

1 **A validated bioluminescence-based assay for the rapid determination of the initial rate of**
2 **kill for discovery antimalarials.**

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13 Running title: Relative rate of kill for antimalarials

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15

16 **Abstract**

17 **Objectives:** A future treatment for uncomplicated malaria will contain at least one
18 component that exerts a rapid rate of kill (RoK). We describe here the validation and
19 application of a simple, robust and rapid bioluminescence-based assay for the
20 determination of the initial RoK in intraerythrocytic asexual stages of *Plasmodium*
21 *falciparum*.

22 **Methods:** A modification to the concentration-response bioluminescence (here termed
23 bioluminescence relative rate of kill, BRRoK) assay, utilizing exposure to fold-IC₅₀
24 concentrations (0.33x to 9x), is used to monitor the immediate cytotoxic effect of 372 open
25 source compounds for antimalarial drug discovery available through the Medicine for
26 Malaria Venture's Malaria Box.

27 **Results:** Antimalarial drugs that exert a rapid cytotoxic effect produce a concentration
28 dependent loss of bioluminescence signal that correlates with available *in vitro* and *in vivo*
29 estimates of parasite clearance time and parasite reduction ratio. Following the
30 measurement of IC₅₀ for the Malaria Box compounds in Dd2^{luc}, the BRRoK assay was used to
31 identify and rank 372 compounds for their initial cytotoxic activity. Fifty three compounds in
32 the Malaria Box show an initial relative RoK greater than that of chloroquine, with 17 of
33 these with an initial relative RoK greater than that of dihydroartemisinin.

34 **Conclusion:** The BRRoK assay provides a rapid assay format for the estimation of a key
35 pharmacodynamic property of antimalarial drug action. The simplicity and robustness of the

36 assay suggests it would be readily scalable for high throughput screening and a critical
37 decision-making tool for antimalarial drug development.

38 ***Keywords***

39 Malaria, rate of kill, pharmacodynamics, bioluminescence, drug screening, MMV Malaria

40 Box

41 **Introduction**

42 The past decade has seen, for the first time in generations, a decline in mortality and
43 morbidity from malaria, largely on account of the use of effective antimalarials and the
44 widespread coverage of insecticide-treated bed nets and other transmission preventative
45 measures.¹ However, the estimated number of deaths is still very high, estimated at 438,000
46 in 2015,² the majority of which are among African children under 5 years of age. In the same
47 period, the malaria parasite has assembled more counter measures than ever before to
48 overcome chemotherapy with some parts of the world reporting clinical failures to
49 artemisinin and artemisinin combination therapy (ACTs), the last effective antimalarial drug
50 class currently available.³⁻⁷ The need to develop new drugs with novel modes of action,
51 which circumvent current parasite resistance mechanisms, therefore remains an urgent
52 priority.^{8,9}

53 Towards this aim, in the past 5 years, the Medicines for Malaria Venture (MMV) has
54 coordinated the screening of more than 5 million compounds against *P. falciparum in vitro*.
55 This has generated nearly 30,000 compounds inhibiting in the submicromolar range.¹⁰⁻¹²
56 However, there is currently no clear and informed path to rationally triage the 20-30,000
57 hits that are now at our disposal. At best, the pharmaceutical and academic malaria
58 research communities will be able to progress 20-30 chemotypes down the traditional
59 discovery and development pathway within the next decade. Technology platforms able to
60 identify the most effective and tractable chemotypes for progression into the drug
61 development pipeline are therefore urgently needed. Key features of the sought-after next
62 generation antimalarial for the treatment of uncomplicated malaria, termed Single Exposure
63 Radical Cure and Prophylaxis (SERCaP), have been rationalized and have resulted in the

64 recommendation of a series of Target Candidate Profiles (TCPs) for the component parts of
65 this drug combination therapy. TCP-1 emphasises the requirement for a component part of
66 SERCaP to rapidly eliminate the initial parasite burden, ideally as fast as artesunate, but with
67 a minimal essential requirement to do so as fast as chloroquine.⁹

68 A current bottleneck in antimalarial discovery projects is that the current gold standard in
69 the determination of killing dynamics for new inhibitors is slow, necessitating between three
70 to four weeks of recrudescence parasite growth following drug exposure.¹³ To address this
71 bottleneck, we describe here the validation of a microplate-based bioluminescence assay
72 that provides, within 6 hours, a determination of a compound's initial cytocidal action.
73 Benchmarking these data against existing antimalarial compounds, for which rate of kill
74 (RoK) pharmacodynamics are known, provides a relative rate of initial kill and thus a means
75 to triage a compound's activity against the minimal essential and ideal criteria as TCP1
76 candidates. The utility of this rapid, simple and robust assay format is demonstrated in a
77 relative rate of kill screen of the MMV Malaria Box, an open access resource provided for
78 drug discovery in malaria and neglected tropical diseases.¹⁴ The MMV Malaria Box contains
79 400 compounds distilled from the initial large chemical screens performed by St. Jude
80 Children's Research Hospital, Novartis and GlaxoSmithKline.¹⁰⁻¹² These compounds reflect a
81 cross section of the chemical diversity available in the 20-30,000 hits, providing 200 starting
82 points for oral drug discovery (termed drug-like) and 200 compounds to explore malaria
83 parasite biology (termed probe-like). Our findings suggest this bioluminescence relative rate
84 of kill (BRRoK) assay provides the required throughput and discrimination necessary to assist
85 in the decision making process to prioritise leads in the 20-30,000 antimalarial compound
86 set for further development.

87

88 *Materials and methods*

89 **Drug stocks**

90 Antimalarial drugs were sourced from Sigma-Aldrich and prepared as follows: atovaquone
91 (ATQ, 10mM in dimethyl sulfoxide [DMSO]), artemether (ARM, 50mM in ethanol),
92 chloroquine (CQ, 100mM in deionised water), dihydroartemisinin (DHA, 50mM in
93 methanol), mefloquine (MQ, 50mM in DMSO) piperazine (PPQ, 100mM in ethanol),
94 pyronaridine (PYN, 100mM in deionised water), quinine (QN, 100mM in ethanol) and
95 tafenoquine (TFN, 100mM in DMSO) and stored at -20°C. The Malaria Box was provided by
96 the Medicine for Malaria Ventures (www.mmv.org) and was provided as 20 µL solutions of
97 10 mM concentration in DMSO and stored at -20°C. In all experiments, the final maximum
98 final concentration of solvent was 0.6% v/v.

99 ***Plasmodium falciparum* cell culture**

100 The transgenic Dd2 *P. falciparum* clone (Dd2^{luc}) expresses luciferase under the control of
101 *Pfpcna* flanking sequences to produce a strong peak of temporal reporter expression during
102 S-phase in trophozoite stage parasites.^{15,16} Dd2^{luc} were cultured using standard continuous
103 culture conditions (RPMI1640 medium supplemented with 37.5 mM HEPES, 10 mM D-
104 glucose, 2 mM L-glutamine, 100 µM hypoxanthine, 25µg mL⁻¹ gentamycin, 4% v/v human
105 serum, 0.25% v/v Albumax II, 5nM WR99210 and 2.5 µg/mL blasticidin S) at a 2%
106 haematocrit in an atmosphere of 1% O₂, 3% CO₂, and 96% N₂. WR99210 and blasticidin S
107 drug selection media were removed 48 h prior to initiation of fluorescence and
108 bioluminescence assays. Staging and parasitaemia of the *in vitro* culture were assessed by
109 light microscopy of Giemsa-stained thin blood smears. Synchronization of cultures was

110 attained using sequential sorbitol lysis treatment,¹⁷ with experiments carried out at least
111 one intraerythrocytic cycle later.

112 **Concentration-response assays using bioluminescent and fluorescent assay formats**

113 Trophozoite-stage (20-26 h post-infection) cultures of Dd2^{luc} (100 μ L, 2% parasitaemia, 4%
114 haematocrit, n = 3) were added to 96-multiwell plates containing 100 μ L of pre-dosed (a
115 final five-fold dilution series) complete culture medium. On each assay plate, three wells
116 containing 200 μ L of 2% parasitaemia cell culture (2% haematocrit) in the absence of drugs
117 served as a positive control (100%), whereas the same culture mix in the presence of a 10
118 μ M concentration of chloroquine served as a negative growth control (0%). The outermost
119 wells on each plate contained 200 μ L of incomplete medium (complete culture medium
120 without human serum or Albumax II supplements) to minimize edge effects from
121 evaporation during incubation.

122 To determine estimates of the IC₅₀^{48h}, the parasite inoculum was incubated continuously in
123 the presence of the compound/drug for 48 h prior to assay. Estimation of the LC₅₀^{6h} was
124 carried out using a modification of the protocol originally described by Pagiuo et al.¹⁸ Here
125 the parasite inoculum was incubated for 6 h in the presence of compound/drug. The
126 infected erythrocyte cultures were collected by centrifugation (3000g, 5 min at room
127 temperature) and the medium supernatant discarded. Three repeat washes with 10
128 volumes of complete cell culture medium and centrifugation were completed before re-
129 suspending the infected erythrocytes in 200 μ L of 37°C complete culture medium for an
130 additional 42 h in the absence of compound/drug prior to assay. Luciferase and Malaria Sybr
131 Green I fluorescent (MSF) assays were also carried out immediately following the 6 h

132 incubation in drug/compound, this data used to estimate the EC_{50}^{6h} . Experiments were
133 carried out as technical triplicates on the same plate, with three independent biological
134 repeats of each plate performed.

