

## Cell Reports

# VIROLOGICAL AND IMMUNOLOGICAL FEATURES OF SARS-CoV-2 INFECTED CHILDREN DEVELOPING SPECIFIC AND NEUTRALIZING ANTIBODIES

--Manuscript Draft--

<b>Manuscript Number:</b>	CELL-REPORTS-D-20-04757
<b>Full Title:</b>	VIROLOGICAL AND IMMUNOLOGICAL FEATURES OF SARS-CoV-2 INFECTED CHILDREN DEVELOPING SPECIFIC AND NEUTRALIZING ANTIBODIES
<b>Article Type:</b>	Research Article
<b>Keywords:</b>	SARS-CoV-2; pediatric COVID-19; anti-SARS-CoV-2 antibodies; Ab-mediated neutralization activity; antigen-specific CD4 T cells; antigen-specific B-cells.
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<b>Abstract:</b>	As the global COVID-19 pandemic progresses and with the school reopening, it is paramount to gain knowledge on adaptive immunity to SARS-CoV-2 in children in order to define possible immunization strategies and reconsider pandemic control measures. We analyzed anti-SARS-CoV-2 antibodies (Ab) and their neutralizing activity (PRNT) in 42 COVID-19-infected children 7 days after symptoms onset. Individuals with specific humoral responses presented faster virus clearance, and lower viral load associated to a reduced in vitro infectivity. We demonstrated that the frequencies of SARS-CoV-2 specific CD4-CD40L+ T-cells and Spike specific B-cells

	<p>were associated with the anti-SARS-CoV-2 Ab and the magnitude of neutralizing activity. The plasma proteome confirmed the association between cellular and humoral SARS-CoV-2 immunity, with PRNT+ patients showing higher viral signal transduction molecules (SLAMF1, CD244, CLEC4G). This work shed lights on cellular and humoral anti-SARS-CoV-2 responses in children which may drive future vaccination trials endpoints and quarantine measures policies.</p>
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September 14<sup>th</sup>, 2020

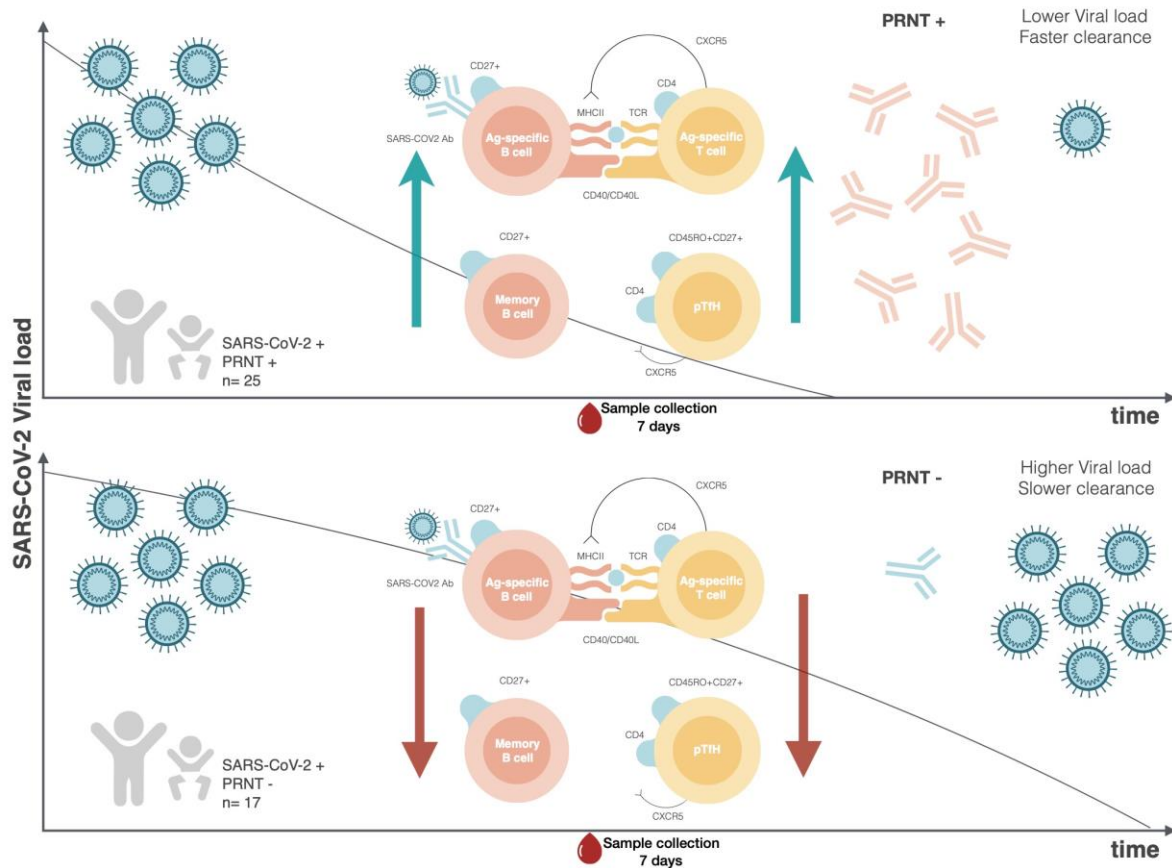
Dear Editor,

We are submitting a manuscript entitled “*VIROLOGICAL AND IMMUNOLOGICAL FEATURES OF SARS-CoV-2 INFECTED CHILDREN DEVELOPING NEUTRALIZING ANTIBODIES*” for consideration for publication as research article in Cell Reports.

In collaboration with Petter Brodin group, we recently described in Cell journal the immunological features of multi inflammatory syndrome (MIS-C) affecting a minor subgroup of children infected by SARS-CoV-2 (Consilio CR, Cell, 2020). Nonetheless the majority of children affected by SARS-CoV-2 do not resemble MIS-C, presenting a milder course of disease.

As the global COVID-19 pandemic progresses and with the forthcoming school reopening, children could represent a major source of infection. It is thus paramount to gain knowledge on adaptive immunity to SARS-CoV-2 in children in order to define possible immunization strategies and reconsider pandemic control measures. Noteworthy, discussion about quarantine times has been recently fueled by proposals to reduce such measure to 1 week. In the current work we describe for the first time to our knowledge, deep virological (by digital droplets PCR) and immunological (SARS-CoV-2 specific cellular and humoral responses) features of infected children 7 days after symptoms onset. We analyzed anti-SARS-CoV-2 antibodies (Ab) and their neutralizing activity (PRNT) in 42 COVID-19-infected children at the same time point. Individuals with specific humoral responses presented faster virus clearance, and lower viral load associated to a reduced *in vitro* infectivity. We demonstrated that the frequencies of SARS-CoV-2 specific CD4-CD40L+ T-cells and Spike specific B-cells were associated with the anti-SARS-CoV-2 Ab and the magnitude of neutralizing activity.

The present work shed lights on cellular and humoral anti-SARS-CoV-2 responses in children identifying endpoints and biological criteria which may drive future vaccination trials endpoints and quarantine measures policies.



We confirm that the manuscript has never been submitted or accepted for publication elsewhere. All the listed authors have seen and approved the content of the paper and have contributed significantly to the work. We hope you will find this manuscript of interest for your Journal.

Looking forward to your response,  
On behalf of the CACTUS study team,  
Sincerely,



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1 **VIROLOGICAL AND IMMUNOLOGICAL FEATURES OF SARS-CoV-2 INFECTED**  
2 **CHILDREN DEVELOPING NEUTRALIZING ANTIBODIES**

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36 **SUMMARY**

37 As the global COVID-19 pandemic progresses and with the school reopening, it is  
38 paramount to gain knowledge on adaptive immunity to SARS-CoV-2 in children in order to  
39 define possible immunization strategies and reconsider pandemic control measures. We  
40 analyzed anti-SARS-CoV-2 antibodies (Ab) and their neutralizing activity (PRNT) in 42  
41 COVID-19-infected children 7 days after symptoms onset. Individuals with specific humoral  
42 responses presented faster virus clearance, and lower viral load associated to a reduced *in*  
43 *vitro* infectivity. We demonstrated that the frequencies of SARS-CoV-2 specific CD4-  
44 CD40L+ T-cells and Spike specific B-cells were associated with the anti-SARS-CoV-2 Ab  
45 and the magnitude of neutralizing activity. The plasma proteome confirmed the association  
46 between cellular and humoral SARS-CoV-2 immunity, with PRNT+ patients showing higher  
47 viral signal transduction molecules (SLAMF1, CD244, CLEC4G). This work shed lights on  
48 cellular and humoral anti-SARS-CoV-2 responses in children which may drive future  
49 vaccination trials endpoints and quarantine measures policies.

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**Keywords:** SARS-CoV-2; pediatric COVID-19; anti-SARS-CoV-2 antibodies; Ab-mediated neutralization activity; antigen-specific CD4 T cells; antigen-specific B-cells.

**Keywords:** Total character (including spaces) count is 26,800

70

71 **INTRODUCTION**

72 The severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), first emerged in  
73 Wuhan in December 2019 (Huang et al., 2020), spread to Europe and in particular to the  
74 northern regions of Italy in the beginning of February 2020. On March 11, with more than  
75 100 countries reporting an increasing number of cases, the World Health Organization  
76 declared the global pandemic (www.euro.who.int, 2020). Despite the unprecedented  
77 scientific effort, the impact of antigen specific cellular immune responses (Altmann & Boyton,  
78 2020), and neutralizing antibodies (Zhang et al., 2020) is only partially known particularly in  
79 children. Ab-mediated neutralizing activity was shown 21 days after infection onset in the  
80 minority (2 out of 45) of specific monoclonal antibodies isolated from Antigen (Ag) specific  
81 B cells (Seydoux et al., 2020) of an infected adult. In particular, the most effective antibody  
82 showed a specific binding for the receptor-binding domain (RBD) and was able to prevent  
83 viral entry (Seydoux et al., 2020). The contribution of SARS-CoV-2 specific CD4+ T cells to  
84 the production of effective neutralizing antibodies has been recently showed in adults  
85 (Grifoni et al., 2020; Meckiff et al., 2020; Weiskopf et al., 2020), but no data on its impact on  
86 the virus nor its association to Ag specific B cells have been shown.

87

88 In the context of pediatric infection, data on the SARS-CoV-2 specific immunity are still  
89 scarce. Few studies showed that children are able to develop a robust neutralizing antibody  
90 response (Nab) after infection (Liu et al., 2020; Yonker et al., 2020; Zhang et al., 2020). On  
91 the other hand, SARS-CoV-2 specific T and B cell immunity needs to be defined in relation  
92 to neutralizing antibodies and viral control. Overall children experience milder clinical course  
93 of COVID19 as compared to adults (Gupta, Malhotra, Gupta, Agrawal, & Ish, 2020), and it  
94 is paramount to define the impact of adaptive SARS-CoV-2 specific immunity on viral spread  
95 and clinical course in pediatric cases (Brodin, 2020).

96

97 In this work we aim to define the humoral and cellular response in 42 SARS-CoV-2 infected  
98 children. We investigated the neutralizing antibodies (Abs) activity in SARS-CoV-2 infected  
99 children and its impact on the viral load in nasopharyngeal swabs (NP). We further explored  
100 Ag specific T and B cells defined as CD4+CD40L+ and SARS-CoV-2 spike (S1+S2) positive  
101 switched B cells. Finally we provided a comprehensive proteomic profile focusing on  
102 differences between SARS-CoV-2 infected individuals with differential neutralizing ability.

103



104

## 105 **RESULTS**

### 106 **Clinical and standard laboratory profile of SARS-CoV-2 infected children compared** 107 **to SARS-CoV-2 neg.**

108 Standard laboratory analysis and demographic characteristics were explored in order to  
109 define differences among SARS-CoV-2 infected children (SARS-CoV-2+), and those  
110 admitted for the clinical suspicion of SARS-CoV-2 but tested negative by both virological  
111 and serological methods (SARS-CoV-2 neg). SARS-CoV-2+ children were investigated for  
112 SARS-CoV-2 Ab titers and for the presence of neutralizing Abs measured by plaque  
113 reduction neutralization test (PRNT) on samples collected 7 days after symptoms onset. As  
114 shown in Table 1, patients were further stratified in PRNT+ and PRNT-, with seventeen  
115 (17/42, 40%) SARS-CoV-2 infected children been PRNT-. No significant differences in terms  
116 of age, male/female ratio, lymphocytes' count, hemoglobin (Hb) was found between PRNT+  
117 and PRNT- and SARS-CoV-2 neg (Table 1). Higher white blood cell count (WBC) was found  
118 in SARS-CoV-2 neg compared to PRNT+ ( $p=0.002$ ) and PRNT- ( $p=0.042$ ). This result is in  
119 line with the higher CRP levels found in SARS-CoV2 neg compared to both PRNT+ and  
120 PRNT- ( $p<0.0001$  and  $p=0.001$ , respectively, Table 1), supporting an alternative  
121 infectious/inflammatory condition in SARS-CoV-2 neg. At admission, PRNT+ and PRNT-  
122 patients did not differ with regards to symptomatology, according to WHO classification  
123 (<https://www.who.int/publications/i/item/clinical-management-of-covid-19>) (Table 1 and  
124 Supplementary Table 1).

