

1 **Differences in phenotype between long-lived memory B cells against *Plasmodium***  
2 ***falciparum* merozoite antigens and variant surface antigens**

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21

22 **ABSTRACT**

23 *Plasmodium falciparum* infections elicit strong humoral immune responses to two main groups  
24 of antigens expressed by blood-stage parasites: merozoite antigens that are involved in the  
25 erythrocyte invasion process and variant surface antigens that mediate endothelial  
26 sequestration of infected erythrocytes. Long-lived B cells against both antigen classes can be  
27 detected in the circulation for years after exposure, but have not been directly compared. Here,  
28 we studied the phenotype of long-lived memory and atypical B cells to merozoite antigens  
29 (MSP1 and AMA1) and variant surface antigens (the CIDR $\alpha$ 1 domain of PfEMP1) in Ugandan  
30 adults before and after local reduction of *P. falciparum* transmission. After a median of 1.7 years  
31 without *P. falciparum* infections, the percentage of antigen-specific activated B cells declined,  
32 but long-lived antigen-specific B cells were still detectable in all individuals. The majority of  
33 MSP1/AMA1-specific B cells were CD95<sup>+</sup>CD11c<sup>+</sup> memory B cells, which are primed for rapid  
34 differentiation into antibody-secreting cells, and FcRL5<sup>-</sup>T-bet<sup>-</sup> atypical B cells. On the other  
35 hand, most CIDR $\alpha$ 1-specific B cells were CD95<sup>-</sup>CD11c<sup>-</sup> memory B cells. CIDR $\alpha$ 1-specific B  
36 cells were also enriched among a subset of atypical B cells that seem poised for antigen  
37 presentation. These results point to differences in how these antigens are recognized or  
38 processed by the immune system and how *P. falciparum*-specific B cells will respond upon re-  
39 infection.

40

## 41 INTRODUCTION

42 Malaria continues to be an enormous public health problem in sub-Saharan Africa (1). This  
43 potentially fatal disease is caused by parasites of the *Plasmodium* genus, of which *P. falciparum*  
44 is responsible for most malaria cases and deaths (1). The development of an effective vaccine  
45 against *P. falciparum* plays an important role in the fight to eradicate malaria. However, a major  
46 hurdle to overcome in malaria vaccine development is the quick waning of vaccine-elicited  
47 immune responses. Most malaria vaccines and vaccine candidates elicit antibodies that inhibit  
48 parasite invasion or development, as well as memory B cells that that will be activated upon the  
49 next *P. falciparum* antigen encounter. To improve the durability of malaria vaccine-induced  
50 immune responses, it is important to define the characteristics of long-lived anti-parasite  
51 immunity (here defined as persisting for at least one year in the absence of exposure), for  
52 example by studying long-lived B cell memory induced by *P. falciparum* infection. The goal of  
53 this study was to compare long-lived memory B cell responses to different parasite antigens  
54 acquired as the result of natural infection in individuals living in a malaria-endemic region.

55  
56 In the human host, *P. falciparum* develops through several life cycle stages, of which the  
57 asexual replication cycle within erythrocytes is responsible for pathogenesis. During this  
58 replication cycle, a single *P. falciparum* merozoite infects an erythrocyte and over the course of  
59 48 hours, divides into 16 – 32 daughter cells. These newly formed merozoites then burst out of  
60 the infected erythrocyte, each ready to invade a new erythrocyte. People living in malaria-  
61 endemic regions are repeatedly infected by *Plasmodium* parasites and, as a result of these  
62 repetitive exposures, develop immunoglobulin G (IgG) responses against asexual blood-stage  
63 parasites that protect against disease (2,3). The main antigenic targets of these IgG responses  
64 can be divided into two categories. The first class are expressed by merozoites and are involved  
65 in erythrocyte invasion, such as merozoite surface protein 1 (MSP1) and apical membrane  
66 antigen 1 (AMA1). The second class of antigens comprises variant surface antigens that are

67 expressed by *P. falciparum* on the surface of the infected erythrocyte. The most important of  
68 these are members of the *P. falciparum* erythrocyte membrane protein 1 (PfEMP1) family that  
69 mediate binding to endothelial receptors on the host microvasculature.  
70  
71 Merozoite-specific memory B cells have been detected in the circulation up to 16 years after  
72 infection in the absence of antigen exposure (4–7). Similarly, memory B cells against the  
73 PfEMP1 variant VAR2CSA involved in pregnancy-associated malaria can be found in the  
74 circulation for many years (8). However, the phenotype of these long-lived *P. falciparum*-specific  
75 memory B cells has not been studied in great detail. IgG<sup>+</sup> B cells in the circulation can be  
76 divided into two main populations: conventional memory B cells (IgD<sup>-</sup>CD27<sup>+</sup>) and double  
77 negative (DN) B cells (IgD<sup>-</sup>CD27<sup>-</sup>), both known to harbor *P. falciparum* merozoite antigen-  
78 specific B cells (9,10). Recent studies have identified subsets of conventional memory B cells  
79 that are associated with durable humoral immune responses after influenza and tetanus  
80 vaccination, and SARS-CoV-2 infection (11–14). In particular, the surface protein FcRL5, often  
81 expressed in conjunction with the integrin CD11c and the transcription factor T-bet, marks a  
82 subset of long-lived class-switched memory B cells that are epigenetically and metabolically  
83 poised to differentiate into antibody-secreting cells during recall responses (11). The same three  
84 markers are expressed by a subset of DN B cells called DN2 or atypical B cells that are typically  
85 expanded in *P. falciparum*-exposed individuals (15,16). Atypical B cells also have the capacity  
86 to differentiate into antibody-secreting cells and may thus contribute to protection against  
87 malaria (17,18). However, it is unknown whether *P. falciparum*-specific atypical B cells have the  
88 same durability as *P. falciparum*-specific memory B cells and if there are differences in the  
89 phenotype and longevity of B cells specific for merozoite antigens or variant surface antigens.  
90  
91 In malaria-endemic regions, repetitive *P. falciparum* infections result in boosting of the immune  
92 response during every infection. These repeated infections complicate the study of the durability

93 of anti-parasite immune responses, because every antigen exposure results in the activation  
94 and differentiation of long-lived memory B cells and the formation of new memory B cells. To  
95 overcome this problem, we used samples that were collected before and after local reduction of  
96 *P. falciparum* transmission. Analyzing antigen-specific B cells from these two time points  
97 allowed us to evaluate which *P. falciparum*-specific B cell subsets remained present in the  
98 absence of new infections and could thus be considered long-lived. Using high parameter  
99 spectral flow cytometry, we analyzed the phenotype of memory and atypical B cells that  
100 recognize *P. falciparum* merozoite antigens or variant surface antigens. Additionally, we  
101 performed an unsupervised clustering analysis of antigen-specific B cells to identify  
102 characteristics of the long-lived B cell response that are unique to each class of antigens.

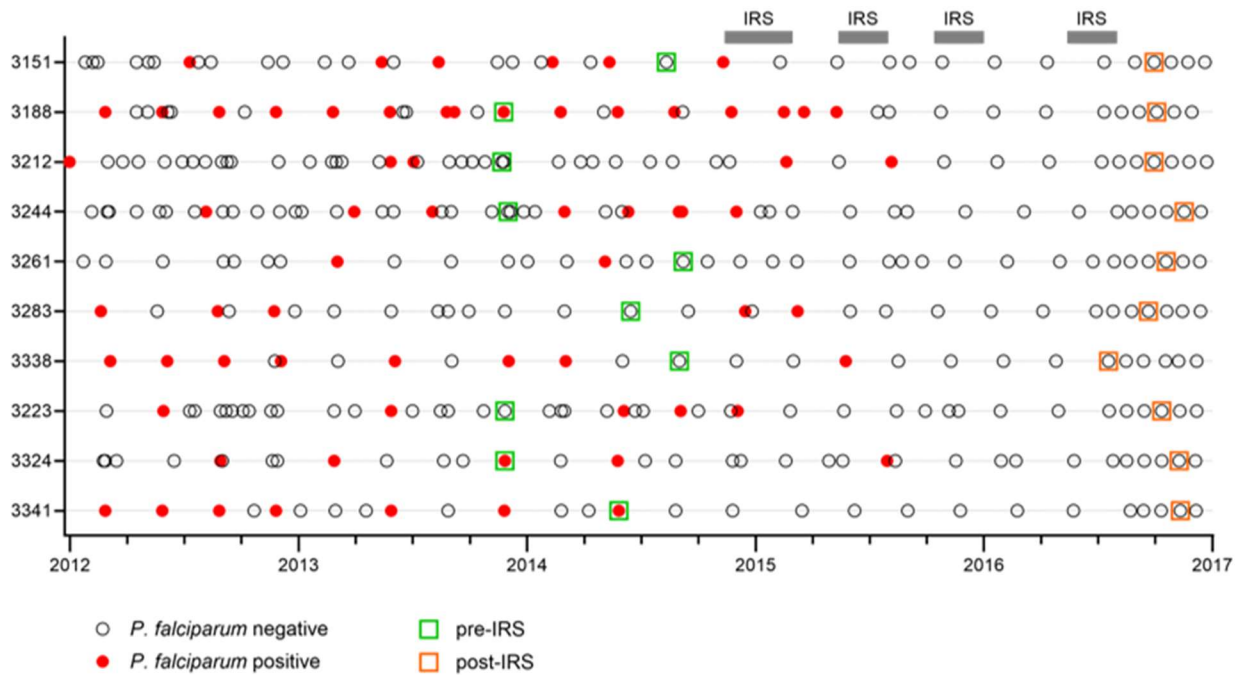
103

## 104 **RESULTS**

### 105 **Activated B cell subsets decrease in abundance in the absence of *Plasmodium*** 106 ***falciparum* exposure**

107 To study *P. falciparum*-specific B cell responses that were maintained in the absence of new  
108 infections, we used peripheral blood mononuclear cells from ten *P. falciparum*-exposed  
109 Ugandan adults collected during a period of high *P. falciparum* transmission and after effective  
110 mosquito control by means of indoor residual spraying (IRS) had reduced parasite prevalence  
111 by 80% (19). Individuals had not tested positive for *P. falciparum* infection for a median of 1.7  
112 years (range, 1.1 – 2.5 years) before collection of blood at the second time point (**Fig. 1, Table**  
113 **S1**). B cells were isolated from peripheral blood mononuclear cells and stained with a  
114 comprehensive panel of B cell markers (**Table S2**). This panel included antigen tetramers that  
115 allowed for the detection of B cells with specificity to two classes of *P. falciparum* antigens: (i)  
116 merozoite proteins involved in erythrocyte invasion (merozoite surface protein 1 [MSP1] and  
117 apical membrane antigen 1 [AMA1]), and (ii) the cysteine-rich interdomain region  $\alpha 1$  (CIDR $\alpha 1$ )  
118 domain of the variant surface antigen *P. falciparum* erythrocyte membrane protein 1 (PfEMP1)

