

# 1 **Natural history of malaria infections during early childhood in twins**

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20 **Running Title:** Malaria infection and disease in twins

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23

## 1 **Abstract**

2 **Background:** The frequency and clinical presentation of malaria infections show marked  
3 heterogeneity in epidemiological studies. However, deeper understanding of this variability  
4 is hampered by the difficulty in quantifying all relevant factors. Here, we report the history  
5 of malaria infections in twins, who are exposed to the same *in utero* milieu, share genetic  
6 factors and are similarly exposed to vectors.

7  
8 **Methods:** Data were obtained from a Malian longitudinal birth cohort. Samples from 25  
9 twin pairs were examined for malaria infection and antibody responses. Bayesian models  
10 were developed on the number of infections during follow-up.

11  
12 **Results:** In 16/25 pairs, both children were infected and often developed symptoms. In  
13 8/25 pairs, only one twin was infected, but usually only once or twice. Statistical models  
14 suggest this pattern is not inconsistent with twin siblings having the same underlying  
15 infection rate. In a pair with discordant hemoglobin genotype, parasite densities were  
16 consistently lower in the child with hemoglobin AS, but antibody levels were similar.

17  
18 **Conclusions:** By using a novel design, we describe residual variation in malaria  
19 phenotypes in naturally-matched children and confirm the important role of  
20 environmental factors, as suggested by the between twin pair heterogeneity in malaria  
21 history.

22  
23 **Key Words:** malaria, infection, twins, pathogenesis, hemoglobin S

## 1 Introduction

2 Children living in endemic areas differ in at least three important aspects with regard to  
3 malaria infection history [1, 2]: the number of falciparum infections experienced; the levels  
4 of parasitemia when blood-stage infections are established; and the clinical outcomes of  
5 these infections. Several factors have been suggested to contribute to these differences. For  
6 example, host genetic factors [3-5] are thought to influence clinical expression and  
7 differences in parasitemia. Factors that modify *in utero* environment have also been linked  
8 to between-child differences in malaria outcomes [6, 7]. Although many epidemiological  
9 studies aim to quantify these different types of variations and identify their causes, the  
10 potentially high number of important host factors complicates the understanding of the  
11 different and common processes that lead to variability in these phenotypes.

12  
13 Here, we propose that comparing the history of malaria infections in twins throughout  
14 early childhood would generate new insights into malaria pathogenesis. Twins are exposed  
15 to the same *in utero* milieu, and share genetic factors, either partially or entirely, when  
16 monozygotic. Furthermore, in some areas, twins often sleep together throughout  
17 childhood, implying similar exposure to malaria vectors. By studying the frequency of  
18 infections, parasite levels and clinical malaria presentations in twins, we learn about  
19 residual variability of malaria phenotypes in children naturally matched for disease-  
20 modifying factors and exposure.

21

## 1 **Methods**

### 2 *Study population and clinical procedures*

3 The longitudinal cohort study of mother-infant pairs was conducted from February 2011 to  
4 July 2016 in the health district of Ouelessebougou located 80 km south of Bamako, Mali, an  
5 area of intense seasonal malaria transmission. Study protocol was approved by the  
6 institutional review boards at the National Institute of Allergy and Infectious Diseases,  
7 National Institutes of Health, and by the Ethics Committee of the Faculty of Medicine,  
8 Pharmacy and Dentistry, University of Bamako. Written informed consent was obtained  
9 from the study participants or the parents/guardians of pregnant adolescent after  
10 receiving a study explanation form and oral explanation from a study clinician in their  
11 native language. The protocol is registered at Clinicaltrials.gov under identifier  
12 NCT01168271. Children were followed from birth up to 5 years. Scheduled and  
13 unscheduled visits included clinical examination and blood smear microscopy for the  
14 detection of malaria parasites. Children were seen monthly during the malaria  
15 transmission season, every two months during the dry season; note (i) that during the  
16 study period before August 2013 follow-up was more frequent for children aged less than  
17 24 months, who were seen every two weeks during the transmission season, and (ii) the  
18 same visit scheduled applied to children within pairs. Throughout the study, any time a  
19 child in the study was sick, she or he would also be seen (unscheduled visit). Severe  
20 malaria was defined as parasitemia detected by blood smear microscopy and one of the  
21 following World Health Organization definitions of severe malaria: coma (Blantyre score  
22 below 3), two or more convulsions in the past 24 hours prostration (inability to sit unaided  
23 or in younger infants inability to move/feed); hemoglobin below 6 g/dL; respiratory

1 distress (hyperventilation with deep breathing, intercostal recessions and/or irregular  
2 breathing).

