1 2 3 4 SARS-CoV-2 seropositivity and subsequent infection risk in healthy young adults: 5 a prospective cohort study 6 7 Andrew G. Letizia*, Yongchao Ge*, Sindhu Vangeti*, Carl Goforth*, Dawn L Weir*, Natalia A. 8 Kuzmina, Hua Wei Chen, Dan Ewing, Alessandra Soares-Schanoski, Mary-Catherine George, William D. 9 Graham, Franca Jones, Preeti Bharaj, Rhonda A. Lizewski, Stephen A. Lizewski, Jan Marayag, Nada 10 Marjanovic, Clare Miller, Sagie Mofsowitz, Venugopalan D. Nair, Edgar Nunez, Danielle M. Parent, 11 Chad K. Porter, Ernesto Santa Ana, Megan Schilling, Daniel Stadlbauer, Victor Sugiharto, Michael 12 Termini, Peifang Sun, Russell. P. Tracy, Florian Krammer, Alexander Bukreyey, Irene Ramos, Stuart C. 13 Sealfon 14 15 *Contributed equally 16 17 Naval Medical Research Center, Silver Spring, MD USA (A G Letizia MD, C Goforth PhD, D L Weir 18 PhD, H W Chen PhD, D Ewing BS, W D Graham PhD, F Jones PhD, J Marayag BA, E Nunez AS, C K 19 Porter PhD, E Santa Ana AS, M Schilling PhD, V Sugiharto PhD, P Sun PhD) 20 21 Department of Neurology. Icahn School of Medicine at Mount Sinai, New York, NY USA (Y Ge 22 PhD, S Vangeti PhD, M-C George PhD, N Marjanovic MS, C Miller PhD, S Mofsowitz BS, V D Nair 23 PhD, A Soares-Schanoski PhD, I Ramos PhD, S C Sealfon MD) 24 25 Department of Pathology University of Texas Medical Branch and Galveston National Laboratory, 26 Galveston, TX USA (P Bharaj PhD, N A Kuzmina PhD, A Bukreyev PhD) 27 28 Naval Medical Research Unit SIX, Lima Peru (R A Lizewski MD, S A Lizewski PhD) 29 30 Department of Pathology & Laboratory Medicine, Larner College of Medicine, University of 31 **Vermont, Burlington, VT USA** (D M Parent BS, R P Tracy PhD) 32 33 Department of Microbiology, Icahn School of Medicine at Mount Sinai, New York, NY USA (D 34 Stadlbauer PhD, F Krammer PhD) 35 36 Naval Medical Readiness and Training Command Beaufort, Beaufort, SC USA (M Termini MD) 37 38 Correspondence to: Dr. Stuart C. Sealfon Icahn School of Medicine at Mount Sinai, Annenberg 14-44, 39 One Gustave L. Levy Place, New York, NY 10029 USA 40

61

Summary 42 Background: The risk of severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) subsequent 43 infection among seropositive young adults was studied prospectively. 44 **Methods**: The study population comprised 3,249 predominantly male, 18-20-year-old Marine recruits. 45 Upon arrival at a Marine-supervised two-week quarantine, participants were assessed for baseline SARS-46 CoV-2 IgG seropositivity, defined as a 1:150 dilution or greater on receptor binding domain and full-47 length spike protein enzyme-linked immunosorbent (ELISA) assays. SARS-CoV-2 infection was assessed 48 by PCR at initiation, middle and end of the quarantine. After appropriate exclusions, including 49 participants with a positive PCR during quarantine, we performed three biweekly PCR tests in both 50 seropositive and in seronegative groups once recruits left quarantine and entered basic training and 51 baseline neutralizing antibody titers on all subsequently infected seropositive and selected seropositive 52 uninfected participants. 53 Findings: Among 189 seropositive participants, 19 (10.1%) had at least one positive PCR test for SARS-54 CoV-2 during the six-week follow-up (1.1 cases per person-year). In contrast, 1.079 (48.0%) of the 2.247 55 seronegative participants tested positive (6.2 cases per person-year). The incidence rate ratio was 0.18 56 (95% CI 0.11-0.28, p<0.00001). Among seropositive recruits, infection was associated with lower 57 baseline full-length spike protein IgG titers (p<0.0001). Compared with seronegative recruits, 58 seropositive recruits had about 10-fold lower viral loads (ORF1ab gene, p<0.005), and trended towards 59 shorter duration of PCR positivity (p=0.18) and more frequent asymptomatic infections (p=0.13). Among 60 seropositive participants, baseline neutralizing titers were detected in 45 of 54 (83.3%) uninfected and in 6 of 19 (31.6%) infected participants during the 6 weeks of observation (ID50 difference p<.0001). 62 **Interpretation**: Seropositive young adults had about one-fifth the risk of subsequent infection compared 63 with seronegative individuals. Although antibodies induced by initial infection are largely protective, they 64 do not guarantee effective SARS-CoV-2 neutralization activity or immunity against subsequent infection. 65 These findings may be relevant for optimization of mass vaccination strategies.

Funding: Defense Health Agency and Defense Advanced Research Projects Agency

Introduction

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

As of mid-December 2020, more than 72 million severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) infections have been diagnosed world-wide¹. Serological surveys indicate that the actual number of infections has been many times higher than the cumulative incidence of diagnosed cases, with seropositivity rates approaching 10% in some countries and more than 40% in the Brazilian Amazon²⁻⁴. With the onset of mass SARS-CoV-2 vaccination programs and the increasing proportion of previously infected individuals, the risk of reinfection after natural infection is an important question for modeling the pandemic, estimating herd immunity and guiding vaccination strategies^{5,6}. Most individuals mount a sustained serologic response after initial infection⁷⁻¹¹. Similar to the response to other coronaviruses, the production of IgG antibodies against SARS-CoV-2 peaks several weeks after infection, goes through a decline phase and then stabilizes. The overall humoral response to SARS-CoV-2 is highly variable among individuals⁹. SARS-CoV-2 specific IgG antibodies can be detected in serum from most individuals several months after infection¹¹. However, a percentage of infected patients, ranging from 2.5% to 28% in different studies, do not maintain detectable circulating antibodies⁹ or neutralizing activity¹⁰⁻¹² at later time points. About 10% of individuals who developed antibodies to SARS-CoV-2, all of whom had full-length spike protein-specific IgG antibody titers lower than 1:320, failed to develop measurable neutralizing activity¹¹. Reports have established that SARS-CoV-2 reinfection occurs after previous infection as well as in seropositive individuals¹³⁻²². Several studies have reported that SARS-CoV-2 IgG antibodies^{22,23} and neutralizing antibodies²⁴ provide protection against subsequent infection. The initial trial results of the adenoviral vector-based SARS-CoV-2 vaccine, ChAdOx1 nCoV-19 (AZD1222), noted that among the 373 participants who were seropositive at baseline, 3 (0.8%) had subsequent positive swab PCR tests; in comparison, among 11,263 baseline seronegative participants in all arms of that study, 218 (1.9%) developed a positive test²¹. A study of SARS-CoV-2 serological status and infection among healthcare workers identified 2 infections among 1265 (0.16%) who were seropositive and 223 among 11,364 (2.0%) who were seronegative²². Young adults, of whom a high proportion are asymptomatically infected and become seropositive in the absence of known infection^{25,26} can be an important source of transmission to more vulnerable populations²⁷. Evaluating the protection against subsequent SARS-CoV-2 infection conferred by seropositivity in young adults is important for determining the need for vaccinating previously infected individuals in this age group.

