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1 Using SARS-CoV-2 nucleoprotein antibodies to detect (re)infection

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11 Abstract

12	We assessed the validity of serum total anti-Nucleoprotein Imr	munoglobulin (N-antibodies) to

13 identify SARS-CoV-2 (re)infections by estimating persistence of N-antibody seropositivity and

14 boosting following infection. From a prospective Dutch cohort study (VASCO), we included adult

15 participants with ≥ 2 consecutive self-collected serum samples, 4-8 months apart, between May

16 2021-May 2023. Sample pairs were stratified by N-seropositivity of the first sample and by self-

17 reported infection within the sampling interval. We calculated proportions of participants with N-

18 seroconversion and fold-increase (1.5, 2, 3, 4) of N-antibody concentration over time since infection

and explored determinants. We included 67,632 sample pairs. Pairs with a seronegative first sample

20 (70%) showed 89% N-seroconversion after reported infection and 11% when no infection was

21 reported. In pairs with a seropositive first sample (30%), 82%-65% showed a 1.5- to 4-fold increase

- 22 with a reported reinfection, and 19%-10% without a reported reinfection, respectively. After one
- 23 year, 83% remained N-seropositive post-first infection and 93%-61% showed 1.5-fold to 4-fold

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- 24 increase post-reinfection. Odds for seroconversion/fold increase were higher for symptomatic
- 25 infections and Omicron infections. In the current era with limited antigen or PCR testing, N-serology
- 26 can be validly used to detect SARS-CoV-2 (re)infections at least up to a year after infection,
- 27 supporting the monitoring of COVID-19 burden and vaccine effectiveness.

28 Introduction

- 29 Monitoring SARS-CoV-2 infections in the endemic phase is important to estimate the incidence in
- 30 the population, e.g. to identify risk groups (1)or to estimate real-world vaccine effectiveness of
- 31 COVID-19 vaccines (2-4). At the start of the pandemic wide-scale community testing was available to
- 32 monitor the incidence of infections. In the Netherlands, SARS-CoV-2 community testing facilities
- have been scaled down and eventually closed in March 2023. In addition, the commitment to self-
- 34 testing declined. As wide-scale testing is no longer available, alternative methods are necessary to
- 35 keep monitoring SARS-CoV-2 infections.
- One method to detect SARS-CoV-2 infections is through detecting antibodies induced by infection 36 37 but not by vaccination. COVID-19 vaccines authorized in the Netherlands induce Spike S1-antibodies 38 following vaccination, but these are also induced by infection. Spike S1 antibodies are therefore less 39 suitable to detect SARS-CoV-2 infections in a highly vaccinated population, leaving antibodies against 40 the Nucleoprotein (N), one of the structural proteins of SARS-CoV-2, a more specific marker to 41 identify (re)infection (5). While a relative increase in antibodies can be used as a marker for 42 reinfection (6-8), it is currently unknown how long N-antibodies persist after infection and which 43 increase in N-antibodies can reliably detect reinfection.
- The aim of this study is to describe the persistence of N-antibody seropositivity and boosting after
- 45 infection, to estimate the most suitable fold increase to detect reinfection and whether there are
- 46 factors that affect the sensitivity of detecting (re)infection.

47 Methods

48 Study design and population

49	VASCO (VAccine Study COvid-19) is an ongoing 5-year prospective cohort study and has included
50	approximately 45,000 community-dwelling participants aged 18-85 years in the Netherlands (9). The
51	study started in May 2021, a few months after COVID-19 vaccines were introduced in the
52	Netherlands, and the primary objective is to assess the real-world vaccine effectiveness against
53	SARS-CoV-2 infection. Participants are asked to take a self-collected fingerprick blood sample every 6
54	months, and one month after primary vaccination, for detection of serum antibodies. In addition,
55	participants are asked to complete monthly digital questionnaires in the first year and three-monthly
56	in years 2-5, including questions on sociodemographic factors, health status, COVID-19 vaccination,
57	SARS-CoV-2 related symptoms, positive SARS-CoV-2 tests (PCR or (self-administered) rapid antigen
58	test), and willingness to test when having symptoms. Participants can also notify positive SARS-CoV-
59	2 tests or COVID-19 vaccinations in the study app at any moment. After April 2022, regular testing
60	has been scaled down in the Netherlands. Since then, participants receive self-tests free of charge
61	and are encouraged to test when having COVID-19-like symptoms.

