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# Spatial Variations in Dengue Transmission in Schools in Thailand

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# Abstract

# Background

Dengue is an important neglected tropical disease, with more than half of the world's population living in dengue endemic areas. Good understanding of dengue transmission sites is a critical factor to implement effective vector control measures.

#### Methods

A cohort of 1,811 students from 10 schools in rural, semi-rural and semi-urban Thailand participated in this study. Seroconversion data and location of participants' residences and schools were recorded to determine spatial patterns of dengue infections. Blood samples were taken to confirm dengue infections in participants at the beginning and the end of school term. Entomological factors included a survey of adult mosquito density using a portable vacuum aspirator during the school term and a follow up survey of breeding sites of *Aedes* vectors in schools after the school term. Clustering analyses were performed to detect spatial aggregation of dengue infections among participants.

#### Results

A total of 57 dengue seroconversions were detected among the 1,655 participants who provided paired blood samples. Of the 57 confirmed dengue infections, 23 (40.0%) occurred in students from 6 (6.8%) of the 88 classrooms in 10 schools. Dengue infections did not show significant clustering by residential location in the study area. During the school term, a total of 66 *Aedes aegypti* mosquitoes were identified from the 278 mosquitoes caught in 50 classrooms of the 10 schools. In a follow-up survey of breeding sites, 484 out of 2,399 water containers surveyed (20.2%) were identified as active mosquito breeding sites.



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#### **Discussion and Conclusion**

Our findings suggest that dengue infections were clustered among schools and among classrooms within schools. The schools studied were found to contain a large number of different types of breeding sites. *Aedes* vector densities in schools were correlated with dengue infections and breeding sites in those schools. Given that only a small proportion of breeding sites in the schools were subjected to vector control measures (11%), this study emphasizes the urgent need to implement vector control strategies at schools, while maintaining efforts at the household level.

#### Introduction

The global incidence of symptomatic and asymptomatic dengue infections per year is estimated at about 400 million, and it is expected to rise [1]. More than half of the world's population lives in dengue endemic areas with more than 70% of those at risk reside in Asia Pacific region, and further geographic expansion of dengue is anticipated because of globalisation, urbanisation, and climate change [2–5]. Thailand is experiencing steadily increasing urbanization; the urban population increased from roughly 45% of the total population in 2000 to 49% of total population in 2014 [6]. This transition from rural towards urban patterns of living has directly affected dengue infection rates [4]. In the absence of vaccines and antiviral therapies specifically targeting the dengue virus, dengue prevention and control efforts have relied heavily on vector control; and these efforts have mostly proved ineffective in the effort to control dengue transmission or outbreaks. Therefore, complementary vector control strategies are urgently needed to protect at-risk populations in endemic areas.

In Thailand, dengue is a serious public health concern and a leading cause of childhood hospitalisations [7]. The average age of dengue infected patients has progressively shifted towards older children and younger adults in the past two decades with the age group 10–14 years carrying the greatest burden [8]. Without adequate care, the infection-fatality rate for severe dengue can be as high as 20%, but this can be reduced to less than 1% with good patient management [7,9,10].

Aedes aegypti and Aedes albopictus are the predominant vectors for dengue, and both vectors are daytime biters [11–14]. Given this daytime biting behaviour, it is important to identify dengue transmission sites in order to better target vector control interventions and hence increase their effectiveness. Several studies have claimed that the majority of dengue infections occur peridomestically [15–17], and vector control has therefore been targeted at residential areas. While vector control in schools has been proven effective in reducing dengue infections in Thailand, schools are still generally neglected as implementation sites [18,19]. Given that school-aged children spend a large part of their day at school, it also makes sense to equally target schools using dengue vector control measures, since controlling dengue infection in children is a priority. Although schools have previously been suggested as potential sites for dengue transmission based on adult vector and larvae surveys, results from many studies have been inconsistent [20–22]. A similar study in Thailand focusing on dengue hemorrhagic fever, using active disease surveillance and vector survey methods, suggested that dengue transmission was most likely to happen in households [23]. So far, there have been no robust data to validate dengue infection for investments in vector-based control strategies targeting schools [24].

