## RESEARCH ARTICLE



## **REVISED** Reverse transcription PCR to detect low density malaria

## infections [version 3; peer review: 1 approved, 1 approved

## with reservations, 1 not approved]

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### Abstract

**Background:** Targeted malaria elimination strategies require highly sensitive tests to detect low density malaria infections (LDMI). Commonly used methods for malaria diagnosis such as light microscopy and antigen-based rapid diagnostic tests (RDTs) are not sensitive enough for reliable identification of infections with parasitaemia below 200 parasites per milliliter of blood. While targeted malaria elimination efforts on the Thailand-Myanmar border have successfully used high sample volume ultrasensitive quantitative PCR (uPCR) to determine malaria prevalence, the necessity for venous collection and processing of large quantities of patient blood limits the widespread tractability of this method.

**Methods:** Here we evaluated a real-time reverse transcription PCR (RT-qPCR) method that reduces the required sample volume compared to uPCR. To do this, 304 samples collected from an active case detection program in Kayin state, Myanmar were compared using uPCR and RT-qPCR.

**Results:** *Plasmodium* spp. RT-qPCR confirmed 18 of 21 uPCR *Plasmodium falciparum* positives, while *P. falciparum* specific RT-qPCR confirmed 17 of the 21 uPCR *P. falciparum* positives. Combining both RT-qPCR results increased the sensitivity to 100% and specificity was

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**Open Peer Review** 

- 1. **Gisely Melo**, Instituto de Pesquisa Clínica Carlos Borborema, Manaus, Brazil
- 2. **Muneaki Hashimoto**, National Institute of Advanced Industrial Science and Technology (AIST), Hayashi-cho, Japan
- 3. Julian Tanner 🔟, The University of Hong

### 95.1%.

**Conclusion:** Malaria detection in areas of low transmission and LDMI can benefit from the increased sensitivity of ribosomal RNA detection by RT-PCR, especially where sample volume is limited. Isolation of high quality RNA also allows for downstream analysis of malaria transcripts.

### **Keywords**

Low density malaria infection, Plasmodium, quantitative PCR, diagnostic, reverse transcription PCR (RT-PCR)

## This article is included in the Mahidol Oxford

Tropical Medicine Research Unit (MORU)

gateway.

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Kong, Pokfulam, Hong Kong

Any reports and responses or comments on the article can be found at the end of the article.

### **REVISED** Amendments from Version 2

I have added an author (Dr. Malika) who was key to the production of the original METF results.

Any further responses from the reviewers can be found at the end of the article

### Background

As malaria burden reduces globally, the international community is working toward its elimination. Successful targeted malaria elimination strategies will require increased surveillance and highly sensitive tests capable of detecting asymptomatic and low density malaria infection (LDMI). These infections are often well below 200 parasites per milliliter and are an important disease reservoir capable of transmitting malaria that must be detected and eliminated<sup>1,2</sup>. Light microscopy and antigen based rapid diagnostic tests (RDTs) are the most common tests used in malaria prevalence surveys, and usually assess 5 µL of whole blood per test, a volume which precludes reliable detection of LDMI. Ultrasensitive RDTs improve detection sensitivity of patients with a parasitaemia between 200 parasites/mL and 10,000 parasites/mL3, but are still limited by their low input volume. Molecular methods using the polymerase chain reaction (PCR) remain the only common and reliable method to detect LDMI. The sensitivity of PCR is due to its ability to detect single, specific nucleic acid molecules and use of concentrated DNA from a large sample. Widespread use of PCR based assays, namely real-time quantitative PCR (qPCR) and reverse-transcription PCR (RT-PCR), have revealed a new landscape of malaria prevalence particularly in low transmission areas<sup>4,5</sup>.

The targeted malaria elimination project (TME) on the Eastern Myanmar border used a high blood volume ultrasensitive qPCR (uPCR) to consistently detect parasitaemia down to 22 parasites per mL<sup>6</sup>, and revealed a high proportion of LDMI7. Major features of uPCR are its 7 copies of gene target, the high volume of blood tested and the ability to accurately quantify low density parasitaemia. Although increasing the blood volume of a PCR leads to higher sensitivity<sup>6</sup>, the collection of large numbers of high volume samples have their own specific limitations. These can include, the ethics approval required for venous blood draw, sample logistics, increased nucleic acid extraction cost and increased sample processing time. Another way to increase the sensitivity of PCR is to increase the number of specific nucleic acid targets per parasite by targeting specific RNA and DNA using RT-PCR. As previously reported by Kamau et al.8, the primer set used in uPCR can be made more sensitive by incorporating reverse transcription prior to qPCR, enabling detection of the 7 genes encoding Plasmodium 18S ribosomal nucleic acid (rRNA) and its rRNA transcripts.

In this study, we compare the sensitivity and specificity of high sample volume, low target copy number ultrasensitive qPCRs, with reduced sample volume, high target copy number RT-qPCR for the detection and quantification of *Plasmodium* spp. and *P. falciparum*.

### Methods

We selected 304 samples with previously reported uPCR results: 21 *P. falciparum* positive and 283 *Plasmodium* spp. negative for comparison to RT-qPCR with increased target numbers per parasite but 30% of the sample volume.

