

Virological and serological kinetics of SARS-CoV-2 Delta variant vaccine-breakthrough infections: a multi-center cohort study

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20 **Running title:** Delta VOC: Viral Kinetics for Vaccinated

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24 **Keywords:** COVID-19; SARS-CoV-2; breakthrough infection; delta; variants of concern; vaccine

25 breakthrough; vaccination

26 Objectives

27 Highly effective vaccines against severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) have
28 been developed but variants of concerns (VOCs) with mutations in the spike protein are worrisome,
29 especially B.1.617.2 (Delta) which has rapidly spread across the world. We aim to study if vaccination
30 alters virological and serological kinetics in breakthrough infections.

31 Methods

32 We conducted a multi-centre retrospective cohort study of patients in Singapore who had received a
33 licensed mRNA vaccine and been admitted to hospital with B.1.617.2 SARS-CoV-2 infection. We
34 compared the clinical features, virological and serological kinetics (anti-nucleocapsid, anti-spike and
35 surrogate virus neutralization titres) between fully vaccinated and unvaccinated individuals.

36 Results

37 Of 218 individuals with B.1.617.2 infection, 84 had received a mRNA vaccine of which 71 were fully
38 vaccinated, 130 were unvaccinated and 4 received a non-mRNA. Despite significantly older age in
39 the vaccine breakthrough group, the odds of severe COVID-19 requiring oxygen supplementation
40 was significantly lower following vaccination (adjusted odds ratio 0.07 95%CI: 0.015-0.335, $p=0.001$).
41 PCR cycle threshold (Ct) values were similar between both vaccinated and unvaccinated groups at
42 diagnosis, but viral loads decreased faster in vaccinated individuals. Early, robust boosting of anti-
43 spike protein antibodies was observed in vaccinated patients, however, these titers were
44 significantly lower against B.1.617.2 as compared with the wildtype vaccine strain.

45 Conclusion

46 The mRNA vaccines are highly effective at preventing symptomatic and severe COVID-19 associated
47 with B.1.617.2 infection. Vaccination is associated with faster decline in viral RNA load and a robust
48 serological response. Vaccination remains a key strategy for control of COVID-19 pandemic.

49

50 Background

51 Availability of effective vaccines against severe acute respiratory syndrome coronavirus 2 (SARS-CoV-
52 2) within one year of the first report of coronavirus disease 2019 (COVID-19) is remarkable. Phase 3
53 clinical trials of messenger RNA (mRNA) vaccines have demonstrated 92-95% efficacy in preventing
54 symptomatic infection and severe disease [1-4] and intensive vaccination programs have reduced
55 infection and mortality rates in multiple settings [5-7].

56 Emerging variants of concern (VOCs), such as B.1.1.7 (Alpha in the World Health Organization
57 classification), B.1.351 (Beta), P.1 (Gamma), and B.1.617.2 (Delta) exhibit varied sequence changes
58 and alteration of amino acid sequences of the spike protein. This has led to concerns of viral immune
59 evasion and decreased vaccine effectiveness. Furthermore, these VOCs have been shown to be more
60 transmissible [8-10], and B.1.1.7 and B.1.617.2 has been associated with increased disease severity
61 and hospitalization [11, 12]. B.1.617.2 has rapidly spread outside India, becoming the most
62 frequently sequenced lineage worldwide by end of June 2021 [13]. Case series of vaccine-
63 breakthrough infections have reported an over-representation by these VOCs [14, 15].

64 Understanding vaccine effectiveness in the context of VOCs requires granular data: which vaccines
65 were administered, at what time point prior to infection, number of doses, and particularly which
66 VOC has caused the infection. Important VOC-specific vaccination outcomes include severity of
67 infection and vaccine effects on transmission.

68 The COVID-19 vaccination program was initiated in Singapore on 30 December 2020, with free
69 vaccinations provided to all Singapore residents in phases, beginning with the elderly and those in
70 high-risk occupations such as healthcare workers. Vaccines used are mRNA vaccines,
71 Pfizer/BioNTech BNT162b2 and Moderna mRNA-1273. As of 19 July 2021, 6,837,200 vaccine doses
72 had been administered and ~2,792,430 individuals (47% of the total population) had completed the
73 vaccination course [16]. In May 2021, B.1.617.2 became the dominant circulating variant based on
74 local sequencing data.

