecosystem's functional redundancy, thus decreasing the chances of malaria occurrence, which is in keeping with the insurance hypothesis [55]. According to this hypothesis, an insurance effect is the ability of an ecosystem to buffer perturbations (e.g., P. vivax circulation), as well as the ability of the species in the community to respond differentially to perturbations (e.g., diffuse mosquito vector competition and dead-end transmission of parasites). Therefore, these mechanisms that hinder malaria parasite transmission are services provided by the forest ecosystems.

In view of the results of simulations conducted using the models applied in the present study (Figure 2,3), we suggest that increasing

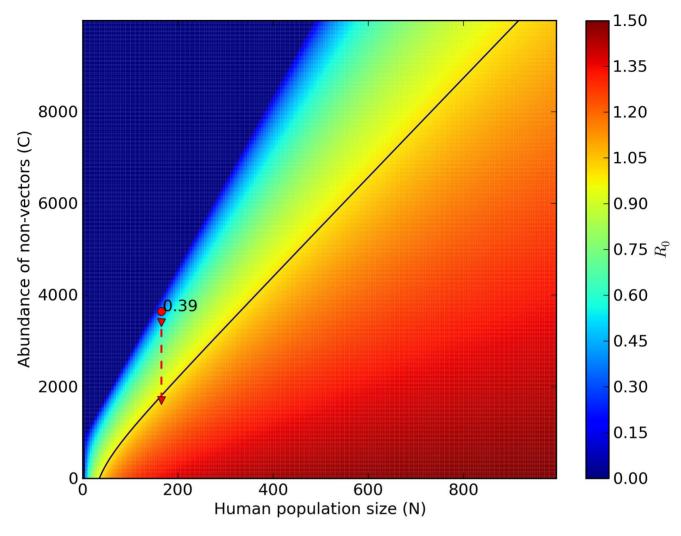


Figure 3. Predicting hypothetical scenarios II: diffuse mosquito vector competition in Marujá. Increase in abundance of non-vector mosquito species is linearly correlated with decrease in the risk of malaria-parasite transmission. Reduction in abundance of non-vector mosquito species (red dashed arrow) can exceed the critical threshold level ( $R_0 = 1$ ). The red circle is  $R_0$  estimate of our model (0.39; eq. 13). The black isoline represents malaria transmission threshold ( $R_0 = 1$ ). Color legend shows a range of  $R_0$  values from 0.00 to 1.50. doi:10.1371/journal.pntd.0002139.g003

non-vector mosquito abundance can reduce the number of An. cruzii bites, decreasing malaria parasite transmission in the Atlantic

Forest. A new law of mosquito-host relationship  $(\frac{\nu}{1 + \frac{1}{h}\frac{C+M}{B+N}})$  is

proposed here and it is supported by the following evidences: 1) there must be an intense selection pressure on hosts to exhibit defensive behavior against biting insects [56,57], and 2) contacts between mosquito species and specific hosts in a community may be influenced more by the presence/absence of hosts than by innate mosquito choices [58]. This law can be defined as a community of defensive hosts in which the access to their blood is a limiting resource, providing competition among opportunistic blood-feeder mosquito species. The total abundance of non-vector and not-infected vector mosquito species can have a negative impact on malaria parasite transmission because of apparent competition mediated by host defensive behavior. The effect of apparent competition is a functional response that may be associated with host tolerance to mosquito bites. When the host tolerance threshold is reached, mosquito bites are avoided by defensive responses from the host. The presence of non-vector and not-infected vector mosquitoes seems to propitiate a larger number of unsuccessful bites, with few *Plasmodium*-infective bites. The vector competition effect could also occur within species. For example, when there is more larval habitat available (during the wet season), hatch rates increase, making the proportion of nulliparous females larger than that of parous females. Host defensive behavior was observed for blacklegged ticks that are killed when feeding on the blood of opossums and squirrels [34]. Consequently, diffuse competition is a protective mechanism against infective bites and should therefore be considered a major factor in studies related to the dynamics of malaria transmission. In considering that *Plasmodium* species infection can affect the feeding behavior of anthropophilic mosquitoes [59], it would be important to understand how the mechanism of diffuse competition can be applied to malaria control strategies in endemic tropical regions.

The abundance of wild warm-blooded animals can decrease the transmission of *Plasmodium* species. Such animals can act as dead-end hosts, diminishing the chances of infective bites in humans, which can be used as an indirect method of malaria control. This might represent a dilution effect mechanism present in natural ecosystems that have a high abundance of

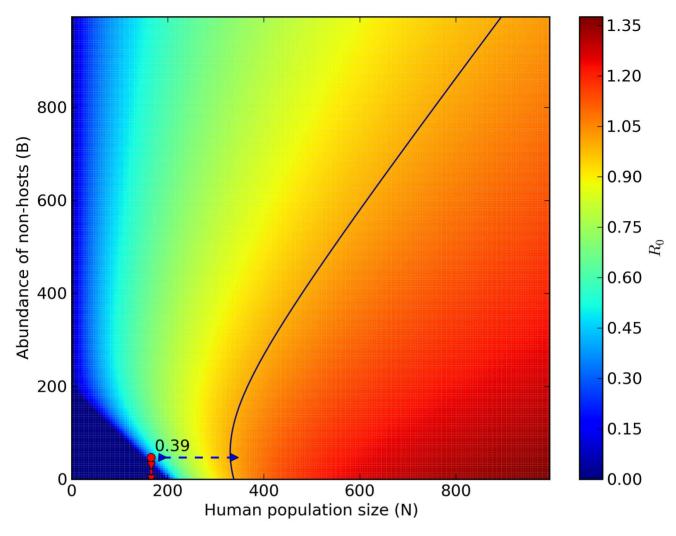


Figure 4. Predicting hypothetical scenarios III: dilution effect in Marujá. Increase in abundance of wild warm-blooded animals is non-linearly correlated with decrease in the risk of malaria-parasite transmission. Reduction in abundance of wild warm-blooded animals (red dashed arrow) does not exceed the critical threshold level ( $R_0 = 1$ ). However, increase in human population size (blue dashed arrow) can exceed the critical threshold level ( $R_0 = 1$ ). The red circle is  $R_0$  estimate of our model (0.39; eq. 13). The black isoline represents malaria transmission threshold ( $R_0 = 1$ ). Color legend shows a range of  $R_0$  values from 0.00 to 1.40. doi:10.1371/journal.pntd.0002139.g004

warm-blooded animal species. Dilution effect mechanisms [29] were observed by Swadle and Calos [32], Johnson et al. [31], and Suzán et al. [33] for West Nile fever, schistosomiasis, and hantavirus infections, respectively. However, a low- to mediumlevel abundance of dead-end hosts can create a neutral situation in which the dilution effect is either unimportant [60] or harmful [28]. Using a computer simulation, Allan Saul showed that the dilution effect (zooprophylaxis) can be harmful when a small number of dead-end hosts potentiate malaria parasite transmission by providing blood-feeding opportunities to vectors [28]. Our model predicts that few wild warm-blooded animals can serve as blood sources for mosquito species, increasing the vector population and Plasmodium species dissemination. This can be seen in the non-linear unimodal relationship between the abundance of non-hosts and the critical threshold level ( $R_0 = 1$ ), as depicted in Figure 4. This finding is supported by the work of Randolph and Dobson, who stated that the dilution effect applies only to species-rich host communities in which there is variable reservoir competence [61]. In addition, hunting activities that are allowed for traditional human communities in natural protected conservation units can reduce vertebrate abundance, whereas it increases the density of vegetation and the abundance of invertebrates, resulting in the so-called "empty forest" effect [62] and increasing the chances of malaria parasite transmission.

Having the present model as a starting point, two new avenues can be pursued for studying dynamics of malaria transmission in tropical forests. In respect of a hypothesis suggesting that non-human hosts may be reservoirs of malaria-parasites [15], the present model can be extended by means of new compartments along with theirs parameters representing the role of susceptible and infective primates. Moreover, the present model assumes that all host species have the same tolerance to mosquito bites. Considering that animals may have more tolerance to mosquito bites than humans, this assumption can be unlikely and thus dilution effect herein may predict a underestimated blocking-transmission impact because of (more) intolerant dead-end hosts. It is therefore important to evaluate how primates as *Plasmodium*-reservoirs and tolerance of warm-blooded animals to mosquito bites may affect, positive or negatively, dilution effect predictions in the dynamics of malaria transmission.

Plasmodium-infected An. cruzii were found within human domiciles during epidemics occurring in the municipalities of Blumenau, Brusque, Joinvile, and Florianópolis, all located within the Atlantic Forest region, in the 1940s and 1950s. One determinant of the malaria burden in those days was the rapid increase in the population of susceptible humans, which reached 800,000 in a short period of time [21]. Another determinant was that humans were immunologically naïve to Plasmodium species infection. Consequently, while clearing native forest for agriculture and cattle farming, they lived in the nearby jungle, which increased the contact between humans and infective mosquitoes. It is likely that more recent malaria epidemics in the Amazon Forest occurred because of ecological and social determinants similar to those present in the Machadinho settlement project in the state of Rondônia between 1984 and 1995. Castro et al. observed that the prevalence of malaria increased rapidly in the early stages of settlement and subsequently decayed, reaching a low level 11 years later, which represents the general pattern of frontier malaria in the Amazon [37]. One way of avoiding malaria epidemics in tropical regions (mainly in the Amazon) is clearing large areas of forest and rapidly establishing agriculture or farming in order to limit the exposure of new settlers to infective mosquito bites [37]. This is in consonance with the traditional approach of forest clearing used in the Atlantic Forest in the 1950s [21]. In contrast, the results of the approach taken in the present study suggest that biodiversity contributes to disease control and thus ecosystems in tropical forests can be managed to sustain an equilibrium between high levels of biodiversity and the overencroachment of human populations. Furthermore, diffuse mosquito vector competition can be considered a novel measure of vector control, especially because some Anopheles vector species seem not to be susceptible to indoor residual insecticide spraying and treated bed nets, which are currently the most successful strategies in Africa [8].