The main objective of this study is to explore whether schools are likely dengue transmission sites for school children by assessing dengue infections and *Aedes* vector abundance in schools.

Using a combination of seroconversion data, households' geographic information data, and participants' classroom data, we aim also to explore possible dengue clustering among school children at the classroom-level.

#### **Materials and Methods**

In order to determine whether schools were active sites for dengue transmission, geospatial analysis of confirmed dengue infections and surveys of *Aedes* vectors were carried out in 10 schools. First, serological surveys were carried out in children from 10 selected schools to identify dengue infections. Second, we surveyed both adult and immature stages of *Aedes* vectors in the same selected schools to assess the potential risk of dengue transmission in the schools. Third, mapping and clustering analysis of confirmed dengue infections were performed at both school and household levels.

# Study setting and participants

The study was conducted in Plaeng Yao District of Chacheongsao Province in eastern Thailand. Located in an area of high dengue endemicity, Plaeng Yao District had a population of 17,963 in 7,233 households in 2013, and covering an area of 236 km<sup>2</sup> [25]. The district is divided into four sub-districts with a total of 48 villages. The economy of Plaeng Yao District was historically based on agriculture such as rice paddies, fruit plantations, and livestock. However, over the past decade, the district has become more industrialized with farms turning into factories and rural areas transitioning into semi-rural and semi-urban areas. This study was carried out in 10 out of 24 schools in the District as shown in Fig 1. All students in the 10 schools were eligible to participate in this study. However, transferred students, students without consent forms, and students without paired-blood samples for seroconversion test due to unavailability for either blood sample were excluded from the study. A total of 1,811 students were enrolled in the trial, however, only 1,655 pairs of blood samples were obtained at the beginning and at the end of the school term. Hence our analyses are based on 1,655 students (91.4% of those enrolled).

# **Ethical Considerations**

The protocol for this study was reviewed and approved by the Ethical Review Board of Mahidol University and Heidelberg University. Participant information, such as classroom number, grade, age, address, and phone number, was collected from school records. Parental written consent was obtained for all participating students. In the case of children aged 12 years and older, individual written assent was also obtained.

#### Dengue infection monitoring

The rainy season is usually from July to October in this area of Thailand, and the school term runs from June to November. We collected blood samples via finger-prick (<0.2 ml) from participating students at the beginning and end of the school term (June and November 2012). Dengue IgG enzyme-linked immunosorbent assays (ELISA) were first performed for all paired samples. If one or both samples (from the beginning and the end of the school term) were positive, paired samples were further assessed by monoclonal antibody (MAb)-based capture ELI-SAs, in which Dengue IgG indirect ELISAs were performed using a purified 2H2 monoclonal antibody for coating plates on paired samples. Results were expressed in terms of positive to negative ratio as described by Johnson *et al.* [26].



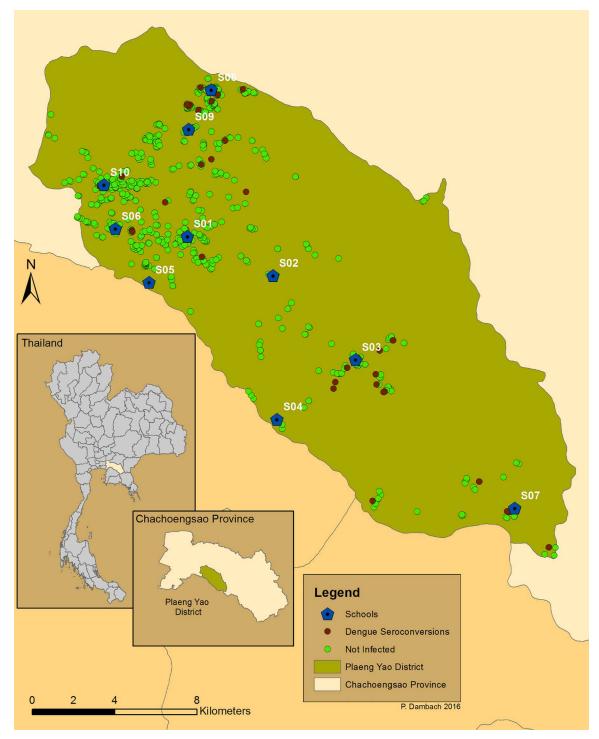


Fig 1. Map of the study area in Chachoengsao Province, indicating the location of schools and participants' residents. Each point represents a school, or a household of each participating student, (either serologically positive and negative).

