

1           **Tolerance of Gambian *Plasmodium falciparum* to Dihydroartemisinin and**  
2           **Lumefantrine detected by Ex vivo Parasite Survival Rate Assay (PSRA)**

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18   **Abstract**

19   Monitoring of *Plasmodium falciparum* sensitivity to antimalarial drugs in Africa is vital for  
20   malaria elimination. However, the commonly used *ex-vivo/in-vitro* IC<sub>50</sub> test is inconsistent for  
21   several antimalarials, while the alternative ring-stage survival assay (RSA) for artemisinin

22 derivatives has not been widely adopted. Here we applied an alternative two-colour flow-  
23 cytometry based parasite survival rate assay (PSRA) to detect *ex-vivo* antimalarial tolerance  
24 in *P. falciparum* isolates from The Gambia.

25 PSRA infers parasite viability from quantifying re-invasion of uninfected cells following 3  
26 consecutive days of drug exposure (10-fold the IC<sub>50</sub> drug concentration of field isolates). The  
27 drug survival rate for each isolate is obtained from the slope of the growth/death curve. We  
28 obtained PSRA of 41 isolates for DHA and LUM, out of 51 infections tested by RSA against  
29 DHA. We also determined the genotypes for known drug resistance genetic loci in *Pf dhfr*,  
30 *Pf dhps*, *Pf mdr*, *Pf crt* and *Pf k13* genes.

31 The PSRA for 41 Gambian isolates showed faster killing and lower variance by DHA  
32 compared to LUM, despite a strong correlation between both drugs. Four and three isolates  
33 were respectively tolerant to DHA and LUM, with continuous growth during drug exposure.  
34 Isolates with the PfMDR1-Y184F mutant variant had increased LUM survival though this  
35 was not statistically significant. Sulphadoxine/Pyrimethamine (SP) resistance markers were  
36 fixed, while all other antimalarial variants were prevalent in more than 50% of the  
37 population.

38 The PSRA detected *ex-vivo* antimalarial tolerance in Gambian *P. falciparum*. This calls for  
39 its wider application and increased vigilance against resistance to ACTs in this population.

#### 40 **Introduction**

41 There has been a substantial decline in malaria morbidity and mortality in sub-Saharan Africa  
42 over the past decade <sup>1</sup>. This was mainly driven by the scale-up of control interventions such  
43 as long-lasting insecticidal nets and clinical case management with artemisinin-based  
44 combination therapy (ACT) <sup>1</sup>. Currently, ACTs are used in endemic countries for the

45 treatment of clinical malaria, for individual chemoprevention in mass treatment campaigns <sup>2</sup>.  
46 These interventions increase pressure on the parasites which could result in the emergence of  
47 resistance to both partner drugs and artemisinin-derivatives as confirmed in southeast Asia <sup>3,4</sup>  
48 and delayed parasite clearance reports in Africa <sup>5</sup>.

49 Currently, the WHO recommends regular efficacy testing of the locally used antimalarials in  
50 humans, complemented by *in-vitro* (laboratory-based) assessment of parasite growth in  
51 response to drug exposure <sup>6</sup>. Comparing the *in-vitro* efficacy of ACTs is complex as the  
52 components have different mechanisms of action <sup>5</sup>. Moreover, most of the existing drug  
53 susceptibility assays were developed when treatment was based on monotherapies <sup>7,8</sup>. The  
54 most common assays are based on the IC<sub>50</sub>; drug concentrations required to inhibit parasite  
55 growth by half, under a set of experimental conditions <sup>9,10</sup>. This approach is sensitive to  
56 variations in drug concentrations used and inconsistency in data analysis <sup>11</sup>. IC<sub>50</sub> assays also  
57 do not assess the temporal course of parasite viability following exposure, and are not suited  
58 for artemisinin derivatives with characteristically shorter half-lives <sup>9</sup>.

59 New *in-vitro* methods assessing the efficacy of fast-acting drugs such as the Ring-stage  
60 Survival Assay (RSA) <sup>12</sup>, Piperaquine survival assay (PSA) <sup>13</sup> and Parasite Viability Fast  
61 Assay (PVFA) <sup>14</sup> are now available. RSA and PSA determine parasite survival following  
62 drug exposure and withdrawal, while the PVFA aims at discriminating fast-acting anti-  
63 malarial drugs by assessing parasite killing kinetics over time. There are still critical gaps in  
64 these assays; RSA was designed solely for fast-acting drugs and therefore cannot be used for  
65 slow-acting antimalarials with longer half-lives <sup>15</sup>. The PVFA has only been used in  
66 antimalarial development for screening candidate drugs.

67 Besides *in-vitro* assessment of drugs, molecular surveillance is recommended to monitor the  
68 emergence and spread of resistance by determining the proportion of isolates in a given

69 population with resistance associated alleles <sup>16,17</sup>. While the Kelch-13 molecular markers of  
70 artemisinin resistance have not been identified in sSA <sup>18</sup>, resistant alleles in PfCRT and  
71 PfMDR1 for both current and previously used drugs, including partners in ACTs, are in  
72 circulation <sup>19</sup>. For instance, the use of lumefantrine in the ACT artemether-lumefantrine (AL)  
73 has been associated with an increase in copy numbers, the frequency of N86 allele, and the  
74 N86/184F/D1246 haplotype of PfMDR1 <sup>20-25</sup>. Additionally, Sulphadoxine/Pyrimethamine  
75 (SP) used in seasonal malaria chemoprevention (SMC) and intermittent preventive treatment  
76 in pregnancy (IPTp) select for mutant PfDHFR and PfDHPS alleles <sup>26</sup>. Combining molecular  
77 surveillance with *in-vitro* surveillance can therefore provide an early warning signal on the  
78 emergence of drug tolerant parasites. This is critical for a parasite population that is exposed  
79 to substantial pressure by drug and vector control interventions such as in The Gambia, where  
80 malaria transmission and prevalence are low to very low. The Gambia together with  
81 neighbouring Senegal is driving for malaria elimination by deploying SMC, while mass drug  
82 treatments with ACTs are being contemplated.