119 that is expressed on the surface of the infected erythrocyte. These antigens were selected  
120 because we have previously used these proteins to isolate monoclonal antibodies with  
121 confirmed antigen specificities (10,20).  
122

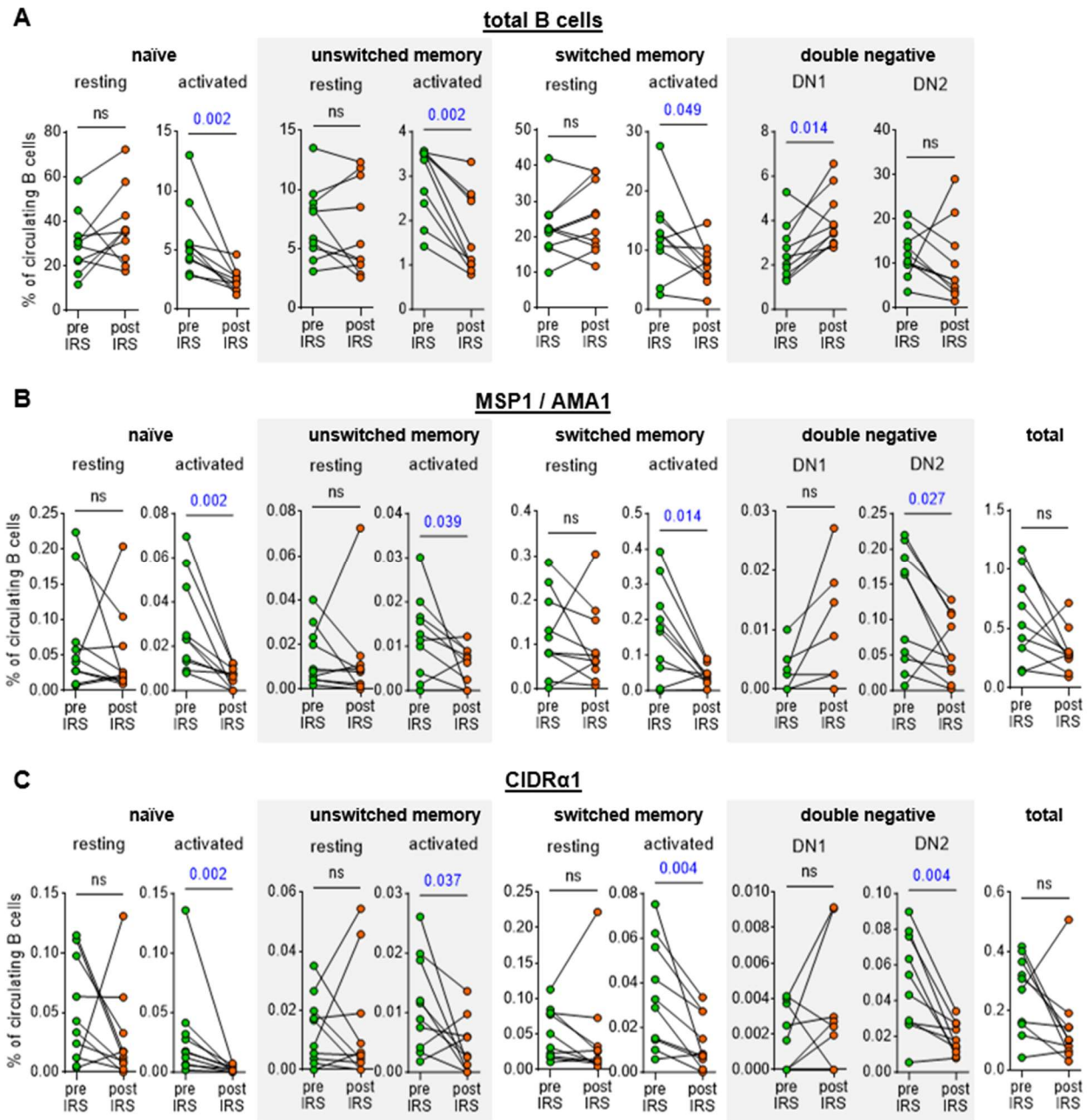


124 **Figure 1: Timing of sample collection.** Cohort participants (n = 10) were sampled during  
125 routine clinic visits roughly every three months and when they visited a study clinic due to  
126 illness. For each visit, the outcome of screening for parasitemia is indicated (open circle for  
127 negative, closed red circle for positive). Samples used in this study were collected in late 2013  
128 through late 2014 when *P. falciparum* transmission was high (green squares), and during the  
129 second half of 2016 after four rounds of indoor residual spraying (IRS) had reduced *P.*  
130 *falciparum* prevalence by 80% (orange squares). The median time between the last known *P.*  
131 *falciparum* infection and collection of the second sample was 1.7 years.  
132

133 To assess the composition of the B cell compartment irrespective of antigen-specificity, we first  
134 determined the relative abundance of major B cell populations during high *P. falciparum*  
135 transmission and after a reduction in parasite exposure. Total CD19<sup>+</sup> B cells were divided into  
136 naïve B cells (IgD<sup>+</sup>CD27<sup>-</sup>), unswitched memory B cells (IgD<sup>+</sup>CD27<sup>+</sup>), switched memory B cells

137 (IgD<sup>-</sup>CD27<sup>+</sup>), and double negative B cells (IgD<sup>-</sup>CD27<sup>-</sup>) (**Fig. S1**). Based on the expression of  
138 CD11c, naïve B cells were further divided into resting (CD11c<sup>-</sup>) and activated (CD11c<sup>+</sup>).  
139 For unswitched and switched memory B cell populations, we used CD21 to divide cells into  
140 resting (CD21<sup>+</sup>) and activated (CD21<sup>-</sup>). Using CD11c and CD21, double negative (DN) B cells  
141 were separated into sub-populations DN1, DN2, DN3, and DN4 (**Fig. S1**). DN2 (or atypical;  
142 CD11c<sup>+</sup>CD21<sup>-</sup>) B cells have been studied extensively in *P. falciparum*-exposed individuals  
143 (17,18,21–23), whereas the other three sub-populations of DN B cells have not previously been  
144 characterized in the context of malaria. DN1 B cells (CD11c<sup>-</sup>CD21<sup>+</sup>) and DN4 (CD11c<sup>+</sup>CD21<sup>+</sup>) B  
145 cells are thought to be closely related to resting switched memory B cells, while DN3 B cells  
146 (CD11c<sup>-</sup>CD21<sup>-</sup>) may be precursors of atypical B cells (24,25).  
147  
148 Following IRS, we observed a consistent decrease in the percentage of activated cells: naïve B  
149 cells from a median of 5.1% to 2.4% (~55% reduction), unswitched memory B cells from 3.4%  
150 to 1.3% (~60% reduction), and switched memory B cells from 12.3% to 7.6% (~40% reduction)  
151 (**Fig. 2A, Table S3**). In contrast, the percentage of DN1 cells increased significantly post-IRS,  
152 from 2.2% to 3.6% (~40% increase) (**Fig. 2A**). These results are in line with a decrease in  
153 immune activation due to an interruption of exposure to *P. falciparum* infections. A similar  
154 pattern was observed when we analyzed antigen-specific B cells: the relative abundance of  
155 activated, but not resting, MSP1/AMA1-specific and CIDR $\alpha$ 1-specific naïve B cells, unswitched  
156 memory B cells, and switched memory B cells declined between the two time points (~70, 40,  
157 and 75% reduction, respectively for MSP1/AMA1-specific B cells and ~85, 75, and 75%  
158 reduction, respectively for CIDR $\alpha$ 1-specific B cells) (**Fig. 2B, C**). Additionally, although the total  
159 percentage of atypical B cells did not change, the percentage of MSP1/AMA1-specific and  
160 CIDR $\alpha$ 1-specific atypical B cells decreased (~60% and 65% reduction, respectively). The  
161 percentages of antigen-specific DN1, DN3, and DN4 B cells were small and did not change over  
162 time (**Fig. 2, Fig. S2**). When looking at the abundance of MSP1/AMA1-specific and CIDR $\alpha$ 1-

163 specific B cells among total B cells, we observed that both populations decreased in size, but  
 164 these differences were not statistically significant (Fig. 2B, C).



165

166 **Figure 2: Abundance of total and antigen-specific B cell subsets in the circulation during**  
 167 **high parasite transmission and in the absence of *P. falciparum* exposure.** The percentage  
 168 of B cell subsets among circulating B cells is shown for total B cells (A), MSP1/AMA1-specific B  
 169 cells (B), and CIDR $\alpha$ 1-specific B cells (C). For MSP1/AMA1-specific B cells and CIDR $\alpha$ 1-  
 170 specific B cells, the total percentage among all circulating B cells is also shown (right most  
 171 graphs in each panel). In panels B and C, no antigen-specific DN1 cells were detected pre- and



172 post-IRS for four individuals. These data points therefore overlap and are not clearly visible.  
173 Differences between groups were evaluated using a Wilcoxon matched-pairs signed-rank test.  
174 P values < 0.05 are shown in blue. Ns, not significant.

175

176 Collectively, these results suggest that the percentage of *P. falciparum*-specific activated B cells  
177 declines in the absence of *P. falciparum* infection but that long-lived *P. falciparum*-specific B  
178 cells are detectable in the circulation after more than a year without parasite exposure. In  
179 addition, we did not observe a difference in the rate at which B cells with specificity for  
180 merozoite antigens or variant surface antigens are lost.