# Entomological monitoring

At baseline in June 2012, indoor adult mosquito surveys were conducted by trained staff inside five randomly selected classrooms in each participating school, using locally made portable vacuum aspirators, for 15 minutes per room. For quality insurance purpose, the same operator conducted the surveys for all schools. Mosquitoes collected from classrooms were transferred to the Center of Excellence for Vectors and Vector-Borne Diseases (CVVD), Faculty of Science, Mahidol University to be counted and identified for species.

In order to identify and characterize the type of breeding sites of *Aedes* vectors at the schools, monthly larvae/pupae follow-up surveys were conducted from May 2013 to June 2014 by members of staff from Mahidol University together with public health volunteers trained to use and fill in the data collection form. For each school, the school grounds and neighbouring residential areas within 1 km were inspected. Surveys recorded the type and number of breeding containers with water, the presence of *Aedes* larvae and pupae, and the vector control measures in place. Only the sites that actually contained water were recorded as potential breeding sites.

#### Data analysis

Entomological and serological data were handled using Microsoft Excel 2011. STATA 12 (Stata Corporation, College Station, TX, USA) was used for data analysis, including the **cij** command for confidence intervals of proportions based on the Jeffreys uninformative prior, because of the relatively small numbers and rates involved. Statistical significance was taken as p<0.05. Data that were not normally distributed, such as mosquito counts, were log-transformed. Regression of dengue infection data in relation to entomological parameters was weighted by the number of participating students in each school. The dengue infections were further disaggregated to classroom level within schools. Poisson goodness-of-fit statistics were used to assess the extent to which these dengue infections were clustered among classrooms. Although the numbers were too small to meaningfully compare dengue infection rates between classrooms, it was possible to consider, within each school, whether or not the total number of dengue infections observed were clustered within classrooms. This was done, by comparing the actual distributions of dengue infections.

# Mapping and geospatial clustering analysis

For clustering analysis, basic mapping of the study area within Plaeng Yao District was performed using Google Earth 7.1 satellite views. After obtaining individual consent, home addresses of the participating students were acquired from school records. Households and schools were geo-referenced using Google Earth with the help and knowledge of local individuals. Geo-referenced households and schools were then mapped using ArcGIS 10.3 (Environmental Systems Research Institute, Inc. Redland, CA, USA). Spatial clustering analysis was done using 50, 100, and 200-metre buffers around households. It evaluated spatial clustering of dengue infections in households using z-scores, assuming that they were randomly distributed among all households. A clustering analysis was performed using a Poisson model with SatScan<sup>TM</sup> software v9.4.2 (National Cancer Institute, Division of Cancer Control and Population Sciences, Statistical Research and Applications Branch).

#### Results

#### **Dengue** infections

Table 1 presents the characteristics of the 10 study schools and their immediate environment. A total of 1,811 students were enrolled in the study, corresponding to an overall participation