Contrary to what has long been believed, forest conservation and malaria control are not incompatible, and biodiversity issues should be included in the World Health Organization Malaria Eradication Research Agenda in order to achieve the desirable goals of biological conservation and maintenance of low malaria endemicity. Although releasing non-vector mosquitoes is not a practical alternative as vector control, conservation of the natural ecosystems may hinder transmission of malaria-parasites. The main application of the present model is to provide a formal framework in which biodiversity conservation and control of the human population size in protected areas are measures that can be taken to control transmission in any malarial endemic settings. The effect of mosquito vector diffuse competition means that policies of removal of native vegetation to eliminate malarial vectors, which were practiced in the past [21], have their shortcomings because they may also decrease non-vector community that buffers malarial transmission. For rural malaria, which includes Anopheles gambiae malarial dynamics in Africa, the mosquito vector diffuse competition is also a plausible underlying mechanism because it supports high transmission rates when native fauna is locally depleted by forest removal. Dead-end parasite transmission (dilution effect), by the framework herein proposed, was shown to be highly dependent on host tolerance. Consequently, there are two general predicted scenarios, i.e., 1) this mechanism may favour parasite decrease if the most tolerant host is a dead-end and 2) it may increase the vector population if tolerant hosts are present. It is noteworthy that these scenarios are not mutually exclusive. According to the subliminal message in Smith and colleagues' work [63], scientists of the present century should go beyond the Ross-Macdonald's Theory in order to have better insights on the ways that make possible the control of malarial transmission. In addition, the present model also makes qualitative predictions, and not just a correction in the value of  $R_0$ , that are very distinct from the Ross-Macdonald (R-M) model, e.g., the behavior of  $R_0$  when N (i.e., human population) increases: it decreases in the R-M model, but it increases in the dynamics of the present model because greater N implies higher vector-host contacts, leading to increase of parasite dissemination. The present model constitutes an essential step for understanding the dynamics of malaria transmission in tropical forest ecosystems that can provide the service of hindering malaria epidemics, allowing to reconcile malaria control with conservation of biodiversity.

### **Supporting Information**

Text S1 Collected data and data from the literature regarding estimates of input parameters utilized in the mathematical model of malaria transmission.

Text S2 Explicit derivation of the basic reproduction number  $R_0$ .

(PDF)

Text S3 Analysis of an alternative model. (PDF)

Figure S1 Plasmodium vivax's presence in the immediate surrounding region of Parque Estadual da Ilha do Cardoso. Curado and others [13] has found positivity of IgG antibodies against P. vivax in human samples from Iporanga municipality (prevalence ~50%). Castro Duarte and others [15] detected Plasmodium vivax infections in howler-monkeys (i.e., Alouatta guariba clamitans) from the Atlantic Forest (possibly Juquitiba municipality) (prevalence ~6%). Finally, D'Avila Couto and others [17] estimated that near 400 cases of malaria (being 97.2% attributable to P. vivax) were confirmed between 1980 and 2007 by official agencies of epidemiological surveillance (e.g., Superintendência de Controle de Endemias da Secretaria de Estado da Saúde de São Paulo and Sistema de Informação de Agravos de Notificação). (PDF)

Figure S2 Relationships between successes and attempts in mosquito biting events in a given day. The X axis is the total number of mosquitoes (An. cruzii) (M) and nonvectors species (C). The Y axis is the total number of biting successes per day  $(\frac{bM}{1+\frac{hC+M}{hB+N}})$ . Guarani, The Guarani Mbya village; and Marujá, Marujá. (PDF)

Figure S3 Human population and its geographical location. Clear-cut areas in the northern part of The Guarani Mbya village (G) represent logged forest that are utilized to agriculture. In slopes of the southern part of The Guarani Mbya village (G) vertebrate animals can be hunted. Fishermen build houses for their families in Marujá (M) which are also utilized as hostels for ecotourists. Source: Instituto Florestal do Estado de São Paulo [64].

Figure S4 Occurrence of mammals in the Parque Estadual da Ilha do Cardoso. Mammal species were either seen or heard. Footprints were also utilized to indicate their presence. Legend: filled black circle, *Alouatta guariba* (howler monkey); hollow circle, *Mazama americana* (deer); hollow circle with vertical line, *Nasua nasua* (coati); filled black square, *Pecari* 

tajacu (collared peccari); hollow square, Leopardus pardalis, L. wiedii e Herpailurus yaguarondi (small spotted cats); hollow square with vertical line, Sciurus ingrami (squirrel); filled black triangle, Cerdocyon thous (fox); hollow triangle, Eira barbara (tayra); hollow triangle with vertical line, Tayassu pecari (white-lipped pecary); cross, Dasyprocta leporina (agouti). Source: Bernardo [45]. (PDF)

Figure S5 Occurrence of birds in the Parque Estadual da Ilha do Cardoso. Bird species were either seen or heard. Legend: filled black circle, *Ramphastos dicolorus* and *R. vitellinus* (toucans); hollow circle, *Penelope obscura* and *P. superciliaris* (guans); filled black square, *Pipile jacutinga* (guan); hollow square, *Crypturellus obsoletus* (tinamou); filled black triangle, *Odontophorus capueira* (spotwinged wood quail); hollow triangle, *Tinamus solitarius* (tinamou). Source: Bernardo [45].

Figure S6 Vegetation and altitude at sampling sites of non-vector mosquito species (C) and Anopheles cruzii ( $X_m^*$ ): interpolations of ecologic niche axes. A: Vegetation biomass ( $\mathbf{m}^3$  of wood per  $\mathbf{m}^2$ ); B: Altitude (meters above the sea). Points represent field sampling locations that were utilized for performing interpolations (grid of 200 m-spatial resolution). Source: Bernardi et al. [46]. (PDF)

Figure S7 Abundance of non-vector mosquito species (C) and Anopheles cruzii  $(X_m^*)$ : spatial abundance distribution modelling. A: Abundance of An. cruzii (altitude  $\beta_1$  of 6.65 and vegetation biomass  $\beta_2$  of 2.13; R<sup>2</sup>-adjusted = 0.91); B: Abundance of An. serratus (vegetation biomass  $\beta_1$  of 2.13; R<sup>2</sup>-adjusted = 0.16); C: Abundance of Li. durhami (altitude  $\beta_1$  of 2.88 and vegetation biomass  $\beta_2$  of 1.00; R<sup>2</sup>-adjusted = 0.93); D: Abundance of Ru. reversa (altitude  $\beta_1$  of 6.4; R<sup>2</sup>-adjusted = 0.25); and E: Abundance of Wy. quasilongirostris (altitude  $\beta_1$  of 5.5; R<sup>2</sup>-adjusted = 0.34; grid of 200 m-spatial resolution). G, The Guarani Mbya village; and M, Marujá. (PDF)

Figure S8 Sensitivity analysis: if h=21 then  $R_0<1$ . A, B: Decrease in abundance of non-vector mosquito species can increase risk of malaria transmission  $(R_0>1)$  in The Guarani Mbya village and Marujá, respectively; C, D: Decrease in abundance of non-host vertebrate species does not increase risk of malaria transmission  $(R_0<1)$  in The Guarani Mbya village and Marujá, respectively. The parameter  $\alpha$  is 5.3 in The Guarani Mbya village and 3 in Marujá. (PDF)

Figure S9 Sensitivity analysis: if h=25 then  $R_0<1$ . A, B: Decrease in abundance of non-vector mosquito species can

### References

- Sinka ME, Bangs MJ, Manguin S, Chareonviriyaphap T, Patil AP, et al. (2011)
   The dominant Anopheles vectors of human malaria in the Asia-Pacific region:
   occurrence data, distribution maps and bionomic précis. Parasit Vectors
   4: 89.
- Sinka ME, Bangs MJ, Manguin S, Coetzee M, Mbogo CM, et al. (2010) The dominant Anopheles vectors of human malaria in Africa, Europe and the Middle East: occurrence data, distribution maps and bionomic précis. Parasit Vectors 3: 117.
- Sinka ME, Rubio-Palis Y, Manguin S, Patil AP, Temperley WH, et al. (2010)
   The dominant Anopheles vectors of human malaria in the Americas: occurrence data, distribution maps and bionomic précis. Parasit Vectors 3: 72.
- Ferguson HM, Dornhaus A, Beeche A, Borgemeister C, Gottlieb M, et al. (2010) Ecology: a prerequisite for malaria elimination and eradication. PLoS Med 7: e1000303.
- Carlton JM, Sina BJ, Adams JH (2011) Why is Plasmodium vivax a neglected tropical disease? PLoS Negl Trop Dis 5: e1160.

increase risk of malaria transmission  $(R_0 > 1)$  in The Guarani Mbya village and Marujá, respectively; C, D: Decrease in abundance of non-host vertebrate species does not increase risk of malaria transmission  $(R_0 < 1)$  in The Guarani Mbya village and Marujá, respectively. The parameter  $\alpha$  is 4.7 in The Guarani Mbya village and 2.8 in Marujá. (PDF)

Figure S10 Sensitivity analysis: if h=29 then  $R_0<1$ . A, B: Decrease in abundance of non-vector mosquito species can increase risk of malaria transmission  $(R_0>1)$  in The Guarani Mbya village and Marujá, respectively; C, D: Decrease in abundance of non-host vertebrate species does not increase risk of malaria transmission  $(R_0<1)$  in The Guarani Mbya village and Marujá, respectively. D: Increase in abundance of non-host vertebrate species can increase risk of malaria transmission  $(R_0>1)$  in Marujá, which is supported in the work by Saul [28]. The parameter  $\alpha$  is 4.3 in The Guarani Mbya village and 2.6 in Marujá. (PDF)

Figure S11 Basic reproduction number  $(R_0)$  as a function of the human population size (N), for the three models compared. The other parameter models are the same from Table 1 (main text) for the Marujá. (PDF)

Table S1 Animal and bird species, density and population size estimates in the Parque Estadual da Ilha do Cardoso.