125

### 126 **Sars-CoV-2 specific IgG and Ab neutralizing activity associate with faster virus** 127 **clearance, lower viral load and reduced *in vitro* infectivity.**

128 In NP, we evaluated the viral load by ddPCR and RT-PCR in association with SARS-CoV-2  
129 humoral responses. Our data show an inverse correlation between viral load in NP and both  
130 S1/S2 SARS-CoV-2 IgG ( $p=0.0005$ ;  $\rho=-0.69$ ) (Fig. 1a) and PRNT ( $p<0.0001$ ;  $\rho=-0.67$ )  
131 (Fig. 1b). *In vitro* infectivity, measured by foci forming unit (FFU), showed an inverse  
132 correlation with both S1/S2 SARS-CoV-2 IgG ( $p=0.003$ ;  $\rho=-0.67$ ) (Fig. 1c) and PRNT  
133 ( $p=0.023$ ;  $\rho=-0.46$ ) (Fig. 1d). Longitudinal analysis confirmed the impact of humoral  
134 responses on virus clearance. We calculated the area under the curve (AUC) of the viral  
135 load from NP collected every 48 hours up to undetectable viral load, and we found an inverse  
136 correlation with SARS-CoV-2 Ab ( $p=0.031$ ;  $\rho=-0.54$ ) (Fig. 1e). We further compared the  
137 levels of SARS-CoV-2 viral load in seropositive and seronegative individuals. Our results

138 show a significantly higher viral load in seronegative patients expressed in terms of both  
139 S1/S2 SARS-CoV-2 IgG ( $p=0.003$ ) and PRNT ( $p=0.0007$ ) (Fig. 1f). Overall these data  
140 confirm the role of SARS-CoV-2 specific humoral responses in controlling virus replication,  
141 expected infectivity and virus clearance. As previously reported (GeurtsvanKessel et al.,  
142 2020), we found S1/S2 SARS-CoV-2 IgG levels to positively correlate with PRNT titers  
143 ( $p=0.0002$ ;  $\rho=0.65$ ) (Supplementary Fig. 1).

144

#### 145 **SARS-CoV-2 specific B cells positively associates with SARS-CoV-2 specific IgG and** 146 **PRNT.**

147 The B cell compartment and the frequency of SARS-CoV-2 specific B cells were analyzed  
148 by FACS using an in-house fluorescently labelled probe expressing S1+S2 SARS-CoV-2  
149 proteins (gating strategy in Fig. 2a and Supplementary Fig. 2a). We analyzed the SARS-  
150 CoV-2 specific IgD-CD27<sup>+</sup> switched B cells (Fig. 2a) and we found a positive association  
151 with both S1/S2 SARS-CoV-2 IgG ( $p=0.003$ ;  $\rho=0.54$ ) and PRNT ( $p=0.008$ ;  $\rho=0.49$ ) (Fig.  
152 2b and 2c respectively). This association was also confirmed when Ag specific B cells were  
153 re- analyzed in SARS-CoV2<sup>+</sup> children stratified by their serological status. Indeed, a higher  
154 frequency of Ag specific B cells was found in seropositive compared to seronegative SARS-  
155 CoV-2 children ( $p=0.001$ ) (Fig. 2d). Despite being not significant ( $p=0.052$ ) (Fig. 2e) a higher  
156 frequency of Ag specific B cells was also found in PRNT<sup>+</sup>.

157

158 We further explored the standard B cell phenotype and we found no differences in terms of  
159 total B cells (CD19<sup>+</sup>CD10<sup>-</sup> B cells) in PRNT<sup>+</sup> compared to PRNT<sup>-</sup> (Supplementary Fig. 2b).  
160 B cell memory compartment analysis, according to the expression of IgD and CD27, showed  
161 a higher frequency of switched memory B cells in PRNT<sup>+</sup> compared to PRNT<sup>-</sup>  
162 (Supplementary Fig. 2c) despite no differences in age between the groups. According to the  
163 expression of CD21 and CD27, a lower frequency of Tissue like memory (TLM) B cells  
164 resulted in PRNT<sup>+</sup> compared to PRNT<sup>-</sup> (Supplementary Fig. 2d).

165

#### 166 **SARS-CoV-2 specific CD4 T cells are positively associated to PRNT**

167 To further characterize the immunological features of patients with differential neutralization  
168 activity against SARS-CoV-2, we investigated CD3<sup>+</sup>CD4<sup>+</sup> general phenotype and  
169 frequency of SARS-CoV-2 specific CD4 T cells (gating strategy in Fig. 3a and  
170 Supplementary Fig. 3a). Antigen specific CD4 T cells were defined through the analysis of  
171 CD40L after *in vitro* stimulation with SARS-CoV-2 antigens using a previously validated

172 methodology (Chattopadhyay, Yu, & Roederer, 2006; Cotugno et al., 2017; Cotugno,  
173 Morrocchi, et al., 2020; Cotugno, Zicari, et al., 2020; de Armas et al., 2017). Pairwise  
174 correlation analysis showed a positive association between Ag specific T cells and Ab  
175 mediated neutralization activity ( $p=0.039$ ;  $\rho=0.39$ ) (Fig. 3c). Furthermore, PRNT+,  
176 revealed a higher frequency of SARS-CoV-2 specific T cells compared to PRNT- ( $p=0.03$ ,  
177 Fig. 3e). No differences in terms of Ag specific T cells emerged in patient with differential  
178 SARS-CoV-2 IgG serostatus. Overall these results may suggest that Ag specific T cells may  
179 correlate with neutralizing antibodies classes other than IgG such as IgA in turn having an  
180 higher correlation with mucosal and tissue resident antibodies (Hsueh, Huang, Chen, Kao,  
181 & Yang, 2004).

182

183 We also explored the standard T cell phenotype and we could benefit from a cohort of  
184 healthy age and gender matched children, examined in the pre COVID-19 era. Whereas no  
185 differences emerged in terms of total CD3+CD4+ between PRNT+, PRNT- , and SARS-  
186 CoV-2 neg, both SARS-CoV-2 positive groups (PRNT+ and PRNT-) showed an higher  
187 CD3+CD4+ frequency compared to HC ( $p=0.001$  and  $p=0.017$  respectively) (Supplementary  
188 Fig. 3b). Maturation subsets were analyzed according to the surface expression of  
189 CD45RO and CD27. PRNT+ expressed a significantly lower frequency of terminally  
190 differentiated effector memory T cells (TEMRA) compared to both PRNT- and SARS-CoV-  
191 2 neg patients (Supplementary Fig. 3c). Through the expression of CXCR5 on live  
192 CD3+CD4+CD45RO+CD27+ central memory T cells we investigated peripheral follicular T  
193 helper cells (pTfH). Our analysis showed a lower frequency of pTfH in both PRNT+ and  
194 PRNT- patients compared to HC ( $p=0.004$  and  $p=0.004$  respectively) (Supplementary Fig.  
195 3d). We also found that PRNT- had lower pTfH compared to SARS-CoV-2 neg children  
196 ( $p=0.040$ ) (Supplementary Fig. 3d) suggesting how the frequency of this subset, can play a  
197 crucial role in the context of SARS-CoV-2 infection.

198

### 199 **Proteomics characteristics of SARS-COV-2 patients with differential neutralizing** 200 **activity.**

201 We explored plasma proteomic correlates of immune responses in patients with SARS-CoV-  
202 2 neutralization activity. We could benefit from previous data generated with Olink platform  
203 on plasma samples collected in our cohort at diagnosis, and before treatment initiation  
204 (Camila Rosat Consiglio & CACTUS study team, 2020). We obtained 121 unique plasma  
205 proteins using two Olink panels associated with inflammation pathways filtering out proteins

206 with >30% measurements below the threshold of detection. Principal component analysis  
207 (PCA) analyzed for proteomics revealed no clear clusters between PRNT+ and PRNT- (data  
208 not shown), suggesting a similar pro-inflammatory pattern in both SARS-COV-2 groups  
209 which overall resulted similar in terms of symptomatology (see Table 1 and Supplementary  
210 Table 1). The full dataset of correlations is available in Supplementary Fig. 4.

211

212 We further assessed whether the presence of neutralizing activity was associated with  
213 differential expression of specific plasma factors. Two different proteins belonging to the  
214 Signaling Lymphocytic Activation Molecule pathway, SLAMF1 (Fig. 4a) and CD244 (Fig. 4b)  
215 resulted significantly higher in PRNT+ compared to PRNT- ( $p=0.002$  and  $p=0.03$ ,  
216 respectively). Such molecules were previously showed to be present on activated T and B  
217 cells and to be essential receptor and signaling transducers for viral entry (Koethe, Avota,  
218 & Schneider-Schaulies, 2012). Proteomic analysis also showed that PRNT+ had higher  
219 levels of other two factors associated with signal transduction and viral entry. First, CLEC4G  
220 ( $p=0.017$ , Fig 4c) which is a glycan-binding receptor already described to act as recognition  
221 and uptake molecule for multiple viruses including SARS coronaviruses (Gramberg et al.,  
222 2005). Second, Fc receptor like 6 (FCRL6) ( $p=0.017$ , Fig. 4d) which can act as major  
223 histocompatibility complex II receptor (MHC II) mediating virus entry (Schreeder et al.,  
224 2010). Finally, correlation analysis confirmed that SLAMF1 was positively associated with  
225 PRNT ( $p=0.001$ , Fig 4e), SARS-CoV-2 IgG ( $p=0.0003$ , Fig. 4f) and Ag specific B cells  
226 ( $p=0.028$ ; Supplementary Fig. 5a). These data collectively confirm a close relation between  
227 cellular and neutralizing activity in SARS-CoV-2 immunity.

228

### 229 **Multomics Factor Analysis (MOFA) revealing predictors of anti-Sars Cov2** 230 **neutralization activity.**

231 In order to provide a comprehensive immunologic description of patients with differential  
232 ability to produce neutralizing antibodies, we applied Multomics Factor Analysis (MOFA)  
233 (Argelaguet et al., 2019). In this analysis we used as input: phenotypic features describing  
234 T and B cell, Ag specific cells frequencies and plasma proteins. We focused on the top  
235 seven factors which were identified as major contributors towards the neutralization activity  
236 (Fig. 5a). Among those, the plasma proteome did not show relevant contribution (Factor 1  
237 in Fig. 5a and Supplementary Fig. 6a). Conversely, factors 3 and 6, mainly driven by the  
238 frequencies of B and T cell subsets were able to discriminate between PRNT+ and PRNT-  
239 (Fig. 5b). This analysis proved that resting memory B cells (IgD-CD27+CD21+) and

240 activated memory B cells (IgD-CD27+CD21-) in factor 3 (Fig. 5c) along with activated T-  
241 Bet+ B cell subsets (Supplementary Fig. 6b) in factor 6 represented the main loading  
242 features for the identification of PRNT+/PRNT- groups. For the T cell subsets in factor 3, the  
243 highest weight for group discrimination was mainly provided by the frequency of CM, EM  
244 and CD40L+ memory T cells (Fig. 5d). Overall these data suggest that the development of  
245 neutralizing antibodies is favored by the presence of an intact memory B and T cell  
246 compartment

247

## 248 **DISCUSSION**

249 This work provides a virological and immunological characterization of SARS-CoV-2  
250 infected children presenting a differential Ab-mediated neutralizing activity. It further shows  
251 that children with neutralizing antibodies present reduced viral load, faster virus clearance  
252 and lower *in vitro* infectivity. These data provide information that can drive vaccination  
253 endpoints and quarantine measures policies. In particular, we explored SARS-CoV-2  
254 specific humoral and cellular responses in PBMCs and plasma collected 1 week after  
255 symptoms onset. We correlated such results with quantitative analysis of SARS-CoV-2 viral  
256 load and *in vitro* infectivity. We stratified the cohort according to humoral responses and we  
257 found that SARS-CoV-2 viral load was lower in individuals with both SARS-CoV-2 IgG and  
258 PRNT, showing the impact of Ab mediated responses on SARS-CoV-2 viral load in NP in  
259 children. Confirming previous *in vitro* findings (Camila Rosat Consiglio & CACTUS study  
260 team, 2020; Walls et al., 2020), we here showed that children presenting higher anti-Spike  
261 protein IgG levels and higher concentrations of neutralizing antibodies are the ones with  
262 lower viral burdens and faster virus clearance. This information further confirms that  
263 pediatric patients are able to mount a humoral response relatively early after symptoms  
264 onset (Yonker et al., 2020) which affects both viral load and virus clearance. Although there  
265 is yet no consensus that a higher viral load in NP correlates with a higher infectivity of  
266 patients, we here show the impact of humoral immunity on virus replication, *in vitro* infectivity  
267 and presumably on virus spread. Hence, SARS-CoV-2 infected children able to mount an *in*  
268 *vitro* neutralization could benefit from less restrictive quarantine measures.

269

270 Further, we studied SARS-CoV-2 specific cellular responses that are still unknown in the  
271 pediatric setting. Indeed, recent works have mainly focused on adult groups and  
272 demonstrated a clear association between the presence of SARS-CoV-2 specific CD4+ T  
273 cells and the development of effective neutralizing activity (Altmann & Boyton, 2020; Carolyn

274 Rydyznski Moderbacher, 2020; Grifoni et al., 2020; Weiskopf et al., 2020). In the present  
275 study we confirmed a positive association between humoral responses and SARS-CoV-2  
276 specific CD4+ T cells in children. In particular, individuals with elevated levels of SARS-CoV-  
277 2 specific CD4+ T cells also showed elevated levels of effective neutralizing activity,  
278 associated with reduced viral load. We further revealed that Ag specific B cells were  
279 positively associated with SARS-CoV-2 neutralization activity and IgG titers. These results  
280 suggest Ag specific B cell frequency as a cellular marker for Ab-mediated neutralization.

281

282 We then moved on to explore whether neutralization activity was associated with particular  
283 B and T cell phenotype characteristics that could favor humoral responses in SARS-CoV-2  
284 infected children. Present data showed that neutralization activity was associated with lower  
285 levels of exhausted B and T cell phenotypes. Indeed, TLM B cell frequencies, previously  
286 showed to be higher in chronic infections (Meffre et al., 2016; Moir et al., 2008), resulted  
287 lower in PRNT+ patients. Accordingly, memory B cells were positively associated with both  
288 SARS-CoV-2 IgG and PRNT titers. These B cell phenotype characteristics can be thus  
289 useful to estimate the ability of the patients to produce anti SARS-CoV-2 humoral responses.  
290 Of note, these results are in line with recent report in adults showing that the majority (>90%)  
291 of Ag specific cells able to produce effective neutralizing antibodies present a memory  
292 phenotype (Seydoux et al., 2020). This observation may further support the use of  
293 convalescent plasma containing high dose of neutralizing antibodies (Tonn et al., 2020), as  
294 previously attempted to support faster virus clearance in critical cases of COVID-19  
295 (NCT04391101, NCT04374370) (Shen et al., 2020; Valk et al., 2020).