School Code	Total number of students	Number of participating students (%)	Number with paired blood samples (%)	Number of incident dengue infections	Dengue infection rate /1,000 (95% CI)	Grades taught	Environmental setting of study schools		
S01	214	170(79%)	167(98%)	8	48(23 to 88)	Preschool and grades 1–6	Semi-urban with a nearby public park and a lake Semi-rural with farm land and farm reservoirs		
S02	44	28(64%)	26(93%)	0	0(0 to 91)	Preschool and grades 1–6			
S03	240	170(71%)	152(89%)	15	99(59 to 154)	Preschool and grades 1–6	Semi-rural with nearby houses and a temple		
S04	345	325(94%)	262(81%)	5	19(7 to 41)	Preschool and grades 1–6	Semi-rural with a nearby temple and plantation		
S05	48	45(94%)	15(33%)	0	0(0 to 152)	Preschool and grades 1–6	Rural with nearby temple and plantation		
S06	194	112(58%)	110(98%)	0	0(0 to 23)	Preschool and grades 1–6	Rural with nearby temple and plantation		
S07	169	75(44%)	68(91%)	6	88(38 to 173)	Preschool and grades 1–6	Rural with nearby temple and plantation		
S08	416	358(86%)	346(97%)	11	32(17 to 54)	Preschool and grades 1–9	Semi-urban with nearby temple, market and rice paddies		
S09	274	234(85%)	224(96%)	9	40(20 to 72)	Preschool and grades 1–9	Semi-urban, next to a village, shop houses and nearby rice paddies		
S10	370	294(79%)	285(97%)	3	11(3 to 28)	Preschool and grades 1–6	Semi-urban, in village center with nearby public park and man-made lake		

#### Table 1. School characteristics and summary of dengue infections by school in Plaeng Yao District, Chachoengsao Province.

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rate of 78%, ranging from 44% at school S07 (rural) to 94% at school S04 (semi-rural). Twentyeight students transferred out of the school during the study period. Additionally, 128 students did not provide a second blood sample. Therefore, a total of 1,655 students were included in the analysis of this study. The students resided in 88 classrooms during school hours over the 10 schools. A total of 57 confirmed dengue infections were detected in 7 of the 10 schools (Fig 1). School S03 (semi-rural) had the highest incidence rate of 99 per 1,000 (15 infections among 152 participating students with paired blood samples) during the study. The overall incidence rate for the 10 schools was 34 per 1,000 (57 infections among 1,655 participating students with paired blood samples). Confidence intervals around dengue infections at the school level (Table 1) showed significant differences between some schools when intervals did not overlap. It indicates that school S03 (semi-rural) had a significantly higher infection rate than schools S04 (semi-rural), S06 (rural), S08 (semi-urban) and S10 (semi-urban). It was clearly not the case that dengue infections were randomly distributed over schools, even in this relatively small geographic area.

The actual distribution of dengue infections among classrooms in each school was compared with expected Poisson distribution (Table 2). Displayed in Table 2, of the seven schools with dengue infections, three, i.e., schools S03 (semi-rural), S04 (semi-rural) and S08 (semiurban) had distributions of infections among classrooms that were significantly clustered when



School	Number of classrooms with participants	ith Number of dengue infections in school	Number of classrooms listed according to the number of dengue infections (di)						Comparison of observed vs. Poisson expected	
				1 di	2 di	3 di	4 di	5 di	6 di	
S01	8	8	4	1	2	1	0	0	0	not clustered
S02	5	0	5	0	0	0	0	0	0	-
S03	9	15	2	3	3	0	0	0	1	$\chi^2 = 20.1, p = 0.001$
S04	9	5	7	1	0	0	1	0	0	χ <sup>2</sup> = 49.6, p < 0.001
S05	6	0	6	0	0	0	0	0	0	-
S06	6	0	6	0	0	0	0	0	0	-
S07	6	6	3	1	1	1	0	0	0	not clustered
S08	18	11	10	7	0	0	1	0	0	χ <sup>2</sup> = 18.1, p = 0.003
S09	9	9	3	4	1	1	0	0	0	not clustered
S10	12	3	10	1	1	0	0	0	0	not clustered

Table 2. Clustering of dengue infections in classrooms within the study schools. Results in bold indicate statistical significance in clustering of dengue infections in classrooms.

compared with the expected Poisson distribution (p<0.001). Overall in the 10 schools, 23 out of the 57 dengue infections (40.0%) occurred in 6 of the 88 classrooms (6.8%).