83 Therefore, the goal of this study was to evaluate a Parasite Survival-Rate Assay (PSRA) to  
84 estimate *ex-vivo* drug sensitivity of *P. falciparum* from The Gambia to the currently used  
85 ACT (AL). The PSRA mimics 3 days of exposure to an ACT, measuring parasite survival  
86 rates over this period. The assay assesses the survival and re-invasion potential of parasites  
87 following exposure to lumefantrine (LUM) and dihydroartemisinin (DHA); prototypes of  
88 slow- and fast-acting components of ACTs used in most endemic countries. The approach  
89 offers significant advantages over the standard IC<sub>50</sub> determination assay due to its higher  
90 sensitivity in measuring parasite viability based on the production of invasive merozoites  
91 after drug exposure; an index of susceptibility or drug tolerability.

## 92 **Materials and Methods**

93 **Sample collection**

94 Ethical clearance for this study was obtained from the Gambia Government/MRCG Joint  
95 Ethics committee and further approved by the Gambian Ministry of Health. The study was  
96 conducted as part of a therapeutic efficacy study (TES) of AL in collaboration with the  
97 National Malaria Control Programme (NMCP) at the Brikama Health Centre (Western  
98 Gambia) in 2017. Patients were included in the study following diagnosis of *P. falciparum*  
99 infection with a parasite density of at least 1000/ $\mu$ L. An informed consent or assent was  
100 obtained from eligible patients. Two millilitres of venous blood samples were collected at  
101 day 0 of the TES into EDTA tubes and blood spots made on Whatman filter papers  
102 (Scientific Laboratory Supplies). Filter papers were air dried and stored in sealed sample bags  
103 with silica gel desiccants. Samples were transported on ice to the MRCG at LSHTM culture  
104 facility and processed within 4 hours of collection.

105 **Parasite processing for drug assays**

106 Thin blood smears were made for all samples to identify parasite lifecycle stages. For each  
107 sample, 50  $\mu$ L was used to estimate parasite density using a C6 flow cytometer (BD  
108 Accuri™, BD Biosciences) after DNA staining with SYBR Green I DNA intercalating dye  
109 (Applied Biosystems). To eliminate white blood cell populations from the analysis, gating  
110 was done on the red blood cell (RBC) population only using forward and side scatter  
111 parameters followed by gating of the SYBR green 1 positive population which effectively  
112 delineates parasitized RBCs. Plasma was separated from blood cells following centrifugation  
113 for 5 minutes at 1500 rpm. An equal volume of incomplete media (RPMI 1640 (Sigma-  
114 Aldrich, UK) supplemented with 35 mM HEPES (Sigma, St. Louis, MO), 24 mM NaHCO<sub>3</sub>,  
115 1 mg/l of hypoxanthine (Sigma), 5 $\mu$ g/ml of gentamicin (Gibco-BRL)) was added to the cell  
116 pellet and layered on 6 ml of lymphoprep (Axis-Shield, UK). The layered sample was

117 centrifugated for 20 minutes at 2,500 rpm and leukocytes aspirated. The RBCs were washed  
118 thrice by re-suspending the pellet in incomplete media and centrifugated for 5 minutes at  
119 1,500 rpm. The washed pellet was re-suspended in growth medium: incomplete medium with  
120 0.5% Albumax (Gibco-BRL). The parasitemia was normalized to 0.5% (1000 parasites /  $\mu\text{L}$ )  
121 for all samples with parasitemia higher than 0.5% and 2% haematocrit using uninfected O<sup>+</sup>  
122 heterologous RBCs prior to PSRA and RSA. Four laboratory adapted strains were used as  
123 internal controls: 3D7, Dd2 and MRA-1239 which are sensitive to both LUM and DHA, and  
124 MRA-1241 which is sensitive to LUM but resistant to DHA. The isolates were routinely  
125 cultured with fresh O<sup>+</sup> RBCs and maintained at 2% haematocrit with growth media under  
126 standard incubation conditions of 37°C, 90% N<sub>2</sub>, 5% O<sub>2</sub>, and 5% CO<sub>2</sub>. All laboratory adapted  
127 strains were synchronized twice with 5% D- sorbitol to obtain  $\geq 80\%$  ring stages prior to  
128 assay set-up. One hundred and seventy samples were obtained from Brikama Health Centre  
129 in 2017.

### 130 **Parasite Survival Rate Assay (PSRA)**

131 The parasite survival rate assay is based on re-invasion of surface labelled uninfected O<sup>+</sup>  
132 RBCs (uRBC) by merozoites emerging from ruptured schizonts that developed after drug  
133 exposure of infected samples. This was a modification of the protocol described <sup>14</sup>. Here,  
134 target uRBCs were pre-labelled with the amine-reactive fluorescent dye:7-hydroxy-9H-(1,3-  
135 dichloro-9, 9-dimethylacridin-2-one) succinimidyl ester (DDAO-SE; 10  $\mu\text{M}$ ; Invitrogen); a  
136 far-red cell dye as described <sup>27</sup>. A 2% haematocrit suspension of the uRBCs in incomplete  
137 media with 10  $\mu\text{M}$  DDAO-SE was made and incubated at 37°C for 2 hours while shaking.  
138 The suspension was washed once, re-suspended with incomplete media and re-incubated for  
139 a further 30 minutes. DDAO-SE labelled uRBC suspension: uRBC<sup>DDAO-SE</sup> were washed and  
140 reconstituted with growth media for a final haematocrit of 2%.

