

Enhanced Health Facility Surveys to Support Malaria Control and Elimination across Different Transmission Settings in the Philippines

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Abstract. Following substantial progress in malaria control in the Philippines, new surveillance approaches are needed to identify and target residual malaria transmission. This study evaluated an enhanced surveillance approach using rolling cross-sectional surveys of all health facility attendees augmented with molecular diagnostics and geo-location. Facility surveys were carried out in three sites representing different transmission intensities: Morong, Bataan (pre-elimination), Abra de Ilog, Occidental Mindoro (stable medium risk), and Rizal, Palawan (high risk, control). Only one rapid diagnostic test (RDT)-positive infection and no PCR confirmed infections were found in Bataan and Occidental Mindoro, suggesting the absence of transmission. In Palawan, the inclusion of all health facility attendees, regardless of symptoms, and use of molecular diagnostics identified 313 infected individuals in addition to 300 cases identified by routine screening of febrile patients with the RDT or microscopy. Of these, the majority (313/613) were subpatent infections and only detected using molecular methods. Simultaneous collection of GPS coordinates on tablet-based applications allowed real-time mapping of malaria infections. Risk factor analysis showed higher risks in children and indigenous groups, with bed net use having a protective effect. Subpatent infections were more common in men and older age-groups. Overall, malaria risks were not associated with participants' classification, and some of the non-patient clinic attendees reported febrile illnesses (1.9%, 26/1,369), despite not seeking treatment, highlighting the widespread distribution of infection in communities. Together, these data illustrate the utility of health facility-based surveys to augment surveillance data to increase the probability of detecting infections in the wider community.

INTRODUCTION

The Philippines declared its vision of eliminating malaria by 2030 with a goal of reducing malaria incidence in the country by 90% relative to a 2016 baseline of 6,604 reported cases. Through its strategy of subnational elimination, enhanced case detection and treatment, and vector control, the country aims to increase the number of malaria-free provinces from 32 to 74 by 2022 out of the 81 provinces.^{1,2} However, malaria continues to be a public health burden with highly variable transmission across the country. In 2018, 4,902 indigenous cases and 1 death were reported with approximately 95% of these on Palawan island (Annual Parasite Index ≥ 1 per 1,000 at-risk population). Within Palawan, transmission is geographically heterogeneous, with malaria-free municipalities in the north, and southern municipalities endemic for all five human *Plasmodium* species.

Recent WHO guidelines on malaria surveillance define surveillance as a core intervention required in settings of any level of transmission to meet elimination goals. The guidelines also highlighted the need for increasingly spatial and temporal resolution data on malaria infection as transmission declines.³ Although population-based community surveys remain the gold standard for measuring prevalence and assessing spatial patterns of infection, these sampling approaches are highly resource-intensive and may require prohibitively large sample sizes in low-transmission settings. Alternatively, surveys of

easy access groups, such as health facility attendees or school children, can be used to provide rapid estimates of malaria prevalence within the community (e.g., refs. 4–8). These surveys may not fully capture the distribution of infection in the entire population but are operationally feasible and cost-effective to implement. As malaria transmission decreases, spatial heterogeneity becomes more pronounced, with substantial variations observed in the geographic distribution of infections.⁹ However, by incorporating methods of geolocating participant households using tablet-based applications, fine-scale maps of malaria infection can be created in near real time, allowing identification of foci of transmission¹⁰ which are relevant for areas like Palawan.

In addition, conventional diagnostic methods recommended by the WHO have limitations for surveillance because low parasite density resulting in submicroscopic and asymptomatic infections is missed.^{11,12} With only symptomatic infections being tested, individuals who are not seeking treatment are overlooked, and malaria transmission estimates based on clinical cases reporting to health facilities are biased.¹³ Asymptomatic and subpatent infections comprise most of the malaria infections in low endemic areas, despite adequate malaria control measures, and contribute to maintaining transmission, undermining elimination efforts.¹⁴ Most of these infections are not detectable by conventional microscopy or rapid diagnostic tests (RDTs), necessitating the use of molecular techniques.^{15,16} Detecting these infections can be challenging because of the infrequent reports of clinical cases and the low probability of identifying infections. For example, in the neighboring country Malaysia, in the state of Sabah, 54 *Plasmodium* infections were identified from a community-based survey, including 876 individuals, despite

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no microscopically positive malaria cases or clinical reports during this time period.¹⁷ Also, in Asia-Pacific countries, reliance on passive health facility surveillance does not detect asymptomatic infections.¹⁸

To assess how health facility–based surveys with molecular diagnostics could be used to support malaria elimination efforts, we conducted rolling cross-sectional surveys in the provinces of Palawan, Occidental Mindoro, and Bataan, three areas of the Philippines with different levels of reported transmission. The overall aims were to 1) develop methods for health facility–based surveys applying improved diagnostics and geolocation technologies, 2) assess the utility of enhanced surveillance approaches to improve detection of malaria infections, and 3) identify characteristics of individuals with subpatent infections.

