# Plasmodium vivax Readiness to Transmit: Implication for Malaria Eradication

S1 Text: Mathematical Models for P. falciparum and P. vivax

Swamy Rakesh Adapa, Rachel A. Taylor, Chengqi Wang, Richard Thomson-Luque, Leah R. Johnson and Rays H. Y. Jiang

We provide full details of the model equations for both *P. falciparum* and *P. vivax* that are analysed in the main text. We begin with *P. falciparum* as this is the simpler model and is similar to many models that have already been used to study malaria [10, 12].

## <sup>4</sup> S1.1 P. falciparum

The model put forward for *P. falciparum* is based upon the Ross-MacDonald model [8, 9, 11] 5 developed specifically for malaria but has since been used for many vector-borne diseases. It is a 6 compartmental model of differential equations, i.e. both hosts (humans) and vectors (mosquitoes) 7 are split into different compartments determined by their infection status and we analyze how the 8 dynamics of each compartment changes over time. For P. falciparum humans are either Suscep-9 tible, S(t), Exposed, E(t), Asymptomatic, A(t), Infected, I(t), or Removed, R(t). A proportion 10 of hosts will show symptoms and are labeled as Infected; the remaining proportion are Asymp-11 tomatic but are still able to transmit the disease. Removed hosts are those which have temporary 12 immunity after a recent bout of infection. However, they lose this immunity and move back to 13 being Susceptible to P. falciparum after a number of days. Mosquitoes are classified as being 14 Susceptible,  $S_M(t)$ , Exposed,  $E_M(t)$ , or Infected,  $I_M(T)$ . In both cases, Exposed implies that the 15 host or vector has been infected with the disease but is not able to transmit vet. That is, the 16 pathogen is currently proceeding through the internal stages within the host or mosquito. 17

All hosts are born Susceptible. These Susceptible hosts progress to the Exposed class (Figure 18 S1.1), due to a bite from an Infected vector (with some probability of successful transmission, see 19 Equations (1)-(8). Once Exposed, a host becomes either Asymptomatic or Infected after a fixed 20 delay to account for the intrinsic incubation period, that is the number of days it takes for P. 21 falciparum to reach the blood stage. Whilst all hosts have a natural death rate which includes 22 death by natural causes and other factors unrelated to malaria infection, Infected hosts can also 23 die due to *P. falciparum*. Otherwise, Asymptomatic and Infected hosts clear the infection and 24 move to a Removed class, which indicates temporary immunity from *P. falciparum*. However, this 25 lasts only for a short time, at which point they move back to the Susceptible class. 26

Similarly, all vectors are born Susceptible. These Susceptible vectors progress to the Exposed class after successful contact with an Infected host. They remain in the Exposed class for the extrinsic incubation period, the duration of time for *P. falciparum* to move from the mid-gut of the mosquito to the salivary glands. They progress to the Infected class and remain so for the



Figure S1.1: A schematic for the *P. falciparum* model. Hosts are represented through the rectangles, vectors in the circles. The processes of how to move between the different compartments are shown with black arrows. The red arrows show the role of interactions between hosts and vectors leading to disease. There are two infectious classes – one which shows symptoms at some point (Infected Host) and one which does not show symptoms (Asymptomatic Host).

<sup>31</sup> remainder of their lifespan. We assume the mosquitoes do not suffer any side-affects from infection

<sup>32</sup> by *P. falciparum* nor does it alter their behavior.

We assume that contact between mosquitoes and humans is frequency-dependent, which implies that the number of bites from mosquitoes is not dependent on the density of humans [1]. This is

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their bite rate because there are more hosts present. This leads to the following model equations:

$$\frac{dS}{dt} = \lambda_H - \frac{ab}{H} I_M S - \mu_H S + wR \tag{1}$$

$$\frac{dE}{dt} = \frac{ab}{H}I_MS - \frac{ab}{H}I_M(t-\tau)S(t-\tau)e^{-\mu_H\tau} - \mu_HE$$
(2)

$$\frac{dA}{dt} = (1-p)\frac{ab}{H}I_M(t-\tau)S(t-\tau)e^{-\mu_H\tau} - rA - \mu_HA$$
(3)

$$\frac{dI}{dt} = p\frac{ab}{H}I_M(t-\tau)S(t-\tau)e^{-\mu_H\tau} - \alpha I - rI - \mu_H I$$
(4)

