

## Expansion of GTP cyclohydrolase I copy number in malaria parasites resistant to a pyrimidine biosynthesis inhibitor

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11 **Dihydroorotate dehydrogenase, resistance**

### 12 **Abstract**

13 Changes in the copy number of large genomic regions, termed copy number variations or CNVs,  
14 are an important adaptive strategy for malaria parasites. Numerous CNVs across the *Plasmodium*  
15 *falciparum* genome contribute directly to drug resistance or impact fitness of this protozoan  
16 parasite. CNVs that encompass the dihydroorotate dehydrogenase (DHODH) gene confer  
17 resistance to antimalarials that target this enzyme in the pyrimidine biosynthesis pathway (i.e.  
18 DSM1). During the characterization of DSM1 resistant parasite lines with DHODH CNVs, we  
19 detected selection of an additional CNV that encompasses 3 genes (~5 kb) including GTP  
20 cyclohydrolase I (GCH1 amplicon). While this locus has been implicated in increased fitness of  
21 antifolate resistant parasites, GCH1 CNVs had not previously been reported to contribute to  
22 resistance to other antimalarials. Here, we further explored the association between GCH1 and  
23 DHODH copy number. We visualized single long reads and directly quantified the number of  
24 tandem GCH1 amplicons in a parental line versus a DSM1-selected line. We found that the  
25 GCH1 amplicons share a consistent structure in all lines. However, we detected more reads that  
26 encompassed a higher number of amplicons in the resistant (up to 7 amplicons) compared to the  
27 parental line (3 amplicons). To better understand the implications of this result, we evaluated  
28 variation at this locus across multiple short- and long-read data sets collected from various  
29 parasite lines. Based on our analysis of parasites resistant to other DHODH inhibitors (DSM265,  
30 DSM267, and DSM705), GCH1 is not likely contributing directly to resistance; however, higher  
31 numbers of the GCH1 amplicon are associated with increased DHODH copies and may  
32 compensate for changes in metabolism of parasites. This is supported by the direct connection  
33 between folate and pyrimidine metabolism, which together contribute to nucleic acid  
34 biosynthesis. This study highlights the importance of studying clonal variation and potential  
35 biochemical connections as novel antimalarials move closer to clinical approval.

36

## 37 Introduction

38 Malaria is a disease caused by the protozoan *Plasmodium* parasite. *Plasmodium falciparum* is the  
39 leading cause of human malaria deaths (Rich et al., 2009). Due to lack of effective vaccines  
40 against malaria infection, antimalarial drugs are the primary approach for malaria treatment  
41 (Casares et al., 2010). However, drug efficacy is mitigated by the frequent emergence of  
42 antimalarial resistant parasites (Blasco et al., 2017).

43 Changes in the copy number of large genomic regions, termed copy number variations, or CNVs,  
44 are an important adaptive strategy for malaria parasites (Kidgell et al., 2006; Conway, 2007;  
45 Hyde, 2007; Ribacke et al., 2007; Nair et al., 2008; Cheeseman et al., 2009; Bopp et al., 2013;  
46 Guler et al., 2013; Menard and Dondorp, 2017). Numerous CNVs across the *P. falciparum*  
47 genome contribute directly to drug resistance or impact parasite fitness (Hyde, 2007; Ribacke et  
48 al., 2007; Nair et al., 2008; Guler et al., 2013). Amplification, one type of CNV with increased  
49 copy number, plays an essential role in the evolution of resistance to various antimalarials (Foote  
50 et al., 1989; Wilson et al., 1993; Hyde, 2007; Ribacke et al., 2007; Cheeseman et al., 2009; Guler  
51 et al., 2013; Heinberg et al., 2013; Osei et al., 2018). As one example, amplification of the  
52 dihydroorotate dehydrogenase (DHODH) gene in the *P. falciparum* genome confers resistance to  
53 DHODH inhibitors (i.e. DSM1) in parasites propagated in vitro (Guler et al., 2013). DHODH is  
54 an important enzyme in the *P. falciparum* pyrimidine biosynthesis pathway that contributes  
55 resources for nucleic acid synthesis (Phillips and Rathod, 2010; Mandt et al., 2019). DHODH  
56 amplicons presumably increase transcription and translation of the drug target to directly impact  
57 drug sensitivity (Guler et al., 2013).

58 In another example, amplification of the GTP cyclohydrolase 1 (GCH1) gene increases the  
59 fitness of clinical parasite populations that are antifolate resistant (i.e. pyrimethamine and  
60 sulfadoxine) (Kidgell et al., 2006; Ribacke et al., 2007; Nair et al., 2008; Osei et al., 2018).  
61 GCH1 is the first enzyme in the folate biosynthesis pathway and increased levels of this enzyme  
62 likely increases flux to compensate for the fitness costs of the resistance-conferring  
63 dihydropteroate synthase (DHPS) and dihydrofolate synthase (DHFS) mutations (Kidgell et al.,  
64 2006; Nair et al., 2008; Heinberg et al., 2013). Although the contribution of GCH1 amplification  
65 to antifolate resistance is well studied, this CNV has not been reported to contribute to resistance  
66 to antimalarials targeting other pathways (Heinberg et al., 2013; Kümpornsinn et al., 2014;  
67 Heinberg and Kirkman, 2015).

68 Typically, gene copy number is studied using widely accessible high coverage short read  
69 sequencing (Guler et al., 2013; Herman et al., 2014; Manary et al., 2014; Cowell et al., 2018;  
70 Huckaby et al., 2018). However, this approach has limitations including non-unique mapping in  
71 repetitive regions, the inability to resolve complex genomic regions, and overall difficulty of  
72 detecting structural variations (Alkan et al., 2011; Treangen and Salzberg, 2012; Kosugi et al.,  
73 2019). These challenges are exacerbated by the high AT-content of the *P. falciparum* genome  
74 (Beghain et al., 2016; Miles et al., 2016). Long read technologies such as Oxford Nanopore  
75 sequencing have the potential to span low complexity and repetitive regions to better represent  
76 structural variation (Cretu Stancu et al., 2017; Sedlazeck et al., 2018a, 2018b; Ho et al., 2020).  
77 Moreover, the single molecule sequencing allows examination of clonal heterogeneity of a  
78 parasite population (Belikova et al., 2020; Rugbjerg et al., 2021).