METHODS

Study areas. The areas were selected based on the 2014 Philippines’ National Malaria Program operational definition of malaria-endemic provinces (Figure 1). In that year, Palawan, Occidental Mindoro, and Bataan were categorized as stable high risk or control phase, stable medium risk of transmission, and malaria pre-elimination provinces, respectively, and in the same order, the annual parasitological indices per 1,000 population were 0, 0.35, and 5.7, respectively, in 2018.¹⁹ Demographic information and land areas of the selected areas are shown in Table 1. According to the Philippine Statistics Authority Census of 2000, the population in all study sites comprised various ethnicities and indigenous groups. In Palawan, almost half of the population belongs to different indigenous groups. The Palaw’an indigenous group comprises

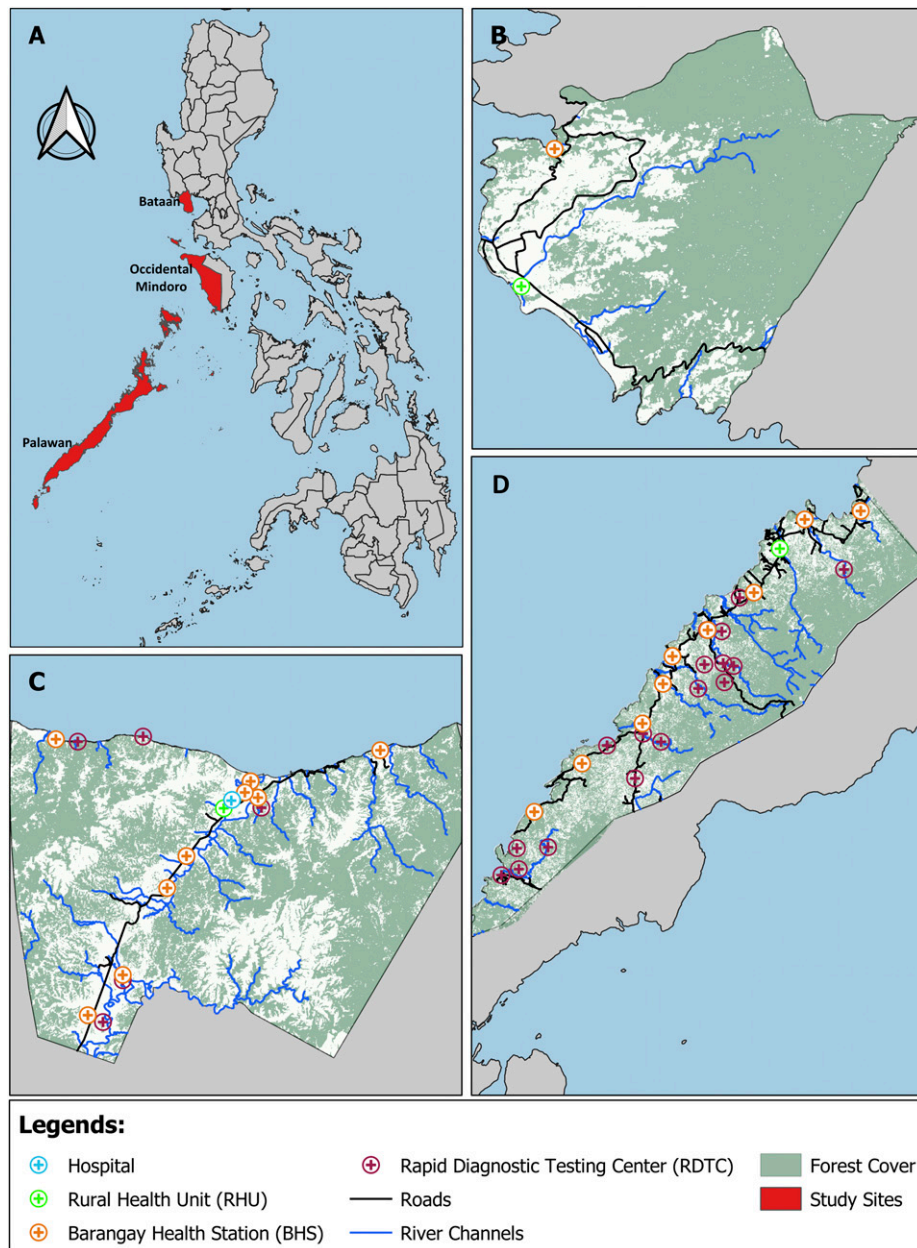


FIGURE 1. Study sites and surveyed health facilities. This figure appears in color at www.ajtmh.org.

TABLE 1
Description of study sites

	Bataan, Bataan (A)	Occidental Mindoro, Occidental Mindoro (B)	Palawan, Palawan (C)	
Land area	219.20 km ²	533.70 km ²	1,256.47 km ²	
Population density	135.40/km ²	58.67/km ²	39.87/km ²	
Transmission setting category (DoH, 2014)	Pre-elimination	Stable medium risk	Stable high/control	
Annual parasite incidence in 2013 (DoH 2018)	No indigenous malaria reported since 2011	0.35	5.7	
Sampling dates	May 2017–March 2018	July 2017–June 2018	(Year 1) Jun 2016–June 2017	(Year 2) Jul 2017–June 2018
Sampling frequency	1 Week bimonthly	1 Week bimonthly	1 Week monthly	1 Week monthly
No of barangays covered	2/5	All 10	All 11	5/11
Number of health facilities	<i>n</i> = 2	<i>n</i> = 17	<i>n</i> = 27	<i>n</i> = 4
Rural health unit	1	1	1	1
Barangay health station	1	9	10	–
RDT center	–	6	16	3
Hospital	–	1	–	–

38.7% of the total population in Palawan; other ethnic groups include Kagayanen (1.9%), Tausug (1.8%), Cuyunon (1.2%), Maranao (1.1%), Jama Mapun (0.9%), and Agutaynen (0.1%).²⁰ The main occupations include subsistence agriculture, swidden agriculture (slash-and-burn), and fishing. In Occidental Mindoro, 64.2% of the population comprises Tagalog and 30.6% of indigenous groups, and the majority of the population in Bataan classified themselves as Tagalog (91.0%), with 0.8% of indigenous population.^{21,22} Residents in Occidental Mindoro and Bataan are primarily long-time settlers with small businesses. All provinces are predominantly rural, partly forested with seasonal rainfall generally from May to October. Primary healthcare services are provided by the rural health unit (RHU) and barangay health stations. In addition to these facilities and service remote communities, Occidental Mindoro and Palawan have malaria testing (using RDTs) and treatment centers based at households of community health workers. With supervision from RHU staff, community volunteers operate the barangay health stations and remote malaria testing and treatment centers.