296

297 The characterization of children with differential anti SARS-CoV-2 neutralizing activity was  
298 enriched by the analysis of plasma proteomic profiling. We found that few proteins involved  
299 in the viral signal transduction were differentially expressed in PRNT+ and PRNT-. In  
300 particular, SLAMF1 and CD244 were significantly higher in PRNT+ patients compared to  
301 PRNT-. Such molecules are crucial in activated lymphocytes to transduce the signal of an  
302 MHC processed antigen, such as measles virus (Lin & Richardson, 2016). In line with this,  
303 few evidence showed the homologous protein domains of measles virus and coronaviruses,  
304 including SARS-CoV-2 (Walls et al., 2020). Indeed, it was recently argued that an adaptive  
305 protection may be provided by the measles mumps and rubella vaccine and BCG  
306 (Mantovani & Netea, 2020; Sidiq, Sabir, Ali, & Kodzius, 2020). Furthermore, CLEC4G,  
307 already described to act as recognition and uptake molecule for multiple viruses including

308 Ebola, West Nile and SARS coronaviruses (Gramberg et al., 2005) was found higher in  
309 PRNT+ compared to PRNT-. Overall these data confirm the close relation between cellular  
310 and humoral responses to control SARS-CoV-2 burden in children.

311

312 This study presents some limitations. First, our study included patients with scarce  
313 symptoms variability, thus we were not able to clearly identify differences in terms of both  
314 SARS-CoV-2 cellular and humoral responses according to symptomatology. However, it is  
315 important to note that asymptomatic patients (n=9) included in our cohort and 11 multi  
316 inflammatory syndrome associated to COVID-19 (MIS-C) patients, previously published  
317 (Camila Rosat Consiglio & CACTUS study team, 2020), showed no major differences in  
318 terms of SARS-CoV-2 serology and neutralization activity compared to mild COVID-19  
319 cases (Camila Rosat Consiglio & CACTUS study team, 2020). This data support the  
320 hypothesis that inflammation dynamics rather than adaptive immunity orchestrate the  
321 clinical course of the disease and specifically the development of MIS-C. Another limitation  
322 is represented by the plasma proteome profiling which was extrapolated from a previous  
323 study, due to sample unavailability, and it was focused on systemic inflammation rather than  
324 antiviral adaptive immunity. Nonetheless, it is still interesting to note that inflammation  
325 markers were not able to discriminate between PRNT+ and PRNT- patients, supporting the  
326 hypothesis that the ability to produce neutralizing antibodies does not directly associate with  
327 grade of inflammation, but rather with the status of the immune system.

328

329 Overall this work provides a description of SARS-CoV-2 specific humoral and cellular  
330 immunity in children and its relation to virus load, virus clearance and infectivity. Both antigen  
331 specific T and B cells positively correlate with anti-SARS-CoV-2 antibody titers and  
332 neutralization activity, suggesting a cell correlates of SARS-CoV-2 immunity in this  
333 population. Public health restrictive measures should take into account such results in order  
334 to reconsider timing of confinement and NP retesting in pediatric patients presenting strong  
335 humoral responses. Additional confirmatory studies involving adult cohorts as well as larger  
336 cohorts of children with COVID-19 and with a higher symptom variability are needed.

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## **STAR METHODS**

### **RESOURCE AVAILABILITY**

#### **Lead Contact**

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Dr. Paolo Palma ([paolo.palma@opbg.net](mailto:paolo.palma@opbg.net)).

#### **Materials Availability**

This study did not generate new unique reagents.

#### **Data and Code Availability**

The published article includes all dataset generated or analyzed during this study.

The datasets supporting the current study have not been deposited in a public repository because are unpublished, but they will be made available upon paper acceptance.

#### **Study participants and samples collection**

Forty two SARS-CoV-2 infected children (SARS-CoV-2 +) and 11 SARS-COV2 negative controls (SARS-CoV-2 neg) were enrolled in the CACTUS (Immunological studies in Children **AffeCT**ed by covid and ac**U**te re**S**piratory diseases) study from March to April 2020 at Bambino Gesù' Children's Hospital in Rome. Local ethical committee approved the study and written informed consent was obtained from all participants or legal guardians. Age, gender, clinical and routine laboratory characteristics of the cohort are described in Table 1. SARS-CoV-2 + were patients tested positive for SARS-CoV-2 real-time reverse transcriptase–polymerase chain reaction (RT-PCR) tests (GeneXpert, Cepheid, Sunnyvale, CA; 250 copies/mL sensitivity, 100% specificity) in nasopharyngeal swab (NP). SARS-CoV-2 + were stratified according to presence (PRNT+) or absence (PRNT-) of neutralizing antibodies. Controls enrolled in the studies (SARS-CoV-2 neg) were children admitted to our hospital with suspected SARS-CoV-2 infection, due to fever or respiratory symptoms, but tested negative for 2 consecutive nasopharyngeal swabs (performed 24 hours apart) and for SARS-CoV-2 S1/S2 IgG test. Longitudinal blood samples were collected at admission, after 48 hours and approximately 7 to 14 days after admission. Viral load in NP was performed in SARS-CoV-2 + every 48 hours up to undetectable viral load.



376

## 377 **METHOD DETAILS**

### 378 **Sample collection and storage**

379 Venous blood was collected in EDTA tubes and processed within 2 hours. Plasma was  
380 isolated from blood and stored at -80°C. Peripheral blood mononuclear cells (PBMCs) were  
381 isolated from blood of all patients with Ficoll density gradient and cryopreserved in FBS 10%  
382 DMSO until analysis, in liquid nitrogen. Nasopharyngeal swab preserving media was stored  
383 at -80°C until use.

384

### 385 **Detection and quantification of SARS-CoV2 RNA in Nasopharyngeal swab (NP).**

386 SARS-CoV-2 viral load was evaluated using both RT-PCR and ddPCR. For the RT-PCR,  
387 the qualitative SARS-CoV-2 real-time reverse transcriptase–polymerase chain reaction (RT-  
388 PCR) tests was used according to manufacturer instruction (Seegene's Allplex 2019-nCoV  
389 Assay, Republic of Korea). The assay is designed to allow for detection of both E and RdRp  
390 genes, which showed comparable specificity for SARS-CoV-2 (Corman et al., 2020). The  
391 system is designed to provide an auto-interpretation of the data alongside a Ct value  
392 resulting from the amplification of each gene.

393 An in-house multiplex quantitative assay based on One-Step RT- digital droplet (dd) PCR  
394 was used to quantitate SARS-CoV-2 viral load. Total RNA was isolated from NP preserving  
395 media and eluted in a final volume of 100µl. The reaction mixture consisted of 5 ml of  
396 supermix (Bio-Rad, CA, USA), 2 µl of reverse transcriptase; 2 µl of DTT final concentration  
397 300mM; forward and reverse primers of SARS-CoV-2 E gene (Corman et al., 2020) to a  
398 final concentration of 400 nM each and probe to a final concentration of 200 nM;  
399 housekeeping GAPDH was amplified under the same conditions using the GAPDH Kit (PE  
400 Applied Biosystems); 5 µl of nucleic acids eluted from nasopharyngeal swab samples into a  
401 final volume of 20 µl. Each well of the prepared mix is loaded into the 8-channel cartridge to  
402 generate the droplets in the oil suspension according to manufacturer (Bio-Rad). Reverse  
403 transcription and PCR cycles were run as follow: at 42-50°C for 60 min; enzyme activation  
404 95°C for 10 min; denaturation of cDNA at 95°C for 30sec and annealing/extension at 60°C  
405 for 1 min, this two passages were repeated for 40 cycles; enzyme deactivation at 98°C for  
406 10 min. The droplets were then read by the QX200™ Droplet Reader (Bio-Rad) and the  
407 results were analyzed with the QuantaSoft™ Analysis Software 1.7.4.0917 (Bio-Rad). Wells  
408 with less than 10000 droplets were discarded from the analysis. GAPDH housekeeping gene

409 was employed to control for the quality of extracted RNA. Each sample was run at least in  
410 duplicate. The final results were expressed as SARS-CoV-2 copies/5 µl. We compared the  
411 results obtained by both ddPCR and RT-PCR and we found a significant inverse linear  
412 correlation between the Ct values of RT-PCR and the viral copy number provided by the  
413 ddPCR ( $r=-0.906$ ,  $p<0.0001$ ). The derived formula  $y=-3.40 x+ 36.88$  was employed to  
414 convert the Ct values in viral copies for samples tested only by RT-PCR.

## 415 **AUC**

416 The SARS-CoV-2 viral load measurements for the gene E in NP were used to calculate the  
417 AUC as follow. The viral load was calculated at multiple time points to calculate the area  
418 under the curve for each patient. The curves were drawn plotting on the y-axis the viral  
419 copies and on the x-axis the number of days between the date of swab collection and the  
420 date of onset of symptoms for symptomatic patients and the hospital admission date for non-  
421 symptomatic ones. The average value was considered for the association with PRNT and  
422 SARS-CoV-2 IgG.

## 423 **Virus titration by focus forming assay (FFA)**

424 Vero E6 cells (ATCC® CRL 1586™) were cultured in Dulbecco's modified Eagle's medium  
425 (DMEM, Gibco) supplemented with 10% FBS, penicillin (100 U/ml) and streptomycin  
426 (100U/ml), at 37°C in a humidified CO2 incubator. To titrate virus infectivity, nasopharyngeal  
427 swab preserving media was filtered through a 0.22 µm filter and serially diluted in DMEM  
428 supplemented with 2% FBS, penicillin (100 U/ml) and streptomycin (100U/ml). Dilutions  
429 were incubated on confluent monolayers of Vero E6 cells, in 96-well plates, for 1 hour. After  
430 infection, the inoculum was removed and an overlay of MEM, 2% FBS, penicillin (100 U/ml)  
431 and streptomycin (100U/ml) and 0.8% carboxymethyl cellulose was added. After 27 hours,  
432 the overlay medium was removed and cells were fixed in PBS 4% PFA, for 30 minutes at  
433 4°C. Upon removal, cells were permeabilized with a 0.5 % Triton-X-100 solution for 10  
434 minutes. Immunostaining was performed by incubation of the J2 anti-dsRNA monoclonal  
435 antibody (1:10,000; Scicons) for 1 hour, followed by incubation with peroxidase-labelled goat  
436 anti-mouse antibodies (1:1000; DAKO) for 1 hour and a 7 min incubation with the True  
437 Blue™ (KPL) peroxidase substrate. Immuno-reagents were prepared in a solution of 1%  
438 BSA and 0.05% Tween-80 in PBS. After each antibody incubation, cells were washed 4  
439 times with a 0.05% Tween-80 PBS solution. Focus forming units per ml (FFU/ml) were

440 counted after acquisition of pictures at a high resolution of 4800 x 9400dpi, on a flatbed  
441 scanner.

#### 442 **Plaque reduction neutralization test (PRNT)**

443 A high- throughput PRNT method was developed *in-house*. Briefly, plasma samples were  
444 heat- inactivated by incubation at 56 °C for 30 minutes and 2-fold dilutions were prepared in  
445 Dulbecco modified Eagle medium (DMEM). The dilutions were mixed to a 1:1 ratio with a  
446 virus solution containing 20-25 FFUs of SARS-CoV-2 and incubated for 1 hour at 37 °C.  
447 Fifty microliters of the virus–serum mixtures were added to confluent monolayers of Vero E6  
448 cells, in 96-wells plates and incubated for 1 hour at 37 °C, in a 5% CO<sub>2</sub> incubator. The  
449 inoculum was removed and 100 µl of overlay solution of Minimum essential medium (MEM),  
450 2% fetal bovine serum (FBS), penicillin (100 U/ml), streptomycin (100 U/ml) and 0.8%  
451 carboxy methyl cellulose was added to each well. After 26 hours' incubation, cells were fixed  
452 with a 4% paraformaldehyde (PFA) solution. Visualization of plaques was obtained with an  
453 immunocytochemical staining method using an anti-dsRNA monoclonal antibody (J2,  
454 1:10,000; Scicons) for 1 hour, followed by 1-hour incubation with peroxidase-labeled goat  
455 anti-mouse antibodies (1:1000; DAKO) and a 7-minute incubation with the True Blue™  
456 (KPL) peroxidase substrate. FFUs were counted as described above. The serum  
457 neutralization titer was defined as the reciprocal of the highest dilution resulting in a  
458 reduction of the control plaque count >50% (PRNT<sub>50</sub>). We considered a titer of 1:10 as the  
459 seropositive threshold.

#### 460 **Generation of Sars-CoV-2 probe to select B-cells antigen specific cells**

461 The S1+S2 Spike SARS-CoV-2 protein was obtained from MyBiosource and labelled with  
462 Lightning-Link® R-PE Conjugation Kit (Innova Biosciences) to obtain a SARS-CoV2-R-PE.

463

#### 464 **Ag-specific B-cells by Flow Cytometry**

465 PBMCs underwent surface staining for the B cell phenotype with the following antibodies:  
466 CD10 Pe-Cy7(HI10a) from Biolegend, CD19 APC-R700(SJ25C1), CD21 APC(B-Ly4),  
467 CD27 FITC(M-T271), IgD BV421(IA6-2), IgM PE-CF594(G20-127), IgG BV605(G18-145)  
468 from BD, S1+S2 Sars-CoV2-R-Phycoerythrin (-R-PE) and Live/Dead (BV510; BD).  
469 Following fixing and permeabilization of cells (BD permeabilization solution II 1x), cells were  
470 stained with an anti T-bet BV650 (04-46, BD). Cells were acquired using Cytoflex (Beckman  
471 Coulter, Brea, CA). Gating strategies are provided in Supplementary Fig 2. Positive cell

472 gating was set using fluorescence minus one control. Data analyses were performed using  
473 Kaluza software (Beckman Coulter).