141 PSRAs were set up using laboratory isolates of  $\geq 80\%$  rings (*in vitro*) and field isolates  
142 within 4 hours of sample collection (*ex vivo*). The assay were done in triplicate for sensitivity  
143 to concentrations that were 10-fold higher than the median  $IC_{50}$  of the respective drugs  
144 determined in a previous study <sup>19</sup>. Briefly, 100  $\mu$ L of parasite suspension at 0.5% parasitemia  
145 and 4% hematocrit was added to 48-well microtiter plates pre-coated with 100  $\mu$ L of the  
146 respective drugs at twice the target concentration [(10-fold median  $IC_{50}$ ) x 2]. This resulted in  
147 a final drug concentration of 10-fold median  $IC_{50}$  of DHA (8.1 nM) and LUM (398 nM) at  
148 2% haematocrit. A no-drug control, substituted with 0.1% dimethyl sulfoxide: DMSO  
149 (Sigma-Aldrich, UK) was assayed for each sample. The samples in the microtiter plates were  
150 incubated for 24-, 48- and 72- hours respectively using standard incubation conditions. Drugs  
151 were refreshed every 24 hours after washing cells by incubating twice for 5 minutes with  
152 incomplete media. Fifty microliters of the drug-free suspension was transferred to a fresh 96-  
153 well microtiter plate containing 100  $\mu$ L of uRBC<sup>DDAO-SE</sup> (1 in 3 dilution) which was further  
154 incubated for 48 hours (Figure 1).

155 Each sample was then washed and counterstained with 1:10,000 dilution of SYBR Green I in  
156 phosphate buffered saline (PBS). For this, 100  $\mu$ L of diluted stain solution was added to each  
157 assay well of the microtiter plate and incubated in the dark at room temperature with shaking  
158 for 20 minutes. Stained cells were washed twice and re-suspended with 200  $\mu$ L of PBS. A  
159 further 1 in 4 dilutions with PBS was done prior to flow cytometric counting using BD  
160 Accuri<sup>TM</sup> C6 flow cytometer. For acquisition, the fluorescence emission peak for SYBR  
161 Green I and DDAO-SE were set at 520nm and 657nm for the green and red channels  
162 respectively. For each assay well, 100,000 events were acquired, and data analysed using the  
163 BD Accuri<sup>TM</sup> C6 software.

164 **Ring-stage survival assay (RSA)**

165 A modification of the RSA protocol<sup>12,28</sup> was carried out to assess the re-invasion potential of  
166 parasites exposed to 700nM of DHA, replacing microscopy with two-colour flow cytometry  
167 similar to the PSRA protocol above. Leukocyte depleted infected RBCs (iRBCs) were set up  
168 in duplicates at 0.5% parasitemia and 2% hematocrit. Each isolate was exposed to 700 nM of  
169 DHA and 0.1% DMSO as control for exactly 6 hours under standard incubation conditions.  
170 DHA and DMSO were then washed off using incomplete media and parasites re-suspended  
171 with drug-free growth media. Fifty microliters of this suspension was added to 100  $\mu$ L  
172 uRBC<sup>DDAO-SE</sup> in a separate 96-well microtiter plate and both plates incubated for a further 66  
173 hours. Thin blood smears were then made and stained with Giemsa following the standard  
174 RSA protocol. Ring-stage survival rates were determined microscopically using the initial  
175 parasitemia before drug exposure (initial parasitemia: INI), DMSO control (non-exposed:  
176 NE) and DHA-exposed (DHA). Ring-stage survival was calculated for isolates with growth  
177 rate of  $\geq 1\%$  using the published formula:  
178 Percentage survival (%) = (DHA/NE) x 100  
179 The cells incubated with uRBC<sup>DDAO-SE</sup> were counterstained as above with SYBR Green I and  
180 acquired using BD Accuri<sup>TM</sup> C6 flow cytometer to determine parasite re-invasion rates.

### 181 **Genotyping of selected drug resistance loci**

182 Genotyping was done by locus specific high-resolution melt (HRM) assays with parasite  
183 DNA extracted from filter paper dried blood spots (DBS). To recover parasite DNA, DBS  
184 were punched onto 96-deep well plates, using punchers and forceps that were rinsed in 1%  
185 bleach and alpha-Q water after each sample to limit cross-contamination. For each plate, 4  
186 negative and 4 positive controls were included. Genomic DNA was manually extracted using  
187 the QIAamp® 96 DNA Blood Kit (Qiagen, Hilden, Germany) with manufacturer's  
188 instructions. The DNA concentration of the eluates were quantified using a Nanodrop 1000

189 (Thermo Scientific) and stored at  $-20^{\circ}\text{C}$  until use. One micromolar of gDNA of  
190 approximately 10pg-1ng/uL, was used for genotyping assays. HRM genotyping reactions  
191 were performed for the following alleles: *pfert* C72/M74/N75/K76, *pfmdr1* N86, *pfmdr1*  
192 Y184, *pfdhps* S436/A437, *pfdhfr* N51/C59 and *pfk13* C580 on the LightCycler® 96 Real-  
193 Time PCR System (Roche). The primers and probes used for PCR reactions with 2.5X  
194 LightScanner master-mix (Biofire) were as previously described<sup>29</sup>. Each reaction had a final  
195 forward and reverse primer concentration of 0.05  $\mu\text{M}$  and 0.2  $\mu\text{M}$  respectively (asymmetric  
196 PCR) and 0.2  $\mu\text{M}$  for allele specific probes. The PCR conditions and analysis method used  
197 are as previously described<sup>29</sup>.

