Optimal Timing of Insecticide Fogging to Minimize Dengue Cases: Modeling Dengue Transmission among Various Seasonalities and Transmission Intensities

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Abstract

Background: Dengue infection is endemic in many regions throughout the world. While insecticide fogging targeting the vector mosquito Aedes aegypti is a major control measure against dengue epidemics, the impact of this method remains controversial. A previous mathematical simulation study indicated that insecticide fogging minimized cases when conducted soon after peak disease prevalence, although the impact was minimal, possibly because seasonality and population immunity were not considered. Periodic outbreak patterns are also highly influenced by seasonal climatic conditions. Thus, these factors are important considerations when assessing the effect of vector control against dengue. We used mathematical simulations to identify the appropriate timing of insecticide fogging, considering seasonal change of vector populations, and to evaluate its impact on reducing dengue cases with various levels of transmission intensity.

Methodology/Principal Findings: We created the Susceptible-Exposed-Infectious-Recovered (SEIR) model of dengue virus transmission. Mosquito lifespan was assumed to change seasonally and the optimal timing of insecticide fogging to minimize dengue incidence under various lengths of the wet season was investigated. We also assessed whether insecticide fogging was equally effective at higher and lower endemic levels by running simulations over a 500-year period with various transmission intensities to produce an endemic state. In contrast to the previous study, the optimal application of insecticide fogging was between the onset of the wet season and the prevalence peak. Although it has less impact in areas that have higher endemicity and longer wet seasons, insecticide fogging can prevent a considerable number of dengue cases if applied at the optimal time.

Conclusions/Significance: The optimal timing of insecticide fogging and its impact on reducing dengue cases were greatly influenced by seasonality and the level of transmission intensity. We suggest that these factors should be considered when planning a control strategy against dengue vectors.

Introduction

Dengue virus (DENV) infection is a mosquito-borne viral disease of serious health concern in recent decades. More than two-fifths of the global population is considered to be at risk of dengue infection, principally in the tropics and sub-tropics [1]. Increases in dengue epidemics are likely due to the rapid and broad-ranging migration of people and urbanization, which is accompanied by expanded infestation of vector mosquito: Aedes aegypti [2].

Clinical manifestations of dengue infection range from a mild febrile form (dengue fever: DF) to severe and sometimes to fatal forms (dengue hemorrhagic fever: DHF and dengue shock syndrome: DSS). Although the case fatality rate of DHF/DSS has been declining [3], such severe forms always require intensive care and fluid management under hospitalization. Consequently, a major outbreak represents a serious burden on medical facilities. Tetravalent dengue vaccines are now under development and have the potential to effectively prevent disease [4]; however, these vaccines are not currently approved for clinical use.

To date, vector control has been the only measure for dengue prevention. In contrast to the substantial progress observed for vaccine development, vector control strategies have shown limited improvement. The major vector control measures conducted in many dengue endemic areas include: 1) fogging ultra-low-volume insecticide particles (insecticide fogging) that target adult mosquitoes; 2) chemical and biological controls for mosquito larvae in the key containers; and 3) larval source reduction. Among those, insecticide fogging has been commonly implemented, but its impact on reducing dengue cases is still controversial [5,6].

Aedes aegypti is a highly domesticated species that tends to rest in locations hidden indoors, making it hard for insecticide to reach adult mosquitoes [6]. Appropriate timing for insecticide application is also under discussion. Focusing in and around the houses of
Author Summary

Dengue virus infection is a serious infectious disease transmitted by Aedes mosquitoes in the tropics and subtropics. Disease control often involves the use of insecticide fogging against mosquito vectors. However, the effectiveness of this method for reducing dengue cases, in addition to appropriate application procedures, is still debated. The previous mathematical simulation study reported that insecticide fogging reduces dengue cases most effectively when applied soon after the epidemic peak; however, the model did not take into account seasonality and population immunity, which strongly affect the epidemic pattern of dengue infection. Considering these important factors, we used a mathematical simulation model to explore the most effective time for insecticide fogging and to evaluate its impact on reducing dengue cases. Simulations were conducted with various lengths of the wet season and population immunity levels. We found that insecticide fogging substantially reduces dengue cases if conducted at an appropriate time. In contrast to the previously suggested application time during the peak of disease prevalence, the optimal timing is relatively early: between the beginning of the dengue season and the prevalence peak.