$$\frac{dR}{dt} = r(A+I) - \mu_H R - wR \tag{5}$$

$$\frac{dS_M}{dt} = \lambda M - (\lambda - \mu)\frac{M^2}{K} - \frac{ac}{H}(A + I)S_M - \mu S_M \tag{6}$$

$$\frac{dE_M}{dt} = \frac{ac}{H}IS_M - \frac{ace^{-\mu EIP}}{H}(A(t - EIP) + I(t - EIP))S_M(t - EIP) - \mu E_M$$
(7)

$$\frac{dI_M}{dt} = \frac{ace^{-\mu EIP}}{H} (A(t - EIP) + I(t - EIP))S_M(t - EIP) - \mu I_M \tag{8}$$

The parameters of the model are the following:  $\lambda_H$  and  $\mu_H$  are the birth rate and death rate 37 for humans, respectively; a is the bite rate of mosquitoes; b is the probability that a bite from an 38 infected mosquito on a susceptible host results in successful transmission; c is the probability that 39 a bite from a susceptible mosquito on an infected host results in successful transmission;  $\tau$  is the 40 time delay for hosts to move from the exposed to the infected class; p is the proportion of hosts that 41 show symptoms when they are infectious;  $\alpha$  is the rate of disease-induced death; r is the rate of 42 recovery from the disease; w is the rate that immunity is loss after infection;  $\lambda$  and  $\mu$  are the birth 43 and death rates of mosquitoes, respectively; K is a carrying capacity for the mosquitoes; EIP is 44 the time delay for the extrinsic incubation period, before mosquitoes move from the exposed to the 45 infected class; lastly H = S + E + I + R is the total host population size and  $M = S_M + E_M + I_M$ 46 is the total mosquito population size. For parameter definitions and values, see Table S1.1. 47

The exponential terms,  $e^{-\mu_H \tau}$  and  $e^{-\mu EIP}$  account for the fact that natural death of the host or mosquito may occur during the time it is exposed. Thus, not all hosts or vectors that enter the exposed class will progress to the infected class; rather the total is discounted by the exponential term.

<sup>52</sup> We can calculate  $R_0$ , the basic reproductive number, which is a widely used criterion to deter-<sup>53</sup>mine the intensity of a disease and it's likelihood to spread. It represents the number of secondary <sup>54</sup>hosts that will be infected when one infected host is introduced into a naïve population. This <sup>55</sup>definition leads to the following criterion: if  $R_0 > 1$  disease prevalence is expected to increase in <sup>56</sup>the population; otherwise the number of infected hosts is expected to decline. The above model <sup>57</sup>for *P. falciparum* leads to the following equation for  $R_0$ :

$$R_{0} = \left(\frac{Ma^{2}bc}{H\mu}e^{-\mu EIP}e^{-\mu_{H}\tau}\left(\frac{p}{\alpha+r+\mu_{H}} + \frac{1-p}{r+\mu_{H}}\right)\right)^{\frac{1}{2}}$$
(9)

This equation can be understood by considering how infection would propagate through the populations of vectors and hosts. It is composed of the ratio of mosquitoes to hosts (M/H); the <sup>60</sup> number of mosquitoes that would bite the infected host and become infected (ac); the proportion <sup>61</sup> of those mosquitoes that survive to become infectious  $(e^{-\mu EIP})$ ; the lifespan of the mosquito  $(\frac{1}{\mu})$ ; <sup>62</sup> the number of hosts those mosquitoes bite and infect (ab); the proportion of those hosts that <sup>63</sup> survive to become infectious  $(e^{-\mu_H\tau})$ ; the length of time a host is infectious, which is  $\frac{1}{\alpha+r+\mu_H}$  for a <sup>64</sup> proportion p of hosts, and  $\frac{1}{r+\mu_H}$  for the remaining proportion 1-p. We will outline the calculations <sup>65</sup> to produce  $R_0$  for the P. vivax model below. The same procedure can be used to calculate equation <sup>66</sup> (9) for the P. falciparum model.

