Carry-over effects of larval microclimate on the transmission potential of a mosquito-borne pathogen

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**Abstract** Climate shapes the transmission of mosquito-borne pathogens through impacts on both the vector and the pathogen. In addition to direct effects of the present environment, indirect carry-over effects from previous life history stages can influence mosquito life history traits relevant to disease transmission. While this has been explored in a laboratory setting, the net effect of temperature-mediated carry-over effects due to relevant environmental variation in the larval stage is ambiguous. Here, we use data collected from a semi-field experiment investigating dengue dynamics in Aedes albopictus across a relevant environmental gradient to parameterize a dengue transmission model. We reared Ae. albopictus across three different land classes characterized by their proportion of impervious surface. Emerged females were offered a dengue infectious bloodmeal, kept at a constant 27C, and assayed for infection, dissemination, and infectiousness 21 days post infection. Incorporating carry-over effects of larval environment on measures of vector competence resulted in lower predicted dengue transmission potential across land class and season, however a strong positive relationship with larval environmental temperature remained. Given the significant impact of carry-over effects on predicted transmission potential, we suggest that future mechanistic models of disease transmission include both direct and carry-over effects of environmental temperature.

**Keywords:** carry-over effects, dengue, mosquito ecology, urban microclimate

# 1 Introduction

Climate plays an important role in the transmission of mosquito-borne pathogens, determining the geographic range of disease vectors and shaping transmission dynamics. Variation in environmental conditions can drive indivudal-level variation in character traits relevant to mosquito population dynamics (1; 2; 3), as well as pathogen transmission (4). However, in addition to the direct effects of the current environment, mosquito phenotype (including fitness) is shaped indirectly by the environmental conditions experienced in previous life history stages, a phenomenon known as carry-over effects (5). Carry-over effects have been documented in a wide-range of species with complex life cycles, such as amphibians (6), migratory birds (7), and insects (8). Similarly, the mosquito life cycle is characterized by ontogenetic niche shifts, with a larval aquatic stage and 10 an adult terrestrial stage. Following these studies, we reason that the thermal environment a 11 mosquito experiences during its larval stage is likely to have lasting impacts on its adult traits, 12 and, ultimately, on transmission potential. 13

There are several pathways by which carry-over effects from the larval environment might 14 impact key adult traits that are relevant for overall fitness and disease transmission. If the larval 15 environment is of low quality (e.g. resource scarcity or thermal stress, or crowding), individuals 16 may experience developmental constraints that negatively impact adult fitness (9). For instance, female An. stephensii reared on a low-food diet have lower adult survival and fecundity than those reared on a high food diet (10; 11). There are numerous studies demonstrating that variation in 19 larval environmental temperature and nutrients significantly impacts adult immune function and thereby the ability of adult mosquitoes to transmit arboviruses (e.g. vector competence) (12; 13). 21 A second mechanism shaping carry-over effects can result from acclimation to a specific larval 22 environment via trait plasticity (14). For example, Culex mosquitoes reduce their growth in larval 23 environments with predator cues to avoid size-specific predation (15). This, in turn, decreases 24 adult body size, with ramifications for other adults traits such as fecundity (16) and susceptibility 25 to pathogens (17). 26

Although it is clear that temperatures at early life stages can significantly alter adult mosquito traits important for transmission, the net effect of temperature-mediated carry-over effects on

overall transmission potential is ambiguous. Studies focusing solely on vector competence have found both positive (18) and negative (19) relationships between larval environmental temper-30 ature and the proportion of infectious mosquitoes. Additionally, laboratory studies designed to 31 estimate temperature-mediated carry-over effects are typically conducted across a wide range of 32 temperatures (e.g. with differences of 5 to 10 °C between treatments) not often experienced by mosquitoes in the wild (20). While larger treatment differences increase the likelihood of detecting temperature-mediated carry-over effects on adult traits, they do not easily "scale-up" to explain transmission across a landscape when incorporated into temperature-dependent models of mosquito-borne disease (21). Furthermore, temperature-dependent models of mosquito-borne disease only incorporate direct effects of temperature, despite evidence that indirect carry-over 38 effects can have large impacts on adult mosquito phenotypes. Thus, the implications of carry-over 39 effects for mechanistic predictions of vector-borne disease remain unexplored. 40

In light of the above, we hypothesize that relevant environmental variation during the larval stage will have lasting impacts on adult traits that are relevant for mosquito population dynamics and pathogen transmission. To assess the implications of omitting carry-over effects from mechanistic transmission models, we used data collected from a semi-field experiment in a the *Aedes albopictus*-dengue virus (serotype 2, DENV-2) system to parameterize a mechanistic dengue transmission model. We then compared model predictions when carry-over effects were incorporated relative to when they were excluded.

### $_{48}$ 2 Methods

# <sup>9</sup> 2.1 Semi-Field Experimental Design

To ensure our experimental system exhibited the full range of urban microclimates for the study site, we chose three replicate sites  $(30m \times 30m)$  each of low (0-5%), intermediate (6-40%), and high (41-100%) impervious surface, which is an accurate predictor of land surface temperature (22). Following citealtmurdock2017, these sites were defined as rural, suburban, and urban, respectively, and distributed evenly across the study area of Athens, GA (Supp. Fig. 1). Within each site,

we evenly distributed four plastic trays, each containing 100 first instar Ae. albopictus larvae and
1L of leaf infusion. Leaf infusion was prepared one week prior to the experiment as described in
citealtmurdock2017. Trays were screened with a fine mesh, placed in a wire cage to deter wildlife,
and placed in full shade. Cages were covered with a clear plastic vinyl to keep rainwater from
entering the trays. We added deionized water to trays after two weeks to prevent trays from drying
up and to maintain a total water volume at 1L. We placed data loggers (Monarch Instruments:
RFID Temperature Track-It logger) in vegetation next to each tray, approximately 3 feet above
the ground, to collect information on the larval microclimate. Data loggers recorded instantaneous
temperature and relative humidity at ten minute intervals throughout the study period.