In this multi-center cohort study, we characterize the clinical features, virological and serological kinetics of patients with vaccine-breakthrough PCR-confirmed B.1.617.2 infection and compared them with unvaccinated patients.

Methods

Patient Recruitment

Adults aged ≥ 18 years with COVID-19 confirmed by positive SARS-CoV-2 PCR and admitted to any of the five study sites from 1 April to 14 June 2021 were screened. Patients with B.1.617.2 infection (identification methods delineated below) were included in this analysis. Vaccine-breakthrough infection was defined as PCR-confirmed COVID-19 with symptom onset or first positive PCR (whichever was earlier) ≥ 14 days following a second dose of BNT162b2 or mRNA-1273 vaccine. Incomplete vaccination was defined as receipt of one dose of these vaccines ≥ 14 days prior to symptom onset or first positive PCR. Patients who received non-mRNA vaccines or developed infection within 14 days after the first dose were excluded from this analysis. B.1.617.2 vaccine-breakthrough infections were compared with a retrospective cohort of unvaccinated patients with B.1.617.2 infection admitted to one study site.

Data Collection

Clinical and laboratory data were collected from electronic medical records using a standardized data-collection form [17]. Laboratory data including cycle threshold (Ct) values from SARS-CoV-2 RT-PCR assays and serological results from Elecsys® (Roche, Basel, Switzerland) Anti-SARS-CoV-2 chemiluminescent immunoassays [anti-nucleocapsid (anti-N) and anti-spike protein (anti-S)] and surrogate virologic neutralization test (sVNT) cPass™ (Genscript, NJ, USA) were recorded. cPass™ detects total neutralizing antibodies targeting the viral spike protein receptor-binding domain [18]. These tests were performed as part of routine clinical care.

Additional Serologic testing

99 Serum samples from a subset of vaccine-breakthrough patients who had separately consented for
100 specimen collection were additionally tested with a newly developed multiplex-sVNT assay using the
101 Luminex platform. Further details can be found in the supplementary information.

102 **Viral RNA sequencing and VOC determination**

103 SARS-CoV-2 PCR was performed using various commercially available assays in different clinical
104 laboratories. As part of active genomic surveillance, whole genome sequencing (WGS) by National
105 Public Health Laboratory is performed for all patients in Singapore with SARS-CoV-2 detected by RT-
106 PCR with a Ct value less than 30. Pangolin COVID-19 Lineage Assigner and CoVsurver were used to
107 assign lineage to each sequence. For individuals with PCR confirmed infection without available
108 sequencing results, lineage was inferred based on epidemiological investigations by the Singapore
109 Ministry of Health (MOH), and likely B.1.617.2 infections were included (i.e., clear epidemiologic link
110 with patients with sequencing confirmed B.1.617.2 infection).

111 **Clinical Management**

112 All individuals with confirmed COVID-19 (including asymptomatic cases) in Singapore are admitted to
113 hospital for inpatient evaluation and isolation. Individuals with pneumonia requiring supplemental
114 oxygen are treated with intravenous remdesivir, while dexamethasone and other agents were
115 reserved for progressive infections per national guidelines [19]. Disease severity was stratified into
116 asymptomatic, mild (no pneumonia on chest radiography), moderate (presence of pneumonia on
117 chest radiography), severe (requiring supplemental oxygen), or critical (requiring intensive care unit
118 [ICU] admission or mechanical ventilation). Collection of clinical data was censored on discharge
119 from hospital.

120 **Statistical Analysis**

121 For descriptive analysis, data were presented as median (interquartile range (IQR)) for continuous
122 parameters and frequency (percentage) for categorical variables. Chi-square and Fisher's exact tests

were used to compared categorical variables, while for continuous variables, t-test was used for normal data and Mann-Whitney U test for non-normal data. For asymptomatic patients, the day of confirmatory COVID-19 diagnosis was denoted as day one of illness. For symptomatic patients, the day of symptom onset or the day of confirmatory COVID-19 diagnosis, whichever earlier, was denoted as day one of illness.