#### 198 **Statistical analysis of drug survival rates**

199 The analysis aimed mainly at evaluating the effect of drug exposure from the magnitude of  
200 decline in growth by re-invasion with time of exposure compared to drug free controls, i.e.  
201 LUM Vs no-drug and DHA Vs no-drug. We also aimed to explore patterns of variation in  
202 response to drug exposure between isolates. To first assess the effect of time of exposure on  
203 survival (growth), the re-invasion rates were log-transformed for normality and these values  
204 were used for descriptive statistics on responses at each time-point. Linear mixed effect  
205 models were then fitted to examine the heterogeneity in drug susceptibility allowing for  
206 interaction between time and drug treatment group (LUM or DHA) with random effects on  
207 subjects. Since there were three discrete time points of measurement, an indication of  
208 potential non-linear relationship between treatment response and time, we used time as  
209 categorical variable comparing differences in effect of treatment for 48- and 72- hours against  
210 24 hours as reference. As such we could examine the effect of longer exposure. To explore  
211 the difference in susceptibility to each drug per isolate, we first obtained the drug effect from  
212 the difference between drug exposed and no-drug control at each time point. We then fitted a

213 linear trend across timepoints for each isolate, deriving patterns of individual growth decay  
214 slopes. These estimated slopes represent individual parasite survival (or death) rates. Based  
215 on the derived decay patterns (individual trajectories), an isolate was assigned to one of the  
216 four classes: linear decrease (---), linear increase (+++), non-linear increase/decrease (++)  
217 and non-linear decrease/increase (-+-). In addition, we assessed the relationship between  
218 individual trajectories and their corresponding genotypes. All analyses were performed using  
219 the R package (RStudio version 1.2.5001) and Stata 14 (StataCorp, College Station, TX,  
220 USA). A *P* value of <0.05 was considered significant. Other plots were explored using Prism  
221 (GraphPad Prism version 7.0a).

## 222 **Results**

223 *Plasmodium falciparum* isolates collected from patients with uncomplicated malaria cases  
224 recruited across the malaria transmission season in 2017 from Western Gambia were  
225 analysed. A total of 79 out of 170 (46.5%) isolates had a parasitemia of  $\geq 0.5\%$  and these  
226 were set up for both PSRA and RSA assays. Analysis data was obtained for 41 (52%) and 51  
227 (64.6%) samples which had a drug free *ex vivo* growth rate of  $\geq 1\%$  for PSRA and RSA  
228 respectively. Apart from the field isolates used in this study, the PSRA was tested against a  
229 panel of previously characterized isolates, including an artemisinin resistant parasite line:  
230 MR4-1241 with the K13 I543T mutation.

### 231 **Ring stage survival rates of field isolates by Microscopy and Flow cytometry**

232 Ring stage survival rates of 51 isolates were determined using conventional microscopy as  
233 per the initial RSA protocol<sup>12</sup> and modified using uRBC<sup>DDAO-SE</sup> and SYBR Green I for flow  
234 cytometric analysis. Following pulse exposure to DHA, 31 isolates (61%) had surviving  
235 parasites observed by microscopy, ranging from 0.05 to 1.2% (Figure 2a). Flow cytometric

236 counting of re-invasion in pre-labelled uRBCs was more sensitive, showing all isolates to  
237 have post-drug exposure survival ranging from 0.14 to 1.53%. The mean survival rates  
238 determined by flow cytometric analysis was statistically higher than microscopy ( $P < 0.0001$ ).  
239 Despite this, there was a strong positive correlation between the two analysis methods, with  
240  $R = 0.83$  and  $p = 2.7 \times 10^{-14}$  (Figure 2b). However, isolates with the highest ring survival rates  
241 by flow cytometry were not the same observed by microscopy. Based on flow cytometry  
242 only, % ring survival after 6 hours of exposure to 700nM of DHA significantly correlated  
243 with parasite survival rates following PSRA analysis ( $R = 0.53$ ,  $p = 0.00038$ ), (figure 2c).  
244 Overall, the median cumulative rates of survival over the 72 hours of exposure was not  
245 significantly different between DHA (-0.051 to 0.029) and LUM (-0.048 to 0.037), ( $p = 0.35$ )  
246 though the responses to LUM had a wider distribution (Figure 2d).

#### 247 ***P. falciparum* ex-vivo survival decreases with longer drug exposure**

248 By comparing log of survival rates between isolates with different durations of drug  
249 exposure, the overall survival declined with increased exposure time for both drugs. Whereas,  
250 there was an increasing growth trend in the drug-free group over time (Figure 3). The mean  
251 differences between treatment and control groups was always significant and increased with  
252 time as treatment groups appeared to show a marked decline in predicted survival particularly  
253 after 72 hours (Supplementary figure 1). Pairwise comparison between the drug-treated  
254 groups against drug-free group showed significant differences at all three timepoints (Table  
255 1). Using 24 hours as the reference, differences in predicted responses were seen for both  
256 DHA and LUM at 72 hours post drug exposure. At 48 hours, the differences in predicted  
257 responses were not statistically significant when compared to 24 hours. This could be due to  
258 the exponential increase in merozoite infected RBCs following a complete *P. falciparum*

259 growth cycle<sup>30</sup>, potentially resulting to the high responses seen at 48 hours in the control  
260 group (Figure 3c).

