## 1 Prawn aquaculture as a method for schistosomiasis control and poverty

- 2 alleviation: a win-win approach to address a critical infectious disease of
- 3 poverty
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#### 40 Abstract

41 Recent evidence suggests crustacean snail predators may aid schistosomiasis control 42 programs by targeting the environmental component of the parasite's life cycle through 43 predation of the snail species that serve as intermediate hosts of the parasite. We evaluate 44 costs, benefits, and potential synergies between schistosomiasis control and aquaculture of 45 giant prawns using an integrated bio-economic-epidemiologic model. We identified 46 combinations of stocking density and aquaculture cycle length that maximize profit and offer 47 disease control benefits for sustainable schistosomiasis control. We consider two prawn 48 species in sub-Saharan Africa: the endemic, non-domesticated Macrobrachium vollenhovenii, 49 and the non-native, domesticated *Macrobrachium rosenbergii*. We find that, at profit-optimal 50 densities, both *M. rosenbergii* and *M. vollenhovenii* can complement conventional control 51 approaches (mass drug treatment of people) and lead to sustainable schistosomiasis control. 52 We conclude that integrated aquaculture strategies can be a win-win strategy in terms of 53 health and sustainable development in schistosomiasis endemic regions of the world.

#### 54 <u>Main</u>

55 Schistosomiasis is a debilitating disease of poverty, affecting around 200 million people 56 worldwide <sup>1,2</sup>. It is caused by trematode parasites of the genus *Schistosoma* that undergo a life 57 cycle involving passage between definitive human hosts and freshwater snails that act as 58 intermediate hosts. While safe and effective treatments, such as the anthelmintic drug 59 Praziquantel, are available to reduce parasite burden and associated symptoms from infected 60 individuals, rapid reinfection in highly endemic areas leads to persistent hotspots of 61 infection<sup>3,4</sup>. Successful long-term elimination efforts may require strategies that go beyond 62 conventional mass drug administration (MDA) campaigns to explicitly target the 63 environmental reservoir of the disease 5.

64 One option for reducing transmission is cultivating snail predators, such as river prawns, 65 via aquaculture. River prawns have been shown to reduce schistosomiasis transmission by 66 consuming snails in the aquatic environment where people contact infested water <sup>14,15</sup>. Given 67 that schistosomiasis is a disease of poverty, combining the nutritional and economic benefits 68 of prawn aquaculture with disease control via prawn predation on snails may offer a 69 sustainable approach to combat schistosomiasis and improve well-being and economic 70 development in endemic areas. Here, we develop an integrated bio-economic-epidemiologic 71 model to investigate whether extensive prawn aquaculture (using either endemic M. 72 vollenhovenii or nonbreeding monosex aquaculture of M. rosenbergii) can be managed at 73 schistosome transmission sites such as rice paddies or enclosed points of water contact 74 where people are exposed <sup>15</sup> to simultaneously maximize profit and control schistosomiasis. 75 There is a rich history of environmental interventions for schistosomiasis that target the 76 intermediate snail hosts <sup>6</sup>. Molluscicides are effective in reducing snail populations and have 77 been used in integrated campaigns to control schistosomiasis in areas of South America,

78 Northern Africa, and Southeast Asia <sup>6-8</sup>. However, these approaches generally require

repeated applications of chemicals that may negatively affect non-target species in addition to *Schistosoma*-bearing snails <sup>9,10</sup>. A more sustainable approach for snail control involves the introduction of snail predators, such as river prawns, which have been shown to actively seek out and consume important intermediate hosts for human schistosomes in laboratory settings, including *Biomphalaria* and *Bulinus* snails <sup>11-13</sup>. Field trials in which crustacean predators have been introduced to reduce schistosomiasis transmission have been successful in reducing reinfection rates in humans following MDA <sup>14,15</sup>.

86 In addition to being voracious predators of snails <sup>13,16</sup>, river prawns are a valuable food 87 commodity<sup>17,18</sup>. The giant freshwater prawn *Macrobrachium rosenbergii* has been 88 domesticated and widely used in commercial hatchery-based aquaculture <sup>19</sup>, providing both 89 a key source of protein and encouraging local economic development <sup>20</sup>. Furthermore, 90 advances in the production of nonbreeding *M. rosenbergii* monosex populations reduces the 91 risk of prawn invasion in areas this species is not native, suggesting safe use of this biological 92 control agent globally <sup>21,22</sup>. In sub-Saharan Africa, where at least 90% of schistosomiasis cases 93 occur <sup>1,23</sup>, the native African river prawn *M. vollenhovenii* has been proposed as an alternative 94 to *M. rosenbergii* for aquaculture <sup>21</sup>. Research into scalable *M. vollenhovenii* aquaculture is 95 ongoing, as the use of this native species may be more attractive due to its historical presence 96 in the local river ecology in western Africa.

97 Extensive prawn aquaculture, increasingly common in developing countries <sup>17-19</sup>, 98 consists of large enclosures, low prawn densities, and no use of supplemental feed, substrate, 99 or additional oxygenation. As such, extensive aquaculture is more compatible with the water 100 resource management needs of rural communities in key areas of sub-Saharan Africa, and 101 can be easily integrated into rice agriculture that is increasingly an important part of food 102 production and is present in many schistosomiasis endemic areas <sup>24,25</sup>. 103 Scaling the prawn aquaculture approach for schistosomiasis control requires that the 104 economic goals of prawn aquaculture are compatible with the public health goal of 105 schistosomiasis control. Thus, we seek to identify conditions under which schistosomiasis 106 reinfection in the human population may be curbed while maximizing the economic benefit 107 of prawn aquaculture. We first develop a bio-economic production model of Macrobrachium 108 spp. aquaculture to identify the stocking density and duration of the grow out phase that 109 maximizes profit for *M. rosenbergii* and *M. vollenhovenii*. Then, we expand an epidemiologic 110 model of schistosomiasis transmission dynamics to include snail size structure and infection 111 dynamics. This model is coupled with the aquaculture model through size- and density-112 dependent prawn predation, and parameterized via results of previous laboratory and field-113 based empirical studies. We use estimates of the disability adjusted life years (DALYs) lost 114 due to schistosomiasis infection derived from the integrated model to compare aquaculture-115 based prawn interventions with conventional MDA interventions, and to estimate the 116 benefits of utilizing both MDA and prawn aquaculture for schistosomiasis control. We 117 conclude with an extensive sensitivity analysis to evaluate the feasibility of such 118 interventions in a variety of settings.

### 119 Methods

120 The integrated model has three components: a) a bio-economic aquaculture component, 121 simulating yields and accounting for density-dependent mortality and somatic growth of 122 *Macrobrachium* spp. prawns over a range of initial stocking densities; b) an epidemiologic 123 component to simulate the dynamics of mean schistosome worm burden in humans and 124 population and infection dynamics of intermediate-host snails through a size structured, SEI 125 compartmental model; and c) a predation function describing the rate at which prawns 126 consume snails as a function of snail density and of snail and prawn body sizes, which links 127 the epidemiologic and aquaculture models.

#### 128 (a) Aquaculture model

We assume that a necessary supply chain of hatcheries and nurseries supplies juvenile prawns to stock at the desired transmission sites. The dynamics of a cohort of  $P_0$  juvenile prawns of initial mean length,  $L_0$  [mm], stocked at time t = 0 days in an enclosure of 1,000  $m^2$ —a size consistent with either a large water contact site or a typical rice field in small-scale, subsistence agriculture settings—are simulated over time as a function of density-dependent and size-dependent growth and mortality.

135 Adult *Macrobrachium rosenbergii* males can be grouped in three different categories that 136 grow at different rates depending upon their body size and developmental phase: small males 137 (SM) between 5-20g, orange-clawed males (OC) between 30-180g, and blue-clawed male 138 (BC) reaching up to 250 g, with growth of some smaller prawns being suppressed by the 139 largest BC males <sup>26</sup>. Though this same social structure has not been investigated for *M*. 140 volenhovenii, we assume here that it is the same. Growth of individual crustaceans is typically 141 stepwise and occurs through a sequence of molting events, but here the population-average 142 growth of prawns is modeled as somatic growth with the von Bertalanffy growth equation 143 (VBGE) <sup>27</sup>:

$$\frac{dL}{dt} = k^* (L_{\infty} - L) \tag{1}$$

145 VBGE produces a classic increasing-and-saturating growth curve with length *L* at time *t* (days 146 after stocking) eventually approaching the mean asymptotic length,  $L_{\infty}$ . Based on 147 experimental stocking trials showing reduced growth rates of *M. rosenbergii* at high stocking 148 densities <sup>26</sup>, a modified Brody growth coefficient,  $k^*$ , was estimated as a decreasing function 149 of total population biomass,  $\Omega$ :

150 
$$k^*(\Omega) = \frac{k_{max}}{1 + \gamma\Omega(t)}$$
(2)

151 where  $k_{max}$  is the maximum value of the Brody coefficient at low densities and  $\gamma$  a coefficient

152 parameterized to produce a density-dependent reduction in somatic growth qualitatively

153 resembling that observed in experimental trials <sup>26</sup>.

154 Total population biomass,  $\Omega(t)$ , is computed as the product of mean prawn body size in 155 grams, B(t), and population size, P(t), t days after stocking:

156 
$$\Omega(t) = B(t)P(t) \tag{3}$$

157 Body size B(t) is derived as an allometric function of prawn length, L(t), from *M. rosenbergii* 158 grow-out data <sup>28,29</sup>:

159 
$$B(t) = a_P L(t)^{b_P}$$
 (4)

As prawns are generalist consumers with a wide range of invertebrate fauna and organic
detritus in their diet <sup>30</sup>, growth as described by eq. 1-4 is assumed independent from snails'
density and the corresponding predation rates.