135 For bioluminescent assays, relative light units were measured using the luciferase assay
136 system (Promega, UK). A standard single-step lysis procedure was used throughout.¹⁹ 40 μ L
137 samples of *P. falciparum* culture were transferred to a white 96-multiwell plate (Greiner,
138 UK) and 10 μ L of passive lysis buffer (Promega, UK) added and homogenized by pipetting.
139 An equal volume, 50 μ L, of the supplied luminogenic substrate was mixed with the lysed
140 parasites and the bioluminescence was measured for 2 sec in a Glomax Multi Detection
141 System (Promega, UK).

142 Fluorescent signals were measured using a standard MSF assay²⁰ as modified.¹⁶ MSF lysis
143 buffer (100 μ L of 20 mM Tris (pH 7.5), 5 mM EDTA, 0.008% (w/v) saponin and 0.08% (v/v)
144 Triton X-100) containing SYBR green I (1 \times final concentration, from 5000 \times stock supplied by
145 Invitrogen, UK) was added to 100 μ L of Dd2^{luc} aliquoted onto a black 96-multiwell plate
146 (Greiner, UK). Well contents were homogenized by pipetting and incubated for one hour in
147 the dark at room temperature. The fluorescent signal was measured using the blue
148 fluorescent module (excitation 490 nm: emission 510–570 nm) in a Glomax Multi Detection
149 System (Promega, UK).

150 Irrespective of the assay, growth was expressed as a proportion of the untreated control
151 (i.e. 100%) and calculated as follows: $100 \times [\mu_{(s)} - \mu_{(-)} / \mu_{(+)} - \mu_{(-)}]$ where $\mu_{(s)}$, $\mu_{(+)}$ and $\mu_{(-)}$
152 represent the means for the sample in question and 100% and 0% controls, respectively.
153 Note, as a complete kill could not be technically demonstrated to be achieved within 6 h,

154 the 0% control for the LC_{50}^{6h} and EC_{50}^{6h} determination was established as a 48 h continual
155 exposure to 10 μ M of chloroquine. The % growth was plotted against log₁₀-transformed drug
156 concentration and the parameters described above determined using a nonlinear regression
157 (sigmoidal concentration–response/variable slope equation) in GraphPad Prism v5.0
158 (GraphPad Software, Inc., San Diego, CA).

159

160 **Bioluminescence relative rate of kill (BRRoK) assay**

161 Trophozoite-stage (20-26 h post-infection) cultures of Dd2^{luc} (100 μ L, 2% parasitaemia, 4%
162 haematocrit, n = 3) were added to 96-multiwell plates containing 100 μ L of pre-dosed (final
163 three-fold IC_{50} dilution series) complete culture medium and mixed by pipetting. The
164 multiwell plate was incubated for 6 h at 37°C. 40 μ L samples from each well were removed
165 and the bioluminescent signal measured using the luciferase single-step lysis protocol
166 described above. Controls in each biological replicate consisted of trophozoite stage culture
167 with no drug added (100%) or uninfected erythrocytes (0%). The mean and standard
168 deviation (SD) of bioluminescence data from three independent biological repeats was
169 expressed as a proportion of the untreated control (100%) using the calculation shown
170 above. For the screening of the MMV Malaria Box (6 h assays using a 9x to 0.3x IC_{50} series), a
171 Principle Components Analysis was performed on the bioluminescence endpoints
172 (expressed as a percentage of untreated control) using the KNIME analytics platform to
173 reduce the dimensionality of these data set.²¹ As the first principle component captured
174 89% of the variance in the data, a zero-meaned PC1 value was used to represent the BRRoK
175 parameter. The Z' score of the BRRoK assay was calculated as follows: $Z' = 1 - [(3\sigma_{(+)} +$

176 $3\sigma_{(-)}/[\mu_{(+)} - \mu_{(-)}]$, where $\mu_{(+)}$ and $\sigma_{(+)}$ are the mean and SD of the no-drug (untreated) positive
177 control, respectively; $\mu_{(-)}$ and $\sigma_{(-)}$ are the mean and SD from uninfected erythrocytes
178 (negative control), respectively.²² The signal to background ratio was calculated as follows:
179 $[\mu_{(+)} - \mu_{(-)}]/\sigma_{(-)}$.

180 **Results**

181 ***A microplate-based bioluminescence assay monitors a concentration- and time dependent*** 182 ***loss of parasite viability immediately following drug perturbation***

183 *P. falciparum* genetically modified to express a luciferase reporter gene (Dd2^{luc}) show a time
184 and concentration-dependent loss of bioluminescence signal immediately, i.e. within 6 h,
185 following exposure to the rapid acting cytotoxic drugs chloroquine (CQ), dihydroartemisinin
186 (DHA) and artemether (ARM).¹⁶ By contrast, exposure to the cytostatic drug atovaquone
187 (ATQ) results in no apparent loss in bioluminescence signal over the same timeframe.¹⁶ To
188 validate that this drug-induced loss of bioluminescence reports a loss in parasite viability,
189 Dd2^{luc} parasites were subjected to a lethality assay adapted from that originally described by
190 Paguio et al.¹⁸ Early trophozoite stage parasites were exposed to a serial dilution of
191 antimalarial drug in a 6 h bolus, the drug was then washed off before replacing the parasites
192 into culture for 42 h to complete a cycle of intraerythrocytic development. The principle here
193 is that parasites killed during the drug bolus will not divide after removal of the drug,
194 whereas those inhibited by the drug will recommence growth upon removal of drug
195 pressure. A range of antimalarial drug classes were tested to explore the applicability of this
196 approach, including; the 4-aminoquinoline chloroquine, the 8-aminoquinoline tafenoquine,
197 the 4-methanolquinolines mefloquine and quinine, the bisquinoline piperazine, the

198 sesquiterpene lactones dihydroartemisinin and artemether and a naphthoquinone
199 atovaquone.

200 Three log concentration-response curves, normalised against untreated controls, were fitted
201 using data derived from either a bioluminescence assay (Luc) or a Malaria Sybr Green I
202 fluorescence (MSF) assay of DNA content (see Figure S1 for an experimental schema). These
203 curves (Figure 1 and Figure S2) report the following parameters (Table 1); a 50% effective
204 concentration recorded immediately following the drug bolus but prior to drug wash-out
205 (EC_{50}^{6h}), a 50% lethal concentration estimate following drug wash out and re-culture (LC_{50}^{6h})
206 and a 50% inhibitory concentration estimate following 48 h of continuous culture in the
207 presence of the drug (IC_{50}^{48h}).

208 The majority of drugs show a right-shift in the lethal concentration curve compared to that
209 of the inhibitory concentration, reflecting the higher concentration of drug required to
210 affect a kill within a 6 h window of exposure (Figure 1 and Figure S2). As expected, the right
211 shift was more pronounced for the quinolone drugs than for the artemisinins.^{18,23} The minor
212 shift in lethal concentration for dihydroartemisinin and artemether likely reflects their
213 formation of covalent adducts with their target(s), rendering them resistant to the wash
214 steps, the use of trophozoite stage parasites in this assay as well as their profoundly rapid *in*
215 *vitro* rate of kill.^{13,23,24} As previously shown, IC_{50}^{48h} data developed using either MSF or
216 bioluminescence assays are essentially identical.¹⁶ The same observation for the LC_{50}^{6h} assay
217 data, whilst not unexpected, is shown here for the first time. Clear differences between the
218 MSF and bioluminescence assay immediately following the 6 h drug bolus (EC_{50}^{6h}) are,
219 however, evident. Here, the intrinsic instability of the luciferase reporter protein ($t_{1/2}$ of
220 approximately 1.5 h)¹⁶ compared to that of the far more stable DNA biomarker (reported in

221 the MSF assay), offers an apparently more dynamic report of immediate drug action during
222 this 6 h period. Importantly, the EC_{50}^{6h} values determined using the bioluminescence assay
223 (without drug wash and reculture) are almost identical to the LC_{50}^{6h} estimated using either
224 assay format. The observation that the 6 h bioluminescence curve closely fits that of the
225 lethal concentration curve for the majority of drugs, indicates that the loss of
226 bioluminescence not only apparently reports loss of viability, but also that this 6 h assay
227 provides a rapid determination of the immediate cytotoxic action of these drugs. The sole
228 exception, atovaquone, shows no reduction in the bioluminescence signal within 6 h, a
229 reflection of its previously reported pharmacodynamic killing lag time.¹³