### 4 *Antibody detection by ELISA*

5 Blood samples were taken, and plasma was used to detect total IgG against AMA-1 and  
6 MSP1[8, 9]. ELISA assays were performed using Immulon® 4HBX (high binding), flat-  
7 bottom, 96-well microtiter plates (Thermo Scientific, Rochester, NY). Briefly, plates were  
8 coated with 200 ng per well (50 µl/well) of each one of the antigens, diluted in 0.05M  
9 carbonate–bicarbonate buffer pH 9.6 and incubated at 4 °C overnight. Plates were blocked  
10 with 120 µl/well of blocking buffer containing 5% skim milk diluted in tris buffered saline  
11 (TBS, Fisher Scientific®) and incubated at RT for 1 h. Wells were washed with TBS 0.05%  
12 Tween 20 and 50 µl/well of plasma diluted in antibody diluting buffer were added in  
13 duplicate and incubated at RT for 1 h. After washing, 50 µl/well of goat anti-human  
14 antibody (KPL, SeraCare®) were added at 1:300 and incubated at RT for 1 h. After the  
15 plates were washed, 50 µl/well of phosphatase substrate (Sigma Aldrich®) diluted in  
16 coating buffer were added and incubated at RT for 20 min. Optical density was measured at  
17 405 nm using a microplate photometer (Infinite® M200 PRO, Tecan).

### 19 *Anti-PfGARP and anti-PfSEA-1 antibody assays*

20 To measure IgG anti-rPfGARP (glutamic acid rich protein) and anti-rPfSEA-1(Schizont  
21 Egress Antigen-1) antibody levels, we developed a bead-based assay according to previous  
22 published methods[10, 11]. In brief, the beads in 96-well plates were washed three times  
23 with ABE to remove particulates. Plasma samples were diluted 1:80 in ABE buffer and 50 µl

1 of diluted sample was added to the beads and incubated in the dark on a shaking platform  
2 at 1000 rpm for 30 seconds followed by 300 rpm for 30 minutes at RT. These conditions  
3 were used in successive incubations. Excess antibody was removed using a vacuum  
4 manifold followed by three washes in ABE. Twenty-five  $\mu$ l of biotinylated human IgG  
5 detection antibody (Pharmingen) diluted 1:500 in ABE was added to the beads and  
6 incubated as indicated. Fifty  $\mu$ l of phycoerythrin-conjugated streptavidin (BD  
7 Pharmingen™, Franklin Lakes, NJ) diluted 1:500 in ABE was added to the beads and  
8 incubated as mentioned. Excess phycoerythrin conjugated streptavidin was removed  
9 followed by three washes in ABE. The beads were then re-suspended in 125  $\mu$ l of ABE and  
10 analyzed on the BioPlex100 system.

11  
12 The reader was set to read a minimum of 50 beads with identical unique detection signal.  
13 Fluorescence values for BSA beads were subtracted from rPfGARP and rPfSEA-1 beads and  
14 the results were expressed as median fluorescent intensity (MFI). The cut-off for detectable  
15 anti-PfGARP/PfSEA-1 antibody levels was defined as fluorescence values greater than the  
16 mean plus 2 s.d. fluorescence level of 10 healthy children. Anti-rPfGARP and anti-rPfSEA-1  
17 antibody levels are presented in the *Supplementary Appendix*.

18  
19 *qPCR*  
20 Following DNA extraction, real-time quantitative PCR (qPCR) to amplify the 18S small sub-  
21 unit rRNA gen (ssrDNA) of *P. falciparum* was carried out on a 7500 Real-Time PCR System  
22 (Applied Biosystems, USA). Briefly, a PCR mixture was prepared with 2.5  $\mu$ l of DNA  
23 template, a 5  $\mu$ M concentration of each primer and a 1.5  $\mu$ M concentration of TaqMan®

1 TAMRA Probe labelled with 6-carboxyfluorescein (FAM) as a reporter. The results were  
2 analyzed using default settings on the Applied Biosystems 7500 Fast Real-Time PCR  
3 System Sequence Detection Software v1.4.1.

## 4 5 **Statistical analysis**

6 Descriptive analyses were performed using Pandas and matplotlib libraries in Python.  
7 Positive blood smears within 28 days of a previous positive smear, and with no negative  
8 smears during the same period, were considered to be a single infection. Bayesian  
9 statistical models were fit, using PyStan, to explore whether observed patterns were  
10 consistent with either Poisson, Negative Binomial or a Hierarchical Poisson model, to  
11 account for the grouping of children in twin pairs. In all models, the prior used for the log-  
12 mean parameter (for the Hierarchical Poisson model, presented in equations I and II, this  
13 corresponds to  $\mu_g$ ) was  $Normal(0, 5^2)$ , which covers all plausible values and beyond; for  
14 the scale parameter ( $\sigma_g$ ) used in the Hierarchical Poisson model we used a weakly  
15 informative prior of  $Normal(0, 1)$ . Sensitivity analyses were performed with different prior  
16 assumptions, with similar results (see **Table S1** and **Figure S8**); models were also fit that  
17 used the log number of routine visits, rather than the log follow-up duration, as the offset  
18 term, and were consistent with findings in the *Results* section.