### Study area, sample collection and malaria screen

Active case detection samples were collected from rural Eastern Kayin (Karen) state of Myanmar between 2014 and 2015 as part of an international malaria elimination project. Full methods have been published<sup>9</sup>, briefly, 3 ml of blood was drawn into an EDTA container from each adult, and transported on ice to the Shoklo Malaria Research Unit in Mae Sot, Tak, Thailand. Within 48 hours the samples were processed, and two aliquots of up to 500 µL of packed red blood cells (PRBC) were stored at -80°C. The rapid diagnostic, SD Bioline Malaria Ag P.f/Pan POCT and light microscopy of giemsas stained thick and thin smears was also done. Only 500 µL sample aliquots were accepted for uPCR detection and quantification while RT-qPCR included samples with a second cryopreserved 150 µL PRBC aliquot.

### Ultrasensitive qPCR (uPCR)

DNA was extracted from 500 µl of cryopreserved PRBC using QIAamp DNA Blood Midi Kit (Cat. No. 51185, Qiagen<sup>TM</sup>) according to manufacturer's instructions. The DNA template was then dried in a vacuum concentrator, re-suspended in 10 µL of PCR grade water and stored at -20°C prior to qPCR. Separate uPCRs specific for Plasmodium spp., P. falciparum and P. vivax were performed over 3 years from 2013 as previously described<sup>6</sup>. Briefly, uPCR was done in 10 µL reactions that contained 2 µL of DNA template with 1x QuantiTect Multiplex PCR No ROX mastermix (Cat. No. 204743, Qiagen<sup>TM</sup>), 0.4 µM each primer, and 0.2 µM Taqman probe. Thermal cycling and signal acquisition was done on an ABI 7500 Fast real-time PCR machine with initial denaturation and enzyme activation at 95°C for 15 min, then 50 cycles of denaturation at 94°C for 15 sec followed by annealing and extension at 60°C for 60 sec. A reaction with exponential signal increase before cycle 40 was considered positive.

#### Sample selection

Within 3 years of sample storage at -80°C, nucleic acid extraction and RT-qPCR assays were performed on the second aliquot of PRBC for selected samples. Selected samples included 283 uPCR negative samples and 21 uPCR *P. falciparum* positives, this includes 18 mixed infections with *P. vivax* and 13 LDMI defined as >50 parasites/ $\mu$ L by uPCR, parasitaemia of samples ranged from 17.5 – 9,907,000 parasites/ $\mu$ L.

### Nucleic acid extraction and RT-qPCR

Nucleic acid was extracted using a Zymo Research Quick-RNA Miniprep (Plus) kit (Cat. No. R1058, Zymo Research<sup>TM</sup>) from. Manufacturer's instructions for whole blood were followed with minor changes. These include, extraction from 150  $\mu$ L of white blood cell depleted PRBC in phosphate buffered saline (PBS) up to 200  $\mu$ L instead of 200  $\mu$ l of whole blood,

DNase enzyme wasn't used, and RNA was eluted in 20 µL of molecular grade water. Two RT-qPCRs were performed on each extract in duplicate: the Plasmodium spp. specific assay using the same primer and probe set as uPCR, and a P. falciparum specific set targeting the DNA of the A-18S rRNA genes and its rRNA transcripts<sup>5</sup>. Both reactions had a final volume of 15 µL and contained 4 µL of RNA template, 1x Superscript III One-Step RT-PCR System master mix (Cat. No. 12574018, ThermoFisher Scientific<sup>TM</sup>), 0.4 µM forward and reverse oligo primer and 0.2 µM of MGB Taqman probe. Amplification and signal acquisition were done on an ABI 7500 Fast real-time PCR machine with cycling conditions as follows: reverse transcription at 45°C for 30 min, enzyme activation at 95°C for 2 min, followed by 50 cycles of denaturation at 95°C for 15 sec and combined annealing and extension steps at 60°C for 60 sec. A reaction with exponential signal increase before cycle 40 was considered positive.

### Primer and probe sequences

Plasmodium spp. specific primer and probe sequences used by uPCR and RT-PCR were published previously by kamau et al.8. The forward primer sequence was 5'-GCTCTTTCTT-GATTTCTTGGATG-3', reverse primer was 5'-AGCAG-GTTAAGATCTCGTTCG-3' and the probe sequence was 5'-ATGGCCGTTTTTAGTTCGTG-3' labeled with FAM as reporter and a TAMRA quencher. The primer and probe sequences used to identify P. falciparum infection in uPCR positive samples were published by Perandin et al.<sup>10</sup>. The forward primer was 5'-CTTTTGAGAGGTTTTGTTACTTTGAGTAA-3', reverse 5'-TATTCCATGCTGTAGTATTCAAACACAA-3' was the probe sequence was 5'-TGTTCATAACAGACGGGTAGT-CATGATTGAGTTCA-3' with FAM and TAMRA as reporter and quencher respectively. RT-PCR primer sets were taken from the publication by Sumari et al.<sup>5</sup>. The forward primer was 5'-TCCGATAACGAACGAGATCTTAAC-3', reverse primer was 5'-ATTATAGTTACCTATGTTCAATTTCA-3' and the minor groove binding probe sequence was 5'-TAGCGGCGAG-TACACTATA-3' labelled with a FAM reporter and BHQ1 quencher.