### 261 **Distribution of PSRA sensitivities to AL**

262 We derived individual responses to each drug from fitting a linear model on the differences in  
263 predicted responses between the drug treated and control with time. These *ex vivo* parasite  
264 survival rates ranged from -0.051 – 0.029 for DHA and from -0.048 – 0.037 for LUM. The  
265 majority of isolates had a negative slope with consistently reducing survival with time  
266 (Figure 3a and 3b). This was seen for 30 isolates for DHA and 35 for LUM representing  
267 73% and 85% of isolates treated respectively. Conversely, 27% (11/41) and 15% (6/41) had a  
268 net increase in growth despite 72 hours of exposure to DHA and LUM, with similar or higher  
269 predicted responses under drug conditions compared to the controls with DMSO (Figure 3a  
270 and 3b, Supplementary figure 2a and 2b). The overall response and rates of growth decline  
271 was higher for DHA compared to LUM (Figure 3c). However, the survival rates between  
272 DHA and LUM showed a strong positive correlation ( $R = 0.77$ ,  $p = 5.4e-09$ ), (Figure 3d).

### 273 **Consistent clusters of survival rate patterns to both DHA and LUM**

274 We identified four patterns of responses based on the growth vs time curve for both drugs  
275 (Figure 4a and 4b). The most common pattern was a continuous decline in survival with  
276 increase in time of exposure. This first group of isolates defined as linear decrease  
277 (designated as “---” on figure 4) represented 46 % (19/41) and 51% (21/41) of isolates tested  
278 against DHA and LUM respectively. The second group of isolates had a peak in growth at 48  
279 hours of drug exposure (“-+-”) and these represented 19.5% (8/41) and 22% (9/41) of isolates  
280 tested. The third group were isolates with consistently linear increase (“+++”) despite drug  
281 exposure, with 9.75% (4/41) and 7.3% (3/41) identified for DHA and LUM, and the fourth  
282 pattern were isolates with the lowest survival timepoint at 48 hours (“+-+”) representing 24%

283 (10/41) and 20% (8/41) of isolates. These patterns did not correlate with initial parasitemia  
284 (Supplementary figure 4) or other patient demographic information.

### 285 **Frequencies of drug resistance alleles in western Gambia**

286 We obtained genotypes for at least 39 isolates for *pfcr1* C72/M74/N75/K76, *pfmdr1* N86,  
287 *pfmdr1* Y184, *pfdhps* S436/A437, *pfdhfr* N51/C59 and *pfk13* C580 (Table 2, Figure 5). The  
288 *pfcr1* mutant haplotype was found in 79% of isolates with 2% of mixed infections. 93% of  
289 isolates were wildtype for *pfmdr1* N86 and 5% mixed, while 57% were mutant for *pfmdr1*  
290 Y184 and 12% mixed. For antifolate markers, 90% of isolates had mutant variants at *pfdhps*  
291 S436/A437 while all isolates were mutated for *pfdhfr* N51/C59. We excluded the analysis for  
292 the *pfdhfr* alleles: IT/NC as the scoring of the melting curves were ambiguous, showing up to  
293 55% of mixed allele calls. *PfK13* C580 was wildtype for all isolates. Given the almost fixed  
294 frequencies of either wildtype or mutant at these loci tested, no association with the PSRA  
295 patterns could be determined. However, for *pfmdr1* codon 184, higher LUM responses were  
296 observed for isolates with the 184F mutant allele though the mean differences were not  
297 significant between these and isolates with Y184 wildtype variant (Figure 5c.ii).

### 298 **Discussion**

299 This study describes the *ex vivo* susceptibility rates of natural isolates from the Gambia,  
300 where transmission has declined, and we had seen increasing *ex-vivo* tolerance to  
301 Lumefantrine by IC<sub>50</sub> as well as modest survival rates (26%) to DHA by ring-stage survival  
302 assay (RSA). These rates were obtained against DHA and LUM with a flow cytometry-based  
303 parasite survival rate assay (PSRA), with potential application to other drugs and antimalarial  
304 candidates. The potency of these drugs depend on the drug concentrations used and the length  
305 of exposure, with the assumption that cytotoxicity occurs when parasites are exposed to the

306 active component of the drug for a prolonged time <sup>31</sup>. Here, we used drug concentrations that  
307 are 10- fold higher than the median IC<sub>50</sub> of the respective drugs obtained from the assessment  
308 of field isolates from western Gambia in 2015 <sup>19</sup>. The use of 10-fold higher drug  
309 concentrations, though much lower than serum concentrations, proved to be the optimal  
310 concentration to determine the rate of kill of slow, medium and fast acting drugs. This  
311 concentration is sub-optimal, allowing for gradual effect of the drugs on the parasites <sup>32</sup>.

312 The PSRA provided several advantages over the IC<sub>50</sub> and RSA assays; it determines the  
313 effect of drugs over 72 hours of exposure and measures both parasite growth and viability by  
314 determining re-invasion even at low parasite densities. Unlike RSA, there is no requirement  
315 for assaying early rings which can be difficult to ascertain for natural isolates from malaria  
316 patients, thereby eliminating the need for further stressing isolates by synchronizing them  
317 with sorbitol. Similar to the *in vivo* parasite clearance rate for determining the efficacy of  
318 artemisinin derivatives <sup>33</sup>, the PSRA determines clearance rates from the rate of *ex vivo*  
319 inhibition of growth over 72 hours of drug exposure. This duration of exposure allows rings  
320 that emerge from tolerant isolates over the first cycle (48 hours) to experience another round  
321 of drug exposure for 24 hours, followed by recovery in drug free medium. The overall  
322 outcome is the kinetics of parasite killing by the test drug over 72 hours. This assay is  
323 therefore a variant of the PVFA <sup>14,32</sup>. Like PVFA, the PSRA does not assess parasite  
324 metabolic activity or other parasite molecules to quantify survival or death indirectly <sup>14</sup>. It  
325 quantifies viability from a direct count of viable merozoites that emerge from drug-exposed  
326 schizonts and invade pre-stained uninfected RBCs: uRBC<sup>DDAO-SE</sup>. Flow cytometry provided  
327 increased sensitivity by individually counting cells and distinguishing new autologous and  
328 heterologous infected cells. With a 2 to 1 ratio of RBC<sup>DDAO-SE</sup> to non-labelled RBCs, higher  
329 numbers of pre-labelled RBCs are present, skewing re-invasion to occur in these cells. As  
330 merozoites emerge after drug exposure, active re-invasion is proof of viability. This gives a