#### Spatial clustering analyses

For assessing clustering of dengue infections by residential location, it was possible to locate the residences of 39 out of a total of 57 students with dengue infections. Those students who could not be located included five who had moved out of Plaeng Yao District; two who had incomplete addresses in their school records; and 11 whose residences could not be successfully located. A total of 1,035 households of participants without dengue infection were located. Using residential location, we observed that no two infections occurred in the same household. Four infected students resided in households located fewer than 50 metres from each other, and 12 in households within 100 metres of each other. Clustering among residential locations of all participants was then compared to that of participants with dengue infections (<0.0001, z-score = -43.7 vs. <0.001, z-score = -4.58). Results revealed a greater clustering of the households of study participants in general (higher z-score) than those with the dengue infections themselves (lower z-score). Houses in a village are inherently and spatially clustered because of the nature of human settlements and, in Plaeng Yao communities, participants attending the same schools generally resided in the same villages. The z-score results did not, however, suggest that dengue infections were clustered at household level. A further clustering analysis, using the Poisson model in SatScan<sup>TM</sup> and based on the reference distribution of participants' households, detected five clusters of dengue infections. Only one cluster was significant (p = 0.006), covering roughly half of the study area. This weak result reflected a lack of substantial clustering among dengue infections when adjusting for the spatial distribution of non-dengue infections. Combined, these three approaches suggest that there is no strong clustering of dengue infections within residential areas.

#### Entomological parameters

In-classroom mosquito surveys were conducted in June 2012. A total of 66 *Ae. aegypti* were identified among 278 mosquitoes (amounting to 24%), collected from 50 classrooms. The highest number of 83 mosquitoes per catch day collected in a school by a portable vacuum aspirator came from school S04 (semi-rural). However, the highest number of *Ae. aegypti* collected was

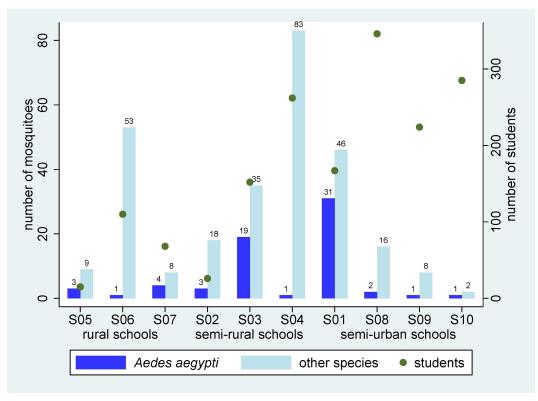


Fig 2. Numbers of mosquitoes caught in schools during school terms using portable vacuum aspirators. Schools are classified by rural, semi-rural or semi-urban status and ranked by the number of students.

31 from school S01 (semi-urban) (Fig 2). There was a strong and significant correlation between dengue infection and the number of mosquitoes caught by a portable vacuum aspirator in classrooms, as shown in Fig 3 ( $R^2 = 0.50$ , p<0.001), allowing for the difference in the number of participants per school using a weighted regression.

#### Breeding site follow-up survey

Based on the surveys of breeding sites of *Aedes* vectors after the study, 6 out of the 10 schools were characterized as being located in rural or semi-rural areas surrounded by rice paddies and plantations with nearby villages while four schools were located in a semi-urban setting with household residences and commercial shops located in close proximity but not close enough to be classified as urban (Table 1). A total of 2,399 *Aedes* breeding containers filled with water were identified during the rainy season in all 10 schools during the follow-up breeding site inspection. The school with the highest number (368) of breeding containers with water was school S06 (rural) and that with the lowest number (122) was school S04 (semi-rural). Across all schools, 484 breeding sites (20.2%) were positive for mosquito larvae or pupae. The schools with the highest (106) and lowest (13) numbers of active breeding sites were schools S08 (semi-urban) and S05 (rural), respectively. In a regression of log-transformed number of active breeding sites against dengue infections, weighted for the number of participating students in each school, there was an overall correlation as shown in Fig 4 ( $R^2 = 0.03$ , p <0.001), which was statistically significant but without a very strong association.