### Standard curve

Standard reference curves for the RT-PCR and uPCR were made using aliquots of 10,000 flow cytometry sorted small ring stage P. falciparum (3D7) parasites<sup>11</sup>. The method used to extract the nucleic acids from these parasites depended on the assay used (RT-PCR or uPCR). For the uPCR standard curve, Qiagen DNA Blood Mini Kit (Cat. No. 51106, Qiagen) was used to extract DNA, this was eluted in 200 µL of sterile water, dried in a partial vacuum at 30°C for consistency with sample extraction, and re-suspended in 200 µL of Qiagen AE buffer6. Nucleic acid for the RT-PCR standard curve was extracted using the Zymo Quick-RNA Miniprep (Plus) (Cat. No. R1058, Zymo Research) kit as above but eluted in 40 µL of water. Serial one in five dilutions were made with these extracts to make 7 standards. The uPCR standard curve ranged from 100 to 0.032 parasites per qPCR reaction and the RT-PCR standard curve ranged from 1000 parasites to 0.064 parasites per reaction.

### Analysis

*Plasmodium* spp. and *P. falciparum* diagnostic accuracy was calculated by comparing RT-PCR results to the uPCR result in  $2 \times 2$  cross tabulation with uPCR as gold standard in STATA version 15.1 (StataCorp LLC, USA). Results of both RT-PCRs were also combined and compared to uPCR, where a positive test by at least one RT-PCR was considered positive. Continuous non-parametric data were compared with Kruskal-Wallis equality-of-populations rank test. *P* values <0.05 were considered statistically significant. Analyses were performed using STATA version 15.1. Agreement between the two *Plasmodium* specific PCR quantifications (spp RT-PCR and uPCR) was determined using Bland-Altman analysis of log transformed data (difference vs average) using GraphPad Prism version 6.07 for Windows, GraphPad Software (La Jolla California USA).

### Results

### Rapid diagnostic and microscopy screening

Using uPCR as gold standard, Malaria Ag P.f/Pan POCT rapid diagnostic test (SD Bioline) confirmed 8 positives, 4 false positives, and 13 false negatives. Giving a sensitivity of 38.10% (95% confidence interval (CI) of 18.11% to 61.56%) and specificity of 98.59% (CI of 96.42% to 99.61%). The positive predictive value (PPV) of RDT was 66.67% (CI of 39.6% to 85.9%) and the negative predictive value (NPV) was 95.6% (CI of 93.9% to 96.8%). Microscopy confirmed 6 positive samples with no false positives, and 15 false negatives, giving a sensitivity of 28.6% (CI of 11.3% to 52.2%) and specificity of 100.0% (CI of 98.7% to 100.0%), the PPV was 100% and a NPV was 95% (CI of 93.5% to 96.1%).

### *Plasmodium* spp. RT-PCR

*Plasmodium* spp. RT-PCR confirmed 18 of 21 *Plasmodium* spp. uPCR positives and an additional 9 positive reactions from the 283 uPCR negatives. The sensitivity and specificity of *Plasmodium* spp. RT-PCR was 85.7% (CI of 63.7 to 97%) and 96.8% (CI of 94.0% to 98.5%) respectively when compared to uPCR (Table 1<sup>12</sup>). The PPV of this test was 66.7% (CI of 50.7% to 79.6%) and NPV was 98.9% (CI of 97.0% to 99.6%).

### P. falciparum RT-PCR

Using the *P. falciparum* specific RT-PCR, 16 of the 21 uPCR *P. falciparum* positives were confirmed along with 5 extra positives from the 283 negatives. Sensitivity and specificity of this test was 76.2% (CI of 52.8% to 91.8%) and 98.2% (CI of 95.9% to 99.4%) respectively when compared to uPCR (Table 1<sup>12</sup>). PPV for this PCR was 76.2% (CI of 56.5% to 88.7%) and the NPV was 98.2% (CI of 96.3% to 99.2%).

### Combined Plasmodium spp. and P. falciparum RT-PCR

Combining the results of both *Plasmodium* spp. and *P. falciparum* RT-PCRs confirmed all 21 uPCR positives, giving 100% Sensitivity (CI of 83.9% to 100.0%). The combined result found an additional 14 (false) positives giving a specificity 95.1% (CI of 91.8% to 97.3%) (Table 1<sup>12</sup>). These results gave a PPV of 60% (CI = 47.4% to 71.4%) and a NPV of 100%.

### Quantification

No significant differences were found for the calculated parasites/ml (P 0.5506) for the three different methods with geometric means of 2.78E × 10<sup>4</sup> (95% CI 4.34 × 10<sup>3</sup> - 1.79 × 10<sup>5</sup>), 1.81 × 10<sup>4</sup> (1.35 × 10<sup>3</sup> - 2.41 × 10<sup>5</sup>) and 6.85E × 10<sup>3</sup> (1.09 × 10<sup>3</sup> - 4.31 × 10<sup>4</sup>) for the *Plasmodium* spp. RT-qPCR, *P. falciparum* RT-qPCR and the *Plasmodium* spp. uPCR respectively (Figure 1).