(PDF)

Table S2 Mosquito species and vegetation types in the Parque Estadual da Ilha do Cardoso. (PDF)

Table S3 Mosquito abundance regression models, independent variables and Akaike Information Criteria values. (PDF)

### **Acknowledgments**

We are in debt to Dr. José Vicente Elias Bernardi for kindly providing raw data of vegetation biomass and altitude of Parque Estadual da Ilha do Cardoso, and to three anonymous reviewers for their comments and suggestions that greatly improved the first draft of this manuscript.

### **Author Contributions**

Conceived and designed the experiments: GZL PIKLdP RAK RMC MAMS. Performed the experiments: GZL. Analyzed the data: GZL RMC. Contributed reagents/materials/analysis tools: GZL MAMS. Wrote the paper: GZL PIKLdP RAK RMC MAMS.

- WHO (2011) World Malaria Report 2011. World Health Organ Tech Rep Ser 2011. Available: http://www.who.int/malaria/world\_malaria\_report\_2011/ en/. Accessed 19 March 2012.
- Murray CJL, Rosenfeld LC, Lim SS, Andrews KG, Foreman KJ, et al. (2012) Global malaria mortality between 1980 and 2010: a systematic analysis. Lancet 379: 413–431.
- 8. Alonso PL, Brown G, Arevalo-Herrera M, Binka F, Chitnis C, et al. (2011) A research agenda to underpin malaria eradication. PLoS Med 8: e1000406.
- The malERA Consultative Group on Vector Control (2011) A research agenda for malaria eradication: Vector Control. PLoS Med 8: e1000401.
- Galindo-Leal C, Gusmão IC (2003) The Atlantic Forest of South America: biodiversity status, threats, and outlook. Washington, DC: Island Press. 488 p.
- Forattini OP, Gomes AC, Natal D, Santos JLF (1986) Observações sobre atividade de mosquitos Culicidae em mata primitiva da encosta no Vale do Ribeira, São Paulo, Brasil. Rev Saúde Pública 20: 1–20.

- Galetti M, Giacomini HC, Bueno RS, Bernardo CSS, Marques RM, et al. (2009) Priority areas for the conservation of Atlantic forest large mammals. Biol Conserv 142: 1229–1241.
- Curado I, Malafronte RS, Duarte AMRC, Kirchgatter K, Branquinho MS, et al. (2006) Malaria epidemiology in low-endemicity areas of the Atlantic Forest in the Vale do Ribeira, São Paulo, Brazil. Acta Trop 100: 54–62.
- Marrelli MT, Malafronte RS, Sallum MAM, Natal D (2007) Kerteszia subgenus of Anopheles associated with the Brazilian Atlantic rainforest: current knowledge and future challenges. Malaria J 6: 127.
- Duarte AMRC, Malafronte RS, Cerutti Jr C, Curado I, Paiva BR, et al. (2008) Natural Plasmodium infections in Brazilian wild monkeys: Reservoirs for human infections? Acta Trop 107: 179–185.
- Oliveira-Ferreira J, Lacerda MVG, Brasil P, Ladislau JLB, Tauil PL, et al. (2010) Review Malaria in Brazil: an overview. Malaria J 9: 115.
- Couto RDA, Latorre MRD, Di Santi SM, Natal D (2010) Autochthonous malaria notified in the State of São Paulo: clinical and epidemiological characteristics from 1980 to 2007. Rev Soc Bras Med Trop 43: 52–58.
- Zavortink TJ (1973) Mosquito studies (Diptera, Culicidae) XXIX. A review of the subgenus Kerteszia of Anopheles. Contrib Am Entomol Inst 9: 1–54.
- Downs WG, Pittendrigh CS (1946) Bromeliad malaria in Trinidad, British West Indies. Am J Trop Med Hyg 26: 47–66.
- 20. Lutz A (1903) Waldmosquitos und waldmalaria. Centralbl Bakt 33: 282–292.
- 21. Smith LB (1953) Bromeliad Malaria. Rep Smithson Inst 1952: 385–398.
- Reitz R (1983) Bromeliáceas e a malária-bromélia endêmica. Itajaí: Herbário Barbosa Rodrigues. 808 p.
- Cerutti C, Boulos M, Coutinho AF, Hatab MCLD, Falqueto A, et al. (2007) Epidemiologic aspects of the malaria transmission cycle in an area of very low incidence in Brazil. Malaria J 6: 33.
- CVE (2006) Casos confirmados de malária autóctones. Centro de Vigilância Epidemiológica 2011. Available: http://www.cve.saude.sp.gov.br/htm/zoo/malaria0309\_cautoctone.htm. Accessed 18 Oct 2011.
- Shannon RC (1931) The environment and behavior of some Brazilian mosquitoes. Proc Ent Soc Wash 33: 1–26.
- Edman JD, Kale HW (1971) Host behavior: its inuence on the feeding success of mosquitoes. Ann Entomol Soc Am 64: 513–516.
- Pianka EP (1974) Niche overlap and diffuse competition. Proc Natl Acad Sci U S A 71: 2141–2145.
- 28. Saul A (2003) Zooprophylaxis or zoopotentiation: the outcome of introducing mortality while searching. Malaria J 2: 32.
- Ostfeld RS, Keesing F (2000) Biodiversity series: the function of biodiversity in the ecology of vector-borne zoonotic diseases. Can J Zool 78: 2061–2078.
- Keesing F, Belden LK, Daszak P, Dobson A, Harvell CD, et al. (2010) Impacts
  of biodiversity on the emergence and transmission of infectious diseases. Nature
  468: 647–652
- Johnson PTJ, Lund PJ, Hartson RB, Yoshino TP (2009) Community diversity reduces Schistosoma mansoni transmission, host pathology and human infection risk. Proc R Soc Lond B Biol Sci 276: 1657.
- Swaddle JP, Calos SE (2008) Increased avian diversity is associated with lower incidence of human West Nile infection: observation of the dilution effect. PLoS One 3: e2488.
- Suzán G, Marcé E, Giermakowski JT, Mills JN, Ceballos G, et al. (2009) Experimental evidence for reduced rodent diversity causing increased hantavirus prevalence. PLoS One 4: e5461.
- Keesing F, Brunner J, Duerr S, Killilea M, LoGiudice K, et al. (2009) Hosts as ecological traps for the vector of lyme disease. Proc R Soc Lond B Biol Sci 276: 2011
- Raymundo LJ, Halford AR, Maypa AP, Kerr AM (2009) Functionally diverse reef-fish communities ameliorate coral disease. Proc Natl Acad Sci U S A 106: 17067.
- Sawyer DR, Sawyer DO (1992) The malaria transition and the role of social science research. In: Cheng LC, editor. Advancing the Health in Developing Countries: The Role of Social Research. Westport: Auburn House. pp. 105–122.
- Castro MC, Monte-Mór RL, Sawyer DO, Singer BH (2006) Malaria risk on the amazon frontier. Proc Natl Acad Sci U S A 103: 2452–2457.
- 38. Wilson EO (1988) Biodiversity. Washington: National Academy Press. 657 p.

- Metzger JP, Lewinsohn TM, Joly CA, Verdade LM, Martinelli LA, et al. (2010) Brazilian law: full speed in reverse? Science 329: 276–277.
- Conn JE, Wilkerson RC, Segura MNO, de Souza RTL, Schlichting CD, et al. (2002) Emergence of a new neotropical malaria vector facilitated by human migration and changes in land use. Am J Trop Med Hyg 66: 18–22.
- Laporta GZ, Ramos DG, Ribeiro MC, Sallum MAM (2011) Habitat suitability
  of Anopheles vector species and association with human malaria in the Atlantic
  Forest in south-eastern Brazil. Mem Inst Oswaldo Cruz 106: 239–245.
- Suguiu K, Petri S (1973) Stratigraphy of the Iguape-Cananéia lagoonal region sedimentary deposits, São Paulo State, Brazil. Bol Inst Geo 4: 1–20.
- Tabarelli M, Pinto LP, Silva JMC, Hirota M, Bed L (2005) Challenges and opportunities for biodiversity conservation in the Brazilian Atlantic Forest. Conserv Biol 19: 695–700.
- Ingberman I, Fusco-Costa R, Cheida CC, Nakano-Oliveira EC, Rodrigues RG, et al. (2010) Was there ever a Muriqui (Brachyteles) population in the Ilha do Cardoso State Park in southeastern Brazil? Neotrop Primates 17: 21–24.
- Bernardo CSS (2004) Abundância, densidade e tamanho populacional de aves e mamíferos cinegéticos no Parque Estadual Ilha do Cardoso, SP, Brasil [Master's thesis]. Piracicaba (Brazil): Universidade de São Paulo. 156 p.
- Bernardi JVE, Landim PMB, Barreto CL, Monteiro RC (2005) Spatial study of the vegetation gradient from Cardoso Island State Park, SP, Brazil. Holos Environ 5: 1–21.
- Almeida AP (1946) Memória histórica da Ilha do Cardoso. Rev Arq Municipal 111: 19–52
- 48. Conselho Estadual do Meio Ambiente (2001) Plano de manejo do Parque Estadual da Ilha do Cardoso. São Paulo: Secretaria do Meio Ambiente. 60 p.
- Galetti M (2001) Indians within conservation units: lessons from the Atlantic Forest, Conserv Biol 15: 798–799.
- Santos RLC (2001) Medida da capacidade vetorial de Anopheles albitarsis e de Anopheles (Kerteszia) no Vale do Ribeira, São Paulo[Ph.D. thesis]. São Paulo (Brazil): Universidade de São Paulo. 81 p.
- Chitnis N, Hyman JM, Cushing JM (2008) Determining important parameters in the spread of malaria through the sensitivity analysis of a mathematical model. Bull Math Biol 70: 1272–1296.
- Nedelman J (1984) Inoculation and recovery rates in the malaria model of Dietz, Molineaux, and Thomas. Math Biosci 69: 209–233.
- Anderson RM, May RM (1991) Infectious diseases of humans: dynamics and control. New York: Wiley Online Library. 757 p.
- Keeling MJ, Rohani P (2008) Modeling infectious diseases in humans and animals. Princeton: Princeton University Press. 408 p.
- 55. McCann KS (2000) The diversity-stability debate. Nature 405: 228-233.
- Kelly DW (2001) Why are some people bitten more than others? Trends Parasitol 17: 578–581.
- Edman JD, Webber LA, Schmid AA (1974) Effect of host defenses on the feeding pattern of *Culex nigripalpus* when offered a choice of blood sources. J Parasitol 60: 874–883.
- 58. Chaves LF, Harrington LC, Keogh CL, Nguyen AM, Kitron UD (2010) Blood feeding patterns of mosquitoes: random or structured? Front Zool 7.
- Cohuet A, Harris C, Robert V, Fontenille D (2010) Evolutionary forces on Anopheles: what makes a malaria vector? Trends Parasitol 26: 130–136.
- 60. Begon M (2008) Effects of host diversity on disease dynamics. In: Ostfeld RS, Keesing F, Eviner VT, editors. Infectious disease ecology: The effects of ecosystems on disease and of disease on ecosystems. Princeton: Princeton University Press. pp. 12–29.
- Randolph SE, Dobson ADM (2012) Pangloss revisited: a critique of the dilution effect and the biodiversity-buffers-disease paradigm. Parasitology 1: 1–17.
- Terborgh J (2000) The fate of tropical forests: a matter of stewardship. Conserv Biol 14: 1358–1361.
- Smith DL, Battle KE, Hay SI, Barker CM, Scott TW, et al. (2012) Ross, Macdonald, and a theory for the dynamics and control of mosquito-transmitted pathogens. PLoS Pathog 8: e1002588.
- 64. Înstituto Florestal do Estado de São Paulo (1998) Plano de gestão ambiental do Parque Estadual da Ilha do Cardoso. São Paulo: Secretaria do Meio Ambiente. 47 p.