163 After stocking, the total number of prawns in the enclosure decreases over time, with *per-*164 *capita* mortality rate modeled as an additive function of two components: (*i*) an exponentially 165 decreasing function of body size, B(t), as large prawns exhibit lower mortality than small 166 prawns <sup>31</sup>; (ii) a linearly increasing function of total population biomass,  $\Omega(t)$ , which accounts 167 for density-dependent competition for resources and cannibalism at high population 168 densities <sup>26</sup>. Accordingly, the dynamics of a cohort of initial size  $P_0$  was described as follows:

169 
$$\frac{dP}{dt} = -P(\mu_P B^{-d} + \omega\Omega)$$
(5)

170 with parameters  $\mu_P$  and *d* derived from previous studies <sup>31,32</sup> and  $\omega$  parameterized to 171 produce density-dependent mortality outcomes qualitatively similar to those observed in the 172 experimental trials by Ranjeet and Kurup <sup>26</sup>. Natural recruitment is excluded from the 173 aquaculture model, as new prawns enter the system only in discrete, exogenously controlled events, when  $P_0$  prawns of initial average body size  $L_0$  are stocked from nurseries and grown out to market size. We assume natural, size- and density-dependent mortality are the only causes of prawn population decline and do not consider other sources such as predation by e.g. seabirds, escape from enclosures or rice fields, disease outbreaks, or declines in water quality that may affect prawn health.

Prawns weighing <30g are generally not of commercial interest, therefore only OC and BC males are considered marketable. Experimental trials by Ranjeet and Kurup with *M. rosenbergii* <sup>26</sup> showed the fraction of retrievable, market-size (>30g) prawns decreases linearly with increasing prawn stocking density. Accordingly, commercial yield at the end of a production cycle of length t = T is only a fraction of the total biomass:

184 
$$Y(T, P_0) = \zeta(P_0) \cdot \Omega(T)$$
(6)

185 where  $\zeta$ , the fraction of marketable size prawns in the population, is a decreasing function of 186 initial stocking density  $P_0$  estimated from data in the Ranjeet and Kurup experiments <sup>26</sup>.

187 Cumulative profits over a finite time horizon are determined by the profit produced per 188 cycle and the number of cycles completed within the given time period. In a time period of 189  $T_{max}$  days, the number of aquaculture cycles completed for each *Macrobrachium* species (sp) 190 is  $n^{sp} = \text{round}(\frac{T_{max}}{T})$ . Cumulative discounted profit for each species,  $CP^{sp}$ , is then estimated 191 as the sum of net discounted revenue for every cycle completed by  $T_{max}$ :

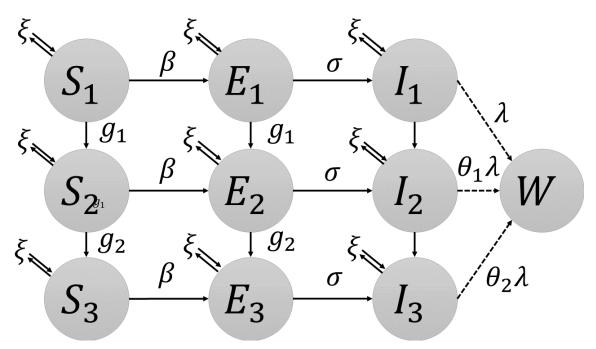
$$CP^{sp}(P_0, T, T_{max}) = \sum_{n=1}^{n^{sp}} (-cP_0 + pY(T, P_0))e^{-\delta nT}$$
(7)

192 where *p* is the price per unit weight (USD/kg), *c* the per capita cost of stocked juvenile 193 prawns, and  $\delta$  the discount rate to account for the time lag between initial stocking costs and 194 delayed revenues of commercial size prawns. Following the comprehensive price analysis by 195 Dasgupta and Tidwell, we set c = \$0.10/P for a juvenile prawn of  $L_0 = 40mm$  196 (corresponding to ~0.35*g* juvenile prawns) and  $p = \frac{12}{kg}$  harvested <sup>33</sup>. The discount rate 197 is set to 7%, which is likely on the low end for sub-Saharan African countries endemic with 198 schistosomiasis but higher than the 3-4% rate used for discounting long term government 199 projects in the United States <sup>34</sup>. Other costs such as maintaining nurseries to produce juvenile 200 prawns are considered external to the aquaculture scenario considered here and are 201 therefore not included in the profit estimation. The influence of such costs are considered in 202 additional sensitivity analyses described below.

203 Cumulative discounted profits are maximized by jointly choosing the rotation length, T, 204 and the initial stocking density,  $P_0$ . Given the rotation length, the number of rotations in the 205 time period is determined, as  $T_{max}$  is given. Equation 7 has it basis in the optimal rotation 206 models in forestry (see, e.g., <sup>35</sup>) and commercial aquaculture operations (see, e.g., <sup>36,37</sup>) which 207 balance the marginal benefits of further growth against the opportunity costs of waiting to 208 harvest. The resulting optimal rotation length is therefore shorter than a simple rule of when 209 to harvest based solely on maximizing growth dynamics. In our setting, we expect the same 210 trade-off between benefits from waiting to harvest the prawns at a larger size against the 211 opportunity costs of delaying the economic returns from future harvests. 212 Parameters used in the prawn aquaculture model simulations are listed in Table S1.

### 213 **(b)** Epidemiologic model

214 Building on our previous modeling of *S. haematobium*<sup>15,38</sup>, the infection dynamics of the 215 intermediate host snail population, N, are modeled as snails transition between  $i \in \{S, E, I\}$ 216 infection compartments corresponding to susceptible (S), exposed (E, pre-patent), and 217 infected (*I*, patent) states. Furthermore, the growth dynamics of snails are modeled as they 218 move through  $j \in \{1, 2, 3\}$  size classes corresponding to 4mm, 8mm, and 12mm mean snail 219 diameter (Fig. 1). The model is further extended to include snail migration with a constant 220 migration rate,  $\xi$ , to and from an external population,  $N^E$ , that is not affected by prawn 221 interventions. For simplicity, the external population is conceptualized to originate from an 222 identical transmission site to the one in which interventions are modeled, though in reality, 223 multiple sites with heterogeneous transmission dynamics may contribute differentially to the 224 intervention site.



226

227 228 **Figure 1**: Epidemiologic model schematic with snail size and infection classes. Parameters governing

transitions between classes and migration into and out of each class are shown.

230 New snails enter the population as susceptible juveniles, i.e. in infection class i = S and 231 size class j = 1. Logistic snail population growth is modeled with *per-capita* recruitment,  $f_i$ 232 and carrying capacity, K. Neither small snails (i = 1) nor infectious snails (i = 1) contribute 233 to recruitment due to sexual immaturity and parasitic castration, respectively <sup>39</sup>. Pre-patent 234 snails' contribution to recruitment is reduced by a fraction 0 < z < 1 <sup>40</sup>. Snails of each size 235 class are subject to both size-dependent natural mortality,  $\mu_i$ , and predation mortality,  $\psi_i$ , a 236 function of both prawn and snail body size and density described in the next section. Small 237 and medium snails grow and transition to the next size class at the per capita rate  $g_1$  (from 238 size class 1 to 2) and  $g_2$  (from class 2 to 3), respectively.

239 New snail infections occur at the per capita rate,  $\beta M$ , where  $\beta$  is the transmission rate 240 and  $M = 0.5\phi(W)WHm$  is an estimate of the overall number of *Schistosoma* miracidia (free 241 living infective stages) produced by mated adult female worms. This estimate is the product 242 of the size of definitive human host population, *H*, the mean parasite burden, *W*, (i.e., mean 243 number of adult worms per person), the rate at which mated adult female worms shed eggs 244 that hatch into infectious miracidia, m, and the function  $\phi(W)$  representing the density-245 dependent mating probability of adult worms <sup>41</sup>. The coefficient 0.5 accounts for the assumed 246 1:1 sex ratio of adult worms. For simplicity, we assume a constant human population and no 247 density dependent fecundity of female worms. Following infection, pre-patent snails, E, 248 transition to the patent class, I, at rate  $\sigma$ , with  $\sigma^{-1}$  being the mean time necessary for 249 sporocyst development following snail infection with a miracidium.

The adult parasite population harbored by definitive human hosts is modeled as the mean parasite burden in the human population, *W*, assuming a negative binomial distribution with clumping parameter,  $\varphi^{41,42}$ . Humans acquire adult worms as a result of contact with cercariae shed from infected snails. Worm acquisition occurs at rate  $\lambda$ , an aggregate parameter accounting for the *per capita* shedding rate of cercariae by infected snails, cercariae mortality,

contact rate, and probability of infection, as described in previous work <sup>15</sup>. The cercarial shedding rate of medium ( $N_{I2}$ ) and large ( $N_{I3}$ ) snails is assumed to exceed that of small ( $N_{I1}$ ) snails by a factor  $\theta_1$  and  $\theta_2$ , respectively <sup>43</sup>.

The full system of differential equations describing the epidemiologic model can be foundin the supplementary information along with model parameters listed in Table S2.