331 good estimate of the number of parasites that survive following drug exposure. The rate of  
332 death is therefore intrinsic to the level of drug tolerance by each isolate. Autologous re-  
333 invasion of unlabelled RBCs are excluded from the analysis as they cannot be differentiated  
334 from dead and arrested cells. Unlike RSA, the PSRA uses a much lower concentration of  
335 drug but potent enough to kill isolates and to induce the delayed clearance phenotype in RSA  
336 control isolate (MRA-1241). Hence, there was a high positive correlation between PSRA and  
337 flow-cytometry modified RSA. With strong correlation with microscopy but improved  
338 throughput, flow cytometry-based RSA and PSRA should allow for robust detection of  
339 emerging drug tolerance in natural isolates. Future and wider application of this method is  
340 warranted in Africa where drug pressure is substantial. This is the case for The Gambia  
341 where the artemisinin-based combination therapy AL is used as first line treatment and other  
342 ACTs are being considered for mass administration after several clinical trials.

343 Most of the isolates tested by PSRA in The Gambia had decreasing parasite survival with  
344 increasing days of exposure to drugs. However, four isolates exposed to DHA and three to  
345 LUM continued to grow and were considered potentially tolerant with one isolate surviving  
346 in the presence of both drugs. More isolates would have been classified as tolerant if all those  
347 that showed a rebound of growth at 72 hours were included. These suggest a state of reduced  
348 drug sensitivity, allowing parasite growth and re-invasion to occur in the presence of sub-  
349 lethal drug concentrations<sup>34</sup>. The six surviving isolates could be on a path towards a  
350 persistent state of drug insensitivity that may result in resistance<sup>35</sup> and should be closely  
351 monitored. Extending the assay time to 96 hours could also reveal clearer response profiles  
352 for the isolates with non-linear responses over the 72-hour period. Importantly, the weak  
353 correlation between initial patient parasitemia and parasite response suggests that the  
354 responses seen are not driven by the rate at which parasites grew in the patient (*in vivo*). Most  
355 isolates had similar response patterns for both drugs and their survival rates correlated

356 positively. This could be an indication of common mechanisms that enable survival to several  
357 drugs, a factor that could lead to multidrug resistance. Multidrug resistance to artemisinin  
358 derivatives and partners has been confirmed in South East Asia <sup>36</sup>. We have already shown in  
359 The Gambia a consistent increase of LUM tolerance between 2012 and 2015 <sup>19</sup>. In the same  
360 study, 26% of the isolate in the 2015 population from western Gambia showed viable  
361 parasites by microscopy-based RSA for DHA. The presence of surviving parasites in this  
362 current study though at different proportions with both assays, suggests sustained low level of  
363 DHA tolerance and requires further investigation. These parasites survived and replicated in  
364 high concentration and prolonged length of DHA pressure with RSA and PSRA respectively.  
365 Malaria transmission in western Gambia has reduced drastically in the last decade, with  
366 prevalence of infection lower than 5% overall and 1% for children under 5 years of age.  
367 Despite this, various ACTs remain widely available and accessible through private and public  
368 vendors. While it is officially required that ACTs should be prescribed only upon a positive  
369 malaria diagnosis, this is hardly sustained given regular short supplies of Rapid Diagnostic  
370 Test kits. We can therefore speculate that the emergence of tolerant parasites is being driven  
371 by high drug pressure against low transmission which is hypothesized to be one of the main  
372 drivers in the emergence of antimalarial drug resistance in South East Asia. This calls for  
373 improved vigilance across Africa as elimination programs are implemented. ACT resistance  
374 has been shown to emerge on a backbone of known drug resistance including *Pfmdr1* and  
375 *Pfcr1* selected by LUM. The WHO recommends surveillance for known and emerging  
376 markers of resistance in natural populations.

377 We genotyped the isolates assayed for alleles at *Pfmdr1*, *Pfcr1*, *Pfdhfr*, *Pfdhps* and *Pfk13* loci  
378 that have been implicated in quinoline, antifolate or artemisinin resistance. We found high  
379 levels of resistance loci against the antifolates, an expected result given the use of SP by  
380 SMC and IPTp. We also found high levels of *Pfmdr1* N86, the wild type allele selected by

381 LUM, a result aligning with what we had shown before for this population <sup>19</sup>. On the  
382 contrary, the *Pfcr* 72-76 mutant haplotype was in over 80% of isolates, indicating continuous  
383 selection by chloroquine. Chloroquine had been withdrawn for treatment of malaria raising  
384 the question as to which drugs are driving selection at *Pfcr* but not *Pfmdr1* <sup>37</sup>. Selection of  
385 *Pfcr* may be driven by amodiaquine which is available in combination with artesunate  
386 accessible from private vendors in The Gambia and is the ACT of choice in neighbouring  
387 Senegal with whom there is significant human migration. We expect to gain more insights on  
388 this considering current extensive temporal and spatial genome sequencing for these parasite  
389 population. With the high levels of mutant or wild alleles at drug resistant genes, an analysis  
390 of genetic association for the four different parasite PSRA profiles was not possible.  
391 However, higher survival rates against lumefantrine were seen for isolates with the mutant  
392 variant at *Pfmdr1* 184F though this was not significantly different from the distribution of  
393 rates in isolates with wild alleles. We assume that the responses observed for samples  
394 carrying multiple strains is a combined effect of the different strains present and the six  
395 isolates that survived following exposure to either of the two drugs have specific molecular  
396 signatures influencing their phenotypes which should be further investigated. Despite the  
397 number of isolates showing growth after 72 hours of exposure to DHA, no mutant alleles of  
398 *Pfk13* C580 were found in the population. Artemisinin associated Kelch13 variants are rare in  
399 African populations but high frequencies of other non-synonymous SNPs on *Pfk13* (kelch  
400 propeller domain) had been observed for isolates from The Gambia <sup>38</sup>. These further  
401 buttresses the need for routine and in-depth surveillance of this population.