Previously reported risk factors for disease severity [20] were evaluated and included in a multivariate logistic regression model [21]. For serial Ct values, we fitted a generalized additive mixed model (GAMM) with a random intercept by patient. To investigate the effect of vaccination status on rate of increase of Ct value, we included fixed factors of vaccination status and day of illness with smoothing terms and interaction between these two fixed factors. We plotted Ct values with marginal effect of day of illness by vaccination status and 95% confidence intervals (CI) from the GAMM.

For analysis of cPass™ and anti-S titres we fitted a GAMM to serial titres with random intercept by patient in addition to fixed factor of day of illness with smoothing terms, separately for vaccine-breakthrough and unvaccinated patients infected with Delta variant. We plotted cPass™/anti-S titres with marginal effect of day of illness and 95%CI from GAMM for each group of vaccine-breakthrough and unvaccinated patients.

P-values less than 0.05 were considered statistically significant, and all tests were 2-tailed. Data analyses were performed using Stata Release 15 (StataCorp, College Station, TX) and R version 3.6.2 (R Foundation for Statistical Computing, Vienna, Austria).

Ethical approval

Written informed consent was obtained from study participants of the multi-centre study approved by National Healthcare Group Domain Specific Review Board (NHG-DSRB) (Study Reference

2012/00917). Informed consent for retrospective data collection at National Centre for Infectious Diseases (NCID) was waived (NHG-DSRB reference number 2020/01122).

Results

218 B.1.617.2 infections were identified across the five study sites (Supplementary Figure S1). Of these, 71 met the definition for vaccine-breakthrough. An additional 13 only received one dose ≥ 14 days prior to disease onset or received both doses but within 14 days of disease onset, while four had received a non-mRNA vaccine overseas. Majority of participants meeting study definition for vaccine-breakthrough had received two doses of BNT162b2 (n=66, 93%).

Clinical Features

In line with Singapore's national vaccination strategy wherein older adults were prioritized for vaccination, our vaccine-breakthrough cohort was of significantly older age; median age of 56 years (IQR:39-64) versus 39.5 (IQR:30-58) ($p < 0.001$) (Table 1). Other baseline demographics were similar.

Vaccine-breakthrough patients were significantly more likely to be asymptomatic (28.2% versus 9.2%, $p < 0.001$); and if symptomatic, had fewer number of symptoms (Table 1). Unvaccinated individuals had worse levels of known biomarkers associated with increased COVID-19 severity including lymphocyte count, C-reactive protein [CRP], lactate dehydrogenase [LDH] and alanine transferase [ALT]. Correspondingly, a higher proportion of the unvaccinated cohort had pneumonia, required supplementary oxygen and ICU admission compared with the vaccinated cohort. A broader analysis comparing unvaccinated versus those who had received at least one dose of vaccine (i.e. both vaccine-breakthrough and incomplete vaccination) demonstrated similar findings (Supplementary Table T1).

Multivariate logistic regression analysis for development of severe COVID-19 (defined by supplementary oxygen requirement) demonstrated that vaccination was protective with an adjusted odds ratio (aOR) of 0.073 (95% confidence interval [CI]:0.016-0.343) ($p = 0.001$) (Table 2). Analysis

170 comparing unvaccinated versus those who had received at least one dose of vaccine demonstrated
171 similar findings (Supplementary Table T2). Multivariate logistic regression analysis for development
172 of moderately severe COVID-19 (defined by development of pneumonia) also demonstrated that
173 vaccination was protective with aOR of 0.069 (95%CI:0.027-0.180) ($p<0.001$) (Supplementary Table
174 T3).

175 **Virologic kinetics**

176 Serial Ct values of individuals were analyzed as a surrogate marker for the viral load. The initial
177 median initial Ct value did not differ between unvaccinated and fully vaccinated patients
178 (unvaccinated median Ct 18.8 (14.9-22.7), vaccinated 19.2 (15.2-22.2), $p=0.929$). However, fully
179 vaccinated patients had a faster rate of increase in Ct value over time compared with unvaccinated
180 individuals, suggesting faster viral load decline (coefficient estimates for interaction terms ranged
181 from 9.12 (standard error 3.75) to 12.06 (standard error 3.03); p -value <0.05 for each interaction
182 terms) (Figure 1).