62 Antibody measurements

63	Self-collected fingerprick blood samples were collected in 0.5 µl Minicollect tubes (Greiner, #450533)
64	and returned in a pre-printed and addressed safety-bag envelope, and centrifuged immediately
65	upon arrival. Serum is subsequently separated, aliquoted and stored at -80°C. Serum samples were
66	analyzed for total immunoglobulin (Ig) levels against N-antibodies on the Cobas e801 (Roche
67	Diagnostics, Mannheim, Germany) using batch-specific, linear calibration-lines obtained with a
68	dilution range of the NIBSC 20/136 WHO standard (NIBSC) or an internal pool of 125 N-antibody
69	positive, anonymized patient sera calibrated against the WHO standard. The cut-off for N-positivity
70	ranged from 2.05 to 3.79 BAU/mL between batches(10). The clinical sensitivity of the Roche assay is
71	99.5% (95% confidence interval: 97.0% – 100%) and the clinical specificity is 99.80 % (99.69% -
72	99.88%)(11).

73 To evaluate reproducibility, a total of 278 samples, ranging from 0.4 BAU/mL to 477 BAU/mL, were 74 measured twice using different assay batches. Concordance of seropositivity was 99% (275/278). To 75 evaluate reproducibility between assay batches, we selected all twice measured seropositive 76 samples (201/278). Proportions of samples with a 1.5-, 2-, 3- and 4-fold difference between 77 measurements were calculated for these samples. Of the 201 samples, 6 (3.0%) samples, ranging 78 from 12 BAU/mL to 107 BAU/mL, had a difference in N-antibody levels of at least 1.5-fold, and 1 79 (0.5%) of 2-fold (12 BAU/mL). There were no samples with a difference in N-antibody levels of 3-fold 80 or more between measurements. The coefficient of variation ranged between 0.01% and 20.4%. 81 Determinants 82 83 The following potential determinants were considered: age group (18-59 years vs. 60-85 years), 84 vaccination status (unvaccinated, partly vaccinated [one primary series dose + 7 days], primary series 85 [two primary series doses + 14 days, or one dose JCovden + 28 days], first booster, second booster, third booster [booster doses + 7 days]), calendar time (quarters), and log N-antibody concentration 86 87 of first sample (continuous in BAU/mL). In case of a reported infection between the first and second sample the following potential determinants were also included: COVID-19 related symptoms (yes, 88 no, unknown), severity of infection (local, systemic, other, not reported). 89 90

For each sample pair, vaccination status was determined at the sampling date of the second blood
sample, as described before (10). Calendar time was determined by the sampling date of the second
blood sample. Occurrence and type of COVID-19 symptoms were collected if participants reported a
new positive test in the study app and in monthly follow-up questionnaires after infection. Infections
were defined as systemic when at least one of the following symptoms was reported: fever, general
malaise, extreme fatigue, joint pain, muscle pain, irritability or confusion, nausea or vomiting,
diarrhea, stomach pain, pain while breathing, and shortness of breath. Infections were defined as

98 local if at least one of the following symptoms was reported without any of the systemic symptoms

99 present: cough, sore throat, runny nose, loss of smell and/or taste and headache.