Sites were visited daily from Aug. 1 to Sept. 3, 2016 and Sept. 26 to Nov. 8, 2016 during
the summer and fall replicates, respectively, to collect emerging adult mosquitoes until all larvae
emerged or died. We quantified the number of male and female mosquitoes emerging by tray
per day, mosquito body size, and dengue vector competence (the proportion of mosquitoes that
became infectious with dengue after receiving an artificial blood meal containing dengue virus).

# <sup>9</sup> 2.2 Dengue virus in vitro culturing and mosquito infections

We progated DENV-2 virus stock (PRS 225 488) by inoculating Vero cells with a low MOI infection. Virus-containing supernatant was harvested when the cells exhibited more than 80% cytopathic effect and stored at -80 °C. We quantified viral titers of virus stock using TCID-50 assays, calculated by the Spearman-Karber method (23). When mixed 1:1 with the red blood cell mixture, the final concentration of virus in the blood meal was  $3.540 \times 10^6 \ TCID_{50}/mL$ .

Adult mosquitoes were aggregated by site and stored in reach-in incubators at  $27^{\circ}C \pm 0.5^{\circ}C$ ,  $80\% \pm 5\%$  relative humidity, and a 12:12 hour light:dark cycle. To ensure infected mosquitoes were of a similar age, mosquitoes were pooled into cohorts of 4-6 days old in the summer and 4-9 days old in the fall (due to slower and more asynchronous emergence rates), allowed to mate, and were fed *ad libitum* with a 10% sucrose solution. Forty-eight hours prior to infection, the 10% sucrose solution was replaced with deionized water, which was then removed 12-14 hours before infection to encourage higher feed rates. Infectious blood meals were administered to mosquitoes

through a water-jacketed membrane feeder and consisted of 47% human red blood cells washed in DMEM (vol/vol), 1% sucrose(weight/vol), 20% FBS (vol/vol), 5 mM ATP, and 33% DMEM medium combined with 1 mL of virus stock (24). Blood-fed mosquitoes were then maintained as described above for the duration of the experiment.

We assessed mosquitoes for infection, dissemination, and infectiousness through salivation as-86 says and dissections 21 days post infection following (25). To determine variation in the proportion of mosquitoes that become infected (bodies positive for virus), disseminated (heads positive for virus), and infectious (saliva positive for virus), we used cytopathic effect (CPE) assays to test for the presence of virus in each collected tissue (26). Individual bodies and heads were homogenized 90 in 500 μL of DMEM and centrifuged at 2,500 rcf for 5 minutes. 200 μL of homogenate was added 91 to Vero cells in a solution of DMEM (1% pen-strep, 5% FBS by volume) in a 24-well plate and 92 kept at 37 °C and 5 %  $CO_2$ . Salivation media was thawed, and plated on Vero cells as above. After 93 5 days, Vero cells were assessed for presence of DENV-2 via CPE assays. Samples were identified 94 as positive for virus if CPE was present in the well. 95

# $_{\scriptscriptstyle 96}$ 2.3 Mosquito body size and intrinsic growth rates $({ m r'})$

We calculated the per capita population growth rate (Equation 1) per tray following citetlivdahl1984:

$$r' = \frac{\ln(\frac{1}{N_0} \sum_x A_x f(\bar{w}_x))}{D + \frac{\sum_x x A_x f(\bar{w}_x)}{\sum_x A_x f(\bar{w}_x)}} \tag{1}$$

Where  $N_0$  is the initial number of female mosquitoes (assumed to be 50% of the larvae, n=50),  $A_x$  is the number of mosquitoes emerging on day x, D is the time to reproduction following emergence (assumed to be 14 days (27)), and  $f(\bar{w}_x)$  is fecundity as a function of mean wing size on day x ( $w_x$ ; Equation 2). This relationship is assumed to be linear and calculated via (16):

$$f(\bar{w}_x) = -121.240 + (78.02 \times \bar{w}_x) \tag{2}$$

#### 2.4 Estimating vectorial capacity

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We calculated the vectorial capacity (VC; Equation 3) for each site and season following (author?) (28):

$$VC(T) = \frac{a(T)^{2}b(T)c(T)e^{-\mu(T)/EIR(T)}EFD(T)p_{EA}(T)MDR(T)}{\mu(T)^{2}}$$
(3)

Here, mosquito traits are a function of temperature, T, as described in Table 1.

Site-level VC was calculated using a combination of traits empirically measured in this study 107 and traits estimated from thermal response models as described in (28). The bite rate (a(T)), 108 adult mosquito mortality rate  $(\mu(T))$ , and extrinsic incubation rate (EIR(T)), were calculated 109 for mosquitoes at a constant 27 °C using temperature dependent functions from (28). Vector 110 competence (b(T)c(T)) was calculated as the proportion of infectious mosquitoes per site as found 111 by our dengue infection assays. The number of eggs produced per female per day (EFD(T)) was 112 calculated by estimating fecundity from average female wing length following Eq. 2, and then 113 dividing this by the expected lifespan of mosquitoes  $(1/\mu)$ . The egg-to-adult survival probability 114  $(p_{EA}(T))$  was defined as the average proportion of adults emerging at a site. The mosquito imma-115 ture development rate (MDR(T)) was calculated as the inverse of the mean time to emergence 116 for female mosquitoes per site, resulting in a daily rate of development. In order to distinguish 117 between vectorial capacity with and without carry-over effects, we constructed two models. The 118 model without carry-over effects used mathematically estimated values for b(T)c(T) and EFD(T)119 based on thermal response models calculated at the adult environmental temperature (27 °C) fol-120 lowing (28), while the model incorporating carry-over effects used the empirically estimated values 121 from our study for b(T)c(T) and EFD(T). All other parameters were the same across the two 122 models. 123