The numbers and types of breeding sites of *Aedes* vectors by school are shown in Fig 5, with substantial differences in overall numbers and types of breeding sites across schools being

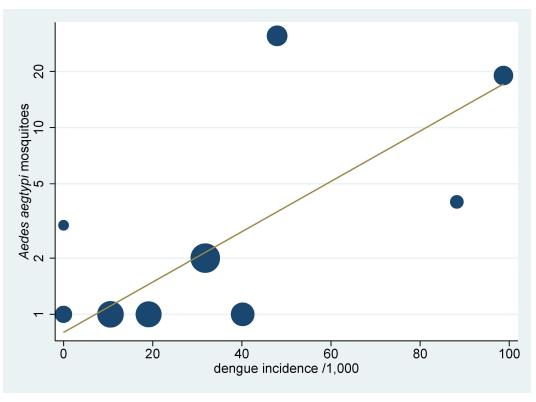


Fig 3. Numbers of mosquitoes caught vs. dengue infections in each school. Each circle represents a school; the size of the circle is proportional to the number of participating students in a school. The regression line is weighted by the number of participating students in each school.

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observed. Among the active breeding sites, the most common types were cement and fabricated water tanks (used for storage of ground water and drinking water respectively) (56.4% combined) and car tyres (8.5%). Vector control measures were only carried out only in 10.7% of all breeding sites, with the use of temephos (32.3%), container covers (30.4%), and larvivorous fish (23.3%) being the most common measures taken, as shown by the container type in Fig 6. Overall, 96% of all vector control efforts were focused at the major breeding sites, primarily cement and fabricated water tanks.

#### Discussion

Based on the clustering of dengue infections among school children within school and classroom, the significant correlations between dengue infections and the number of *Aedes* mosquitoes caught in the classrooms together with the active breeding sites in the environment of the schools, our study suggests that schools may be a potential dengue transmission site among school children. Despite the large cluster identified by SatScan as significant, it could not be used as evidence to conclude that dengue infections were actually clustered within the study area by residential location due to its large size covering half of the study area.

The strength of our study is that we identified all incident dengue infections (asymptomatic and symptomatic) through paired blood samples. The large variation of school sizes and participation rates were controlled for, as far as possible, by considering dengue infection rates among participating students. Nonetheless, Fig 3 and Fig 4 show large variability that could explain only in part by the parameters studied. Furthermore, we used a combination of



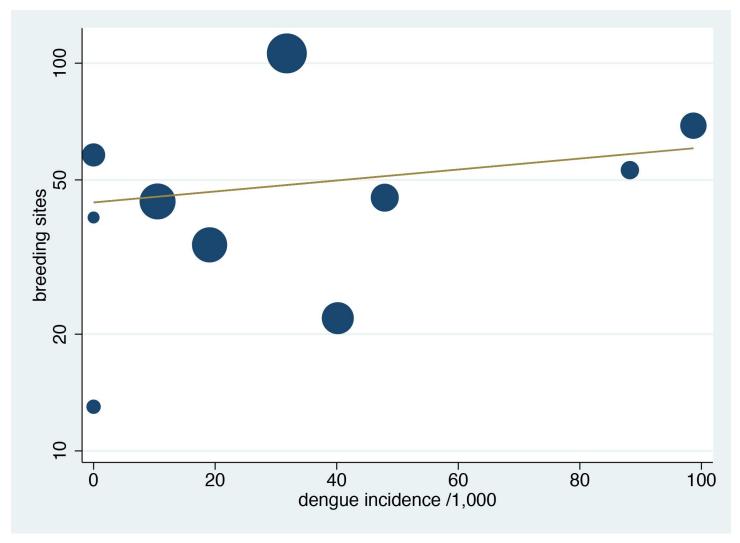
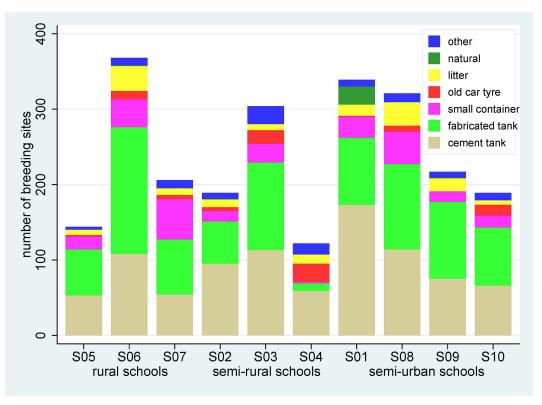