402 This study highlights early signs of *ex-vivo* drug tolerance of parasites from western Gambia  
403 to the most common ACT components. These were derived by PSRA which provides a  
404 significant advancement in approaches for the determination of parasite susceptibility. A  
405 wider application of this approach across sSA to distinguish drug tolerance and resistance

406 will support current and future chemoprevention and chemotherapeutic strategies against  
407 malaria.

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542 falciparum K13-Propeller Polymorphisms. *N. Engl. J. Med.* 374, 2453–2464.
- 543
- 544 **Table 1.** Effect of drug exposure on predicted responses of the treatment groups (DHA,  
545 LUM, DMSO-control) and exposure times (24-, 48- and 72- hours) for *P. falciparum* isolates  
546 analysed by PSRA.

Treatment groups	Difference (95%CI)	P value
(DHA vs Control) 24h	-0.68 (-0.90, -0.47)	<0.0001
(DHA vs Control) 48h	-1.03(-1.25, -0.81)	<0.0001
(DHA vs Control) 72h	-1.20 (-1.42, -0.99)	<0.0001
(LUM vs Control) 24h	-0.31 (-0.52, -0.09)	0.005
(LUM vs Control) 48h	-0.62(-0.84, -0.41)	<0.0001

Gene	Alleles	Codons	Frequency
(LUM vs Control) 72h		-0.99 (-1.21, -0.77)	<b>&lt;0.0001</b>
(48h vs 24h) Control		0.25 (0.01, 0.48)	<b>0.04</b>
(48h vs 24h) DHA		-0.10 (-0.33, 0.13)	0.39
(48h vs 24h) LUM		0.07 (-0.30, 0.16)	0.57
(72h vs 24h) Control		0.14 (-0.13, 0.42)	0.31
(72h vs 24h) DHA		-0.38 (-0.65, -0.10)	<b>0.007</b>
(72h vs 24h) LUM		-0.54 (-0.81, -0.27)	<b>0.0001</b>

\*24h = 24 hours; 48h = 48 hours; 72h = 72 hours; DHA = Dihydroartemisinin

treatment; LUM = Lumefantrine treatment; Control: DMSO treatment.

Values in bold are significant P values determined by pairwise comparisons

547 **Table 2.** Allele frequencies of drug resistance genes for 41 parasite isolates with drug  
548 phenotypic data (PSRA and RSA).

<i>pfcr1</i>	C72, M74, N75, K76	CMNK (wildtype)	0.17
		CIET (mutant)	0.79
		CMNK/CIET (mixed)	0.02
<i>pfmdr1</i>	N86	N (wildtype)	0.93
		Y (mutant)	0
		N/Y (mixed)	0.05
	Y184	Y (wildtype)	0.29
		F (mutant)	0.57
		Y/F (mixed)	0.12
<i>pfdhps</i>	S436/A437	SA (wildtype)	0.02
		SG (mutant)	0.88
		FG (mutant)	0.02
		SA/SG (mixed)	0.05
		FG/SA/SG (mixed)	0.02
<i>Pfdhfr</i>	N51/C59	NC (wildtype)	0
		IR (mutant)	0.26
		IT/NC (mixed)	-
		IR/NR (mixed)	0.12
		NR/NC (mixed)	0.02

<i>pfk13</i>	C580	C (wildtype)	1
		Y (mutant)	0

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*pfcr1* = *P. falciparum* chloroquine resistance transporter; *pfmdr1* = *P. falciparum* multidrug resistance gene 1; *pfdhps* = *P. falciparum* dihydropteroate synthase; *pfdhfr* = *P. falciparum* dihydrofolate reductase; *pfk13* = *P. falciparum* kelch 13

549 **Figure 1.**

550 Schematic representation of *ex vivo* parasite survival rate assay. (1) iRBCs at 0.5%  
551 parasitemia and 2% haematocrit are incubated with 10-fold median IC<sub>50</sub>s of  
552 Dihydroartemisinin and Lumefantrine for 24-, 48- and 72-hour time-points. (2) uRBCs are  
553 labelled with the intracellular dye: DDAO-SE (uRBC<sup>DDAO-SE</sup>). (3) Drugs are washed off from  
554 step 1 every 24 hours, aliquots taken, and drugs replenished. (4) Post-exposure drug free  
555 aliquots are incubated with 2 x uRBC<sup>DDAO-SE</sup> for a further 48 hours. (5,6) These are then  
556 counterstained with SYBR Green I for flow cytometric analysis where 100,000 cells are  
557 acquired (7) and double positive stained cells analysed.