100

101 Data analysis

- 102 First, N-antibody levels 200 days pre- and post-infection were explored and visualized using a
- 103 generalized additive model for first, second and third reported infections separately. Models were

104 fitted with time since infection as a base-spline with 6 knots. The most favorable number of knots

- and knot positions were determined for each subsequent infection by AIC value of the models.
- 106 Then, we included participants with at least two blood samples with an interval of 4-8 months
- 107 between May 2021 and May 2023 for which antibody assessment was available. Subsequently, the

108 data was organized and analyzed in sample pairs consisting of two consecutive samples of the same

109 participant. A participant could contribute more than one sample pair if the participant had

submitted more than two samples, i.e. the second sample of the first sample pair could serve as a

111 first sample in the second sample pair (Figure 1, panel A).

All sample pairs were stratified by N-seropositivity of the first sample. Subsequently, the sample pairs were stratified by whether an infection was reported within the sampling interval. In case an infection was reported, time since infection was calculated as the time between the infection and the second sample. In case of a reported infection, the third sample, if available, was added to the sample pair, provided that between the second and third sample no infection was reported and no increase in N-levels of >=2 fold was observed (Figure 1, panel B).

For sample pairs where the first sample was seronegative, we calculated the percentage and 95% confidence interval (CI) of N-seroconversion overall and by categories of the determinants, stratified by reported infection within the sample pair interval. To estimate the association between potential determinants and N-seroconversion we performed univariable and multivariable logistic regression using generalized estimating equation (GEE) models with exchangeable correlation structure to

123 account for dependencies within participants. Odds ratios with 95% CI and p-values were provided. 124 Variables included in the univariable and multivariable models were age group (18-59 years, 60-85 125 years), vaccination status, time period (year-quarter), and severity of infection (only for sample pairs 126 with a reported infection in the sampling interval). A sensitivity analysis was performed on 127 participants who reported to (almost) always test in case of symptoms. For sample pairs with a 128 reported infection the duration of seropositivity after infection was assessed by calculating the 129 proportion (and 95% CI) of seropositive samples over time. 130 For sample pairs where a first sample was seropositive, the percentage of sample pairs with a 1.5-, 131 2-, 3- and 4-fold was calculated overall and by categories of the determinants, stratified by reported 132 infection within the sample pair interval. The fold increase levels were chosen arbitrarily to explore 133 different relative increase measures as a marker for unreported reinfections. A univariable and 134 multivariable GEE model with exchangeable correlation structure were used to estimate the 135 association between potential determinants and n-fold increase. Odds ratios with 95% Cl and p-136 values were provided. Variables included in the univariable models were age group, vaccination 137 status, time period, concentration of first sample in the sample pair, occurrence of symptoms, and 138 severity of infection (only for sample pairs with a reported infection in the sampling interval). In the 139 multivariable models the same variables were included except occurrence of symptoms due to 140 collinearity with the variable severity of infection. A sensitivity analysis was performed on 141 participants who reported to (almost) always test in case of symptoms. For sample pairs with a 142 reported infection, the fold increase over time was assessed by calculating the percentage (and 95% 143 CI) of samples with a 1.5-, 2-, 3- and 4-fold increase relative to the first sample of the sample pair. 144 All analysis were performed using R version 4.4.1, including the tidyverse, geepack and mgcv 145 packages (12-15).

146 Ethics

- 147 The VASCO study is conducted in accordance with the principles of the Declaration of Helsinki and
- 148 the study protocol was approved by the not-for-profit independent Medical Ethics Committee of the
- 149 Stichting Beoordeling Ethiek Biomedisch Onderzoek (BEBO), Assen, the Netherlands
- 150 (NL76815.056.21). VASCO was registered in the online Dutch clinical trials register (trialregister.nl,
- registration number NL9279). Written informed consent was obtained from all participants prior to
- 152 enrollment into the study.
- 153 **Results**

154 N-antibody concentrations following reported infection

- Between May 2021 and May 2023 a total of 131,791 samples were collected from 44,407
- 156 participants. N-antibody levels 200 days before and after the first three reported infections are
- 157 plotted in Figure 2. N-antibody levels post-infection showed a high degree of variation between
- 158 participants (Figure 2). Overall, after a first reported infection N-antibody levels showed an increase
- during the first weeks after which a geometric mean concentration (GMC) of 39 BAU/mL was
- 160 observed. This was followed by a gradual decline to 30 BAU/mL 200 days post-infection. After a
- 161 second reported infection we observed a peak GMC of 162 BAU/mL, after which N-antibody levels
- declined to 91 BAU/mL 200 days post-infection. After a third reported infection N-antibody levels
- reached a peak GMC of 215 BAU/mL, which then declined to 150 BAU/mL 200 days post-infection.