## 19 **Results**

### 20 *Study participants*

21 We report data from a birth cohort study with intensive follow-up performed in Southwest  
22 Mali. 25 twin pairs, 2 of which monozygotic, were identified and included in this analysis.

1 These participants were recruited at birth between April 2011 and February 2015 and  
2 were followed for 30.7 months (median, interquartile range [IQR] 18.5 – 39.9). The median  
3 number of study visits, scheduled or unscheduled, was 33 (IQR 16 - 44) and the range was  
4 7 - 91. Half (25/50) of these children were female. Of the 50 children, 36 had AA genotype,  
5 9 were heterozygous for hemoglobin C mutation (AC genotype) and 5 had AS genotype.  
6 There were 9 twin pairs with at least one child with hemoglobin mutations; in 4 of these 9  
7 pairs, only one of the two twins had hemoglobin mutations. Additional information about  
8 the pairs is presented in **Table 1**.

#### 9 10 *Malaria infections during childhood*

11 Overall, 1,717 blood smears were performed, 126 performed in monozygotic twins.  
12 Asexual falciparum parasites were identified in 190 smears - 137 during scheduled and 53  
13 during unscheduled, walk-in visits. 40/50 children had at least one falciparum-positive  
14 visit; the median age at the first falciparum-positive smear was 11.4 months (IQR 5.9–  
15 14.4). In 24/25 pairs, at least one of the twins had a positive smear. Both children in the  
16 pair with no parasitemia were followed for more than 15 months. 36/40 children with at  
17 least one positive smear developed clinical malaria (range of number of clinical episodes  
18 per child, 1–13).

19  
20 **Figures 1** (the subset of twin pairs with longest follow-up) and **S1** (all twin pairs) show  
21 patterns of infection and parasitemia. Study pairs were broadly categorized: pairs where  
22 both children were infected at least once (concordant group; group 1 in **Figures 1** and **S1**);  
23 pairs where only one of the twins had infection (discordant group; group 2 in **Figures 1**



1 and **S1**); twins with different hemoglobin genotypes (AA versus AS [i.e. heterozygous for  
2 sickle cell mutation] hemoglobin type; group 3 in the same figure). Although numbers of  
3 infections in children in the same pair were often similar (**Figures S1 and S2**), in 8/25  
4 pairs, all with follow-up longer than a year, only one twin had parasitemia detected. The  
5 number of positive smears in this group was low: in 5/8 pairs the infected sibling had one  
6 or two positive smears, which might suggest lower exposure to sporozoite-infected  
7 mosquitoes in the household or area where these pairs lived. Note that 16/28 and 4/16  
8 births in groups 1 and 2, as defined above, happened during the transmission season  
9 months (July – December); furthermore, median (IQR) numbers of scheduled visits per  
10 month of follow-up in the two groups were similar: 0.84 (0.71 – 0.97) and 0.74 (0.66 –  
11 0.88) scheduled visits per month, respectively. To assess whether this pattern, where only  
12 one of the twins had infections detected by microscopy, represents reduced exposure or  
13 better control of parasitemia at submicroscopic levels, available samples from children  
14 with no positive blood smears were tested with a sensitive molecular assay (qPCR  
15 targeting 18S; 2 samples for 3 children, 1 sample for 4 children). Only one child without  
16 patent infection had parasites detected by molecular methods.

17  
18 To further understand the distribution of infections within twin pairs, we fit a series of  
19 Bayesian models to the number of independent malaria infections, accounting for  
20 differences in follow-up duration: Poisson model (where the same incidence parameter is  
21 assumed for all children in the study), Negative Binomial model (which also assumes the  
22 same incidence parameter but allows for more between child variability, without regard to  
23 twin pairs) and Hierarchical Poisson model (where a separate incidence parameter is

1 allowed for each twin pair). The Hierarchical Poisson model is shown below in equations I  
 2 and II:

$$3 \mu_j \sim \text{Normal}(\mu_g, \sigma_g^2) \quad \text{(I)}$$

$$4 y_{ij} \sim \text{Poisson}(e^{(\mu_j + \text{offset})}) \quad \text{(II)}$$

5  
 6  
 7 where log-rate  $\mu_j$  for pair  $j$  is assumed to follow a Normal distribution with location  
 8 parameter  $\mu_g$  and scale  $\sigma_g$ . The number of infections detected for child  $i$  in pair  $j$  is  
 9 represented by  $y_{ij}$ ; the offset term corresponds to the log of the follow-up duration.