79 In this study, we identified a potential positive association between GCH1 and DHODH copy  
80 number from previously acquired short read sequencing data. To explore this relationship  
81 further, we performed long read sequencing and directly observed the expansion of the GCH1  
82 amplicon. Using single long read visualization, we also determined that the structure and  
83 orientation of the amplicon was preserved during expansion. When we evaluated short read data  
84 from parasite lines that were resistant to other DSM-based compounds, we did not detect  
85 increases in GCH1 copy number. This result indicates that GCH1 does not contribute directly to  
86 resistance; however, our observations, as well as the biochemical connection between folate and  
87 pyrimidine biosynthesis, suggest that increased copies of GCH1 may facilitate the acquisition of  
88 increased DHODH copy number under certain selection conditions. Further study of the  
89 relationship between these two genomic loci is important considering the imminent use of  
90 DHODH inhibitors to treat clinical malaria.

## 91 **Materials and Methods**

### 92 **DSM1 and parasite clones**

93 DSM1 is a triazolopyrimidine antimalarial that specifically and potently inhibits the *P.*  
94 *falciparum* dihydroorotate dehydrogenase enzyme of pyrimidine biosynthesis (Phillips et al.,  
95 2008). DSM1-resistant parasites were previously selected according to the scheme depicted in  
96 **(Figure 1)** (Guler et al., 2013). In this study, we simplified the naming scheme to represent low  
97 (L), moderate (M), and high (H) levels of resistance to DSM1 **(Figure 1A)**.

### 98 **Parasite culture**

99 We thawed erythrocytic stages of *P. falciparum* (*Dd2*, MRA-150; *3D7*, MRA-102, Malaria  
100 Research and Reference Reagent Resource Center, BEI Resources and DSM1 resistant clones as  
101 highlighted in **Figure 1A**, a generous gift from Pradipsinh Rathod, University of Washington)  
102 from frozen stocks and maintained them as previously described (Haynes et al., 1976). Briefly,  
103 we grew parasites at 37 °C in vitro at 3% hematocrit (serotype A positive human erythrocytes,  
104 Valley Biomedical, Winchester, VA) in RPMI 1640 medium (Invitrogen, USA) containing  
105 24 mM NaHCO<sub>3</sub> and 25 mM HEPES, and supplemented with 20% human type A positive heat  
106 inactivated plasma (Valley Biomedical, Winchester, VA) in sterile, sealed flasks flushed with  
107 5% O<sub>2</sub>, 5% CO<sub>2</sub>, and 90% N<sub>2</sub> (Guler et al., 2013). We maintained the cultures with media  
108 changes every other day and sub-cultured them as necessary to keep parasitemia below 5%. We  
109 determined all parasitemia measurements using SYBR green-based flow cytometry (Bei et al.,  
110 2010). We routinely tested cultures using the LookOut Mycoplasma PCR Detection Kit (Sigma-  
111 Aldrich, USA) to confirm negative Mycoplasma status.

### 112 **DNA extraction for long read sequencing**

113 We lysed asynchronous *P. falciparum*-infected erythrocytes with 0.15% saponin (Sigma-Aldrich,  
114 USA) for 5 min at room temperature and washed them three times with 1× PBS (diluted from  
115 10× PBS Liquid Concentrate, Gibco, USA). We then lysed parasites with 0.1% Sarkosyl  
116 Solution (Bioworld, bioPLUS, USA) in the presence of 1 mg/ml proteinase K (from *Tritirachium*  
117 *album*, Sigma-Aldrich, USA) overnight at 37 °C. We first extracted nucleic acids with  
118 phenol/chloroform/isoamyl alcohol (25:24:1) pH 8.0 (Sigma-Aldrich, USA) three times using  
119 1.5 ml light Phase lock Gels (5Prime, USA), then further extracted nucleic acids with chloroform

120 twice using 1.5 ml light Phase lock Gels (5Prime, USA). Lastly, we precipitated the DNA with  
121 ethanol using the standard Maniatis method (Maniatis et al., 1989). To obtain high molecular  
122 weight genomic DNA, we avoided any pipetting during the extraction, transferred solutions by  
123 directly pouring it from one tube to another, and mixed solutions by gently inverting the tubes.

## 124 **Oxford Nanopore long read sequencing and analysis**

125 We subjected 1 µg of high molecular weight genomic DNA from each sample to library  
126 preparation for Oxford Nanopore sequencing following the Nanopore Native barcoding genomic  
127 DNA protocol (version: NBE\_9065\_v109\_revAB\_14Aug2019) with 1x Ligation Sequencing kit  
128 (SQK-LSK109, Oxford Nanopore Technologies, Oxford, UK). We performed DNA repair and  
129 end preparation using NEBNext FFPE DNA Repair Mix (New England Biolabs, Ipswich, MA,  
130 USA) and NEBNext End Repair/dA-Tailing Module (New England Biolabs, Ipswich, MA,  
131 USA). We cleaned the A-tailed fragments using 0.9X AMPure XP beads (Beckman Coulter,  
132 High Wycombe, UK). We then ligated barcodes to the end-prepped DNA using the Native  
133 Barcoding Expansion 1–12 kit (EXP-NBD104, Oxford Nanopore Technologies, Oxford, UK)  
134 and Blunt/TA Ligase Master Mix (New England Biolabs, Ipswich, MA, USA). We cleaned the  
135 barcoded samples using 0.9X AMPure XP beads. Then we pooled barcoded samples in  
136 equimolar ratios and subjected to an adaptor ligation step, using the Adapter Mix II from the  
137 Native Barcoding Expansion 1–12 kit and NEBNext Quick Ligation Reaction Buffer (New  
138 England Biolabs, Ipswich, MA, USA) as well as Quick T4 DNA Ligase (New England Biolabs,  
139 Ipswich, MA, USA). After adaptor ligation, we cleaned the library using AMPure XP beads. We  
140 quantified the adapter ligated and barcoded DNA using a Qubit fluorimeter (Qubit 1X dsDNA  
141 High Sensitivity Assay Kit, Life Technologies, Carlsbad, CA). We sequenced the WT1 and  
142 initial H2 libraries using a R9.4.1 flow cell (FLO-MIN106D, Oxford Nanopore Technologies,  
143 Oxford, UK) on MinION (Oxford Nanopore Technologies, Oxford, UK) and another H2 library  
144 using the R10 flow cell (FLO-MIN111) on MinION. To obtain the maximum number of reads,  
145 we ran both flow cells for 48 h (controlled and monitored using the MinKNOW software  
146 (3.6.5)).