230 To compare the relative concentration-dependent effects of different antimalarial drugs, a
231 revised bioluminescence assay was devised that utilised fold-changes in IC_{50} concentrations
232 to ensure exposure to equipotent concentrations of drug. Here, $Dd2^{luc}$ parasites were
233 exposed to a three-fold serial dilution (81 to $0.33 \times IC_{50}$) for 6 h, with the bioluminescent
234 signal, normalised to an untreated control at the same timepoint, plotted against drug
235 concentration (Figure 2). These data illustrate an apparent saturation in the immediate
236 lethal effect of drug concentrations greater than $9 \times IC_{50}$ for all, except atovaquone, of the
237 drugs tested. This observation is in agreement with the findings of Sanz et al,¹³ who suggest
238 that at a $10 \times IC_{50}$ concentration the maximal rate of *in vitro* kill was achieved. Direct
239 comparison between the data shown in figure 2 indicates an apparent relative ranking order
240 of artemisinin > chloroquine > 4-methanolquinolines > atovaquone, that is identical to the
241 relative order of RoK described both *in vivo* and *in vitro* for the same drugs.²⁵⁻²⁹ To explore
242 this correlation further, linear regression analysis was performed between the normalised
243 bioluminescent signals produced for each drug concentration of drug tested and the *in vitro*

244 parasite reduction ratio (a Log ratio between parasitaemia at the onset of treatment and
245 that after 48 h exposure, Log PRR) and parasite clearance time (time of drug exposure to
246 elicit a 99.9% reduction in parasitaemia, PCT) reported in Sanz et al.¹³ (Figure 3 and Figures
247 S3 and S4). Comparison of bioluminescence against the PCT shows a strong, and significant,
248 correlation at higher concentrations of drug, with the slope and intercept of the regression
249 analysis essentially unchanged at concentrations greater than 9xIC₅₀ reflecting an apparent
250 saturation in the rate of kill achieved at these concentrations (Figure 3c and Figure S3).
251 Comparisons with the Log PRR show a strengthening trend with higher concentrations of
252 drug (Figure S4), although these just fail to reach a level of significance ($\alpha = 0.05$). Here, the
253 available shared data (artemisinins are excluded as Log PRR only reported as >8) and the
254 limited distribution in Log PRR for the quinoline drugs used would appear to be the likely
255 limitations in achieving a significant correlation.

256

257 ***Screening the Malaria Box for compounds that exert a rapid cytotoxic effect***

258 The application of a microplate-based bioluminescence assay to quickly identify compounds
259 that exert an immediate cytotoxic effect was explored using the compound set available in
260 the MMV Malaria Box. Using a 48 h MSF assay, IC₅₀ data was developed here in the Dd2^{luc}
261 clone for 396 compounds, the remaining 4 omitted as insufficient material was available.
262 These data have been deposited in the ChEMBL - Neglected Tropical Disease Open Access
263 repository (CHEMBL3392923). Of these 396 compounds, sufficient material was available for
264 372 to complete a 6 h bioluminescence cytotoxicity assay using a serial three-fold dilution of
265 compounds between 9 to 0.33xIC₅₀; this range selected to monitor the range of initial
266 cytotoxic action without the saturation effects observed at higher concentrations (Figure 3).

267 We term this the Bioluminescence Relative Rate of Kill assay, as the initial cytotoxic activity
268 of each compound is compared against a set of benchmark antimalarials for which *in vitro*
269 rates of action are known. Log concentration-normalised bioluminescence signal plots for all
270 372 compounds are reported in the online supplementary materials (Figures S5 and S6. See
271 also Table S1 for compound positions in these figures). Ten assay plates (each with $n=3$
272 replicates) of Dd2^{luc} exposed for 6 h to either no drug (100% growth) or uninfected
273 erythrocytes (0%) allow the Z' score, signal to background (S/B) ratio and coefficient of
274 variation (%CV) assay parameters to be determined. The 95% confidence intervals for Z'
275 score (0.9-0.97), maximum %CV (0.96-2.98%) and S/B (806-993) indicate a robust and
276 sensitive microplate-based assay format.²²

277 Using the mean and standard deviation of the normalized bioluminescence signal for each
278 IC₅₀-fold concentration in the BRRoK assay, a Principle Components Analysis was carried out
279 to capture the concentration-dependent effects in a single parameter (see Figures S7, Tables
280 S2 and S3 in online supplementary materials). The first Principle Component (PC1) accounts
281 for 89% of the variance in the 6 h assay dataset with the majority of the loading
282 contributions provided by the 9x and 3xIC₅₀ data ($0.63x[9xIC_{50}] + 0.62x[3xIC_{50}] +$
283 $0.41x[1xIC_{50}] + 0.22x[0.33xIC_{50}]$). Zero-meaned PC1 values provide a sequential order of the
284 initial cytotoxic effect exerted by the 372 MMV compounds screened (see Table S4 in the
285 online supplementary materials), with lower value PC1 representing a greater cytotoxic
286 effect. This order of initial cytotoxic effect is then informed by comparison against the initial
287 cytotoxic effect provided for each of the benchmark antimalarial compounds, providing the
288 necessary surrogate information regarding the initial relative rate of kill for the MMV
289 compounds. As such, the BRRoK assay indicates that 53 MMV compounds exert an initial

290 rate of kill at least the same as that for chloroquine (PC1=-73.7), with 17 (Figure S8) of these
291 compounds showing an initial rate of kill at least as good as that of dihydroartemisinin
292 (PC1=-97.4). Support for the surrogacy of PC1 in informing a compound's initial RoK is
293 provided by comparing PC1 with the *in vitro* estimates of Log PRR and PCT for the
294 benchmark antimalarial drugs tested (Figure 4).¹³ This comparison shows significant
295 correlations between both PCT ($r^2=0.91$, $p=0.003$) and Log PRR ($r^2 = 0.78$, $p=0.05$) with the
296 PC1 values determined in the BRRoK assay.

297 Plotting PC1 against the IC₅₀ for the MMV compounds screened provides a simple means to
298 explore the interplay between the IC₅₀ potency and relative initial RoK against a background
299 of known antimalarial drug benchmarks (Figure 5). Potent, low IC₅₀, compounds with an
300 initial rapid rate of kill, exemplified by artemisinins (i.e. dihydroartemisinin), occupy the
301 bottom left quadrant of this plot. Atovaquone, whilst potent in terms of its IC₅₀, is a slow
302 acting drug and occupies the upper left hand quadrant. This analysis reveals that the 372
303 Malaria Box compounds tested display a wide range of apparent initial rates of kill, but also
304 that, as would be expected from previous *in vitro* assays of rate of kill, that there is no
305 correlation between IC₅₀ and rate of kill ($r^2=0.1$).^{13,30} Also, as would be expected from the
306 MMV Malaria box, where compounds have been selected on their basis as starting points
307 for drug discovery programmes rather than IC₅₀ potency, no compound tested falls within
308 the optimal lower-left quadrant of this plot.

309

310 **Discussion**

311 The development of the next generation of medicines for the treatment of uncomplicated
312 malaria recognises the need for a combination of small molecule drugs that meets a series
313 of challenging targets around efficacy, cost and safety.^{8,9,31} Amongst these targets is the
314 requirement to quickly clear the parasite burden through the action of (at least one) rapidly
315 acting cytotoxic drug within this combination therapy.⁹ Here we describe the development
316 of a rapid and robust assay for the screening of fast-acting cytotoxic compounds against the
317 intraerythrocytic trophozoite stages of *P. falciparum*. Moreover, the microplate-based
318 format and minimal experimental manipulations required to complete the assay offers the
319 potential for it to be readily scaled for high throughput screening of compound libraries
320 such as the Tres Cantos Antimalarial Set (TCAMS) to triage hits with this rapid killing kinetic.

321 The utility of this assay was demonstrated through a medium throughput screen of 372
322 compounds sourced from the Malaria Box, an open access resource provided by the MMV
323 to pump-prime antimalarial drug development.¹⁴ Here the concentration-dependent loss of
324 bioluminescence signal for these compounds was compared against those for a range of
325 benchmark antimalarial drugs, providing a simple relative assessment of the initial rate of
326 kill for each MMV compound. Thus, 53 compounds in the MMV Malaria Box were shown to
327 have an initial rate of kill at least as good as chloroquine, with 17 of these compounds
328 showing an initial rate of kill better than that for dihydroartemisinin. This relative
329 description of the initial rate of kill relates directly to the minimum essential and ideal
330 criteria, respectively, specified for a TCP 1 component of a future SERCaP drug by MMV.⁹
331 Thus, whilst BRRoK assay doesn't provide a direct measurement of the rate of kill in terms of
332 the currently defined PRR and PCT parameters, it readily meets the challenge of identifying,

333 and discriminating between, fast acting cytotoxic drugs – and does so within one working
334 day.