### 67 S1.2 P. vivax

We adapt the model for *P. falciparum* to include specific details of *P. vivax*, with a focus on 68 the new information found experimentally. P. vivax is significantly different from P. falciparum, 69 both because there are believed to be more asymptomatic cases and the high chance of relapses 70 of the disease from 2-3 weeks to months and even years later, depending on whether the strain 71 is tropical or temperate [15]. Asymptomatic cases for P. falciparum have been seen, perhaps due 72 to continuous exposure to the disease in regions of high endemicity, but studies have suggested 73 that submicroscopic cases will occur much more frequently for P. vivax, with up to 89% of sub-74 microscopic infections being asymptomatic [2, 6]. Relapses of *P. vivax* occur due to the presence 75 of hypnozoites in the liver which will either die over time, or be released into the blood stream, 76 re-infecting the host. The process that causes release of hypnozoites from the liver is unclear. We 77 include two classes of Recovered hosts in our model (Figure S1.2), those with hypnozoites and the 78 possibility of relapse, and those without. We do not keep track of the number of hypnozoites in the 79 liver and thus how many times an individual host can relapse. Instead once they relapse, we treat 80 them as any other infected host with probabilities of being recovered with or without hypnozoites. 81 However, the probability of recovering with hypnozoites is calibrated by the average number of 82 relapses each host is likely to have. 83

Similar to P. falciparum, we include both an asymptomatic compartment and an infected 84 compartment. Those in the infected compartment do not necessarily show symptoms from the 85 beginning of their infection, rather it indicates those hosts which have symptoms at some point, 86 and therefore are likely to seek care and be logged in the health-care system as a *P. vivax* case. We 87 set the proportion of hosts that show symptoms to be a proportion of those in the *P. falciparum* 88 model in order to compare the role of asymptomatic hosts on disease transmission of both P. 89 falciparum and P. vivax. Of the hosts that relapse in the P. vivax model, the same proportion 90 will develop symptoms as for the initial infection. 91

From our computational experiments, we found that it is possible for human hosts to develop sexual stages much quicker in *P. vivax* than was previously thought possible. We include this reduction in length of the intrinsic incubation period by varying how long it takes for hosts to become infectious, and correspondingly we change the average length of time infectious (such that the total length of time exposed and infectious remains constant).

<sup>97</sup> With these changes to the model, we produce a new schematic to show disease progression <sup>98</sup> for hosts and vectors (Figure S1.2). As before, all hosts are born Susceptible. They progress to <sup>99</sup> Exposed after a successful bite from an infectious vector. The length of time a host is in this class <sup>100</sup> is once again given by a time delay, but we will vary the length of the delay to explore the effects <sup>101</sup> of our experimental results. A proportion  $k_3p$  of the hosts will move into the Infected host class, <sup>102</sup> while the remainder progress to the Asymptomatic compartment. Asymptomatic and Infected <sup>103</sup> hosts will transmit the disease and will recover from the disease with the same probability but <sup>104</sup> only Infected hosts can die due to the disease. The likelihood of hosts recovering with or without <sup>105</sup> hypnozoites is the same for both Infected and Asymptomatic hosts.



Figure S1.2: A schematic for the *P. vivax* model. Hosts are represented through the rectangles, vectors in the circles. The processes of how to move between the different compartments are shown with black arrows. The red arrows show the role of interactions between hosts and vectors leading to disease. After infection, a proportion have hypnozoites in their liver which can either cause relapse, or the hypnozoites die, in which case they move to Recovered Host 2 class before loss of immunity leads to movement back to the Susceptible class. Relapse can either be back into the Infected class or the Asymptomatic class, with the same proportion as for an initial infection.

The equations for the P. vivax model are:

$$\frac{dS}{dt} = \lambda_H - \frac{ab}{H} I_M S + wR_2 - \mu_H S \tag{10}$$

$$\frac{dE}{dt} = \frac{ab}{H} I_M S - \frac{ab}{H} I_M (t - \tau_1) S(t - \tau_1) e^{-\mu_H \tau_1} - \mu_H E$$
(11)

$$\frac{dA}{dt} = \frac{(1-k_3p)ab}{H} I_M(t-\tau_1)S(t-\tau_1)e^{-\mu_H\tau_1} + (1-k_3p)\nu R_1 - r_1A - \mu_HA$$
(12)