164 Selection of sample pairs

- 165 In total 67,632 sample pairs of 33,283 participants were included. 8,627 participants contributed one
- sample pair, 14,963 participants two sample pairs and 9,693 three sample pairs. Figure 3 shows the
- 167 number of sample pairs by seropositivity of the first sample. An infection was reported in the
- sampling interval for 31% of sample pairs with the first sample N-seronegative and for 14% of
- sample pairs with the first sample N-seropositive.

Among sample pairs where the first sample was seronegative, the median N-antibody level of the second samples was 32.6 BAU/mL for sample pairs with a reported infection in the sampling interval and 1.3 BAU/mL for sample pairs without a reported infection. Additionally, the distribution of Nantibody levels was visually distinct between the two groups (Figure 4, panel A). Among sample pairs where the first sample was seropositive the median N-antibody level of the second samples was 237.4 BAU/mL for sample pairs with a reported infection in the sampling interval and 30.6 BAU/mL for sample pairs without a reported infection (Figure 4, panel B).

177 First infections

178 Among the sample pairs with a seronegative first sample, 14,685 infections were reported and an 179 additional 3,495 sample pairs for which no infection was reported showed seroconversion. Since the 180 specificity of the Roche antibody test for N-seropositivity is 99.5%, this indicates that 19% of first 181 infections would be missed in this study population when only considering reported infections. 182 Among participants who reported an infection with a seronegative first sample, the overall 183 seroconversion rate was 89%. The seroconversion rate varied around 90% for the different age 184 groups, and levels of vaccination status and severity of infection (Figure 5). For samples collected 185 during Q4 of 2021 and Q1 of 2022 (mostly Delta infections) the N-seroconversion rate was 186 significantly lower at 71% compared to ~90% in samples taken later (mostly Omicron infections) 187 (p<0.01). The N-seroconversion rate was significantly higher for infections with local and systemic 188 symptoms (both 90%) than for asymptomatic infections (81%, p < 0.001). In the multivariable model, 189 N-seroconversion was more likely for participants over 60 years compared to those under 60 years 190 (OR: 1.25 [1.10-1.41]), unvaccinated participants compared to vaccinated participants (e.g. 0.47 191 [0.30-0.73] for primary series), and for local infections (1.92 [1.40-2.65]) and systemic infections 192 (1.81 [1.34-2.45]) compared to asymptomatic infections (Supplementary table S1A). The odds of N-193 seroconversion increased with calendar-time (8.04 [5.41-11.93] in 2022 Q2 to 24.39 [6.65-89.45] in 194 2023 Q2, compared to 2021 Q4).

- 195 The overall N-seroconversion rate was 11% among participants with a seronegative first sample,
- 196 who did not report an infection in the sample interval. The N-seroconversion rate was significantly
- 197 higher among participants aged 18-59 years (12%) compared to 60-85 years (10%, p<0.001). The N-
- seroconversion rate was 18% for unvaccinated participants and was significantly lower for
- 199 vaccinated participants (4-16%, p<0.05). N-seroconversion rates increased significantly with
- 200 calendar-time from 1% in 2021 Q4 to 26% in 2023 Q2 (p<0.001). In the multivariable analysis only
- 201 vaccination status and calendar time remained significant factors (Supplementary table S1A).
- 202 N-seroconversion increased to 96% 8-9 weeks after a reported infection and started declining after
- 203 20-29 weeks (Figure 6). At 50-59 weeks after infection the N-seroconversion rate was still 83%.