Bland-Altman analysis of log transformed parasitaemia data (Figure 2) did not show any significant systematic bias between uPCR and RT-qPCR measurements (Bias = -0.3786 +/- S.D 1.948), 95% of our differences fall between 2 standard deviations or more precisely 1.96 × S.D (1.948) = 3.82. This implies a reasonable amount of agreement between uPCR and RT-qPCR.

### Discussion

LDMI detection is essential for effective targeted elimination programs, necessitating the careful selection of a detection assay that is appropriate to the setting and study requirements. Sample volume, storage conditions and transit time are important factors, as well as the required assay sensitivity, specificity and its cost. RNA is generally less stable than DNA, and accurate RNA quantification often requires normalization due to variable transcription rates. It is for these reasons that DNA based qPCR was chosen for the original study as this approach enabled accurate quantification of LDMI in a setting where samples from remote locations would likely experience delays.

The targeted malaria elimination (TME) project on the Eastern Myanmar border used conserved regions of the 18S rRNA genes as the target for qPCR. This high sample volume

Table 1. Results of three PCRs on 304 malaria survey samples: tabulated results from *Plasmodium* spp. uPCR, SD Bioline Malaria Ag P.f/Pan POCT, light microscopy, *Plasmodium* spp. RT-qPCR and *P. falciparum* RT-qPCR including total positives, total negatives, false positives, false negatives, sensitivity and specificity using *Plasmodium* spp. uPCR results as gold standard.

	Positive	Negative	False Positive	False Negative	Sensitivity (95% CI)	Specificity (95% CI)
Plasmodium spp. uPCR	21	283	N/A	N/A	N/A	N/A
SD Bioline Malaria Ag <i>P.f</i> /Pan POCT	12	292	4	13	38.1% (18.1 - 61.6%)	98.6% (96.4 - 99.6%)
Light Microscopy	6	298	0	15	28.6% (11.3 - 52.2%)	100% (98.7 - 100%)
Plasmodium spp. RT-qPCR	27	277	9	3	85.7% (63.7 - 97%)	96.8% (94 - 98.5%)
P. falciparum RT-qPCR	21	283	5	5	76.2% (52.8 - 91.8%)	98.2% (95.9 - 99.4%)
Combined RT-qPCR	35	269	14	0	100% (83.9 - 100%)	95.1% (91.8 - 97.3%)







Figure 2. Bland–Altman analysis (difference vs average) of uPCR and RT-qPCR quantification data from the TME malaria survey of Kayin state, Myanmar.

uPCR assay was modified from the RT-qPCR published by Kamau et al.8 for their detection of low density malaria infections (LDMI). After uPCR detected a high prevalence of LDMI in the region9, and with continued surveillance in mind, we wanted a lower sample volume assay with similar LDMI detection sensitivity. As Kamau et al. has shown, using this primer set as a RT-PCR significantly increases the sensitivity of the assay. The increased sensitivity of RT-PCR is due to the increased number of targets per parasite (compared to uPCR). These amplification targets include the 18S rRNA genes, and the structural RNA of each ribosome. Plasmodium genus specific uPCR amplifies type A and S 18S ribosomal RNA genes distributed on chromosomes 1, 5, 7, 11 and 13. A positive qPCR reaction requires at least one of these genes to be included in the assay. Alternatively, RT-PCR can detect these gene loci, and their gene transcripts (rRNA). The increased target copy number per parasite means a smaller fraction of parasite is needed to provide a positive reaction, leading to less false negatives and an opportunity for further downstream applications. The downside to increased sensitivity and target copy is the variable nature of gene expression and relative fragility of RNA molecules. In general this makes accurate quantification of parasitaemia by RT-qPCR more challenging, and is one of the reasons for outliers in our inter-assay quantification comparison. In future studies the use of a comprehensive methodology tailored specifically to RNA preservation, extraction and amplification would improve sensitivity and allow for downstream applications involving whole-transcriptome profiling important for studies on transmission, pathogenesis and virulence<sup>13</sup>.

While there were obvious differences in quantification for some samples by each method, these did not reach statistical significance. One reason for these outliers was the use of different stored aliquot volumes between assay types. The uPCR aliquot was fixed at 500 µL while the second aliquot, which was used for RT-qPCR ranged from 150 µL to 1 mL prior to freezing. Because RT-qPCR targeting rRNA is capable of detecting tiny fractions of a single parasite, the original lysed sample volume becomes an important detail. Assuming a single freeze thaw lyses blood stage Plasmodium and a Plasmodium assay has a hundred thousand targets per parasite, then a single lysed parasite divided into one hundred aliquots can produce one hundred positive reactions, if the parasite wasn't lysed beforehand then only 1 of 100 would be positive. This can lead to people describing their assay sensitivity well below the sample volume used, a theoretical impossibility unless detecting free circulating nucleic acids outside of parasite cells.