# 1 Introduction

Here, we better describe Materials and Methods section regarding estimates of input parameters which were utilized in the mathematical model of malaria transmission.

# 1.1 Human population size (N)

The management plan of Parque Estadual da Ilha do Cardoso [1] was utilized to estimate population size in The Guarani Mbya village and Marujá. Using Aerophotogrametric images (Figure S3), it was possible to identify the geographical localities where inhabitants logged to build houses or to cultivate crops. The Guarani Mbya village is in the northwest, where approximately 150 people live today [2]. They can log natural vegetation on lowlands for small-scale agriculture and to hunt animals in slopes of the primary tropical forest (Figure S3). Marujá is located on the margins of the southern coastal plain (Figure S3), where 165 inhabitants subsist by fishing and exploring tourism [1].

# 1.2 Abundance of wild warm-blooded animals (B)

Christine São Bernardo and her advisor Dr. Galetti estimated the density of birds and mammals in Parque Estadual da Ilha do Cardoso (Table S1 [2]). Animal observations were performed in up to 273 km of transects in 13 trails throughout the region (Figure S4, Figure S5 [2]). Bird and mammal species density [2] was multiplied by the area of The Guarani Mbya village (2.8 km²; Figure S3) and Marujá (0.8 km²; Figure S3). As a result, estimates of abundance of bird and mammal species were 172 and 47, respectively (Table S1).

# 1.3 Abundance of non-vector mosquito species (C) and Anopheles cruzii $(X_m^*)$

Mosquito species that have overlapping period of biting activity were collected employing CDC-CO<sub>2</sub> traps [3] from 600 am to 1800 pm in altitudinal and vegetational succession gradients. Species identifications were based on the morphological identification keys [4–8]. As a result, a total of 3,299 mosquitoes belonging to 41 species were collected. *Plasmodium* vector *Anopheles cruzii* and non-vectors *Ae. serratus*, *Li. durhami*, *Ru. reversa*, and *Wy. quasilongirostris* were found in restinga and forest (Table S2), where females may compete for blood sources, such as agoutis in the former, and howler monkeys and squirrels in the latter. It was assumed that mosquito blood-feeding relied primarily on host availability [9].

Variations along the altitudinal and vegetational succession gradients were assumed to provide specific resting places after blood-feeding to the egg maturation, which could influence both An. cruzii and non-vector species abundances. Altitude and vegetation biomass data were obtained in locations thoroughly sampled [10] and then a generalized linear Gaussian geostatistical model with Bayesian inference was run to interpolate the altitude and vegetation biomass in the statistical environment R 2.13 with geoR package [11]. Results are shown in Figure S6A, in which light green represents scrubs on plains and hilltops, whereas dark green means tropical pluvial forest. In Figure S6B, lowlands were represented as light brown (<50 m) and hillsides as dark brown (from 50 to 350 m), whereas hilltops were underrepresented.

Abundance of  $An.\ cruzii$  and non-vectors species was, firstly, regressed against values of altitude and vegetation biomass interpolations and, secondly, extrapolated to Parque Estadual da Ilha do Cardoso (Figure S7A-E), based on the best fitted and parsimonious regression model [12,13] (Table S3). Zonal statistic in the Spatial Analyst extension of ArcMap (www.esri.com) was utilized to estimate abundances of  $An.\ cruzii\ (X_m^*)$  as 300 and non-vectors (C) as 3,640 in Marujá and 1,514 ( $An.\ cruzii\ X_m^*$ ) and 14,101 (non-vectors, C) in The Guarani Mbya village.

# 1.4 Anopheles cruzii biting rate (b) and mortality rate ( $\mu$ )

Roseli La Corte dos Santos and her advisor Dr. Forattini estimated the vectorial capacity of mosquitoes of subgenera *Kerteszia* of *Anopheles* in Atlantic Forest, southeastern Brazil [14].

Roseli considered the gonotrophic cycle estimate as approximately 4 days under laboratory conditions [14]. In this laboratory experiment  $An.\ cruzii$  female cohorts were accompanied from blood-feeding until oviposition giving an estimate of the length of a physiological gonotrophic cycle. Another couple of scientists also performed a similar experiment with  $An.\ cruzii$  female cohorts and estimated duration of gonotrophic cycle as 4.01 days [15], which means that the gonotrophic cycle estimate as 4 days is reasonable and also concensus in the literature. Following, some authors consider that  $An.\ cruzii$  has gonotrophic discordance [14,16], and then it was assumed that females could bite two times in average per cycle duration (4 days), which thus led to an estimate of biting rate of 0.5 bites/day (i.e.,  $\frac{\text{number of bites per cycle}}{\text{gonotrophic cycle duration in days}} = \frac{2}{4} = 0.5\ \text{bite/female/day}$ .
Roseli considered the daily survival estimate as 0.45 employing mark-release-recapture experiments

Roseli considered the daily survival estimate as 0.45 employing mark-release-recapture experiments [14]. This value was obtained from a regression analysis (Milby and Reisen [17]) of marked-and-recaptured females in function of days after the day of release of females (y = -0.7958x + 5.3103;  $R_{\text{multiple}}^2 = 0.7612$ ;  $\exp(-0.7958) = 0.4512201 = \text{daily survival}$ ). It was considered that An. cruzii mortality rate was independent of density, what amounts to say that the mortality rate ( $\mu$ ) is related to the daily survival ( $s_{day}$ ) by  $\mu = -\log(s_{day})$ , providing the value of  $\mu = -\log(0.45) = 0.8/\text{day}$ . Moreover, we calculated that, with a vector mortality rate as 0.8 per day, 0.17% of the female population will remain alive until the 8<sup>th</sup> day (when Plasmodium vivax extrinsic period is complete [18]), being 24 females in the Guarani Mbya tribe and 6 in Marujá. It is well-known that only few females of the population can survive long enough to become infective and thus our model estimate has connection with the real nature of this parameter.

# 1.5 Anopheles cruzii conversion rate $(\alpha)$

Anopheles cruzii was present, so it must be true that emergence of  $An.\ cruzii$  adults in average surpasses its mortality rate (i.e.,  $\alpha b > \mu$ ), and at the same time abundance of non-vector mosquito species are not high enough to competitively exclude  $An.\ cruzii$  (i.e.,  $C < \left(\frac{\alpha b}{\mu} - 1\right) h(B+N)$ ). Equilibrium population between  $An.\ cruzii$  and non-vector mosquito species was derived from the model equations, and is given by:

$$X_m^* = \left(\frac{\alpha b}{\mu} - 1\right) h(B+N) - C. \tag{1}$$

Note that when  $\frac{\alpha b}{\mu} \approx 1$  An. cruzii is not present because of the lack of environmental conditions that offer niche to the species. For example, dune pioneering vegetation ecosystem represents a situation in where An. cruzii niche requirement is absent because of the lack of bromeliads in where its larvae develop. In this situation,  $\alpha$  is, probably, under 1 and  $\frac{\alpha b}{\mu}$  may be < 1. However, in our study the Guarani Mbya tribe is in a forest and Marujá is in a "restinga" vegetation, in where An. cruzii is present (Table S2).

It was considered that the estimated populations of mosquitoes (see Section 1.3) are in fact equilibrium ones, and we used those values to find out the conversion rate  $\alpha$  in the wild. Using input parameters discussed in the previous subsections in the formula above, we have:

$$1,514 = \left(\frac{\alpha \, 0.5}{0.8} - 1\right) 20(172 + 150) - 14,101 \Rightarrow \alpha = 5.5$$

for The Guarani Mbya village and

$$300 = \left(\frac{\alpha \, 0.5}{0.8} - 1\right) 20(47 + 165) - 3,640 \Rightarrow \alpha = 3.1$$

in Marujá.