10  
 11 The Poisson model assuming the same incidence for all twin pairs does not fit the data well.  
 12 As can be seen in **Figure 2A**, the data are consistent with the Hierarchical Poisson model,  
 13 suggesting that there is between pair variability in incidence parameters, but not  
 14 necessarily within twin pair variability. In particular, consistency with the latter suggests  
 15 that the observed degree of discordance in malaria infection history among twins in some  
 16 pairs could have arisen even if there were no differences in the underlying incidence within  
 17 pairs of siblings, i.e. if both twins in each pair were equally exposed to malaria parasites  
 18 and had on average the same number of events per time unit. In other words, the relatively  
 19 low expected numbers of infections per time unit estimated under the Hierarchical Poisson  
 20 model for pairs of group 2, defined in **Figure 1**, are consistent with the pattern where one  
 21 of the twins had no infections detected during follow-up and the other twin in the same  
 22 pair had only a few infections. On the other hand, the underlying infection rates estimated  
 23 in the Hierarchical Poisson model suggest significant variation between pairs (**Figure 2B**).

1 The total number of clinical malaria episodes was 141. Of the four children who became  
2 infected during follow-up and did not develop clinical malaria, two were only followed for a  
3 few months, another child only developed infection at the age of ~6 months and the other  
4 child had only one infection at the age of ~13 months, despite her twin developing two  
5 clinical malaria episodes in the same period. As can be seen in **Figures 1 and S1**, children  
6 continued to develop clinical malaria throughout their follow-up, sometimes with more  
7 than one episode during the same transmission season. The numbers of clinical episodes  
8 were generally similar for twins, except for those pairs where one twin had AS genotype  
9 and the other AA genotype (**Figure 3**).

10  
11 Non-falciparum malaria infections were also observed: 5 positive smears for *Plasmodium*  
12 *malariae*, all in different pairs, and 7 positive smears for *Plasmodium ovale* (3 different  
13 children in 2 different pairs). In three clinical malaria episodes, only non-falciparum  
14 malaria species were observed. Additionally, malaria transmission stages, gametocytes,  
15 were detected in 18 visits (11 different children in 9 different pairs).

#### 16 17 *Twins with different hemoglobin types*

18 There were three pairs with discordant hemoglobin S mutation status. In one of these pairs,  
19 while parasitemia in 8/10 positive-smears of the AA child was > 1000 parasites/300 WBCs,  
20 none of the 17 positive-smears in the AS child had >1000 parasites/300 WBCs. The second  
21 twin pair with discordant hemoglobin S status had different follow-up duration: while the  
22 AA child was followed for nearly 4 years, the AS child died at the age of 2.5 years. If we  
23 consider only the first ~2.5 years of follow-up of the AA child, there were 10 positive blood

1 smears, while the AS child only had one falciparum positive visit. We tested 2 samples from  
2 this child with AS genotype using qPCR and did not observe submicroscopic malaria  
3 infection. In the third pair, no infections were detected in both AA and AS children.  
4

#### 5 *Longitudinal seroreactivity*

6 In addition to quantifying parasite carriage throughout childhood, we also tested samples,  
7 including cord-blood samples, for antibodies against the malaria blood-stage antigens.  
8 Cord-blood levels of antibodies against four different blood-stage antigens were similar  
9 between twins (**Figure S5**). In **Figures 4, S6 and S7**, we show longitudinal changes in  
10 antibodies as children age. Samples collected during infancy had lower antibody levels  
11 compared to birth, as maternal antibodies are cleared from infants' blood. For a subset of  
12 children, in samples collected after infancy, antibody levels that were as high as those  
13 observed at birth were, at least temporarily, detected. In 5/8 pairs in the discordant group  
14 (i.e. pairs where only one child had evidence of infection), the child with at least one  
15 positive smear had higher antibody levels following an infection than the twin with no  
16 infections. In one of the pairs of twins with dissimilar hemoglobin genotype, although the  
17 AS child had consistently lower parasitemia, antibody levels were similar to the levels of  
18 the AA sibling.  
19

## 20 **Discussion**

21 Falciparum malaria burden is not equally distributed in endemic areas [12]. Here, we  
22 provided a detailed description of the history of malaria infections in children who have

1 both similar long-term exposure to vectors and share individual-level factors thought to  
2 influence infection outcome.

3  
4 Although there is substantial evidence for the role of host genetics in modifying malaria  
5 disease, with recent genome-wide association studies identifying several new protective  
6 variants [13], there are only a handful of malaria epidemiological studies that focused on  
7 twins, to our knowledge none of which included intensive longitudinal follow-up from  
8 birth. These studies primarily aimed to quantify the host genetic contribution to specific  
9 malaria phenotypes by comparing monozygotic twin pairs and dizygotic twins. For  
10 example, in The Gambia, twin pairs, recruited on average at the age of 5 years, were  
11 followed during rainy seasons and a stronger correlation in the development of fever was  
12 observed for monozygotic twins compared to dizygotic twins [14]. In another malaria twin  
13 study, it was shown that correlations of the IgG isotype levels were generally higher in the  
14 monozygotic versus dizygotic twins, which was interpreted as reflecting a degree of genetic  
15 regulation [15]. In addition to studies on twins, other studies have assessed familial  
16 aggregation of malaria phenotypes to understand joint contribution of shared genetic and  
17 environmental factors [16]. Whilst our sample size of 25 twin pairs is relatively small, the  
18 dataset included more than 1,500 parasitological observations during the age period when  
19 most clinical burden occurs. More importantly, by having information from birth, we were  
20 able to describe patterns of infections in these pairs of siblings as these children acquire  
21 partial immunity from repeated exposure.