335 The development of this assay followed from the observation that the bioluminescent signal
336 in parasites genetically modified to express a luciferase reporter protein is reduced in a
337 concentration and time dependent way immediately following drug exposure when exposed
338 to known cytotoxic drugs.¹⁶ This inherent dynamic response, a result of the short half-life of
339 the luciferase, provides an apparent indirect report of the viability of the parasite. That is,
340 dead and dying parasites do not synthesise new luciferase, the remainder being rapidly
341 turned over. Here, using an adaptation of a lethality assay,¹⁸ the concentration-dependent
342 loss of bioluminescence over a 6 h drug bolus was shown to relate with that of the apparent
343 lethal effect of a range of antimalarial drugs monitored following a drug wash and regrowth
344 into a subsequent intraerythrocytic cycle of growth.¹⁸

345 To facilitate a relative comparison of cytotoxic activity between different antimalarial drugs,
346 the bioluminescence protocol was adapted to use fold-IC₅₀ concentrations of drug bolus.
347 Comparisons between the loss of bioluminescent signal at 6 h when exposed to between
348 0.33 to 81xIC₅₀ concentrations correlated significantly with *in vitro* PCT at 3xIC₅₀ or greater.
349 Interestingly, the slopes for these correlations remained unchanged at concentrations
350 greater than 9x IC₅₀, mimicking the observation of Sanz et al., that suggests a 10xIC₅₀
351 concentration is generally sufficient, irrespective of mode of action of a drug, to achieve its
352 maximal rate of *in vitro* kill.¹³ Whilst the losses of bioluminescence signal at 6 h failed to
353 consistently provide a significant correlation with *in vitro* PRR, the coefficient of variation
354 are consistently greater than 0.69 for concentrations of 3xIC₅₀ and more. Given these
355 observations, the BBRoK assay was adapted to screen the MMV Malaria Box using

356 concentrations between 0.33 to $9 \times IC_{50}$. This choice balancing the apparent saturation in *in*
357 *vitro* cytotoxic action at concentrations higher than $9 \times IC_{50}$ and the observation that
358 concentrations as low as $0.33 \times IC_{50}$ still elicited a measurable loss of bioluminescence from
359 profoundly rapidly acting drugs such as dihydroartemisinin. A distinction between the
360 BRRoK and *in vitro* PRR assays is the use of chloroquine resistant and sensitive strains,
361 respectively. However, given the approach of using IC_{50} -fold concentrations of drug the
362 effect on the interpretation of the relative rates of kill was considered minimal, and appears
363 so from the correlation of benchmark drugs using both assays. The use of the IC_{50} -fold
364 concentration approach in the analysis of drug-action in chloroquine sensitive and
365 resistance strains is supported by the observation that the temporal accumulation of
366 haemozoin shows no difference between these strains when the appropriate 1x or 2x IC_{50} -
367 fold concentration of chloroquine is added.³²

368 Potential modes of action have been attributed to 135 compounds in the MMV Malaria Box,
369 although for most the target association is considered tentative.³³ Using these data,
370 compounds exhibiting three modes of action were correlated with the BRRoK assay data to
371 explore the validity of the assay format (Figure 6). Specifically; inhibition of (i) the bc_1
372 complex of the mitochondrial electron transport chain, (ii) dihydroorotate dehydrogenase
373 (DHODH), a key step in the *de novo* synthesis of pyrimidines in a parasite that otherwise
374 lacks a pyrimidine salvage pathway and (iii) PfATP4, a Na^+ -ATPase located in the parasite's
375 plasma membrane. These modes of action were selected as *in vitro* PRR data are available
376 for drugs/compounds that share these modes of action, with at least ten MMV compounds
377 annotated for each.³³⁻³⁸ Fifteen compounds are annotated as inhibitors of the parasite's bc_1
378 complex and are all reported in the BRRoK assay as having a slow initial cytotoxic action (PC1

379 between 25.2 and 100.9), comparable to the exemplar drug, atovaquone, sharing the same
380 mode of action (PC1= 55.4, log(PRR)=2.9 and 99.9% PCT=90 hr).¹³ Twelve compounds are
381 annotated as DHODH inhibitors, with five of these being structural analogues of the
382 triazolopyrimidine early clinical trial candidate DSM265.³⁴ BRRoK data reports these
383 compounds as sharing a slow initial cytocidal action (PC1 between 23.1 and 68) with this
384 apparent slow rate of kill correlating with the atovaquone-like *in vitro* PRR data available for
385 DSM265 due to a lag-phase of between 24 to 48hr before eliciting its cytocidal activity *in*
386 *vitro*.³⁴ Of the 28 potential PfATP4 inhibitors in the MMV Malaria Box,³⁵ 26 were screened
387 here. *In vitro* PRR data are available for the exemplar PfATP4 inhibitors (+)-SJ733,³⁶ a
388 dihydroisoquinoline with a slow to moderate (between pyrimethamine and atovaquone) rate
389 of kill, and KAE609/NITD609,³⁷ a spiroindolone with a moderate to fast (between
390 pyrimethamine and artesunate) rate of kill. The majority of the potential PfATP4 inhibitors
391 in the MMV Malaria Box were reported in the BRRoK assay (PC1 between -47.4 and -114.9)
392 as having an initial rate of kill between the moderate mefloquine (PC1=-42.4, log(PRR)=3.7
393 and 99.9% PCT= 43 hr), comparable to the *in vitro* PRR reference pyrimethamine
394 (log(PRR)=3.5 and 99.9% PCT= 55 hr),¹³ and the fast-acting dihydroartemisinin (PC1=-97.4).
395 The fastest acting PfATP4 inhibitor in the BRRoK assay was the spiroindolone MMV396749.
396 The Malaria Box also contains five structural analogues of (+)-SJ733.³⁵ Of these, four
397 reported BRRoK data (between -16.4 and 49.1) falling between mefloquine and atovaquone,
398 supporting the moderate to slow rate of kill of these dihydroisoquinolines. These data,
399 taken together with the expected relative order of the benchmark antimalarial drugs tested,
400 validates the application of the BRRoK assay in determining initial cytocidal activity across a
401 diverse range of chemotypes.

402 Comparison of BRRoK with other available *in vitro* assays of rate of kill suggests a number of
403 advantages to our approach. Two alternative assays offer an indirect measurement of
404 cytotoxic activity, either by monitoring mRNA levels or through the use of a modified ³H-
405 hypoxanthine incorporation assay.^{25,26} The two remaining alternatives offer a direct
406 measurement of viability, essentially through the monitoring of erythrocyte re-invasion
407 (re-invasion into fluorescently labelled erythrocytes) and growth post-drug challenge – i.e.
408 the current “gold” standard offered through monitoring parasite recrudescence after
409 limiting dilution.^{13,27} Apart from the recrudescence assay, these formats offer readouts of
410 parasitocidal activity within 3-10 days, with the recrudescence assay taking between 21-28
411 days. The advantage of the recrudescence assay, however, is based on the fact that it
412 provides a direct measurement of rate of kill, albeit *in vitro* conditions generate PRR values
413 that are not always directly comparable to *in vivo* PRR measurements.^{13,28,36,39} The
414 erythrocyte invasion viability assay, like the BRRoK assay, offers a relative measure of RoK,
415 with classifications of slow (atovaquone-like), moderate (pyrimethamine-like) and fast
416 (artemisinin-like).²⁷ Comparison of the PC1 values for the 30 MMV compounds and
417 benchmark antimalarials similarly tested in the erythrocyte-invasion viability assay shows
418 good correlation (Figure S9), with significant differences between PC1 values for fast and
419 slow RoK drugs as defined in the invasion assay.^{27,30} Moderate RoK compounds, however,
420 showed no significance difference to slow and fast RoK compounds when compared to the
421 BRRoK assay, but the sample size is small and there are outliers in both groups. These
422 outliers may be potentially interesting as they likely represent differences between
423 compounds being exposed for 6 h to trophozoites (BRRoK) or for between 24 to 48 h
424 (invasion assay), encompassing most developmental stages of the intraerythrocytic asexual
425 cycle, and may provide some guide to lag in cytotoxic activity or stage-specific action.

426 The key limitation to the recrudescence assay is that it is only available as a low throughput
427 tool, due to the technical and time consuming challenge of the assay protocol – but it does
428 provide the ability to discriminate between whether a compound meets the minimal
429 essential or ideal TCP1 criteria for RoK. This discrimination between TCP1 candidates is
430 similarly provided by the BRRoK assay, although here it is provided in 6 h from a microplate
431 format assay requiring minimal manual intervention beyond a single-step lysis and readout
432 protocol. The simplicity of this assay format offers a significant opportunity to scale up for
433 high throughput screening through semi-automation and denser microplate formats. Z' and
434 S/B ratios comparable to those from the 96-well microplate assay can be achieved using 30
435 μ l of intraerythrocytic culture (2% haematocrit and 2% parasitaemia) indicating that this
436 robust assay can be readily adapted into a 384- or 1536 - well microplate format. Whilst
437 offering advantages in terms of speed, simplicity, scalability and discrimination, the BRRoK
438 assay in its current format defines RoK only in terms of the relative immediate cytotoxic
439 action against trophozoite stage parasites. This assay appears best placed in the early drug
440 discovery pipeline, with priority hits from BRRoK assay to be subsequently confirmed using
441 the *in vitro* PRR assay.