We utilized the COVID-19 Health Action Response for Marines (CHARM) study²⁶, a longitudinal prospective cohort study, to examine the effect of SARS-CoV-2 seropositivity on the risk of developing SARS-CoV-2 infection in young, healthy adult Marine recruits.

Methods

Study design and participants

The prospective study observation period began when Marine recruits arrived at Marine Corps

Recruit Depot – Parris Island (MCRDPI) to commence basic training (Figure 1). To mitigate the spread of

SARS-CoV-2, just before transferring to MCRDPI, the United States Marine Corps (USMC)

implemented two separate quarantine protocols. The first was a two-week home quarantine. After that,
the recruits traveled, while masked and socially distanced, to a second USMC-supervised quarantine

situated at either a college campus from May until July 2020 or at a hotel from August until October

2020. The supervised quarantine employed extensive public health measures, as previously described²⁶,
that were strictly enforced by US Marine instructors at all times. The recruits and staff were forbidden to
leave, and no visitors other than deliveries of supplies and food along with local essential workers and the
study staff were allowed onto the premises. At the end of this quarantine period, the USMC required all
recruits to test negative for SARS-CoV-2 by PCR before proceeding to MCRDPI to initiate basic training.

Within 48 hours of arriving at the supervised quarantine location, recruits were offered the opportunity to volunteer for CHARM. Recruits were eligible if they were ≥18 years of age. Since recruits are a vulnerable population and at risk for coercion, special measures were undertaken including study briefers, who are active-duty Navy personnel wore civilian clothes, did not disclose military ranks, did not have members in the recruit's chain of command present, and ensured that participation would not affect a recruit's medical care or influence the grading of a recruit's military performance by superiors.

Institutional Review Board approval was obtained from the Naval Medical Research Center (protocol number NMRC.2020.0006) in compliance with all applicable U.S. federal regulations governing the protection of human subjects. All participants provided written informed consent.

At enrollment, participants completed a questionnaire consisting of demographic information, risk-factors, reporting of 14 specific COVID-19 related symptoms or any other unspecified symptom, and brief medical-history. At quarantine weeks 0, 1 and 2 a mid-turbinate nares swab for SARS-CoV-2 PCR testing and sera were obtained and questionnaire administered. The follow up questionnaire inquired about the same COVID-19 related symptoms since the last study visit.

Participants who had three negative swab PCR results at the beginning, middle and end of quarantine and a baseline serum serology test at the beginning of the supervised quarantine that identified them as seronegative or seropositive for SARS-CoV-2 according to criteria described below were followed prospectively. At weeks 2, 4 and 6 after transfer from the quarantine location to MCRDPI, a mid-turbinate nares swab for SARS-CoV-2 PCR testing and sera were obtained and the symptom questionnaire administered. When clinically indicated due to the development of symptoms, some participants were evaluated at the MCRDPI clinic and diagnosed by rapid testing. If positive, they went to the isolation barracks, where the study team was able to follow up and repeat testing outside of the scheduled longitudinal follow up encounters. Participants without PCR results obtained during the MCRDPI study period were excluded from analysis.

Procedures

SARS-CoV-2 quantitative PCR testing

All swabs in viral transport media (VTM) were kept at 4°C. All assays were performed within 48h of sample collection at high complexity Clinical Laboratory Improvement Amendments (CLIA)-certified laboratories using the US FDA authorized Thermofisher TaqPathTM COVID-19 Combo Kit (Thermo Fisher Scientific, Waltham MA). Lab24Inc (Boca Raton, FL) performed PCR testing from study initiation until the end of July, and the Naval Medical Research Center (Silver Spring, MD) from August until the conclusion of the study.

SARS-CoV2 enzyme-linked immunosorbent assay (ELISA)

The presence and levels of IgG SARS-CoV-2-specific antibodies in serum were determined using an enzyme-linked immunosorbent assay (ELISA) as previously described²⁶. Briefly, 384-well Immulon 4 HBX plates (Thermofisher), or 96-well half area Microlon plates (Greiner Bio-One), were coated overnight at 4°C with recombinant his-tagged spike (S) receptor binding domain (S-RBD) (SinoBiological) or full-length spike protein (LakePharma) at a concentration of 2 µg/ml in phosphatebuffered saline (PBS). Plates were washed three times with 0.1% Tween-20 (Fisher Scientific) in PBS (PBS-T) using an automated ELISA plate washer (Aquamax 4000, Molecular devices), and blocked for 1 h at room temperature (RT) with 3% milk (BioRad) PBS-T. Blocking solution was removed, and serum samples diluted in 1% milk PBS-T were dispensed in the wells. At least 2 positive controls (sera with known IgG presence), 8 negative controls (sera collected before July 2019) and 4 blanks (no serum) were included in every assay. Plates were incubated for 2 h at room temperature, and then washed 3 times with PBS-T. Next, peroxidase conjugated goat F(ab')2 Anti-Human IgG (Abcam) was added at a dilution 1:5,000-1:10,000 dilutions (determined after optimization for each antibody lot) in 1% milk PBS-T, and plates were incubated for 1 h at room temperature. Plates were washed 6 times with PBS-T, developed using o-Phenylenediamine (Sigma), and the reaction was stopped after 10 min with 3M HCl. Optical density (OD) at 492 nm was measured using a microplate reader (SpectramaxM2, Molecular Devices). All serum samples were screened at a 1:50 dilution with S-RBD. Those samples with an OD 492 nm value higher than the average of the negative controls plus 3 times their standard deviation (SD) in the screening assay underwent titration assay (6 serial 1:3 serum dilutions starting at 1:50) using both S-RBD and full-length spike protein. Serum samples were considered positive for each assay when at least 2 consecutive dilutions showed higher OD 492 nm than the average of the negative controls plus 3 times their SD at the correspondent dilution or 0.15 OD 492 nM. Specificity was 100% on both S-RBD and full-length spike protein ELISA using 70 control sera obtained before July 2019. Participants were only considered seropositive to SARS-CoV-2 if IgG titrations for both ELISA gave a positive result at a minimum of 1:150 dilution.