The parameter  $\alpha$  was higher (5.5) in The Guarani Mbya village than in Marujá (3.1) because the former place is in a forest and the latter is in a "restinga" vegetation. Veloso and others [19] performed an intensive ecological study of larval habitats of An.~cruzii in Atlantic Forest and observed that this species is more associated with forest environment than with "restinga" vegetation. The  $\alpha$  parameter estimate represents environmental conditions (mainly associated with larval habitats), and not simply a physiological characteristic.

# 1.6 Host tolerance (h)

Success to feed upon a host was assumed to be determined by the lack of host defensive responses to biting mosquitoes, which is supported by the works of Kelly [20] and Edman and others [21]. In the present work, host tolerance (h) is a phenomenological parameter, providing a functional response of hosts to mosquito density. This functional response represents here the simplest model for a phenomenon that increases linearly when mosquito density is low but reaches a saturation point when mosquito density is high (Figure S2). In addition, h is an adimensional parameter representing simply the number of bites. To estimate host tolerance, however, we need the number of bites received before starting a defensive behavior. Tolerance (i.e., number of bites per day without a host defensive behavior) is herein named as  $\theta$  which equals 10 (bites / day), a common sense number representing how many times a given host (e.g., humans in a forest) is not bothered about being bitten during mosquito haematophagic activity:

$$Y_h^{BITES} = \frac{BITES * Y_h}{(B+N)} \tag{2}$$

where  $Y_h^{BITES}$  is the number of bites upon infected humans, B+N is the total number of hosts, and BITES is the total number of bites which is in function of

$$BITES = bX_m SUCCESS (3)$$

where b is the biting rate,  $X_m$  is the number of Anopheles cruzii and SUCCESS is the success factor of mosquito versus host, i.e., being mathematically

$$SUCCESS = \left[1 + \frac{bC + bM}{\theta B + \theta N}\right]^{-1} = \left[1 + \frac{1}{h}\frac{C + M}{B + N}\right]^{-1} \tag{4}$$

where  $h = \frac{\theta}{b}$ , (bC + bM) is the total number of attempts of biting mosquitoes upon hosts per a given time, and  $(\theta B + \theta N)$  is the total number of bites in which hosts can repel 50% of attempts of biting mosquitoes per a given time. It is important to note that the success factor (i.e., SUCCESS) must have the following properties:

- goes to 1 when M=C=0 or when  $N+B\to +\infty$
- $\bullet$  strictly, decreases with M and C and increases with N and B
- goes to 0 when  $M \to +\infty$  or  $N, B \to 0$  (because nobody can take infinite bites)

Host tolerance (h) may be interpreted as an order-of-magnitude estimate, being related to real parameters (i.e., possible to be estimated in laboratory or field experiments) such as tolerance  $(\theta)$  and biting rate (b). Moreover, it is clear that we made two simplifications: 1) tolerances were assumed to be equal for both hosts, i.e., B and N, and 2) biting rates rates were assumed to be equal for all mosquitoes, i.e., C and M. Although these assumptions may be strong, they permitted us to consider An. cruzii's b and humans'  $\theta$  estimates as proxies for other species.

As the number of bites in a day without a host defensive behavior was estimated as 10 and An cruzii biting rate (0.5), then h parameter equals 20 (i.e.,  $h = \frac{10}{0.5} = 20$ ). Total biting success per day is a Power-based function and, therefore, it decays up to its asymptote (Figure S2).

Since this value (h=20) is harder to establish with precision, we performed a sensitivity analysis of malaria model to host tolerance (h), in which h was varied keeping  $M=X_m^*$  constant and thus  $\alpha$  was adjusted, being possible to estimate a new  $R_0$  value. For values of h smaller than 18, the  $R_0$  was < 0 in both human settlements, so this is the minimum of the considered interval. The maximum value was chosen to be 30, which corresponds to a human tolerance far greater than observed. Thus mosquito vector diffuse competition and dead-end parasite transmission patterns were assessed for h values within 20 and 30 (e.g., 21, 25, and 29). As a result, no qualitative changes in the first interpretations (see the main text) could be made (Figure S8A-D, Figure S9A-D, and Figure S10A-D).

### References

- 1. Instituto Florestal do Estado de São Paulo (1998) Plano de gestão ambiental do Parque Estadual da Ilha do Cardoso. São Paulo: Secretaria do Meio Ambiente. 47 p.
- Bernardo CSS (2004) Abundância, densidade e tamanho populacional de aves e mamíferos cinegéticos no Parque Estadual Ilha do Cardoso, SP, Brasil. Piracicaba: Universidade de São Paulo [Master's thesis]. 156 p.
- Laporta GZ, Sallum MAM (2011) Effect of CO<sub>2</sub> and 1-octen-3-ol attractants for estimating species richness and the abundance of diurnal mosquitoes in the southeastern Atlantic forest, Brazil. Mem Inst Oswaldo Cruz 106: 279-284.
- 4. Lane J (1953) Neotropical Culicidae. São Paulo: EDUSP. 1112 p.
- 5. Correa RR, Ramalho GR (1956) Revisão de *Phoniomyia* Theobald, 1903 (Diptera, Culicidae, Sabethini). Folia Clin Biol 25: 1-176.
- 6. Harbach RE (1994) The subgenus Sabethinus of Sabethes (Diptera: Culicidae). Syst Entomol 19: 207-234.
- 7. Forattini OP (2002) Culicidologia médica. São Paulo: EDUSP. 860 p.
- 8. Sallum MAM, Santos CLS, Wilkerson RC (2009) Studies on *Anopheles (Kerteszia) homunculus* Komp (Diptera: Culicidae). Zootaxa 2299: 1-18.
- 9. Chaves LF, Harrington LC, Keogh CL, Nguyen AM, Kitron UD (2010) Blood feeding patterns of mosquitoes: random or structured? Front Zool 7.
- 10. Bernardi JVE, Landim PMB, Barreto CL, Monteiro RC (2005) Spatial study of the vegetation gradient from Cardoso Island State Park, SP, Brazil. Holos Environ 5: 1-21.
- 11. Diggle PJ, Ribeiro Jr PJ (2007) Model-based geostatistics. New York: Springer. 228 p.
- 12. Pinheiro J, Bates D, DebRoy S, Sarkar D (2011) nlme: Linear and Nonlinear Mixed Effects Models. Vienna: R Development Core Team, R package version 3.1-101.
- 13. Wood SN (2011) Fast stable restricted maximum likelihood and marginal likelihood estimation of semiparametric generalized linear models. J R Stat Soc Series B Stat Methodol 73: 3-36.

- 14. Santos RLC (2001) Medida da capacidade vetorial de *Anopheles albitarsis* e de *Anopheles* (*Kerteszia*) no Vale do Ribeira, São Paulo. São Paulo: Universidade de São Paulo [Ph.D. thesis]. 81 p.
- 15. Chahad-Ehlers S, Lozovei AL, Marques MD (2007) Reproductive and post-embryonic daily rhythm patterns of the malaria vector *Anopheles* (*Kerteszia*) cruzii: aspects of the life cycle. Chronobiol Int 24: 289–304.
- 16. Forattini OP, Kakitani I, Massad E, Marucci D (1996) Studies on mosquitoes (Diptera: Culicidae) and anthropic environment: 11-Biting activity and blood-seeking parity of *Anopheles* (*Kerteszia*) in South-Eastern Brazil. Rev Saúde Pública 30: 107–114.
- 17. Milby MM, Reisen WK (1989) Estimation of vectorial capacity: vector survivorship. Bull Soc Vector Ecol 14: 47–54.
- Russell RC (1987) Seasonal abundance, longevity and population age composition of potential malaria vectors in northern and southern australia. Aust J Zool 35: 289–306.
- 19. Veloso HP, Moura JV, Klein RM (1956) Delimitação ecológica dos anofelíneos do subgênero Kerteszia na região costeira do sul do Brasil. Mem Inst Oswaldo Cruz 54: 517–534.
- 20. Kelly DW (2001) Why are some people bitten more than others? Trends Parasitol 17: 578–581.
- 21. Edman JD, Webber LA, Schmid AA (1974) Effect of host defenses on the feeding pattern of *Culex nigripalpus* when offered a choice of blood sources. J Parasitol 60: 874–883.

# 1 $R_0$ calculation

Below, we present a derivation of the expression for  $R_0$  of the main model, following the method presented in [1]. The procedure for the Ross-MacDonald model is completely analogous.

We denote by  $X_m^*$  the population of vector mosquitoes in the absence of infection, as in the main text, and write down the matrices F and V, used to build the next generation matrix K:

$$F = \begin{pmatrix} 0 & \frac{bT_{hM}N}{(B+N)\left(1+\frac{1}{h}\frac{C+X_m^*}{B+N}\right)} \\ \frac{bT_{Mh}X_m^*}{(B+N)\left(1+\frac{1}{h}\frac{C+X_m^*}{B+N}\right)} & 0 \end{pmatrix}$$

$$V = \begin{pmatrix} \gamma & 0 \\ 0 & \mu \end{pmatrix}$$

$$K = FV^{-1} = \begin{pmatrix} 0 & \frac{1}{\mu}\frac{bT_{hM}N}{(B+N)\left(1+\frac{1}{h}\frac{C+X_m^*}{B+N}\right)} \\ \frac{1}{\gamma}\frac{bT_{Mh}X_m^*}{(B+N)\left(1+\frac{1}{h}\frac{C+X_m^*}{B+N}\right)} & 0 \end{pmatrix}$$

The value of  $R_0$  will be given by the largest non-negative eigenvalue of the next generation matrix, which in this case is the same as the *spectral radius*  $\rho$  of the matrix K, as follow:

$$R_{0} = \rho(K) = \frac{b}{(B+N)\left(1 + \frac{1}{h}\frac{C + X_{m}^{*}}{B+N}\right)} \sqrt{\frac{T_{hM}T_{Mh}NX_{m}^{*}}{\gamma\mu}}$$

$$= \frac{\mu}{\alpha(B+N)} \sqrt{\frac{T_{hM}T_{Mh}NX_{m}^{*}}{\gamma\mu}}$$

$$= \frac{\mu}{\alpha(B+N)} \sqrt{\frac{T_{hM}T_{Mh}N\left[\left(\frac{\alpha b}{\mu} - 1\right)h(B+N) - C\right]}{\gamma\mu}}$$

# References

1. van den Driessche P, Watmough J (2008) Further Notes on the Basic Reproduction Number. In: Brauer F, van den Driessche P, Wu J, Allen LJS, editors. Mathematical epidemiology. Heidelberg: Springer-Verlag. pp. 159–178.