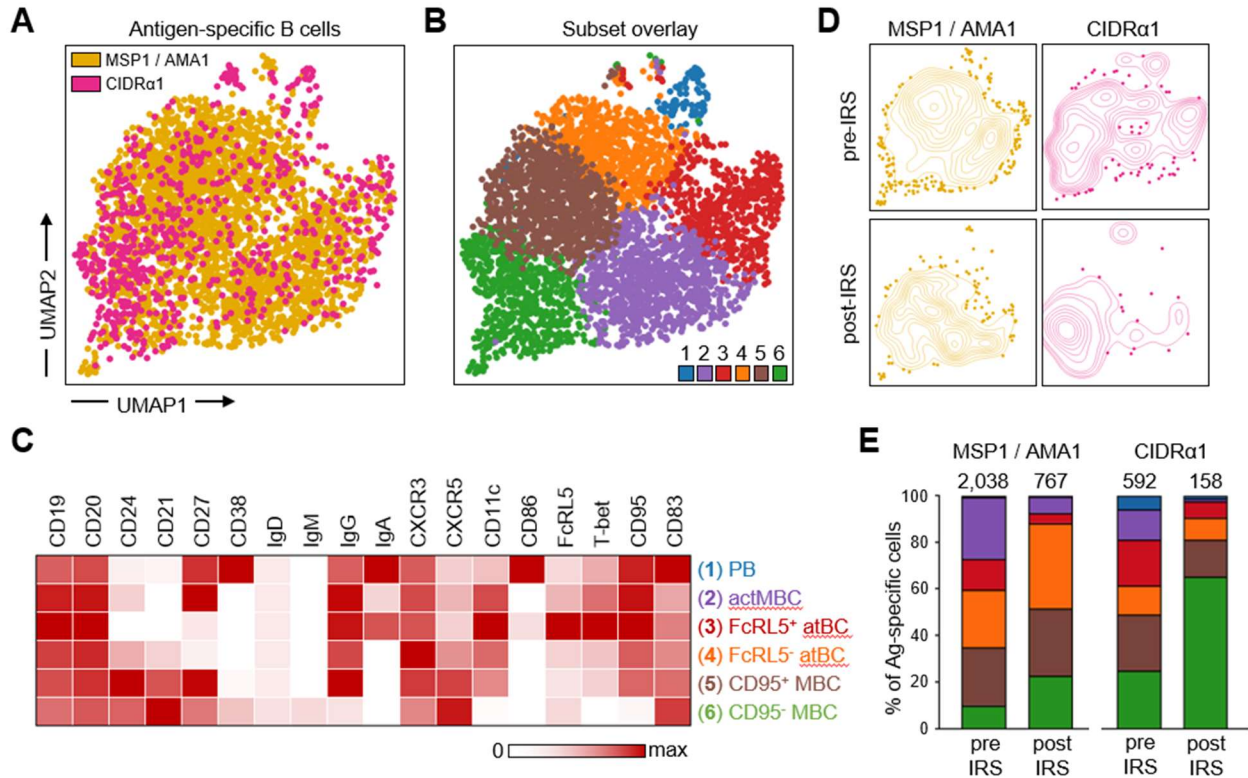
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### 182 **Long-lived MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells differ in phenotype**

183 To further explore similarities and differences in the long-lived memory B cell responses to  
184 merozoite antigens and variant surface antigens, we analyzed the phenotype of MSP1/AMA1-  
185 specific and CIDR $\alpha$ 1-specific B cells. To do this in an unbiased way and without limiting the  
186 analysis to pre-defined B cell subsets, we first grouped all non-naïve antigen-specific B cells  
187 from all ten individuals at both time points and performed unsupervised clustering based on  
188 expression of all markers except Ig isotypes (**Fig. 3A-B, Fig. S3, Table S3**). This analysis  
189 identified six clusters, which were classified based on the expression of markers associated with  
190 previously characterized B cell populations, as follows: plasmablasts (CD27<sup>+</sup>CD38<sup>+</sup>), activated  
191 memory B cells (CD21<sup>-</sup>CD27<sup>+</sup>), two atypical B cell subsets (CD21<sup>-</sup>CD27<sup>-</sup>CD11c<sup>+</sup>), and two  
192 memory B cell subsets (CD21<sup>+</sup>CD27<sup>+</sup>) (**Fig. 3C**). The two atypical B cell subsets were  
193 distinguished by differences in the expression of FcRL5 and T-bet, while the two memory B cell  
194 subsets mainly differed in the expression of CD11c, and CD95.

195

196



197

198 **Figure 3: Differences in phenotype between long-lived MSP1/AMA1-specific and CIDRα1-**  
 199 **specific B cells. A)** Composite UMAP of antigen-specific B cells from samples collected at two  
 200 time points from 10 individuals, with B cells colored by antigen-specificity. **B)** The same UMAP  
 201 as shown in panel A with antigen-specific B cells colored by subset. **C)** Median fluorescence  
 202 intensity of 18 surface and intracellular markers in the six B cell subsets, calculated using flow  
 203 cytometry data from all 20 samples (two time points for 10 individuals) and color-coded relative  
 204 to the maximum intensity observed among all B cell populations, including naïve B cells not  
 205 shown in the heatmap (see Table S3). **D)** Contour plot overlay of MSP1/AMA1-specific and  
 206 CIDRα1-specific B cells onto the composite UMAP, shown separately for samples collected pre-  
 207 IRS and post-IRS. **E)** Distribution of all MSP1/AMA1-specific and CIDRα1-specific B cells over  
 208 the six B cell subsets at the pre-IRS and post-IRS time points. The number above the bar  
 209 represents the total number of cells. Colors represent the different subsets shown in panel D.  
 210 PB, plasmablasts; actMBC, activated memory B cells; atBC, atypical B cells; MBC, memory B  
 211 cells.

212  
 213

214 Overlay of MSP1/AMA1-specific and CIDRα1-specific B cells onto the composite UMAP of all  
 215 antigen-specific B cells showed differences in their distribution over the six clusters, especially  
 216 at the post-IRS time point (**Fig. 3D**). We therefore determined the percentage of antigen-specific  
 217 cells that belonged to each of the six subsets of B cells (**Fig. 3E, Table S3**). This allowed us to

218 quantify the changes in composition of the MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells by  
219 calculating the percentage overlap between the samples collected before and after IRS. The  
220 overlap in composition of CIDR $\alpha$ 1-specific B cells between the two time points (60%) was slight  
221 lower than that of MSP1/AMA1-specific B cells (71%), suggesting that the population of  
222 CIDR $\alpha$ 1-specific B cells may have undergone more changes during the period with reduced *P.*  
223 *falciparum* transmission. When comparing the two groups of antigen-specific B cells at each  
224 time point, we observed that the populations of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B  
225 cells were more similar during high parasite transmission (74%) than in the absence of parasite  
226 exposure (54%). Thus, the populations of circulating long-lived B cells with specificity for  
227 merozoite antigens or variant surface antigens seem to diverge in their composition in the  
228 absence of antigen re-exposure.

229  
230 To better understand these differences in phenotype between long-lived B cells with different  
231 antigen-specificities, we looked more closely at the distribution of MSP1/AMA1-specific and  
232 CIDR $\alpha$ 1-specific B cells over the six subsets. During a time of high parasite exposure, both  
233 MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells were found among all six subsets. With the  
234 exception of plasmablasts that were a small population among both antigen groups, antigen-  
235 specific B cells were distributed fairly evenly over the various sub-populations (**Fig. 3E**). In line  
236 with the reduction in immune activation, the percentage of short-lived plasmablasts (cluster 1)  
237 and activated memory B cells (cluster 2) was lower post-IRS (20 – 70% of the pre-IRS level)  
238 (**Fig. 3E**). The same was true for the FcRL5<sup>+</sup>T-bet<sup>+</sup> subset of atypical B cells (cluster 3), which  
239 decreased in proportion by ~65% for both merozoite and variant surface antigens. However, we  
240 observed differences in the relative abundance of subsets 4, 5, and 6 between the two antigen  
241 groups. While the fraction of FcRL5<sup>+</sup>T-bet<sup>-</sup> atypical B cells (cluster 4) increased among  
242 MSP1/AMA1-specific B cells (from 25% pre-IRS to 37% post-IRS), it remained unchanged  
243 among CIDR $\alpha$ 1-specific B cells (~10%). Additionally, the fraction of CD95<sup>+</sup>CD11c<sup>+</sup> memory B

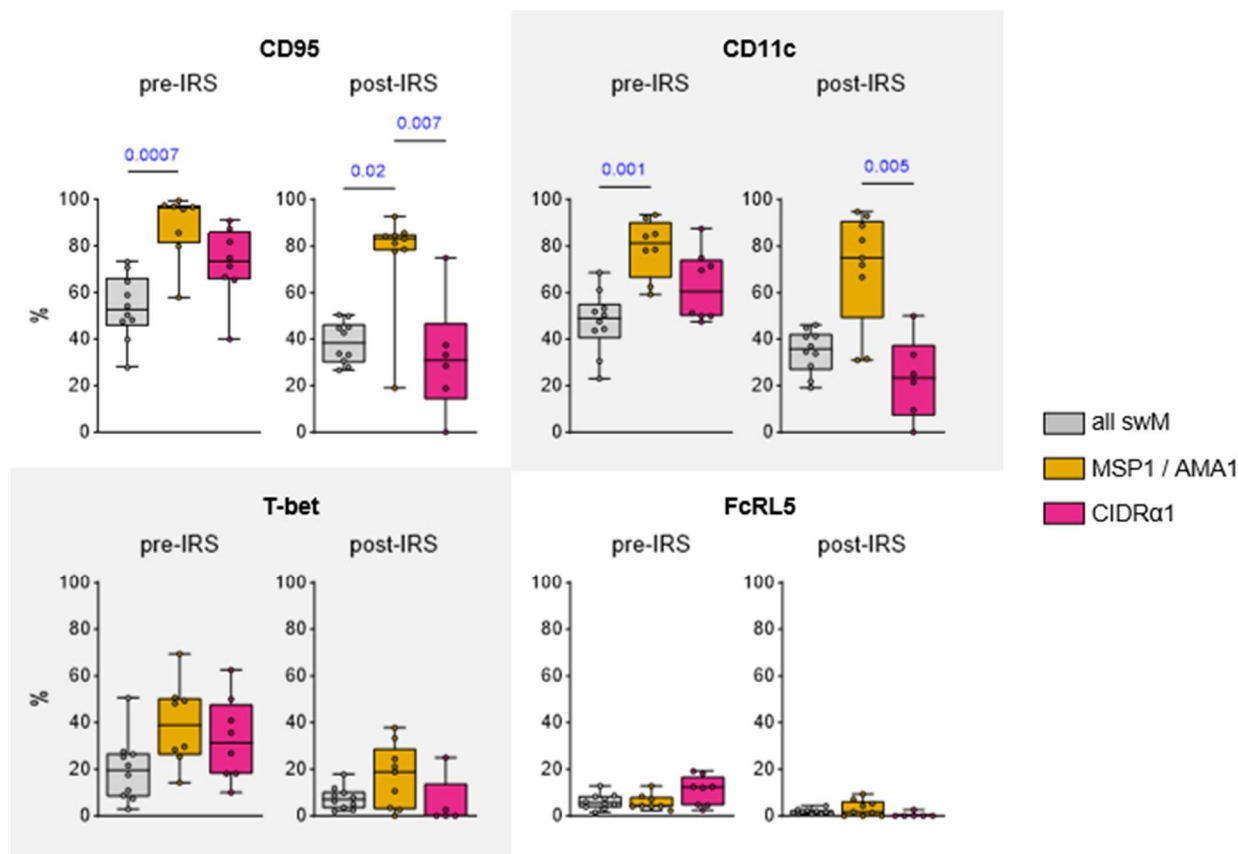
244 cells (cluster 5) remained stable among MSP1/AMA1-specific B cells (25 – 30%) but decreased  
245 among CIDR $\alpha$ 1-specific B cells (from 24% pre-IRS to 16% post-IRS). Together, subsets 4 and 5  
246 made up the majority (65%) of MSP1/AMA1-specific B cells post-IRS, but only 25% of CIDR $\alpha$ 1-  
247 specific B cells at this time point. In contrast, 65% of all CIDR $\alpha$ 1-specific B cells detected post-  
248 IRS were CD95<sup>+</sup>CD11c<sup>-</sup> memory B cells (cluster 6), an almost three-fold increase in comparison  
249 to its proportion among CIDR $\alpha$ 1-specific B cells present during high *P. falciparum* exposure  
250 (25%). Collectively, these results suggest that circulating long-lived anti-*Plasmodium* B cells  
251 with different antigen specificities have different phenotypes.