Fig 4. Numbers of active breeding sites of *Aedes* vectors vs. dengue infections in each school. Each circle represents a school, and the size of the circle is proportional to the number of participating students. The regression line is weighted by the number of participating students in each school.

methods that included assessment of mosquito densities, clustering analyse in classrooms, as well as geospatial analyses, in order to identify clustering in residential areas versus schools; all enhanced by surveys to identify *Aedes* breeding sites around schools. Nevertheless, we did not take into consideration dengue infections of people living in the same households or in close proximity to infected children. A further study would be needed to evaluate and clearly compare the importance of transmission site between households and schools.

Our finding that schools are possible sites for dengue transmission is biologically plausible given that *Ae. aegypti* bite mainly during the day, with peaks of biting reported between 10.00–11.00 and around 15.00 [12]. Schools in Thailand start around 08.00 and end at 16.00. Because *Ae. aegypti* usually have a limited flight range (<100m) [27], a high concentration of this mosquito species would suggest that dengue transmission is likely to occur within the proximity where *Aedes* mosquitoes are caught. Recent studies from Colombia and Mexico also highlighted schools as potential transmission sites using entomological data as their main evidence [20,21]. Olano et al. (2015) performed entomological surveys (both adult and immature





forms) in rural schools in Colombia and found the greatest numbers of Ae. aegypti females within classrooms in comparison to the overall school indoor space. Furthermore, during the wet season, a high infestation with Ae. aegypti females was observed, with more than half of those caught from schools were in classrooms [21]. Another study by García-Rejón et al. (2011) performed an adult mosquito survey in 24 schools in Mexico and also found the greatest numbers of Ae. aegypti females in classrooms [20]. Furthermore, García-Rejón et al. stated that, out of a total of 415 Ae. aegypti females caught, 118 were blood-fed and 16.1% of bloodfed mosquitoes tested positive for DENV infection [20], confirming our study results. Additionally, a large proportion of dengue infections in children are asymptomatic or mild [28-30]. Asymptomatic or mildly symptomatic children who continue to go to school contribute to dengue transmission, as shown in a study in Thailand [29]. However, because the numbers of dengue infection at the classroom level were too small in our study, we had to assume as a null hypothesis that, within each school, classrooms were potentially homogeneous units in terms of how dengue infections in school might be distributed. It was not possible to take classroom location within a school premise into consideration, therefore the reasons for substantial clustering of infections by classroom in some schools remain unexplained.

Through a follow-up survey, we identified the main types of breeding sites for larvae and pupae to be water tanks at 74% of total breeding sites. Among water tanks found, 51% were made of cement and 49% from other types of fabricated materials such as plastic. These tanks were used to store water and required special attention from schools so as to be covered appropriately. The relatively consistent findings between both the number of *Aedes* mosquitoes caught and the breeding sites in relation to dengue infections are encouraging; it could be that the breeding site correlation would have been stronger if the breeding sites containing only

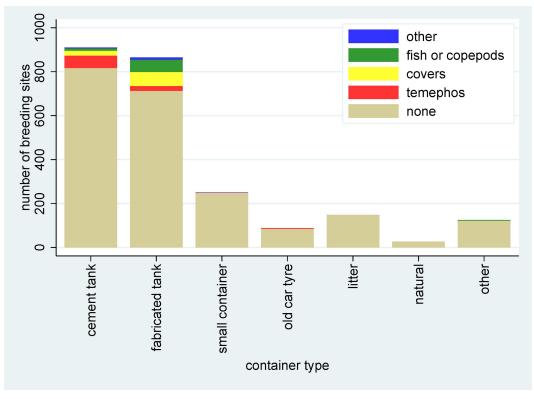


Fig 6. Numbers of breeding sites of *Aedes* mosquito vectors by container type and the extent of vector control measures.