204 Reinfections

- 205 In sample pairs where the first sample was seropositive, the median fold increase in N-antibody
- 206 levels was 7.6 (IQR: 2.3-22.9) for sample pairs with a reported infection in the sample interval (n=

207 2934) and 0.6 (IQR: 0.4 - 1.1) for sample pairs without reported infection (n = 17,512).

- 208 Among the sample pairs with a seropositive first sample, a total of 2,934 infections were reported
- and an additional 3,297 sample pairs for which no infection was reported showed a 1.5-fold
- 210 increase, 2,676 a 2-fold increase, 2,040 a 3-fold increase, and 1,723 a 4-fold increase. Using a 1.5, 2-,
- 211 3-, or 4-fold increase suggests that, respectively, 53%, 48%, 41%, 37% of infections are missed when
- 212 only using reported infections for detection.

Figure 7 shows the percentage of sample pairs with a 1.5-, 2-, 3- or 4-fold increase in N-antibody
level by determinants for sample pairs with and without a reported infection between samples.
Among sample pairs with a reported infection in the sampling interval 82% showed a 1.5-fold
increase, 77% a 2-fold increase, 71% a 3-fold increase and 65% a 4-fold increase. A fold increase was
more likely among vaccinated participants, following local and systemic infections, following
infections after the first quarter of 2022 and less likely with increasing antibody concentrations of

- the first sample of a sample pair (Supplementary tables S1B-S1E). Age group did not affect fold
- 220 increase. In the multivariable model most of these effects were sustained, but there was no
- significant association between vaccination status and fold increase.
- Among sample pairs without a reported infection in the sampling interval the proportion of sample
- pairs with a 1.5-, 2-, 3- and 4-fold increase were respectively 19%, 15%, 12% and 10%. Among these
- sample pairs a fold increase was more likely in the 18–59 year age group, in unvaccinated
- 225 participants, for infections after 2022 Q1, and less likely with increasing antibody concentrations of
- the first sample of a sample pair. These results were maintained in the multivariable model (
- 227 Supplementary tables S1B-S1E).
- 228 The percentage of sample pairs with a 1.5-fold increase rose from 57% 0-1 weeks after infection to
- 229 89% 30-39 weeks after infection (Figure 8). A similar pattern is seen for the 2-, 3- and 4-fold increase
- in N-antibody levels, but with lower proportions with a higher fold increase. The 3-fold and 4-fold
- 231 increase in N-level appeared to decline 20-29 weeks after infection.

232 Sensitivity analysis

- A sensitivity analysis on participants who report to (almost) always test in case of symptoms
- revealed slightly lower proportions (approximately 2 percent points) of participants with
- seroconversion or fold increase among those that did not report an infection, particularly in the 18-
- 236 59 year age group (Supplementary tables S2A-S2E).

237 Discussion

- 238 In this study we aimed to describe the persistence of N-antibody seropositivity after infection and to
- evaluate the sensitivity of different fold increases in order to detect reinfection(s) and whether this
- 240 differed by several potential determinants. We found that seroconversion rate to detect primary
- 241 infections (using reported positive tests as a gold standard) is 89% and using fold-increases to detect
- reinfections provided a sensitivity of 82% for 1.5-fold to 65% for 4-fold. We found that in our cohort,

by not using serology data but only reported infections, we would have missed 19% of primary
infections and 37%-53% of reinfections depending on the fold increase used. Among participants
with a reported infection, seroconversion, 1.5-fold and 2-fold increases were maintained in more
than 80% of participants, 3-fold increases in 73% of participants and 4-fold increases in 67% after 6
months. This allows detection of infections well for at least half a year after the occurrence of
infection, making the method suitable for sampling intervals such as in the VASCO study (a 6 month
interval).