147 For base calling and demultiplexing of the Nanopore sequencing reads, we used Guppy (version  
148 3.4.5+fb1fbfb) with the parameter settings “-c dna\_r9.4.1\_450bps\_hac.cfg --barcode\_kits "EXP-  
149 NBD104" -x auto” for samples sequenced with R9.4.1 flow cell and “-c  
150 dna\_r10\_450bps\_hac.cfg -x auto” for the sample sequenced with R10 flow cell. We checked the  
151 read length and read quality using “Nanoplot” (version 1.0.0) (see **Supplementary Table 1**). We  
152 trimmed the adapters with “qcat” (version 1.1.0) (Oxford Nanopore Technologies) and filtered  
153 the reads with a cutoff “length ≥ 500 and Phred value ≥ 10” using the program “filtlong version  
154 0.2.0” (<https://github.com/rrwick/Filtlong>). To estimate the coverage of sequencing reads in each  
155 sample, we aligned the filtered reads to *Plasmodium falciparum* 3D7 reference genome using  
156 “minimap2” (version 2.17) (Li, 2018). “QualiMap” (version 2.2.1) (García-Alcalde et al., 2012)  
157 was used to calculate the coverage of the aligned reads (see **Supplementary Table 1**).

## 158 **Shiny analysis of long reads**

159 To visualize structural variants in the parasite genome, we used a custom R Shiny script to plot  
160 the arrangement of reference gene segments on individual Nanopore reads (Ebel et al., 2023).  
161 Briefly, we defined a target region in the 3D7 reference genome (chromosome 12: 932916 bp –



162 999275 bp) that contained 3 genes in GCH1 amplicon and 11 flanking genes. We extracted the  
163 reference sequences of these genes and subsequent intergenic regions, then split these sequences  
164 into fragments of 500-1000 base pairs. We compared these fragments to individual Nanopore  
165 reads using BLAST (Ye et al., 2006). We used the BLAST output as input for a custom R script,  
166 which drew rectangles representing homology between the defined genes (y-axis) and each  
167 individual read (x-axis). The percent identity required to draw a homologous rectangle was  
168 allowed to vary between reads, which varied in quality, using a slider in the Shiny app. To filter  
169 out long reads with potentially spurious hits to gene fragments, we also used BLAST to compare  
170 Nanopore reads to the reference genome and removed reads with <90% identity to chromosome  
171 12. To compare the mean copy number of GCH1 amplicon between WT1 and H2 reads covering  
172 GCH1 as well as the read length of these reads between WT1 and H2, we performed a one way  
173 ANOVA in Microsoft Excel with Alpha value of 0.05.

#### 174 **Short read sequencing analysis and CNV detection**

175 We analyzed CNVs in Illumina short read datasets of *P. falciparum* parasites selected by three  
176 DSM antimalarial drugs (DSM1, DSM265, DSM267, and DSM705, **Supplementary Table 2**)  
177 (Guler et al., 2013; Mandt et al., 2019; Palmer et al., 2021). We first processed and mapped the  
178 reads to reference genome as previously described (Huckaby et al., 2018; Liu et al., 2021).  
179 Briefly, we trimmed Illumina adapters from reads with BBDuk tool in BBMap (version 38.57)  
180 (Bushnell 2016). We aligned each fastq file to the 3D7 *P. falciparum* reference genome with  
181 Speedseq (version 0.1.0) through BWA-MEM alignment (Chiang et al., 2015). We discarded the  
182 reads with low-mapping quality score (below 10) and removed duplicated reads using Samtools  
183 (version 1.10) (Li et al., 2009). We analyzed split and discordant reads from the mapped reads  
184 using LUMPY in Speedseq to determine the location and length of the previously reported  
185 GCH1, DHODH and multidrug resistance protein 1 (MDR1) CNVs (**Supplementary Table 2**)  
186 (Layer et al., 2014). For read-depth analysis, we further filtered the mapped reads using a  
187 mapping quality score of 30. To determine the copy number of the GCH1, DHODH and MDR1  
188 CNVs, we used CNVnator (version 0.4.1) with a bin size of 100 bp; the optimal bin size was  
189 chosen to detect GCH1 CNVs in all analyzed samples (Abyzov et al., 2011).

#### 190 **Droplet Digital PCR**

191 Prior to Droplet Digital (dd) PCR, we digested DNA with restriction enzyme RsaI (Cut Site:  
192 GT/AC) following the manufacturer's instructions (New England Biolabs, Ipswich, MA, USA)  
193 in 37°C incubation for one hour. We selected the restriction enzyme RsaI to cut outside of the  
194 ddPCR amplified regions of desired genes and separate copies of CNVs to be distributed into  
195 droplets. We diluted the digested DNA for ddPCR reactions. We performed ddPCR using  
196 ddPCR Supermix for Probe (no dUTP, Bio-Rad Laboratories, California, USA) with DNA input  
197 0.1 ng (in duplicate per sample), 0.025 ng (in duplicate per sample) as previously described  
198 (McDaniels et al., 2021). The primers and probes used in reactions are included in  
199 **Supplementary Table 3**. The PCR protocol for probe-based assay was 95°C for 10 min,  
200 followed by 40 rounds of 95°C for 30 sec and 60°C for 1 min. Seryl-tRNA synthetase and  
201 calcium-transporting ATPase (ATP6) served as a single copy reference genes on chromosome 7  
202 and chromosome 1 respectively; dihydroorotate dehydrogenase (DHODH) and GTP  
203 cyclohydrolase 1 (GCH1) are multi-copy genes (**Supplementary Table 3**). We performed  
204 droplet generation and fluorescence readings per the manufacturer's instructions. For each

205 reaction, we required a minimum number of 10,000 droplets to proceed with analysis. We  
206 calculated the ratio of positive droplets containing a single- (ATP6) or multi-copy gene (GCH1,  
207 DHODH) versus a single-copy gene (Seryl-tRNA synthetase) using the Quantasoft analysis  
208 software (QuantaSoft Version 1.7, BioRad Laboratories) and averaged between independent  
209 replicates.