150

151

152

153

154

155

156

157

158

159

160

161

162

163

164

165

166

167

168

169

170

171

172

173

174

Neutralization assays

177

178

179

180

181

182

183

184

185

186

187

188

189

190

191

192

193

194

195

196

197

198

199

200

201

202

Two-fold serial dilutions of heat-inactivated serum at an initial dilution of 1:20, were prepared in serum free media (Minimum Essential Medium; Thermo fisher Scientific, Cat No. 11095080 containing 25 mM HEPES and 0.05 g/L gentamicin sulfate) and incubated with an equal volume of mNeonGreen SARS-CoV-2²⁸ for 1 hour at 37°C at a final concentration of 200 plaque forming units in humidified 5% CO₂. Virus-serum mixtures were then added to Vero-E6 monolayers in 96 well optical black plates and incubated at 37°C. Plates were read using the BioTek Cytation 5 plate reader (EX 485 nm, EM 528 nm) at 24 h post-infection. Following background signal correction, neutralization titers at a fluorescent end point of 50% virus reduction (ID₅₀) were determined.

Statistical Analysis

Analyses, figures and tables were generated using R 3.6.3. Race was categorized as non-Hispanic white, non-Hispanic black, non-Hispanic other, and Hispanic. Cochran-Armitage Chisquare test for trend was used to compare proportions testing positive for SARS-CoV-2 by increasing titers. Cumulative incidence rates computed by Kapan-Meir method were used to estimate the risk of SARS-CoV-2 infection between seropositive and seronegative participants and also between different titers among the seropositive participants. Observational follow-up began upon arrival at MCRDPI and participants were censored at the first observed positive PCR, or at the latest time with valid PCR assay or at the termination of the study (6 weeks of observation). The Cox proportional hazards model controlled for age, sex and race. The p-values from the cumulative incidence curves were determined by the log-rank test and the p-value and CI for Cox proportional hazard model was computed by the R function coxph. The cycle threshold (Ct) values of viral genes were quantile normalized to remove the batch effects between Lab24Inc and Naval Medical Research Center laboratory assays. The CI and p-values for comparing the mean of the Ct values for two groups are computed based on the two sample ttest.

Role of the Funding Source

The funders had no role in the design of the protocol, data collection, data management, data analysis, data interpretation, or writing of the report. SCS, AGL, YG, CP and IR had access to all deidentified data. SCS and AGL had final responsibility for the decision to submit for publication.

Results

203

204

205

206

207

208

209

210

211

212

213

214

215

216

217

218

219

220

221

222

223

224

225

226

227

228

229

The flow of participants through the study is shown in Figure 1. Two weeks before the initiation of basic training and the start of the prospective cohort study period, a total of 3,249 out of 4,657 eligible new Marine recruits (70%) enrolled in CHARM and underwent a supervised two-week quarantine. Exclusions before the prospective study period included 73 participants who were SARS-CoV-2 PCR positive on at least one of the three PCR tests performed during quarantine, 53 who lacked baseline serology results and 47 who were lost to follow-up. Of the remaining 3,076 participants, 225 were baseline seropositive, having SARS-CoV-2 IgG titers in serum samples obtained at the beginning of quarantine that were greater than 1:150 both with S-RBD and with full-length spike protein ELISA, and 2,851 were baseline seronegative. Among the seropositive participants, 36 (16.0%) were excluded from analysis due either to being lost to follow up (n=34), or to lacking valid PCR results during the study period (n=2). In the seronegative group, 604 (21.2%) participants were excluded due to either being lost to follow up (n=532), or lacking valid PCR results (n=72). Participants were lost to follow up for specific reasons unknown to the study team, including dropping out of the study, being separated from the Marines or being removed from the base for medical or administrative reasons. Demographic characteristics of the two groups in the study cohort are shown in Table 1. Most participants were 18-20 years old and male. The two groups were well-balanced with the exception of a higher proportion of participants who self-identified as Hispanic and as black in the seropositive group. A total of 19 out of 189 (10.1%, 1.1 cases per person-year) seropositive participants and 1,079 out of 2,247 (48.0%, 6.2 cases per person-year) seronegative participants had at least one positive SARS-

CoV-2 PCR result during the six-week study period, representing an 0.18 (95% CI: 0.11 to 0.28, p<0.001)

231

232

233

234

235

236

237

238

239

240

241

242

243

244

245

246

247

248

249

250

251

252

253

254

255

256

incidence rate ratio for SARS-CoV-2 infections in the seropositive group (Table 2). The temporal incidence of infection in seropositive and seronegative groups is shown in Figure 2A. After adjusting the effects of race, age and sex on the SARS-CoV-2 infections, the hazard ratio comparing seropositive participants and seronegative participants was 0.16 (95% CI, 0.10-0.25, p<0.001; supplementary Table 1). Within the seropositive group, we assessed the association between the SARS-CoV-2 IgG baseline titers and the risk of infection. As shown in Figure 2B, supplementary Figure 2 and Table 3, we found a strong association between subsequent PCR positive infection and lower titers of IgG antibodies directed to full-length spike protein (p<0.0001) as well as to S-RBD (p=0.0019). The detailed Cox proportional hazard analysis in supplementary Table 1 gives a hazard ratio of 0.45 (95% CI 0.32-0.65, p<0.001) and 0.67 (95% CI 0.47-0.96, p=0.028) respectively for the full-length spike protein titer and S-RBD titer, both log-transformed. We examined baseline SARS-CoV-2 IgG neutralizing antibody activity in all seropositive participants who became PCR positive during the observation period and in the first 54 participants who were seropositive but remained PCR negative. Neutralizing activity was above the limit of detection in 45 of 54 (83.3%) seropositive participants who never became PCR positive and in 6 of 19 (31.6%) of participants infected during the 6 weeks of observation. The neutralizing activity assessed as 50% inhibitory dose (ID50) was significantly higher in the participants who did not become PCR positive during the study (p<.0001, Cochran-Armitage test, Table 3, supplementary Figure 2). We also compared virus loads estimated by PCR Ct values between the seronegative and seropositive PCR infected groups and found that seronegative individuals had on average 4, 2.6 and 3.3 lower cycle values for ORF1ab gene (p=0.004, 95% CI 1.23 to 6.67), S gene (p=0.11, 95% CI -0.58 to 5.77) and N gene (p=0.033, 95% CI 0.27 to 6.33), respectively, than seropositive individuals. The lower Ct values suggest an approximately 10-fold higher virus load in the samples from seronegative participants (Table 4). In addition, seronegative participants tended to have a longer duration of PCR positivity than seropositive individuals (p=0.18). The proportion of asymptomatic participants was 84.2% (16 of 19) and 67.8% (732 of 1079) in seropositive and serong ative infected individuals, respectively, a difference that did not reach significance (p=0.13).