442 The requirement for transgenic parasites expressing the luciferase reporter gene limits the
443 genetic backgrounds available for this assay, and does represent a distinct limitation of this
444 *in vitro* method when compared to the PRR and erythrocyte invasion assay.^{13,27} However,
445 these transgenics can be reasonably readily generated using stable episomally maintained
446 reporter plasmids, with the opportunity to extend the utility of the assay, beyond the
447 current limitation of trophozoite stage parasites, to explore stage-specific rate of kill
448 dynamics through the selection of gene flanking sequences that would offer temporal

449 expression at other intraerythrocytic stages. The potential for a revised reporter construct in
450 developing a cytotoxic activity assay in ring stage parasites for the exploration of artemisinin
451 action and resistance being a particularly relevant target of interest. One disadvantage
452 evident from this study was that it took significantly longer to generate the IC₅₀ data for the
453 MMV Malaria Box compounds than to perform the BRROK assay. Typically, IC₅₀ data from
454 large high throughput screens are available for the 3D7 strain of *P. falciparum*, and were
455 provided with the Malaria Box resource. Given that multiples of IC₅₀ are used in the BRROK
456 assay, and that the 9xIC₅₀ assay data best correlated with available *in vitro* PRR and PCT
457 data, we examined whether Dd2-specific IC₅₀ data was actually needed to triage rapidly
458 acting cytotoxic compounds or whether a similar outcome could be achieved using the more
459 widely available IC₅₀ data from the 3D7 strain. Using the available 3D7 data to provide for a
460 9xIC₅₀ concentration against Dd2^{luc}, the loss of bioluminescence signal in a single
461 concentration/single timepoint (6 h) triage assay was carried out with 396 of the MMV
462 compounds and compared to the same data derived using our Dd2 IC₅₀ values (Figure 7a).
463 The loss of bioluminescence measured using the 3D7 IC₅₀ concentrations significantly
464 correlate with those determined using the Dd2 IC₅₀ values ($r^2=0.88$ $p<0.0001$). Looking
465 specifically at the 53 compounds that the BRROK assay define as having an initial rate of kill
466 at least as good as chloroquine, setting a threshold of discovery based on a 50% loss of
467 bioluminescence signal using the 3D7 IC₅₀ concentration would ensure >95% of these TCP1
468 candidates would be identified in this simplified assay format using the more readily
469 available 3D7 data (Figure 7b). The discovery rate using 3D7 IC₅₀ data falls as a more
470 stringent bioluminescence signal threshold is applied, although the same is similarly true
471 when using the actual Dd2 IC₅₀ data. This simple triage assay, utilising the opportunities
472 afforded through denser microplate formats and available 3D7 IC₅₀ data, provides the

473 means for a quick and robust exploitation of the available chemical libraries in our search
474 for rapid acting cytocidal antimalarial drugs to meet the challenge of malaria control and
475 eradication in a post-artemisinin era.

476

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479 Malaria Box.

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484 **Transparency Declaration**

485 None to declare.

486 **Supplementary data**

487 Supplementary data are available at JAC Online (<http://jac.oxfordjournals.org/>).

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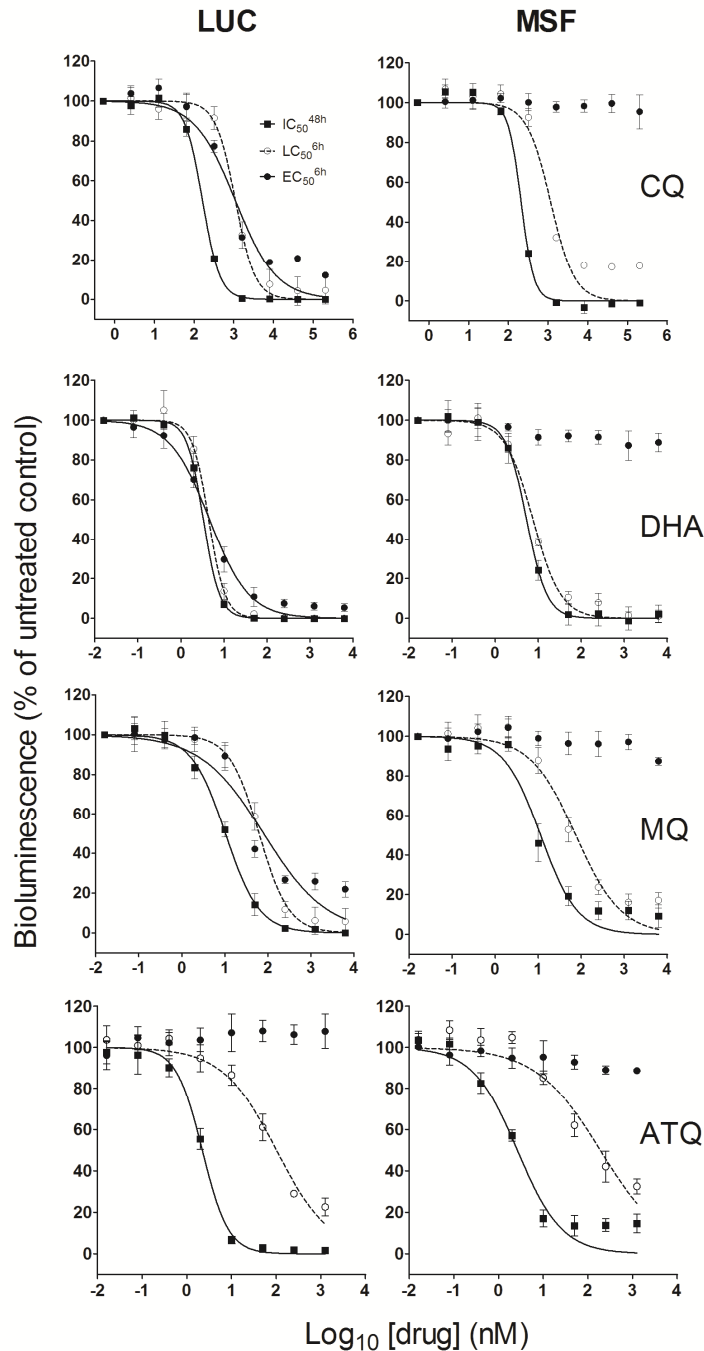
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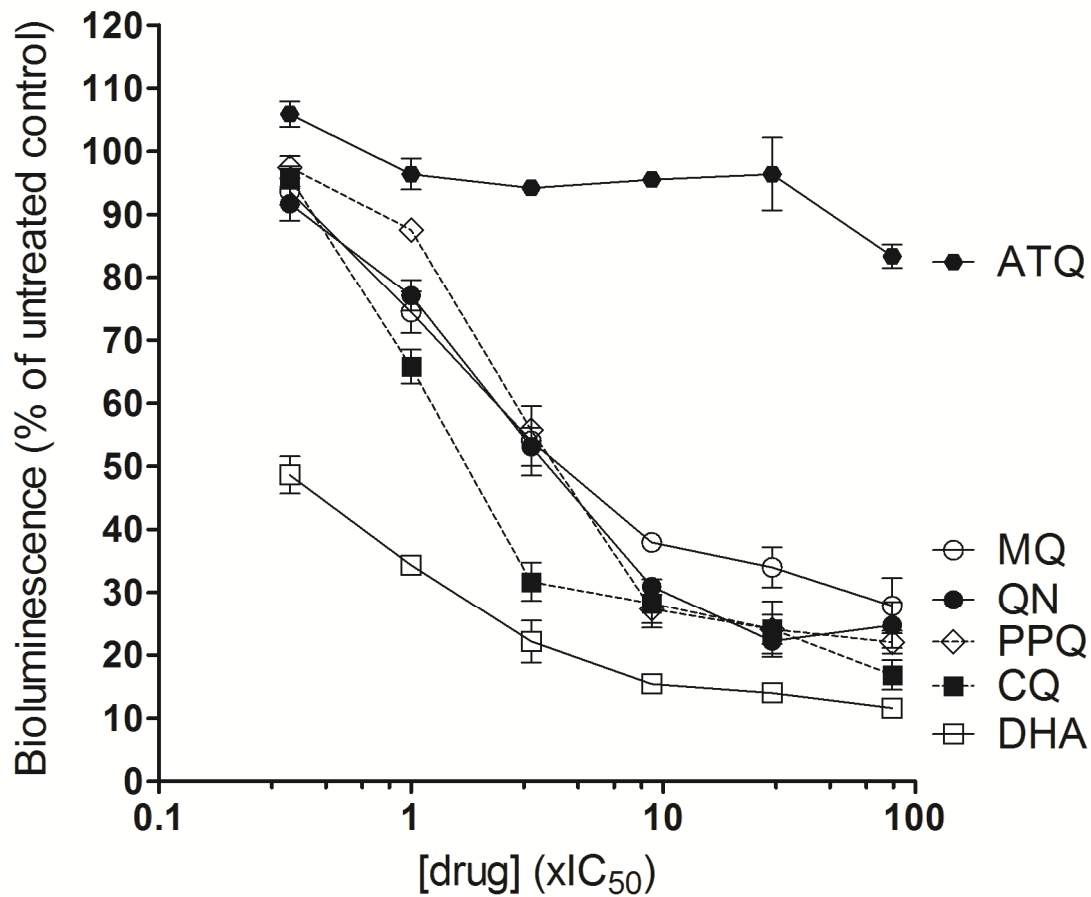
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575

576 **Figure 1.** Monitoring drug-induced loss in parasite viability using a bioluminescence assay.
 577 Panels illustrate log-concentration response curves following exposure to the indicated drug
 578 using either a bioluminescence (LUC) or fluorescence assay (MSF) format. From these
 579 curves, estimates of the IC_{50}^{48h} , LC_{50}^{6h} and EC_{50}^{6h} (see main text for definition and key for
 580 symbols used) were determined using each assay format (reported in Table 1). Data
 581 represents the mean of three biological replicates, with SD indicated by error bars. ATQ,
 582 atovaquone; CQ, chloroquine; DHA, dihydroartemisinin; MQ, mefloquine. See Figure S1 for
 583 same charts for artemether, quinine, piperavaquine and tafenoquine. Note that non-linear
 584 regression for EC_{50}^{6h} estimates using the MSF assay were not possible.