*Aedes* vectors were specifically identified. The breeding site data were obtained in the season following the seroconversion data, which might also have diluted the observed effects. In this follow-up survey, we also did not examine the quantitative productivity of the breeding sites.

Only 23 out of 910 cement tanks (2.5%) and 4 out of 865 (7.4%) of other types of water tanks were covered at the time of this inspection, and 89.3% of all breeding sites were not subjected to any vector control method. Our findings of such high numbers of active breeding sites around schools have implications. Schools will need to improve their vector control efforts by targeting these active breeding sites. Among the 11% breeding sites with counter measures, temephos was the most preferred control method used in our study schools. However, temephos resistance among mosquito larvae and water removal from storage containers without replenishing temephos can potentially reduce the effectiveness of this strategy [31,32]. Prevention methods with high visibility and minimal maintenance requirements are highly recommended for schools. Temephos though effective, require regular replenishment for water storage with high water turnover rate. However, temephos is not visible to human-eyes, making it difficult to determine whether or not temephos is already applied at the right concentration in water storages. In our study area, temephos was applied in a sachet which made it possible to be evaluated by our research team. Container covers on the other hand, is highly visible. Similarly, larvivorous fish are also naturally found in Thailand, making it accessible and manageable. Therefore, a wider use of additional methods such as larvivorous fish and container covers should be considered and encouraged to facilitate the control of mosquito breeding sites.

#### Conclusion

In summary, our study findings suggest that dengue infections were clustered at the school and classroom levels, implying a possible key role of the school environment in dengue transmission. Study schools were characterized by large numbers and different types of Aedes breeding sites. Both Aedes mosquito densities and the numbers of breeding sites within schools were significantly correlated with high dengue infections among students. Nonetheless, some dengue infections may also have been acquired outside schools given that infectious mosquito bites may occur outside school hours. Therefore, dengue control efforts should continue to target households, not only to protect children outside of school hours, but also to protect younger children and adults. However, this study underpins the urgency of improving existing vector control strategies at schools, such as indoor residual spraying in classrooms, reduction of breeding sites in school premises, and use of larvicidal methods. However, these approaches have so far failed to successfully control dengue infections in school children. We need to develop novel and complementary vector control measures covering all potential dengue transmission sites, such as impregnated school uniforms and clothing [33,34], impregnated curtains [35], and impregnation of walls [36], or insecticidal methods targeting furniture in schools and households, as well as other innovative non-insecticidal approaches. Further research that aims to compare the significance of households and schools as dengue transmission sites using active surveillance might be strongly beneficial for effective design and budget allocation of future dengue prevention programs.

#### **Supporting Information**

S1 Appendix. Data set of serological survey: Data set of serological survey in school children participating in the study (seroconversion status = 1 indicates a positive seroconversion).

(XLSX)

**S2 Appendix. Data set of regression model.** Data for regression model with variables: Schools, number of eligible children, actual number of participants, number of blood paired tests, number of positive blood tests, rates and number of *Aedes* mosquitoes captured by aspirator in June 2012.

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(XLSX)
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S3 Appendix. Data set of breeding site survey: Data set of breeding site survey with variables: date, school, container category (1 = cement tank, 2 = fabricated water tank, 3 = small water container, 4 = old car tyre, 5 = litter, 6 = natural container, 9 = others), water level (1 = full container, 2 = 3/4 of the container, 3 = 1/2 of the container, 4 = 1/4 of the container, 5 = less than 1/4 of the container)), mosquito control (0 = none, 1 = temephos, 2 = Bti, 3 = cover, 4 = net cover, 5 = copepods, 6 = fish, 9 = other), and binary (1 = positive) variables for biological control (copepods and fish), container covers and presence of *Aedes* larvae or pupae.

(XLSX)

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