Alternatively, LDMI detection relying on DNA, will have a significant reduction in sensitivity if only a fraction of the DNA template is tested. This is exemplified by the lowest concentration standard used for quantification in uPCR. This standard theoretically contains 0.032 parasites per PCR reaction, at this concentration there is a 1 in 5 chance for the reaction to be positive (7 target genes per parasite  $\times 0.032 = 0.2$  copies per reaction). These factors need to be considered when setting up a qPCR standard curve for LDMI quantification. A reliable standard curve for qPCR requires at least one copy of its target at the lowest concentration.

While many consider light microscopy the gold standard for malaria diagnosis, its lack of sensitivity at parasitaemia below 50 parasites/ $\mu$ L makes its use impractical for analysis of LDMI (13 of 21 uPCR positive samples were LDMI). Ultrasensitive PCR has been assessed for sensitivity in previous studies with a limit of detection at 22 parasites per mL<sup>6</sup>.

### Conclusion

The success of any LDMI detection protocol relies on the careful consideration of the following factors: sample volume, elution volume, template volume per assay reaction, primer set target and assay type (uPCR or RT-qPCR). Our experience of the different types of assay suggest that for a LDMI program requiring highly sensitive, accurate quantification and where venous blood collection is possible, uPCR is recommended. In an environment where blood volume is limited (i.e. finger prick sampling) and quantification accuracy of parasitaemia is less important, RT-qPCR is a suitable alternative.

### Declaration

### Ethics approval and consent to participate

First, community engagement teams sought community approval ahead of the survey date. Then, survey participants received individual information in their language, and informed consent was obtained from each individual before they provided a venous blood sample. Appropriate treatment for *Plasmodium falciparum* or *Plasmodium vivax* was available for all RDT-positive individuals.

The METF project has ethical approval from the Lower Myanmar Department of Medical Research Ethics' committee (reference 73/ETHICS2014, dated 25 November 2014, and renewed in November 2015 and 2016 under the same reference).

### Data availability

#### Underlying data

Open Science Framework: Reverse transcription PCR to detect low density malaria infections. https://doi.org/10.17605/OSF. IO/76K9R<sup>12</sup>

This project contains the following underlying data:

- Plasmodium quantifications\_Parasites per mL.xls (Contains *Plasmodium* spp., *P. falciparum* quantifications (parasite per mL whole blood) and the threshold cycle for all RT-qPCRs)

Data are available under the terms of the Creative Commons Zero "No rights reserved" data waiver (CC0 1.0 Public domain dedication).

### Acknowledgements

The authors would like to thank all the staff and participants involved in the malaria elimination project.

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## **Open Peer Review**

# Current Peer Review Status: 🗙 ? 🗸

Version 3

Reviewer Report 08 April 2022

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Julian Tanner 匝

School of Biomedical Sciences, Li Ka Shing Faculty of Medicine, The University of Hong Kong, Pokfulam, Hong Kong

The authors have addressed the issues originally raised.

Competing Interests: No competing interests were disclosed.

Reviewer Expertise: Diagnostics

I confirm that I have read this submission and believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

Version 2

Reviewer Report 06 August 2021

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## ? Muneaki Hashimoto

Health Research Institute, National Institute of Advanced Industrial Science and Technology (AIST), Hayashi-cho, Takamatsu, 761-0395, Japan

1. What I want to know is why uPCR is more sensitive than your RT-qPCR. If not, you will not be able to evaluate your RT-qPCR.

- 2. If contamination is the cause of ultra-sensitive detection, is there a way to prevent it? If not, your RT-qPCR in endemic areas may not be useful. Please specify where in your manuscript the reviewer's comments were or were not reflected.
- 3. In Abstract, you have defined the real-time reverse transcription PCR you performed as RTqPCR. qPCR is an abbreviation for quantitative PCR. If this PCR method is qualitative, it should be clearly stated and changed to an appropriate abbreviation.

Competing Interests: No competing interests were disclosed.

I confirm that I have read this submission and believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard, however I have significant reservations, as outlined above.

### Author Response 10 Aug 2021

Peter Christensen, Mahidol University, Maesot, Thailand

Thank you for your time, I hope I have addressed your questions.

1. What I want to know is why uPCR is more sensitive than your RT-qPCR. If not, you will not be able to evaluate your RT-qPCR.

RT-PCR detection of 18SrRNA is more sensitive than PCR detection of the 18SrRNA gene (Kamau et al). There is no gold standard for malaria detection other than microscopy. I agree that uPCR is a flawed control for sens/spec testing but the other options are worse. I could use microscopy but that has much lower sensitivity. I would need to repeat the Kamau et al. paper with changes to the sample preparation, sample volume, elution volume and kit brand if I want to determine and compare the low limits of detection. Although PCR is a less sensitive technology, the uPCR contains DNA from a larger sample volume and is more likely to include a parasite from patient samples with very low

parasitaemias.

To confuse matters further, both assays can detect a single parasite in a given sample volume, if the whole sample is tested. Problems arise when the PCR template is diluted and split into multiple assays.

1. If contamination is the cause of ultra-sensitive detection, is there a way to prevent it? If not, your RT-qPCR in endemic areas may not be useful. Please specify where in your manuscript the reviewer's comments were or were not reflected.