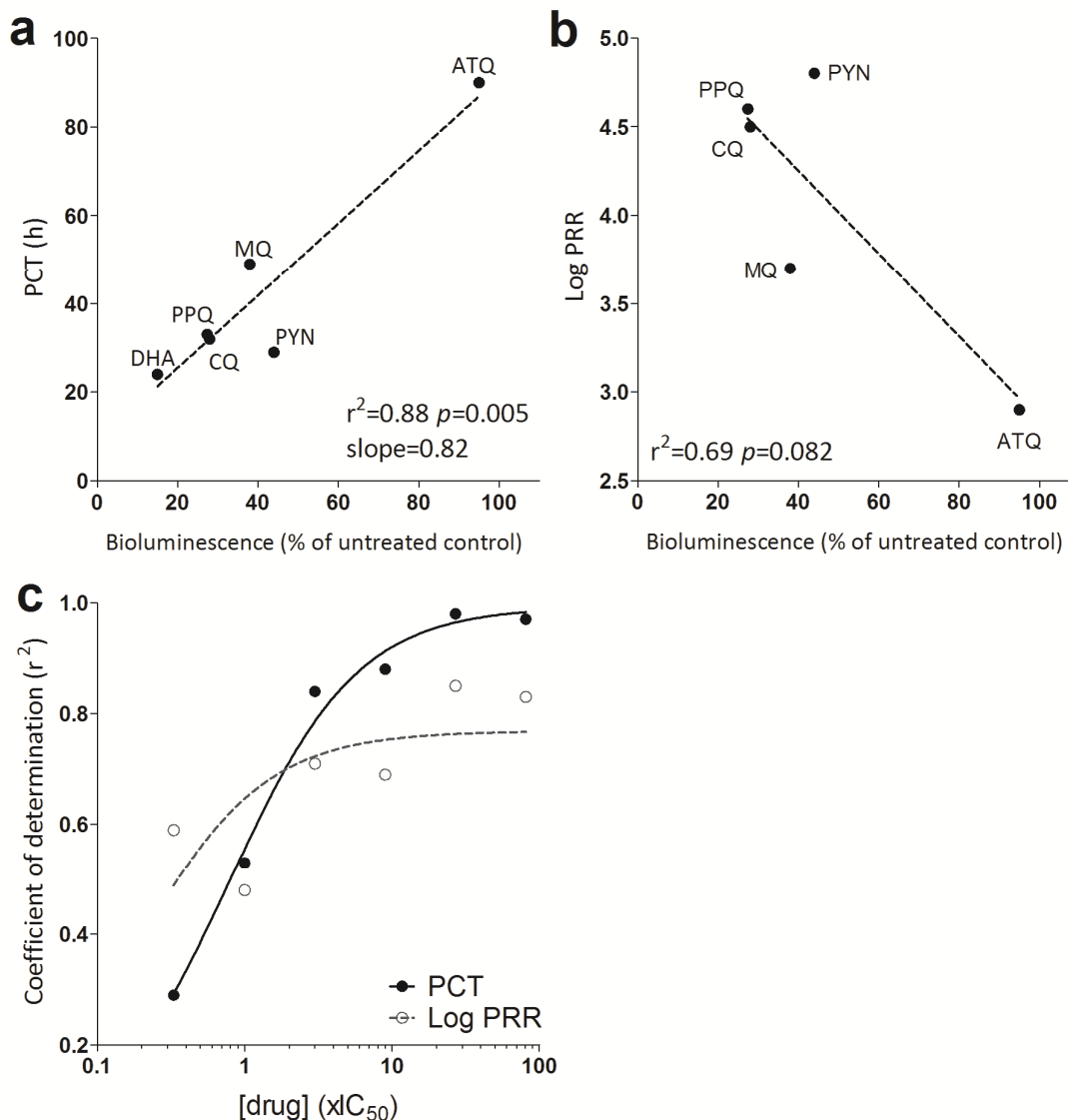
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589 **Figure 2.** Equipotent-IC₅₀ concentration-dependent loss of bioluminescence for standard
 590 antimalarial drugs. The mean (error bars represent \pm SD from three biological replicates)
 591 bioluminescence signal, normalised against an untreated control, remaining after a 6 h
 592 exposure to the indicated fold-IC₅₀ concentration of drug (see key to right of chart). A serial
 593 three-fold dilution from 81xIC₅₀ to 0.33xIC₅₀ is reported. ATQ, atovaquone; CQ, chloroquine;
 594 DHA, dihydroartemisinin; MQ, mefloquine; PPQ, piperazine; QN, quinine.

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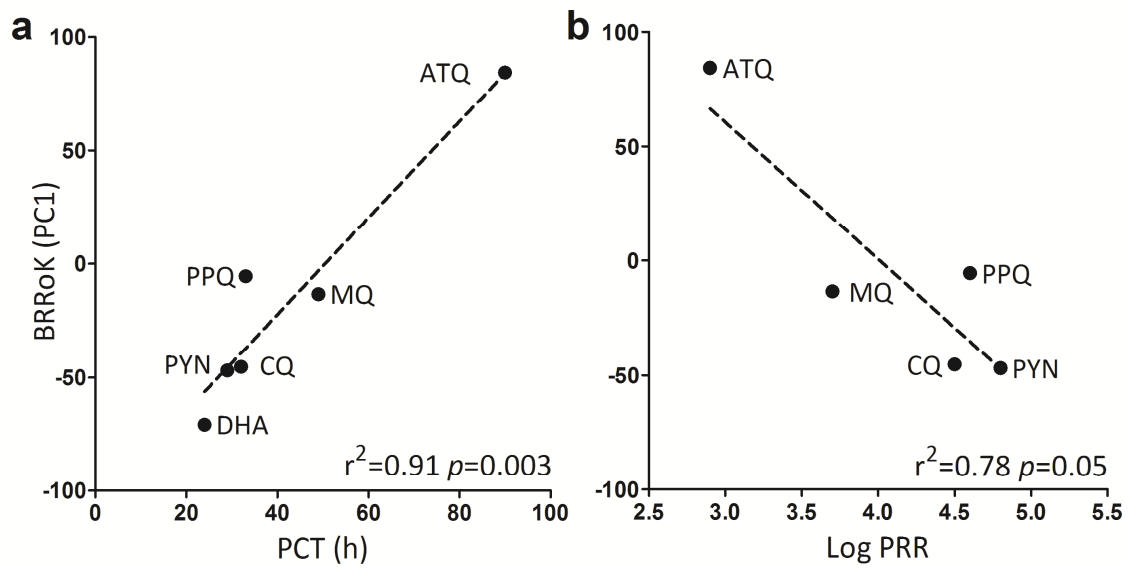


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598 **Figure 3.** Correlating the concentration-dependent loss of bioluminescence signal with *in*
 599 *vitro* (a) Parasite Clearance Time (PCT, h) and (b) Log Parasite Reduction Ratio (PRR). Each
 600 panel represents on the x-axis the bioluminescence signal, as a % of an untreated control,
 601 following exposure to a 9 x IC₅₀ concentration of drug for 6 h. *In vitro* PCT and Log PRR data
 602 from the Sanz *et al.*,¹³ study are plotted on the y-axis. Linear regressions are indicated with a
 603 dotted line, with parameters reported on each chart. Charts representing the effect at 81,
 604 27, 3, 1 and 0.33 x IC₅₀ are shown in Figures S3 and S4. (c) Plot illustrating the apparent
 605 saturation in coefficients of determination (r²) derived when correlating *in vitro* PCT and Log
 606 PRR data against the loss of bioluminescence signal at higher fold-IC₅₀ drug concentrations
 607 tested. ATQ, atovaquone; CQ, chloroquine; DHA, dihydroartemisinin; MQ, mefloquine; PPQ,
 608 piperavaquone; PYN, pyronaridine.