22

1 One advantage of the design adopted is that study participants in each twin pair were  
2 expected to have similar exposure to *Anopheles* vectors. Indeed, although recent studies  
3 suggest that even within households there is variation in the number of mosquito bites  
4 different individuals receive [17], twins do not differ in two important determinants of  
5 frequency of malaria vector exposure: age, which is associated with attractiveness to  
6 mosquitoes possibly through body size, and bed net use, which is likely to be shared by  
7 twins in the same room.

8  
9 Several previous epidemiological studies have described considerable variability in  
10 numbers of malaria episodes in children living in the same endemic area. In our study area,  
11 we observed that while in some twin pairs both children developed multiple clinical  
12 episodes, in nearly a third of the pairs, only one of the twins had parasites during follow-up.  
13 Whilst previous studies[18, 19] suggest that average malaria infection duration is longer  
14 than the time interval between scheduled study visits, we cannot rule out the possibility  
15 that children with no parasites detected during the study had short-duration infections or  
16 subpatent infections. However, statistical analyses suggest that these observations are  
17 consistent with models that assume a common incidence for twins in the same pair. The  
18 presence in our study population of siblings with discordant hemoglobin types also  
19 allowed us to compare parasitemia during children's first infections by hemoglobin S  
20 mutation status. The observation of consistently low parasitemia in a child with AS  
21 hemoglobin genotype, whilst the twin with AA genotype had multiple infections with high  
22 parasitemia provide additional evidence for the effect of hemoglobin S heterozygosity on  
23 parasite growth as a mechanism of protection against malaria [20]. This observation also

1 parallels results of a Kenyan study that showed that children with higher-than-average  
2 numbers of clinical episodes often lived in the same homestead as children with average  
3 numbers of clinical episodes and that sickle cell mutation was an important factor which  
4 differentiated these groups [21]. Furthermore, after the consistent decrease in antibody  
5 levels during the first months of life as maternal antibodies wane, our antibody data show  
6 variable patterns of longitudinal changes during early childhood, including for children in  
7 the same pair (although changes in antibodies were often similar for different target  
8 antigens studied), reflecting between pair differences in parasite exposure.

## 10 **CONCLUSIONS**

11 By using a novel design, including longitudinal follow-up of twins from birth, with over  
12 1,500 parasitological observations, and a series of statistical models involving different  
13 assumptions on the distribution of the underlying incidence risk in the study population,  
14 we described heterogeneity in malaria burden between children from different families.  
15 This could be related to differences in vector exposure, host genetics and preventative  
16 measures, such as bed net use. Our detailed longitudinal data from naturally matched  
17 children also suggested similarities in malaria infection history within twin pairs, although  
18 important differences were observed for twins having different hemoglobin genotypes.  
19 More detailed phenotyping (i.e. host and parasite transcriptomics) of infections of  
20 intensively followed matched children, for whom history of infection exposure would thus  
21 be documented, is the next methodological step that could provide additional insights into  
22 the susceptibility to repeated malaria episodes during early childhood and generate  
23 hypotheses to be tested in larger population-based studies.