474

#### 475 **CD4 Ag-specific T-cells by Flow Cytometry**

476 Thawed PBMC were plated ( $1.5 \times 10^6$ /aliquot/200 ul) in 96 well-plate containing CD154-PE  
477 (CD40L, BD Pharmingen, Franklin Lakes, NJ, USA), Golgi Stop (SigmaAldrich), anti-CD28  
478 (1 $\mu$ g/ml) and either 0,4 $\mu$ g/ml PepTivator SARS-CoV-2 Prot\_S (Milteny Biotech, Bergisch  
479 Gladbach, Germany) or media only. Following 16hrs incubation at 37°C/5% CO<sub>2</sub>, PBMC  
480 were centrifuged and stained with LIVE/DEAD fixable NEAR-IR dead cell stain kit (for 633  
481 or 635 nm excitation, ThermoFisher, Waltham, Massachusetts, US) 1ul per 10<sup>6</sup>cells/ml for  
482 15 minutes at room temperature (RT), protected by light. Antigen specific CD40L+CD4+ T  
483 cells were identified according to the gating strategy showed in Fig. 3a. Preliminary  
484 experiments on unstimulated (UN), SARS-CoV-2 stimulated (STIM), or SEB-stimulated (not  
485 shown) healthy controls collected in the pre-COVID-19 era were used to set the gate.  
486 Following *in vitro* stimulation with SARS-CoV-2 antigens, only SARS-CoV-2 + patients  
487 showed increase in CD40L+ T cells demonstrating the antigen-specific cellular response  
488 (Supplementary Fig. 3a). Surface staining was performed using the following antibodies:  
489 CD3 PE-CF594 (UCHT1), CD4 BV510 (SK3), CD27 V450 (M-T271), CD45RO PE-Cy5  
490 (UCHL1), CD185 BV605 (CXCR5, RF8B2) from BD (USA); CD197 BV786 (CCR7, 3D12),  
491 from Biolegend (San Diego, CA, USA). Intra-cytokines staining (ICS) was performed  
492 following permeabilization using BD Perm sol II 1X (BD) and included IFN $\gamma$  FITC, from BD;  
493 TNF $\alpha$  AF700 (Mab11), IL-2 PE-Cy7 (MQ1-17H12), IL-21 APC (3A3-N2), from Biolegend.  
494 Gating strategy for T cell phenotype is provided in Supplementary Fig. 3.

495

#### 496 **Serum protein profiling**

497 Serum proteins were analyzed using a multiplex technology based upon proximity-extension  
498 assays (Lundberg et al., 2011). Briefly, each kit consisted of a microtiter plate for measuring  
499 92 protein biomarkers in all 88 samples and each well contained 96 pairs of DNA-labeled  
500 antibody probes. To minimize inter- and intra-run variation, the data were normalized using  
501 both an internal control (extension control) and an interplate control, and then transformed  
502 using a pre-determined correction factor. The pre-processed data were provided in the  
503 arbitrary unit Normalized Protein Expression (NPX) on a log<sub>2</sub> scale and where a high NPX  
504 represents high protein concentration.

505

506 **Statistical analysis**

507 Statistical analyses were performed using GraphPad Prism 8 (GraphPad Software, Inc., San  
508 Diego, CA) and R software (version 3.6.2). Statistical significance was set at  $P < 0.05$  and  
509 the test were two-tailed. All data were analyzed D'Agostino-Pearson to assess normality.  
510 For non-parametric or parametric data, median or mean are presented, respectively and  
511 Mann-Whitney non-parametric test or T-test were used for the comparisons, as indicated in  
512 figure legends. Chi-square test was used for gender analysis. The AUC values were  
513 calculated with the MESS package (version 0.5.6) as described above. Spearman's  
514 correlation was used to examine the association between features. In correlation heatmaps  
515 only statistically significant correlations were shown. Linear univariate regression analysis  
516 were performed with the "lm" function (stats R package version 3.6.2). MOFA was performed  
517 with the MOFA2 package (version 1.0) in the R statistical environment (Argelaguet et al.,  
518 2019). Graphpad Prism 8 software was used for statistical analysis (of the cells type  
519 distribution and serological parameters) for demographic and routine laboratory blood tests.

521 **ACKNOWLEDGMENTS**

522 We would like to thank all patients and guardians who participated to the study and all the  
523 CACTUS study nurses team of the COVID-19 Center of "Bambino Gesù "Children'Hospital".  
524 We also thank Jennifer Faudella for her administrative assistance. This work was made  
525 possible by support from Bambino Gesù Children's Hospital ricerca corrente 2020 to NC  
526 and ricerca corrente 2019 to PP, by PENTA and by Fondazione Cassa di Risparmio di  
527 Padova e Rovigo, Progetti di Ricerca Covid-19 (ADR participant). We also thank Riccardo  
528 Truono for providing graphical support.

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537 **DECLARATION OF INTERESTS**

538 The authors declare no competing interests.

539

540 **FIGURE LEGENDS**

541 **Fig.1 SARS-CoV2 specific IgG and Ab neutralization activity were inversely**  
542 **associated with viral load, virus clearance and infectivity.** Non-parametric Spearman  
543 correlation was used in a-e. Non-parametric Mann Whitney test was used in f).  
544 ddPCR=digital droplet PCR; FFU= Foci Forming Unit; AUC=area under the curve;  
545 NP=nasopharyngeal swab; light purple triangles= SARS-CoV-2 IgG+; light green triangles=  
546 SARS-CoV-2 IgG-; light purple solid circle= PRNT+; light green solid circle = PRNT-.

547

548 **Fig. 2 SARS-CoV-2 specific B cells are positively associated to anti SARS-CoV-2 IgG**  
549 **and Ab neutralization activity.** Gating strategy for antigen specific B-cells is shown in  
550 panel a). Spearman and Mann-Whitney were used in panels b-c and in d-e, respectively.  
551 Light purple triangles= SARS-CoV-2 IgG+; light green triangles= SARS-CoV-2 IgG-; light  
552 purple solid circle= PRNT+; light green solid circle = PRNT-.

553

554 **Fig. 3 SARS-CoV-2 specific CD4 T cells are positively associated to SARS-CoV-2**  
555 **specific IgG and Ab neutralization activity.** Gating strategy for antigen specific T-cells  
556 (CD40L+) is shown in panel a): left side panels show CD40L+CD4+ T cells for unstimulated  
557 (UN) and stimulated (STIM) samples in a healthy control (HC). Right side panels show same  
558 conditions for a SARS-CoV-2 infected patients. Spearman tests were used in panel b and  
559 c. Mann-Whitney test was used in panels d and e. Light purple triangles= SARS-CoV-2  
560 IgG+; light green triangles= SARS-CoV-2 IgG-; light purple solid circle= PRNT+; light green  
561 solid circle = PRNT-.

562

563 **Fig.4 Proteomic analysis revealing distinct patterns in patients with differential anti-**  
564 **SARS-CoV-2 Ab neutralization activity.** Non-parametric Mann Whitney test was used in  
565 panels a-d. Non-parametric Spearman correlation test was used in e-g. Light purple solid  
566 circle= PRNT+; light green solid circle = PRNT-; grey solid circle = healthy control (HC).

567

568 **Fig. 5 Multiomics Factor Analysis (MOFA) showing clusterization factors of patients**  
569 **with Ab neutralization activity.** Fraction of variance explained by 7 latent factors is shown  
570 in panel a. Samples distributed across the top six latent factors in b. Top contributing  
571 features and loading direction (+ and -) for factor 3 in B cells and T-cells populations are  
572 shown in panels c and d respectively. RM= resting memory; AM= activated memory; DN=

573 double negative; TLM= tissue like memory; CM= central memory; EM= effector memory;  
574 TEMRA= terminally differentiated effector memory.

575

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593 Eleanor G. Crotty, Cheryl Kim, Stephen A. Rawlings, Jose Mateus, Long Ping Victor Tse,  
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692

## KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
<b>Antibodies</b>		
CD154-PE (CD40L, clone TRP1)	BD	Cat#555700
CD3PE-CF594 (clone UCHT1)	BD	Cat#562280
CD4 BV510 (SK3)	BD	Cat#562970
CD27 V450 (M-T271)	BD	Cat#561408
CD45RO PE-Cy5 (UCHL1)	Biolegend	Cat#304208
CD185 BV605 (CXCR5, RF8B2)	BD	Cat#740379
CD197 BV786 (CCR7, 3D12)	Biolegend	Cat#563710
IL-21 APC (3A3-N2)	Biolegend	Cat#513008
IL-2 PE-Cy7 (MQ1-17H12)	Biolegend	Cat#500326
IFN $\gamma$ FITC	BD	Cat#552887
IL-2 PE-Cy7 (MQ1-17H12)	Biolegend	Cat#500326
TNF $\alpha$ AF700 (Mab11)	Biolegend	Cat#502928
CD10 Pe-Cy7(HI10a)	Biolegend	Cat#312214
CD19 APC-R700(SJ25C1)	BD	Cat#659121
CD21 APC (B-Ly4)	BD	Cat#559867
CD27 FITC(M-T271)	BD	Cat#555440
IgD BV421(IA6-2)	BD	Cat#565940
IgM PE-CF594(G20-127)	BD	Cat#562539
IgG BV605(G18-145)	BD	Cat#563246
T-bet BV650 (04-46)	BD	Cat#564142
Double Strand RNA (dsRNA J2)	Scicons	J2 produced in mouse
Peroxidase-labeled goat anti-mouse	Thermofisher	Cat#G-21040
True Blue™ (KPL)	SeraCare	Cat#5510-0052
<b>Bacterial and Virus Strains</b>		
<b>Biological Samples</b>		
Peripheral venous EDTA blood	OPBG	n.a.
Swab-preserving media	OPBG	n.a.
<b>Chemicals, Peptides, and Recombinant Proteins</b>		
BD FACS Permeabilizing Solution 2	BD	Cat# 347692
BD Golgi Stop	BD Biosciences	Cat#554724
Anti-CD28 (1 $\mu$ g/ml)	BD	Cat#555725
Bovine Albumin Fraction V (7.5% solution)	Thermofisher	Cat#15260037
Dimethyl sulfoxide	Sigma-Aldrich	Cat#D8418
Dulbecco's Phosphate buffered saline	EuroClone	Cat#ECB4004L
Fetal Bovine Serum	Gibco	Cat#10270-106
Ficoll-Paque PLUS	GE Healthcare	Cat#17-1440-03
PepTivator SARS-CoV-2 Prot_S	Miltenyi Biotec	Cat#130-126-700
S1+S1 SARS-CoV-2 Prot S	Sino Biological	Cat# 40589-V08B1
RPMI 1640	EuroClone	Cat#ECM9106L

Dulbecco's modified Eagle's medium	Gibco	Cat#11995065
Triton-X-100	Sigma	Cat# T8787
Penicillin-Streptomycin	Thermofisher	Cat# 15140122
Paraformaldehyde (PFA) 4% solution	Sigma	Cat# 1004968350
Carbo xymethyl cellulose salt	Sigma	Cat# C5013-500G
MEM	Thermofisher	Cat# 11095080
Tween-80	Sigma	Cat#P1754
<b>Critical Commercial Assays</b>		
Live/dead Fixable Near-IR Dead cell Stain kit	Invitrogen	Cat#L34976
Lightning-Link® R-PE Conjugation Kit	(Innova Biosciences)	Cat#703-0030
<b>Deposited Data</b>		
<b>Experimental Models: Cell Lines</b>		
Vero E6 cells	ATCC	CRL 1586
<b>Experimental Models: Organisms/Strains</b>		
n.a.		
<b>Oligonucleotides</b>		
Primers for SARS-CoV-2 E gene: forward ACAGGTACGTTAATAGTTAATAGCGT	Corman et al, 2020	N/A
Primers for SARS-CoV-2 E gene: reverse ATATTGCAGCAGTACGCACACA	Corman et al, 2020	N/A
Probe: FAM- ACACTAGCCATCCTTACTGCGCTTCG- BBQ	Corman et al, 2020	N/A
Housekeeping GAPDH	PE Applied Biosystems	Cat#402869
GAPDH Kit (PE Applied Biosystems)		
<b>Recombinant DNA</b>		
n.a.		
<b>Software and Algorithms</b>		
Kaluza software	Beckman Coulter	<a href="https://www.beckman.com/flow-cytometry/software/kaluza?country=US">https://www.beckman.com/flow-cytometry/software/kaluza?country=US</a>
R software (v 3.6.2)	R Foundation	<a href="https://www.r-project.org/">https://www.r-project.org/</a>
QuantaSoft™ Analysis Software 1.7.4.0917	Bio-Rad	Cat#1864011

Other		
Droplet Generation Oil for Probes	Bio-Rad	Cat#1863005
One-Step RT-ddPCR Adv Kit	Bio-Rad	Cat#1864022
QX200™ Droplet Generator	Bio-Rad	Cat#1864002
96 well plate	Bio-Rad	Cat#HSS9641
Eppendorf Mastercycler	Eppendorf	Cat#6313000018
QX200™ Droplet Reader	Bio-Rad	Cat#1864003
DG8™ Cartridges	Bio-Rad	Cat#1864008

Table 1

	<b>SARS-CoV-2 + (n= 42)</b>		<b>SARS-CoV-2 neg (n= 11)</b>	<b>p value</b>
	<b>PRNT+ (n= 25)</b>	<b>PRNT- (n= 17)</b>		
<b>Age (years)</b>	8.6 (3.9-15.7)	1.9 (0.2-14.9)	5.3 (2.1-7.9)	n.s.
<b>Male N (%)</b>	16/25 (64)	6/17 (35)	5/11 (45)	n.s.
<b>Platelets (10<sup>3</sup>/uL)</b>	238 (200.5-287.8)	269 (199.5-364.5)	324.0 (231.0-525.0)	PRNT+ vs SARS-CoV-2 neg p=0.022
<b>WBC count (10<sup>3</sup>/uL)</b>	5.4 (4.3-6.5)	5.6 (4.6-8.5)	8.4 (7.4-10.5)	PRNT+ vs SARS-CoV-2 neg p=0.002 PRNT- vs SARS-CoV-2 neg p=0.042
<b>Neutrophils (10<sup>3</sup>/uL)</b>	2.2 (1.8-3.8)	2.6 (1.7-3.9)	4.3 (2.4-6.0)	PRNT+ vs SARS-CoV-2 neg p=0.029
<b>Lymphocytes (10<sup>3</sup>/microL)</b>	2.3 (1.9-3.3)	3.0 (1.3-5.3)	3.4 (2.3-4.2)	n.s.
<b>Hb (g/dL)</b>	12.9 (12.1-14.0)	12.1 (11.7-13.7)	12.3 (10.8-12.8)	n.s.
<b>CRP (mg/dL)</b>	0.08 (0.04-0.60)	0.10 (0.04-0.55)	3.4 (2.0-12.08)	PRNT+ vs SARS-CoV-2 neg p<0.0001; PRNT- vs SARS-CoV-2 neg p=0.001
<b>Duration of symptoms at analysis* mean (SD)</b>	8.1 (4.2), n=23	6.4 (2.4), n=15	n.a.	n.s.
<b>Symptoms (0/1/2)</b>	(6/15/4)	(3/10/4)	n.a.	n.s.