Discussion

257

258

259

260

261

262

263

264

265

266

267

268

269

270

271

272

273

274

275

276

277

278

279

280

281

282

This study of primarily young, male Marine recruits found that the presence of antibodies to SARS-CoV-2 conferred an 82% reduced incidence rate of SARS-CoV-2 infection. The percentage of symptomatic infections was comparable in seropositive and seronegative participants. Among the seropositive group, the participants that became infected had lower antibody titers than those that were uninfected, and were more likely to lack detectable baseline neutralizing antibody activity. Our results indicate that although antibodies induced by infection are largely protective, they do not guarantee effective immunity against subsequent infection.

This study leveraged a two-week USMC-mandated quarantine period during which baseline SARS-CoV-2 antibody status was established on arrival. Only baseline seronegative or seropositive participants who had multiple negative SARS-CoV-2 PCR tests during the supervised quarantine were included in the prospective study. The three negative PCR tests during quarantine helped ensure that infections diagnosed during basic training were not persistent infections but incident infection occurring during the prospective period. The two-week home quarantine preceding the supervised quarantine, as well as the relatively low frequency of infections diagnosed on arrival and during quarantine, further support that only incident infections were included in our analyses. The aggregate infection rate in both groups during the six weeks of observation at MCRDPI was 1,098 out of 2,436 (45.1%) participants. In contrast, only 28 of 3,249 (0.9%) participants were PCR positive on arrival at the supervised quarantine and less than 2% of participants became PCR positive during the two-week quarantine period. In view of the consecutive two periods of quarantine, the relatively low rate of infection during quarantine, and the three consecutive negative PCR tests, it is unlikely that any participants with persistent infection preceding their arrival at MCRDPI were entered into the prospective study. Even if this occurred, such cases would be unlikely to affect the relative risk calculations comparing the seropositive and seronegative groups. This methodology allowed for the creation of two well defined groups who entered basic training without active infection and differed primarily by baseline serology.

The two groups had similar demographic profiles, with the exception of a slightly higher prevalence in self-identified Hispanic and non-Hispanic black participants in the seropositive group. The seropositive group was almost 50% Hispanic and 22% non-Hispanic black participants compared to 22% and 12%, respectively in the seronegative group. This is likely due to minority populations having higher seroprevalence rates during the COVID-19 pandemic in general and among young adults specifically²⁷.

Rates of infection and the risk reduction provided by seropositivity are important for understanding transmission dynamics for COVID-19, for epidemiologic modeling, and for estimating and achieving herd immunity levels, a major goal of mass vaccination strategies. Herd immunity is difficult to predict if the infection risk after natural and vaccine-induced immunity is unknown. Since SARS-CoV-2 vaccines may not provide sterile immunity, it is possible that both previously infected and vaccinated individuals may later become infected. It is not known if either can contribute to transmission events. We found only a modest, approximately 10-fold decrease in nares virus load as estimated by swab PCR Ct levels in the seropositive compared with the seronegative infected participants. This finding suggests that some reinfected individuals could have a similar capacity to transmit infection as those who are infected for the first time. The rate at which reinfection occurs after vaccines and natural immunity are important for estimating the percentage of the population that needs to be vaccinated to suppress the pandemic.

The crowded living conditions, demanding regimen and requirement for personal contact during basic training despite the pandemic leads not only to an increased risk for respiratory epidemics²⁹, but also potentially to higher exposure levels. The close quarters and constant contact among recruits that are needed for team building allows a viral infection to rapidly proliferate within a unit. The physically and mentally demanding training environment may also suppress immunity. These conditions may contribute to the high infection rate we observed during the six-week study period. These factors are not typically present in the civilian community. Therefore, the study setting limits the generalizability of our findings to other settings where the frequency and intensity of exposure and the susceptibility of the host might differ.

The clinical outcomes between seropositive and seronegative groups were similar, with the majority (84.2% and 67.8%, respectively) being asymptomatic. The two groups did not show a significant

difference in the duration of PCR positivity. No participants in either group needed inpatient care. Although our findings are limited to healthy young adults, studying this population does have the advantage of reducing the confounding factors of age and co-morbid illnesses³⁰. Infection in seropositive participants was associated with lower SARS-CoV-2 IgG titers and absent or lower levels of neutralizing antibody activity. Young adults have high rates of asymptomatic and pauci-symptomatic infection, which has been associated with lower levels of antibodies and potentially a less robust immune memory response. This could lead to higher overall rates of re-infection among this population compared to other populations. We did not examine the role of cell mediated immunity or host, environment and virus factors leading to reinfection.

Since the study population is a fairly accurate representation of the races and ethnicities in the US population among 18-20-year-olds, the results are most applicable to young male adults. The relative risk of infection may be different in seropositive females and in adults of other ages or health status. Other limitations in our study include not being able to investigate the exposure event during a seropositive participant's initial infection prior to arrival at quarantine, the inability to confirm initial SARS-CoV-2 infection by PCR in the seropositive group, and potentially missing detectable infections that occurred between biweekly sampling.

Our investigation is likely to underestimate the risk of SARS-CoV-2 infection in previously infected individuals because the seronegative group includes an unknown number of previously infected participants who did not have significant IgG titers in their baseline serum sample. Despite this underestimation, we found that previously infected participants identified by seropositivity are susceptible to repeat infection, with nearly one-fifth the incidence rate of those without evidence of previous infection. This suggests that COVID-19 vaccination may be necessary for control of the pandemic in previously infected young adults.