260

#### (c) Prawn predation model

261 As in previous work <sup>38</sup>, the per-capita prawn predation rate on snails of each class,  $\psi_{ii}$ , is 262 modeled as a type III functional response, described by a generalization of Holling's disk 263 equation <sup>44</sup>. This produces a sigmoid-shaped function, which increases and saturates at high 264 prey densities and decreases to approach zero at low prey densities. Previous experiments 265 by Sokolow et al <sup>13</sup> show that prawn predation of snails changes predictably as a function of 266 the ratio of prawn biomass to snail body mass,  $r_i$ . Using these experimental data, the attack 267 rate,  $\alpha$ , is estimated as a log-linear function of the biomass ratio:  $\alpha = \alpha_m * \log(r_i(t))$ . The handling time,  $T_h$ , is estimated as a reciprocal function of the biomass ratio:  $T_h =$ 268  $(T_{h_m}r_j(t))^{-1}$  where  $\alpha_m$  and  $T_{h_m}$  are coefficients estimated from <sup>13</sup> and  $r_j$  the ratio between 269 270 prawn body size and mean snail body size in each class. Laboratory experiments presented 271 in <sup>13</sup> show that small prawns are unable to feed on large snails (j = 3), accordingly,  $\psi = 0$ 272 when  $r_i < 3$ . In addition, the attack rate,  $\alpha$ , derived by Sokolow et al. <sup>13</sup> in controlled laboratory conditions in  $1m^{-2}$  tanks is penalized by a factor  $0 < \epsilon < 1$  to account for the 273 274 reduction in searching efficiency caused by the morphological complexity of foraging in wild 275 settings.

276 The biomass ratio for each snail size class is estimated as:

277 
$$r_j(t) = \frac{B(t)}{a_N L_{N_j}^{b_N}}$$
(8)

where B(t) is prawn body size derived with eq. (4), and the denominator represents snail mass in each class *j*, derived as a simple allometric function of snail shell diameter in each size class. The *per-capita* attack rate of prawns on snails of size *j* and infection class *i* is then estimated as:

282 
$$\psi_{ij} = \begin{cases} \frac{\alpha(r_j(t))\epsilon N_{ij}^n}{1 + \sum_{i=S}^{I} \sum_{j=1}^{3} \alpha(r_j(t))\epsilon T_h(r_j(t))N_{ij}^n}, & r_j \ge 3\\ 0, & r_j < 3 \end{cases}$$
(9)

Prawn stocking at the considered densities is assumed to have no negative effects on water quality that may affect prawn survival, growth, predation of snails, or snail population dynamics, though ongoing field experiments in the lower Senegal River basin show that water quality may be negatively affected by nets installed to contain prawns introduced at transmission sites.

288 Parameters of the snail predation component of the combined model are listed in Table S3.

#### 289 Model simulations

290 We consider a time horizon of  $T_{max} = 10$  years, for comparability to similar analyses 291 investigating different schistosomiasis intervention strategies <sup>7,45</sup>. Because prawn body size 292 increases and levels off with time (eq. 1-3), but prawn abundance decreases in time (eq. 5), 293 both stock biomass and cumulative profit (eq. 7) are unimodal functions of time for any given 294 initial stocking density,  $P_0$ . Additionally, harvesting prior to peak profit may afford the 295 opportunity to increase *n*<sup>*sp*</sup> and therefore sacrifice short term profits to maximize long term 296 profit. It is thus possible to use equations 1-7 to simulate prawn aquaculture dynamics and 297 numerically find the stocking density,  $P_0$ , and harvest time, T, that maximize cumulative 298 profit. The surface of values  $(P_0, T, CP^{sp}(P_0, T, T_{max}))$  is related to the eumetric curve used in 299 fishery science to identify the stocking density that maximizes profit <sup>46</sup>. As stocking costs 300 increase linearly with stocking size,  $P_0$ , while revenues increase less than linearly as a

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301 consequence of density-dependent growth and mortality, the surface is unimodal and its 302  $CP_{ont}^{sp} =$ peak represents the maximum achievable cumulative profit, 303  $max(CP^{sp}(P_0, T, T_{max}))$ . Therefore, for each *Macrobrachium* species (*sp*) and a time period 304 of  $T_{max} = 10$  years it is possible to identify the stocking density,  $P_{0opt}^{sp}$ , and harvest time,  $T_{opt}^{sp}$ , that maximize cumulative profit,  $CP_{opt}^{sp}$ , here collectively defined as optimal management. We 305 306 identify optimal management for each prawn species using a grid search over initial stocking densities,  $P_0$ , ranging between  $0.5 - 7.5 Pm^{-2}$  and potential harvest times, *T*, on each day 307 308 between 1 – 730.

Given the optimal stocking density,  $P_{0 opt}^{sp}$ , that maximizes cumulative profit and the 309 corresponding optimal harvest time in an individual cycle,  $T_{opt}^{sp}$ , the epidemiologic model is 310 311 run under the following scenarios: (1) 10 years of annual MDA with no prawn intervention; 312 (2) and (3); 10 years of prawn stocking and harvesting under optimal aquaculture 313 management for each species, as described above; and (4) and (5) 10 years of integrated 314 annual MDA and prawn intervention under optimal management. In all scenarios, we 315 simulate the system for an additional 10 years without intervention to explore the potential 316 for infection rebound in the case the intervention program is ceased.

Stocking and harvesting were simulated at regular intervals of  $T_{opt}^{sp}$  days, and were implemented as instantaneous events that reset the values of *P* and *L* to match the initial conditions at the beginning of each stocking cycle (i.e.  $P_{0}_{opt}^{sp}$  and  $L_0$ ). This assumes that all prawns—regardless of marketability—are harvested and replaced with  $P_{0}_{opt}^{sp}$  juveniles in a single day. Mass drug administration is implemented as an instantaneous 85% reduction in mean worm burden, *W*, in the same 75% of the human population, corresponding to assumptions of 85% drug efficacy and 25% systematic non-compliance <sup>45,47</sup>. To compare the effects of different interventions, we model disability associated with schistosomiasis using the disability adjusted life year (DALY) as in previous analyses <sup>7,48</sup>. Disability weights measuring the disability associated with a condition for a single year of life—where 0 is perfect health and 1 is death—were distributed among individuals with heavy (> 50 eggs per 10mL urine,  $H_{hi}$ ) and light (0 < eggs per 10mL urine  $\leq$  50,  $H_{lo}$ ) *S. haematobium* burdens as defined by WHO guidelines. Total DALYs over the simulation period are then estimated as:

$$\sum_{t=1}^{T_{max}} \frac{DW_{hi}}{365} H_{hi_t} + \frac{DW_{lo}}{365} H_{lo_t}$$
(10)

Where  $DW_{hi}$  and  $DW_{lo}$  are the yearly disability weights associated with heavy and light *S*. *haematobium* burdens, respectively, normalized to a daily estimate to match the dynamics of the epidemiological component of the model. Details on estimating the number of individuals in each burden class at each time step of the epidemiological model ( $H_{hi_t}$  and  $H_{lo_t}$ ) are provided in the supplementary information.

The model was coded in R version 3.5.0 and simulated using the solver lsoda from the package deSolve <sup>49</sup>. To address concerns regarding reproducibility, all model code and data are included as a supplementary file and are also made freely available online at <u>https://github.com/cmhoove14/Prawn fisheries Public health</u>.

## 340 Sensitivity analyses

To quantify the influence of uncertain parameter inputs on key model outcomes, latin hypercube sampling is performed over parameter ranges in Table S1 to generate a set of 1,000 candidate sets. These parameter sets are used to derive estimates of uncertainty in the simulations described above. Furthermore, global sensitivity analysis using latin hypercube sampling and partial rank correlation coefficients (LHS-PRCC) <sup>50,51</sup> is performed with optimal

cumulative profit  $(CP_{opt}^{sp})$  as the outcome in the prawn aquaculture model, equilibrium 346 347 infected snail density  $(N_I)$  and mean worm burden (W) absent prawn or MDA interventions 348 as the outcomes in the epidemiologic model, and total DALYs accumulated through simulated 349 10-year combined MDA and prawn interventions as the outcome in the integrated model. 350 Briefly, PRCC estimates the correlation between a model parameter and a model outcome by 351 first rank-transforming parameters drawn from an LHS scheme and the corresponding model 352 outputs, then removing the linear effects of all other model parameters on the parameter of 353 interest and the outcome, and finally measuring the linear relationship between the rank-354 transformed parameter and outcome residuals <sup>50</sup>. Monotonicity of the relationship between 355 model outputs and all parameters was assessed via scatterplots (Figs S1-S4) prior to 356 conducting LHS-PRCC sensitivity analyses.

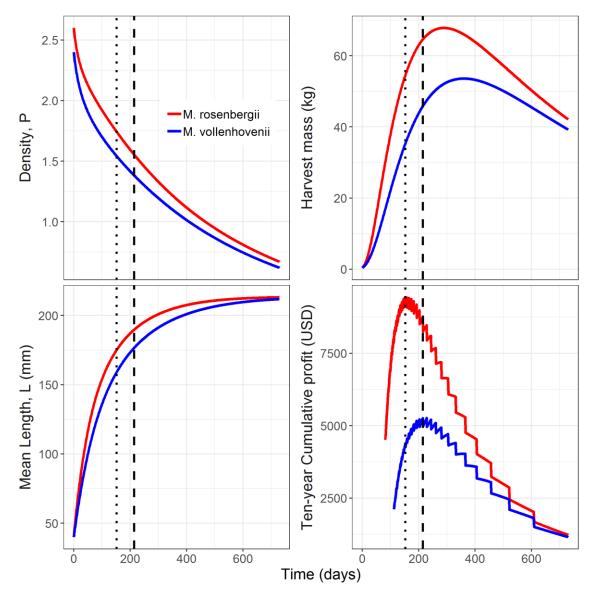
357 Two additional sensitivity analyses are performed to identify profitability thresholds for 358 the prawn aquaculture model. In the first, fixed costs,  $c_f$ , in the range 0 - 1,000 are added 359 to the per-cycle profit calculation (eqn 7; such that total cost for each cycle is  $-(cP_0 + c_f)$ ) to 360 represent additional costs that may be incurred with each aquaculture cycle such as labor, 361 transport of prawns, and nursery costs leading up to stocking. In the second, the prawn 362 mortality rate,  $\mu_P$ , is multiplied up to 10 times the estimated natural rate to account for 363 additional sources of prawn loss that may be incurred due to predation, escape, or other 364 sources of mortality, such as disease.