250 We observed several determinants that affected seroconversion/fold increase. First, we observed 251 that seroconversion/fold increase was more likely among participants with symptomatic infections. 252 Higher antibody responses can be expected with more severe infections, resulting in a higher chance 253 of seroconversion or a fold increase. Since widescale testing has discontinued it is likely that 254 participants only test when being symptomatic. This is supported by our observation that the 255 proportion with a fold increase among those without a test increases over time. Furthermore, our sensitivity analysis among participants who (almost) always test when having symptoms showed 256 257 marginal differences in proportions for samples pairs without reported infections, suggesting that 258 unreported infections are indeed mostly asymptomatic. Second, higher seroconversion rates were 259 seen among unvaccinated compared to vaccinated participants. After (multiple) doses, vaccinated 260 individuals usually have higher levels of antibodies against the Spike protein (16). As a consequence, 261 infections may be cleared earlier before substantial levels of N-antibodies are induced, resulting in 262 less fold increase and a lower rate of seroconversion in vaccinated participants and lower sensitivity 263 of the assay, similar to what was shown by Bazin et al (17). Furthermore, due to absence of 264 protective antibodies unvaccinated participants may experience more severe infections and 265 therefore induce higher antibody concentrations, resulting in higher seroconversion rates (5, 18). 266 Fold increase rates were not significantly different between vaccinated and unvaccinated 267 participants, suggesting that vaccination status does not affect detection of reinfections. Third, 268 among sample pairs without reported infections, a fold increase was more likely among the younger

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269 age group (18-59 years). Participants in the younger age group are expected to experience less 270 symptoms when infected and are less likely to test when having symptoms. This is supported by our 271 findings in the sensitivity analysis among participants who (almost) always test when having 272 symptoms, where the age effect was no longer present. In contrast, seroconversion among sample 273 pairs with a reported test was more likely among the older age group. The older age group possibly 274 experienced more severe first infections compared with the younger age group, which may have led 275 to enhanced antibody induction in the older age group. While we adjust for symptoms after 276 infections, we may not be able to fully adjust for severity as categorization is only based on type of symptom (local vs systemic) and does not include a measure for seriousness of the symptoms. 277 278 Fourth, we observed lower rates of seroconversion or fold increase among those with and without a 279 reported infection during the Delta prevalent period. The Omicron variant has deviated more from 280 the vaccine strain than the Delta variant. This may in turn result in a less adequate immune response among vaccinated participants during an Omicron infection than during a Delta infection due to 281 282 immune escape. This in turn might result in more severe symptoms and thus higher rates of 283 seroconversion following Omicron infections. Finally, we observed that a fold increase is less likely 284 when the N-antibody levels in the first sample were already high. Recent research has shown that 285 higher serum N-antibody levels are associated with higher mucosal immunity, thus reducing the risk 286 of reinfection (19). However, in addition to observed boosting of N-antibody levels following each 287 additional infection (at least up to three infections), we also observed a ceiling effect. The higher the 288 N-antibody levels in the first sample, the lower the chance that a fold increase will be found as high 289 levels cannot always accurately be measured due to saturation of the assay. This limits the possibility 290 to use the fold increase as a proxy for reinfection when multiple infections occur in a relatively short 291 period of time. Overall, using serology in addition to reported positive tests in population-based 292 studies will help identify more infections, specifically in unvaccinated participants and younger age 293 groups.