252

### 253 **Long-lived MSP1/AMA1-specific memory B cells express CD95 and CD11c**

254 The difference in proportions of CD95<sup>+</sup>CD11c<sup>+</sup> (cluster 5) and CD95<sup>+</sup>CD11c<sup>-</sup> (cluster 6) long-  
255 lived memory B cells between merozoite antigen-specific and variant surface antigen-specific  
256 memory B cells was interesting given that, in general, the majority of class-switched memory B  
257 cells (CD19<sup>+</sup>IgD<sup>-</sup>CD27<sup>+</sup>) do not express these markers (12,14,26). To study this observation in  
258 more detail, we determined the percentages of CD95<sup>+</sup> cells and CD11c<sup>+</sup> cells among antigen-  
259 specific switched memory B cells and the total population of switched memory B cells.  
260 Irrespective of the level of parasite exposure, the large majority (80 – 95%) of MSP1/AMA1-  
261 specific switched memory B cells expressed CD95, compared to only 40 – 50% of all switched  
262 memory B cells (**Fig. 4**). A similar pattern was seen for CD11c with 70 – 80% of MSP1/AMA1-  
263 specific switched memory B cells expressing CD11c, compared to only 35 – 40% in the total  
264 population of switched memory B cells (**Fig. 4**). During high parasite exposure, the percentages  
265 of CD95<sup>+</sup> / CD11c<sup>+</sup> MSP1/AMA1-specific switched memory B cells did not differ from those  
266 among CIDR $\alpha$ 1-specific switched memory B cells (median, 60 – 70%), although it should be  
267 mentioned that the percentages of CD95<sup>+</sup> / CD11c<sup>+</sup> CIDR $\alpha$ 1-specific switched memory B cells  
268 were also not statistically different from those of the total population of switched memory B cells  
269 (**Fig. 4**). Post-IRS, the percentages of CD95<sup>+</sup> / CD11c<sup>+</sup> CIDR $\alpha$ 1-specific switched memory B

270 cells decreased to 25 – 30% and were significantly different from those among MSP1/AMA1-  
271 specific switched memory B cells.  
272  
273 CD11c is often co-expressed with FcRL5 and T-bet. Collectively, these markers have been  
274 associated with long-lived class-switched memory B cells that participate in robust recall  
275 responses (11,12). To determine whether MSP1/AMA1-specific memory B cells not only  
276 express higher levels of CD11c than CIDR $\alpha$ 1-specific switched memory B cells, but also higher  
277 levels of these other two markers, we compared the percentages of FcRL5<sup>+</sup> cells and T-bet<sup>+</sup>  
278 cells among antigen-specific switched memory B cells and the total population of switched  
279 memory B cells. The percentage of T-bet<sup>+</sup> cells among MSP1/AMA1-specific and CIDR $\alpha$ 1-  
280 specific switched memory B cells was similar during high parasite exposure (median, 30 – 40%)  
281 and post-IRS (median, 5 – 20%), and was not increased as compared to the total population of  
282 switched memory B cells (**Fig. 4**). The percentage of cells expressing FcRL5 was low and did  
283 not differ between MSP1/AMA1-specific and CIDR $\alpha$ 1-specific switched memory B cells (**Fig. 4**).  
284 Thus, CD95 and CD11c, but not other markers of durable immunity, are differentially expressed  
285 between MSP1/AMA1-specific and CIDR $\alpha$ 1-specific long-lived memory B cells.



286

287 **Figure 4: Expression of CD95, CD11c, T-bet, and FcRL5 among long-lived switched**  
 288 **memory B cells.** The percentage of CD95<sup>+</sup>, CD11c<sup>+</sup>, T-bet<sup>+</sup>, and FcRL5<sup>+</sup> cells are shown pre-  
 289 IRS and post-IRS for all switched memory B cells, as well as MSP1/AMA1-specific and CIDRα1-  
 290 specific switched memory B cells. Differences between groups were tested using a Kruskal-  
 291 Wallis test, followed by comparisons between all pairs of groups using Dunn's post-hoc test,  
 292 which reports P values that have been corrected for multiple comparisons. Only P values < 0.05  
 293 are shown. swM, switched memory.  
 294

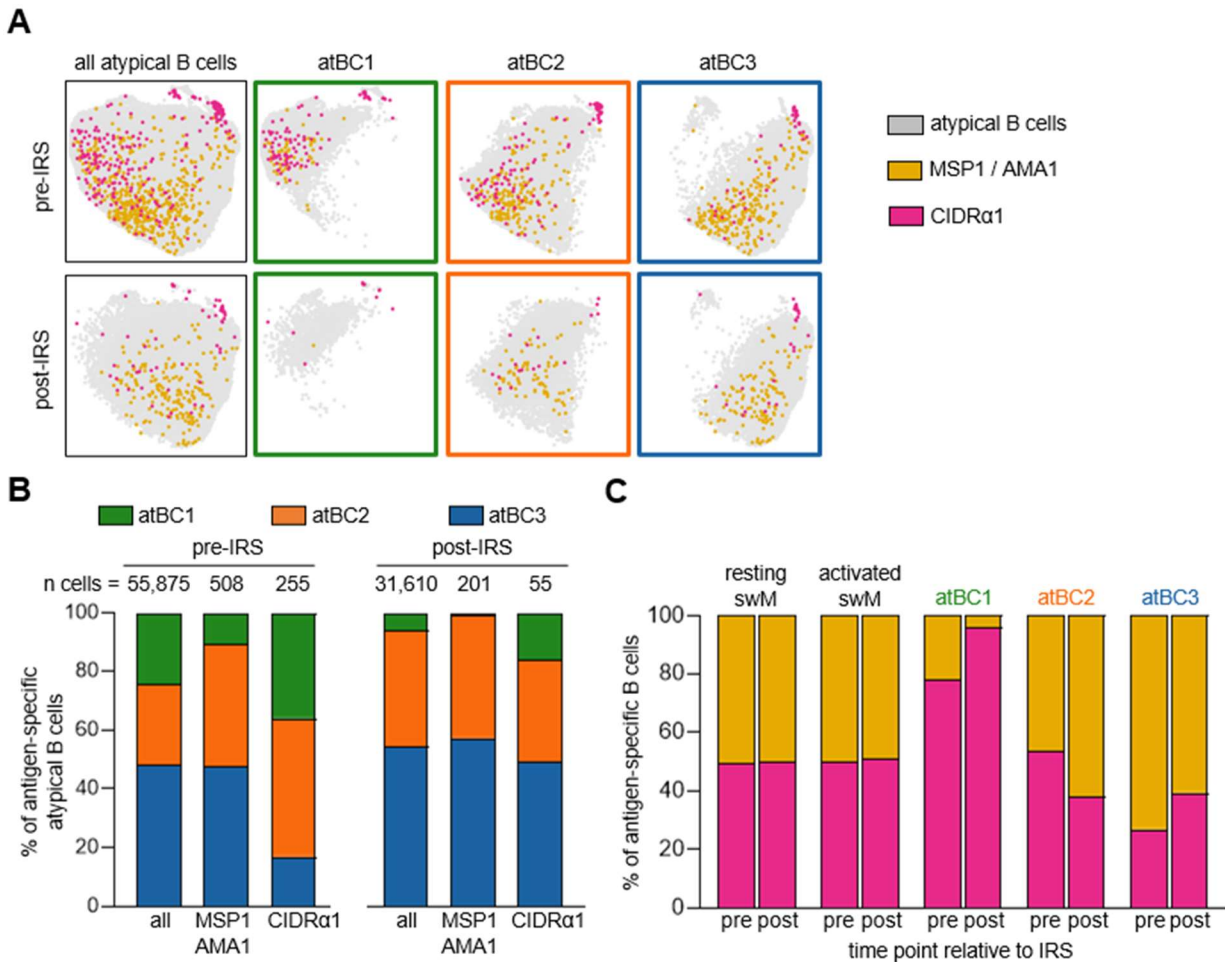
### 295 **CD86<sup>+</sup>CD11c<sup>hi</sup> atypical B cells are enriched for CIDRα1-specific cells**

296 As shown in Figure 3E, we observed that the large majority (90%) of long-lived MSP1/AMA1-  
 297 specific atypical B cells (clusters 3 and 4, post-IRS) did not express FcRL5 and T-bet, whereas  
 298 CIDRα1-specific atypical B cells were divided almost equally between the FcRL5<sup>+</sup>T-bet<sup>+</sup> (cluster  
 299 3) and FcRL5<sup>-</sup>T-bet<sup>-</sup> (cluster 4) populations. We recently described three subsets of atypical B  
 300 cells with different functional profiles (18), that we will here refer to as atBC1 (CD86<sup>+</sup>CD11c<sup>hi</sup>),  
 301 atBC2 (CD86<sup>-</sup>CD11c<sup>hi</sup>), and atBC3 (CD86<sup>-</sup>CD11c<sup>int</sup>). Of these, atBC1 and atBC2 expressed high

302 levels of FcRL5 and T-bet, whereas atBC3 expressed low levels of T-bet and did not express  
303 FcRL5. We determined the proportion of these three previously described subsets of atypical B  
304 cells among the MSP1/AMA1-specific atypical B cells and the CIDR $\alpha$ 1-specific atypical B cells.  
305 After gating on IgD<sup>-</sup> atypical B cells (CD21<sup>-</sup>CD27<sup>-</sup>CD11c<sup>+</sup>IgD<sup>-</sup>), unsupervised clustering was  
306 performed, followed by separating the cells into the three atypical B cell subsets based on  
307 expression of CD11c and CD86 (**Fig. 5A, Fig. S4**). Overall, the fraction of atBC1 among all  
308 atypical B cells was smallest (25%) and decreased in the absence of *P. falciparum*-exposure  
309 (6%) (**Fig. 5B**). The fraction of atBC2 increased from 27% to 40%, while the relative size of  
310 subset atBC3 remained stable at ~50%. However, it is important to note that atypical B cells of  
311 all subsets were still detected in the circulation post-IRS, indicating that these cells are long-  
312 lived in the absence of infection.