$$\frac{dI}{dt} = \frac{k_3 p a b}{H} I_M(t - \tau_1) S(t - \tau_1) e^{-\mu_H \tau_1} + k_3 p \nu R_1 - k_1 \alpha I - r_1 I - \mu_H I$$
(13)

$$\frac{dR_1}{dt} = k_2 r_1 (A+I) - \nu R_1 - \eta R_1 - \mu_H R_1 \tag{14}$$

$$\frac{dR_2}{dt} = (1 - k_2)r_1(A + I) + \eta R_1 - wR_2 - \mu_H R_2$$
(15)

$$\frac{dS_M}{dt} = \lambda M - (\lambda - \mu)\frac{M^2}{K} - \frac{ac}{H}(A + I)S_M - \mu S_M \tag{16}$$

$$\frac{dE_M}{dt} = \frac{ac}{H}(A+I)S_M - \frac{ac}{H}(A(t-EIP) + I(t-EIP))S_M(t-EIP)e^{-\mu EIP} - \mu E_M$$
(17)

$$\frac{dI_M}{dt} = \frac{ac}{H} (A(t - EIP) + I(t - EIP)) S_M(t - EIP) e^{-\mu EIP} - \mu I_M$$
(18)

The new host compartments, as discussed above, are Recovered with hypnozoites,  $R_1(t)$ , and 106 Recovered without hypnozoites,  $R_2(t)$ . Parameters with the same name as in Equations (1)-(8) 107 are defined in the same way and have the same value. The new parameters are:  $\tau_1$  is the length of 108 the exposed time delay;  $k_3$ , a proportionality constant relating the proportion of hosts that show 109 symptoms in the P. vivax model to the P. falciparum model;  $k_1$ , a proportionality constant relating 110 death caused by P. vivax to P. falciparum;  $r_1$ , the rate of recovery in P. vivax;  $k_2$ , the proportion 111 of hosts leaving the Infected/Asymptomatic stages that have hypnozoites in their liver, and thus 112 can potentially relapse;  $\eta$ , the rate of death of hypnozoites in the liver and thus movement from 113 one Removed class to the second; and  $\nu$ , the rate of relapse caused by hypnozoites. Parameter 114 values and definitions are given in Table S1.1. 115

#### 116 S1.2.1 Calculating $R_0$

We go through the procedure to calculate  $R_0$  for this model. It is based upon the work of [4, 5] which 117 introduces the idea of next-generation matrices. Some good examples of using this method are 118 provided in [14, 17] with specific examples for vector-borne diseases. A further example, specifically 119 for delay-differential equations, is in [1]. The next-generation matrix approach involves calculating 120  $R_0$  as the largest eigenvalue of the matrix  $FV^{-1}$  in which F is defined as the transmission matrix 121 and V is defined as the transition matrix. We outline this process in more detail: first we focus 122 only on those classes which are considered infectious. For our model (10)-(18) for P. vivax, the 123 infectious classes are (10), (11), (12), (13), (16) and (17), i.e. Exposed host, Asymptomatic host, 124 Infected host, Recovered host with hypprozoites, Exposed vector and Infected vector. For both 125 matrices, the rows and columns will be delimited by these classes in the order just stated. The 126 transmission matrix F is a matrix indicating new infections arising in each of the population 127

128 classes, moving from columns to rows. Explicitly, it outlines how a host or vector in a column

class can lead to a new infection in a vector or host in the row classes. For our system, we have the following matrix for F:

For example, the term in the first row is the rate of new infections that arise from an infected mosquito that go into the E class. Those on the 5th row represent the rate of new infections arising in the  $E_M$  class from both the A and I classes.

The matrix V is a transition matrix, outlining other movement between classes not caused by new infectious contact between mosquito and host. Once again, we have each row and column representing equations (10)-(13), (16) and (17) in that order. Of particular note is that movement out of a class is considered positive, whilst movement into a class is negative. This produces the following transition matrix:

$$V = \begin{pmatrix} 1 & 0 & 0 & 0 & 0 & 0 \\ -(1-k_3p)e^{-\mu_H\tau_1} & r_1 + \mu_H & 0 & -(1-k_3p)\nu & 0 & 0 \\ -k_3pe^{-\mu_H\tau_1} & 0 & k_1\alpha + r_1 + \mu_H & -k_3p\nu & 0 & 0 \\ 0 & -k_2r_1 & -k_2r_1 & \nu + \eta + \mu_H & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & -e^{-\mu EIP} & \mu \end{pmatrix}$$
(20)