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**Notes**

**Acknowledgments**

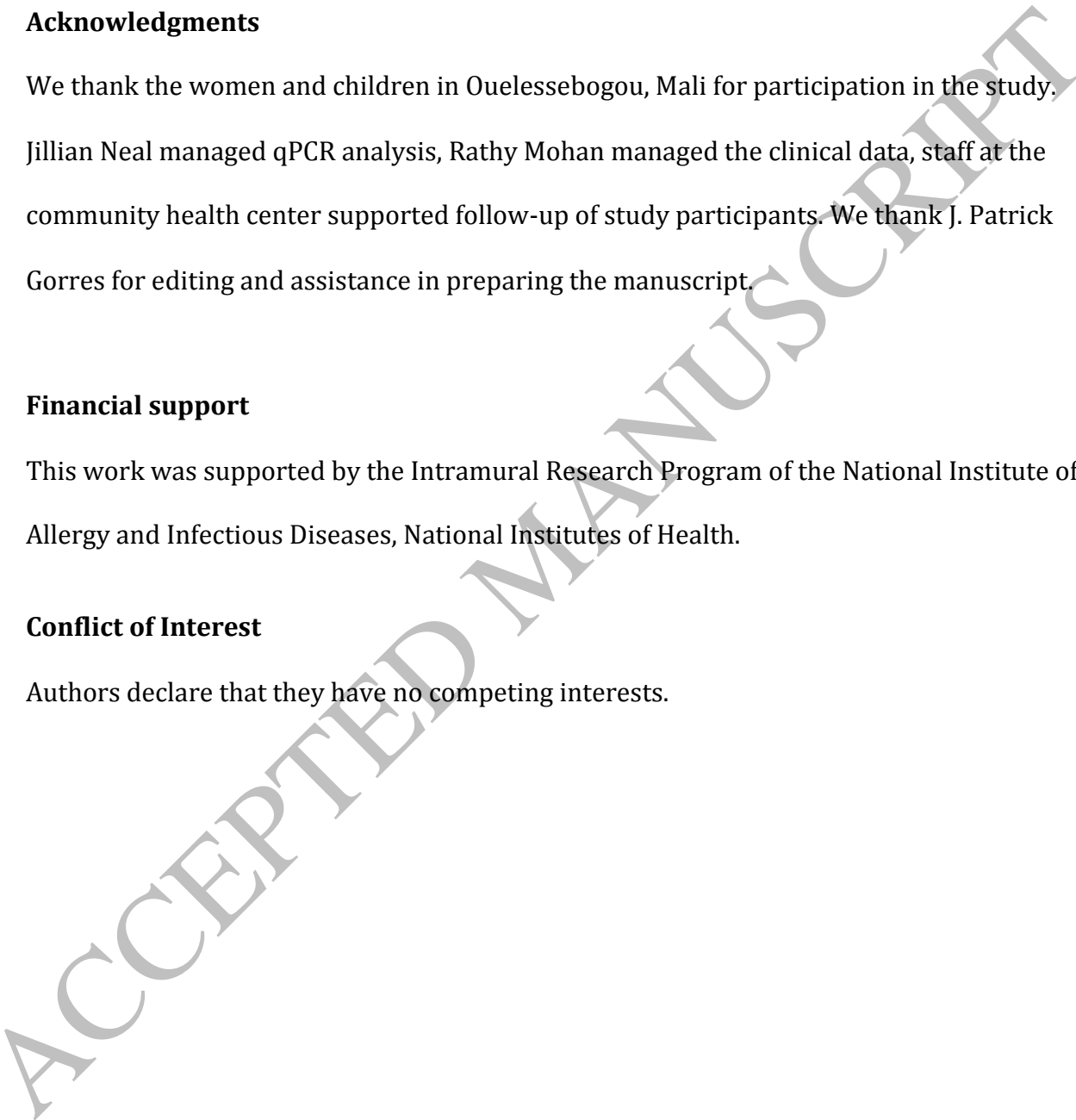
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**Conflict of Interest**

Authors declare that they have no competing interests.





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## Figure Legends

**Fig. 1. Falciparum infections during early childhood.** In each panel, smear results (y-axes; in parasite counts per 300 WBCs) for both twins in each pair are represented by blue and red lines. Circles represent time points (x-axes) when smears were performed; clinical episodes are represented by black squares. Orange shaded areas represent the transmission season (July – December). To facilitate visualization of low-density infections, infections with less than 100 parasites/300 WBC are represented by '\*'. Groups described in the text are shown on the top right corner in each panel. Pairs in group 1 were subcategorized in those with similar parasite levels during infection (1a) and those with discordant levels (1b), where the twin with highest parasitemia had at least one smear with counts 5-fold or higher than the maximum parasitemia of her or his sibling. Group 2 corresponds to pairs where only one of the twins had infection. Group 3 includes pairs with discordant hemoglobin S mutation status. Note that (i) **here only the two pairs in each group with the longest follow-up are presented (the same information is shown for all pairs in Figure S1)**; (ii) in group 3, only individuals with AA genotype had hyperparasitemia (here defined as > 3,750 parasites/300 WBC; see also **Figure S3**); (iii) clinical episodes where only non-falciparum parasites were detected are represented by black squares that are not linked to the plot lines and whose y-axis coordinate is defined by the non-falciparum parasitemia.

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3 **Fig. 2. Results of statistical models on the number of malaria infections. (A)** We fit three  
4 different count data models: Poisson model, that assumes the same incidence parameter for all  
5 individuals; Negative Binomial model, that allows for additional variability in the incidence, but  
6 that does not explicitly allow for the clustering of children within pairs; and a Hierarchical Poisson  
7 model that allows the incidence parameter to vary between different pairs of twins but not within  
8 pairs. In this figure, the y-axis represents the number of infections (black circles) during the  
9 follow-up of children, grouped in pairs (x-axis); children with hemoglobin AS genotype are  
10 presented by red stars. For each child, posterior predictive distributions are presented for the 3  
11 models discussed above; the different degrees of transparency of the colors represent different  
12 posterior intervals: 2.5 – 97.5, 25 – 75, 40 – 60. Whilst the Poisson model (orange color) does not  
13 fit the data well, data are consistent with both the Negative Binomial (green color) and the  
14 Hierarchical Poisson (purple) models. Of note, we also fit a Poisson model that included as  
15 covariate birth before versus after August 2013, when follow-up frequency changed (see **Figure**  
16 **S4**). **(B)** In this panel, the estimated rate of infection (per month) (x-axis; posterior median and  
17 95% interval) based on the Hierarchical Poisson model is presented for each of the 25 twin pairs  
18 (y-axis). Note that the rate in Pair 5 is estimated to be relatively high, due to infection detection  
19 during the relatively short follow-up of this pair. The ordering of this panel, from higher to lower  
20 y-axis coordinates, corresponds to the same ordering, from left to right, in panel A.