# 1 Alternative model

In this section we briefly analyze a variant model from that of the main text, to make clearer what are the consequences of specific ecological hypotheses assumed.

The model described by equations (8-11, main text) differs from the Ross-MacDonald one by introducing two effects: a saturating biting rate, caused by the diffuse competition among mosquitoes for feeding bites; and a limitation of the vector mosquito population by number of bites, while other competing mosquito species are regulated by factors not included in the model. The diffuse competition effect is essential to our model, as it is thought to cause decrease in number of bites and thus malaria risk.

In order to separate these effects, we are going to relax the second one and assume instead a constant vector mosquito population. This variant model is given by the system of equations:

$$\frac{dX_h}{dt} = -\frac{bT_{hm}X_hY_m}{(B+N)\left(1 + \frac{1}{h}\frac{C+M}{B+N}\right)} + \gamma Y_h \tag{1}$$

$$\frac{dY_h}{dt} = \frac{bT_{hm}X_hY_m}{(B+N)\left(1+\frac{1}{h}\frac{C+M}{B+N}\right)} - \gamma Y_h \tag{2}$$

$$\frac{dX_m}{dt} = \mu Y_m - \frac{bT_{mh}X_mY_h}{(B+N)\left(1 + \frac{1}{h}\frac{C+M}{B+N}\right)}$$
(3)

$$\frac{dY_m}{dt} = \frac{bT_{mh}X_mY_h}{(B+N)\left(1+\frac{1}{h}\frac{C+M}{B+N}\right)} - \mu Y_m , \qquad (4)$$

where  $M = X_m + Y_m$ .

Applying the same method from  $R_0$  calculation (Text S2) one can calculate the basic reproduction number  $R_0$  of this model, obtaining:

$$R_0 = \frac{b}{(B+N)\left(1 + \frac{1}{h}\frac{C + X_m^*}{B+N}\right)} \sqrt{\frac{T_{hM}T_{Mh}NX_m^*}{\gamma\mu}} , \qquad (5)$$

which is the same expression as before, but with the crucial difference that now  $X_m^*$  is given by the initial vector mosquito abundance, and does not vary with other model parameters or human abundance.

The main difference between this model and the main one is how the human population (N) influences the transmission dynamics. This can be seen in Figure S11 which shows that at low human population sizes  $R_0$  increases with N for both main and alternative models (but not for Ross-MacDonald); and for larger populations alternative model gets close to Ross-MacDonald predictions, while main model increases and saturates at a higher value.

The inclusion of diffuse competition between mosquitoes decreases the risk of an outbreak of malaria at very low population sizes, which is intuitive and reasonable. On the contrary, Ross–MacDonald model predicts the opposite – which is to be expected since it allows each human to take several hundreds of bites per day in that situation.

At larger population sizes, the relevant assumption is that vector population size is regulated by diffuse competition, being dependent on the human population size. In the absence of this regulation, alternative model approaches the Ross-MacDonald predictions for large N, while main model (equations 8-11, main text) predicts a higher risk of outbreak of malaria as human population increases. Therefore, we chose the most conservative model (i.e., main model), which gives a pessimistic scenario for population sizes concerned herein.

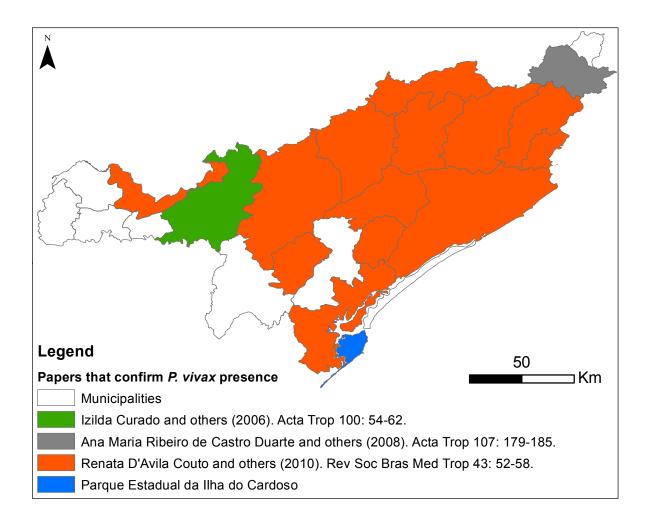


Figure S1. Plasmodium vivax's presence in the immediate surrounding region of Parque Estadual da Ilha do Cardoso. Curado and others [1] has found positivity of IgG antibodies against P. vivax in human samples from Iporanga municipality (prevalence  $\sim 50\%$ ). Castro Duarte and others [2] detected Plasmodium vivax infections in howler-monkeys (i.e., Alouatta guariba clamitans) from the Atlantic Forest (possibly Juquitiba municipality) (prevalence  $\sim 6\%$ ). Finally, D'Avila Couto and others [3] estimated that near 400 cases of malaria (being 97.2 % attributable to P. vivax) were confirmed between 1980 and 2007 by official agencies of epidemiological surveillance (e.g., Superintendência de Controle de Endemias da Secretaria de Estado da Saúde de São Paulo and Sistema de Informação de Agravos de Notificação).

1. Curado I, Malafronte RS, Duarte AMRC, Kirchgatter K, Branquinho MS, et al. (2006) Malaria epidemiology in low-endemicity areas of the Atlantic Forest in the Vale do Ribeira, São Paulo, Brazil. Acta Trop 100: 54–62.

- 2. Duarte AMRC, Malafronte RS, Cerutti Jr C, Curado I, Paiva BR, et al. (2008) Natural *Plasmodium* infections in Brazilian wild monkeys: Reservoirs for human infections? Acta Trop 107: 179–185.
- 3. Couto RDA, Latorre MRD, Di Santi SM, Natal D (2010) Autochthonous malaria notified in the State of São Paulo: clinical and epidemiological characteristics from 1980 to 2007. Rev Soc Bras Med Trop 43: 52–58.

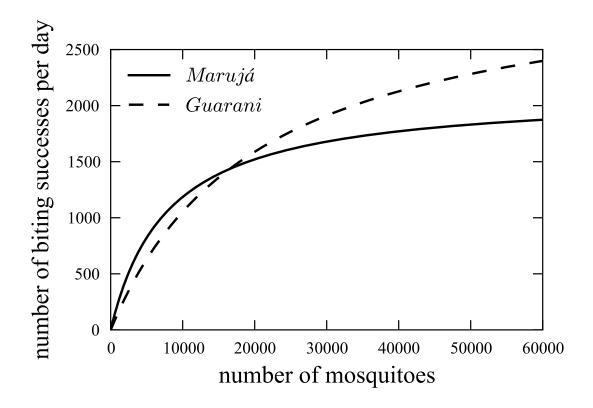


Figure S2. Relationships between successes and attempts in mosquito biting events in a given day. The X axis is the total number of mosquitoes  $(An.\ cruzii)$  (M) and non-vectors species (C). The Y axis is the total number of biting successes per day  $(\frac{bM}{1+\frac{1}{h}\frac{C+M}{B+N}})$ . Guarani, The Guarani Mbya village; and Marujá, Marujá.

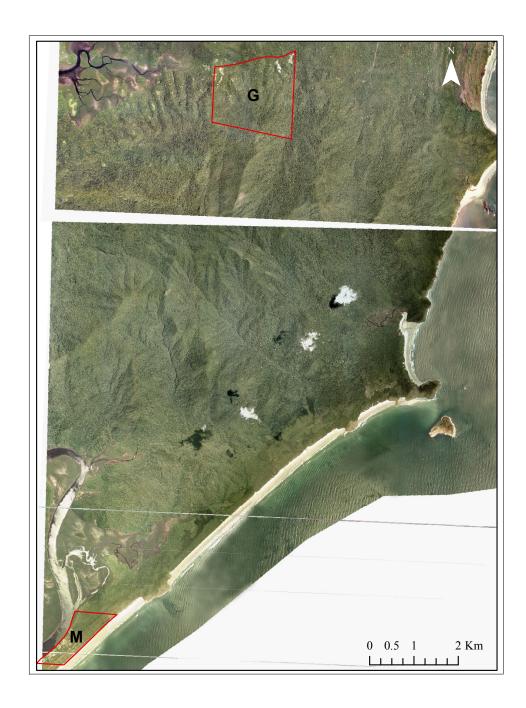


Figure S3. Human population and its geographical location. Clear-cut areas in the northern part of The Guarani Mbya village (G) represent logged forest that are utilized to agriculture. In slopes of the southern part of The Guarani Mbya village (G) vertebrate animals can be hunted. Fishermen build houses for their families in Marujá (M) which are also utilized as hostels for ecotourists. Source: Instituto Florestal do Estado de São Paulo [1].

1. Instituto Florestal do Estado de São Paulo (1998) Plano de gestão ambiental do Parque Estadual da Ilha do Cardoso. São Paulo: Secretaria do Meio Ambiente. 47 p.