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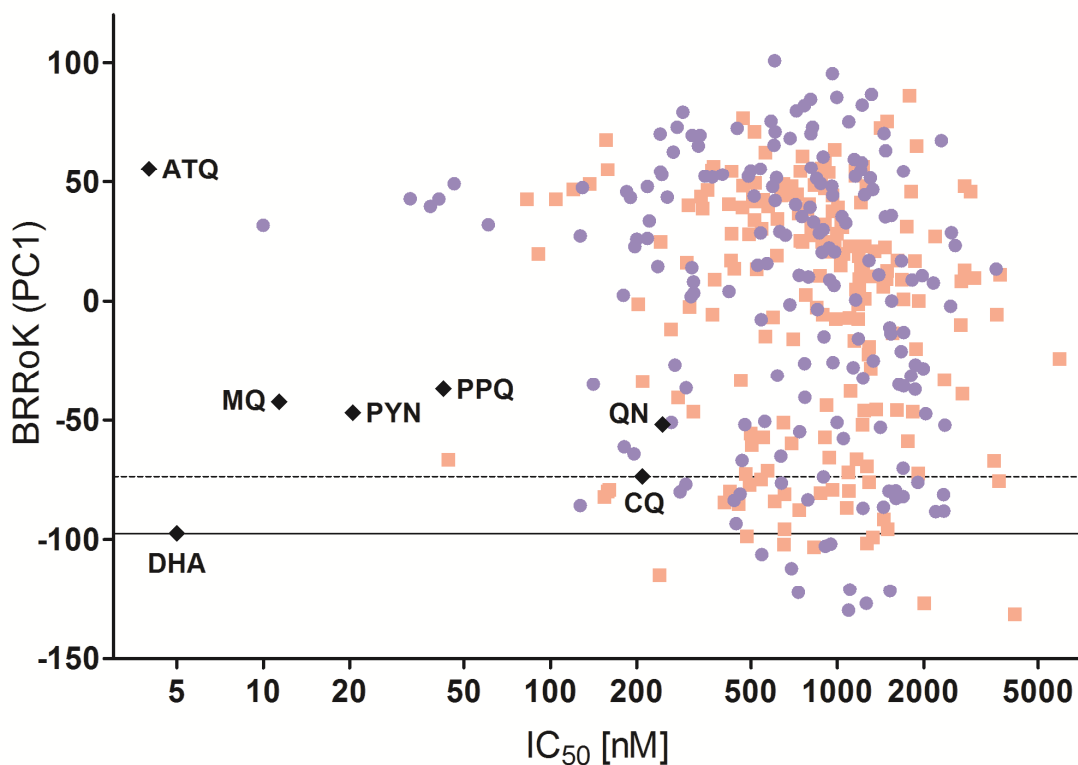


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613 **Figure 4.** Correlating the Bioluminescence Relative Rate of Kill (BRRoK, PC1) with *in vitro* (a)
614 Parasite Clearance Time (PCT, h) and (b) Log Parasite Reduction Ratio (PRR). Zero-meaned
615 PC1 data are plotted on the y-axis for antimalarial drugs where *in vitro* PCT and PRR data are
616 available from Sanz *et al.*¹³ Linear regressions are indicated with a dotted line, with
617 parameters reported on each chart. ATQ, atovaquone; CQ, chloroquine; DHA,
618 dihydroartemisinin; MQ, mefloquine; PPQ, piperazine; PYN, pyronaridine.

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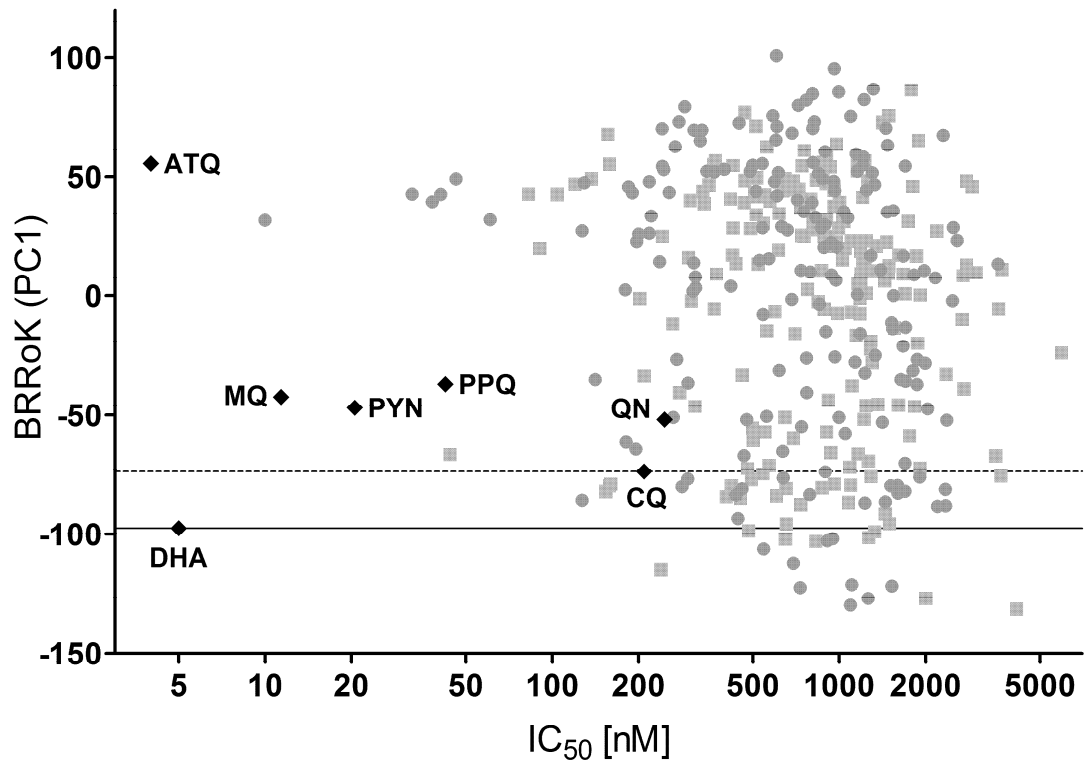


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622 **Figure 5.** Distribution of Bioluminescence Relative Rate of Kill (BRRoK, PC1) against IC₅₀ for
 623 the MMV Malaria Box compounds. Zero-meaned PC1 data for 372 compounds in the MMV
 624 Malaria Box (drug-like in red squares and probe-like in blue circles) and 7 benchmark
 625 antimalarial drugs (black diamonds) are plotted against their IC₅₀ (note: faster initial rates of
 626 cytocidal activity are represented with lower PC1 values). See Table S4 in online
 627 supplementary materials for PC1 and IC₅₀ data for individual compounds. The minimum
 628 essential threshold (dotted line) and ideal threshold (solid line) for TCP1 candidates are
 629 indicated based on the BRRoK assay data for CQ and DHA, respectively. This figure appears
 630 in colour in the online version of *JAC* and in black and white in the print version of *JAC*. ATQ,
 631 atovaquone; CQ, chloroquine; DHA, dihydroartemisinin; MQ, mefloquine; PPQ, piperazine;
 632 PYN, pyronaridine; QN, quinine.