**Table 1.** Continuous data were presented as median and interquartile range (IQR). T test and Mann Whitney test were used for comparison between parametric and not parametric data respectively. Symptomatology: 0= asymptomatic; 1=mild ; 2=moderate according to WHO classification (<https://www.who.int/publications/i/item/clinical-management-of-covid-19>). \* “Duration of symptoms” was calculated as the number of days between symptoms onset and date of analysis; for asymptomatic patients, the symptom onset of the family member or direct contact who resulted positive for SARS-CoV-2 was used. SD=standard deviation.

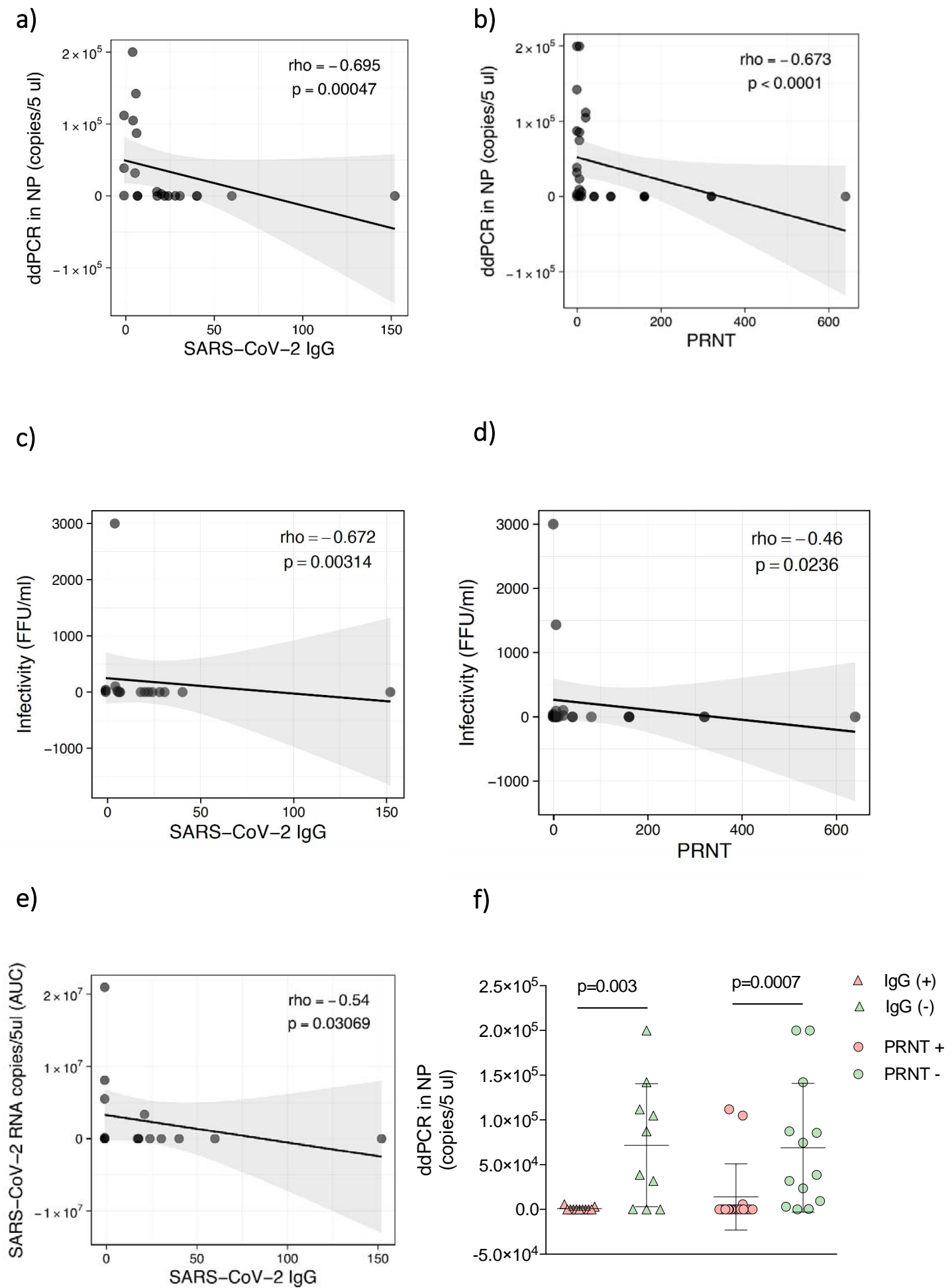


Fig. 2

a) Gated on live CD10-CD19+ Switched memory B cells

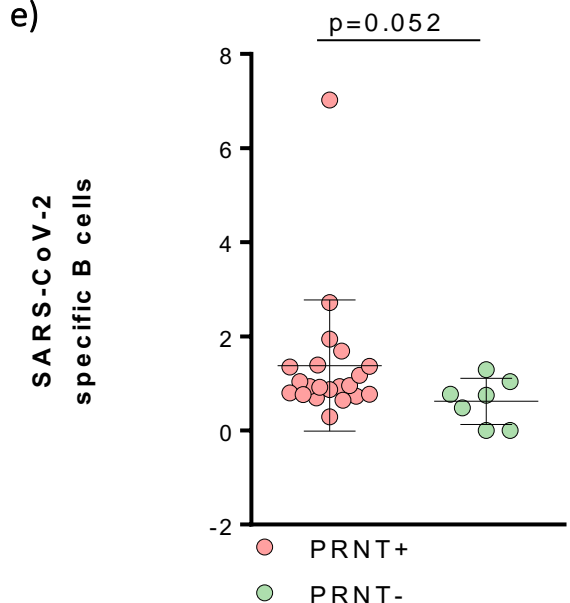
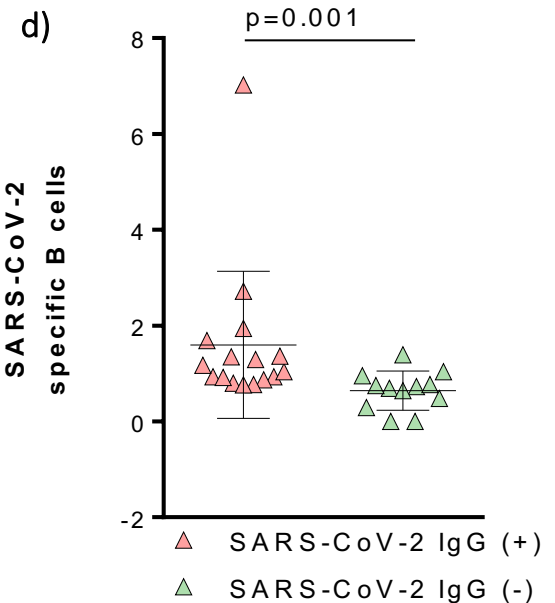
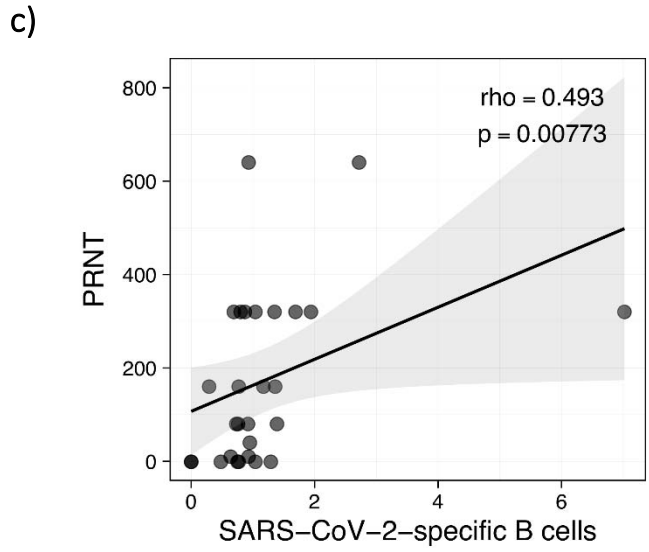
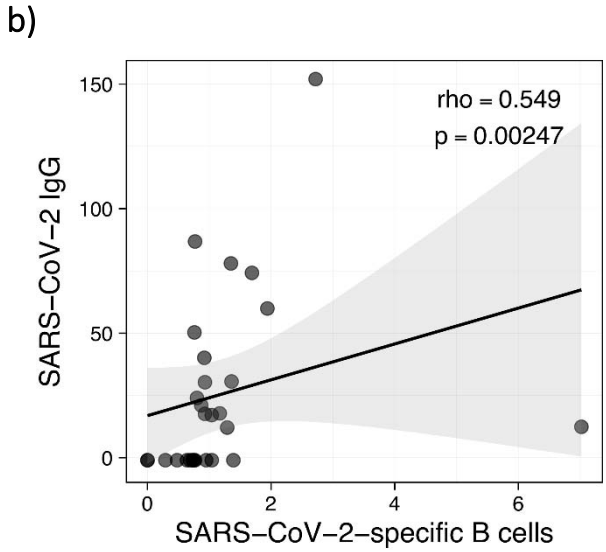
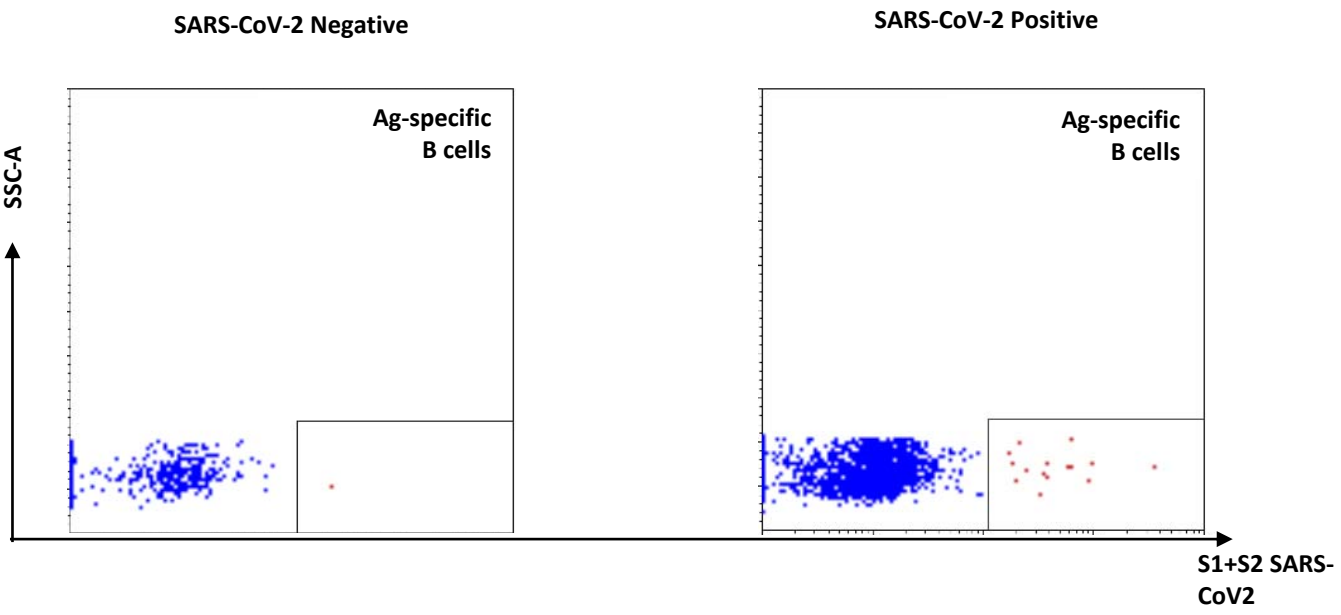
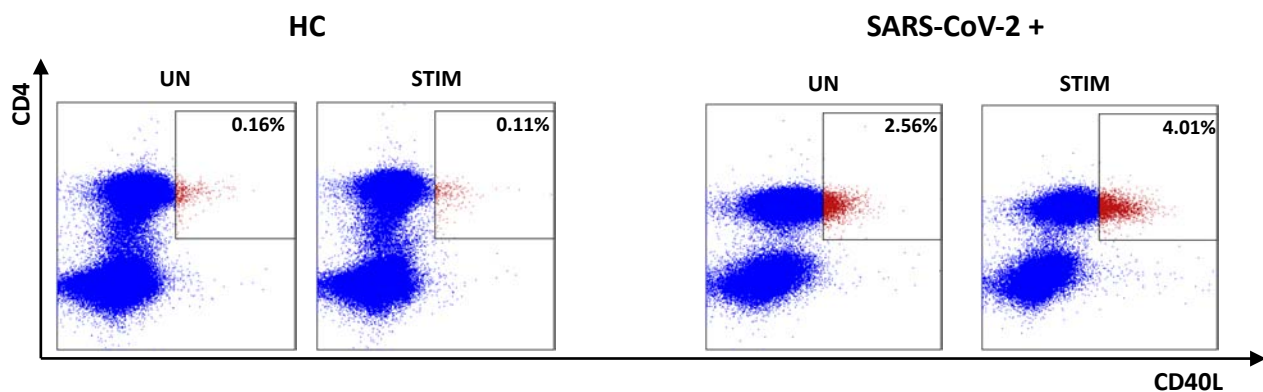