When assessing the current dengue situation, seasonality and transmission intensity are critical determinants of epidemic patterns that should be taken into consideration when evaluating and optimizing the impact of insecticide fogging. Some studies suggested that the optimal timing and the impact of insecticide fogging might differ from results reported by N&R when also considering seasonality [12,17]. However, the most appropriate time for insecticide fogging to effectively prevent dengue incidence was not definitively provided in these studies. Thus, we aimed to identify the optimal timing for insecticide fogging and its impact on reducing cases of DENV infection by using a mathematical simulation model of dengue transmission dynamics that included various seasonal settings and transmission intensities.

Methods

The model

We used the structure of the N&R model [10] and partly modified it to: 1) add seasonality and 2) produce the endemic state. Equations are presented below. Host population was divided into $S_h$ (susceptible), $E_h$ (exposed), $I_h$ (infectious) and $R_h$ (recovered). Vector population was also divided into $S_v$ (susceptible), $E_v$ (exposed) and $I_v$ (infectious).

Host population

$$\frac{dS_h}{dt} = N_h \frac{T_h}{T_{ih}} - S_h (c_{h} \frac{I_h}{N_h} + \frac{1}{T_{th}})$$

(1)

$$\frac{dE_h}{dt} = S_h c_h \frac{I_h}{N_h} - E_h (\frac{1}{T_{it}} + \frac{1}{T_{th}})$$

(2)

$$\frac{dI_h}{dt} = E_h \frac{1}{T_{it}} - I_h (\frac{1}{T_{id}} + \frac{1}{T_{th}})$$

(3)

$$\frac{dR_h}{dt} = I_h \frac{1}{T_{id}} - \frac{R_h}{T_{th}}$$

(4)

Vector population

$$\frac{dS_v}{dt} = \epsilon - S_v \left( c_v \frac{(I_v + I_v \text{stat})}{N_v} + \frac{1}{T_{tv}} \right)$$

(5)

$$\frac{dE_v}{dt} = S_v \left( c_v \frac{(I_v + I_v \text{stat})}{N_v} \right) - E_v (\frac{1}{T_{it}} + \frac{1}{T_{tv}})$$

(6)

$$\frac{dI_v}{dt} = E_v \frac{1}{T_{it}} - \frac{I_v}{T_{tv}}$$

(7)

Parameters and parameter values are shown in Table 1.

Seasonality. We considered both wet and dry seasons. In the real-life situation, seasonal changes in temperature have a great impact on mosquito survival and viral growth, and rainfall influences the availability of larval habitat of the vector [18–20]. However, to minimize model complexity, we assumed two seasons that affect only the mosquito lifespan ($T_{lv}$). The emergence rate of adult mosquitoes ($\epsilon$) was set based on N&R’s assumption [10] that carrying capacity was divided by vector lifespan (4 days). When we added seasonality into the model, we assumed that mosquito
Table 1. Parameter values for the simulations.