How to treat movement between classes when there is a fixed delay is not intuitive. We 139 handle this by noting that all hosts or vectors leave the exposed class, either through time delayed 140 movement to an infected class, or through death. As there is a time delay, it is not important to 141 know the rate at which hosts or vectors leave the class. Thus, we have 1's in (row, column) = 142 (1,1) and (5,5) in V indicating that all hosts/vectors leave these exposed classes. But we need to 143 consider what proportion of the exposed class progresses to the infected class rather than dying: 144 these are the exponential terms in (2, 1), (3, 1) and (6, 5), with the appropriate negative signs to 145 indicate movement into the class. 146

The next step is to calculate  $V^{-1}$ . First we calculate the determinant of the matrix:

$$det(V) = \mu(r_1 + \mu_H) \left( (k_1 \alpha + r_1 + \mu_H) (\nu + \eta + \mu_H) - k_3 p \nu k_2 r_1 \right) - \mu(k_1 \alpha + r_1 + \mu_H) (1 - k_3 p) \nu k_2 r_1$$
  
=  $\mu((r_1 + \mu_H)G_1 - (k_1 \alpha + r_1 + \mu_H)G_2)$ 

where we introduce  $G_1$  and  $G_2$  to simplify the presentation. Proceeding through the steps of calculating the inverse, which can be done by hand or using a suitable computer program, produces the following:

$$V^{-1} = \frac{1}{\det V} \begin{pmatrix} \det V & 0\\ e^{-\mu_H \tau_1} ((1-k_3 p)G_1 + k_3 pG_2) & \mu G_1\\ k_3 p e^{-\mu_H \tau_1} (r_1 + \mu_H) (\nu + \eta + \mu_H) \mu & \mu G_2 \frac{k_3 p}{1-k_3 p}\\ e^{-\mu_H \tau_1} \mu \frac{G_2}{\nu} \left( (k_1 \alpha + r_1 + \mu_H) + (r_1 + \mu_H) \frac{k_3 p}{1-k_3 p} \right) & (k_1 \alpha + r_1 + \mu_H) k_2 r_1 \mu \\ 0 & 0\\ 0 & 0 \end{pmatrix}$$

$$\begin{pmatrix} 0 & 0 & 0 & 0 \\ \mu G_2 & (k_1 \alpha + r_1 + \mu_H)(1 - k_3 p)\nu\mu & 0 & 0 \\ (r_1 + \mu_H)(\nu + \eta + \mu_H)\mu - \mu G_2 & (r_1 + \mu_H)k_3 p\nu\mu & 0 & 0 \\ (r_1 + \mu_H)k_2 r_1 \mu & (k_1 \alpha + r_1 + \mu_H)(r_1 + \mu_H)\mu & 0 & 0 \\ 0 & 0 & \det V & 0 \\ 0 & 0 & \frac{\det V}{\mu} e^{-\mu EIP} & \frac{\det V}{\mu} \end{pmatrix}$$
(21)

Next we calculate  $FV^{-1}$  in order to compute its eigenvalues. As the matrix is mostly zeroes but some terms are quite long, we separately display the components of the matrix which are non-zero using (row, column) notation:

$$(5,1) = \frac{ac\mu}{\det V} \frac{S_M}{H} e^{-\mu_H \tau_1} \left[ (1-k_3 p) \left( G_1 + G_2 \frac{k_3 p}{1-k_3 p} \right) + k_3 p (r_1 + \mu_H) (\nu + \eta + \mu_H) \right] (5,2) = \frac{ac\mu}{\det V} \frac{S_M}{H} \left( G_1 + G_2 \frac{k_3 p}{1-k_3 p} \right) (5,3) = \frac{ac\mu}{\det V} \frac{S_M}{H} (r_1 + \mu_H) (\nu + \eta + \mu_H) (5,4) = \frac{ac\mu}{\det V} \frac{S_M}{H} ((k_1 \alpha + r_1 + \mu_H) (1 - k_3 p) \nu + (r_1 + \mu_H) k_3 p \nu) (1,5) = \frac{abS}{H} \frac{e^{-\mu EIP}}{\mu} (1,6) = \frac{abS}{H} \frac{1}{\mu}$$

One important aspect to note is that for calculating  $R_0$  we assume that there is only one infected host in an otherwise susceptible population of both hosts and vectors. Therefore, we will assume that  $S \approx H$  and  $S_M = M$ , the total vector population.