### 2.5 Statistical Analysis

All analyses were conducted with respect to the female subset of the population, as they are the subpopulation responsible for disease transmission. In the case of data logger failure, imputed

means from the site were used to replace microclimate data. Given the low intra-site variation in temperature, this assumption allowed us to include mosquito data for those trays without biasing our microclimate data. In the case of trays failing due to wildlife emptying them (two urban and one suburban in the fall replicate on experimental days 20, 22, and 20, respectively), collected mosquitoes were used for infection assays, but were excluded from survival and emergence analyses. For all mixed-models, significance was assessed through Wald Chi-square tests ( $\alpha = 0.05$ ) and examination of 95% confidence intervals. Pearson residuals and Q-Q plots were visually inspected for normality. All mixed models were fit using the 1me4 package in R.

# 2.5.1 Assessing effects of land class and season on mosquito population dynamics and transmission potential

We used generalized linear mixed models to explore if microclimate (i.e. mean, minimum, max-137 imum, and daily ranges of temperature and relative humidity), the mean proportion of adult 138 females emerging per tray, time to female emergence, female body size, the mean mosquito per 139 capita growth rate, metrics of vector competence, and vectorial capacity differed across land class 140 and season. Fixed effects in all models included land class, season, and their interaction. Site was 141 included as a random effect in all models to control for any variation inherent to the site. The 142 effect of body size on infection dynamics was also explored at the level of the individual mosquito, fitting a binomial generalized linear mixed effects model including wing size as a fixed effect and site as a random effect. 145

# Assessing effects of microclimate on mosquito population dynamics and trans mission potential

To explore whether the effects of land class and season were due to variation in microclimate, we ran additional statistical analyses exploring the effects of different microclimate variables on each response variable. Due to extreme correlation between variables ( $\rho > 0.9$ ), we ultimately chose one variable to represent microclimate (mean temperature) to reduce bias due to collinearity (29). Thus, we analyzed the effect of mean temperature on the mean proportion of adult females

emerging per tray, mosquito development rate (defined as the inverse of the time to emergence), female body size,the mean mosquito per capita growth rate, metrics of vector competence, and vectorial capacity by fitting linear mixed effects models to each response variable with site included as a random factor.

#### 57 3 Results

Of the 3,600 first-instar larvae placed in each season, a total of 2595 and 1128 mosquitoes emerged in the summer and fall, respectively. A total of 319 female mosquitoes were assessed for infection status, twenty per site in the summer, and varying numbers per site in the fall due to lower emergence rates (sample sizes reported in Supp. Table 1). Of this number, a total of 291 wings were mounted and measured (28 wings were damaged). Of the uninfected mosquitoes, 135 and 162 female wing lengths were measured in the summer and fall replicates, respectively.

#### 64 3.1 Effects of land class and season on microclimate

We found that microclimate profiles differed significantly across both season and land class (Table 2, Supp. Fig. 2). All microclimate metrics differed significantly across season, except for maximum relative humidity (z=0.679, p = 0.497). In general, temperatures were warmer in the summer and on urban sites, replicating what was found in a prior study in this system (30). Relative humidity was higher in the summer than the fall, due to a drought, and lower on urban land classes than suburban and rural classes.

# Direct effects of land class, season, and microclimate on population growth

The total proportion of adult females emerging per tray was significantly higher in summer than fall (Table 3), but did not differ across land class (Fig. 1A). There was a strong positive relationship between mean daily temperature and larval survival to emergence by tray (Table 3). The mean rate of larval development per tray was significantly different between summer and fall (Fig. 1B, Table

3), with daily development rates of  $0.074 \pm 0.002 \ day^{-1}$  and  $0.0387 \pm 0.002 \ day^{-1}$ , respectively.

There was a significant positive relationship between temperature and larval development rate

(Table 3).

# 3.3 Carry-over effects of land class, season, and microclimate on population growth

We did not observe a significant effect of land class or season on mosquito wing size, however there was a significant interaction between the two (Table 3), with the smallest mosquitoes on suburban sites in the summer and rural sites having the smallest wing size in the fall. We also found no effect of temperature on female wing size. After incorporating the number of adult females emerging per day, the date of emergence, and their body size into the per capita growth rate equation (Equation 1), we found that the estimated per capita growth rate was higher in the summer season than the fall season (Fig. 1C, Table 3). There was no evidence for a difference in population growth across land class or temperature.

# 190 3.4 Carry-over effects of land class, season, and microclimate on vec191 tor competence

We found that both land class and season did significantly impact the probability of a mosquito 192 becoming infected and disseminating dengue infection (Fig. 2, Table 3). The probability of 193 becoming infectious did not differ across land class, nor season, despite the higher probability of 194 mosquito infection and dissemination in the fall and on suburban and rural sites. This suggests that the ability of virus to penetrate the salivary glands differs in adults reared in the summer vs. the fall and across land class, with a higher proportion of dengue infected mosquitoes becoming infectious 197 in the summer and on urban sites (Supp. Table 1,  $\chi^2=13.65,\,p<0.001$ ). Finally, we also found 198 the probability of infection to decline with increasing body size ( $\chi^2 = 4.776$ , p = 0.0289), although 199 there was no evidence for a relationship between body size and the probability of dissemination 200 or infectiousness. Differences in metrics of vector competence across land class and season were 201

driven by a strong relationship with microclimate. We found that infection and dissemination rates
decreased with increasing temperatures, while there was no relationship between infectiousness and
temperature (Table 3).