Study design and sampling. Rolling cross-sectional surveys in the health facilities were carried out every first week of the month for 2 years in Palawan. During the first year of the project (June 2016–June 2017), surveys were conducted in the 27 health facilities in the municipality (Table 1). Data collection was extended to a second year (July 2017–June 2018), with surveys limited to the rural health center and the three malaria RDT centers that reported the highest numbers of cases the previous year. In Occidental Mindoro and Bataan, these surveys were conducted the first week every 2 months over a 12-month period. Seventeen health facilities were surveyed in Occidental Mindoro. These were the RHUs, one district hospital, nine barangay health stations, and six RDT centers. In Bataan, information was collected from the RHUs and one barangay health station. Nearby hospitals are accessible to the residents of Occidental Mindoro and Bataan, unlike in Palawan. Hence, residents typically opt to send their patients to these hospitals. The distance from Dr. Jose Rizal District Hospital from nearest to farthest barangay ranges from 13.7 km to 64.9 km by road. The southernmost barangays, Latud and Canipaan, were excluded because they are not accessible by road. Moreover, the Rio Tuba Nickel Mining Corporation Hospital in Bataraza, Palawan, is 72.1 km away from Palawan.

Health facility staff underwent training on study procedures including obtaining written informed consent, malaria blood film and blood spot preparation, collection of geolocation information of participant's residence, and history of illness and travel. Questionnaire data and GPS coordinates of participant households were collected using GeoODK (GeoMarvel, Alexandria, VA) on Android tablets using satellite imagery and known landmarks to geolocate households; this methodology is described in detail by Fornace et al.¹⁰ This included basic demographic information, symptoms, axillary temperature, movement history, malaria prevention practices, and initial RDT results. Activities and travel history within and beyond the study sites in the past 7 days were recorded. Participants, without age restrictions, were classified as either patients, that is, individuals seeking health consultations were referred, or companions, that is, those who accompany the patients. Women in the maternal clinic and individuals with serious illnesses who required urgent care or transport to higher level health facilities and individuals who have resided in the study sites less than 7 days were excluded.

Research ethics. The Research Institute for Tropical Medicine—Institutional Review Board (IRB no.: 2016-04), and London School of Hygiene and Tropical Medicine (11597) approved this study.

Assessment of malaria infection. Health facility workers collected finger-prick blood samples for malaria blood film microscopy and three 20- μ L spots on filter papers (3MM, Whatman, Maidstone, United Kingdom). Filter papers were dried and stored with desiccants at -20°C . Thick and thin blood films were examined by trained malaria microscopists from the Research Institute for Tropical Medicine, supervising the health facility workers with all positive slides and 10% of the negative slides validated by a WHO-certified level one malaria microscopist. All participants from Palawan and Occidental Mindoro were also tested for malaria using the SD Bioline Malaria RDT, with either Ag Pf/PanTM or Ag Pf/PvTM (Abbott Rapid Diagnostics, Santa Clara, CA) depending on its availability in the market. Individuals tested RDT- and/or microscopy-positive were treated on-site by the health facility personnel following the Philippines' national treatment guidelines for malaria.

DNA was extracted from approximately 10 μ L of dried blood spots (DBS) on filter papers using the Chelex 100 (Bio-Rad Laboratories, Hercules, CA) method²³ modified to 6%. A

nested PCR assay targeting *Plasmodium* sp. small subunit ribosomal RNA genes was used to identify positive samples, and species-specific primers were used on genus-positive samples.^{24–27} Results were visualized on 2% agarose gel. This malaria diagnosis by PCR has a limit of detection of 0.2 parasites/ μ L. A subset of samples was extracted using a Qiagen DNA Mini Kit (Qiagen, Hilden, Germany) to validate results. All samples were tested with PCR, regardless of RDT and microscopy results; positive results were referred to as malaria infections. Within this study, we defined patent infections as individuals positive with both PCR and microscopy and/or RDT, and infections were classified as subpatent if they could only be identified by PCR and were negative for microscopy and/or RDT.

Data management and analysis. Each participant was assigned a unique ID to enable linkage to samples. Data for geolocation of residence were collected during the interview using a designed electronic questionnaire run on GeoODK application. Participants were asked to locate their homes by pointing to its location on Android tablets. All information was later sent to the project's secure cloud server. Households with missing GPS coordinates due to limited tablet availability during the first quarter of the study were visited and located using a handheld GPS (Garmin Ltd., Olathe, KS).¹⁰ Microscopy, RDT, and PCR results were recorded in the laboratory worksheets and were double encoded using Microsoft[®] Excel[®] 2016 (Microsoft Corporation, Redmond, WA) and were merged with questionnaire results. Results of malaria blood film microscopy/RDT and malaria PCR were plotted on QGIS[™] Desktop software version 3.8.2 (QGIS.org, Open Source Geospatial Foundation Project).²⁸

All data sets were analyzed using R statistical programming language version 3.6.3 (R Foundation for Statistical Computing, Vienna, Austria).²⁹ Individuals with insufficient samples and incomplete questionnaire data needed for the analysis of this study were excluded. To compare the sociodemographic characteristics of patients with other individuals screened by health facility surveys, we fit a binomial generalized linear mixed model with participant status as the outcome. Data were included from all sites with health facility included as a random effect. For Palawan only, binomial generalized mixed models were used to identify risk factors for malaria infection including a random effect for the health facility of the survey. An additional model was developed to determine the probability of patent infection (defined as infections detected by microscopy or RDTs) from all infected individuals. To select variables for inclusion, univariate analyses were conducted, with all variables with $P < 0.2$ screened for inclusion in multivariate analyses. The final multivariate analyses were fit in a forward-stepwise manner, with variables included in the final model with $P < 0.05$.