The final step is to calculate the eigenvalues of this matrix  $FV^{-1}$ . There are 4 zero eigenvalues and a double root of a quadratic. As  $R_0$  is the largest positive eigenvalue, we take the positive root. With some simplification, we end with:

$$R_{0} = \left\{ a^{2}bc\frac{M}{H}\frac{e^{-\mu EIP}}{\mu}e^{-\mu_{H}\tau_{1}} \left[ \frac{(1-k_{3}p)(k_{1}\alpha+r_{1}+\mu_{H})+k_{3}p(r_{1}+\mu_{H})}{(k_{1}\alpha+r_{1}+\mu_{H})(r_{1}+\mu_{H})-((1-k_{3}p)(k_{1}\alpha+r_{1}+\mu_{H})+k_{3}p(r_{1}+\mu_{H}))\left(\frac{\nu k_{2}r_{1}}{\nu+\eta+\mu_{H}}\right)} \right] \right\}^{\frac{1}{2}}$$
(22)

Although this equation seems complicated, it can be reasonably well understood by thinking in terms of how the disease progresses through the vector and host populations. Most of the terms in (9) are present in (22); the difference results from a more complicated length of time infectious. To understand it more clearly, we can consider some of the components separately:

$$\frac{(1-k_3p)(k_1\alpha+r_1+\mu_H)+k_3p(r_1+\mu_H)}{(k_1\alpha+r_1+\mu_H)(r_1+\mu_H)} = k_3p\frac{1}{k_1\alpha+r_1+\mu_H} + (1-k_3p)\frac{1}{r_1+\mu_H}$$
(23)

The right hand side has a more intuitive meaning than the left: a proportion  $k_3p$  go into the infected class for an average length of time infectious given by  $\frac{1}{k_1\alpha+r_1+\mu_H}$ , while a proportion  $1-k_3p$  move into the asymptomatic class for an average length of time  $\frac{1}{r_1+\mu_H}$ . This term within (22) is regulated by those hosts that relapse:  $\frac{\nu}{\nu+\eta+\mu_H}$  is the proportion of recovered hosts with hypnozoites that relapse, and  $k_2r_1$  is the rate at which infected and asymptomatic hosts recover with hypnozoites.

#### <sup>166</sup> S1.2.2 The role of Asymptomatic Hosts

Above, in the *P. vivax* model, we assumed that a proportion  $k_3p$  of infected hosts had symptoms 167 at some point, whilst the remaining proportion  $1 - k_3 p$  were asymptomatic. It is unclear how many 168 asymptomatic hosts there could be, therefore we vary the parameters p and  $k_3$  to assess the effect 169 of asymptomatics on  $R_0$ . However, this is assuming that we take into account that asymptomatics 170 exist, but do not know in what proportion. We ask now, what happens when you do not take into 171 account transmission by asymptomatics at all? To do this we use similar equations to (10)-(18)172 but we no longer think of the Asymptomatic host A(t) as able to transmit infection. However, 173 exposed hosts can still move into the asymptomatic class with the same proportion  $1 - k_3 p$ . When 174 calculating  $R_0$  using the procedure outlined above, the A(t) equation will not be considered an 175 infectious class. This leads to the following equation for  $R_0$ : 176

$$R_{0} = \left(a^{2}bc\frac{M}{H}\frac{e^{-\mu EIP}}{\mu}k_{3}pe^{-\mu_{H}\tau_{1}}\frac{1}{k_{1}\alpha + r_{1} + \mu_{H} - k_{3}p\left(\frac{\nu k_{2}r_{1}}{\nu + \eta + \mu_{H}}\right)}\right)^{\frac{1}{2}}$$
(24)

<sup>177</sup> We can compare this  $R_0$  to the  $R_0$  for *P. vivax* and *P. falciparum* above and assess how much <sup>178</sup> information is lost by not taking into account the asymptomatic compartment.