313  
314 Next, we determined the proportion of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific cells among  
315 the three atypical B cell subsets, as well as among resting and activated memory B cells.  
316 Antigen-specific B cells were found among all atypical and memory B cell populations, but their  
317 distributions within each population differed. Resting memory B cells, activated memory B cells,  
318 and atBC2 harbored equal proportions of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific cells (**Fig.**  
319 **5C**), suggesting that there is no enrichment for antigen-specificity among these B cell  
320 populations. AtBC3 contained about 60% MSP1/AMA1-specific cells and 40% CIDR $\alpha$ 1-specific  
321 cells, although this difference did not reach statistical significance when analyzed for individual  
322 donors (**Fig. S5**). In stark contrast, the majority of antigen-specific atBC1 (~80% after  
323 normalizing for the total abundance of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific cells) was  
324 specific for CIDR $\alpha$ 1 at the pre-IRS time point (**Fig. 5C, Fig. S5**). The relative abundance of  
325 CIDR $\alpha$ 1-specific cells within atBC1 was even higher post-IRS, although it should be noted that  
326 very few antigen-specific B cells were detected at this time point (10 cells in total). Collectively,  
327 these results suggest that atypical B cells are part of the long-lived B cell response to

328 *Plasmodium* antigens and point to differences in the atypical B cell response to different classes  
 329 of antigens.  
 330



331

332 **Figure 5: Distribution of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells among**  
 333 **atypical B cell subsets. A)** Composite UMAP of atypical B cells from samples collected at two  
 334 time points from 10 individuals, separated by time point (left column). UMAPs for each of the  
 335 three atypical B cell subsets are also shown (right three columns in green, orange, and blue).  
 336 MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells were projected onto these UMAPs. **B)**  
 337 Distribution of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells over the three atypical B cell  
 338 subsets in samples collected during times of frequent *P. falciparum* infection (pre-IRS) and in  
 339 absence of parasite infection (post-IRS). **C)** The normalized percentage of MSP1/AMA1-specific  
 340 and CIDR $\alpha$ 1-specific B cells among different B cell subsets. swM, switched memory B cell;  
 341 atBC $i$ , atypical B cell subset  $i$ .

342

343



344 **DISCUSSION**

345 Our current understanding of the longevity of naturally acquired immunity against *P. falciparum*  
346 is mostly based on studies that measured the presence of anti-parasite antibodies in serum.  
347 Previous research on memory B cell responses in *P. falciparum*-exposed individuals has mainly  
348 focused on changes in the major B cell populations shortly after acute infection or on studying B  
349 cell memory in non-immune individuals (4,27,28). In recent years, novel subsets of memory and  
350 atypical B cells have been discovered, each of which may play a different role in the immune  
351 response to infection (11–14,18). To identify components of the naturally acquired B cell  
352 response that contribute to long-lived memory against *P. falciparum* infection, we studied  
353 samples collected from individuals living in a malaria endemic region before and after a  
354 reduction in *P. falciparum* exposure due to highly effective vector control. Using spectral flow  
355 cytometry, we determined the phenotype of B cells with specificity to *P. falciparum* merozoite  
356 antigens (MSP1/AMA1) and variant surface antigens (the CIDR $\alpha$ 1 domain of PfEMP1). While  
357 both groups of antigen-specific B cells showed similar dynamics over time (i.e., a reduction in  
358 the percentage of activated B cells), we observed several differences in the composition of  
359 circulating long-lived MSP1/AMA1-specific B cells and CIDR $\alpha$ 1-specific B cells.

360

361 First, we found that the majority of MSP1/AMA1-specific switched memory B cells expressed  
362 CD95 and CD11c. CD95 is a death receptor that can induce apoptosis of the cell when it gets  
363 bound by its ligand. CD95 is upregulated in germinal center B cells and activated B cells as a  
364 mechanism to regulate the humoral immune response and limit inflammation (29). Seemingly  
365 contradictory, it can also play a role in cell survival and proliferation (30). Until now, it was  
366 unclear whether CD95<sup>+</sup> cells were recent germinal center emigrants that would disappear  
367 shortly after the resolution of infection, or whether they were part of a durable memory B cell  
368 response. Our observation that approximately 80% of MSP1/AMA1-specific switched memory B  
369 cells expressed CD95 after almost two years without *P. falciparum* exposure suggests that

370 these cells are long-lived in the circulation. Glass *et al.* showed that CD95<sup>+</sup> memory B cells were  
371 phenotypically more closely related to plasma cells than other memory B cell subsets,  
372 suggesting that these cells readily differentiate into antibody-secreting cells upon antigen  
373 encounter (26). Indeed, CD95<sup>+</sup> memory B cells strongly responded to BCR crosslinking,  
374 resulting in the phosphorylation of proteins that are part of the BCR signaling cascade (26).  
375 CD11c expression has also been shown to be upregulated by BCR stimulation, and, similar to  
376 CD95<sup>+</sup> memory B cells, CD11c<sup>+</sup> B cells are more prone to differentiate into antibody-secreting  
377 cells than CD11c<sup>-</sup> B cells (31). Together, this suggests that MSP1/AMA1-specific switched  
378 memory B cells are enriched for an effector memory population that will rapidly differentiate into  
379 antibody-secreting cells upon antigen encounter. Interestingly, long-lived MSP1/AMA1-specific  
380 switched memory B cells did not express FcRL5 or T-bet, markers that are often co-expressed  
381 with CD11c and have been associated with durable B cell immunity and rapid recall responses  
382 following vaccination (11,12). The lack of FcRL5 and T-bet expression in CD11c<sup>+</sup> memory B  
383 cells observed here may point to differences in the immune response to vaccination and  
384 infection.

385  
386 The second major difference between MSP1/AMA1-specific B cells and CIDR $\alpha$ 1-specific B cells  
387 was that the large majority of atypical B cells subset 1 were CIDR $\alpha$ 1-specific. We previously  
388 reported that this subset of atypical B cells had the most “atypical” phenotype, with highest  
389 expression of CD19, CD11c, FcRL5, and T-bet, and upregulated many genes that are involved  
390 in antigen presentation and interaction with T cells (18). This subset of atypical B cells is most  
391 likely to home to the spleen where they function as a memory B cell subset, possibly to rapidly  
392 respond to systemic infections (32,33). Their presence in the circulation may be the result of  
393 spillover from the spleen, either due to limited space to harbor all newly formed atypical B cells  
394 or to distortion of the spleen architecture during *P. falciparum* infections (34). In the circulation,  
395 the proportion of this atypical B cell subset decreased after a period without *P. falciparum*

396 infection. However, it is possible that these cells are longer-lived in the spleen and are more  
397 abundant than can be assessed using PBMCs.

398

399 What may underlie the differences in phenotype between MSP1/AMA1-specific and CIDR $\alpha$ 1-  
400 specific memory B cells? One possible explanation may be a difference in the type of cell that  
401 initially captures the antigen for presentation to CD4<sup>+</sup> T cells. MSP1 and AMA1 are both shed  
402 from the merozoite surface during invasion and are thus present in the circulation in soluble  
403 form (35). Dendritic cells are highly efficient at taking up and presenting soluble antigen (36). In  
404 contrast, PfEMP1 is expressed on the surface of infected erythrocytes, which can be considered  
405 'particles'. Dendritic cells have been shown to be dispensable for mounting an immune  
406 response to particulate antigens (37). Instead, B cells are the primary antigen-presenting cells  
407 that take up particulate antigens, including *Plasmodium*-infected erythrocytes (36–38). Gao *et*  
408 *al.* recently showed that atypical B cells were better at presenting antigen and activating CD4<sup>+</sup> T  
409 cells than other B cell subsets (39). In line with these observations, we show that atypical B cell  
410 subset 1 (that seems primed for antigen presentation) was enriched for particle-associated  
411 CIDR $\alpha$ 1-specific B cells over B cells with specificity for soluble antigens MSP1 and AMA1,  
412 suggesting that capturing infected erythrocytes and presenting parasite antigens to T cells may  
413 be an important function of this atypical B cell subset. We have previously determined that this  
414 subset of atypical B cells can also be stimulated to differentiate into antibody-secreting cells in  
415 vitro (18), indicating that it may have dual roles in the immune response to *P. falciparum*.

416

417 Another explanation for the observed differences in phenotype of antigen-specific B cells is that  
418 certain B cell receptor properties predispose B cells to a certain fate. It has been hypothesized  
419 that atypical B cells are derived from anergic cells with low levels of autoreactivity (40). During  
420 *P. falciparum* infection, these cells could be activated and acquire mutations in the B cell  
421 receptor that increase their affinity to *P. falciparum* antigens and at the same time decrease

422 their autoreactivity (40). In line with this theory, we have previously observed differences in  
423 antibody heavy chain V-gene usage between memory and atypical B cells (41). Specifically, we  
424 showed that V<sub>H</sub>3-48 was overrepresented among IgG<sup>+</sup> atypical B cells. Interestingly, we have  
425 recently isolated two broadly inhibitory antibodies against CIDR $\alpha$ 1 that both used V<sub>H</sub>3-48 (20).  
426 These observations suggest that intrinsic autoreactivity of their B cell receptor may equip  
427 atypical B cells with the potential to recognize *P. falciparum* variant surface antigens.