## 210 **Results**

211 Through expanded analysis of short read data from a family of parasites selected with DSM1,  
212 originally presented in (Guler et al., 2013) (**Figure 1A**), we noticed a potential positive  
213 association between GCH1 and DHODH copy number (**Figure 1B**). Using droplet digital PCR  
214 on analogous parasite lines that had recently been propagated in our laboratory, we confirmed  
215 that GCH1 copy number trended higher as DHODH copy number increased (**Table 1**). Due to  
216 the relationship between these parasite lines (**Figure 1A**), we were unable to perform statistics  
217 on these data.

218 We conducted long read sequencing to more precisely define GCH1 copy number and amplicon  
219 structure in the parental line versus one DSM1-selected line (WT1 and H2, **Supplementary**  
220 **Table 1**). We directly visualized single reads using an app that represents gene segments of  
221 individual Nanopore reads (Materials and Methods). Small amplicons, like those including  
222 GCH1, are especially conducive to this approach because long reads span multiple copies of the  
223 amplicon as well as both up and downstream regions. Read visualization showed that two 3-gene  
224 amplicons, separated by an inversion of the same gene set, were conserved between the parental  
225 and H2 line (**Figure 2A and B**). This amplicon structure was reported previously in the WT1  
226 (*Dd2*) parental line (**Figure 2C**) (Kidgell et al., 2006).

227 Using read visualization, we also manually recorded the number of GCH1 amplicon units  
228 (depicted in **Figure 2C**) from both spanning and non-spanning reads (**Figure 3A**,  
229 **Supplementary Table 4**). We consistently detected 3 amplicon units per read from the parental  
230 line. However, we observed more reads that encompassed a higher number of GCH1 amplicon  
231 units in the H2 selected line (up to 7 units). If only considering spanning reads, that is those  
232 covering both upstream and downstream of the amplicon, the difference between WT1 and H2  
233 mean copy number is significantly different ( $F(1,10)=[75]$ ,  $p = 5.84E-06$ ). There was not a  
234 significant difference in mean read lengths used in the GCH1 analysis ( $F(1,34)=[1.07]$ ,  $p = 0.31$ ,  
235 **Figure 3B**), indicating that a skewed read distribution was not contributing to this difference. All  
236 groups of amplicons from the H2 line began with a set of 3 amplicon units, as observed in the  
237 parental line, followed by groups of 2 amplicon units where one was inverted and the other was  
238 in normal orientation (**Figure 2C**).

239 To better understand whether variation in copy number of the GCH1 locus was common in other  
240 laboratory-adapted parasite lines, we evaluated several additional long read-based datasets  
241 (**Supplementary Table 4, Supplementary Methods**, Vembar et al., 2016). In general, different  
242 parasite lines exhibited different GCH1 amplicon sizes as expected (i.e. *Dd2* versus *3D7*, as  
243 reported previously (Kidgell et al., 2006)) but the amplicon copy number was relatively stable  
244 across diverse datasets; we detected ~10-25% of reads above the expected copy number for each  
245 respective line. This is in contrast to the H2 line that had >50% of reads that depicted amplicon  
246 copy numbers greater than the expected copy number for a *Dd2*-derived line.

247 To investigate whether an increase in GCH1 amplicons was contributing to resistance of  
248 DHODH inhibitors in general, we evaluated the copy number of GCH1 amplicons from parasites  
249 selected with other DSM derivatives (Mandt et al., 2019; Palmer et al., 2021). Contrary to  
250 DSM1-selected parasites, we did not detect increases in GCH1 amplicon number in parasites  
251 resistant to DSM265, DSM267, or DSM705 (compared to parental *Dd2* or *3D7* parasite lines,  
252 **Figure 4A-4C, Supplementary Table 5**). For this analysis, we only included resistant parasite  
253 lines that carried DHODH amplicons. When we compiled the data for each parasite line together,  
254 those that harbored more DHODH amplicons generally maintained higher numbers of GCH1  
255 amplicons and this association was more prominent in *Dd2*-derived parasite lines than *3D7*-  
256 derived parasite lines (**Figure 4D** and **4E**).

## 257 Discussion

258 We found that GCH1 copy number is positively associated with DHODH copy number in  
259 parasites resistant to DSM1. This association was initially detected using both short-read  
260 sequencing as well as an accurate PCR-based method ddPCR (**Figures 1B and 4, Table 1**);  
261 however, limitations in each of these methods contributes to inaccuracies in these results. For  
262 example, because the GCH1 amplicon is small (~5kb), copy number analysis using short reads  
263 requires small stretches of the genome to be combined, or binned, together; smaller sized bins in  
264 general leads to higher levels of variation in CNV calling and potentially false differences.  
265 Furthermore, DNA fragmentation and restriction digestion can alter distribution of DNA  
266 fragments into oil droplets during ddPCR, thus limiting copy number quantification.  
267 Additionally, both of these methods result in an average value for the entire population of  
268 parasites.

269 We therefore utilized long-read sequencing combined with a custom visualization tool (Ebel et  
270 al., 2023) to directly quantify the copy number of this locus and assess the structure of the GCH1  
271 amplicon (**Figures 2 and 3**). Each long read represents a DNA strand from a single parasite  
272 genome and therefore, this approach is an accurate way to visualize copy number heterogeneity  
273 across a population of haploid parasites. We considered whether our detection of more GCH1  
274 amplicons on reads from the H2 line (**Figure 3A**) was related to Nanopore sample preparation or  
275 natural variation during in vitro culture. We excluded differences in sample preparation because  
276 the parental and H2 long read sequencing runs had similar N50s and read length distributions  
277 (**Supplementary Table 4, Figure 3B**). While we did observe a low level of variation at the  
278 GCH1 locus in different parasite lines that were grown independently (~10-25% of reads), the  
279 variation in copy number in the H2 line was well above this level (>50% of reads,  
280 **Supplementary Table 5**). This observation, combined with the visualization of up to 7 tandem  
281 amplicons in a single read (**Figure 2B**), provides direct evidence for GCH1 amplicon expansion  
282 in the DSM1 resistance context.