365 <u>Results</u>

#### 366 Aquaculture model

With parameters fixed at the values shown in Table 1, stocking *M. rosenbergii* at  $P_0 = 2.6 Pm^{-2}$  and harvesting at  $T_{opt}^{ros} = 165 days$  maximizes cumulative ten-year profit while stocking at  $P_0 = 2.4 Pm^{-2}$  and harvesting at  $T_{opt}^{ros} = 260 days$  maximizes cumulative profit

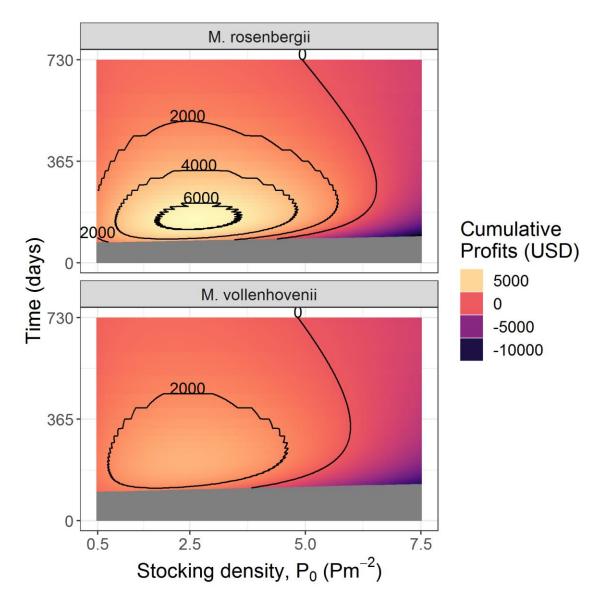
370	for <i>M. vollenhovenii</i> . These stocking densities and harvesting times were used to simulate
371	aquaculture cycles for each species. Figure 2 shows the dynamics of each species run
372	continuously through two years with vertical dashed lines indicating the optimal time of
373	harvest, $T_{opt}^{sp}$ . Prawns grow in length, L, and weight over time while population size
374	(measured as density, $Pm^{-2}$ ) decreases with time as a result of density dependent death from
375	crowding and natural, size-dependent mortality (Fig 2). These competing effects lead to a
376	humped function of total harvestable biomass, $\varOmega$ , over time with the peak occurring well
377	before prawns grow to their full size. Ten-year cumulative profits also have a single peak,
378	which is determined both by the profit per cycle and the number of cycles possible within the
379	10 year time frame. Cumulative profits are maximized by harvesting well before the peak in
380	harvestable biomass occurs, indicating more, smaller harvests maximize profit over time.



381

382 Figure 2: Prawn aquaculture model dynamics. Two-year aquaculture cycles for, M. rosenbergii (red 383 lines) and *M. vollenhovenii* (blue lines) under optimal management showing how prawns grow in 384 length over time (bottom-left), but decrease in density (top-left). This leads to a single peak in 385 harvest mass (top-right), but harvesting actually occurs prior to the peak in order to maximize ten-386 year cumulative profits (bottom-right) by sacrificing profit-per-cycle for completing more 387 aquaculture cycles. Vertical dashed lines indicate time at which harvest would occur for each species 388 (small dashes – M. rosenbergii, large dashes – M. vollenhovenii). Here, following (19), we set the cost c 389 for a juvenile prawn to \$0.10 with  $L_0 = 40mm$  (~0.35g per juvenile prawns) and selling price 390 p=\$12/kg. Other parameters set as in Table 1.

392	The surface of values $(P_0, T, CP^{sp}(P_0, T, T_{max}))$ for each species is shown in Figure 3. As
393	expected, profits associated with aquaculture of the faster growing <i>M. rosenbergii</i> are higher.
394	Considering parametric uncertainty, the peak estimate of median cumulative profit for $M$ .
395	rosenbergii occurs at $P_0 = 2.9 Pm^{-2}$ and $T_{opt}^{ros} = 173 days$ (IQR: 146 – 192), producing
396	$CP_{opt}^{ros} = $5364 ($3192 - $8111) \text{ per } 1,000 m^2 \text{ enclosure.}$ The same estimates for
397	<i>M. vollenhovenii</i> are $P_0 = 2.5 Pm^{-2}$ , $T_{opt}^{vol} = 260 days (228 - 331)$ , and $CP_{opt}^{vol} =$
398	\$1738 (\$704 – \$3394). Additional outputs from the aquaculture model that describe stock
399	structure and aquaculture performances at optimal management are reported in Table 1.
400	



401

402Figure 3: Grid search to identify optimal management decisions for each prawn species. Cumulative403profits  $(CP^{sp})$  generated by the aquaculture model for each species across a range of potential404stocking densities  $(P_0)$  and harvest times (T) are shown. Grey regions indicate regions where405harvesting is not feasible due to prawns not having reached sufficient marketable size (30g).

406 Contours indicate regions of *CP*<sup>*sp*</sup> corresponding to the labeled value in 2018 USD.

408	Table 1: Optimal stocking and harvesting parameters for each prawn species reported as median
409	(interquartile range).

<u>Parameter</u>	Definition	<u>M. vollenhovenii</u>	<u>M. rosenbergii</u>
P <sub>0</sub> <sup>sp</sup> <sub>opt</sub>	Optimal stocking density	$2.4 Pm^{-2}$	$2.6 Pm^{-2}$
L <sub>0</sub>	Stocking size of juveniles	40 <i>mm</i>	40 <i>mm</i>
T <sup>sp</sup> <sub>opt</sub>	Optimal harvest time	260 days	165 days
* opt		(228 – 331)	(146 – 192)
$L(T_{opt}^{sp})$	Mean length at harvest	167 <i>mm</i>	167 <i>mm</i>
<sup>2</sup> ( <sup>1</sup> opt)	Mean length at hai vest	(161 – 175)	(161 - 174)
$P(T_{ont}^{sp})$	Prawns harvested	1056	1559
( opt)	Flawiis nai vesteu	(850 – 1236)	(1434 – 1662)
$Y(T_{opt}^{sp}, P_{0opt}^{sp})$	Commercial yield per harvest	28 kg	41 kg
( opt, Oopt)	Commercial yield per harvest	(21 – 36)	(34 - 49)
n <sup>sp</sup>	Number of cycles in 10 years	14	22
<i>n</i> ·		(11 – 16)	(19 – 25)
CP <sup>sp</sup>	Cumulative profits over 10	\$1891	\$5403
CI opt	years	(\$856 - \$3486)	(\$3380 - \$8075)

410

#### 412 Integrated aquaculture epidemiologic model

413 Simulation of the integrated model reveals comparable performance of prawn 414 intervention strategies to MDA strategies. As in previous analyses <sup>7,15</sup>, annual mass drug 415 administration alone produces a pattern of gradually decreasing worm burden over time 416 characterized by repeated rebound in infection following MDA (Fig 4A, purple line). The 417 prawn-only intervention causes mean worm burden to gradually decline towards 0, 418 eventually reducing worm burden to comparable levels by year 10 (Fig 4A, blue line). Finally, 419 the combined MDA and prawn intervention leads to a rapid decline in mean worm burden 420 that nearly reaches 0 by year 10 (Fig 4A, gold line).

421 These patterns can mostly be explained by the underlying snail infection dynamics. Under 422 MDA intervention, the snail population persists through repeated rounds of MDA and even 423 increases due to the reduced influence of infection (Fig 4B). Most importantly, a population 424 of infected snails is able to sustain transmission—albeit at lower levels—even as adult worms 425 are removed from the treated human population by MDA (Fig 4B). Interventions in which 426 prawns are introduced at profit-optimal densities produce rapid declines in the snail 427 population that heavily reduce this environmental reservoir of transmission (Fig 4C). 428 Extirpation of the entire snail population is prevented due to the assumption of a Holling's 429 type III functional response and immigration from an unaffected reservoir population (see 430 Fig S3 for snail infection dynamics without immigration and under a Holling's type II 431 functional response), but transmission is effectively halted due to near elimination of the 432 infected snail population (Fig 4C). This heavy reduction in transmission coupled with the 433 benefits of MDA translates to near elimination of the parasite by year 10. Regardless of the 434 intervention, ceasing efforts to control transmission after 10 years results in rapid returns to 435 pre-intervention snail populations and community-level mean worm burdens (Fig 4A-C).