Contributors

AGL, IR, and SCS provided overall leadership and guidance to the investigation. YG performed statistical analysis and data curation. SV, CKP, CG, DLW, RL, and IR contributed to data analysis. RL,

338

339

340

341

342

343

344

345

346

347

348

349

350

351

352

353

354

355

356

357

358

359 360

361 362

363

364

365

JM, EN, ESA, SM, NM, contributed to sample collection and management. CG, DLW, WDG contributed to data collection. SV, NAK, DE, AS, PB, NM, CM, DMP, SM, DS, PS performed serological assays. HWC, and VS performed PCR assays. AGL, SV, DLW, NAK, AS, RL, CM, CKP, MT, and IR contributed to data interpretation. AGL, CG, FJ, RL, EN supervised sample collection. AGL, CG, RL supervised data collection. RPT, FK, AB, and IR supervised serology assays. MS supervised PCR assays. MG and MT provided project administration and coordination. YG, SV, IR, CKP and VDN prepared figures. AGL, YG, SV, IR and SCS wrote and revised the original draft. All authors reviewed and approved the final manuscript. **Declaration of Interests** AGL, YG, SV, CG, DLW, HWC, DE, MCG, WDG, FJ, RL, JM, NM, CM, SM, VDN, EN, CKP, ESA, ASS, MS, VS, MT, PS, RPT, IR and SCS declare no competing interests. DP owned stock in Co-Diagnostics Inc during the conduct of the study. DP held stock in Co-Diagnostics, Inc. DS and FK have filed a patent regarding serological assays and for SARS-CoV-2 and Icahn School of Medicine at Mount Sinai has founded a company to commercialize serological assays they developed. AGL, CG, DLW, HWC, DEW, DG, FJ, JM, EN, CKP, ESA, MS, VS, PS, RAL, SAL, and MT are military Service members or GS employees. This work was prepared as part of their official duties. Title 17, U.S.C., §105 provides that copyright protection under this title is not available for any work of the U.S. Government. Title 17, U.S.C., §101 defines a U.S. Government work as a work prepared by a military Service member or employee of the U.S. Government as part of that person's official duties. The views expressed in the article are those of the authors and do not necessarily express the official policy and position of the US Navy, the Department of Defense, the US government or the institutions affiliated with the authors. Acknowledgements We thank Quanterix (Billerica, MA) for providing beta-level serological assay kits used for ELISA validation studies; Mary Anne Amper, Nitish Seenarine, Mital Vasoya, Illya Aronskyy and Braian Qela for outstanding technical assistance; German Nudelman and Stas Rirak for database development; Celia Gelernter and Adam B. Sealfon for editing assistance; Mitchel Rabinowitz for project management; Terri

Brantley and Andrea Gates for administrative support; Adam Armstrong for strategic guidance; the many US Navy corpsmen who assisted in the logistics and sample acquisition; and the devoted Marine recruits who volunteered for this study. This work received funding from the Defense Health Agency through the Naval Medical Research Center (9700130) and from the Defense Advanced Research Projects Agency (contract number N6600119C4022).

373

374

375

376

377

378

379

380

381

382

383

384

385

386

387

388

389

390

391

392

393

394

395

396

397

Table and Figure legends Table 1: Demographic characteristics of participants studied prospectively in the seropositive and seronegative groups. A total of 120 participants are excluded due to being lost to follow up, lacking any baseline valid IgG or becoming PCR positive during the quarantine period. The table includes all 3,076 participants who entered training and were followed prospectively, including the 640 participants who were later excluded for further analysis Table 2: Comparison of SARS-Cov-2 infection (PCR positive) at MCRDPI between the seropositive and seronegative groups. The analysis is based on the 2,436 participants who had valid PCR data obtained during the prospective follow-up period. Table 3. SARS-CoV-2 S-RBD and full-length spike IgG titers and neutralizing antibody activity in PCR positive and PCR negative seropositive participants. p-values were assessed by the Cochran-Armitage test. ID50 is the titer at which a 50% reduction in virus infection was observed. Table 4: Comparison of symptoms and cycle threshold values between SARS-CoV-2 infected (PCR positive) seropositive and seronegative groups. Figure 1: Flow chart of the study design and outcomes. The baseline analyses were performed within two days of enrollment and two weeks before the prospective study period. Nearly all participants were tested at scheduled biweekly intervals during the prospective study period. A few participants were diagnosed by the MCRDPI clinic, and were tested by the study team at times not corresponding to the regularly scheduled longitudinal follow ups. Participants lost to follow up either dropped out of the study. were separated from the Marine Corps or were removed from the base for medical or administrative reasons. The study team did not know the reason for participants missing study visits.

Figure 2: SARS-CoV-2 PCR positive incidence curves during the six-week follow-up period. A.

Overall cumulative incidence for testing PCR positive in the baseline seropositive and seronegative groups. B. Cumulative incidence for testing PCR positive in the seropositive group at different baseline full-length spike protein IgG titers which ranged from 1:150 to 1:12150. The charts are derived from Kaplan-Meier survival analyses and the cumulated censored participants are listed.

408 References

- 1. Dong E, Du H, Gardner L. An interactive web-based dashboard to track COVID-19 in
- 410 real time. *Lancet Infect Dis* 2020; **20**(5): 533-4.
- 411 2. Buss LF, Prete CA, Jr., Abrahim CMM, et al. Three-quarters attack rate of SARS-CoV-2
- in the Brazilian Amazon during a largely unmitigated epidemic. *Science* 2020.
- 413 3. Pollán M, Pérez-Gómez B, Pastor-Barriuso R, et al. Prevalence of SARS-CoV-2 in Spain
- 414 (ENE-COVID): a nationwide, population-based seroepidemiological study. *The Lancet* 2020;
- 415 **396**(10250): 535-44.
- 416 4. Stadlbauer D, Tan J, Jiang K, et al. Repeated cross-sectional sero-monitoring of SARS-
- 417 CoV-2 in New York City. *Nature* 2020.
- 418 5. Altmann DM, Douek DC, Boyton RJ. What policy makers need to know about COVID-
- 419 19 protective immunity. *Lancet* 2020; **395**(10236): 1527-9.
- 420 6. Overbaugh J. Understanding protection from SARS-CoV-2 by studying reinfection. Nat
- 421 *Med* 2020; **26**(11): 1678-9.
- 422 7. Beaudoin-Bussieres G, Laumaea A, Anand SP, et al. Decline of Humoral Responses
- against SARS-CoV-2 Spike in Convalescent Individuals. *mBio* 2020; **11**(5).
- 424 8. Gudbjartsson DF, Norddahl GL, Melsted P, et al. Humoral Immune Response to SARS-
- 425 CoV-2 in Iceland. *N Engl J Med* 2020; **383**(18): 1724-34.
- 426 9. Self WH, Tenforde MW, Stubblefield WB, et al. Decline in SARS-CoV-2 Antibodies
- 427 After Mild Infection Among Frontline Health Care Personnel in a Multistate Hospital Network -
- 428 12 States, April-August 2020. MMWR Morb Mortal Wkly Rep 2020; **69**(47): 1762–6.
- 429 10. Seow J, Graham C, Merrick B, et al. Longitudinal observation and decline of neutralizing
- antibody responses in the three months following SARS-CoV-2 infection in humans. *Nat*
- 431 *Microbiol* 2020; **5**(12): 1598-607.