283 GCH1 amplicons have previously only been associated with antifolate resistance (Kidgell et al.,  
284 2006; Nair et al., 2008; Heinberg et al., 2013; Kumpornsin et al., 2014; Heinberg and Kirkman,  
285 2015; Osei et al., 2018). An increase in flux through the folate biosynthesis pathway alleviates  
286 fitness effects of mutations that confer pyrimethamine and sulfadoxine resistance (Kidgell et al.,  
287 2006; Nair et al., 2008; Kumpornsin et al., 2014; Heinberg and Kirkman, 2015; Osei et al.,  
288 2018). A similar contribution to resistance to DHODH inhibitors would not be surprising, given  
289 the close connection of the folate and pyrimidine biosynthesis pathways (**Figure 5**); they both

290 contribute to nucleotide biosynthesis and converting dUMP to dTMP requires conversion of N<sup>5</sup>,  
291 N<sup>10</sup>-methylene-THF to DHF.

292 Although not required for resistance to all DHODH inhibitors (**Figure 4A-C, Supplementary**  
293 **Table 5**), we speculate that a change in GCH1 copy number arose serendipitously during DSM1  
294 selection and further increases were beneficial for parasite fitness. Increased copies of GCH1  
295 may facilitate the acquisition of increased DHODH copy numbers, especially under specific  
296 conditions. For example, DSM1 selections were uniquely performed in media supplemented  
297 with 20% human serum as opposed to AlbuMAX II (**Supplementary Table 5**) (Guler et al.,  
298 2013). It is possible that the presence of folate precursors in different media formulations  
299 changes the parasite's dependence on folate biosynthesis and thus, GCH1 flux. Levels of para-  
300 amino benzoic acid (pABA) can vary widely in human serum while the common AlbuMAX  
301 serum replacement contains no additional pABA (Chulay et al., 1984; Watkins et al., 1985;  
302 Wang et al., 1986; Salcedo-Sora et al., 2011; Valenciano et al., 2019). These environments likely  
303 exert different selective pressures on parasites during drug selection as reported previously  
304 (Kumar et al., 2021); higher pABA levels in human serum may drive positive selection for  
305 higher GCH1 copy numbers and hold extra benefits by contributing to both folate and pyrimidine  
306 biosynthesis (**Figure 5**). Of note, our observation of some level of variation in standard parasite  
307 lines (**Supplementary Table 4**) suggests that growth environment could drive changes at this  
308 locus.

309 Another factor that could contribute to GCH1 evolution is genetic background. The *Dd2* parasite  
310 line (and its parent line, *W2*) were isolated in Southeast Asia (Oduola et al., 1988; Wellems et al.,  
311 1990), where antifolates were widely used. Consequently, *W2* and *Dd2* carry 5 mutations in  
312 folate biosynthesis enzymes (DHPS and DHFR). The *3D7* line originated in Africa (Walliker et  
313 al., 1987) and is wild type at these loci. In our studies, we observed a positive association of copy  
314 numbers between DHODH and GCH1 in *Dd2* versus *3D7* parasite lines (**Figure 4D and 4E**),  
315 indicating that mutant backgrounds may rely more heavily on the GCH1 CNV to alleviate fitness  
316 effects for resistance to both antifolates and DHODH inhibitors.

317 Importantly, DSM265 has entered clinical trial for the treatment of clinical malaria (Mandt et  
318 al., 2019). Antifolate resistance and GCH1 CNVs are widespread in clinical isolates (Kidgell et  
319 al., 2006; Ribacke et al., 2007; Nair et al., 2008; Osei et al., 2018), thus, necessitating further  
320 evaluation of the contribution of GCH1 in parasites that are resistant to DHODH inhibitors.

## 321 **Conflict of Interest**

322 The authors declare that the research was conducted in the absence of any commercial or  
323 financial relationships that could be construed as a potential conflict of interest.

## 324 **Author Contributions**

325 S.L and J.L.G. designed the study and wrote the manuscript. S.L., N.E. and J.K performed the  
326 experiments and data analysis. E.R.E developed the Shiny application and provided instructions  
327 for using the application. E.R.E. and E.S.E. edited and reviewed the manuscript. E. Y. and T. B.  
328 conducted the experiment described in the Supplementary Methods and wrote the Supplementary  
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## 345 **Supplementary Material**

346 The Supplementary Tables and Supplementary Methods for this article can be found in  
347 Supplementary files

## 348 **Data Availability Statement**

349 The nucleotide sequences obtained in the present study have been deposited in the Sequenced  
350 Read Archive (SRA) database under the accession number PRJNA820055.

## 351 **Abbreviations**

352 CNV, copy number variation; DHODH, dihydroorotate dehydrogenase; DSM1, 5-Methyl-N-(2-  
353 naphthyl)[1,2,4]triazolo[1,5-a]pyrimidin-7-amine; DHPS, dihydropteroate synthase; DHFS,  
354 dihydrofolate synthase; GCH1, GTP cyclohydrolase 1; MDR1, multidrug resistance protein 1;  
355 ddPCR, Droplet Digital PCR; ATP6, calcium-transporting ATPase; pABA, para-amino benzoic  
356 acid; SD, standard deviation; 50S RPL24, 50S ribosomal protein L24; YHM2,  
357 citrate/oxoglutarate carrier protein; Gln, Glutamine; DHO, Dihydroorotate; UMP, Uridine  
358 monophosphate; dUMP, Deoxyuridine monophosphate; dTMP, deoxythymidine  
359 monophosphate; GTP, Guanosine-5'-triphosphate; DHF, Dihydrofolate; THF, Tetrahydrofolate;  
360 HMDP-P2, 6-hydroxymethyl-7, 8-dihydropterin diphosphate; 5, 10-CH<sub>2</sub>-THF: 5,10-  
361 Methylenetetrahydrofolate.