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22 **Figure 3.** Numbers of clinical malaria episodes for twins in the same pair (x- and y-axes).  
23 Red circles represent pairs with discordant hemoglobin S status; in these pairs, the Twin 2  
24 (y-axis) is AS child. Noise was added to x- and y-coordinates so that circles for pairs with  
25 similar coordinates do not fully overlap.

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1 **Figure 4.** Levels (y-axes) of antibodies against the malaria antigens AMA-1 (gray lines) and  
2 MSP-1 (green lines). As with **Figure 1**, each panel presents data of a twin pair. The ordering  
3 of the panels was kept between **Figures 1** and **4**; and continuous lines in **Figure 4**  
4 represent data of the twins represented with red lines in **Figure 1**, and the dashed line,  
5 data of the twins represented by blue lines in **Figure 1**. Blue and red circles, shown in the  
6 lower half of each panel, indicate the timing (x-axes) of positive smears. Black crosses on  
7 the serological measurements represent serological samples coinciding with smear  
8 positive results. Of note, there were twins who developed a high humoral response despite  
9 low cumulative parasite burden. Note that, as for **Figure 1**, only data for the twin pairs in  
10 each group with the longest follow-up are shown; similar data for all twin pairs are shown  
11 in **Figure S6**.

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ACCEPTED MANUSCRIPT

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**Table 1. Twins' characteristics and follow-up.**  
Positive blood smears in this table refer only to falciparum infections

	<i>Dizygotic</i>	<i>Monozygotic</i>
	N	N
<b>Total</b>	46	4
<b>Female</b>	25	0
<b>Hemoglobin genotype</b>		
<i>AA</i>	32	4
<i>AC</i>	9	0
<i>AS</i>	5	0
<b>Mother's gravidity</b>		
<i>Primi</i>	6	2
<i>Secundi</i>	6	2
<i>Multi</i>	34	0
<b>Placental Malaria</b>	6	0
	Median (IQR)	Values
<b>Maternal age (years)</b>	27 (21 – 34.5)	20, 22
<b>Age at first infection (months)</b>	10.4 (5.9 – 13.5)	14.1, 19.8, 26.2
<b>Age at last study visit (months)</b>	30.7 (18.0 – 40.3)	28.6 (x2), 33.3 (x2)
<b>Number of study visits</b>	34 (15.2 – 46.2)	27, 28, 35, 36
	N	N
<b>Total number of positive blood smears</b>	183	7
<b>Total number of clinical malaria</b>	135	6
<b>Total number of severe malaria</b>	2	0

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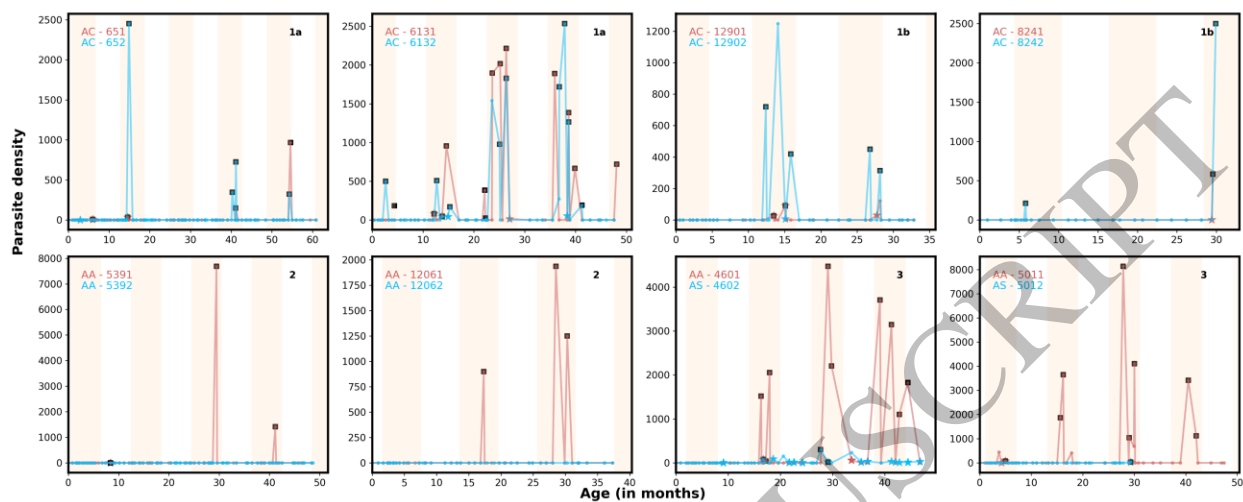
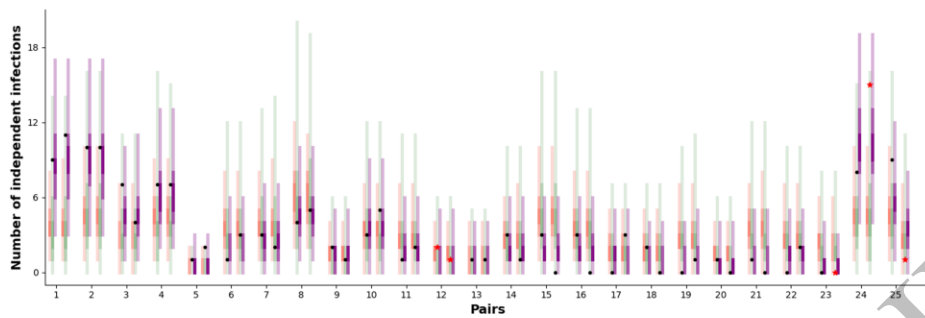