294 A 4-fold increase in antibody concentrations is considered a gold standard for various pathogens, but 295 has been posed as too strict for population studies and resulting in under detection of reinfections 296 (6, 7). Traditionally, a 2-fold increase was considered to carry a risk of measurement error causing 297 false-positives (6). False-positives may be caused by differences in sample concentrations by other 298 factors than infection such as variation of sample distribution and storage conditions, or variations in 299 lab measurement. This may cause small variations in concentrations that may be picked up as a fold 300 increase (e.g. a difference of 1.5 BAU/mL between a sample with 3 BAU/mL and 4.5 BAU/mL is a 1.5-301 fold increase, but not necessarily due to an infection). We found 3% false-positives when using a 1.5-302 fold increase and 0.5% false-positives when using a 2-fold increase in samples measured in duplicate. 303 The extend of other sources of false-positives, such as conditions during transport of samples, could 304 not be measured in the current study. Where false-positives might not be wanted in a clinical 305 setting, in the context of cohort studies such as the VASCO study, a small proportion of false-306 positives may be more acceptable. For example, if one would like to exclude participants with a 307 recent infection, this would result in the inappropriate exclusion of only a small group, but 308 simultaneously identify a large number of true positives. 309 Not all infections can be identified using seroconversion or fold increases. One factor that affects the 310 possibility of detection is the time of sampling in relation to the moment of infection. N-antibody 311 levels are still increasing during the first 4-6 weeks after infection and then decrease over time. For 312 example, if the infection occurred just before the second sample, an infection could be missed. For 313 reinfections, if the first sample is shortly after a prior infection or the second sample is too long after 314 the reinfection, a fold increase may not be observed. We showed that fold increases remained high 315 for at least half a year, making the fold increase method suitable for serial sampling with an interval 316 of 6 months and possibly longer. Other approaches have been suggested, for example to only look at 317 fold increases after a downward trend in antibodies has been observed (20). However, this approach 318 requires sampling with smaller intervals as one would need to identify the downward trend before 319 the reinfection occurs.

320 **Recommendation**

321 When choosing the most suitable fold increase to detect reinfections a trade-off needs to be made 322 between having more false positives with a lower fold increase or having less true positives with a 323 higher fold increase. In our study we gained 82% true positives and 3% false positives when using a 324 1.5-fold increase, whereas we gained 77% true positives and 0.5% false positives when using a 2-fold 325 increase, thus decreasing the proportion of false positives to near-zero. Using a 3-fold increase the 326 proportion of true positives decreased to 71% whereas only a marginal reduction in false positives 327 was found compared to using a 2-fold increase (0%). Furthermore, due to increasing antibody levels 328 and the assay limit of detection, a higher fold increase is hard to maintain over time as larger fold 329 increases become less practical to measure for commercial kits. At this time a 2-fold increase 330 therefore appears most favorable. In the end, the most favorable fold increase may depend on the 331 research question.

332 Strengths and limitations

333 VASCO has a large study population with blood sampling at a regular interval allowing us to identify (re)infections in addition to reported infections based on (self-)testing. However, the interval of 6 334 335 months makes it more difficult to study trends (e.g. downward trends) within individuals. It should 336 be noted that the duration of N-seropositivity, but also the sensitivity and specificity is dependent on 337 the assay used (21, 22). When using an assay with lower sensitivity over time, this may limit the 338 applicability of seroconversion or a fold increase as a proxy for (re)infection. Our findings should 339 therefore be read in the context of the Roche assay measuring total Ig. In addition, the Roche assay 340 has a high specificity (99.5%), making it suitable for this application. Finally, our method assumes 341 that sample collection is complete, samples are collected between 4-8 months, and all have a 342 measurable result. In reality, this is not always the case, which leads to less detection of infections 343 than presented here.

344 Conclusion

- 345 Seroconversion and fold-increase are suitable methods to detect (re)infections in population based
- 346 prospective research at least up to a year after infection. Which fold increase to use requires a trade-
- off to include either more false positives or less true positives and this may depend on the research
- 348 question. Overall, using a 2-fold increase resulted in the detection of a large proportion of additional
- 349 infections in our data, with only a small share of false-positives.
- 350 Funding source
- 351 This study is funded by the Dutch ministry of Health, Welfare and Sport.