# 205 3.5 Integrating direct and carry-over effects into estimates of trans-206 mission potential

When calculating VC both with without the inclusion of carry-over effects, VC was higher in 207 the summer than the fall (Fig 3, Table 3). In the summer season, there was a trend for VC to 208 increase with increasing urbanization; that is, urban sites had higher predicted vectorial capacity 209 than suburban, which had a higher value than rural (Fig. 3). This trend was not significant, 210 however, given the small sample size (n=9) and the disproportional impact of having no infectious 211 mosquitoes at one site, resulting in a value of VC=0 for one sample. Further, we found that 212 calculated vectorial capacity increased with temperature for both models, although the increase 213 was more pronounced when not accounting for carry-over effects (Fig. 3). When comparing 214 VC calculations with and without carry-over effects, we found that including carry-over effects 215 decreased the expected vectorial capacity overall by an average of  $84.89 \pm 2.86$  %.

### 17 4 Discussion

Mathematical models of mosquito-borne disease rarely include the larval stage of the life cycle (21), and of those that do, few include the influence of carry-over effects on important mosquito 219 life-histuiory traits (but see (31)). This is likely due, in part, to the lack of empirical studies 220 parameterizing the carry-over effects of the larval environment in mosquito-pathogen systems (32), 221 most of which are laboratory studies conducted across a wider range of temperatures than that 222 seen in the field. Here, we demonstrate that fine-scale differences in larval microclimate generate 223 carry-over effects on adult vector competence and fecundity, resulting in variation in mosquito 224 population dynamics and transmission potential across an urban landscape and season, driven by 225 differences in microclimate.

The subtle heterogeneity in microclimate we observed resulted in significantly different pre-227 dicted population growth rates through its effects on demographic traits. Daily mean temperatures 228 (25.43 °C) across all sites in the summer were closer to the predicted thermal optimum of Ae. al-229 bopictus for the probability of egg to adult survival  $(p_{EA}; 24-25 \,^{\circ}\text{C})$  (28) than in the fall (17.69  $^{\circ}\text{C})$ , 230 leading to higher survival rates. We also observed more rapid larval development rates (MDR) in 231 the summer relative to the fall, and on warmer urban sites in the fall only. Again, this is likely due 232 to the strong positive relationship observed between MDR and mean larval temperature, as the 233 metabolic rate of mosquitoes and this trait have been shown to increase with warming temperatures (1). Surprisingly, we found no effect of land class or season on female mosquito body size, in 235 spite of the difference in temperatures across season. Following allometric temperature-size rela-236 tionships of ectotherms, warmer larval temperatures lead to smaller bodied mosquitoes (33; 34). 237 Our results are contrary to many laboratory studies that have found cold rearing temperatures 238 result in large bodied mosquitoes (Ae. albopictus (35), Culex tarsalis (36), Anopheles gambiea 239 (37)). 240

There could be several explanations why we did not observe an effect of larval environmental 241 temperature on adult body size. Nutrient availability and quality can mediate the relationship 242 between temperature and body size (38). The majority of the above laboratory studies rear larvae 243 on high quality food sources, such as fish food. The leaf infusion used in our experiment relied on 244 veast and naturally colonizing microorganisms such as bacteria, both of which grow more slowly 245 at low temperatures (39), likely constraining growth of larvae. For example, Louibos et al. (16) 246 provided leaf litter as a nutrient source, and found a positive relationship between temperature 247 and male Ae. albopictus body size. However, a study in this system in 2015 found a negative 248 relationship between larval temperature and adult Ae. albopictus body size (30) when reared on 249 a similar leaf infusion as used in this experiment. The prior study, however, was conducted at a 250 different time of year and reared larvae in smaller containers, resulting in a cooler temperature 251 profile in the 2016 study relative to the 2015 study and different starting abundances. These differences highlight the potential for an interaction between abiotic and biotic effects on mosquito life-history traits.

Our results agree with laboratory studies in other arboviral systems (chikungunya (40), yellow 255 fever (40), and Rift Valley fever (41)) that found cool larval environmental temperatures to enhance 256 arbovirus infection relative to warmer larval environments. Studies on the Ae. albopictus-dengue 257 virus system have also found that low larval temperatures enhance mosquito susceptibility to 258 virus infection, although this is dependent on larval nutrition (42) and the stage of the infection 259 (i.e. mid-gut vs. dissemination vs. saliva) (43). While we found infection and dissemination to 260 decrease with increasing temperatures, there was no effect of temperature on viral presence in the saliva, suggesting carry over effects due to microclimate variation may alter the overall efficiency of dengue infections. Thus, even though a smaller proportion of mosquitoes reared on urban 263 sites and in the summer became infected and disseminated, these mosquitoes were more likely to 264 become infectious. This, in turn, resulted in no net difference in the proportion of mosquitoes that 265 ultimately become infectious across land class and season and suggests that later stages of viral 266 infection (i.e. salivary gland penetration) may be differentially impacted by larval environmental 267 temperature than earlier stages (i.e. midgut escape). 268

Current statistical and mechanistic models of vector-borne disease prediction focus primarily 269 on the direct effects of environmental variables on mosquito densities and disease transmission 270 and rarely include the effects of the larval stage, either directly or via carry-over effects (28; 44). 271 We find that when carry over effects are not incorporated, mechanistic models overestimate the 272 effects of key environmental drivers (e.g. temperature) on vector-borne disease transmission. 273 The relatively small differences in temperature across our study site (less than 1.5 °C) resulted 274 in a two-fold difference in predicted vectorial capacity when omitting carry-over effects. Past 275 studies of carry-over effects have been primarily lab-based (45; 46), and conducted across wide 276 environmental gradients at constant temperatures that are not characteristic of field conditions. 277 Similar to these laboratory studies, we found carry-over effects to be pervasive, despite observing only subtle differences in microclimate. Thus, we would expect these phenomena to have an even larger impact in more urbanized areas, particularly megacities, with larger seasonal and spatial microclimate ranges (47). 281