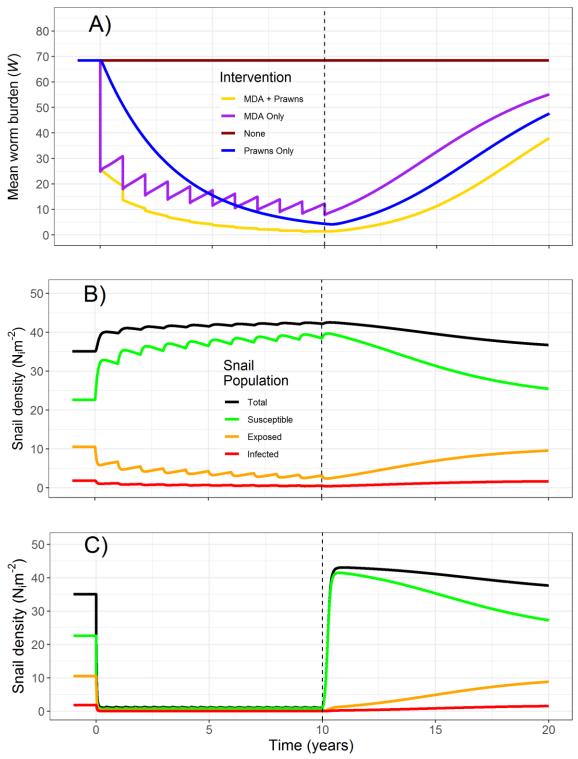




Figure 4: Outputs of the integrated model under different intervention scenarios implemented over 438 ten years followed by ten years of no intervention. Worm burden trajectories under no intervention 439 (red), annual MDA only (purple), prawn stocking of *M. rosenbergii* under optimal management (blue), 440 and both annual MDA and prawn stocking (gold) (A); snail infection dynamics under MDA only 441 intervention (B); and snail infection dynamics under prawn stocking interventions (C). Outputs from 442 *M. volenhovenii* interventions not shown as they approximately mirror those of *M. rosenbergii*.

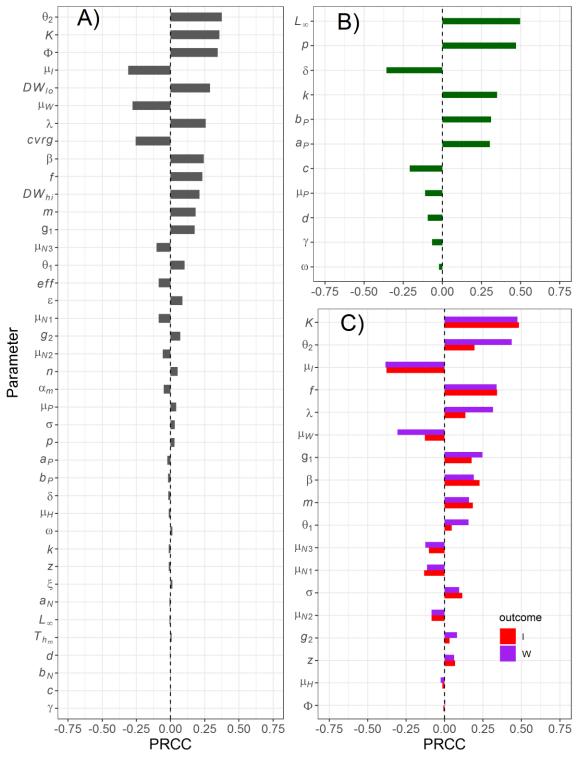
443 Comparison of total DALYs lost over ten year simulation periods under each intervention 444 shows comparable performance of the prawn only intervention to MDA and ubstantial 445 additional DALYs averted when combining MDA with prawn intervention. Without intervention a median 324 (IQR: 119 – 502) DALYs are lost to S. haematobium infection. 446 447 Annual MDA and profit-optimal stocking of prawns perform comparably with 160 (IQR: 54 – 448 285) total DALYs lost with annual MDA and 184 (IQR: 70 – 294) total DALYs lost with profit-449 optimal prawn stocking; representing 51% and 43% DALYs averted, respectively. Integrated 450 interventions utilizing both MDA and prawn stocking reduce median DALYs lost to 83 (IQR: 451 30 – 137), representing a 74% reduction in *S. haematobium* related disability.

### 452 Sensitivity Analyses

453 Substantial sensitivity analyses reveal that profitability of the prawn aquaculture system 454 and reductions in schistosomiasis burden associated with prawn introductions are robust to 455 model assumptions and parameters (Figs S1 and S2). The addition of fixed costs associated 456 with each aquaculture cycle and additional sources of mortality reveal aquaculture of M. 457 rosenbergii remains profitable with fixed costs of up to \$550 per cycle (Fig S1) and mortality 458 rates up to 5.2 times higher than the baseline estimate (Fig S2). Aquaculture of M. 459 vollenhovenii remains profitable with fixed costs of up to \$400 per cycle (Fig S1) and 460 mortality rates up to 3.6 times higher than the baseline estimate (Fig S2). Global sensitivity 461 analysis using LHS-PRCC shows that the parameters of the VBGE that govern prawn growth 462 dynamics  $(L_{\infty},\kappa)$  and parameters governing estimates of discounted profits  $(\delta,p)$  are most 463 correlated with 10-year cumulative profits (Fig 5B)

Exploration of snail infection dynamics under prawn interventions also reveals that the Holling's type III functional response and the inclusion of snail migration represent conservative structural model assumptions. Figure S3 shows that snail extirpation is only possible when both of these assumptions are relaxed. Parameters governing snail predation 468 by prawns ( $\epsilon$ , n) are also shown to have moderate influence on estimates of 10-year 469 cumulative DALYs lost (Fig 5A).

- Key outcomes from the epidemiologic model including equilibrium estimates of infected
  snail density (*I*) and mean worm burden (*W*) and of DALYs lost over 10-year intervention
  periods is mostly influenced by epidemiologic parameters, rather than parameters governing
  prawn population or predation dynamics (Fig 5A & 5C). We also compared parameter sets in
  which the MDA only intervention was superior to the prawn only intervention in terms of
- 475 DALYs averted. We find that the MDA only intervention leads to more DALYs averted when
- 476 the coverage and efficacy are high, while the prawn-only intervention performs better when
- 477 the snail population carrying capacity (*K*) is higher (Fig S4).



479 480

Figure 5: Sensitivity of key model outcomes to model parameters assessed with LHS-PRCC. Sensitivity
to all parameters of DALYs lost following 10 years of combined MDA and prawn intervention (A),
cumulative 10-year profit sensitivity to prawn aquaculture parameters (B), and sensitivity of mean
worm burden and equilibrium infected snail density to epidemiologic parameters (C). Parameter
definitions and baseline values can be found in supplementary tables 1-3.

#### 486 Discussion

Small-scale, extensive prawn aquaculture such as that considered here offers a profitable and sustainable method to improve food production, reduce schistosomiasis burdens, and increase revenues for small-scale subsistence farmers, especially when paired with ongoing efforts such as rice cultivation <sup>25</sup>. In areas of high food insecurity, malnutrition, and endemic schistosomiasis—conditions which reinforce each other and often result in "poverty traps" <sup>52,53</sup>—an integrated system of prawn aquaculture may be a solution for co-benefits of disease control and sustainable development.

494Our results are consistent with an increasing body of evidence that consumption of snails495by predator species such as *Macrobrachium* prawns can be an effective method for combating496schistosomiasis transmission to people 14,15,54. Specifically, by targeting the environmental497reservoir of schistosome parasites, prawns can reduce reinfection rates that plague MDA498campaigns in high transmission settings. By deploying prawn aquaculture with MDA,499effective control—in which the schistosome parasite is suppressed in both human hosts and500intermediate host snails—can be achieved.

501 We also show that such prawn interventions combined with established extensive 502 aquaculture methods can be profitable if carefully managed. Drawing on economic studies of 503 existing aquaculture practices <sup>19,33</sup>, we develop—to our knowledge—the first dynamic model 504 of prawn aquaculture to investigate optimal management practices. The model suitably 505 simulates prawn stocking in a large water contact site or rice paddy, and the length of optimal 506 cycles coincides with typical rice harvesting timelines <sup>25</sup>. We find that this system produces 507 short- and long-term profits, implying the potential for a sustainable, community-driven 508 intervention, given the right capital investment and incentive programs.

509 Under optimal management, extensive aquaculture of of either *M. rosenbergii* or *M.* 510 *vollenhovenii* leads to both profits and reductions of the snail population. The optimal 511 stocking densities of each species are above the potential threshold of approximately  $2 Pm^{-2}$ 512 necessary for local snail extirpation as identified in previous work <sup>15</sup>, though our conservative 513 inclusion of snail migration and a Holling's type III functional response restricts such an 514 outcome in this analysis.

515 Achieving these stocking densities may be challenging in sub-Saharan Africa where >90% 516 of the global burden of schistosomiasis is found <sup>23</sup> and where the proposed intervention is 517 likely to provide the most benefit. More than 50 years of domestication of *M. rosenbergii* has 518 established protocols for ideal rearing and management of aquaculture efforts with this 519 species <sup>18,19</sup>, whereas similar protocols for the African native *M. vollenhovenii* are still under 520 development. Profits appear to be highly sensitive to parameters that regulate prawn growth, 521 meaning continued research and development into *M. vollenhovenii* aquaculture may 522 eventually provide comparable profits to *M. rosenbergii*. However, in the short term, all male 523 stocking of *M. rosenbergii* may be a superior strategy.