- 432 11. Wajnberg A, Amanat F, Firpo A, et al. Robust neutralizing antibodies to SARS-CoV-2
- 433 infection persist for months. *Science* 2020; **370**(6521): 1227-30.
- 12. Crawford KHD, Dingens AS, Eguia R, et al. Dynamics of neutralizing antibody titers in
- the months after SARS-CoV-2 infection. *J Infect Dis* 2020.
- 436 13. Chan PKS, Lui G, Hachim A, et al. Serologic Responses in Healthy Adult with SARS-
- 437 CoV-2 Reinfection, Hong Kong, August 2020. Emerg Infect Dis 2020; **26**(12): 3076-8.
- 438 14. Huang J, Zheng L, Li Z, et al. Kinetics of SARS-CoV-2 positivity of infected and
- recovered patients from a single center. Sci Rep 2020; **10**(1): 18629.
- Lee JS, Kim SY, Kim TS, et al. Evidence of Severe Acute Respiratory Syndrome
- Coronavirus 2 Reinfection After Recovery from Mild Coronavirus Disease 2019. Clin Infect Dis
- 442 2020.
- 443 16. Lu J, Peng J, Xiong Q, et al. Clinical, immunological and virological characterization of
- 444 COVID-19 patients that test re-positive for SARS-CoV-2 by RT-PCR. *EBioMedicine* 2020; **59**:
- 445 102960.
- 446 17. Mulder M, van der Vegt D, Oude Munnink BB, et al. Reinfection of SARS-CoV-2 in an
- immunocompromised patient: a case report. Clin Infect Dis 2020.
- 448 18. Munoz Mendoza J, Alcaide ML. COVID-19 in a patient with end-stage renal disease on
- chronic in-center hemodialysis after evidence of SARS-CoV-2 IgG antibodies. Reinfection or
- inaccuracy of antibody testing. *IDCases* 2020; **22**: e00943.
- 451 19. Selhorst P, Van Ierssel S, Michiels J, et al. Symptomatic SARS-CoV-2 reinfection of a
- health care worker in a Belgian nosocomial outbreak despite primary neutralizing antibody
- response. Clin Infect Dis 2020.
- 454 20. Van Elslande J, Vermeersch P, Vandervoort K, et al. Symptomatic SARS-CoV-2
- reinfection by a phylogenetically distinct strain. Clin Infect Dis 2020.

- 456 21. Voysey M, Clemens SAC, Madhi SA, et al. Safety and efficacy of the ChAdOx1 nCoV-
- 457 19 vaccine (AZD1222) against SARS-CoV-2: an interim analysis of four randomised controlled
- 458 trials in Brazil, South Africa, and the UK. *The Lancet* 2020.
- Lumley SF, O'Donnell D, Stoesser NE, et al. Antibody Status and Incidence of SARS-
- 460 CoV-2 Infection in Health Care Workers. New England Journal of Medicine 2020.
- Harvey RA, Rassen JA, Kabelac CA, et al. Real-world data suggest antibody positivity to
- SARS-CoV-2 is associated with a decreased risk of future infection. *medRxiv* 2020:
- 463 2020.12.18.20248336.
- 464 24. Addetia A, Crawford KHD, Dingens A, et al. Neutralizing Antibodies Correlate with
- 465 Protection from SARS-CoV-2 in Humans during a Fishery Vessel Outbreak with a High Attack
- 466 Rate. J Clin Microbiol 2020; **58**(11): e02107-20.
- 467 25. Letizia AG, Ge Y, Goforth CW, et al. SARS-CoV-2 seropositivity among US Marine
- recruits *Emerging Infectious Diseases* 2021; **revision awaiting decision**.
- 469 26. Letizia AG, Ramos I, Obla A, et al. SARS-CoV-2 Transmission among Marine Recruits
- 470 during Quarantine. *N Engl J Med* 2020; **383**(25): 2407-16.
- 471 27. De Sanctis V, Ruggiero L, Soliman AT, Daar S, Di Maio S, Kattamis C. Coronavirus
- 472 Disease 2019 (COVID-19) in adolescents: An update on current clinical and diagnostic
- 473 characteristics. *Acta Biomed* 2020; **91**(2): 184-94.
- 474 28. Xie X, Muruato A, Lokugamage KG, et al. An Infectious cDNA Clone of SARS-CoV-2.
- 475 *Cell Host Microbe* 2020; **27**(5): 841-8 e3.
- 476 29. Gray GC, Callahan JD, Hawksworth AW, Fisher CA, Gaydos JC. Respiratory diseases
- among U.S. military personnel: countering emerging threats. *Emerg Infect Dis* 1999; **5**(3): 379-
- 478 85.
- 479 30. Frasca D, Blomberg BB. Aging induces B cell defects and decreased antibody responses
- 480 to influenza infection and vaccination. *Immun Ageing* 2020; **17**(1): 37.

Label	Levels	Seropositive	Seronegative	Total
Total N (%)		225 (7.3)*	2851 (92.7)	3076
Age	Mean (SD)	19.0 (1.8)†	19.1 (1.9)	19.1 (1.9)
Sex	F	22 (9.8)	229 (8.0)	251 (8.2)
	M	203 (90.2)	2622 (92.0)	2825 (91.8)
Race	Non-Hispanic White	56 (24.9)	1698 (59.6)	1754 (57.0)
	Non-Hispanic Black	50 (22.2)	349 (12.2)	399 (13.0)
	Non-Hispanic Other	7 (3.1)	183 (6.4)	190 (6.2)
	Hispanic	112 (49.8)	621 (21.8)	733 (23.8)
Non-US residence	No	216 (96.0)	2749 (96.4)	2965 (96.4)
	Yes	4 (1.8)	19 (0.7)	23 (0.7)
	N/A‡	5 (2.2)	83 (2.9)	88 (2.9)
Non-US birth	No	189 (84.0)	2626 (92.1)	2815 (91.5)
	Yes	32 (14.2)	192 (6.7)	224 (7.3)
	N/A	4 (1.8)	33 (1.2)	37 (1.2)

Table 1: Demographic characteristics of participants studied prospectively in the seropositive and seronegative groups. A total of 120 participants were excluded due to being lost to follow up, lacking any baseline valid IgG or becoming PCR positive during the quarantine period. The table includes all 3,076 participants who entered training and were followed prospectively, including the 640 participants who were later excluded for further analysis (see Figure 1).