183 **Serologic data**

184 69 fully vaccinated individuals and 45 unvaccinated had serologic data available on record. 66/66
185 (100%) of vaccinated individuals had detectable S antibodies in week 1 of illness, while 7/45 (16%) of
186 unvaccinated individuals did (Supplementary Figure S2). There was no difference in the proportion
187 of individuals who seroconverted with the anti-N assay in week 1 (vaccinated 7/68 (10%) vs
188 unvaccinated 11/107 (10%)) or week 2 (vaccinated 2/11 (18%), unvaccinated 4/20 (20%).

189 Analysis of sVNT with cPass indicated very high inhibition among vaccinated individuals in week 1 of
190 illness (median 98.3% (IQR:91.0-99.4%)) which increased to 99.6% (IQR 99.3-99.9%) in week 2
191 (Figure 2A, 2B). Among unvaccinated individuals, median inhibition was below the 20% threshold at
192 both week 1 and week 2. Among the 37 vaccinated individuals with a serum sample available for

testing by the multiplex sVNT assay, titres were significantly higher against wildtype virus compared with B.1.617.2 and other VOCs (Figure 3). sVNT titres were lowest against B.1.617.2 and P.1 VOCs.

Discussion

In this study, we found that fully vaccinated patients had significantly lower odds of moderate or severe outcomes following infection by the SARS-CoV-2 VOC B.1.617.2. Vaccination was associated with lower peak measures of systemic inflammation, fewer symptoms, including more asymptomatic infection, and better clinical outcomes. Notably, in contrast to existing studies that showed lower viral load in vaccinated patients [22], initial viral load indicated by PCR Ct values was similar between vaccinated and unvaccinated patients with B.1.617.2. However, vaccinated patients appeared to clear viral load at a faster rate. Our serologic data suggest an early rapid rise in neutralizing and binding antibodies indicated by C-Pass and Roche anti-S antibodies, which may be evidence of memory immunity to COVID-19 vaccination on challenge with a breakthrough infection with B.1.617.2.

As part of active case finding and surveillance in Singapore, all patients with fever or respiratory symptoms, close contacts of confirmed cases, and newly arrived travelers are screened for COVID-19 using PCR. Additionally, high-risk individuals in frontline occupations or congregate settings are tested as part of routine surveillance. All confirmed COVID-19 cases are reported to MOH and admitted to a hospital for initial evaluation. As such, our hospitalized cohort uniquely captures the entire spectrum of disease severity of COVID-19 infection and provides granular data even for mild and asymptomatic vaccine-breakthrough infections, giving us the opportunity to analyze virologic and serologic kinetics of these patients.

The finding of diminished severity with B.1.617.2 infection in vaccinated individuals is reassuring and corroborates emerging data from the United Kingdom which have found that mRNA vaccination remains protective against symptomatic and severe disease[12, 23]. An observational cohort study conducted in Scotland suggested that ≥ 14 days after the second dose, BNT162b2 vaccine offered

218 92% vaccine effectiveness against presumptive non-B.1.617.2 infection and 79% protection against
 219 presumptive B.1.617.2 [24]. Protection associated with the ChAdOx1 nCoV-19 vaccine was 73% and
 220 60% respectively. Although vaccine-breakthrough infections are increasingly reported, with the
 221 largest series to date in the United States reporting 10,262 breakthrough infections, a majority of
 222 these were mild (27% asymptomatic, 10% hospitalization, 2% mortality)[25]. Vaccine-breakthrough
 223 infections will continue to be observed, especially with genetic drift and selection pressures resulting
 224 in emergence of newer VOCs; however, it is likely that there will be a shift toward milder disease
 225 spectrum with more widespread implementation of vaccination programs.