Additionally, carry-over effects are not simply limited to microclimate, and have been ob-

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served as a result of variation in larval nutrition (10), intra- and inter-specific densities (46; 45), 283 and predation (31) in mosquito systems. Abiotic and biotic factors will likely interact to influence 284 carry over effects (42; 48; 49), and how abiotic and biotic factors shape carry-over effects could 285 be scale-dependent. For example, biotic processes are thought to be more important at local geo-286 graphic scales, while abiotic processes tend to dominate at regional geographic scales in predictive 287 models of species distributions (50). There is also evidence to suggest that the magnitude of 288 the interaction between abiotic and biotic processes on carry over effects is scale-dependent (51). Future exploration of the scale-dependent contribution of different environmental factors, their interactions, to carry-over effects is needed to improve models of mosquito distributions, population 291 dynamics, and disease transmission. 292

In conclusion, we found fine-scale variation in microclimate to shape mosquito population dy-293 namics and the transmission potential of mosquito-borne diseases both through direct impacts on 294 larval survival and development rates, and indirectly through carry-over effects on vector compe-295 tence and fecundity. Our study suggests that more empirical work in the lab and field is needed 296 to better characterize carry over effects associated with relevant environmental drivers. The in-297 teraction between the larval and adult environments, mediated by carry-over effects, could have 298 complex consequences for adult phenotypes and fitness for mosquitoes as well as other organisms. 290 Given the devastating impact of disease in other species with complex life histories (e.g. chytrid-300 iomycosis in amphibians), the role of carry-over effects in disease transmission are an important, 301 though understudied, mechanism that must be better understood to control disease spread. Thus, 302 incorporating relationships between carry-over effects and organismal life-history traits into statis-303 tical and mechanistic models will lead to more accurate predictions on the distributions of species, 304 population dynamics, and the transmission of pathogens and parasites. 305

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# 6 Contributions

M.V.E, J.M.D, and C.C.M designed the study; M.V.E, J.C.S. and N.S. collected the data; M.V.E. and M.A.B. cultured virus and conducted CPE assays; M.V.E, J.M.D, and C.C.M analyzed the data; M.V.E., J.M.D, and C.C.M prepared the tables and figures; M.V.E., J.C.S., N.S., M.A.B., J.M.D, and C.C.M drafted the manuscript. All authors gave final approval for publication.

# <sup>318</sup> 7 Data accessibility

All data and code used in analyses are available on figshare (doi:10.6084/m9.figshare.5558128).

# References

- [1] Delatte H, Gimonneau G, Triboire A, Fontenille D. Influence of Temperature on Immature
  Development, Survival, Longevity, Fecundity, and Gonotrophic Cycles of Aedes Albopictus,
  Vector of Chikungunya and Dengue in the Indian Ocean. J Med Entomol. 2009 Jan;46(1):33–
  41.
- <sup>325</sup> [2] Yang HM, Macoris MLG, Galvani KC, Andrighetti MTM, Wanderley DMV. Assessing the Effects of Temperature on the Population of Aedes Aegypti, the Vector of Dengue. Epidemiol Infect. 2009 Aug;137(8):1188–1202.
- [3] Alto BW, Juliano SA. Temperature Effects on the Dynamics of Aedes Albopictus(Diptera: Culicidae) Populations in the Laboratory. J Med Entomol. 2001 Jul;38(4):548–556.
- [4] Murdock C, Paaijmans K, Bell A, King J, Hillyer J, F Read A, et al. Complex effects of
   temperature on mosquito immune function. Proceedings Biological sciences / The Royal
   Society. 2012 May;279:3357–66.
- [5] Harrison XA, Blount JD, Inger R, Norris DR, Bearhop S. Carry-over Effects as Drivers of Fitness Differences in Animals. J Anim Ecol. 2011 Jan;80(1):4–18.
- [6] Vonesh JR. Sequential Predator Effects across Three Life Stages of the African Tree Frog,
   Hyperolius Spinigularis. Oecologia. 2005 Mar;143(2):280–290.
- Norris DR, Taylor CM. Predicting the Consequences of Carry-over Effects for Migratory Populations. Biology Letters. 2006 Mar;2(1):148–151.
- [8] De Block M, Stoks R. Fitness Effects from Egg to Reproduction: Bridging the Life History Transition. Ecology. 2005;86(1):185–197.
- [9] Inger R, Harrison XA, Ruxton GD, Newton J, Colhoun K, Gudmundsson GA, et al.

  Carry-over Effects Reveal Reproductive Costs in a Longdistance Migrant. J Anim Ecol.

  2010;79(5):974–982.