<table>
<thead>
<tr>
<th>Parameter</th>
<th>Symbol</th>
<th>Value</th>
<th>Source</th>
</tr>
</thead>
<tbody>
<tr>
<td>Host population</td>
<td>(N_h)</td>
<td>10,000</td>
<td>10</td>
</tr>
<tr>
<td>Host life span</td>
<td>(T_{h})</td>
<td>600,060 hours (68.5 years)</td>
<td>10</td>
</tr>
<tr>
<td>Intrinsic incubation period</td>
<td>(T_{iv})</td>
<td>5 days</td>
<td>10</td>
</tr>
<tr>
<td>Extrinsic incubation period</td>
<td>(T_{ex})</td>
<td>10 days</td>
<td>10</td>
</tr>
<tr>
<td>Number of mosquitoes per person</td>
<td>(MPP)</td>
<td>2–15</td>
<td></td>
</tr>
<tr>
<td>Emerging rate of adult mosquitoes</td>
<td>(e)</td>
<td>5,000–37,500/day (*)</td>
<td>10</td>
</tr>
<tr>
<td>Vector life span</td>
<td>(T_{v})</td>
<td>4 days (wet season) (\text{and}) 3 days (dry season)</td>
<td>10</td>
</tr>
<tr>
<td>Visiting infectious host</td>
<td>(I_{v,visit})</td>
<td>0 in Simulation 1 and 2 (0.001) in Simulation 3 and 4</td>
<td>20</td>
</tr>
<tr>
<td>Host infection duration</td>
<td>(T_{i})</td>
<td>3 days</td>
<td>10</td>
</tr>
<tr>
<td>Effective contact rate, vector to host</td>
<td>(c_{av})</td>
<td>0.75/day</td>
<td>10</td>
</tr>
<tr>
<td>Effective contact rate, host to vector</td>
<td>(c_{hv})</td>
<td>0.375/day</td>
<td>10</td>
</tr>
</tbody>
</table>

\(*5,000\) for Simulation 1–3 (MPP = 2); \(7,500, 12,500, 20,000 \) and \(37,500\) for MPP = 3, 5, 8 and 15 in Simulation 4.

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emergence is not affected by the season and is a constant, which may be true in areas where the dengue vector breed in domestic water containers that do not receive rainwater. The density of adult mosquitoes was calculated as \(eT_{h}\) at the equilibrium and was higher during the wet season.  

**Insecticide.** Single pulse fogging was conducted in all simulations. Fogging was implemented at noon on each day of application. For each insecticide application, 60% of the total mosquitoes were assumed to be killed. No residual insecticide efficacy was included in our model so that, after application, there was no effect on surviving or newly-emerged mosquitoes [10,17]. N&R assumed a density-dependent recovery rate after insecticide fogging; however, we assumed that the fogging did not affect larval and pupal population. Density dependence was therefore not included in adult population dynamics, and the emergence rate of mosquitoes after fogging was also the same rate as \(e\).

**Simulations**  
Fogging was applied each day from the 1st to the 365th day of the year, during which time, the wet season was assumed to occur at the beginning of the year. The annual number of infected cases was calculated at each application and the day when fogging resulted in a maximum reduction of dengue cases was defined as the optimal day for fogging. The simulation was conducted numerically with a time-step of one hour using Microsoft Excel.

**Simulation 1: Identical settings to N&R’s base case.** This simulation was carried out for 1 year using the same settings as N&R’s base case simulation [10]; the host population was completely naïve to DENV and the initial value of \(I_{i}\) was set to 1 on the first day of the year. The optimal day for fogging, and the proportion of the prevented cases, were compared with the results from N&R’s simulation.

**Simulation 2: Simulation 1 + seasonality.** We added seasonality to the model by changing vector life span (\(T_{h}\)) for 4 days in the wet season and 3 days in the dry season during the course of the simulation. Wet season duration was set to 4, 5 and 6 months (one month = 30 days). All parameters except \(T_{h}\) were the same as for Simulation 1. The optimal day for fogging and maximum case reduction were investigated for each wet season in a year.

**Simulation 3: Simulation 2 + endemic state.** This simulation was run for 499 years without any intervention to produce an endemic state. When we simulated dengue transmission over many years with a single initial introduction of DENV, we often found that the prevalence decreased to a very low level during the dry season and never recovered to the visible level during the successive wet season. This is not the case in actual dengue endemic areas, where infected hosts or vectors occasionally enter the system and maintain transmission. To simulate stable seasonal dynamics, the number of infected hosts that temporarily visit an area but are not included in the resident population (\(I_{v,visit}\)) was added into equations 5 and 6. For strict mathematical consistency, \(I_{v,visit}\) should be added to the denominator; however, as we set \(I_{v,visit}\) to be a very small value (0.001) compared with the total population (10,000), it was omitted from the denominator. Therefore, we assumed a constant rate of virus introduction (\(I_{h,visit}\)) which was 0.00001% of the total host population from the first day of the simulation. As the coefficient of variation for annual cases was less than 1% over 10 years (the 490th–499th year) in all settings, we considered that the endemic state had been reached in this stage. Fogging was applied in the 500th year, and the optimum day for fogging to minimize dengue cases in this year was calculated.