362

## 363 **Tables**

364 **Table 1. Positive GCH1:DHODH association is validated using Droplet Digital PCR on**  
365 **modern parasite lines.**

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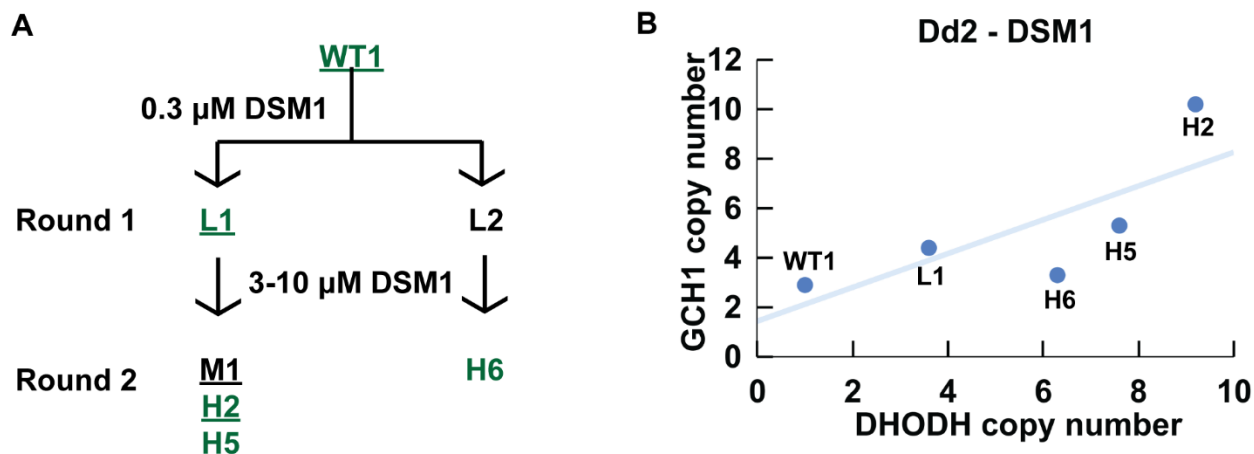
Line	Sample type	Average copy number (SD)*			GCH1 CN relative to parent	DHODH CN relative to parent
		GCH1	DHODH	ATP6		
WT1	Parent	2.5 (0.2)	0.8 (0.1)	1.1 (0.0)	1.0	1.0
L1	Round 1 selection	3.9 (0.3)	3.2 (0.1)	1.0 (0.1)	1.6	4
M1	Round 1 selection	3.9 (0.1)	5.2 (0.3)	1.0 (0.1)	1.6	6.5
H2	Round 2 selection	4.6 (0.2)	6.0 (0.3)	1.1 (0.1)	1.8	7.5
H5	Round 2 selection	4.3 (0.3)	7.0 (0.4)	1.0 (0.1)	1.7	8.8

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366 \*The average copy number is calculated by comparing ddPCR signal to a single copy gene  
367 signal (Seryl tRNA synthetase, PF3D7\_0717700). N=4. ATP6 copy number is expected to be 1  
368 in all parasite lines.