RESULTS

Characteristics of study sites and population demographics.

The distribution of participants by study site, nature of the visit to health facility (i.e., patient or a patient's companion), gender, median age, and presence of fever is summarized in Supplemental Table S1. Out of 5,746 participants in Palawan, only 5,620 were included in the analysis due to sample insufficiency ($n = 24$) and incomplete questionnaire data ($n = 102$). Most of the participants in all sites were patients, rather than companions. There were higher proportions of female participants in all sites, with the most notable difference

observed in Bataan and Occidental Mindoro. These two sites also had much older age-groups and lower proportions of febrile individuals than Palawan. A review of records disclosed that in 2018, 70.8% and 61.6% of the consultations in Bataan and Occidental Mindoro, respectively, were for acute respiratory infections and could reflect mothers accompanying their children.

High proportions of health facility attendees were the Palawan indigenous people in both the first (63.4%, $n = 3,659$) and second (46.1%, $n = 523$) years of surveillance in Palawan. By contrast, clinic attendees were primarily Tagalog, the nonindigenous group, at health facilities surveyed in Occidental Mindoro (56.4%, $n = 999$) and Bataan (97.3%, $n = 872$), whereas the Tagalog attendees in Palawan were 9.1% (524) in the first year and 20.2% (229) in the second year. On the other hand, only 0.4% (4) from the aboriginal group in Bataan (Aetas) and 41.6% (738) in Occidental Mindoro (Mangyans) attended the health facilities. Remaining attendees identified themselves as migrants or not originally from the province, with 27.5% (1,584) in the first year and 33.7% (383) in Palawan, 2.0% (35) in Occidental Mindoro, and 2.2% (20) in Bataan; these individuals had been residing in the area for more than 7 days before the survey.

For all study participants, we compared the association of sociodemographic characteristics of individuals classified as patients (6,458/8,288) and companions (1,830). Companions were more likely to be adults, females, indigenous groups, and forest workers (Table 2).

Malaria infection in patients and companions. Malaria infections were detected only in Palawan either by RDTs/microscopy or PCR. All samples from Occidental Mindoro and Bataan tested PCR-negative (Supplemental Table S2). Although one RDT-positive individual was detected in Occidental Mindoro, this was confirmed to be PCR-negative, suggesting a false-positive RDT result or historical exposure. In the first year of collection in Palawan, there was twice the number of individuals whose PCR results were positive for malaria compared with microscopy and RDTs. It was noteworthy that 12.9% ($n = 1,354$) of companions were positive for malaria infections by PCR, contributing 28.5% (175/613) of all positive cases. PCR increased the detected malaria infections in patients by 36.7% (254/693) compared with microscopy and 38% (268/706) compared with RDT. Enhancing the surveillance through PCR testing and adding companions increased the total infections from 6.2% (255/4,095) by microscopy and 6.1% (268/4,391) by RDT to 10.7% (613/5,722).

In the second year of collection, 20.1% ($n = 228$) of individuals were malaria positive by PCR as compared with 8.2% and 8.7% of microscopy and RDTs, respectively (Supplemental Table S2). Comparing the two phases of surveillance, the second year of collection from the four health facilities that reported the highest malaria cases confirms that the proportion of PCR positives among companions (23.9%, 38/159) is high like year 1 (17.8%, 52/292) but higher than other facilities (11.6%, 123/1,062).

Plasmodium species identified. Within Palawan, *Plasmodium falciparum* was the most common species detected using blood film microscopy (74.3%, 223/300) followed by *Plasmodium vivax* (18.0%, $n = 54$), *Plasmodium malariae* (1.3%, $n = 4$), and mixed infections (6.0%, $n = 18$); this was similar in year 2 (76.9%, 70/91; 11.0%, $n = 10$ 3.3%, $n = 3$;

TABLE 2
Sociodemographic factors associated with participant classification (patients vs. companions)

Variable (n = 8,288)	N	Unadjusted			Adjusted		
		OR	95% CI	P-value	OR	95% CI	P-value
Age (years)				< 0.001			< 0.001
Under 5	1,574	–	–		–	–	
5–10	1,182	0.95	(0.77–1.17)		0.80	(0.64–1.01)	
11–20	1,373	0.71	(0.58–0.86)		0.59	(0.46–0.75)	
21–30	1,284	0.39	(0.32–0.48)		0.39	(0.30–0.49)	
Over 30	2,875	0.46	(0.39–0.55)		0.45	(0.36–0.55)	
Gender				< 0.001			< 0.001
Female	5,026	–	–		–	–	
Male	3,262	1.64	(1.45–1.84)		1.34	(1.18–1.53)	
Ethnicity				< 0.001			< 0.001
Other ethnicity	1,623	–	–		–	–	
Indigenous groups	4,271	0.48	(0.41–0.57)		0.53	(0.44–0.64)	
Tagalog	2,394	1.07	(0.82–1.39)		1.05	(0.80–1.38)	
Occupation							
1. Agriculture				0.408			–
No	7,036	–	–		–	–	
Yes	1,252	0.70	(0.60–0.82)		–	–	
2. Forestry				0.016			0.022
No	7,572	–	–		–	–	
Yes	716	0.50	(0.41–0.61)		0.77	(0.61–0.96)	
3. Business owner				< 0.001			0.003
No	7,803	–	–		–	–	
Yes	485	1.90	(1.41–2.56)		1.61	(1.16–2.24)	
4. Unemployed				< 0.001			< 0.001
No	6,027	–	–		–	–	
Yes	2,261	0.49	(0.43–0.56)		0.71	(0.60–0.85)	
Education				0.004			0.004
None	3,236	–	–		–	–	
Primary	1,851	1.13	(1.00–1.29)		1.31	(1.12–1.54)	
Secondary	3,201	1.07	(0.90–1.26)		1.24	(1.00–1.55)	