- [10] Moller-Jacobs LL, Murdock CC, Thomas MB. Capacity of Mosquitoes to Transmit Malaria
   Depends on Larval Environment. Parasites & Vectors. 2014;7:593.
- [11] Shapiro LLM, Murdock CC, Jacobs GR, Thomas RJ, Thomas MB. Larval Food Quantity Affects the Capacity of Adult Mosquitoes to Transmit Human Malaria. Proc B. 2016
   Jul;283(1834):20160298-8.
- [12] Muturi EJ, Nyakeriga A, Blackshear M. Temperature-Mediated Differential Expression of Immune and Stress-Related Genes in Aedes Aegypti Larvae. Journal of the American Mosquito
   Control Association. 2012 Jul;28(2):79–83.
- [13] Price DP, Schilkey FD, Ulanov A, Hansen IA. Small Mosquitoes, Large Implications: Crowding and Starvation Affects Gene Expression and Nutrient Accumulation in Aedes Aegypti.
   Parasites & Vectors. 2015;8:252.
- [14] Monaghan P. Early Growth Conditions, Phenotypic Development and Environmental
   Change. Philos Trans R Soc Lond B Biol Sci. 2008 May;363(1497):1635–1645.
- Jourdan J, Baier J, Riesch R, Klimpel S, Streit B, Mller R, et al. Adaptive growth reduction in response to fish kairomones allows mosquito larvae (Culex pipiens) to reduce predation risk. Aquatic Sciences. 2016 Apr;78(2):303–314.
- In Italian In Italian Ita
- Paulson SL, Hawley WA. Effect of body size on the vector competence of field and laboratory populations of Aedes triseriatus for La Crosse virus. Journal of the American Mosquito Control Association. 1991 Jun;7(2):170–175.
- [18] Muturi EJ, Lampman R, Costanzo K, Alto BW. Effect of Temperature and Insecticide Stress
   on Life-History Traits of Culex Restuans and Aedes Albopictus (Diptera: Culicidae). J Med
   Entomol. 2011 Mar;48(2):243–250.

- [19] Muturi EJ, Kim CH, Alto BW, Berenbaum MR, Schuler MA. Larval Environmental Stress Alters Aedes Aegypti Competence for Sindbis Virus. Trop Med Int Health. 2011 May;16(8):955–964.
- <sup>372</sup> [20] Cator LJ, Thomas S, Paaijmans KP, Ravishankaran S, Justin JA, Mathai MT, et al. Characterizing Microclimate in Urban Malaria Transmission Settings: A Case Study from Chennai,

  <sup>374</sup> India. Malaria Journal. 2013 Mar;12(1):1–1.
- Review of Mathematical Models of Mosquito-Borne Pathogen Transmission: 1970–2010. J R

  Soc Interface. 2013 Apr;10(81):20120921.
- Yuan F, Bauer ME. Comparison of Impervious Surface Area and Normalized Difference
  Vegetation Index as Indicators of Surface Urban Heat Island Effects in Landsat Imagery.
  Remote Sens Environ. 2007;106(3):375–386.
- [23] Shao Q, Herrlinger S, Yang SL, Lai F, Moore JM, Brindley MA, et al. Zika Virus Infection Disrupts Neurovascular Development and Results in Postnatal Microcephaly with Brain Damage. Development. 2016 Nov;143(22):4127–4136.
- Shan C, Xie X, Muruato AE, Rossi SL, Roundy CM, Azar SR, et al. An Infectious cDNA Clone of Zika Virus to Study Viral Virulence, Mosquito Transmission, and Antiviral Inhibitors. Cell Host and Microbe. 2016 May;p. 1–23.
- Tesla B, Demakovsky LR, Packiam HS, Mordecai EA, Rodriguez AD, Bonds MH, et al. Estimating the effects of variation in viremia on mosquito susceptibility, infectiousness, and R0 of Zika in Aedes aegypti. bioRxiv. 2017 Nov;p. 221572. Available from: https://www.biorxiv.org/content/early/2017/11/17/221572.
- <sup>391</sup> [26] Balaya S, Paul S, D'Lima L, Pavri K. Investigations on an Outbreak of Dengue in Delhi in <sup>392</sup> 1967. Indian J Med Res. 1969;57(4):767–774.
- <sup>393</sup> [27] Livdahl TP, Willey MS. Prospects for an Invasion: Competition between Aedes Albopictus <sup>394</sup> and Native Aedes Triseriatus. Science. 1991 Jan;253:189–191.

- [28] Mordecai EA, Cohen JM, Evans MV, Gudapati P, Johnson LR, Lippi CA, et al. Detecting the
   Impact of Temperature on Transmission of Zika, Dengue, and Chikungunya Using Mechanistic
   Models. PLOS Neglected Tropical Diseases. 2017 Apr;11(4):e0005568.
- <sup>398</sup> [29] Graham MH. Confronting Multicollinearity in Ecological Multiple Regression. Ecology. 2003 Nov;84(11):2809–2815.
- [30] Murdock CC, Evans MV, McClanahan TD, Miazgowicz KL, Tesla B. Fine-Scale Variation in
   Microclimate across an Urban Landscape Shapes Variation in Mosquito Population Dynamics
   and the Potential of Aedes Albopictus to Transmit Arboviral Disease. PLOS Neglected
   Tropical Diseases. 2017 May;11(5):e0005640.
- [31] Roux O, Vantaux A, Roche B, Yameogo KB, Dabiré KR, Diabaté A, et al. Evidence for
   Carry-over Effects of Predator Exposure on Pathogen Transmission Potential. Proc R Soc B.
   2015 Dec;282(1821):20152430.
- Parham PE, Waldock J, Christophides GK, Hemming D, Agusto F, Evans KJ, et al. Climate,
  Environmental and Socio-Economic Change: Weighing up the Balance in Vector-Borne Disease Transmission. Philosophical Transactions of the Royal Society B: Biological Sciences.
  2015 Feb;370(1665):20130551–20130551.
- 411 [33] Angilleta MJ, Steury TD, Sears MW. Temperature, Growth Rate, and Body Size in Ectotherms: Fitting Peice of a Life-History Puzzle. Integrative and Comparative Biology. 2004

  413 Jan;44:498–509.
- 414 [34] Kingsolver JG, Huey RB. Size, Temperature, and Fitness: Three Rules. Evol Ecol Res.
  415 2008;10(2):251–268.
- [35] Reiskind MH, Zarrabi AA. Is Bigger Really Bigger? Differential Responses to Temperature
   in Measures of Body Size of the Mosquito, Aedes Albopictus. Journal of Insect Physiology.
   2012 Jul;58(7):911–917.
- [36] Dodson BL, Kramer LD, Rasgon JL. Effects of Larval Rearing Temperature on Immature

- Development and West Nile Virus Vector Competence of Culex Tarsalis. Parasites & Vectors.