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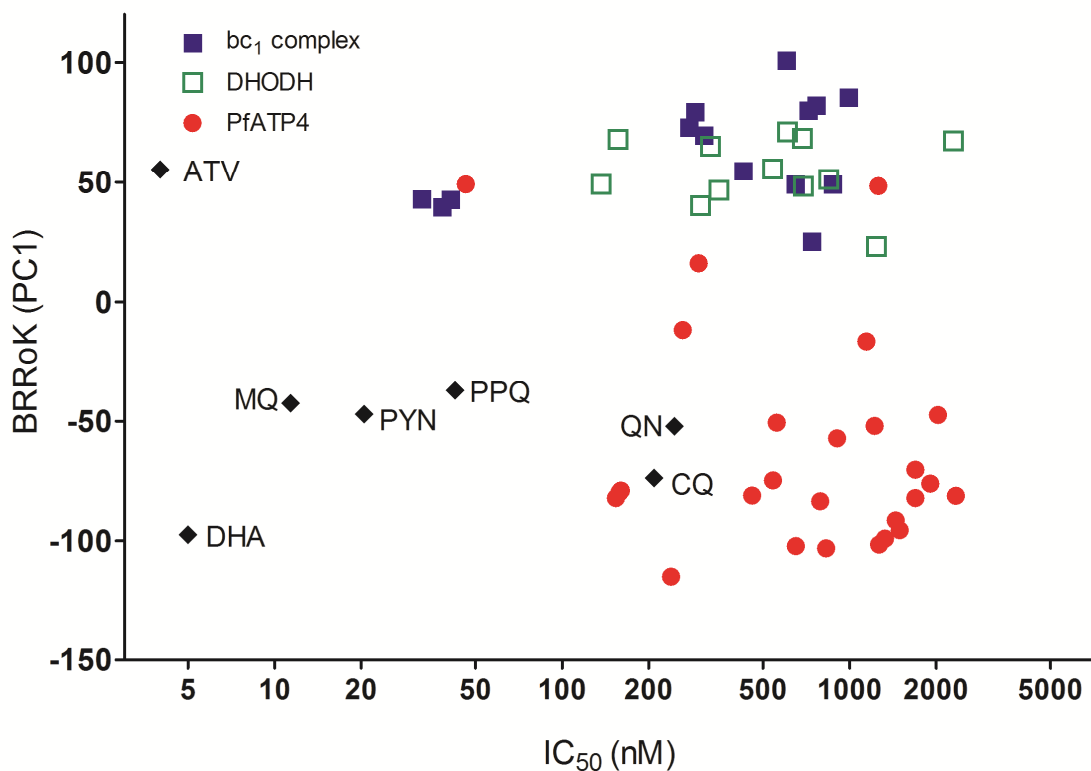
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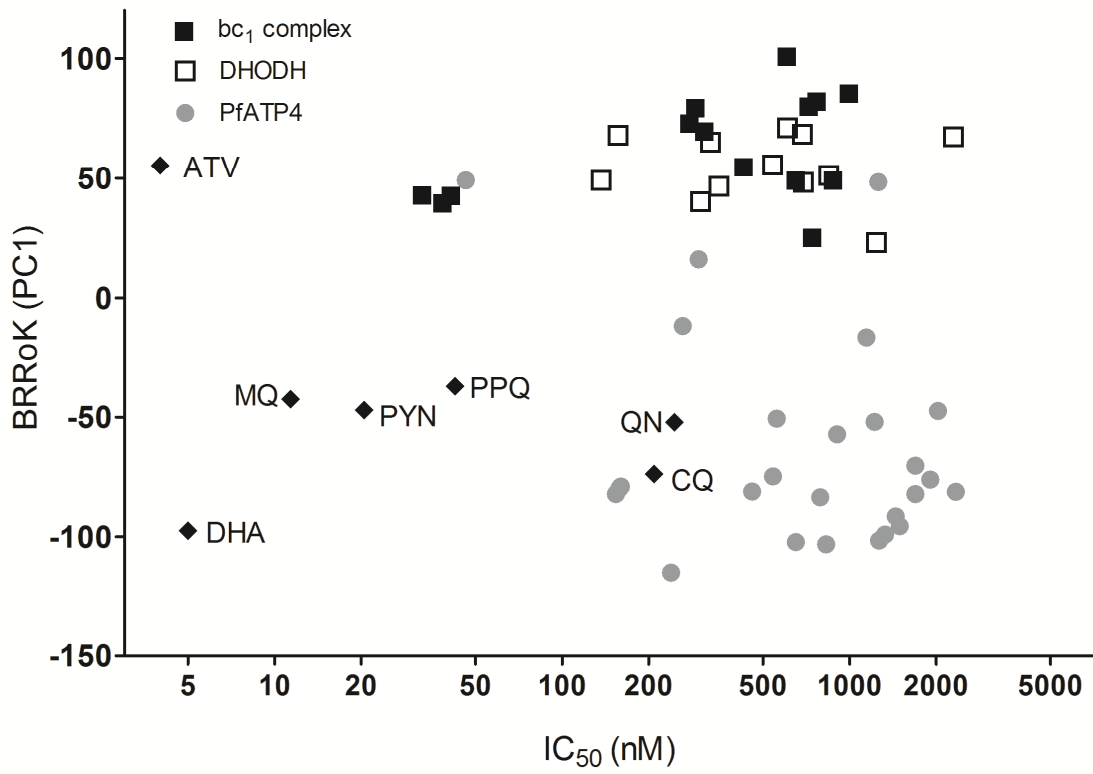


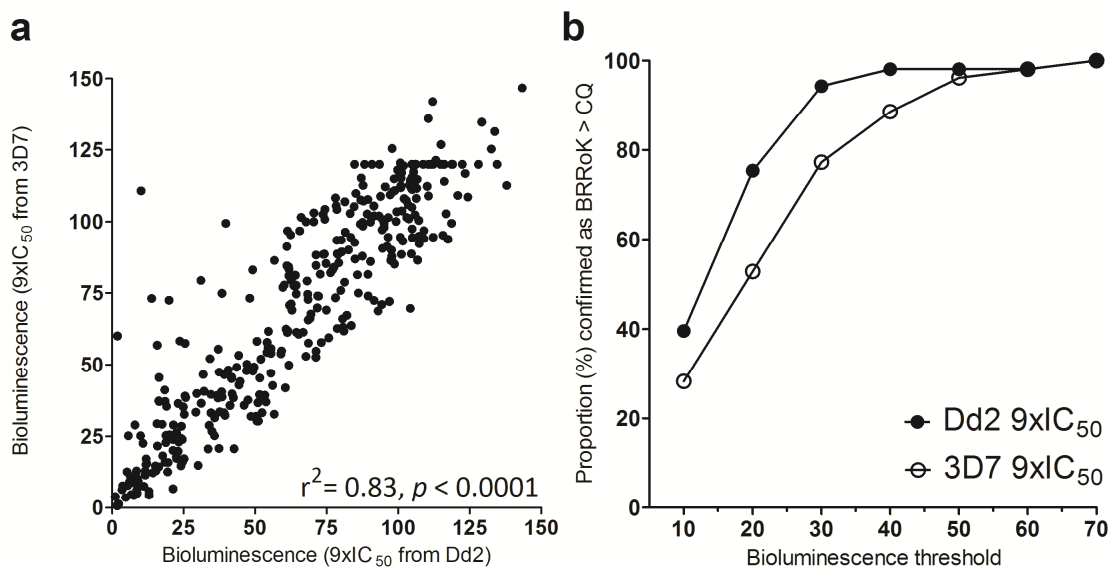
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641 **Figure 6.** Correlating mode of drug action with the BRRoK assay. Zero-meaned PC1 data for
 642 MMV compounds with predicted modes of action that target (i) bc_1 complex (blue filled
 643 square), (ii) DHODH (green unfilled square) and (iii) PfATP4 (red filled circles) are plotted
 644 against their IC_{50} .³² This figure appears in colour in the online version of *JAC* and in black and
 645 white in the print version of *JAC*. ATQ, atovaquone; CQ, chloroquine; DHA,
 646 dihydroartemisinin; MQ, mefloquine; PPQ, piperaquine; PYN, pyronaridine; QN, quinine.

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654

655 **Figure 7.** Scaling the BRRoK assay – the utility of a single concentration /single time point
 656 assay. **(a)** Chart illustrating the correlation between the bioluminescence signals (as a % of
 657 untreated control) when Dd2^{luc} is exposed to a 9xIC₅₀ concentration of MMV Malaria Box
 658 compound for 6 h – the x-axis representing data using Dd2 IC₅₀ data derived in this study,
 659 and the y-axis IC₅₀ data from a 3D7 clone (values provided with the Malaria Box resource)¹⁴.
 660 **(b)** Plot representing the proportion of the 53 compounds from the full BRRoK assay that
 661 show an initial rate of cytotoxic activity at least as good as that of chloroquine (CQ) that
 662 would be identified when the indicated thresholds of bioluminescence signal post-
 663 treatment are chosen. The two curves represent the bioluminescence signal thresholds
 664 when 9xIC₅₀ concentrations of either the Dd2 or 3D7 strains are used in this assay. Note that
 665 selection of a 50% bioluminescence threshold, irrespective of the source of the IC₅₀ data
 666 used in the single concentration/single time point assay, identifies >95% of the MMV
 667 compounds shown in this report to have an initial cytotoxic activity that would meet the
 668 minimal essential requirement for a TCP1 candidate.

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670

671 **Table 1.** IC₅₀^{48h}, LC₅₀^{6h} and EC₅₀^{6h} estimates determined using bioluminescence (Luc) and
 672 fluorescence (MSF) assay formats.

673

| | IC ₅₀ ^{48h} | | LD ₅₀ ^{48h} | | ED ₅₀ ^{6h} | |
|--------------------------|---------------------------------|---------------------|---------------------------------|---------------------|--------------------------------|-----------------|
| | Luc ¹ | MSF ² | Luc | MSF | Luc | MSF |
| Chloroquine ³ | 162 (150-174) ⁵ | 209 (156-232) | 1093 (895-1336) | 1163 (880-1431) | 1091 (906-1350) | nd ⁴ |
| Piperaquine | 37.0 (34.5-39.6) | 42.5 (34.1-52.8) | 339 (273-391) | 376 (224-547) | 351 (232-436) | nd |
| Mefloquine | 10.3 (8.9-11.9) | 11.4 (8.3-16.6) | 62.3 (51.2-75.8) | 74.7 (59.3-87.5) | 79.8 (52.4-92.1) | nd |
| Quinine | 306 (271-346) | 246 (205-295) | 1532 (1142-1953) | 2031 (1681-3053) | 1865 (1462-2055) | nd |
| Tafenoquine | 354 (285-441) | 373 (308-506) | 2356 (1950-2846) | 3207 (2215-4365) | 3169 (2465-3847) | nd |
| Dihydroartemisinin | 3.3 (3.2-3.5) | 4.1 (3.9-4.8) | 4.4 (3.9-5.0) | 6.8 (5.8-8.7) | 5.6 (4.6-6.2) | nd |
| Artemether | 5.5 (5.0-6.0) | 10.0 (9.1-10.9) | 6.7 (5.8-7.6) | 12.7 (10.8-14.9) | 7.8 (5.7-10.8) | nd |
| Atovaquone | 2.2 (1.9-2.6) | 2.6 (1.7-3.7) | 101 (73.1-142) | 187 (91.9-248) | nd | nd |

¹Bioluminescence luciferase assay ²Malaria Sybr Green Fluorescence assay

674 ³Mean (n≥6 measurements) in nM ⁴not determined ⁵95% Confidence intervals