4.4%, $n = 4$, respectively). Remaining blood films were positive for malaria but, because of poor thin smears, not speciated (year 1, $n = 1$; year 2, $n = 4$). By PCR, all five species of malaria were detected. The observations were similar, with *P. falciparum* being the most prevalent species (49.9%, $n = 306/613$), followed by *P. vivax* (12.2%, $n = 75$), *P. malariae* (4.7%, $n = 29$), *Plasmodium ovale* (0.3%, $n = 2$), *Plasmodium knowlesi* (0.2%, $n = 1$), and mixed infections (8.0%, $n = 49$). However, 153 samples positive for *Plasmodium* were not speciated because of sample insufficiency. Likewise, PCR results in year 2 showed *P. falciparum* (55.3%, $n = 126/228$) as the most dominant species, followed by *P. vivax* (11.8%, $n = 27$), *P. malariae* (1.3%, $n = 3$), and mixed (9.7%, $n = 22$). Similar to year 1, species identification of 50 positives for *Plasmodium* were not performed (Supplemental Table S3).

In the first year of surveillance, there was 82.9% (179/216) agreement on the species of the parasite present in samples that were positive by both PCR and microscopy.

Consequently, a low proportion of all positive samples by microscopy (15.8%, 42/265) were negative by PCR and a high proportion of positive samples by PCR (58.5%, 314/537) were negative by microscopy (Table 3). With microscopy, 74.3% (142/191) were correctly identified as *P. falciparum* and 62.2% (28/45) for *P. vivax*. All *P. malariae* infections (100.0%, 4/4) were accurately diagnosed. *Plasmodium ovale* infections were misidentified as *P. falciparum* (1) and *P. vivax* (1).

Seasonal and spatial distribution of malaria infections.

For the first year of surveillance in Palawan, the number of malaria infection and individuals attending health facilities varied monthly (Figure 2). Although there was seasonality in the number of patients attending health facilities and the total number of infections, there were some temporal trends in the proportions of individuals detected as positive by either routine or enhanced surveillance. Although the rainfall season is from May to October, increased malaria infections were only noted in July and August.

TABLE 3
Comparison of PCR and malaria microscopy for active health facility survey

Microscopy result	No. of samples with the following result by PCR (%)							Total
	<i>P. falciparum</i>	<i>P. vivax</i>	<i>P. malariae</i>	<i>P. ovale</i>	<i>Plasmodium knowlesi</i>	Mixed*	Negative	
<i>P. falciparum</i>	142 (74.3)	2 (1.0)	1 (0.5)	1 (0.5)	0 (0.0)	11 (5.8)	34 (17.8)	191
<i>P. vivax</i>	5 (11.1)	28 (62.2)	0 (0.0)	1 (2.2)	0 (0.0)	5 (11.1)	6 (13.3)	45
<i>P. malariae</i>	0 (0.0)	0 (0.0)	4 (100.0)	0 (0.0)	0 (0.0)	0 (0.0)	0 (0.0)	4
Mixed†	6 (35.3)	4 (23.5)	1 (5.9)	0 (0.0)	0 (0.0)	5 (29.4)	1 (5.9)	17
Negative	130 (2.78)	37 (0.8)	17 (0.4)	0 (0.0)	1 (0.0)	22 (0.5)	4,476 (95.6)	4,683
Total	283 (5.7)	71 (1.4)	23 (0.5)	2 (0.0)	1 (0.0)	43 (0.9)	4,518 (91.4)	4,941

P. falciparum = *Plasmodium falciparum*; *P. malariae* = *Plasmodium malariae*; *P. ovale* = *Plasmodium ovale*; *P. vivax* = *Plasmodium vivax*.

* Mixed infections by PCR: *P. falciparum*/*P. vivax*, *P. falciparum*/*P. ovale*, *P. falciparum*/*P. malariae*, *P. vivax*/*P. malariae*, *P. falciparum*/*P. vivax*/*P. malariae*.

† Mixed infections by microscopy: *P. falciparum*/*P. vivax* and *P. falciparum*/*P. malariae*.