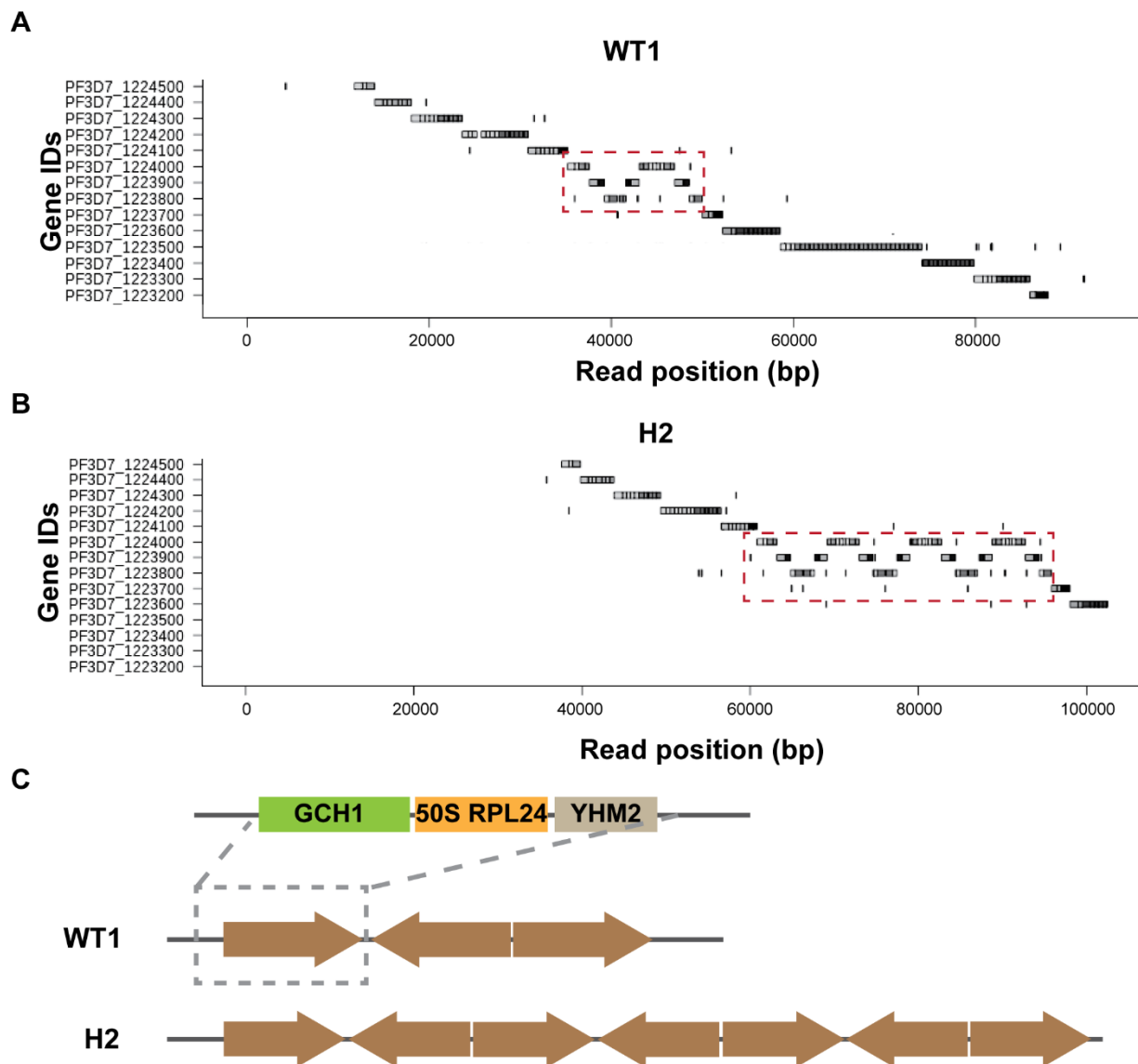
369

370 **Figures**



371 **Figure 1. GCH1 copy number increase is positively correlated with DHODH copy number**  
372 **in one family of DSM1 resistant parasites.** (A) Schematic depicting DSM1 selections, as  
373 presented previously (Guler et al. PLoS Pathogens 2013). Green: Illumina short read sequenced  
374 lines. Underline: modern lines confirmed by ddPCR analysis. Wild-type (WT1, *Dd2*) *P.*  
375 *falciparum* was selected with DSM1 in two steps; the first step selected for low-level (L)  
376 resistance and the second step selected for moderate- (M) or high-level (H) resistance. DSM1  
377 EC50 values are as follows: L1 (1  $\mu$ M), L2 (0.9  $\mu$ M), M1 (7.2  $\mu$ M), H2 (85  $\mu$ M), H5 (56  $\mu$ M),  
378 H6 (49  $\mu$ M). All values were previously reported in and clone names adapted from (Guler et al.,  
379 2013). (B) Relationship between GCH1 and DHODH copy number in DSM1 selected parasites  
380 as quantified using short read data from Guler et al. 2013. A trendline was added to show the  
381 relationship between GCH1 and DHODH copy numbers but a correlation coefficient could not  
382 be calculated due to the small sample size (n=5) and dependence among the lines.

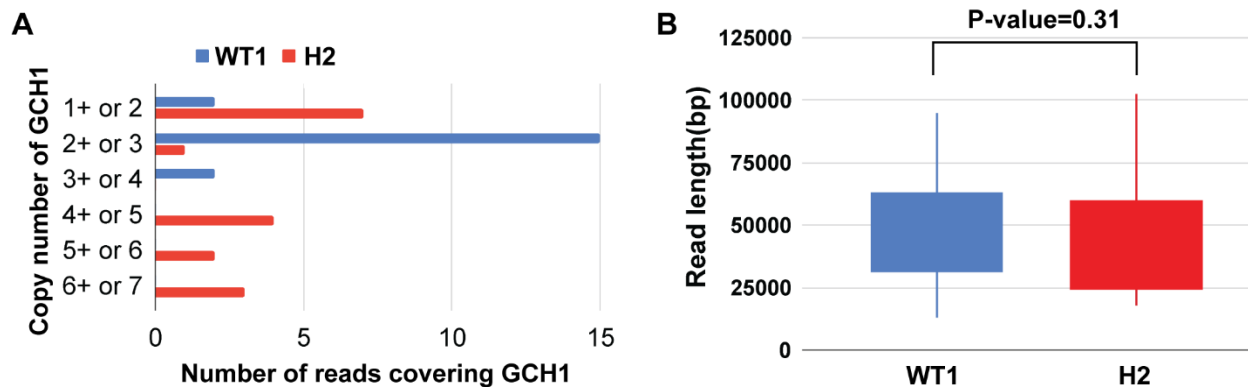
383



384 **Figure 2. Long-read visualization shows GCH1 amplicon has the same boundaries and**  
 385 **structure in a DSM1 resistant parasite line. (A) and (B)** Representative images from the Shiny  
 386 app comparing the GCH1 amplicon in WT1 and H2 reads (alignment to the *3D7* reference  
 387 genome with no GCH1 amplicon represented). Red dashed square: GCH1 amplicon. Each gene  
 388 sequence was split into  $\leq 500$  bp fragments and blasted against individual Nanopore reads  
 389 (darker: genic regions, lighter: intergenic regions). (C) Diagram of amplicon orientation in  
 390 GCH1 amplicon for WT1 and H2 parasite lines. The three genes within the GCH1 amplicon unit  
 391 include PF3D7\_1224000 (GTP cyclohydrolase I, GCH1), PF3D7\_1223900 (50S ribosomal  
 392 protein L24, putative, 50S RPL24), and PF3D7\_1223800 (citrate/oxoglutarate carrier protein,  
 393 putative, YHM2).