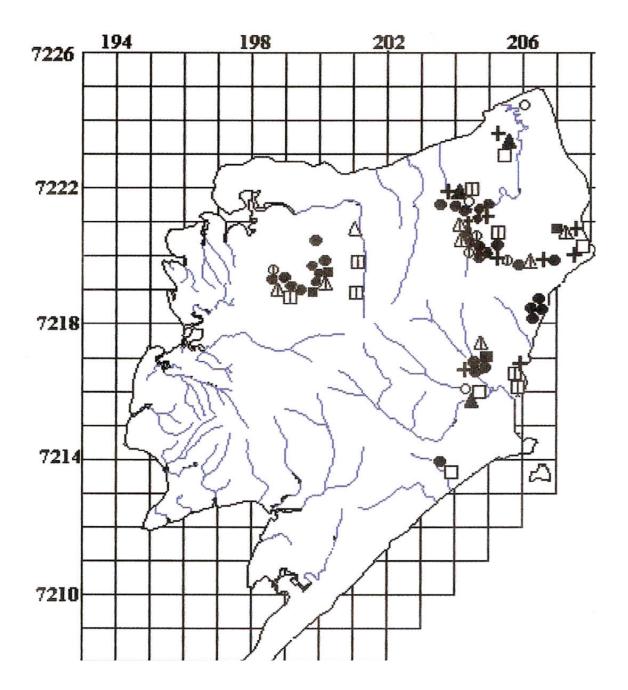


Figure S4. Occurrence of mammals in the Parque Estadual da Ilha do Cardoso. Mammal species were either seen or heard. Footprints were also utilized to indicate their presence. Legend: filled black circle, Alouatta guariba (howler monkey); hollow circle, Mazama americana (deer); hollow circle with vertical line, Nasua nasua (coati); filled black square, Pecari tajacu (collared peccari); hollow square, Leopardus pardalis, L. wiedii e Herpailurus yaguarondi (small spotted cats); hollow square with vertical line, Sciurus ingrami (squirrel); filled black triangle, Cerdocyon thous (fox); hollow triangle, Eira barbara (tayra); hollow triangle with vertical line, Tayassu pecari (white-lipped pecary); cross, Dasyprocta leporina (agouti). Source: Bernardo [1].

1. Bernardo CSS (2004) Abundância, densidade e tamanho populacional de aves e mamíferos cinegéticos no Parque Estadual Ilha do Cardoso, SP, Brasil. Piracicaba: Universidade de São Paulo [Master's thesis]. 156 p.

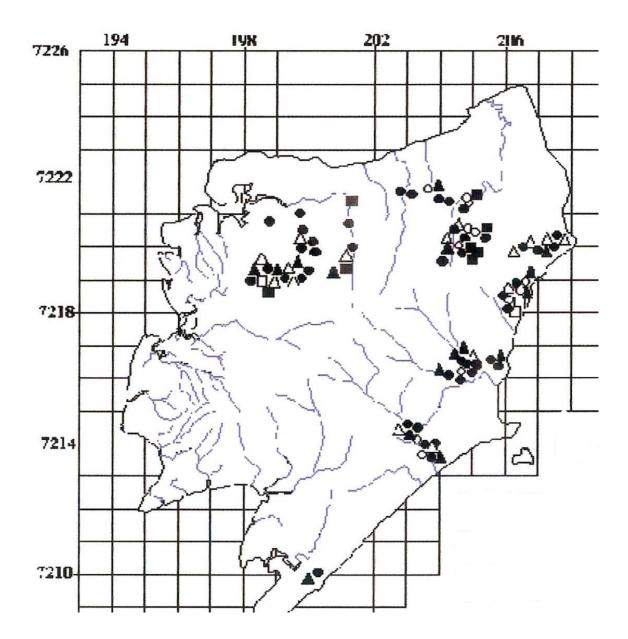


Figure S5. Occurrence of birds in the Parque Estadual da Ilha do Cardoso. Bird species were either seen or heard. Legend: filled black circle, *Ramphastos dicolorus* and *R. vitellinus* (toucans); hollow circle, *Penelope obscura* and *P. superciliaris* (guans); filled black square, *Pipile jacutinga* (guan); hollow square, *Crypturellus obsoletus* (tinamou); filled black triangle, *Odontophorus capueira* (spot-winged wood quail); hollow triangle, *Tinamus solitarius* (tinamou). Source: Bernardo [1].

1. Bernardo CSS (2004) Abundância, densidade e tamanho populacional de aves e mamíferos cinegéticos no Parque Estadual Ilha do Cardoso, SP, Brasil. Piracicaba: Universidade de São Paulo [Master's thesis]. 156 p.

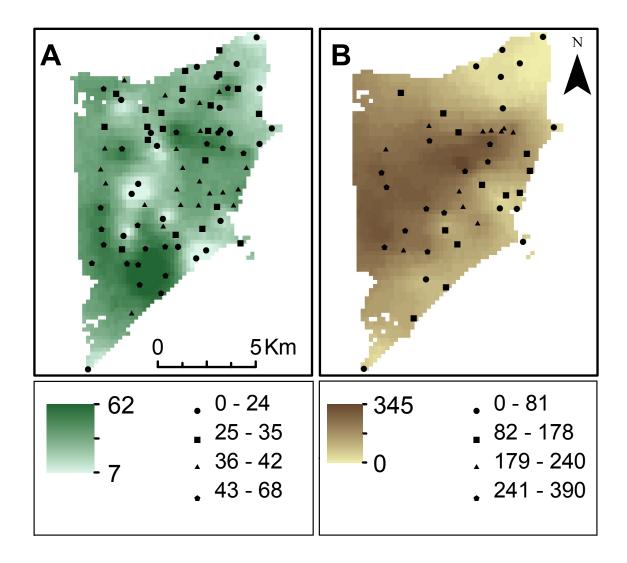


Figure S6. Vegetation and altitude at sampling sites of non-vector mosquito species (C) and Anopheles cruzii  $(X_m^*)$ : interpolations of ecologic niche axes. A: Vegetation biomass  $(m^3)$  of wood per  $m^2$ ; B: Altitude (meters above the sea). Points represent field sampling locations that were utilized for performing interpolations (grid of 200 m-spatial resolution). Source: Bernardi et al. [1].

1. Bernardi JVE, Landim PMB, Barreto CL, Monteiro RC (2005) Spatial study of the vegetation gradient from Cardoso Island State Park, SP, Brazil. Holos Environ 5: 1-21.

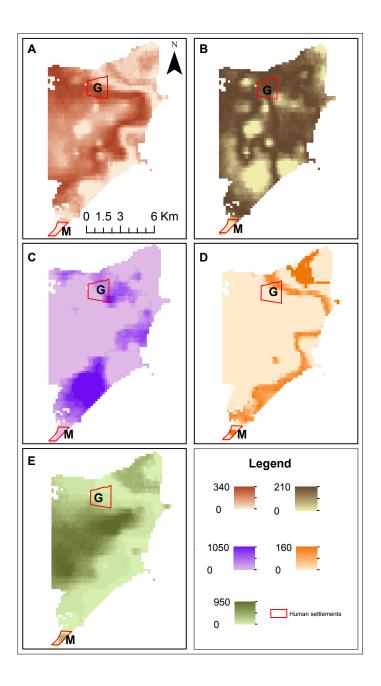


Figure S7. Abundance of non-vector mosquito species (C) and Anopheles cruzii ( $X_m^*$ ): spatial abundance distribution modelling. A: Abundance of An. cruzii (altitude  $\beta_1$  of 6.65 and vegetation biomass  $\beta_2$  of 2.13; R²-adjusted = 0.91); B: Abundance of Ae. serratus (vegetation biomass  $\beta_1$  of 2.13; R²-adjusted = 0.16); C: Abundance of Li. durhami (altitude  $\beta_1$  of 2.88 and vegetation biomass  $\beta_2$  of 1.00; R²-adjusted = 0.93); D: Abundance of Ru. reversa (altitude  $\beta_1$  of 6.4; R²-adjusted = 0.25); and E: Abundance of Wy. quasilongirostris (altitude  $\beta_1$  of 5.5; R²-adjusted = 0.34; grid of 200 m-spatial resolution). G, The Guarani Mbya village; and M, Marujá.

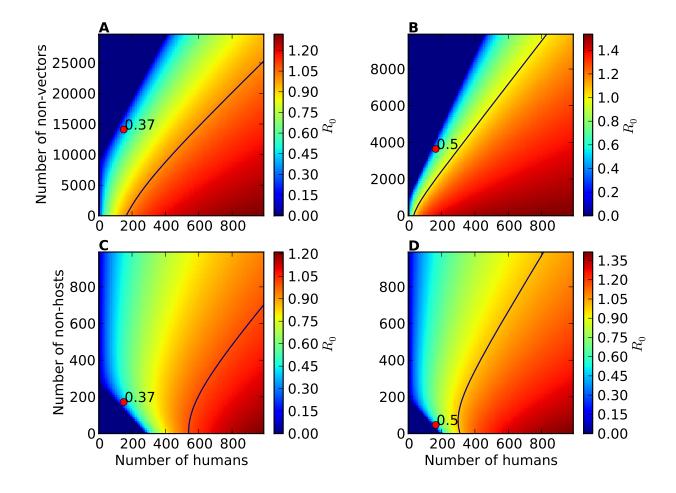


Figure S8. Sensitivity analysis: if h=21 then  $R_0<1$ . A, B: Decrease in abundance of non-vector mosquito species can increase risk of malaria transmission  $(R_0>1)$  in The Guarani Mbya village and Marujá, respectively; C, D: Decrease in abundance of non-host vertebrate species does not increase risk of malaria transmission  $(R_0<1)$  in The Guarani Mbya village and Marujá, respectively. The parameter  $\alpha$  is 5.3 in The Guarani Mbya village and 3 in Marujá.