428  
429 Finally, it cannot be ruled out that *P. falciparum*-exposed individuals have different life-time  
430 levels and frequencies of exposure to these two groups of antigens that may result in  
431 differences in phenotypes of long-lived B cells. With every asexual replication cycle of blood-  
432 stage *P. falciparum*, MSP1 and AMA1 are expressed to mediate erythrocyte invasion. B cell  
433 responses against these two antigens are thus expected to get boosted with every *P. falciparum*  
434 infection. On the other hand, not all PfEMP1 variants contain a CIDR $\alpha$ 1 domain (42). Although  
435 the parasite population within an infected individual may collectively express multiple PfEMP1  
436 variants, it is possible that not every infection leads to exposure of the immune system to  
437 CIDR $\alpha$ 1. However, we observed a similar reduction of activated MSP1/AMA1-specific and  
438 CIDR $\alpha$ 1-specific cells from the pre-IRS to the post-IRS time point among all major B cell  
439 populations: naïve, unswitched memory, switched memory, and atypical B cells. In addition, the  
440 unsupervised clustering analysis of antigen-specific B cells identified a population of CIDR $\alpha$ 1-  
441 specific plasmablasts that were short-lived in the circulation. Together, these observations  
442 suggest that the individuals in this study had recently been exposed to CIDR $\alpha$ 1 and that a lack  
443 of CIDR $\alpha$ 1 exposure in itself cannot explain the differences in long-lived memory B cell  
444 responses between CIDR $\alpha$ 1 and merozoite antigens.

445  
446 This study has several limitations. First, the study population is relatively small and  
447 homogeneous (ten women between 25 and 65 years of age). Performing a similar analysis in a

448 larger cohort of individuals of different age groups, including children and men, will strengthen  
449 our observations. Second, we assessed B cell responses almost 1.5 – 2 years after the last  
450 known *P. falciparum* infection, which is a relatively short time without antigen exposure. Long-  
451 lived memory B cells have been detected decades after infection or vaccination (4–8,43). It  
452 would be interesting to survey the ten individuals included in this study again at a later time  
453 point. Third, our analyses are restricted to B cell phenotype and did not include functional  
454 assessment of the various B cell populations identified here. Finally, we detected relatively few  
455 antigen-specific B cells, especially for CIDR $\alpha$ 1 in the absence of *P. falciparum* exposure, which  
456 prevented us from analyzing responses for each person separately. Instead, we aggregated  
457 antigen-specific B cells from ten individuals and analyzed them in bulk. Using antigen probes of  
458 additional CIDR $\alpha$ 1 variants and non-3D7 *P. falciparum* MSP1/AMA1 variants could facilitate the  
459 detection of larger numbers of antigen-specific B cells.

460

461 In conclusion, we analyzed long-lived B cell responses against merozoite antigens and variant  
462 surface antigens in individuals living in a malaria-endemic region at a time when *P. falciparum*  
463 transmission was high, and after at least a year (median of 1.7 years) without parasite  
464 exposure. The loss of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells in the circulation was  
465 similar, but the phenotype of long-lived MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells was  
466 different. The majority of long-lived MSP1/AMA1-specific were CD95<sup>+</sup>CD11c<sup>+</sup> memory B cells  
467 and FcRL5<sup>+</sup>T-bet<sup>+</sup> atypical B cells, whereas the majority of long-lived CIDR $\alpha$ 1-specific B cells  
468 were CD95<sup>-</sup>CD11c<sup>-</sup> memory B cells. Our results do not necessarily point to a qualitative  
469 difference in the memory B cell response to these antigens but may be reflective of differences  
470 in how these different antigens are recognized or processed by the immune system, and how  
471 the immune response will unfold during a new *P. falciparum* infection.

472

473

## 474 **MATERIALS AND METHODS**

### 475 **Study design and ethics approval**

476 All ten individuals included in this study were residents of the Nagongera sub-county in Tororo  
477 District, Uganda. This region was historically characterized by extremely high *P. falciparum*  
478 transmission intensity, with an estimated annual entomological inoculation rate of 125 infectious  
479 bites per person per year (44). Since 2015, multiple rounds of indoor residual spraying (IRS)  
480 have dramatically reduced malaria incidence compared with pre-IRS levels (19). Individuals  
481 were selected for inclusion into this study based on age and *P. falciparum* exposure. All  
482 individuals included in this study were enrolled in The Program for Resistance, Immunology,  
483 Surveillance, and Modeling of Malaria (PRISM) program (45) and have provided written consent  
484 for the use of their samples for research. The PRISM cohort study was approved by the  
485 Makerere University School of Medicine Research and Ethics Committee (SOMREC), London  
486 School of Hygiene and Tropical Medicine IRB, the University of California, San Francisco  
487 Human Research Protection Program, and the Stanford University School of Medicine IRB. The  
488 use of cohort samples for this study was approved by the Institutional Review Board of the  
489 University of Texas Health Science Center at San Antonio.

490

### 491 **B cell isolation**

492 Cryopreserved PBMCs were thawed and immediately mixed with pre-warmed (37°C) thawing  
493 medium (IMDM/GlutaMAX supplemented with 10% heat-inactivated FBS (USA origin) and  
494 0.01% Universal Nuclease (Thermo, #88700)) to wash away the DMSO. After centrifugation  
495 (250 × g, 5 min at RT), the cell pellet was resuspended in warm thawing medium and viable  
496 cells were counted. Next, cells were centrifuged (250 × g, 5 min at RT), resuspended in isolation  
497 buffer (PBS with 2% FBS and 1 mM (f/c) EDTA) at 50 million live cells/mL, and filtered through a  
498 35 µm sterile filter cap (Corning, # 352235) to break apart any aggregated PBMCs. B cells were  
499 isolated by negative selection using the EasySep Human B Cell Isolation Kit (StemCell, #17954)

500 or the MojoSort Human Pan B Cell Isolation Kit (BioLegend, # 480082) according to the  
501 manufacturer's instructions.

502

### 503 **Staining for spectral flow analysis**

504 C-terminally biotinylated full-length *P. falciparum* 3D7 MSP1 and AMA1 were produced in  
505 Expi293F cells (Thermo, # A14635) as described previously (10). C-terminally StrepTagII  
506 labeled HB3VAR03 CIDR $\alpha$ 1.4 and IT4VAR20 CIDR $\alpha$ 1.1 were produced in baculovirus-infected  
507 insect cells as described previously (46). Antigen tetramers were synthesized by incubating  
508 protein with fluorophore-conjugated streptavidin overnight at 4°C at a molar ratio of 6:1 with  
509 rotation. MSP1 and AMA1 tetramers were made with APC-conjugated streptavidin (Cytex, # 20-  
510 4317-U100) and BUV563-conjugated streptavidin (BD, # 612935), while CIDR $\alpha$ 1 tetramers were  
511 generated with PE-labeled streptavidin (Cytex, # 50-4317-U100) and BUV661-conjugated  
512 streptavidin (BD, # 612979). B cells isolated by negative selection were washed with PBS,  
513 centrifuged (250  $\times$  g, 5 min), resuspended in 1 ml of PBS containing 1  $\mu$ l live/dead stain  
514 (Zombie UV Fixable Viability kit (Biolegend, # 423107)) and incubated on ice for 30 min. Cells  
515 were subsequently washed with cold PBS containing 1% BSA (250  $\times$  g, 5 min, 4°C),  
516 resuspended with a cocktail of 25  $\mu$ M of each merozoite tetramer (MSP1/AMA1) diluted in PBS  
517 containing 1% BSA to a volume of 100  $\mu$ l, and incubated at 4°C for 30 min. The cells were then  
518 washed twice with cold PBS containing 1% BSA (250  $\times$  g, 5 min, 4°C) and incubated with a  
519 cocktail of 25  $\mu$ M of each CIDR $\alpha$ 1 tetramer (CIDR $\alpha$ 1.1/ CIDR $\alpha$ 1.4) diluted in PBS containing 1%  
520 BSA to a volume of 100  $\mu$ l, and incubated at 4°C for 30 min. Next, the cells were washed twice  
521 with cold PBS containing 1% BSA (250  $\times$  g, 5 min, 4°C) and incubated at 4°C for 30 min with a  
522 B cell surface marker antibody cocktail (**Table S2**) with 10  $\mu$ l Brilliant Stain Buffer Plus (BD, #  
523 566385) diluted in PBS containing 1% BSA up to a volume of 100  $\mu$ l. The cells were then  
524 washed with cold PBS containing 1% BSA (250  $\times$  g, 5 min, 4°C), resuspended in 1 ml of  
525 Transcription Factor Fix/Perm Concentrate (Cytex, part of # TNB-0607-KIT), diluted with 3 parts

526 Transcription Factor Fix/Perm Diluent (Cytex), and incubated at 4°C for 1 hour. After the  
527 incubation, the cells were washed twice with 3 ml of 1× Flow Cytometry Perm Buffer (Cytex)  
528 (300 × g, 8 min, 4°C) and resuspended in 1× Flow Cytometry Perm Buffer with an anti-human T-  
529 bet antibody. After an incubation at 4°C for 30 min, the cells were washed twice with 3 ml cold  
530 1× Flow Cytometry Perm Buffer (300 × g, 8 min, 4°C) and once with 3 ml cold PBS containing  
531 1% BSA, resuspended in cold PBS containing 1% BSA to 20 – 30 million cells/ml and filtered  
532 into a FACS tube through a 35 µm sterile filter cap. Cells were analyzed by flow cytometry  
533 immediately following intracellular staining.

534

### 535 **Spectral flow cytometry analysis**

536 B cells were analyzed on a Cytex Aurora spectral flow cytometer equipped with five lasers.  
537 SpectroFlo QC Beads (Cytex, # N7-97355) were run prior to each experiment for routine  
538 performance tracking. Daily quality control and Levey-Jennings tracking reports were used to  
539 ensure optimal performance of the machine and to confirm that settings between different runs  
540 were comparable. Pooled B cells from two malaria-naïve US donors were used for the  
541 unstained control, technical replicates, and to perform compensation for the live/dead stain.  
542 UltraComp eBeads Plus Compensation Beads (Thermo, #01-3333-41) were used to perform  
543 compensation for all other fluorophores. Between experiments performed on different days, the  
544 technical replicates showed near perfect correlation between the expression of cell surface and  
545 intracellular markers (Spearman  $r = 0.98$ ). To minimize experimental variation, paired samples  
546 were analyzed within the same experiment.