558 **Figure 2.** (a) Percentage ring survival of 51 isolates using conventional microscopy to assess  
559 viable parasites and flow cytometry to assess the number of re-invaded parasites following  
560 pulse exposure and withdrawal of DHA with RSA. Each point on the plot represents an  
561 isolate. The median survival rates of the isolates for each method are shown as the red broken  
562 lines. T-test statistics gave a *P* value of <0.0001 using Wilcoxon rank sum test. (b)  
563 Correlation analysis of percentage ring survival using flow cytometry and microscopy with a  
564 Pearson correlation coefficient of *R* = 0.83 and *p* = <0.0001 and (c) correlation analysis of  
565 percentage ring survival using RSA and parasite survival rates using PSRA analysis. Pearson

566 correlation coefficient gave an  $R$  value of 0.53 and a  $p$  value of 0.00036. (d) Distribution of  
567 the parasite survival rates of 41 isolates treated with DHA and LUM at 3 timepoints over 72  
568 hours with PSRA . Each point shows the rate at which each isolate survives following drug  
569 exposure with reference to DMSO-treated control. The red dotted lines are the median  
570 survival rates for both drug treatments with  $p = 0.35$ .  $P$  value of  $<0.05$  represents statistical  
571 significance. All *ex vivo* assays were performed in triplicates.

572 **Figure 3.** Individual trajectories of 41 isolates following exposure to (a) DHA and (b) LUM  
573 relative to DMSO treated control at 24-, 48-, and 72- hour timepoints. Linear mixed effect  
574 model was used, and a linear trend fitted for each isolate across timepoints. The blue and red  
575 dotted lines show the isolates with decreasing and increasing responses over time  
576 respectively. The thick blue and red lines represent the mean log response of isolates with  
577 decreasing and increasing responses respectively. (c) Mean predicted parasite responses of all  
578 isolates following exposure to DHA (red broken line), LUM (blue broken line) and DMSO  
579 control (grey broken line) with the SEM shown as bars. (d) Correlation between parasite  
580 survival rates of isolates treated with DHA and LUM with  $R = 0.77$  and  $p < 0.001$ . All *ex*  
581 *vivo* assays were performed in triplicates.

582 **Figure 4.** Grouped profiles of 41 isolates following exposure to DHA and LUM at 24, 48 and  
583 72 hours with PSRA. Each point in the individual plots represent the difference between the  
584 predicted response of the (a) DHA treated and control and (b) LUM treated and control. The  
585 connecting lines give an indication of the response pattern of each isolate. The isolates are  
586 grouped based on their response profiles. (i) linear decrease (---), (ii) non-linear decrease/  
587 increase (-+-), (iii) linear increase (+++), (iv) non-linear increase/decrease (+-+).

588 **Figure 5.** (a) Allele frequencies of 41 field isolates for the drug resistant genes: *pfert*  
589 *C72/M74/N75/K76*, *pfmdr1* N86, *pfmdr1* Y184, *pfdhps* S436/A437 and *pfk13* C580. Parasite

590 survival rates of (b) DHA and (c) LUM for isolates with wildtype, mutant and mixed alleles  
591 for *pfprt* C72/M74/N75/K76, *pfmdr1* Y184 and *pfdhps* S436/A437. Each point in the graphs  
592 represent the parasite survival rate of an isolate. The broken red lines indicate the median  
593 survival rates of the isolates with the same alleles.

#### 594 **List of abbreviations**

595	ACT	artemisinin combination therapy
596	AL	artemether lumefantrine
597	DBS	dried blood spots
598	DHA	dihydroartemisinin
599	DMSO	dimethyl sulfoxide
600	HRM	high resolution melting
601	IC <sub>50</sub>	50% inhibitory concentration
602	IPTp	intermittent preventive treatment in pregnancy
603	LUM	lumefantrine
604	PBS	phosphate buffered saline
605	PSA	piperaquine survival assay
606	PSRA	parasite survival rate assay
607	PVFA	parasite viability fast assay
608	RBC	red blood cells
609	iRBC	infected red blood cells
610	uRBC	uninfected red blood cells
611	RSA	ring-stage survival assay
612	SMC	seasonal malaria chemoprevention
613	SP	sulphadoxine/pyrimethamine

614 TES therapeutic efficacy study

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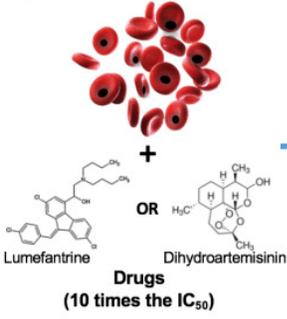
### 624 **Author Contributions**

625 HM and AAN conceived and designed the experiment. HM carried out the experiments. FB  
626 and FKJ assisted in validating the assay using laboratory adapted controls. ACJ contributed  
627 in sample preparation. BN contributed in microscopic analysis as the second reader and NIM  
628 supported all statistical analyses. JO was involved in the planning of the research. HM took  
629 the lead in writing the manuscript and ANN

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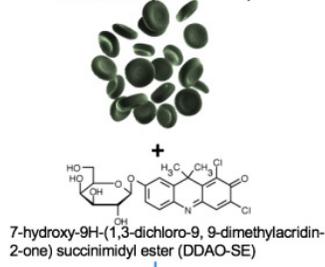
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1 *P. falciparum* ring stage culture at 0.5% parasitemia and 2% haematocrit



Incubate for 24h, 48h and 72h respectively

2 Label uninfected RBCs with DDAO-SE ( $RBC^{DDAO-SE}$ )



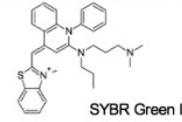
3 Wash drugs off

Take aliquots of isolates at 24h, 48h and 72h post drug exposure and replenish drugs

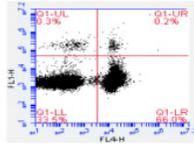
4 Incubate aliquots with 2x  $uRBC^{DDAO-SE}$  for 48 h



5 Stain cells with SYBR green I and incubate for 20 mins in the dark while shaking



6 Acquire 100,000 cells using the fluorescence emission peak for SYBR Green I and DDAO-SE



7 Parasite re-invasion = % of double positive cells (SYBR Green I and DDAO-SE)