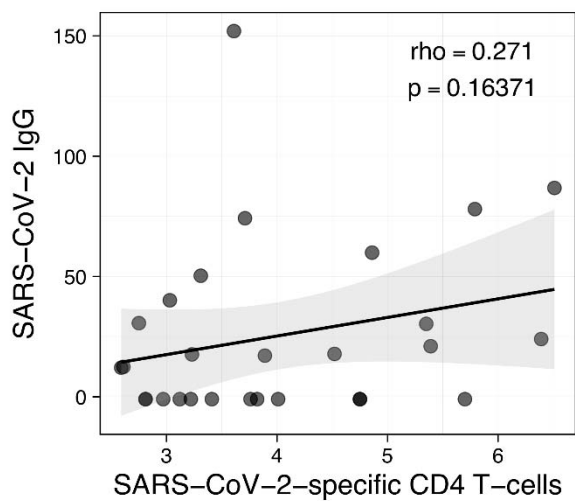
Fig. 3

a)

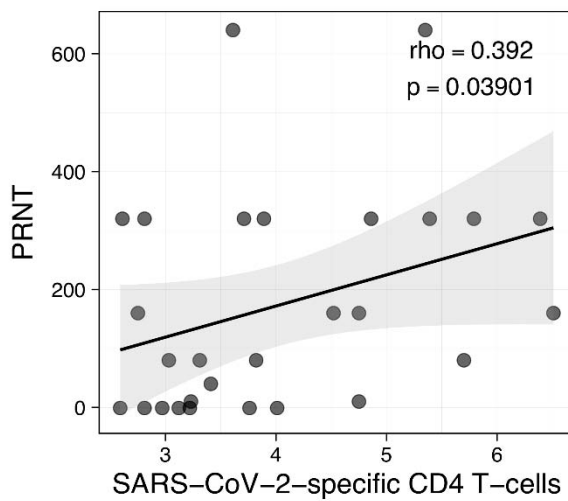
Gated on live lymphocytes



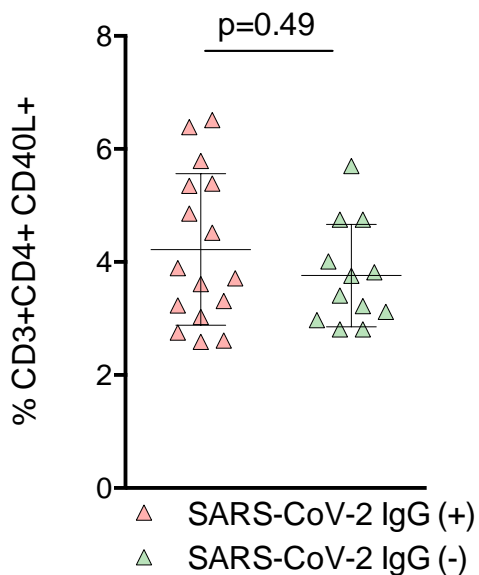
b)



c)



d)



e)

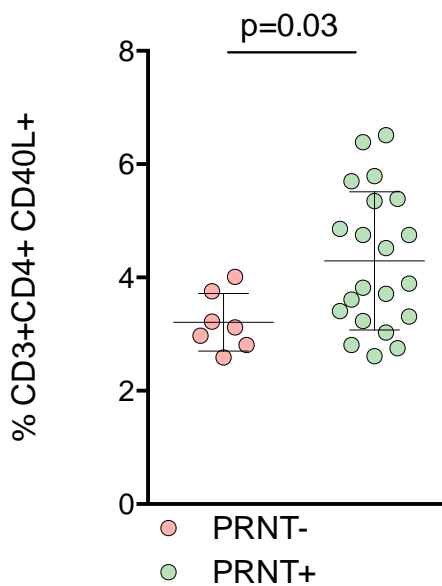
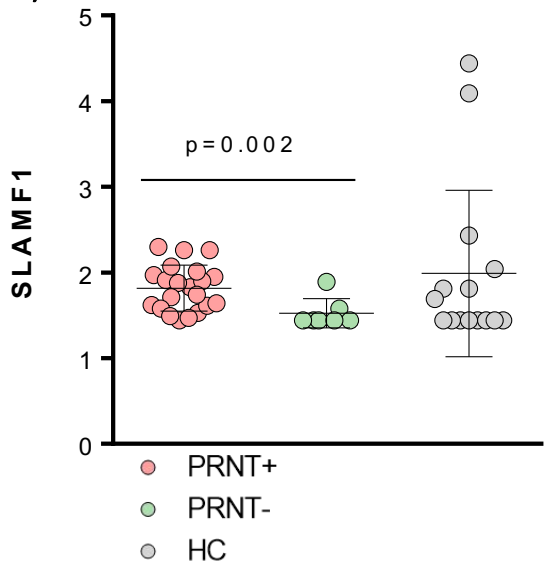


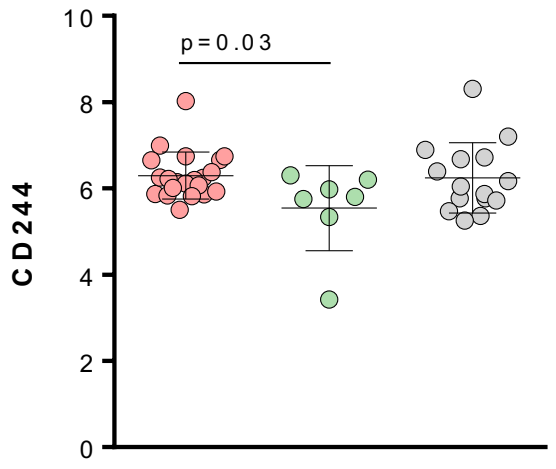


Fig. 4

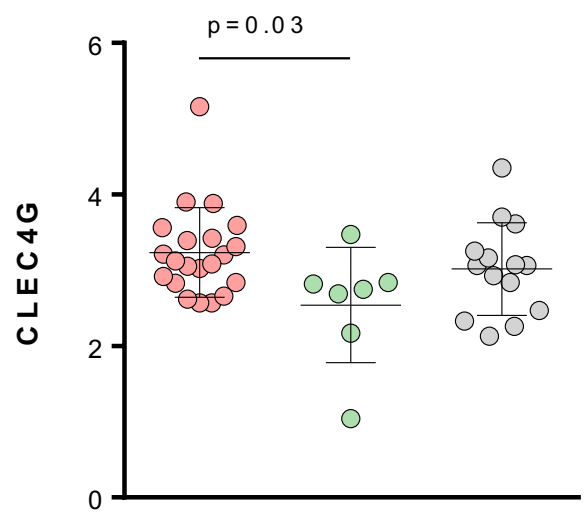
a)



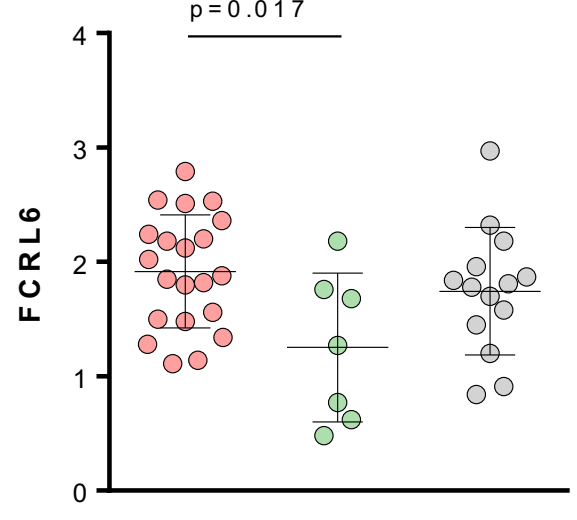
b)



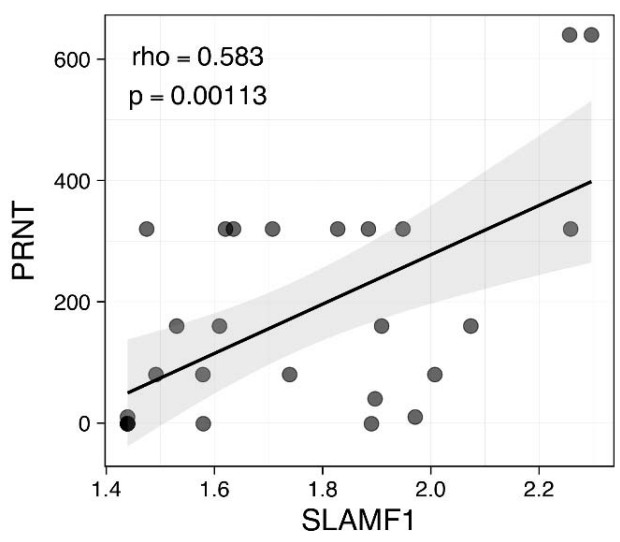
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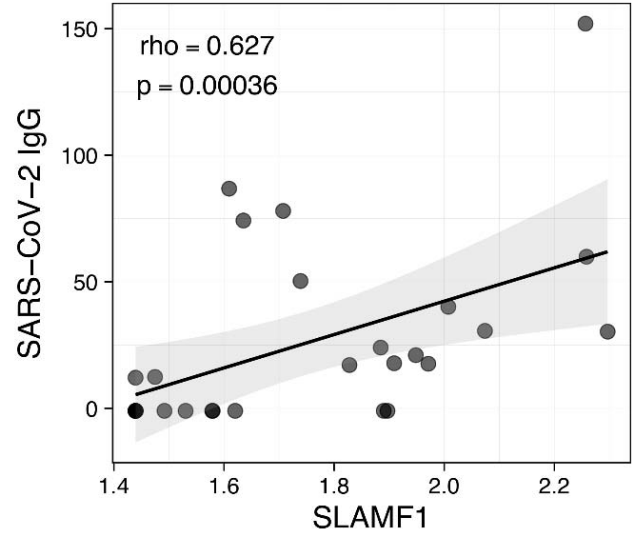
d)



e)

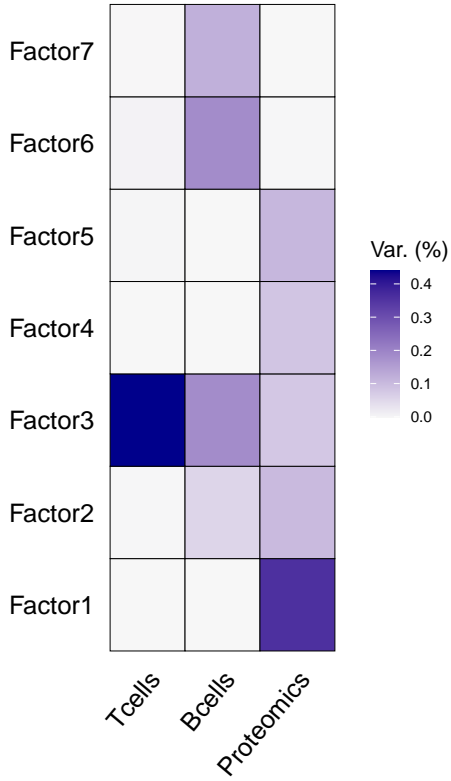


f)