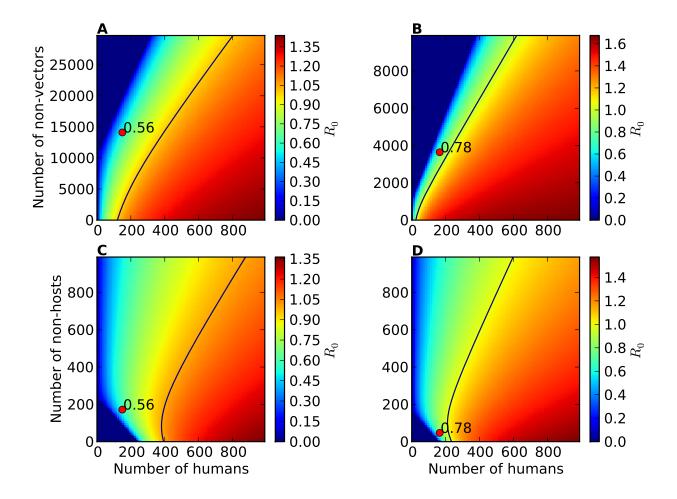


Figure S9. Sensitivity analysis: if h=25 then  $R_0<1$ . A, B: Decrease in abundance of non-vector mosquito species can increase risk of malaria transmission  $(R_0>1)$  in The Guarani Mbya village and Marujá, respectively; C, D: Decrease in abundance of non-host vertebrate species does not increase risk of malaria transmission  $(R_0<1)$  in The Guarani Mbya village and Marujá, respectively. The parameter  $\alpha$  is 4.7 in The Guarani Mbya village and 2.8 in Marujá.

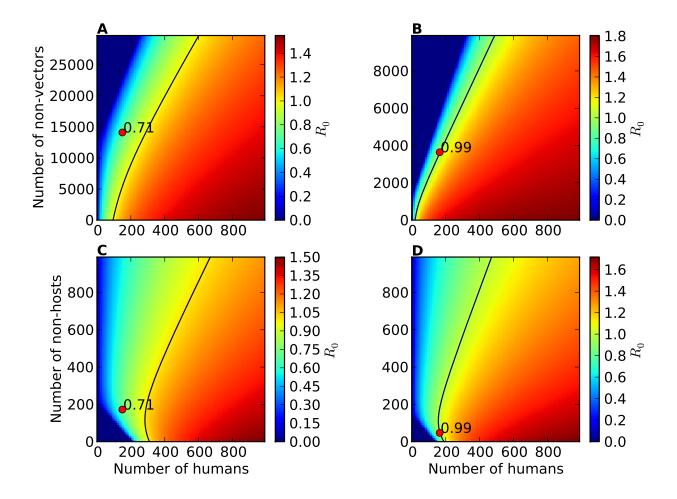


Figure S10. Sensitivity analysis: if h = 29 then  $R_0 < 1$ . A, B: Decrease in abundance of non-vector mosquito species can increase risk of malaria transmission ( $R_0 > 1$ ) in The Guarani Mbya village and Marujá, respectively; C, D: Decrease in abundance of non-host vertebrate species does not increase risk of malaria transmission ( $R_0 < 1$ ) in The Guarani Mbya village and Marujá, respectively. D: Increase in abundance of non-host vertebrate species can increase risk of malaria transmission ( $R_0 > 1$ ) in Marujá, which is supported in the work by Saul [1]. The parameter  $\alpha$  is 4.3 in The Guarani Mbya village and 2.6 in Marujá.

1. Saul A (2003) Zooprophylaxis or zoopotentiation: the outcome of introducing mortality while searching. Malaria J 2: 32.

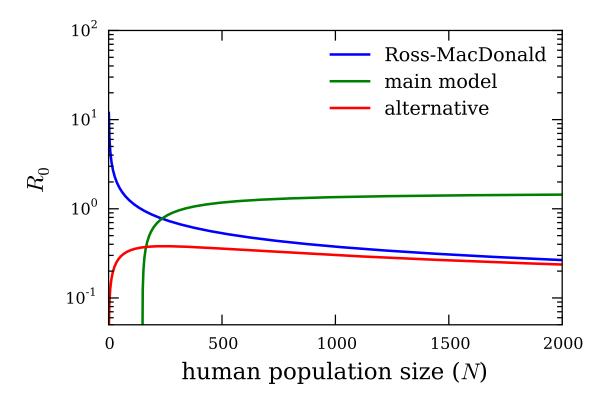


Figure S11. Basic reproduction number  $(R_0)$  as a function of the human population size (N), for the three models compared. The other parameter models are the same from Table 1 (main text) for the Marujá.

Table S1. Animal and bird species, density and population size estimates in the Parque Estadual da Ilha do Cardoso.

Species (popular name)	Animal density	Number of individuals
	(n° of individuals per km²)	(n°)
Odontophorus capueira (spot-winged wood quail)	26.7 (18.0 - 37.2)	2,963 (2,004 - 4,129)
Ramphastos dicolorus and R. vitellinus (toucans)	12.2 (10.6 - 15.9)	1,354 (1,179 - 1,765)
Alouatta guariba (howler monkey)	8.9 (6.9 - 11.6)	997 (769 - 1,291)
Dasyprocta leporina (agouti)	3.4 (2.3 - 4.4)	385 (264 - 488)
Penelope obscura and P. superciliaris (guans)	3.2 (2.8 - 4.2)	359 (311 - 467)
Pipile jacutinga (guan)	2.1 (1.8 - 2.7)	234 (203 - 304)
Sciurus ingrami (squirrel)	1.6 (1.1 - 2.0)	182 (124 - 231)
Tinamus solitarius (tinamou)	1.2 (1.0 - 1.6)	140 (121 - 182)

Estimates of animal population size and density were performed in the software DISTANCE 4.1. The values in parentheses correspond to the lower and upper limits of 95% confidence interval. Source: Bernardo [1].

# References

1. Bernardo CSS (2004) Abundância, densidade e tamanho populacional de aves e mamíferos cinegéticos no Parque Estadual Ilha do Cardoso, SP, Brasil. Piracicaba: Universidade de São Paulo [Master's thesis]. 156 p.

Table S2. Mosquito species and vegetation types in the Parque Estadual da Ilha do Cardoso.

able S2. Mosquito species and vegetation types in the Parque Estadual da Ilha do Cardoso.							
Species	Scrub vegetation	Restinga	Tropical pluvial forest				
Aedes albifasciatus	13	0	0				
Aedes hastatus	3	18	2				
Aedes fulvus	0	2	0				
Aedes oligopistus	4	26	2				
Aedes scapularis	542	79	6				
Aedes serratus	26	160	21				
Anopheles bellator	26	9	0				
Anopheles cruzii	23	33	90				
Anopheles homunculus	1	11	15				
$An opheles \ maculipes$	1	0	0				
Anopheles mediopunctatus	1	0	1				
Coquillettidia chrysonotum	766	337	93				
Coquillettidia venezuelensis	3	3	1				
Culex imitator	1	0	0				
Culex inadimirabilis	77	0	0				
Culex neglectus	0	2	0				
Culex ocossa	2	0	0				
Culex ribeirensis	83	0	0				
Culex sacchettae	9	15	0				
Psorophora albigenu	0	9	0				
Psorophora albipes	0	8	0				
Psorophora ferox	7	64	0				
Limatus durhami	0	42	14				
Limatus flavisetosus	0	16	3				
Runchomyia cerqueirai	0	5	0				
Runchomyia frontosa	0	0	3				
Runchomyia humboldti	0	4	1				
Runchomyia reversa	0	54	1				
Runchomyia theobaldi	0	29	2				
Sabethes intermedius	0	1	0				
Sabethes soperi	0	1	0				
Trichoprosopon pallidiventer	0	2	2				
Wyeomyia aporonoma	0	4	3				
Wyeomyia confusa	0	11	4				
Wyeomyia mulhensi	10	137	8				
Wyeomyia occulta	0	1	0				
Wyeomyia pallidoventer	0	61	0				
Wyeomyia pertinens	0	5	1				
Wyeomyia quasilongirostris	12	228	18				
Wyeomyia shannoni	0	1	0				
Wyeomyia theobaldi	0	17	3				
Tr goonigia incobalat		1	9				

Table S3. Mosquito abundance regression models, independent variables and Akaike Information Criteria values.

Model	Independent variables	Anopheles cruzii	Aedes serratus	Runchomyia reversa	Limatus durhami	Wyeomyia quasilongirostris
1. GL	Alt	190.89	212.76	165.98	161.03	241.25
2. GL	Bioveg	210.70	209.61	165.72	162.10	239.60
3. GL	Alt + Bioveg	190.83	209.12	162.94	162.19	234.18
4. GL	$Alt \times Bioveg$	192.15	209.10	164.52	156.58	236.10
5. a-LS	Alt	194.81	211.67	173.20	151.96	232.35
6. a-LS	Bioveg	201.69	209.52	169.21	146.64	228.22
7. a-LS	Alt + Bioveg	195.63	210.22	175.46	154.15	229.01
8. a-LS	$Alt \times Bioveg$	205.92	219.95	186.86	165.53	238.09
9. NB	Alt	140.35	183.89	111.82	91.83	195.57
10. NB	Bioveg	149.95	178.85	110.87	83.25	189.81
11. NB	Alt + Bioveg	142.10	177.81	100.49	83.87	181.62
12. NB	$Alt \times Bioveg$	143.95	177.81	86.40	72.64	183.59
13. GA	Alt	139.81	177.94	$83.81^{a}$	62.92	$160.22^a$
14. GA	Bioveg	149.86	$175.37^a$	86.55	58.41	174.62
15. GA	Alt + Bioveg	$136.45^{a}$	178.23	84.34	$57.34^{a}$	164.58
16. GA	$Alt \times Bioveg$	NC	177.74	NC	NC	NC

Model: GL, Gaussian linear regression model (the simplest model); a-LS, autoregressive least square model (it considered spatial correlation structure); NB, negative binomial regression model (it considered exponential non-linear relationship between mosquito abundance and independent variables); and GA, generalized additive regression model (it considered exponential non-linear relationship and a very flexible smooth function that maximize model fit).

Independent variables: Alt, altitude interpolation; Bioveg, vegetation biomass interpolation; Alt + Bioveg, sum of effects; Alt  $\times$  Bioveg, interaction.

NC: model did not converge to a result.

 $\vdash$ 

<sup>&</sup>lt;sup>a</sup>: The best model, i.e., the lowest Akaike Information Criteria value.