547

548 The cytometry analysis software OMIQ (Dotmatics) was used for all data analysis. B cell  
549 subsets and antigen specific B cells were manually gated in OMIQ (**Figure S1**). Since both  
550 MSP1 and AMA1 tetramers were generated in the same two fluorochrome format (APC and  
551 BUV563), MSP1/AMA-specific B cells were collectively defined as cells staining positive for both



552 tetramer formats. For CIDR $\alpha$ 1, we used the domain variants IT4VAR20 CIDR $\alpha$ 1.1, HB3VAR03  
553 CIDR $\alpha$ 1.4, and IT4VAR22 CIDR $\alpha$ 1.7 that are highly diverse in sequence. Because tetramers for  
554 each CIDR $\alpha$ 1 variant were generated using PE and BUV661 fluorochromes, B cells binding  
555 either one of the two variants were indistinguishable. Therefore, all CIDR $\alpha$ 1.1, CIDR $\alpha$ 1.4, and  
556 CIDR $\alpha$ 1.7-reactive B cells were collectively referred to as CIDR $\alpha$ 1-specific B cells. Antigen-  
557 specific B cells were defined as cells staining positive for both tetramer formats in a single  
558 antigen group. To exclude any non-specific binders, B cells with reactivity to both MSP1/AMA1  
559 and CIDR $\alpha$ 1 probes were removed. Thus, the gating strategy for antigen-specific B cells is  
560 summarized as follows: single / live / CD19<sup>+</sup> / CD20<sup>+</sup> / IgD<sup>-</sup> / non-strep / (MSP1/AMA1<sup>+</sup> or  
561 CIDR $\alpha$ 1<sup>+</sup>).

562  
563 Data integration and dimension reduction analysis were performed using Uniform Manifold  
564 Approximation and Projection (UMAP). UMAPs of antigen-specific B cells were created using  
565 the expression of CD19, CD20, CD21, CD24, CD27, CD38, CD83, CD86, CD95, CXCR3,  
566 CXCR5, CD11c, FcRL5, and T-bet as features with default parameters (neighbors = 15,  
567 minimum distance = 0.8, metric = Euclidean, random seed = 2478) and included all 20 Ugandan  
568 donor samples used in this study for initial projection. FlowSOM (47) was used to identify six cell  
569 subsets based on the expression of CD19, CD20, CD21, CD24, CD27, CD38, CD83, CD86,  
570 CD95, CXCR3, CXCR5, CD11c, FcRL5, and T-bet (metric = Euclidean, random seed = 1150).  
571 For the analysis of atypical B cells, atypical B cells were pre-gated on single / live / CD19<sup>+</sup> /  
572 CD20<sup>+</sup> / CD21<sup>-</sup> / CD27<sup>-</sup> / CD11c<sup>+</sup> / IgD<sup>-</sup> cells, followed by the generation of a UMAP (neighbors =  
573 15, minimum distance = 0.8, metric = Euclidean, random seed = 2742) based on the expression  
574 of markers associated with atypical B cells (CD19, CD20, CD24, CD38, CD86, CD95, CXCR3,  
575 CXCR5, CD11c, FcRL5, and T-bet). To define the three atypical B cell subsets, FlowSOM (47)  
576 was used to identify three clusters based on CD11c and CD86 expression using default  
577 parameters (metric = Euclidean, random seed = 7333). For the projection of antigen-specific B

578 cells onto the UMAP, gates were manually set to identify populations of interest using two-  
579 dimensional displays, which were then overlaid onto the UMAP projection. Mean fluorescence  
580 intensities of cell surface and intracellular markers in select B cell subsets were calculated using  
581 the heatmap function in OMIQ. For the analysis of expression of individual markers (CD95,  
582 CD11c, T-bet, and FcRL5) in switched memory B cells, samples with fewer than 10 cells were  
583 excluded from analysis.

584

### 585 **Percent overlap in B cell populations**

586 To determine the similarity in distribution of MSP1/AMA1-specific and CIDR $\alpha$ 1-specific B cells  
587 over six B cell subsets, we calculated the percentage overlap between pair-wise combinations  
588 of samples. For each subset, we determined which of the two samples had the smallest fraction  
589 of that subset. For example, if subset A took up 25% of sample x and 17% of sample y, we used  
590 the value of 17%. We then calculated the sum of these six smallest fractions to obtain the  
591 overlap in composition between the two samples. All distributions and calculations of percent  
592 overlap are included in **Table S3**.

593

### 594 **Statistical analysis**

595 Statistical analyses of flow cytometry data were performed in GraphPad Prism 10 with details of  
596 statistical tests provided in the relevant figure legends. P values < 0.05 were considered  
597 statistically significant.

598

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609

## 610 **Author contributions**

611 R.A.R. performed spectral flow cytometry experiments and data analysis. L.T. and T.L. provided  
612 CIDR $\alpha$ 1 proteins. I.S., P.J., M.E.F., and B.G. provided clinical samples. R.A.R., S.B., and  
613 E.M.B. wrote the manuscript with input from all other co-authors. All authors contributed to the  
614 article and approved the submitted version.

615

## 616 **References**

- 617 1. World malaria report 2023 [Internet]. [cited 2024 Mar 12]. Available from:  
618 <https://www.who.int/teams/global-malaria-programme/reports/world-malaria-report-2023>
- 619 2. Dent AE, Nakajima R, Liang L, Baum E, Moormann AM, Sumba PO, et al. Plasmodium  
620 falciparum Protein Microarray Antibody Profiles Correlate With Protection From  
621 Symptomatic Malaria in Kenya. *J Infect Dis*. 2015 Nov 1;212(9):1429–38.
- 622 3. Crompton PD, Kayala MA, Traore B, Kayentao K, Ongoiba A, Weiss GE, et al. A  
623 prospective analysis of the Ab response to Plasmodium falciparum before and after a  
624 malaria season by protein microarray. *Proc Natl Acad Sci*. 2010 Apr 13;107(15):6958–63.
- 625 4. Ndungu FM, Lundblom K, Rono J, Illingworth J, Eriksson S, Färnert A. Long-lived  
626 Plasmodium falciparum specific memory B cells in naturally exposed Swedish travelers. *Eur*  
627 *J Immunol*. 2013;43(11):2919–29.
- 628 5. Ndungu FM, Olotu A, Mwacharo J, Nyonda M, Apfeld J, Mramba LK, et al. Memory B cells  
629 are a more reliable archive for historical antimalarial responses than plasma antibodies in  
630 no-longer exposed children. *Proc Natl Acad Sci*. 2012 May 22;109(21):8247–52.
- 631 6. Ayieko C, Maue AC, Jura WGZO, Noland GS, Ayodo G, Rochford R, et al. Changes in B  
632 Cell Populations and Merozoite Surface Protein-1-Specific Memory B Cell Responses after  
633 Prolonged Absence of Detectable *P. falciparum* Infection. *PLOS ONE*. 2013 Jun  
634 27;8(6):e67230.

- 635 7. Wipasa J, Suphavitai C, Okell LC, Cook J, Corran PH, Thaikla K, et al. Long-Lived Antibody  
636 and B Cell Memory Responses to the Human Malaria Parasites, *Plasmodium falciparum*  
637 and *Plasmodium vivax*. *PLOS Pathog*. 2010 Feb 19;6(2):e1000770.
- 638 8. Ampomah P, Stevenson L, Ofori MF, Barfod L, Hviid L. B-Cell Responses to Pregnancy-  
639 Restricted and -Unrestricted *Plasmodium falciparum* Erythrocyte Membrane Protein 1  
640 Antigens in Ghanaian Women Naturally Exposed to Malaria Parasites. *Infect Immun*. 2014  
641 Apr 18;82(5):1860–71.
- 642 9. Hopp CS, Sekar P, Diouf A, Miura K, Boswell K, Skinner J, et al. *Plasmodium falciparum*-  
643 specific IgM B cells dominate in children, expand with malaria, and produce functional IgM. *J*  
644 *Exp Med*. 2021 Mar 4;218(4):e20200901.
- 645 10. Gonzales SJ, Clarke KN, Batugedara G, Garza R, Reyes RA, Ssewanyana I, et al. A  
646 Molecular Analysis of Memory B Cell and Antibody Responses Against *Plasmodium*  
647 *falciparum* Merozoite Surface Protein 1 in Children and Adults From Uganda. *Front Immunol*  
648 [Internet]. 2022 Jun 2 [cited 2024 Mar 12];13. Available from:  
649 <https://www.frontiersin.org/journals/immunology/articles/10.3389/fimmu.2022.809264/full>
- 650 11. Nellore A, Zumaquero E, Scharer CD, Fucile CF, Tipton CM, King RG, et al. A  
651 transcriptionally distinct subset of influenza-specific effector memory B cells predicts long-  
652 lived antibody responses to vaccination in humans. *Immunity*. 2023 Apr 11;56(4):847-  
653 863.e8.
- 654 12. Kim CC, Baccarella AM, Bayat A, Pepper M, Fontana MF. FCRL5+ Memory B Cells Exhibit  
655 Robust Recall Responses. *Cell Rep*. 2019 Apr 30;27(5):1446-1460.e4.
- 656 13. Ogega CO, Skinner NE, Blair PW, Park HS, Littlefield K, Ganesan A, et al. Durable SARS-  
657 CoV-2 B cell immunity after mild or severe disease. *J Clin Invest* [Internet]. 2021 Apr 1 [cited  
658 2024 Mar 12];131(7). Available from: <https://www.jci.org/articles/view/145516>
- 659 14. Reyes RA, Clarke K, Gonzales SJ, Cantwell AM, Garza R, Catano G, et al. SARS-CoV-2  
660 spike-specific memory B cells express higher levels of T-bet and FcRL5 after non-severe  
661 COVID-19 as compared to severe disease. *PLOS ONE*. 2021 Dec 22;16(12):e0261656.
- 662 15. Weiss GE, Traore B, Kayentao K, Ongoiba A, Doumbo S, Doumtabe D, et al. The  
663 *Plasmodium falciparum*-Specific Human Memory B Cell Compartment Expands Gradually  
664 with Repeated Malaria Infections. *PLOS Pathog*. 2010 May 20;6(5):e1000912.
- 665 16. Weiss GE, Crompton PD, Li S, Walsh LA, Moir S, Traore B, et al. Atypical Memory B Cells  
666 Are Greatly Expanded in Individuals Living in a Malaria-Endemic Area1. *J Immunol*. 2009  
667 Aug 1;183(3):2176–82.
- 668 17. Hopp CS, Skinner J, Anzick SL, Tipton CM, Peterson ME, Li S, et al. Atypical B cells up-  
669 regulate costimulatory molecules during malaria and secrete antibodies with T follicular  
670 helper cell support. *Sci Immunol*. 2022 May 13;7(71):eabn1250.
- 671 18. Reyes RA, Batugedara G, Dutta P, Reers AB, Garza R, Ssewanyana I, et al. Atypical B cells  
672 consist of subsets with distinct functional profiles. *iScience*. 2023 Dec 15;26(12):108496.
- 673 19. Kanya MR, Kakuru A, Muhindo M, Arinaitwe E, Nankabirwa JI, Rek J, et al. The Impact of  
674 Control Interventions on Malaria Burden in Young Children in a Historically High-  
675 Transmission District of Uganda: A Pooled Analysis of Cohort Studies from 2007 to 2018.  
676 *Am J Trop Med Hyg*. 2020 May 18;103(2):785–92.
- 677 20. Reyes RA, Raghavan SSR, Hurlburt NK, Introini V, Kana IH, Jensen RW, et al. Broadly  
678 inhibitory antibodies against severe malaria virulence proteins [Internet]. *bioRxiv*; 2024 [cited  
679 2024 Apr 5]. p. 2024.01.25.577124. Available from:  
680 <https://www.biorxiv.org/content/10.1101/2024.01.25.577124v1>
- 681 21. Portugal S, Tipton CM, Sohn H, Kone Y, Wang J, Li S, et al. Malaria-associated atypical  
682 memory B cells exhibit markedly reduced B cell receptor signaling and effector function.  
683 Krzych U, editor. *eLife*. 2015 May 8;4:e07218.