524 This strategy of stocking the non-native *M. rosenbergii* in coastal regions where it is non-525 native should be approached with caution to avoid the establishment of an alien population 526 with potentially unintended ecological consequences on local biodiversity. Establishment of 527 non-GMO aquaculture biotechnologies for either all-male <sup>55–57</sup> or all-female <sup>58</sup> populations 528 suggest possible strategies to prevent invasions. Moreover, recent laboratory experiments 529 (Savaya-Alkalay et al. submitted) have ruled out the possibility of cross-fertilization between 530 mature female *M. vollenhovenii* and male *M. rosenbergii*, demonstrating that male-only 531 progeny of *M. rosenbergii* may be safely used for extensive aquaculture and schistosomiasis 532 control in western Africa where *M. rosenbergii* is non-native.

Extensive sensitivity analyses reveal that key model outcomes including profit generated by the aquaculture portion of the model and DALYs lost from the integrated model are robust to key parameters that govern profit estimation and the influence of prawn interventions on 536 DALYs lost. The prawn aquaculture model is most sensitive to parameters governing somatic 537 growth, which have been estimated from available literature, and supported by expert 538 opinion <sup>28,32</sup>. This finding also suggests that if stock improvement or improvements in 539 husbandry practices can increase average prawn condition or size, i.e. by supplementing 540 feeds, further increases in profit may be possible. Selective harvesting methods that only 541 remove market-size prawns, leaving the remaining stock to continue to grow, may also 542 improve aquaculture performance.

543 Optimal aquaculture practices are also sensitive to the market price of adult prawns and 544 the stocking cost of juvenile prawns, implying that optimal management may be influenced 545 by fluctuations in market factors that may influence price and cost of harvested and stocked 546 prawns. Profit generated from selling harvested prawns is based on reasonable assumptions 547 of prices in premium markets, though the actual selling price in subsistence economies might 548 be lower and contingent on market access and local demand. However, the fixed cost 549 sensitivity analysis demonstrates profitability is possible even with substantial additional 550 costs associated with prawn stocking, and profitability persists across a wide range of 551 stocking densities for each species. These results together assuage concerns that such 552 vagaries of the market would impair the success of the proposed system and suggest that 553 prawn aquaculture should be economically viable even under non-optimal management 554 densities.

Additional sources of mortality could result from declines in water quality caused by prawn stocking, disease outbreaks, or predation by waterbirds, fish, amphibians or reptiles. We demonstrate that extensive aquaculture is still profitable with mortality rates as high as five times greater than natural mortality. Barring catastrophic events, this demonstrates that the proposed system should be resilient to such perturbations. Therefore, further field work is required to assess prawn life expectancy, escapement rate, growth performances, changes in water quality, and potential changes in human behavior which might affect either
aquaculture performances and/or snail abundance, transmission rates, and epidemiologic
outcomes.

564 Prawn predation of the snail population as modeled here is also based on a number of 565 assumptions including the Holling's type III functional response and the prawn attack rate 566 penalty. We consider the type III functional response a conservative estimate of the 567 relationship between prawn predation and snail density as it does not allow for the potential 568 extirpation of the snail population. We also test a wide range of attack rate penalties as we 569 identified no prior estimates of prawn predation efficiency in non-laboratory settings, and 570 find that effective control is feasible even when increasing this parameter by an order of 571 magnitude (implying a substantially reduced attacked rate).

572 Regarding schistosomiasis transmission dynamics, recent findings suggest non-573 linearities in the human-to-snail force of infection may decrease the efficacy of MDA and lead 574 to faster post-MDA rebounds of schistosomiasis <sup>59</sup>. While this may alter the effects of MDA in 575 our simulations, we believe it strengthens the argument for strategies that explicitly target 576 the intermediate host snail population, such as the prawn intervention proposed here. 577 Another recent finding suggests that snail control can actually lead to increased human risk 578 of *Schistosoma* infection if the snail population is limited by resource competition prior to 579 "weak" control efforts <sup>60</sup>. In this scenario, remaining snails with higher per-capita resource 580 availability may produce more cercariae. Given the large magnitude of snail reductions at the 581 proposed prawn densities modeled here—even given the conservative Holling's III functional 582 response—we believe this effect is unlikely in our scenarios. Finally, our model lacks 583 seasonality, which would likely affect both schistosomiasis transmission and prawn growth 584 as e.g. temperature and rainfall fluctuate through the year, especially in sub-tropical and near 585 temperate regions where schistosomiasis is still endemic, such as in northern Africa <sup>61,62</sup>.

586 This bioeconomic analysis shows that an integrated intervention strategy that utilizes 587 both MDA and a profitable prawn aquaculture system can successfully control 588 schistosomiasis while generating profit. Since the intervention is driven by a profitable 589 business model, it may be sustainable purely through market incentives, and thereby reduce 590 the need for external support from donors or public health agencies. Subsidies are only likely 591 to be necessary in the event that *M. rosenbergii* aquaculture is not suitable for the region and 592 obtaining large quantities of *M. vollenhovenii* juveniles is infeasible or expensive. Research 593 and development for this system is indeed ongoing in Senegal, which will aid future analyses 594 of the effectiveness and feasibility of this promising integrated strategy.

# 595 Data Availability

All data and code used to conduct this analysis are provided as a supplementary file and are
 freely available at <a href="https://github.com/cmhoove14/Prawn\_fisheries\_Public\_health">https://github.com/cmhoove14/Prawn\_fisheries\_Public\_health</a>

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# 615 <u>Author information</u>

# 616 Contributions

- 617 GADL and SHS conceived the problem and designed the general modelling framework. CMH,
- 618 SHS, JK, JVR, and GADL developed the analysis. CMH and JK wrote the simulations scripts. GR
- 619 collected field data to parameterize the epidemiologic model. SHS provided experimental
- 620 data to parameterize the predation component of the model. JNS provided guidance on profit
- 621 estimation of the prawn aquaculture model. AS-A, SC, and AS provided guidance on dynamics
- 622 of the aquaculture model. CMH, JK, JNS, JVR, and GADL drafted the manuscript and all authors
- 623 contributed to its editing.
- 624 **Competing interests**
- 625 The authors declare no competing interests
- 626

# 627 Supplementary Information

628 <u>**Table S1**</u>: Parameters of the prawn aquaculture model and ranges used in the global sensitivity analysis

Parameter	Value & Units	Description	Source	Range
$L_{\infty}$	214 mm	Maximum length used in von Bertalanffy growth equation	32	[184, 234]
к	$0.0034 \frac{mm}{day}$	Growth rate of Macrobrachium vollenhovenii	32,63	[0.0078, 0.012]
	$0.0104 \frac{mm}{day}$	Growth rate of Macrobrachium rosenbergii	29	
γ	$3.5 \times 10^{-6} g^{-1}$	Density dependent growth reduction	26	$[3.5 \times 10^{-6}, 6.5 \times 10^{-6}]$
<i>a</i> <sub>P</sub>	0.00244	Allometric parameter for <i>Macrobrachium</i> length- weight conversion	- 28 -	[0.066, 0.081]
b <sub>P</sub>	3.55	Allometric parameter for <i>Macrobrachium</i> length- weight conversion		[3.46, 3.64]
$\mu_P^{\dagger}$	$0.0061 \frac{P}{day}$	Daily prawn mortality rate	32,63	[0.0054, 0.012]
d	-0.382	Size-dependent mortality scaling coefficient	31	[-0.461, -0.289]
ω	$5.5 \times 10^{-9} g^{-1}$	Density dependent mortality factor	26	$[7.5 \times 10^{-9}, 3.5 \times 10^{-9}]$
р	$\frac{\$12}{kg}$	Price per kg of harvested market-size prawns	33,64,65	[11, 22]
δ	$\frac{1.99 \times 10^{-4}}{day}$	Discount rate	(7% annual)	[3%, 20%]
$c^{\dagger}$	$\frac{\$0.10}{P}$	Cost of a stocked juvenile prawn	33	[0.045, 0.12]

630	<sup>†</sup> See additional sensitivity analyses below

#### 632 Epidemiologic model equations

633 
$$\frac{dN_{S1}}{dt} = \xi N_{S1}^E + f \left( 1 - \frac{N}{K} \right) \left( N_{S2} + N_{S3} + z (N_{E2} + N_{E3}) \right) - (\mu_1 + g_1 + \psi_{S1} P + \xi + \beta M) N_{S1}$$
(S1)

634 
$$\frac{dN_{S2}}{dt} = \xi N_{S2}^E + g_1 N_{S1} - \psi_{S2} P - (\mu_2 + g_2 + \xi + \beta M) N_{S2}$$
(S2)

635 
$$\frac{dN_{S3}}{dt} = \xi N_{S3}^E + g_2 N_{S2} - \psi_{S3} P - (\mu_3 + \xi + \beta M) N_{S3}$$
(S3)

636 
$$\frac{dN_{E1}}{dt} = \xi N_{E1}^E + \beta M H N_{S1} - \psi_{E1} P - (\mu_1 + g_1 + \xi + \sigma) N_{E1}$$
(S4)

637 
$$\frac{dN_{E2}}{dt} = \xi N_{E2}^E + \beta M H N_{S2} - \psi_{E2} P - (\mu_2 + g_2 + \xi + \sigma) N_{E2}$$
(S5)

638 
$$\frac{dN_{E3}}{dt} = \xi N_{E3}^E + \beta M H N_{S3} - \psi_{E3} P - (\mu_3 + \xi + \sigma) N_{E3}$$
(S6)

639 
$$\frac{dN_{I1}}{dt} = \xi N_{I1}^E + \sigma N_{E1} - \psi_{I1}P - (g_1 + \mu_1 + \mu_I + \xi)N_{I1}$$
(S7)