Reply: The uPCR is high throughput and used to survey many 1000s of samples regularly. The flow through contains multiple negative and positive controls (DNA extract controls and mastermix controls) per test plate. They also have sample left over to analyse and check. Using this data they found standard contamination to be a factor in some runs.

There's no way to determine if the unique RT-qPCR positives are true or not in this study. The RT-qPCR assay included negative controls in all runs (and they were negative).

Removing the standard and making the assay qualitative is one way to remove possible contamination issues, but a positive control will always be needed and represent a source of contamination.

I'm also not convinced that these are all contamination. RT-qPCR is a more sensitive

technique, and could be detecting true positives (especially when taking an aliquot from a frozen/lysed sample – unfortunately I didn't record which samples had more than 150ul PRBC remaining and is a limitation). There's just no way to know when using clinical samples from asymptomatic people for evaluation. In this paper I wanted to answer a simple question "can I use a lower volume sample and a more sensitive technique to achieve similar sensitivity to uPCR?"

I can add a point in the discussion on the importance of including multiple true negative controls, especially in field settings when using highly sensitive techniques.

1. In Abstract, you have defined the real-time reverse transcription PCR you performed as RT-qPCR. qPCR is an abbreviation for quantitative PCR. If this PCR method is

qualitative, it should be clearly stated and changed to an appropriate abbreviation. Reply: The 2 assays were run in duplicate with a high quality standard curve. There has been some discussion amongst authors as to what we are allowed to call the assay. In my opinion it is a quantitative assay (and bland-altman analysis showed reasonable agreement between the 2 assays). Unfortunately the assay doesn't follow MIQE guidelines for RT-qPCR, so one of the authors wanted it changed to RT-PCR. I recently changed all back to RT-qPCR when referring to the assay, after comments from another reviewer. I'll check and make sure it's consistent. If you have advice on this point I'm open to review.

*Competing Interests:* No competing interests were disclosed.

Author Response 10 Aug 2021

Peter Christensen, Mahidol University, Maesot, Thailand

I can add this to the end of discussion is you think it's warranted. "It should be noted that there is no way to determine the true status of samples with positive results from a single assay type in this study. Determining whether RT-qPCR is more sensitive than uPCR in the described format is beyond the scope of this study as uPCR results were used as the gold standard for analysis."

*Competing Interests:* No competing interests were disclosed.

## Version 1

Reviewer Report 22 July 2021

https://doi.org/10.21956/wellcomeopenres.18253.r44476

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School of Biomedical Sciences, Li Ka Shing Faculty of Medicine, The University of Hong Kong, Pokfulam, Hong Kong

In this article, the authors present data on using RT-PCR on small volume clinical samples.

This is a fairly simple, although logistically challenging, study, particularly given the present COVID situation. The study adds value to the literature around this topic and given this is:

- 1. An important topic.
- 2. A journal which accepts submissions Wellcome Open Research without concerning too much with impact
- 3. Adds value for those looking at PCR methods in malaria-endemic regions.
- 4. Has suitable ethical approvals.

I would support the indexing of this article.

Some comments to improve:

- 1. Figure 1 are these data in triplicate, can error bars be added?
- 2. Figure 2 besides Bland-Altman can further analysis be added to add some more depth to the paper?

Is the work clearly and accurately presented and does it cite the current literature?  $\ensuremath{\mathsf{Yes}}$ 

Is the study design appropriate and is the work technically sound?

Yes

Are sufficient details of methods and analysis provided to allow replication by others?  $\ensuremath{\mathsf{Yes}}$ 

If applicable, is the statistical analysis and its interpretation appropriate?

Yes

Are all the source data underlying the results available to ensure full reproducibility?  $\ensuremath{\mathsf{Yes}}$ 

Are the conclusions drawn adequately supported by the results?

Yes

*Competing Interests:* No competing interests were disclosed.

**Reviewer Expertise:** Molecular diagnostics.

I confirm that I have read this submission and believe that I have an appropriate level of

# expertise to confirm that it is of an acceptable scientific standard, however I have significant reservations, as outlined above.

Author Response 27 Jul 2021

Peter Christensen, Mahidol University, Maesot, Thailand

Dear Reviewer, thanks for you time reviewing our paper. I have responded to your questions below.

- 1. Figure 1 are these data in triplicate, can error bars be added?
- 2. Unfortunately not. This is one reason we called it RT-PCR not RT-qPCR (the other is a lack of internal control). We were trying to add as much concentrated sample into the reaction as possible to have detection sensitivity similar to uPCR. This was the catch, we are forced to use as much sample as possible per reaction to achieve high sensitivity, but we don't want the logistics issues of large sample volumes. So we had to decide; either we decrease the assay sensitivity to increase its quantification accuracy, or put the whole sample into the PCR reaction. As this PCR will be used for 'Hot Spot' detection at the village level, we prioritized high sensitivity over high precision.
- 3. Figure 2 besides Bland-Altman can further analysis be added to add some more depth to the paper?
- 4. I'm hesitant to analyse the quantifications further as they're not high quality (not triplicate, not normalised) and accurate quantification of LDMI is not particularly important (low detection limit is more important).
- 5. I'll be adding microscopy and RDT results to the next draft and more information on the species present. Some of these samples were mixed Pf+Pv infections.