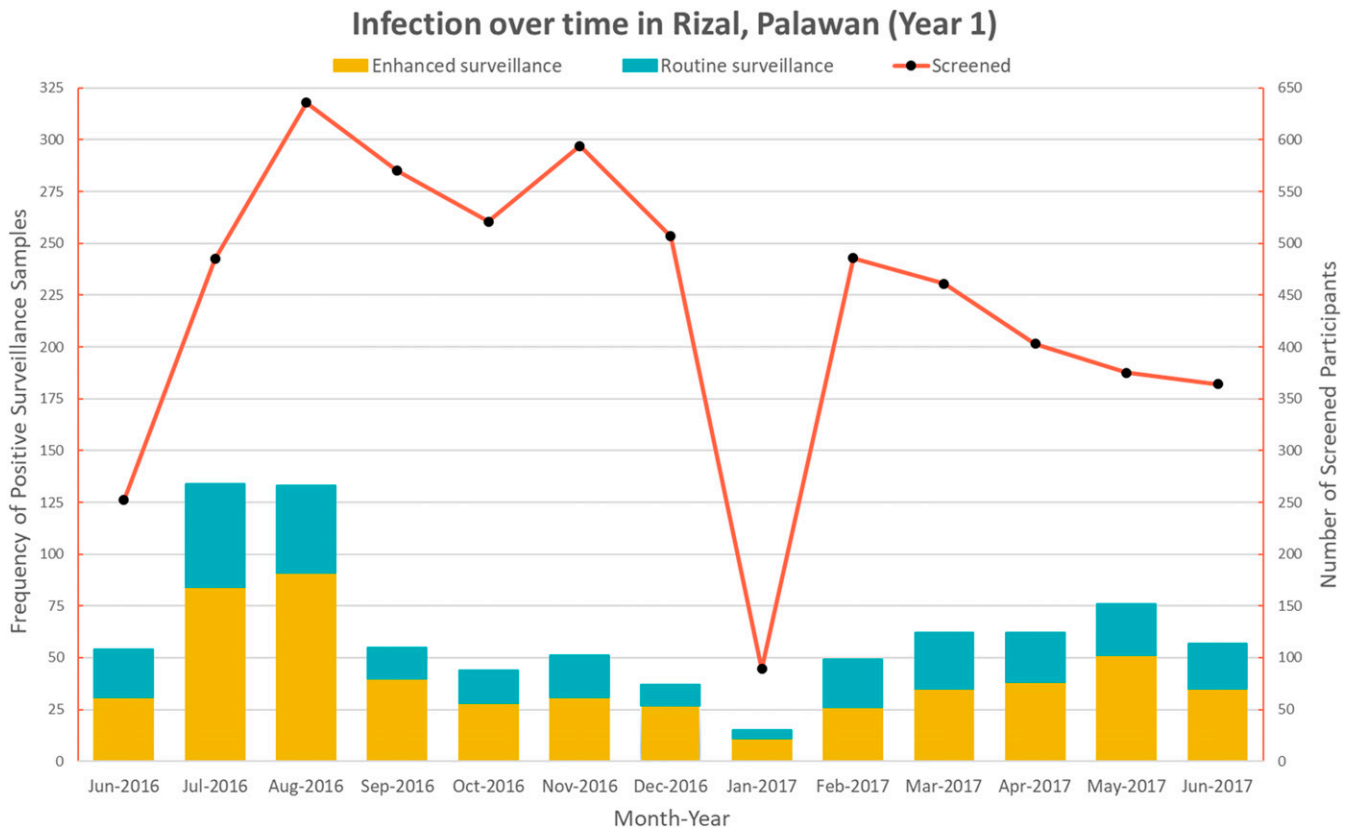


FIGURE 2. Temporal trend in Rizal, Palawan. This figure appears in color at www.ajtmh.org.

Figure 3 shows the difference in spatial distributions of infections detected by both surveillance approaches. Although this analysis shows the utility of health facility surveys using this platform to capture real-time spatial data on the locations of participants' residences, further analysis of spatial patterns of health facility attendance and infections was explored by Fornace et al.³⁰

Factors associated with malaria infections. As malaria infections were only identified within Palawan and the first year of surveillance represented the most comprehensive data set,

we chose to focus on risk factor analysis on these data. Within this year, the inclusion of malaria screening of all companions increased the identification of patent infections by 16.6% ($n = 60/361$). This further improved to 18.5% ($n = 125/676$) when PCR was used to assess infection. Subsequent risk factor analysis showed that the odds of malaria infection (as detected by any diagnostic methods, $n = 5,620$) were almost three times higher in 11- to 20-year age-group than older than 30-year age-group (Table 4). In addition, male individuals, Palaw'an indigenous group, and individuals sleeping without

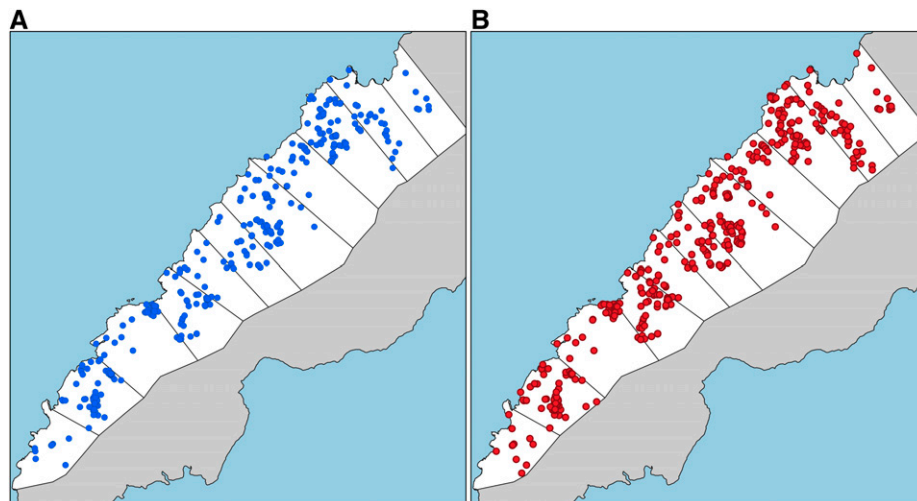


FIGURE 3. Malaria surveillance approaches; (A) routine surveillance, (B) enhanced surveillance. This figure appears in color at www.ajtmh.org.

bed nets had higher risks of infection. A significantly higher infection risk was observed in individuals with lower education levels; however, there was no clear association with specific occupational activities. There was no significant difference in infection risks detected between patients or companions screened.

For all malaria cases, we compared the risks of the patent (356/669) and subpatent malaria (313). Patent malaria infections were more common in younger age-groups, with risks of patent infections decreasing with age (Table 5). Male gender had almost twice the odds of patent infections compared with female gender. Companions were more likely to have subpatent infections, as would be expected considering they were not seeking treatment. No associations between bed net use or history of travel and patent infections were identified.