### <sup>179</sup> S1.3 Parameter Values

We outline our choice of parameter values for the *P. falciparum* and *P. vivax* models (Table S1.1). We only consider those parameters that are different between the  $R_0$  equations (9) and (22). We assume that the transmission rates between hosts and mosquitoes and the length of time for the mosquito to become infectious will be the same for *P. falciparum* and *P. vivax*.

The host death rate is given by assuming an average lifespan of 71.5 years [13]. The diseaseinduced death rate for *P. falciparum* is found by assuming 1 million deaths per year to an estimated 350-500 million cases [18]. *P. vivax* has an estimated 13.8 million cases per year with death caused by *P. vivax* in the range 1400 - 14900 [18]. Therefore, the disease-induced death rate of *P. vivax* should be between 0.0001-0.001 and hence  $k_1$ , the proportionality constant relating the two disease-induced death rates, will be between 0.05-0.5.

To determine what proportion of hosts leaving the infectious classes will recover with hypnozoites (parameter  $k_2$ ), we use the fact that on average a host will have 2.1 relapses [16]. Using the

Parameter	Definition	Value	Reference
$\mu_H$	Host death rate	$3.84 \times 10^{-5}$	[13]
$\alpha$	Disease-induced death rate for $P. falciparum$	0.002	[18]
$k_1$	Proportional rate of disease death for $P$ . vivax	0.25	[18]
r	Recovery rate for <i>P. falciparum</i>	1/60	[3]
$r_1$	Recovery rate for <i>P. vivax</i>	$1/(60+\epsilon)$	-
$\tau$	Length of exposed period for <i>P. falciparum</i>	14	[7]
$ au_1$	Length of exposed period for $P$ . vivax	$ au-\epsilon$	-
$\epsilon$	Reduction in length of exposed period for $P$ . vivax	$0\!\!-\!\!7~(3.5)$	-
p	Proportion of infected <i>P. falciparum</i> hosts with symptoms	0 - 1 (1)	-
$k_3$	Proportional rate of having symptoms in <i>P. vivax</i> model	0 - 1 (1)	-
$k_2$	Proportion of recovering hosts with hypnozoites	0.68	[16]
$\nu$	Hypnozoite relapse rate	1/72	[16]
$\eta$	Hypnozoite death rate in liver	1/223	[16]

Table S1.1: Parameter definitions with the values used to calculate  $R_0$  for *P. falciparum* (Eqn (9)) and for *P. vivax* (Eqn (22)). For *p*,  $k_3$  and  $\epsilon$ , their range is given with a base value given in parentheses. All rates are in days

concept of Bernoulli trials, the host essentially has an average of 2.1 failures (clearing the infection
with hypnozoites) until it has a success (clearing the infection without hypnozoites). This leads to
a probability of 0.68 for a failure, i.e. clearing with hypnozoites.

We introduce a new parameter,  $\epsilon$ , to describe the reduction in length of the intrinsic incubation period, and hence the increase in length until average recovery time with *P. vivax*. A larger  $\epsilon$  indicates a bigger difference in incubation length between *P. falciparum* and *P. vivax* which corresponds to the disease transmitting sooner for *P. vivax*. This affects both parameters  $\tau$  and *r* as seen in Table S1.1, producing  $\tau_1$  and  $r_1$ . Parameters  $\epsilon$ , *p* and  $k_3$  vary over a range therefore we set a baseline value for them, for *p* and  $k_3$  this is 1 to indicate the baseline assumption is that there are no asymptomatic hosts for either *P. falciparum* or *P. vivax*.

### $_{202}$ S1.4 Methods

We use Matlab to compare the values of  $R_0$  for P. falciparum and P. vivax. As we are looking at 203 the relative values of  $R_0$  we need only consider those terms within each  $R_0$  which are different. We 204 treat the value of  $R_0$  for *P. falciparum* as a baseline, setting it's value equal to 1 when p = 1 and 205 determining how much  $R_0$  for *P. vivax* differs. We focus on the change in the length of the intrinsic 206 incubation period which correspondingly changes the length of time infectious, but also consider 207 the role of asymptomatic hosts in spreading infection and of relapses. To do this, we perform a 208 sensitivity analysis for  $R_0$ , in which all parameters are varied by 10% and the resultant change in 209  $R_0$  is plotted. For parameters p,  $k_3$  and  $\epsilon$ , we vary the parameters over their whole range rather 210 than by 10%. 211

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