Figure 1  
165x93 mm (2.5 x DPI)

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A



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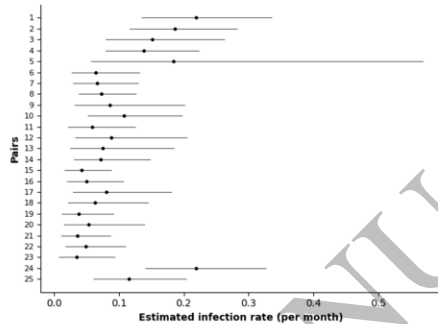


Figure 2  
165x93 mm (2.5 x DPI)

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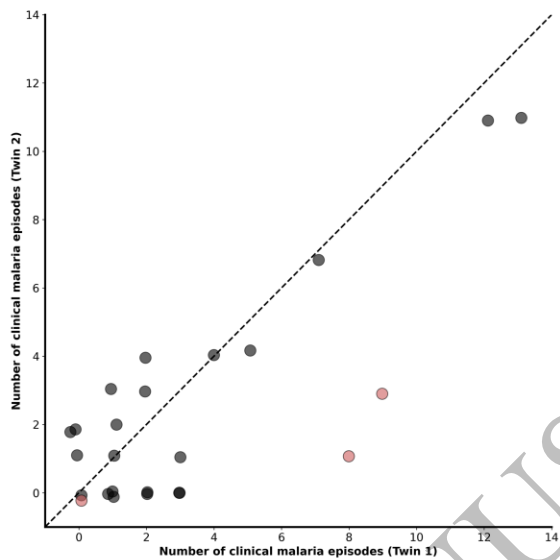


Figure 3  
165x93 mm (2.5 x DPI)

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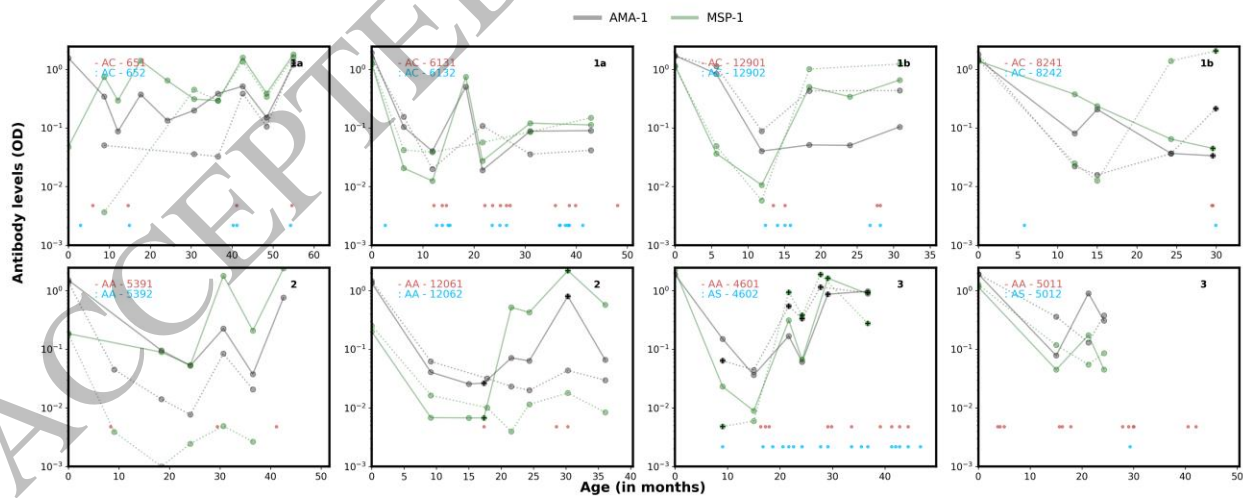


Figure 4  
165x93 mm (2.5 x DPI)

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