DISCUSSION

We developed an enhanced surveillance approach to demonstrate the utility of health facility surveys in low- and high-transmission settings incorporated with both molecular diagnostics and geolocation. The inclusion of companions and PCR testing provided additional information to assess transmission levels in the catchment populations that would not have been possible with the standard malaria surveillance system and captured wider demographic groups. The use of PCR led to about 58% increase in the total number of infections detected from 255 samples by microscopy and 268 by RDTs to 438. The simultaneous collection of spatial data and the use of geographic information systems further increase the resolution of the spatial distribution of malaria infection. This approach can provide an operationally feasible method to supplement existing health facility data to improve

TABLE 4
Factors associated with *Plasmodium* infection detectable by PCR

Variable (n = 5,620)	N	Unadjusted			Adjusted		
		OR	95% CI	P-value	OR	95% CI	P-value
Age (years)				< 0.001			< 0.001
Under 5	1,323	–	–		–	–	
5–10	935	1.55	(1.19–2.03)		2.10	(1.56–2.83)	
11–20	977	1.59	(1.22–2.07)		2.64	(1.92–3.64)	
21–30	737	1.18	(0.87–1.60)		1.61	(1.15–2.24)	
Over 30	1,648	0.72	(0.54–0.93)		0.96	(0.72–1.28)	
Gender				< 0.001			< 0.001
Female	3,230	–	–		–	–	
Male	2,390	1.41	(1.19–1.68)		1.49	(1.24–1.79)	
Ethnicity				< 0.001			< 0.001
Other ethnicity	1,581	–	–		–	–	
Palaw'an	3,516	4.20	(3.16–5.58)		3.87	(2.86–5.23)	
Tagalog	523	1.13	(0.67–1.93)		1.13	(0.66–1.94)	
Occupation							
1. Agriculture				0.079			–
No	4,633	–	–		–	–	
Yes	987	0.80	(0.63–1.03)		–	–	
2. Forestry				0.680			–
No	5,094	–	–		–	–	
Yes	526	0.94	(0.70–1.26)		–	–	
3. Business owner				0.815			–
No	5,422	–	–		–	–	
Yes	198	0.94	(0.56–1.58)		–	–	
4. Unemployed				< 0.001			–
No	4,740	–	–		–	–	
Yes	880	0.61	(0.46–0.82)		–	–	
Activities outside house*				0.328			–
No	2,724	–	–		–	–	
Yes	2,896	1.09	(0.91–1.31)		–	–	
History of travel				0.267			–
No	4,303	–	–		–	–	
Yes	1,317	0.87	(0.68–1.11)		–	–	
Type of participant				0.201			–
Patient	4,286	–	–		–	–	
Companion	1,334	1.14	(0.93–1.39)		–	–	
Education				< 0.001			< 0.001
None	2,738	–	–		–	–	
Primary	2,151	0.78	(0.65–0.94)		0.66	(0.53–0.83)	
Secondary	731	0.42	(0.29–0.60)		0.59	(0.39–0.89)	
Bed net use				< 0.001			< 0.001
Yes	5,485	–	–		–	–	
No	135	3.89	(2.58–5.89)		3.50	(2.28–5.38)	
Health facility type				0.048			–
Barangay health station	2,197	–	–		–	–	
Rural health unit	1,091	0.95	(0.26–3.45)		–	–	
Rapid diagnostic testing center	2,332	1.99	(1.17–3.41)		–	–	

* Activities include child play, school, and work-related activities.

TABLE 5
Factors associated with *Plasmodium* infection detectable by RDTs/microscopy, among all infections identified by PCR

Variable (n = 669)	N	Unadjusted			Adjusted		
		OR	95% CI	P-value	OR	95% CI	P-value
Age (years)				< 0.001			< 0.001
Under 5	140	–	–		–	–	
5–10	142	0.81	(0.49–1.18)		0.86	(0.51–1.46)	
11–20	168	0.54	(0.19–0.52)		0.66	(0.40–1.08)	
21–30	88	0.28	(0.12–0.39)		0.43	(0.23–0.80)	
Over 30	131	0.24	(0.13–0.61)		0.29	(0.17–0.50)	
Gender				< 0.001			< 0.001
Female	327	–	–		–	–	
Male	342	2.24	(1.63–3.09)		1.99	(1.42–2.79)	
Ethnicity				0.151			–
Other ethnicity	72	–	–		–	–	
Palaw'an	575	1.50	(0.89–2.55)		–	–	
Tagalog	22	0.78	(0.28–2.17)		–	–	
Occupation							
1. Agriculture				0.015			–
No	566	–	–		–	–	
Yes	103	0.58	(0.37–0.90)		–	–	
2. Forestry				0.006			–
No	597	–	–		–	–	
Yes	72	0.48	(0.28–0.81)		–	–	
3. Business owner				0.754			–
No	650	–	–		–	–	
Yes	19	1.16	(0.45–3.02)		–	–	
4. Unemployed				< 0.001			–
No	606	–	–		–	–	
Yes	63	0.27	(0.15–0.49)		–	–	
Activities outside house*				0.015			–
No	305	–	–		–	–	
Yes	364	0.67	(0.49–0.93)		–	–	
History of travel				0.564			–
No	514	–	–		–	–	
Yes	155	1.13	(0.75–1.70)		–	–	
Type of participant				< 0.001			< 0.001
Patient	485	–	–		–	–	
Companion	184	0.27	(0.18–0.40)		0.35	(0.23–0.52)	
Education				0.103			–
None	385	–	–		–	–	
Primary	246	1.05	(0.74–1.48)		–	–	
Secondary	38	0.48	(0.24–1.00)		–	–	
Bed net use				0.203			–
Yes	626	–	–		–	–	
No	43	1.55	(0.78–3.08)		–	–	
Facility type				0.300			–
Barangay health station	200	–	–		–	–	
Rural health unit	85	2.08	(0.86–5.03)		–	–	
Rapid diagnostic testing center	384	1.21	(0.76–1.92)		–	–	

* Activities include child play, school, and work-related activities.

surveillance and better target interventions. In areas where malaria is no longer endemic, the approach provides valuable information to confirm the absence of malaria in pre-elimination settings.