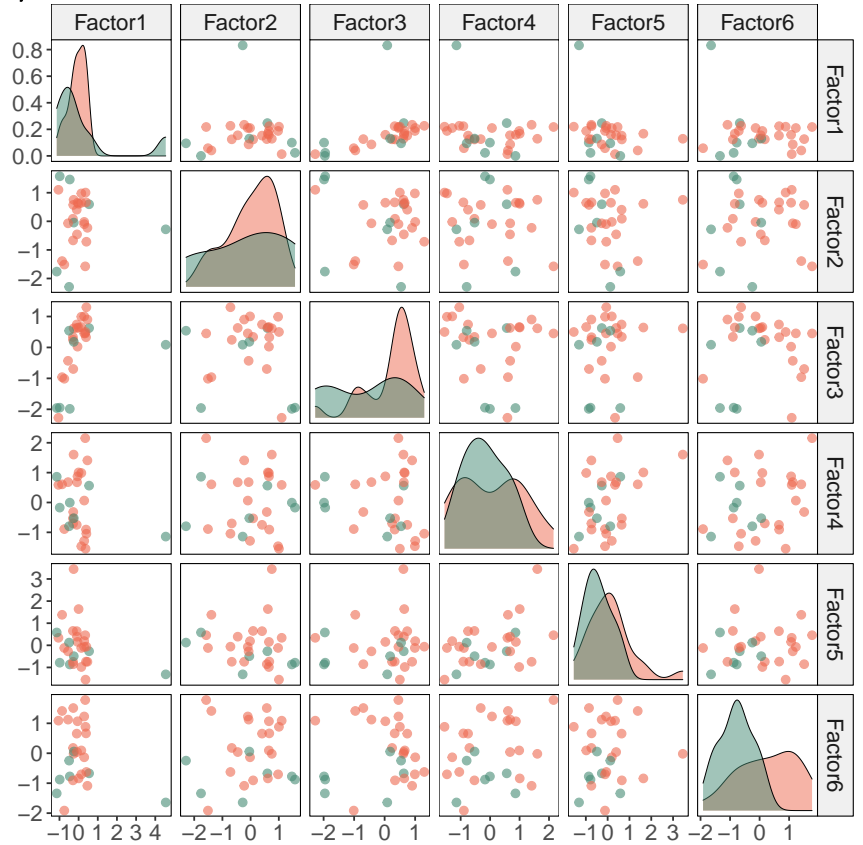


**Fig. 5**

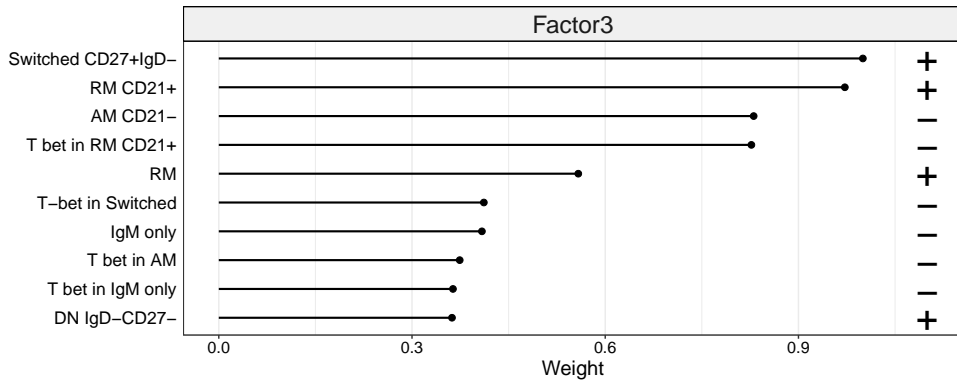
**a)**



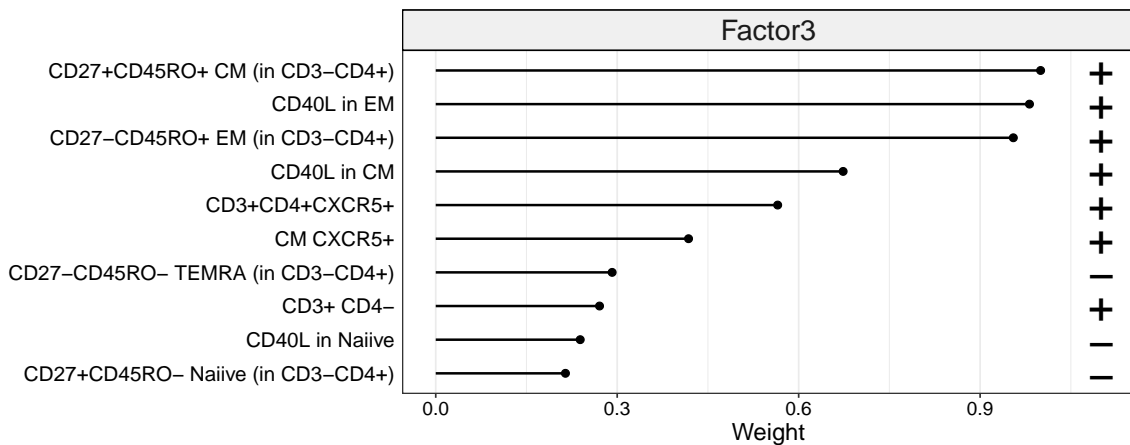
**b)**

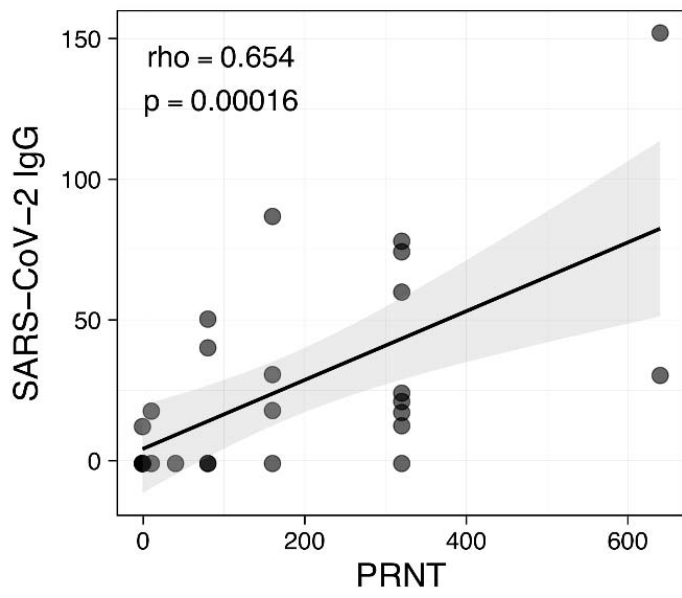


**c)**

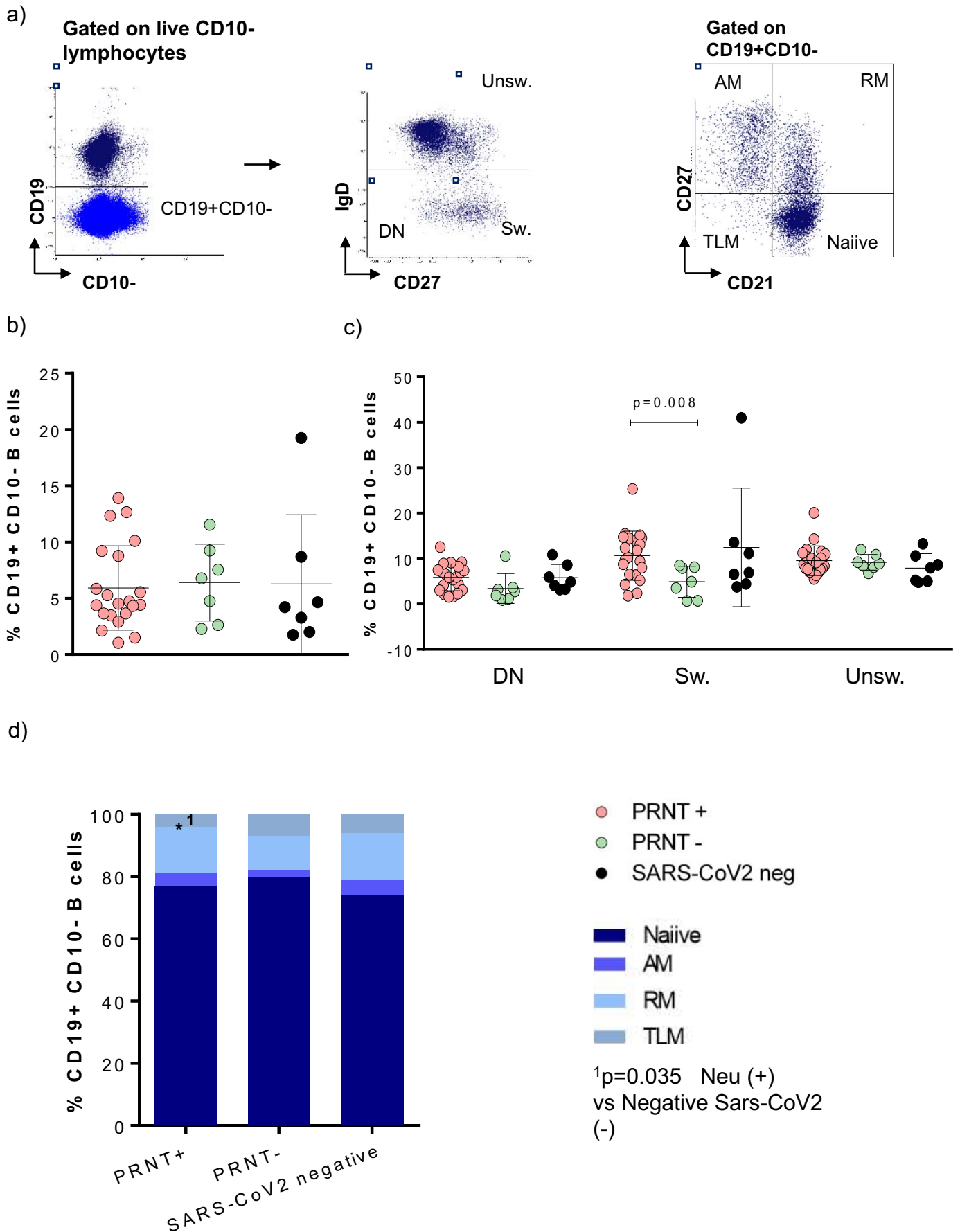


**d)**

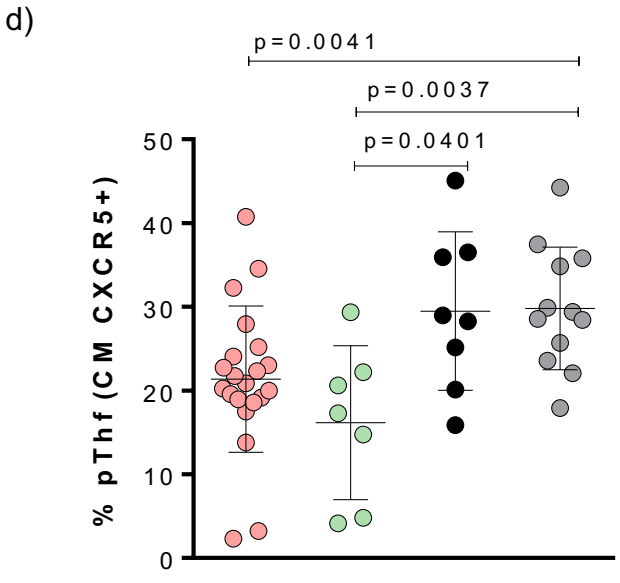
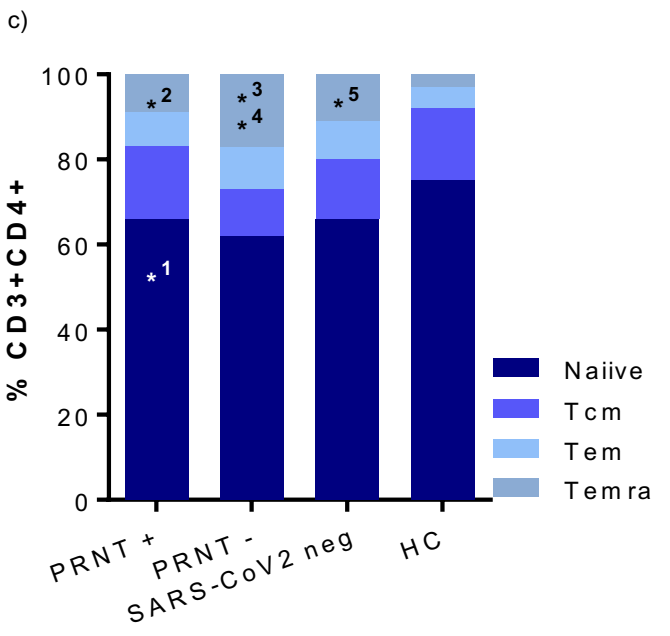
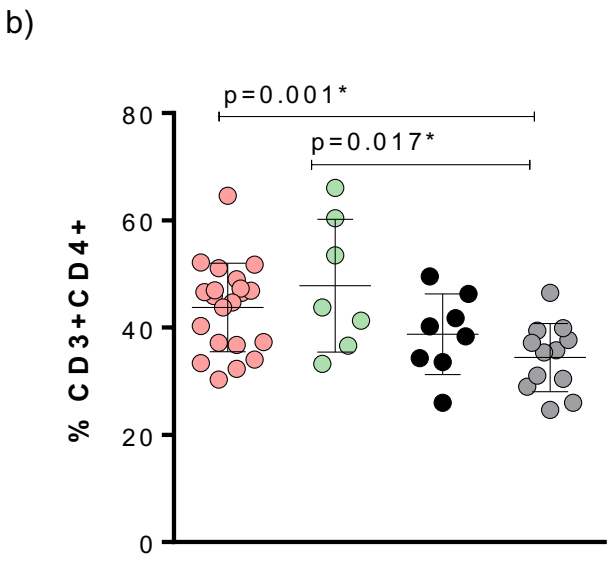
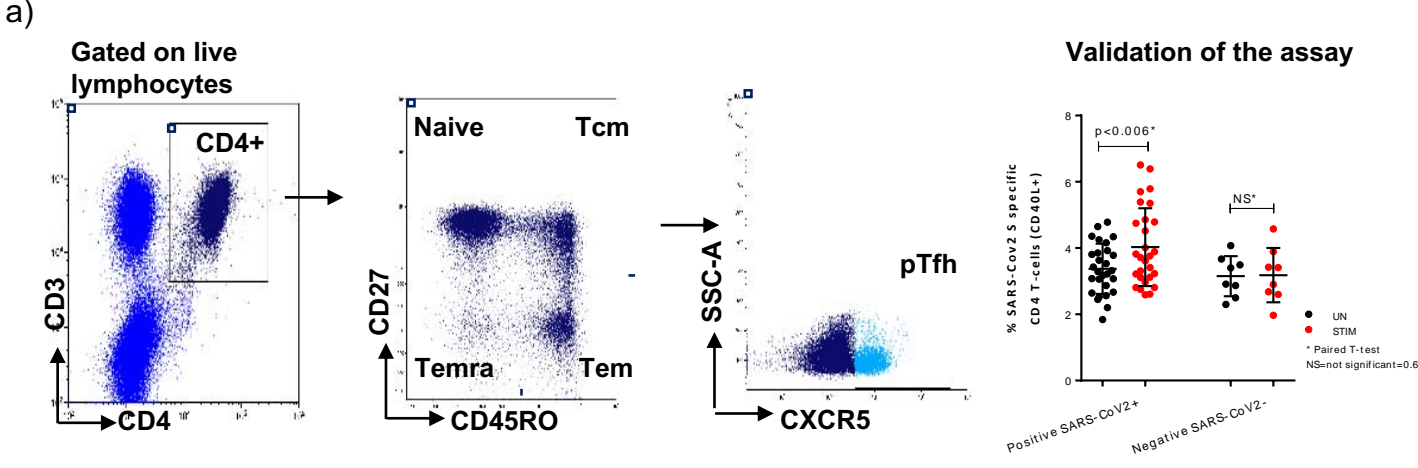




Supplementary Fig. 1 SARS-CoV-2 IgG associates with neutralization activity (PRNT).