**Simulation 4: Simulation 3 + various transmission intensities.** These simulations were conducted using higher transmission intensities than in Simulation 2. The number of mosquitoes per person (MPP) was increased from 2 to 3, 5, 8 and 15 for low, moderate, high and very high endemic situations, respectively. The day and proportion of most prevented cases were investigated at each MPP.

**Results**

**Simulation 1**  
Our results were very similar to those obtained for N&R’s simulation (Table 2). The maximum reduction in cases was observed when fogging was conducted 6 days after the prevalence peak; however this reduction only amounted to 6.7% of the total cases (Fig. 1A).

**Simulation 2**  
The epidemic magnitude was smaller when the wet season was shorter (Table 2). Dengue incidence generally increased exponentially during the wet season (Fig. 1B), and started to decline rapidly within the few days after the onset of the dry season, during which...
time, climatic conditions for mosquitoes are unfavorable. Our results showed that the optimal day for fogging was earlier than in Simulation 1 for all wet season durations assessed. The proportion of prevented cases was greater during a shorter wet season.

Simulation 3

In the endemic state, the yearly number of cases was much smaller than that observed in Simulation 1 and 2 (Table 2, Fig. 1C). Optimal timing of fogging shifted to a much earlier time than in Simulation 2, and more than 40% of the cases were prevented during the wet season of any length.

Simulation 4

Population immunity level also increased with an increase in MPP and the length of wet season (Table 1). In the lower endemic situations (MPP = 3 and 5), a maximum reduction in cases was observed between 81 and 116 days before the prevalence peak, and over 40% of cases were mostly prevented during the wet season of any length. In the higher endemic situations (MPP = 8 and 15), a maximum reduction in cases was also observed earlier than the prevalence peak. The proportion of prevented cases was 35.9–39.6%, which was slightly lower than a MPP of 2, 3 and 5.

Overall, the most effective time for insecticide fogging was early in the wet season, when over 35% of the cases were prevented at any transmission intensity level. The greatest impact of fogging was observed during shorter wet seasons and for lower transmission intensities. The proportion of cases prevented by fogging on each day of the year is shown in Fig. 2, and the green area indicates the greatest proportion of cases prevented (>40%).

The proportion of prevented cases at and after the prevalence peak was not optimal in any settings for an endemic situation.

Discussion

We successfully developed a model for predicting the most optimal time for insecticide fogging against dengue mosquitoes, which will potentially help reduce the number of dengue cases in endemic regions of the world. By including additional parameters, such as seasonality and disease transmission rates, our model more accurately depicted epidemic outbreaks when compared with the previously published model.

Our simulation results for a naive population with no seasonal setting were similar to those obtained with the N&R model [10]. The greatest reduction of dengue cases was observed when fogging was conducted several days after the prevalence peak, but the impact was minimal. When climatic conditions are favorable for mosquitoes throughout the year, insecticide fogging only slows down the epidemic curve temporarily even if implemented intensively. After fogging, mosquito populations recover rapidly and transmit DENV to susceptible people. Dengue incidence subsequently continues to increase until population immunity reaches a level at which the recovery rate exceeds the new infection rate. In such a situation, fogging reduced dengue cases when conducted after the prevalence peak by accelerating the natural decline of the epidemic.

When we considered seasonality, the results were completely different. The optimum timing for insecticide fogging shifted earlier than the prevalence peak; because it interferes with the exponential epidemic growth at a certain point and prevents the prevalence peak from reaching the original level by the end of the wet season (Fig. 1B). Furthermore, when considering both endemicity and seasonality, the optimum timing for insecticide fogging shifted to an earlier time and the proportion of prevented cases was greater. The period of greatest prevention was observed relatively early in the wet season (Fig. 2, in green).

DENV has four different serotypes that simultaneously circulate in most dengue endemic countries. Such co-circulation of multiple serotypes greatly influences long-term epidemic patterns. We additionally evaluated the optimal timing of insecticide fogging by including the co-circulation of four serotypes in endemic situation. The results indicated that the optimal application was also between the onset of the wet season and the prevalence peak (results are shown in Text S1). Therefore, we suggest that hyperendemicity did not affect our findings.