640 
$$\frac{dN_{I2}}{dt} = \xi N_{I2}^E + \sigma N_{E2} + g_1 N_{I1} - \psi_{I2} P - (g_2 + \mu_2 + \mu_I + \xi) N_{I2}$$
(S8)

641 
$$\frac{dN_{I3}}{dt} = \xi N_{I3}^E + \sigma N_{E3} + g_2 N_{I2} - \psi_{I3} P - (\mu_3 + \mu_I + \xi) N_{I3}$$
(S9)

642 
$$\frac{dW_t}{dt} = \lambda (N_{I1} + \theta_1 N_{I2} + \theta_2 N_{I3}) - (\mu_W + \mu_H) W_t$$
(S10)

643 
$$\frac{dW_u}{dt} = \lambda (N_{I1} + \theta_1 N_{I2} + \theta_2 N_{I3}) - (\mu_W + \mu_H) W_u$$
(S11)

644

# 645 MDA Implementation and DALYs estimation

646 The model tracks treated and untreated segments of the population by dividing the 647 worm burden based on MDA coverage, such that total worm burden is a weighted average 648 of each population:  $W = cvrgW_t + (1 - cvrg)W_u$ . When MDA is implemented, mean worm 649 burden in the treated compartment is reduced by  $W_t(1 - eff)$ . We assume the dispersion 650 parameter of the negative binomial distribution in each population is constant over the 651 simulation period. To estimate the total number of individuals with heavy and light egg 652 burdens,  $H_{hi}$  and  $H_{lo}$ , respectively, we first sample n = H \* cvrg draws from a negative

binomial distribution with mean  $W_t$  and dispersion,  $\varphi$ , to represent the distribution of adult

- 654 worms in the treated segment of the human population. Similarly, we sample n = H \* (1 1)
- 655 cvrg) draws from a negative binomial distribution with mean  $W_u$  and dispersion,  $\varphi$ , to
- 656 represent the distribution of adult worms in the untreated segment of the human
- 657 population. We then convert these individual level adult worm counts, denoted  $W_h$ , to
- estimates of egg burden, denoted  $B_h$ , as:  $B_h = 0.5W_h\phi(W_h)\mathcal{E}$  where  $0.5W_h\phi(W_h)$  provides
- an estimate of the number of mated female (i.e. egg producing) worms and  $\mathcal{E}$  is an estimate
- of *S. haematobium* eggs per 10mL urine per mated adult female worm from [CITE]. With the
- full distribution of  $B_h$ , we can then estimate the number of individuals with heavy (> 50
- 662 eggs per 10mL urine,  $H_{hi}$ ) and light (0 < eggs per 10mL urine  $\leq$  50,  $H_{lo}$ ) *S. haematobium*
- burdens as defined by WHO guidelines and subsequently estimate DALYs as in equation 10.

Parameter	Value & Units	Description	Source	Range
f	$0.26 N_{S1} day^{-1}$	Per-capita recruitment rate of reproductive snails	15	[0.06, 0.36]
К	$50\frac{N}{m^2}$	Snail population carrying capacity	66	[25, 75]
Z	0.5	Proportion of pre-patent snails that reproduce	40	[0.25, 1]
$\mu_1$	$\frac{1}{50} day^{-1}$	Mortality rate of snails in size class 1		[25, 100]
μ <sub>2</sub>	$\frac{1}{75} day^{-1}$	Mortality rate of snails in size class 2	67,68	[50, 125]
$\mu_3$	$\frac{1}{100}  day^{-1}$	Mortality rate of snails in size class 3		[75, 150]
$\mu_I$	$\frac{1}{10}  day^{-1}$	Mortality rate of snails in infection class <i>I</i>	40	[7, 20]
ξ	$\frac{1}{5}$ year <sup>-1</sup>	Migration rate of snails	69	[0, 1]
<b>g</b> 1	$\frac{1}{37} day^{-1}$	Growth rate of snails in size class 1	- 70 –	[20, 60]
$g_2$	$\frac{1}{62} day^{-1}$	Growth rate of snails in size class 2		[40, 100]
σ	$\frac{1}{50} day^{-1}$	Pre-patent period; transition rate of snails in infection class <i>E</i> to infection class <i>I</i>	71	[30, 70]
$m^{\dagger}$	0.8	Infectious miracidia produced per mated adult female worm		[0.5, 1.5]
$oldsymbol{eta}^\dagger$	$4 \times 10^{-7}$	Pre-patent snails produced per infectious miracidia	15	$[2.0 \times 10^{-7} \\ 8 \times 10^{-7}]$
$\lambda^{\dagger}$	$7.5 \times 10^{-6}$	Adult worms produced per infectious cercaria shed by infected snails		$[5.0 \times 10^{-6}]$ $1.0 \times 10^{-5}]$
$ heta_1$	1.31	Increased relative production of infectious cercariae by snails in class $N_{I2}$	- 43 –	[1, 5]
$\theta_2$	7.88	Increased relative production of infectious cercariae by snails in class $N_{I3}$		[2, 10]
φ	0.08	Clumping parameter of the negative binomial distribution	38	[0.01, 0.3]
$\mu_W$	$\frac{1}{3.3} year^{-1}$	Mortality rate of adult worms	- 15 –	[2, 4]
$\mu_H$	$\frac{1}{60}$ year <sup>-1</sup>	Mortality rate of humans harboring adult worms		[50, 70]
DW <sub>hi</sub>	0.05	Disability weight associated with heavy <i>S. haematobium</i> egg burden	7,72	[0.03, 0.15]
DW <sub>lo</sub>	0.014	Disability weight associated with heavy <i>S. haematobium</i> egg burden	7,72	[0.003, 0.03
eff	0.85	MDA efficacy		[0.75, 0.95]
cvrg	0.75	MDA coverage		[0.5, 0.95]
$\mathcal{E}^{\dagger}$	3.6	Eggs produced per 10mL urine per mated adult female worm	73	[2, 5]

664 **Table S2**: Parameters of the schistosomiasis epidemiologic model

665 <sup>†</sup> Units provided in description

666	Table S3: Parameters regulating snail predation of snails, linking the aquaculture model to the
667	epidemiologic model

Parameter	Value & Units	Description	Source	Range
$a_N$	0.19	Allometric parameter for snail shell width-weight conversion		[0.1, 0.3]
$\boldsymbol{b}_N$	2.54	Allometric parameter for snail shell width-weight conversion		[2, 3]
α <sub>m</sub>	0.91	Parameter to estimate prawn attack rate from prawn-snail biomass ratio	. 13 —	[0.5, 1.5]
$T_{h_m}$	0.39	Parameter to estimate prawn handling time from prawn-snail biomass ratio	·	[0.2, 0.5]
n	2	Exponent of Holling's type III functional response	38	[1.1, 4]
ε	10%	Prawn predation attack rate penalty associated with searching for prey in wildlife rather than laboratory conditions	Estimated as 10% of laboratory- determined rates with wide range investigated in sensitivity analysis	[1, 100]

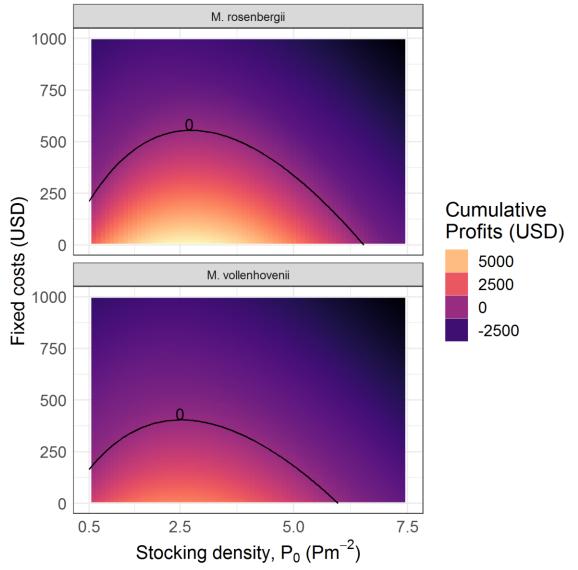
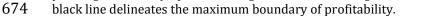
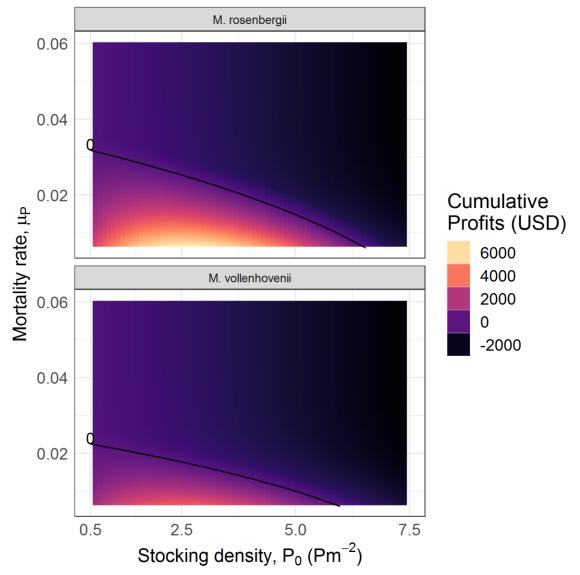
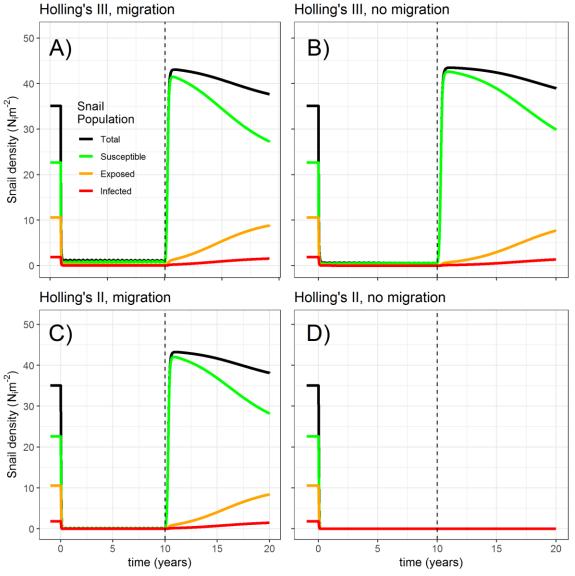