**Supplementary Fig. 2 B cells phenotype.** Gating strategy for B-cells phenotype is shown in panel a. B cell populations were analyzed in PRNT (+, light purple solid circle), PRNT (-, light green solid circle) and SARS-CoV-2 neg (black solid circle) using non-parametric Mann Whitney test b), c), d). Unsw.: unswitched CD27+IgD+ B cells; Sw.: switched CD27+IgD- B cells AM=activated memory; RM= resting memory; TLM= tissue like memory. Light purple solid circle= PRNT+; light green solid circle = PRNT-; black solid circle = SARS-CoV-2 negative (neg).



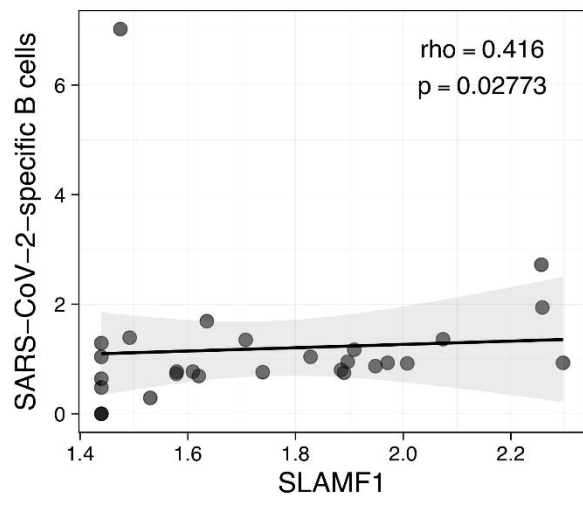
<sup>1</sup> $p=0.05$  Neu (+) vs Healthy  
<sup>2</sup> $p=0.008$  Neu (+) vs Healthy  
<sup>3</sup> $p=0.047$  Neu (+) vs Neu (-)  
<sup>4</sup> $p=0.008$  Neu (-) vs Healthy  
<sup>5</sup> $p=0.024$  Neu (-) vs SARS-COV-2 neg

● PRNT+  
 ● PRNT-  
 ● SARS-CoV-2 neg  
 ● HC

**Supplementary Fig. 3 CD4 T-cells phenotype.** Gating strategy for T-cells phenotype is shown in panel a. Assay validation is shown in b. T-cell populations were analyzed in PRNT (+, light purple solid circle), PRNT (-, light green solid circle) and SARS-CoV-2 neg (black solid circle) using non-parametric Mann Whitney test c-e. Tcm= central memory; Tem=effector memory; Temra= terminally differentiated effector memory. UN=unstimulated, STIM= SARS-CoV-2 stimulated T-cells

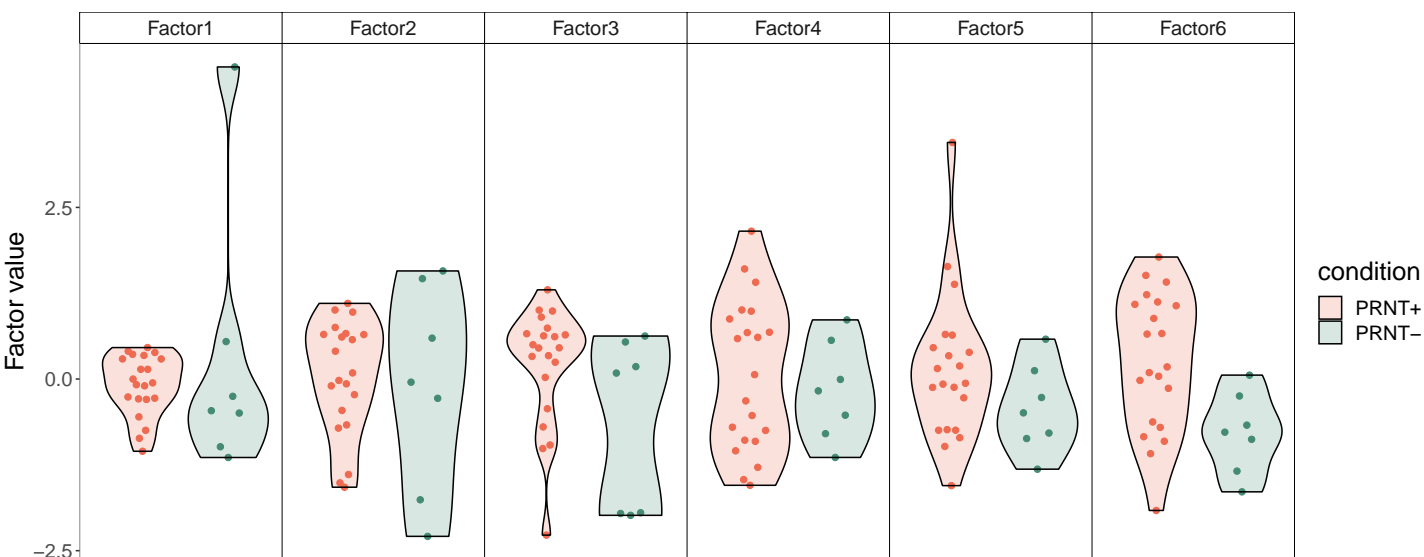
Supplementary Fig. 4 attached separately for higher resolution

**Supplementary Fig. 4 Full set of correlation between Ag-specific B and T cells, humoral responses, viral data and proteomics.** Only significant correlations are shown in the heatmap.

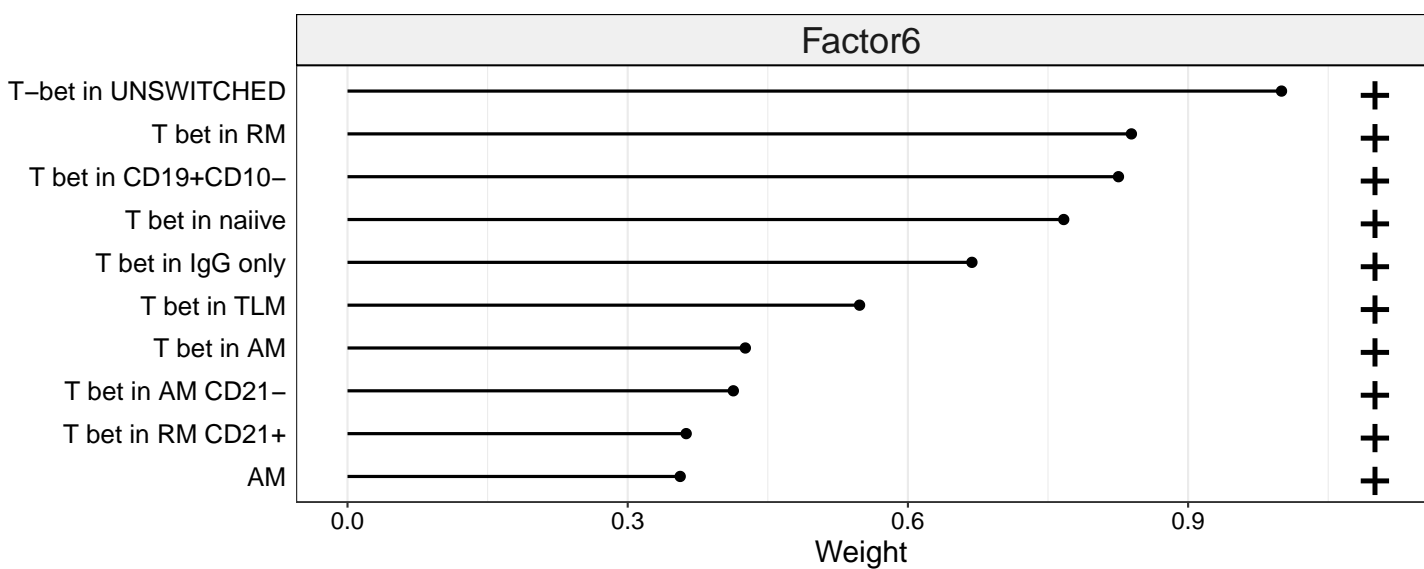


Supplementary Fig. 5 SLAMF1 associates with Ag-specific B cell frequency.

a)

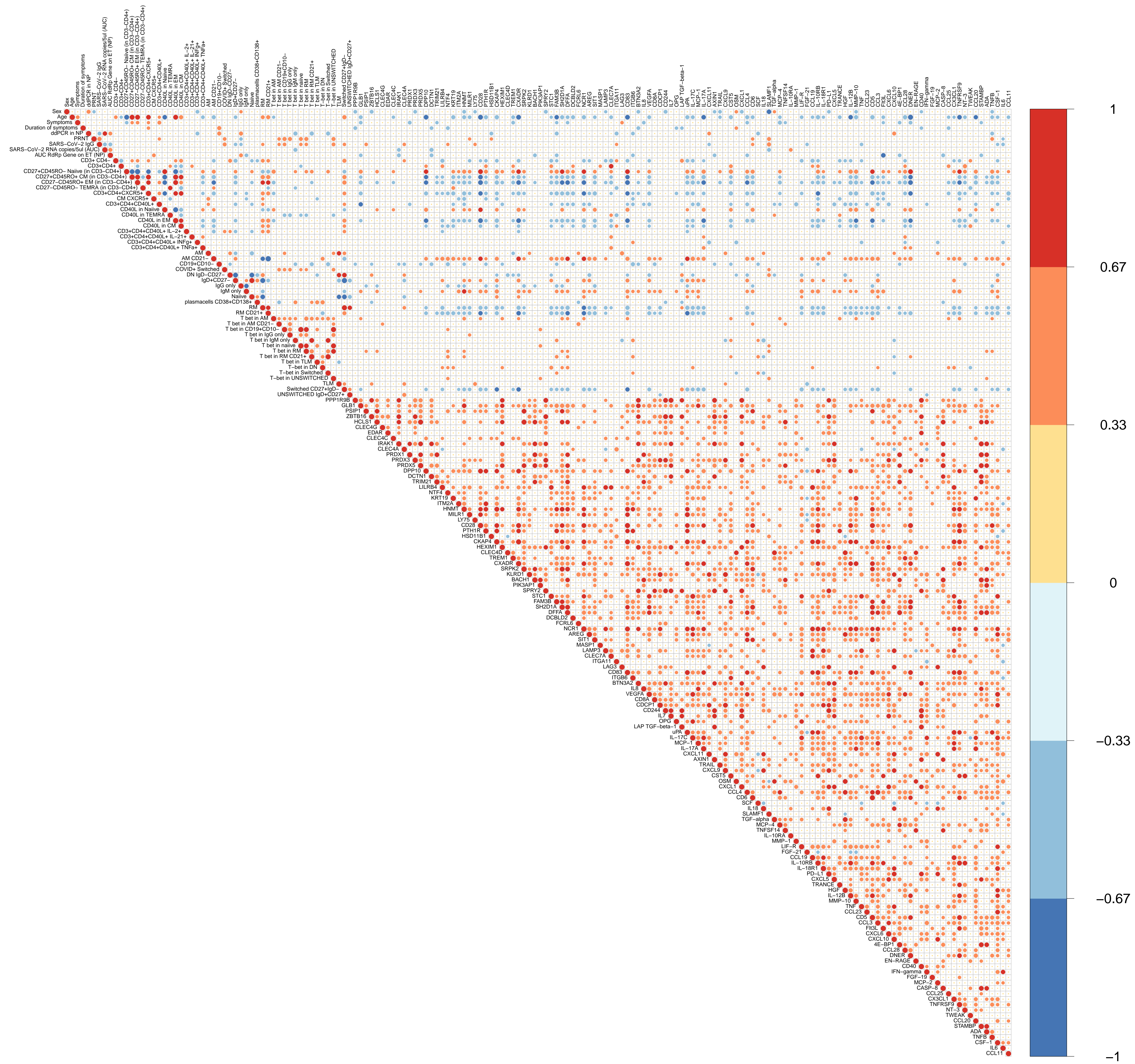


b)



**Supplementary Fig. 6 MOFA analysis.** a) Factors values distribution in PRNT- and PRNT+. b) B cells population contributing to the variance of factor 6.





**Table 2. Table of different Symptoms at admission of the PRNT +, PRN- and SARS-CoV-2 negative patients.**

<b>Symptoms</b>	<b>PRNT+ (n=25)</b>	<b>PRNT- (n=11)<sup>a</sup></b>	<b>SARS-CoV-2 neg (n=11)</b>
Respiratory, <b>n/tot (%)</b>	10/25 (40%)	4/11 (36%)	7/11
Gastrointestinal, <b>n/tot (%)</b>	5/25 (20%)	3/11 (27%)	4/11 (36%)
Convulsion, <b>n/tot (%)</b>	2/25 (8%)	1/11 (9%)	1/11 (9%)
Migraine, <b>n/tot (%)</b>	5/25 (20%)	3/11(27%)	1/11 (9%)
Fever > 37.5, <b>n/tot (%)</b>	10/25 (40%)	6/11 (54%)	11/11 (100%)
Fever < 37.5, <b>n/tot (%)</b>	4/25 (16%)	3/11(27%)	0/11 (0%)
Skin rash, <b>n/tot (%)</b>	0/25 (0%)	1/11 (9%)	2/11 (18%)
Conjunctivitis, <b>n/tot (%)</b>	3/25 (12%)	1/11 (9%)	2/11 (18%)
Joint pain, <b>n/tot (%)</b>	3/25 (12%)	2/11 (18%)	1/11 (9%)
<b>Prescriptions/Treatments</b>			
Azithromycin, <b>n/tot (%)</b>	6/25 (24%)	2/11	0/8 <sup>b</sup> (0%)
Plaquenil, <b>n/tot (%)</b>	6/25 (24%)	4/11 (36%)	n.a.
Corticosteroids, <b>n/tot (%)</b>	2/24 <sup>b</sup> (17%)	1/11 (9%)	1/8 <sup>b</sup> (13%)
Anakirna, <b>n/tot (%)</b>	1/25 (4%)	0/11 (0%)	n.a.

<sup>a</sup>For 6 samples detailed symptoms history was not available; <sup>b</sup>information not available for all the individuals of the group. na=not available.