Our model however, does have some limitations when applying simulations to actual dengue endemic areas, due to the simplification of parameters to understand the overall effects of insecticide fogging. First, our assumption of seasonal change was represented by two different values of mosquito lifespan, which
was too simple to describe real seasonal dynamics. However, as we aimed to provide a practical strategy for determining optimal insecticide fogging in general, we prioritized the model simplicity and clearly distinguished the on and off-dengue seasons. Various biological features may fluctuate seasonally and affect dengue epidemics. However, when a year can be divided into the on and off-dengue seasons, temporary reduction of adult mosquito population by fogging in the middle of the on-dengue season would delay epidemic growth and prevent cases (Fig. 1B). Thus, population by fogging in the middle of the on-dengue season is effective strategy if implemented too early (Fig. 2). However, the low vector survival rate in our model did not support our conclusion, we set the mosquito lifespan assumption to estimated to be slightly longer than our assumption: 5.3–9.1 days [23], which was not included in our model. As insecticide resistance has already become a serious problem in many dengue endemic countries [24,25], it is important to carefully consider which insecticides can effectively reduce mosquitoes in the target areas on the basis of biological evidence. The spraying method used to allow the insecticides to reach mosquitoes also requires further investigation. Although our results may not show the best strategy for the long-term prevention of dengue epidemics, they should be interpreted as the optimal strategy for the non-regular emergency treatment during major epidemics.

Despite these limitations, our model has a clear practical significance for dengue control in regions where this disease has been endemic for a long time and its epidemic pattern is affected by seasonal climate factors. The optimal timing of insecticide fogging to reduce dengue incidence most effectively is between the beginning of the wet season and the prevalence peak, rather than waiting until the peak of a major outbreak occurs.

### Table 2. Summary of the simulation results.

<table>
<thead>
<tr>
<th>Setting</th>
<th>MPP</th>
<th>Wet season (months)</th>
<th>Herd immunity</th>
<th>Day of prevalence peak</th>
<th>No. of annual cases</th>
<th>Prevented cases</th>
<th>Best day of fogging</th>
<th>Difference from the peak</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td>Without fogging</td>
<td>With fogging</td>
<td></td>
<td></td>
</tr>
<tr>
<td>N&amp;R’s base case</td>
<td>2</td>
<td>12</td>
<td>0%</td>
<td>163</td>
<td>7,561.9</td>
<td>7,044.2</td>
<td>6.8%</td>
<td>169</td>
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<td>Simulation1</td>
<td>2</td>
<td>12</td>
<td>0%</td>
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<td>7,616.0</td>
<td>7,120.0</td>
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<td>169</td>
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<tr>
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<td>4</td>
<td>0%</td>
<td>125</td>
<td>2,614.8</td>
<td>1,874.0</td>
<td>28.3%</td>
<td>60</td>
</tr>
<tr>
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<td>0%</td>
<td>152</td>
<td>4,788.8</td>
<td>3,793.0</td>
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<td>112</td>
</tr>
<tr>
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<td>6</td>
<td>0%</td>
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<td>6,259.7</td>
<td>5,592.0</td>
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<td>139</td>
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<td>12.8</td>
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<td>39.2</td>
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<td>56.0</td>
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<td>67.1%</td>
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<td>125</td>
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<td>89.7%</td>
<td>184</td>
<td>131.0</td>
<td>84.0</td>
<td>35.9%</td>
<td>79</td>
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</table>

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Supporting Information

Text S1 Supplementary method and results of the simulations with four DENV serotypes.

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References


Figure 2. Proportion of cases prevented by single insecticide fogging. MPP is the number of mosquitoes per person. The wet season occurs at the beginning of the year. Blue lines represent the optimal day of fogging and red lines indicate the prevalence peak.
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Author Contributions

Conceived and designed the experiments: TS MO. Performed the experiments: MO. Analyzed the data: MO TS MH TY. Wrote the paper: MO.