I hope I have answered your questions fully, The next draft will be out soon. Best Regards, Peter C

*Competing Interests:* No competing interests were disclosed.

Reviewer Report 25 June 2021

https://doi.org/10.21956/wellcomeopenres.18253.r44495

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## ? Muneaki Hashimoto

Health Research Institute, National Institute of Advanced Industrial Science and Technology (AIST),

Hayashi-cho, Takamatsu, 761-0395, Japan

In this study, the authors compared RT-qPCR with uPCR to develop ultra-sensitive and quantitative Plasmodium parasite detection methods. Previously, Kamau et al. showed that the detection limit of RT-qPCR is significantly lower than that of uPCR in experiments with in vitro cultured parasites. Using RT-qPCR, the current study investigated the ability to detect the parasites with ultra-sensitivity in real-patient blood samples and examined the possibility of reducing the required blood sample volume. The authors showed that parasitemia calculated by spp. uPCR was not statistically significantly different from that calculated by Pf RT-qPCR and spp. RT-qPCR, respectively, concluding that RT-qPCR may be an alternative to uPCR.

My comments are below:

- 1. In this study, uPCR was performed as the gold standard method. The gold standard method should have sufficiently high accuracy when compared with the method undergoing evaluation. What is the rationale for uPCR being the gold standard when assessing RTqPCR?
- 2. What is the cause of the false-positive results detected by RT-qPCR? For example, is there any risk of detecting rRNA of other pathogens by performing RT-qPCR? It is important to evaluate whether this method is suitable for actual blood samples
- 3. In the paper, what should be written as RT-qPCR was written as RT-PCR. The authors need to revise this.

Is the work clearly and accurately presented and does it cite the current literature?  $\ensuremath{\mathsf{Yes}}$ 

Is the study design appropriate and is the work technically sound? Partly

Are sufficient details of methods and analysis provided to allow replication by others? Yes

If applicable, is the statistical analysis and its interpretation appropriate?

I cannot comment. A qualified statistician is required.

# Are all the source data underlying the results available to ensure full reproducibility? $\ensuremath{\mathsf{Yes}}$

# Are the conclusions drawn adequately supported by the results? Partly

*Competing Interests:* No competing interests were disclosed.

Reviewer Expertise: Development of malaria diagnosis devices

## I confirm that I have read this submission and believe that I have an appropriate level of

# expertise to confirm that it is of an acceptable scientific standard, however I have significant reservations, as outlined above.

### Author Response 27 Jul 2021

Peter Christensen, Mahidol University, Maesot, Thailand

Dear Reviewer,

Thank you for your time reviewing the paper. It is very much appreciated. I have replied to each of your questions below in bold.

- 1. In this study, uPCR was performed as the gold standard method. The gold standard method should have sufficiently high accuracy when compared with the method undergoing evaluation. What is the rationale for uPCR being the gold standard when assessing RT-qPCR?
- 2. We use uPCR because it has been fully evaluated for sensitivity and specificity in 'Imwong et al. JCM 2014' - 2500x more sensitive than microscopy (true gold standard) and 50x more sensitive than finger prick + PCR. Also, uPCR is a standard method at the SMRU and I had already produced uPCR results from these samples. My supervisor wanted to collect less sample without losing too much sensitivity, and I knew the primer set was more sensitive in RT-PCR format (Kamau et. al. JCM 2011). The samples had a lower volume cryopreserved second aliquot, so I tried the uPCR in RT-PCR format. Another reviewer has asked for the microscopy (true gold standard detection) and RDT results, which will be included in the next draft. Both are inappropriate for comparison to RT-PCR due to low sensitivity, which you'll see in the next draft.
- 3. What is the cause of the false-positive results detected by RT-qPCR? For example, is there any risk of detecting rRNA of other pathogens by performing RT-qPCR? It is important to evaluate whether this method is suitable for actual blood samples
- 4. The 18SrRNA primers are unique to Plasmodium, so false positives are either real positives or, more likely, contamination from the standard during plate preparation (false positive from uPCR (Imwong 2014) were found to be caused by standard contamination). Unfortunately, we were trying to include as much sample as possible to to increase sensitivity of the PCR, so we had no sample left over to investigate these false positives further.
- 5. In the paper, what should be written as RT-qPCR was written as RT-PCR. The authors need to revise this.
- 6. Our PCR doesn't meet the criteria for RT-qPCR so one of the authors wasn't happy naming it 'qPCR' (The PCR is not in triplicate, and doesn't have an internal control for normalising quantification). I understand the confusion, because we go on to compare quantification (which I assumed would be different but to my surprise wasn't). In my opinion the quantification of LDMI is less useful than the low limit of detection and could be removed entirely from the paper (especially without knowing the life stage - ring vs schizont will have vastly different ribosome quantities).

I hope this answers your questions, I'll have the second draft in soon. Regards, Peter C Competing Interests: No competing interests were disclosed.