  2012 Sep;5(1):199.
- 422 [37] Koella JC, Lyimo EO. Variability in the Relationship between Weight and Wing Length
  423 of Anopheles Gambiae (Diptera: Culicidae). Journal of Medical Entomology. 1996
  424 Mar;33(2):261–264.
- [38] Farjana T, Tuno N, Higa Y. Effects of Temperature and Diet on Development and Interspecies

  Competition in Aedes Aegypti and Aedes Albopictus. Medical and Veterinary Entomology.

  2011 Jul;26(2):210–217.
- <sup>428</sup> [39] Ratkowsky DA, Olley J, McMeekin TA, Ball A. Relationship between Temperature and Growth Rate of Bacterial Cultures. J Bacteriol. 1982 Jan;149(1):1–5.
- 430 [40] Adelman ZN, Anderson MAE, Wiley MR, Murreddu MG, Samuel GH, Morazzani EM, et al.
  431 Cooler Temperatures Destabilize RNA Interference and Increase Susceptibility of Disease Vec432 tor Mosquitoes to Viral Infection. PLOS Neglected Tropical Diseases. 2013 May;7(5):e2239.
- <sup>433</sup> [41] Turell M. Effect of Environmental Temperature on the Vector Competence of Aedes Tae-<sup>434</sup> niorhynchus for Rift Valley Fever and Venezuelan Equine Encephalitis Viruses. Am J Trop <sup>435</sup> Med Hyg. 1993;49(6):672–676.
- [42] Buckner EA, Alto BW, Lounibos LP. Larval Temperature–Food Effects on Adult Mosquito
   Infection and Vertical Transmission of Dengue-1 Virus. J Med Entomol. 2016 Jan;53(1):91–98.
- 438 [43] Alto BW, Bettinardi D. Temperature and Dengue Virus Infection in Mosquitoes: Independent
  439 Effects on the Immature and Adult Stages. The American Journal Of Tropical Medicine And
  440 Hygiene. 2013 Mar;88(3):497–505.
- [44] Ezeakacha NF. Environmental impacts and carry-over effects in complex life cycles: the role
   of different life history stages. University of Southern Mississippi; 2015.
- [45] Alto BW, Reiskind MH, Lounibos LP. Size Alters Susceptibility of Vectors to Dengue Virus
   Infection and Dissemination. Am J Trop Med Hyg. 2008 Oct;79(5):688–695.

- <sup>445</sup> [46] Alto BW, Lounibos LP, Higgs S, Juliano SA. Larval Competition Differentially Affects Arbovirus Infection in Aedes Mosquitoes. Ecology. 2005;86(12):3279–3288.
- [47] Peng S, Piao S, Ciais P, Friedlingstein P, Ottle C, Bréon FM, et al. Surface Urban Heat
   Island Across 419 Global Big Cities. Environ Sci Technol. 2012 Jan;46(2):696-703.
- [48] Muturi EJ, Costanzo K, Kesavaraju B, Alto BW. Can Pesticides and Larval Competition
   Alter Susceptibility of Aedes Mosquitoes (Diptera: Culicidae) to Arbovirus Infection? Journal
   of Medical Entomology. 2011 Mar;48(2):429–436.
- [49] Muturi EJ, Blackshear M, Montgomery A. Temperature and Density-Dependent Effects of
   Larval Environment on Aedes Aegypti Competence for an Alphavirus. J Vector Ecol. 2012
   Jun;37(1):154–161.
- [50] Cohen JM, Civitello DJ, Brace AJ, Feichtinger EM, Ortega CN, Richardson JC, et al. Spatial
   Scale Modulates the Strength of Ecological Processes Driving Disease Distributions. PNAS.
   2016 Jun;113(24):E3359–E3364.
- <sup>458</sup> [51] Leisnham PT, LaDeau SL, Juliano SA. Spatial and Temporal Habitat Segregation of Mosquitoes in Urban Florida. PLoS ONE. 2014 Jan;9(3).

Parameter	Definition	Without carry-over	With carry-over	
		effects	${ m effects}$	
a(T)	Per-mosquito bite rate	Mordecai et al. 2017	Mordecai et al. 2017	
$b(T)c(T)^*$	Vector competence	Mordecai et al. 2017	Current Study	
$\mu(T)$	Adult mosquito mortality	Mordecai et al. 2017	Mordecai et al. 2017	
	rate			
EIR(T)	Extrinsic incubation rate	Mordecai et al. 2017	Mordecai et al. 2017	
	(inverse of extrinsic			
	incubation period)			
$EFD(T)^*$	Number of eggs produced	Mordecai et al. 2017	Current Study	
	per female mosquito per day			
$p_{EA}(T)$	Egg-to-adult survival	Current Study	Current Study	
	probability			
MDR(T)	Mosquito immature	Current Study	Current Study	
	development rate			

Table 1: Sources of parameters used in the VC equation. Parameters sourced from (28) were mathematically estimated at a constant temperature of 27 °C. Parameters that included carry-over effects are starred.

Table 2: Mean  $\pm$  s.e. of climate metrics across season and land class. Superscripts represent significant differences within a season as measured by pair-wise comparisons using Tukey multiple comparisons of means, adjusting for significance with the Holm-Bonferroni method.