By applying this approach to sites with the differing transmission trends in the Philippines, we demonstrate how health facility surveys can complement existing malaria surveillance efforts. In the high-transmission site of Palawan, we identified widespread infections in the community in addition to individuals seeking treatment. Also, with high proportion of PCR positives among companions in these health facilities than others, this emphasizes that these individuals must be tested, especially in facilities that report high numbers of malaria. By screening companions, surveys were extended to wider demographic groups not captured by routine surveillance, particularly older age-groups. Notably, risks of infection did not differ between patients and companions, suggesting equal

probabilities of infections between these two groups. This included a substantial proportion of companions who were not seeking treatment but had active febrile illnesses (26/1,369). Previous studies have similarly described wider distributions of infections within populations than are captured at health facilities and highlighted the importance of identifying and targeting these infections.^{13,31,32} This study illustrates how screening easy-access groups of health facility attendees can substantially increase the number of infections detected. By applying tablet-based applications to map the distribution of infections, this enables near real-time mapping of infections to better enable targeting of control measures.¹⁰ The real-time aspect of this data collection is important because this allows the test results and household location to be linked and mapped immediately.

As explored by Fornace et al.,³⁰ the use of the convenience sampling of health facility attendees markedly increased

detection probabilities and spatial coverage of surveillance, particularly in rural populations living in forested areas. Overall, a much wider spatial distribution of infected households was only detected by enhanced surveillance methods. Although we detected higher numbers of infections during the sampling period, this did not reflect the temporal changes of malaria throughout the year. We demonstrated the utility of this method to increase the number of infections detected, but further longitudinal sampling would be required to assess fine-scale changes over time.

In addition, we demonstrated how health facility data can be used to identify risk factors for malaria infection. Analysis of data from Palawan found risk factors for malaria infection, consistent with other studies within this region, identifying higher risks in male individuals^{33–36} and indigenous populations^{37–40} and individuals not using bed nets.^{41–43} Although no associations were found between occupation and malaria risks, these risk factors may be partially attributed to livelihood activities such as swidden farming, movements into forested areas, and associated travel and overnight stays at outdoor locations.^{44–46} Because we also included molecular diagnostics in this approach, we identified significant numbers of subpatent infections, particularly in older age-groups. This is consistent with other studies observing decrease in the risk of patent infections with age, suggestive of acquired immunity.^{47–49} High proportions of subpatent malaria infections may contribute substantially to the transmission and undermine malaria elimination efforts.⁵⁰ This study illustrates how health facility surveys can be used to identify and target these infections. Because this methodology collected geolocated data on the use of bed nets and other preventive measures as well as infection risks, this could be used to identify priority areas for targeting control measures.

As well as identifying infections, this survey methodology allows for verification of the absence of malaria transmission. Two of the study sites, Occidental Mindoro and Bataan, recorded no active infections. This is consistent with public health data and supports the notion that malaria transmission is all but absent in these areas. Although routinely collected surveillance data are key to WHO certification, augmenting these data with periodic pulses of enhanced passive or active detection provides additional assurance for the absence of infection.⁵¹ This can improve the statistical robustness of any assertions, especially if conducted at times when historically the transmission would have been high. The use of enhanced surveys might also allow for certification of elimination at lower administrative levels and assist in the more rational use of public health resources.

Despite the utility of this survey methodology, there were several important limitations to this study. This analysis relied on individuals reporting to participating health facilities and therefore is not representative of the wider population within this region. Previous studies have found biases in the demographic groups captured by facility surveys, with high attendance primarily by mothers and young children.⁵² Moreover, the indigenous populations are known to be mobile and may attend different facilities, affecting the relevance of geolocation data for follow-up activities. Because these movements are seasonal, future studies could explore targeting specific time periods. In addition, although most of the infections on Palawan were by *P. falciparum*, approximately a quarter was due to *P. vivax*; this may lead to overestimation of numbers of malaria infections if repeated reports are due to

relapses. We also observed individuals (1.1%, $n = 61$) who were microscopy- and/or RDT-positive but PCR-negative. With this, there is the possibility of false-positive RDT results when the malaria parasite is cleared, and parasite antigens remain in circulation. These negative results by PCR could result from improper collection and/or storage of DBSs from the study sites to RITM laboratories in Manila, leading to DNA degradation.^{53–55}

Nevertheless, this study demonstrates the utility of health facility surveys. Similar health facility-based approaches have been applied in Kenya,⁵⁶ showing good concordance between the facility and community-based estimates of infection. The approach has been used to identify risk factors for infection in both Haiti⁵⁷ and Indonesia.¹⁰ In this study, the addition of the combination of geolocation and diagnostic methods performed by community volunteer health workers allowed real-time mapping of field diagnostic methods such as microscopy and RDT down to the household level. This is encouraging as it suggests that as strategies emerge for malaria elimination, these health workers can take new roles with proper training and resources. This is evident as they adapted to the use of mobile technology for tablet-based questionnaires and mapping and collect blood on filter papers.

CONCLUSION

Extended health facility surveys can provide more comprehensive and readily accessible data for operational planning and evaluation of malaria and other diseases. Incorporating molecular diagnostics provided additional information in detecting subpatent and asymptomatic infections that are missed by routine methods such as microscopy and RDT, preventing underestimated malaria prevalence. How this approach can be incorporated into the routine health system and budgets require further consideration. Community volunteer health workers can collect blood on filter papers for multiple testing or multi-disease testing in the future. Indeed, health facility surveys incorporated with geolocation and molecular methods could be adapted across a range of ecologies (e.g., rural and forested population) and can support malaria control not just in Palawan but other areas with similar transmission. Similarly, these methods can be used to provide stronger evidence of progress toward elimination as observed in Occidental Mindoro and Bataan allowing subnational verification as part of the Philippines' march to malaria freedom.

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