^{*} The continuous variable age is summarized with mean (SD)

[†] Categorical variables are summarized with counts (percentages)

[‡] If a participant answered unknown or left a question blank, then the value is grouped into "N/A".

Group	Seropositive	Seronegative	
Total	189	2247	
PCR positive	19	1079	
Incidence proportion (%)	10.1	48	
Proportion difference (%)	-38 (-45 to -31, p<0.001)		
Observed person year	17.1	175.2	
Incidence rate	1.11	6.16	
Incidence rate ratio	0.18 (0.11 to 0.28, p<0.001)		

Table 2: Comparison of SARS-Cov-2 infection (PCR positive) at MCRDPI between the seropositive and seronegative groups. The analysis is based on the 2,436 participants who had valid PCR data obtained during the prospective follow-up period.

Assay	Group	N	No. (%) of people at the titer or ID50 interval				mean±sem	p-value	
titer			150	450	1350	4050	12150		
S-RBD	PCR+	19	5(26.3)	5(26.3)	6(31.6)	3(15.8)	0(0)	674.5±181.1	0.017
	PCR-	170	6(3.5)	49(28.8)	81(47.6)	27(15.9)	7(4.1)	1186.3±86.2	0.017
Full-length	PCR+	19	6(31.6)	2(10.5)	2(10.5)	6(31.6)	3(15.8)	1202.6±472.7	1 205 05
spike protein	PCR-	170	3(1.8)	2(1.2)	41(24.1)	83(48.8)	41(24.1)	3723.7±259.9	1.20E-05
ID50 range			<20	[20,40)	[40,80)	[80,160)	[160,320)		
Neutralization	PCR+	19	13(68.4)	2(10.5)	3(15.8)	1(5.3)	0(0)	16.8±3.1*	9.80E-05
	PCR-	54	9(16.7)	10(18.5)	19(35.2)	15(27.8)	1(1.9)	48.2±5.7	

Table 3. SARS-CoV-2 S-RBD and full-length spike IgG titers and neutralizing antibody activity in PCR positive and PCR negative seropositive participants. p-values were assessed by the Cochran-Armitage test. ID50 is the titer at which a 50% reduction in virus infection was observed.

^{*}The mean and SEM is computed after converting undetectable titer <20 to be 10.

	Seropositive	Seronegative	Difference comparison
Total N	19	1079	
Infection duration>7 days	6 (31.6%)*	510 (47.3%)	-0.16 (-0.38 to 0.07, p=0.175)†
Symptomatic	3 (15.8%)	347 (32.2%)	-0.16 (-0.38 to 0.05, p=0.129)
N gene Ct	27.7 (7.6) ‡	24.4 (5.5)	3.30 (0.27 to 6.33, p=0.033) ¶
S gene Ct	26.9 (7.1)	24.3 (5.3)	2.60 (-0.58 to 5.77, p=0.109)
ORF1ab Ct	28.0 (7.0)	24.0 (5.3)	3.95 (1.23 to 6.67, p=0.004)

Table 4: Comparison of symptoms and cycle threshold values between SARS-CoVCov-2 infected (PCR positive) seropositive and seronegative groups.

- * Binary variables are summarized with counts (percentages)
- † Difference in proportion for binary variables
- ‡ The cycle threshold (Ct) values of three viral genes are summarized by mean (SD)
- ¶ Difference in mean for the Ct values

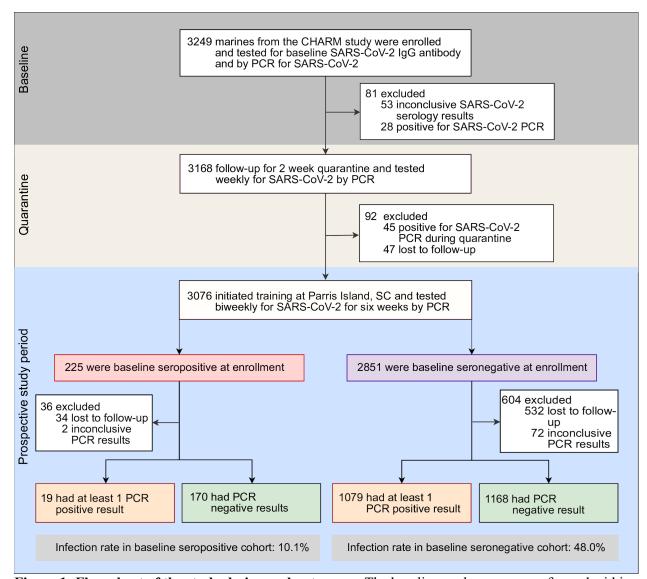


Figure 1: Flow chart of the study design and outcomes. The baseline analyses were performed within two days of enrollment and two weeks before the prospective study period. Nearly all participants were tested at scheduled biweekly intervals during the prospective study period. A few participants were diagnosed by the Marine Corps Recruit Depot Parris Island clinic, and were tested by the study team at times not corresponding to the regularly scheduled longitudinal follow ups. Participants lost to follow up either dropped out of the study, were separated from the Marine Corps or were removed from the base for medical or administrative reasons. The study team did not know the reason for participants missing study visits.