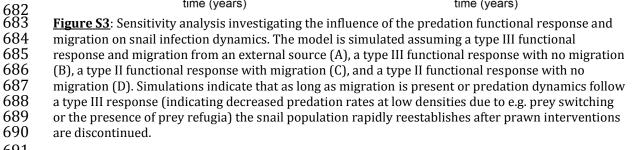
Figure S1: Sensitivity analysis investigating the influence of fixed costs incurred each aquaculture
cycle on profits generated by the prawn aquaculture model. Color indicates the 10-year cumulative
profits generated by optimal management with stocking at the density indicated on the x-axis. The

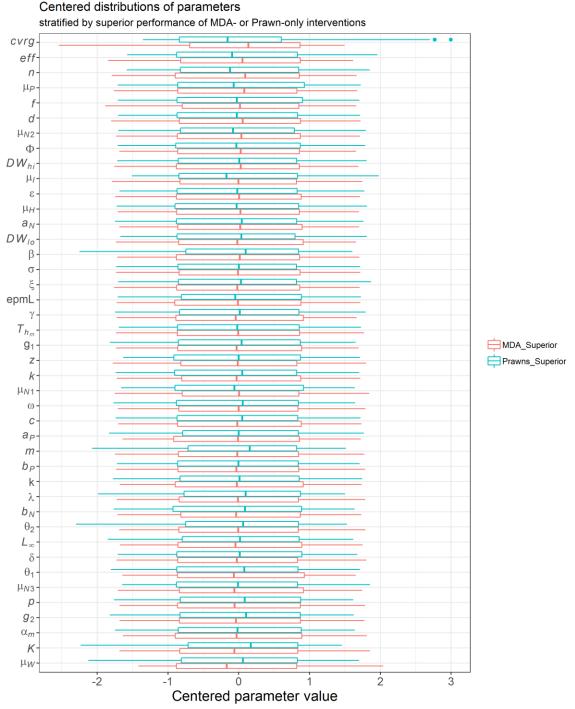


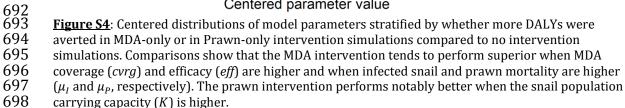


676 677 **Figure S2**: Sensitivity analysis investigating the influence of increased mortality rates (baseline  $\mu_P =$ 678 0.006) on profits generated by the prawn aquaculture model. Color indicates the 10-year cumulative 679 profits generated by optimal management with stocking at the density indicated on the x-axis. The 680 black line delineates the maximum boundary of profitability.









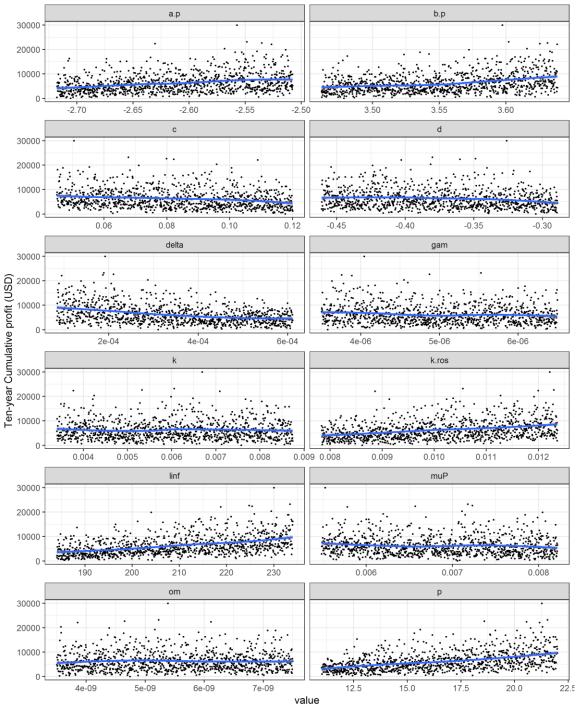
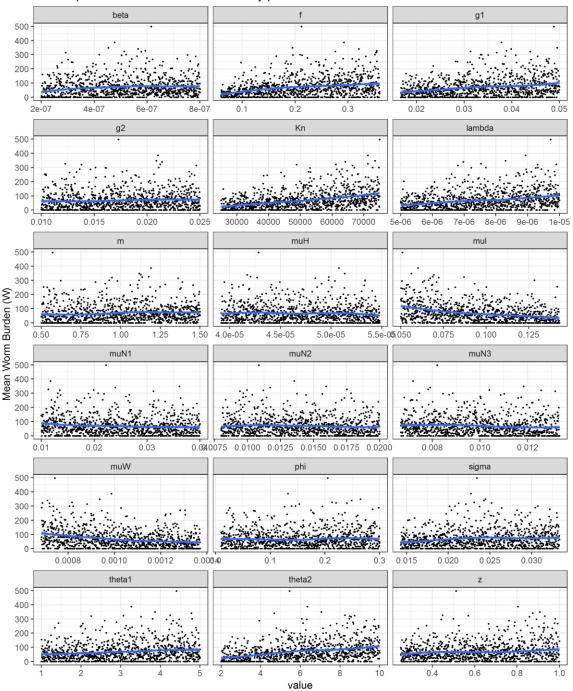




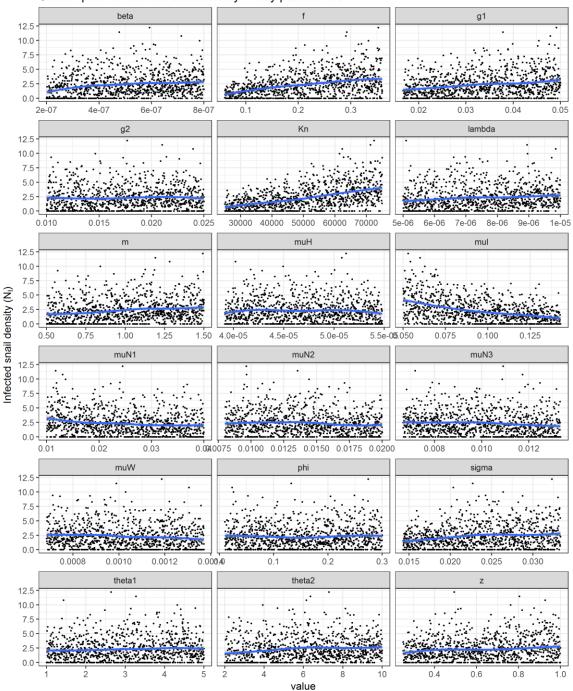
Figure S5: Scatterplots used to verify monotonicity between parameters of the prawn aquaculture
 model and estimates of ten year cumulative profits. Blue lines represent loess smoothing.



Scatter plots of mean worm burden to key parameters



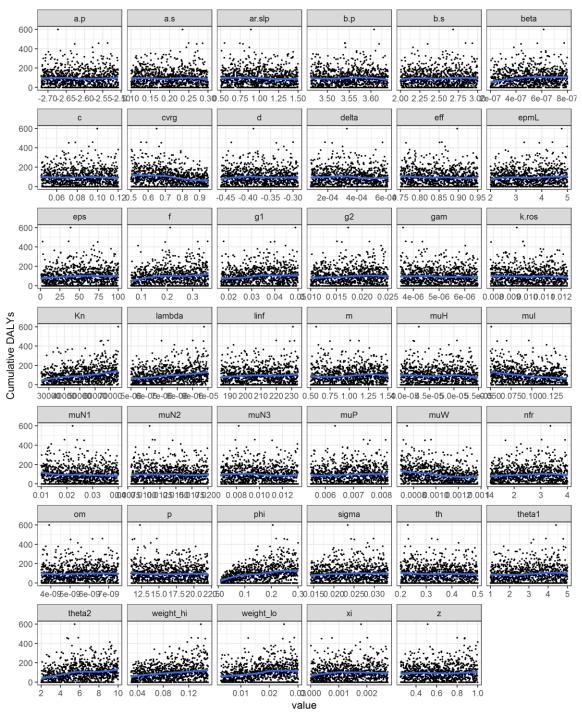
Figure S6: Scatterplots used to verify monotonicity between parameters of the epidemiologic model
 and estimates of equilibrium mean worm burden. Blue lines represent loess smoothing.



Scatter plots of infected snail density to key parameters



709 Figure S7: Scatterplots used to verify monotonicity between parameters of the epidemiologic model
 and estimates of equilibrium infected snail density. Blue lines represent loess smoothing.



712 713

Figure S8: Scatterplots used to verify monotonicity between parameters of the combined model and 714 estimates of DALYs lost during ten years of integrated MDA and prawn intervention. Blue lines 715 represent loess smoothing.

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