		Summer		Fall			
	Rural	Suburban	Urban	Rural	Suburban	Urban	
Min. Temperature	$21.69 \pm 0.23^a$	$21.99 \pm 0.32^a$	$22.69 \pm 0.33^a$	$11.07 \pm 0.33^a$	$12.23 \pm 0.47^{ab}$	$13.32 \pm 0.47^{b}$	
Mean Temperature	$25.41 \pm 0.16^a$	$25.36 \pm 0.22^a$	$26.30 \pm 0.23^{b}$	$17.87 \pm 0.23^a$	$18.11 \pm 0.33^a$	$19.28 \pm 0.33^{b}$	
Max. Temperature	$31.39 \pm 0.49^a$	$30.86 \pm 0.68^a$	$31.41 \pm 0.71^a$	$27.52 \pm 0.37^a$	$26.58 \pm 0.53^a$	$26.87 \pm 0.55^a$	
DTR	$9.82 \pm 0.55^a$	$8.86 \pm 0.76^a$	$8.75 \pm 0.79^a$	$16.46 \pm 0.57^a$	$14.35 \pm 0.80^a$	$13.58 \pm 0.82^b$	
Min. Relative Humidity	$73.59 \pm 1.84^{ab}$	$76.29 \pm 2.55^b$	$66.48 \pm 2.67^a$	$47.81 \pm 1.75^a$	$48.84 \pm 2.45^a$	$44.28 \pm 2.52^a$	
Mean Relative Humidity	$93.80 \pm 1.04^a$	$94.77 \pm 1.45^a$	$87.52 \pm 1.51^b$	$80.84 \pm 1.52^a$	$80.41 \pm 2.14^a$	$71.58 \pm 2.17^{b}$	
Max. Relative Humidity	$99.97 \pm 0.84^a$	$99.97 \pm 1.31^a$	$98.09 \pm 1.37^a$	$99.33 \pm 1.25^a$	$98.92 \pm 1.75^a$	$92.07 \pm 1.78^b$	
DHR	$26.37 \pm 2.00^{ab}$	$23.69 \pm 2.77^b$	$31.62 \pm 2.90^a$	$51.51 \pm 1.89^a$	$50.09 \pm 2.65^a$	$47.79 \pm 2.73^a$	

Table 3: Model results from mixed models investigating the effect of land class, season, their interaction, and temperature on population demographics, metrics of infection, and vectorial capacity with and without the inclusion of carry-over effects.

	Class			Season		Class*Season		Temperature				
	df	$\chi^2$	p-value	df	$\chi^2$	p-value	df	$\chi^2$	p-value	$\beta \pm s.e.$	t-value	p-value
Survival	2	0.0361	0.982	1	61.129	< 0.001	2	5.891	0.053	0.240 (0.0297)	8.089	< 0.001
Development Rate	2	3.847	0.1461	1	597.51	< 0.001	2	3.108	0.211	$0.005 \ (0.0002)$	20.17	< 0.001
Wing Length	2	0.835	0.6587	1	2.7937	0.0946	2	14.748	< 0.001	$0.006 \ (0.003)$	1.883	0.061
Per Capita Growth (r')	2	0.667	0.717	1	219.84	< 0.001	2	2.622	0.230	$0.013 \ (0.001)$	14.927	< 0.001
Infection	2	18.733	< 0.001	1	12.609	< 0.001	2	1.985	0.371	-0.075 (0.0249)	-3.011	< 0.001
Dissemination	2	14.208	< 0.001	1	15.05	< 0.001	2	0.941	0.625	-0.093(0.0282)	-3.299	0.004
Infectiousness	2	1.125	0.57	1	3.7762	0.052	2	0.302	0.860	$0.006 \ (0.0065)$	0.955	0.354
VC (w/o carry-over)	2	0.388	0.824	1	79.472	< 0.001	2	0.168	0.920	3.912 (0.449)	8.347	< 0.001
VC (w/ carry-over)	2	0.588	0.745	1	20.631	< 0.001	2	0.337	0.845	0.802 (0.168)	4.690	< 0.001

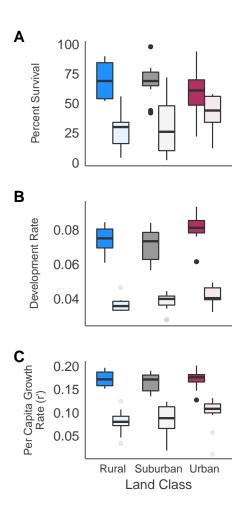


Figure 1: Female larval a) survival rate, b) development rate and c) population growth rate across the summer (dark fill) and fall (light fill) trials and three land classes.

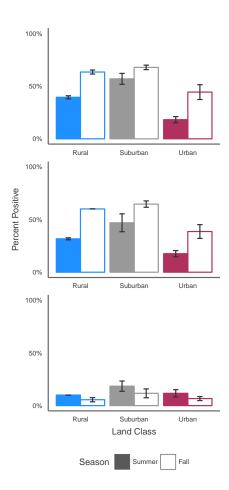


Figure 2: Infection dynamics (infected, disseminated, and infectious mosquitoes) across land class and season. Bars represent mean and standard errors of raw data across sites (n=3 per treatment).

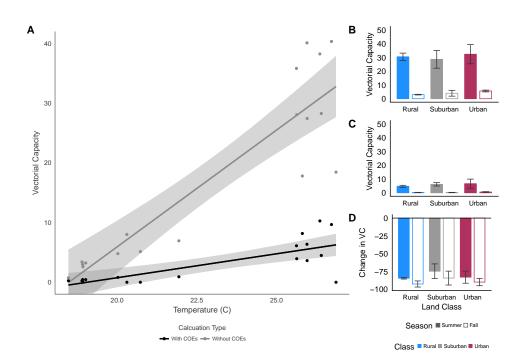


Figure 3: The calculated vectorial capacity (with 95 % confidence intervals) by site across individual mean temperature prior to infection assays (a). Inset charts on the right indicate calculated vectorial capacity without carry-over effects (b), with carry-over effects (c), and the percent difference due to the incorporation of carry-over effects (d). Error bars represent standard error.