Reviewer Report 20 April 2021

https://doi.org/10.21956/wellcomeopenres.18253.r42783

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## **Gisely Melo**

Tropical Medicine Foundation Dr. Heitor Vieira Dourado, Instituto de Pesquisa Clínica Carlos Borborema, Manaus, Brazil

## **Abstract:**

What was the target used? Was all PCR targeted to a specific gender? What was the gold standard used? The method is not clear. Why used only *falciparum* used for the manuscript?

## Introduction:

What is the target? What is the comparison with methods used as the gold standard of PCR?

### **Methods:**

Why was only *Plasmodium falciparum* used? What chance does the target fail to detect other malaria? Which parasitemia of the people studied to study low parasitemia? If used, was gold pattern used as a thick blood smear or RDT? The target for RT-PCR was for *Plasmodium*? Two RT-PCRs were performed on each extract in duplicate: *Plasmodium* spp. and are they sensitive enough? Using uPCR as a gold standard would not be the most appropriate use of the thick blood smear as a control. It is not clear that he will use a method for gender and species for methodology.

## **Results:**

Using uPCR as a gold standard is not the most suitable. How to be sure of positive positives and false negatives? Why was parasitemia not compared in the studied methods to verify the comparison between the methods to verify the smallest parasitemia that it would detect? In quantification, it is more appropriate to perform correlation analysis to compare a parasitemia between the methods.

## Discussion:

The targets should have been described in the methodology as well. What are the limitations of the study?

## Is the work clearly and accurately presented and does it cite the current literature?

Partly

## Is the study design appropriate and is the work technically sound?

No

Are sufficient details of methods and analysis provided to allow replication by others?  $\ensuremath{\mathsf{Yes}}$ 

# If applicable, is the statistical analysis and its interpretation appropriate? Partly

Are all the source data underlying the results available to ensure full reproducibility?  $\ensuremath{\mathsf{Yes}}$ 

Are the conclusions drawn adequately supported by the results? Partly

Competing Interests: No competing interests were disclosed.

I confirm that I have read this submission and believe that I have an appropriate level of expertise to state that I do not consider it to be of an acceptable scientific standard, for reasons outlined above.

### Author Response 22 Apr 2021

Peter Christensen, Mahidol University, Maesot, Thailand

Thank you for your time reviewing this paper, I appreciate the effort.

Hopefully I can address all your comments in the next draft.

## *Info on target & sensitivity specifictity data:*

I will update the paper to include more information about the primer targets earlier and will add the previously published Sens and Spec for the Plasmodium spp. primer set used by uPCR and RT-PCR. It has been done in the original paper for both qPCR and qRT-PCR and then again for high volume uPCR. **Will adding previously published data be satisfactory?** 

## Why only falciparum:

We used Pf only because we can produce very young rings *invitro* that are then FACS sorted for a more consistent standard, and because clinical vivax samples often contain late stages (which may contain more than one nucleus per infected red cell and also contain more ribosomal material). Furthermore, although there is a growing realisation of vivax malaria's importance; the funder and clinicians at the field site still consider the sensitive and timely diagnosis of Pf a priority. Nonetheless I wish to assure the reviewer that we also would have preferred to have a Pv data set (esp. considering Pv is the most prevalent in the region); however due to the large proportion of sample per reaction (4ul of DNA template per rxn & only 20ul DNA eluted) this means we can only do two PCRs in duplicate. This is a limitation of this type of high blood volume per reaction assay. I can discuss this limitation.

## Clarify targets:

Only 2 new RT-PCR results were produced in this study, both target 18S RNA. One was Plasmodium genus specific, the other was *P. falciparum* specific. The original Pf classification given by uPCR used another Pf primer set from Perandin et al. JCM 2004.

In hindsight I should have used this same Pf primer set for my RT-PCR assays. The reason I used primers from Sumari et al. is because they had been used in RT-PCR format and we originally included gametocyte data using PfS25 primers from that paper as well. We didn't have enough sample to complete the data set, so it was removed from the paper.

## RDT and Microscopy:

Microscopy would be better as it is the gold standard. But the LOD is so low it would not be able to detect the majority of samples in this data set (13 of 21 are submicroscopic (<50,000 p/mL)). Unfortunately RDT data from the malaria elimination program, was found to have some important QA issues (the specific batch of PfHRP-2 RDTs provided by Global Fund)).

## Statistics:

I thought correlation was appropriate here as well, but our statistician sent me this paper ( https://www.ncbi.nlm.nih.gov/pmc/articles/PMC4470095/). So I used bland-altman for assessing agreement (both similarities and differences) between test measurements. Originally I wanted this assay to be yes/no and semi-quantitative and expected the analysis to <u>not</u> show agreement between tests. The reason thought this is because Kamau *et al* have already shown this primer set is less accurate at low parasitaemia when used as qRT-PCR.

## *Number of LDMI*:

I will add the number of samples that were low density (less than 50 parasites/uL) by uPCR result: 13 of 21 were LDMI.

Again we wish to thank the reviewer for their time and expertise, Regards, Peter C

*Competing Interests:* No competing interests were disclosed.