- 684 22. Holla P, Dizon B, Ambegaonkar AA, Rogel N, Goldschmidt E, Boddapati AK, et al. Shared  
685 transcriptional profiles of atypical B cells suggest common drivers of expansion and function  
686 in malaria, HIV, and autoimmunity. *Sci Adv*. 2021 May 26;7(22):eabg8384.
- 687 23. Sullivan RT, Kim CC, Fontana MF, Feeney ME, Jagannathan P, Boyle MJ, et al. FCRL5  
688 Delineates Functionally Impaired Memory B Cells Associated with *Plasmodium falciparum*  
689 Exposure. *PLOS Pathog*. 2015 May 19;11(5):e1004894.
- 690 24. Woodruff MC, Ramonell RP, Haddad NS, Anam FA, Rudolph ME, Walker TA, et al.  
691 Dysregulated naive B cells and de novo autoreactivity in severe COVID-19. *Nature*. 2022  
692 Nov;611(7934):139–47.
- 693 25. Stewart A, Ng JCF, Wallis G, Fraternali F, Dunn-Walters DK. Single-Cell Transcriptomic  
694 Analyses Define Distinct Peripheral B Cell Subsets and Discrete Development Pathways.  
695 *Front Immunol* [Internet]. 2021 Mar 18 [cited 2024 Mar 13];12. Available from:  
696 <https://www.frontiersin.org/journals/immunology/articles/10.3389/fimmu.2021.602539/full>
- 697 26. Glass DR, Tsai AG, Oliveria JP, Hartmann FJ, Kimmey SC, Calderon AA, et al. An  
698 Integrated Multi-omic Single-Cell Atlas of Human B Cell Identity. *Immunity*. 2020 Jul  
699 14;53(1):217-232.e5.
- 700 27. Jahnmatz P, Sundling C, Yman V, Widman L, Asghar M, Sondén K, et al. Memory B-Cell  
701 Responses Against Merozoite Antigens After Acute *Plasmodium falciparum* Malaria,  
702 Assessed Over One Year Using a Novel Multiplexed FluoroSpot Assay. *Front Immunol*  
703 [Internet]. 2021 Feb 12 [cited 2024 Apr 22];11. Available from:  
704 <https://www.frontiersin.org/journals/immunology/articles/10.3389/fimmu.2020.619398/full>
- 705 28. Jahnmatz P, Nyabundi D, Sundling C, Widman L, Mwacharo J, Musyoki J, et al.  
706 *Plasmodium falciparum*-Specific Memory B-Cell and Antibody Responses Are Associated  
707 With Immunity in Children Living in an Endemic Area of Kenya. *Front Immunol* [Internet].  
708 2022 Mar 9 [cited 2024 Apr 22];13. Available from:  
709 <https://www.frontiersin.org/journals/immunology/articles/10.3389/fimmu.2022.799306/full>
- 710 29. Daniel PT, Krammer PH. Activation induces sensitivity toward APO-1 (CD95)-mediated  
711 apoptosis in human B cells. *J Immunol*. 1994 Jun 15;152(12):5624–32.
- 712 30. Peter ME, Budd RC, Desbarats J, Hedrick SM, Hueber AO, Newell MK, et al. The CD95  
713 Receptor: Apoptosis Revisited. *Cell*. 2007 May 4;129(3):447–50.
- 714 31. Golinski ML, Demeules M, Derambure C, Riou G, Maho-Vaillant M, Boyer O, et al. CD11c+  
715 B Cells Are Mainly Memory Cells, Precursors of Antibody Secreting Cells in Healthy Donors.  
716 *Front Immunol* [Internet]. 2020 Feb 25 [cited 2024 Apr 21];11. Available from:  
717 <https://www.frontiersin.org/journals/immunology/articles/10.3389/fimmu.2020.00032/full>
- 718 32. Johnson JL, Rosenthal RL, Knox JJ, Myles A, Naradikian MS, Madej J, et al. The  
719 Transcription Factor T-bet Resolves Memory B Cell Subsets with Distinct Tissue  
720 Distributions and Antibody Specificities in Mice and Humans. *Immunity*. 2020 May  
721 19;52(5):842-855.e6.
- 722 33. Song W, Antao OQ, Condiff E, Sanchez GM, Chernova I, Zembrzuski K, et al. Development  
723 of Tbet- and CD11c-expressing B cells in a viral infection requires T follicular helper cells  
724 outside of germinal centers. *Immunity*. 2022 Feb 8;55(2):290-307.e5.
- 725 34. Urban BC, Hien TT, Day NP, Phu NH, Roberts R, Pongponratn E, et al. Fatal *Plasmodium*  
726 *falciparum* Malaria Causes Specific Patterns of Splenic Architectural Disorganization. *Infect*  
727 *Immun*. 2005 Apr;73(4):1986–94.
- 728 35. Harris PK, Yeoh S, Dluzewski AR, O'Donnell RA, Withers-Martinez C, Hackett F, et al.  
729 Molecular Identification of a Malaria Merozoite Surface Sheddase. *PLOS Pathog*. 2005 Nov  
730 25;1(3):e29.
- 731 36. Fontana MF, Ollmann Saphire E, Pepper M. *Plasmodium* infection disrupts the T follicular  
732 helper cell response to heterologous immunization. Kurosaki T, Taniguchi T, Boyle MJ,  
733 editors. *eLife*. 2023 Jan 30;12:e83330.

- 734 37. Hong S, Zhang Z, Liu H, Tian M, Zhu X, Zhang Z, et al. B Cells Are the Dominant Antigen-  
735 Presenting Cells that Activate Naive CD4<sup>+</sup> T Cells upon Immunization with a Virus-Derived  
736 Nanoparticle Antigen. *Immunity*. 2018 Oct 16;49(4):695-708.e4.
- 737 38. Arroyo EN, Pepper M. B cells are sufficient to prime the dominant CD4<sup>+</sup> Tfh response to  
738 Plasmodium infection. *J Exp Med*. 2019 Nov 20;217(2):e20190849.
- 739 39. Gao X, Shen Q, Roco JA, Dalton B, Frith K, Munier CML, et al. Zeb2 drives the formation of  
740 CD11c<sup>+</sup> atypical B cells to sustain germinal centers that control persistent infection. *Sci*  
741 *Immunol*. 2024 Feb 8;eadj4748.
- 742 40. Ambegaonkar AA, Holla P, Dizon BL, Sohn H, Pierce SK. Atypical B cells in chronic  
743 infectious diseases and systemic autoimmunity: puzzles with many missing pieces. *Curr*  
744 *Opin Immunol*. 2022 Aug 1;77:102227.
- 745 41. Braddom AE, Bol S, Gonzales SJ, Reyes RA, Musinguzi K, Nankya F, et al. B Cell Receptor  
746 Repertoire Analysis in Malaria-Naive and Malaria-Experienced Individuals Reveals Unique  
747 Characteristics of Atypical Memory B Cells. *mSphere*. 2021 Sep  
748 15;6(5):10.1128/msphere.00726-21.
- 749 42. Rask TS, Hansen DA, Theander TG, Pedersen AG, Lavstsen T. Plasmodium falciparum  
750 Erythrocyte Membrane Protein 1 Diversity in Seven Genomes – Divide and Conquer. *PLOS*  
751 *Comput Biol*. 2010 Sep 16;6(9):e1000933.
- 752 43. Amanna IJ, Carlson NE, Slifka MK. Duration of Humoral Immunity to Common Viral and  
753 Vaccine Antigens. *N Engl J Med*. 2007 Nov 8;357(19):1903–15.
- 754 44. Kilama M, Smith DL, Hutchinson R, Kigozi R, Yeka A, Lavoy G, et al. Estimating the annual  
755 entomological inoculation rate for Plasmodium falciparum transmitted by Anopheles  
756 gambiae s.l. using three sampling methods in three sites in Uganda. *Malar J*. 2014 Mar  
757 21;13(1):111.
- 758 45. Kanya MR, Arinaitwe E, Wanzira H, Katureebe A, Barusya C, Kigozi SP, et al. Malaria  
759 Transmission, Infection, and Disease at Three Sites with Varied Transmission Intensity in  
760 Uganda: Implications for Malaria Control. *Am J Trop Med Hyg*. 2015 May 6;92(5):903–12.
- 761 46. Lau CKY, Turner L, Jespersen JS, Lowe ED, Petersen B, Wang CW, et al. Structural  
762 Conservation Despite Huge Sequence Diversity Allows EPCR Binding by the PfEMP1  
763 Family Implicated in Severe Childhood Malaria. *Cell Host Microbe*. 2015 Jan 14;17(1):118–  
764 29.
- 765 47. Van Gassen S, Callebaut B, Van Helden MJ, Lambrecht BN, Demeester P, Dhaene T, et al.  
766 FlowSOM: Using self-organizing maps for visualization and interpretation of cytometry data.  
767 *Cytometry A*. 2015;87(7):636–45.
- 768