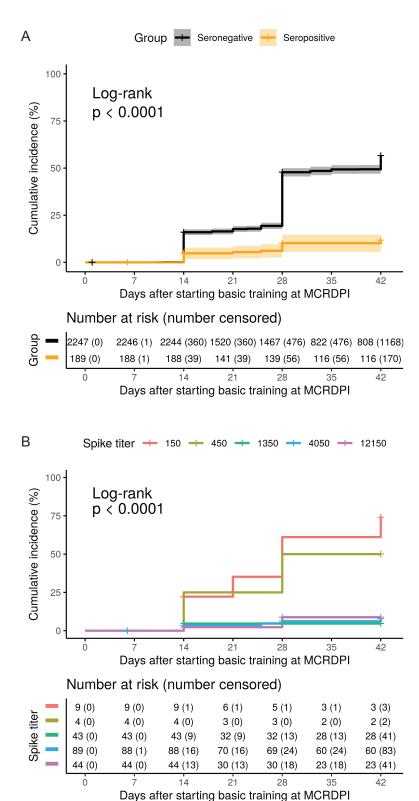


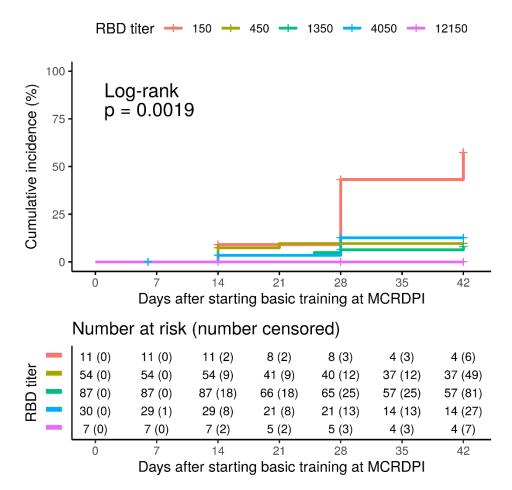
Figure 2: SARS-CoV-2 PCR positive incidence curves during the six-week follow-up period. A. Overall cumulative incidence for testing PCR positive in the baseline seropositive and seronegative groups. B. Cumulative incidence for testing PCR positive in the seropositive group at different baseline full-length spike protein IgG titers which ranged from 1:150 to 1:12150. The cumulative incidence rate is computed by the Kaplan-Meier method, and the cumulated censored participants are listed.

Supplementary Tables and Figures

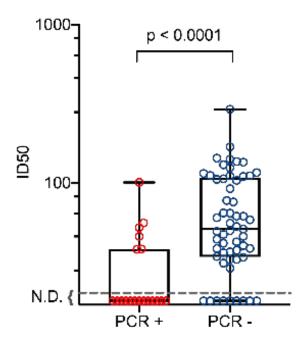
			N	Hazard ratio (univariable)	Hazard ratio (multivariable)	
Group Analysis*	Group	Seronegative	2247	-‡	-	
		Seropositive	189	0.16 (0.10-0.25, p<0.001)	0.16 (0.10-0.25, p<0.001)	
	Age	Mean (SD)	19.1 (1.9)	0.97 (0.94-1.00, p=0.088)	0.97 (0.94-1.00, p=0.070)	
	Sex	F 217		-	-	
		M	2219	1.03 (0.85-1.25, p=0.746)	1.06 (0.87-1.29, p=0.541)	
	Race	Non-Hispanic White	1352	_	-	
		Non-Hispanic Black 324		0.75 (0.62-0.91, p=0.004)	0.86 (0.70-1.04, p=0.120)	
		Non-Hispanic Other	162	0.97 (0.77-1.22, p=0.793)	0.96 (0.76-1.22, p=0.763)	
		Hispanic	598	0.94 (0.81-1.08, p=0.360)	1.08 (0.93-1.24, p=0.324)	
S-RBD	Titer	Mean (SD)	10.1 (1.4)	0.67 (0.48-0.94, p=0.022)	0.67 (0.47-0.96, p=0.028)	
Titer	Age	Mean (SD)	19.0 (1.8)	1.00 (0.78-1.27, p=0.970)	1.00 (0.79-1.27, p=0.975)	
Analysis†	Sex	F	17	-	-	
		M	172	0.95 (0.22-4.10, p=0.941)	1.19 (0.25-5.55, p=0.829)	
	Race	Non-Hispanic White	46	-	-	
		Non-Hispanic Black	45	0.68 (0.11-4.08, p=0.674)	0.59 (0.10-3.60, p=0.571)	
		Non-Hispanic Other	5	3.41 (0.35-32.83, p=0.288)	2.47 (0.23-26.67, p=0.456)	
		Hispanic	93	2.28 (0.65-7.98, p=0.199)	2.05 (0.58-7.25, p=0.268)	
Full-	Titer	Mean (SD)	8.1 (1.1)	0.49 (0.35-0.68, p<0.001)	0.45 (0.32-0.65, p<0.001)	
Length Spike Protein Titer	Age	Mean (SD)	19.0 (1.8)	1.00 (0.78-1.27, p=0.970)	1.04 (0.79-1.35, p=0.794)	
	Sex	F	17	-	-	
		М	172	0.95 (0.22-4.10, p=0.941)	1.07 (0.19-6.22, p=0.936)	
Analysis†	Race	Non-Hispanic White	46	-	-	
		Non-Hispanic Black	45	0.68 (0.11-4.08, p=0.674)	0.68 (0.11-4.19, p=0.678)	
		Non-Hispanic Other	5	3.41 (0.35-32.83, p=0.288)	1.62 (0.11-23.89, p=0.724)	
		Hispanic	93	2.28 (0.65-7.98, p=0.199)	4.82 0.79-10.11, p=0.112)	

Supplementary Table 1: Cox proportional hazard regression analysis of group and titer association with SARS-CoV-2 infection.

- * The predictor in multivariable analysis includes predictor variables group, age, sex and race using all 2,436 participants with valid PCR data to detect SARS-CoV-2 infection during the six-week prospective study period.
- † The predictor in multivariable analysis includes predictor variables titer, age, sex and race using 189 participants in the seropositive group. The titers (S-RBD and full-length spike protein) have been log transformed. The univariate analysis for both S-RBD titer and full-length spike protein titer gives the same results of age, sex and race due to use the same set of participants and were kept for both to make it is easier to compare the univariable and multivariable analysis.
- ‡ The dashed symbol indicates the reference level against which other levels were compared.



Supplementary Figure 1: SARS-CoV-2 PCR positive incidence curves at different baseline RBD IgG titers during the six-week follow-up period. Cumulative incidence for testing PCR positive in the seropositive group at different baseline RBD IgG titers, which ranged from 1:150 to 1:12150. The numbers at risk and cumulated censored participants are listed below the table.



Supplementary Figure 2: Baseline neutralizing antibodies in PCR+ and PCR- seropositive participants. The baseline 50% inhibitory dose (ID50) was determined for all seropositive participants who became SARS-CoV-2 PCR positive during the subsequent six-week observation period and in the first 54 seropositive participants enrolled who did not test PCR positive. N.D. indicates no inhibition detected at a 1:20 dilution which was the lowest titer evaluated. P value was assessed by the Cochran-Armitage test.