352 Ethical approval

- 353 Medical Ethics Committee of the Stichting Beoordeling Ethiek Biomedisch Onderzoek, Assen, the
- 354 Netherlands, gave ethical approval for this work.
- 355 Data availability
- 356 Anonymized data reported from this study can be obtained from the corresponding author upon
- 357 request. The dataset may include individual data and a data dictionary will be provided. Data
- 358 requests should include a proposal for the planned analyses. Data transfer will require a signed data
- 359 sharing agreement.
- 360 Competing interests
- 361 The authors declare none.
- 362

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- 429 Commercially Available High-Throughput SARS-CoV-2 Serologic Assays for Serosurveillance and
- 430 Related Applications. Emerging infectious diseases. 2022;28(3):672-83.
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- 433 Figure 1. Organization of sample pairs. A) Subsequent samples (S) form a sample pair (SP). A second sample may serve as a
- 434 first sample in the next sample pair of the same individual (e.g. sample 2 is considered a second sample in sample pair 1,
- 435 but a first sample in sample pair 2). B) In case of an infection (star symbol) between a first and second sample of a sample
- 436 pair, a third sample may be added to evaluate a longer time interval since infection (sample triple (ST)). A third sample can
- 437 only be added to the sample pair if there is no infection between the second and third sample. Fourth samples were not
- 438 included due to limited numbers. S3 may therefore form an ST sample pair with S1 in the upper figure, and a sample pair
- with S2 in panel A.



440

Figure 2. Generalized additive model showing N-antibody geometric mean concentration (GMC) over time before and after
a first (A, n = 46,090 samples), second (B, n = 9,607 samples) and third (C, n = 719 samples) reported infection. Black lines
represent N-antibody GMC and 95% confidence interval, blue scatter represents all individual samples used in the model,
dotted vertical lines represent the moment of infection; red area corresponds with the cut-off range for seropositivity for
different assay batches.



- 449 Figure 3. Flowchart of included sample pairs. Sample pairs are grouped based on seropositivity of the first sample of a
- 450 sample pair and a reported infection in the sampling interval.

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453 Figure 4. Histogram of N-antibody levels of the second sample of sample pairs. A) sample pairs with the first sample

454 seronegative (n=47,186) stratified by reported infection in the sampling interval, B) sample pairs with the first sample

455 seropositive (n=20,446) stratified by reported infection in the sampling interval. Bars are plotted with overlap.



- 458 Figure 5. N-seroconversion of sample pairs with (left) and without (right) reported infection. When there were less than
- 459 10 datapoints for a determinant, data is not shown in the figure. Calendar time was determined by the sampling date of

460 the second blood sample.



- 463 Figure 6. N-seroconversion in sample pairs with or without third sample, with a reported infection only between 1st and
- 464 **2nd sample, by time since infection.** Third samples were only included if there was no reported infection between the
- 465 second and third sample and absence of a 2-fold increase. The error bars represent the 95% confidence interval around the
- 466 percentage. When there were less than 10 datapoints for a period, data was excluded from the figure.
- 467 *time since infection equals time between infection and third sample.





 \rightarrow % N-seroconversion at third sample (n = 5056)*

468

470 Figure 7. Percentage of sample pairs with 1.5-, 2-, 3- or 4-fold increase by determinant, stratified by reported infection

471 in-between samples. When there were less than 10 datapoints for a determinant, data was excluded from the figure. Fold

472 increase is presented by the saturation of the bars with the lightest bars representing samples with a 1.5-fold increase and

- 473 the darker bars samples with a 4-fold increase. Calendar time was determined by the sampling date of the second blood
- 474 sample.



- 476 Figure 8. Percentage of 1.5-, 2-, 3- or 4-fold increase in sample pairs with or without third sample, with a reported
- 477 infection only between 1st and 2nd sample. Third samples were only included if there was no reported infection between
- 478 the second and third sample and absence of a 2-fold increase. The error bars represent the 95% confidence interval around
- 479 the percentage. When there were less than 10 datapoints for a period, data was excluded from the figure.
- 480 *time since infection equals time between infection and third sample.



← % n-fold increase at second sample

% n-fold increase at third sample