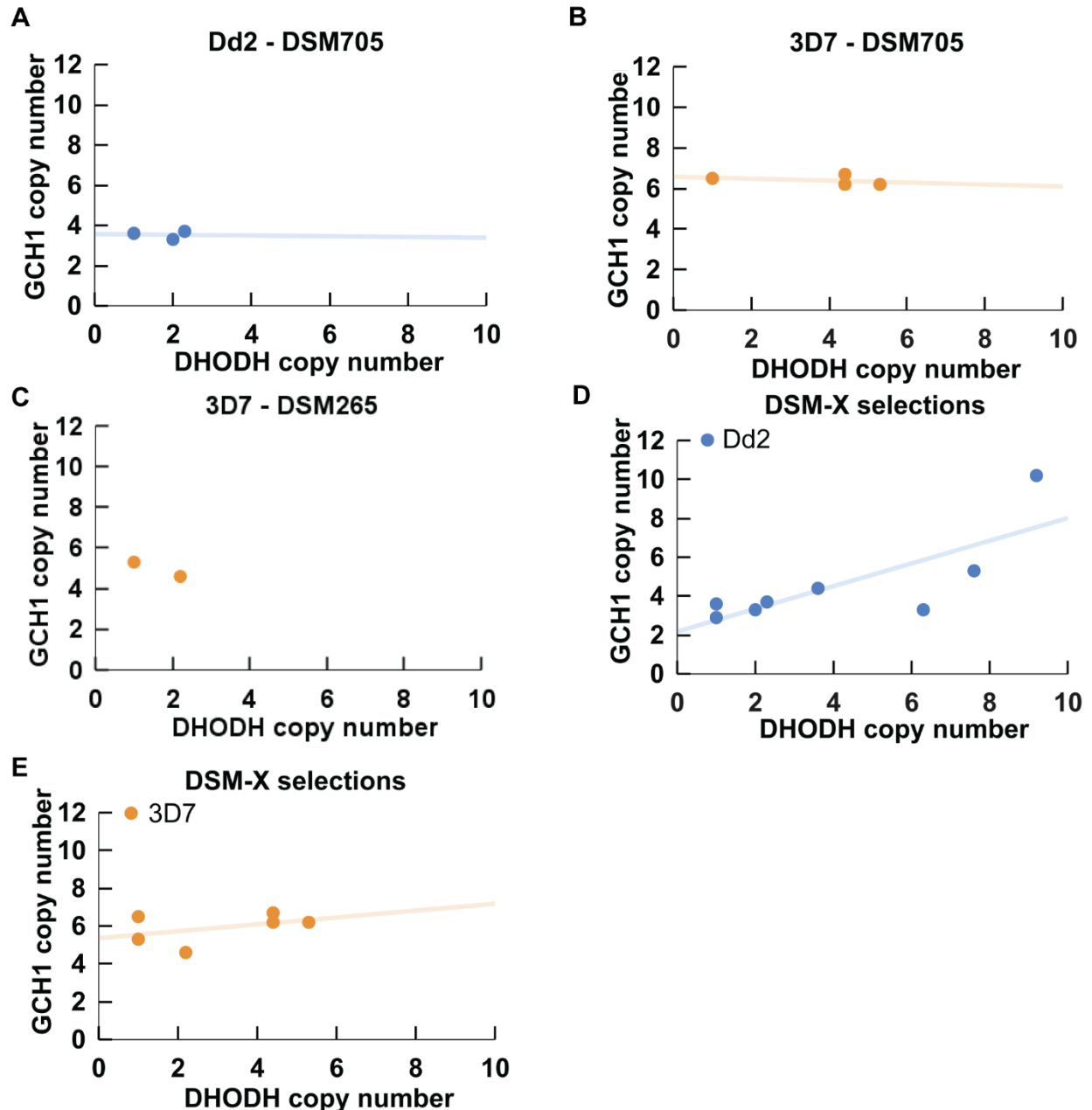
394



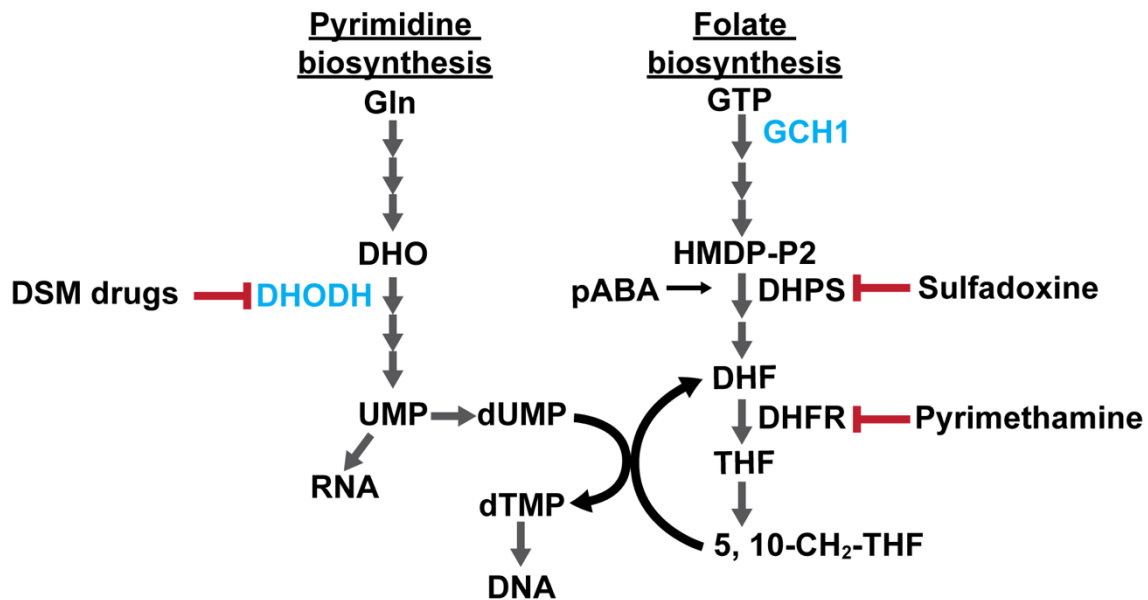


395 **Figure 3. Quantification of long reads displays greater variability and increase in GCH1**  
396 **amplicon number in DSM1 resistant parasites.** Copy number (A) and read length (B)  
397 distributions from Nanopore long reads ( $\geq 5$ kb) covering the GCH1 amplicon in WT1 and H2  
398 parasite line. A one-way ANOVA revealed that there was not a significant difference in mean  
399 read length between WT1 and H2 ( $F(1,34)=[1.07]$ ,  $p = 0.31$ ).

400



401 **Figure 4. Parasite lines with more DHODH amplicons generally have more GCH1**  
402 **amplicons.** (A) Relationship between GCH1 and DHODH copy number in *Dd2* parent line and  
403 DSM705 selected lines. (B) Relationship between GCH1 and DHODH copy number in *3D7*  
404 parent line and DSM705 selected lines. (C) Relationship between GCH1 and DHODH copy  
405 number in *3D7* parent line and DSM265 selected lines. (D) Relationship between GCH1 and  
406 DHODH copy number in *Dd2* parent line and DSM1, DSM705, DSM265-selected lines. Data  
407 from DSM1 selected lines are represented in Figure 1B as well. (E) Relationship between GCH1  
408 and DHODH copy number in *3D7* parent line and DSM1, DSM705, DSM265-selected lines.  
409 Correlation coefficients are not calculated due to small sample sizes and dependence among  
410 DSM1 selected lines. Trendlines show the relationship between GCH1 and DHODH copy  
411 numbers in available lines.



412 **Figure 5. The connection between pyrimidine and folate biosynthesis pathways.** Enzymes  
 413 with gene copy number variations are indicated in blue. Gln: Glutamine; DHO: Dihydroorotate;  
 414 UMP: Uridine monophosphate; dUMP: Deoxyuridine monophosphate; dTMP: deoxythymidine  
 415 monophosphate; GTP: Guanosine-5'-triphosphate; DHPS: Dihydropteroate synthase; DHFR:  
 416 Dihydrofolate reductase; DHF: Dihydrofolate; THF: Tetrahydrofolate; HMDP-P2: 6-  
 417 hydroxymethyl-7, 8-dihydropterin diphosphate; pABA: para-amino-benzoic acid; 5, 10-CH<sub>2</sub>-  
 418 THF: 5,10-Methylenetetrahydrofolate.

419

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