226 To our knowledge, we provide the first data characterizing impact of vaccination on virologic kinetics
 227 by the B.1.617.2 variant. While initial Ct values were similar; the effect of vaccination with a more
 228 rapid decline in viral load (and hence shorter duration of viral shedding) has implications on
 229 transmissibility and infection control policy. A shorter duration of infectivity may allow a shorter
 230 duration of isolation for vaccinated individuals. Based on our data, it seems likely that vaccination
 231 reduces secondary transmission, though this needs to be further studied in larger community
 232 surveillance studies. Other studies found similar impact of vaccination on other variants. Pritchard
 233 and colleagues found that vaccinated individuals had higher Ct values compared with unvaccinated
 234 individuals in B.1.1.7 infections [7], while Levine-Tiefenbaum and colleagues similarly found a
 235 reduction in viral loads after BNT162b2 vaccine, though no data was provided on variant type [26].

236 There are several limitations to our study. Firstly, we only compared vaccine-breakthrough infections
 237 with unvaccinated COVID-19 patients. We did not study vaccinated individuals who had similar
 238 exposure risk but did not develop COVID-19 infection. We thus could not evaluate vaccine efficacy
 239 against asymptomatic infection. We also did not have detailed epidemiologic data to study the effect
 240 of vaccination on preventing secondary transmission.

241 Secondly, we could only obtain serologic tests after infection since patients were recruited after
 242 confirmation of infection. While active contact tracing and case finding in Singapore resulted in early

243 identification of most COVID-19 cases, the first available serologic result was at a median of 2 (IQR:1-
244 3) days of illness and antibody levels are likely to already have been boosted by natural infection. We
245 thus could not evaluate the underlying immunologic mechanisms behind vaccine-breakthrough
246 infection, e.g., diminished neutralizing antibody level or impaired cellular immunity. Further study
247 should compare similarly exposed vaccinated individuals who develop breakthrough infection with
248 those who do not, to elucidate the underlying drivers of susceptibility, which may enlighten us on
249 how to optimize protection (e.g., through enhanced/boosted dosing schedules).

250 Thirdly, PCR testing was not standardized in a centralized laboratory, and instead conducted at each
251 centre using different validated commercial assays. Ct values are only a surrogate measure of viral
252 load and shedding. We did not evaluate viability of shed virus via viral culture. In addition, we only
253 evaluated participants with mRNA vaccination, and thus our findings are restricted to mRNA
254 vaccines and not all COVID-19 vaccines.

255 **Conclusion**

256 mRNA vaccines against COVID-19 are protective against symptomatic infection and severe disease
257 by the B.1.617.2 variant. Vaccinated individuals had a more rapid decline in viral load, which has
258 implications on secondary transmission and public health policy. Rapid and widespread
259 implementation of vaccination programs remains a key strategy for control of COVID-19 pandemic.
260 Further studies should elucidate immunologic features driving vaccine-breakthrough infection to
261 improve vaccine-induced protection.

262 **Conflict of Interest Disclosures**

263 BEY reports personal fees from Roche and Sanofi, outside the submitted work. All other authors
264 declare no competing interests.

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274 management, analysis and interpretation of the data; preparation, review or approval of the
275 manuscript; and decision to submit the manuscript for publication.

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	Unvaccinated n = 130	Vaccinated n = 71	p-value
Median age (IQR), years	39.5 (30-58)	56 (39-64)	<0.001
Male (%)	67 (51.5)	27 (38)	0.067
Median Charlson Comorbidity Index (IQR)	0 (0-1)	0 (0-0)	0.125
Diabetes mellitus (%)	28 (21.5)	5 (7.0)	0.008
Hypertension (%)	28 (21.5)	14 (19.7)	0.762
Hyperlipidaemia (%)	32 (24.6)	18 (25.4)	0.908
Median Ct value on diagnosis (IQR)*	18.8 (14.9-22.7)	19.2 (15.2-22.2)	0.929
Asymptomatic	12 (9.2)	20 (28.2)	<0.001
Symptom onset after Diagnosis (%)	11 (9.3)	11 (21.6)	0.030
Median day of illness symptoms start (IQR)	2 (2-3)	3 (2-3)	0.715
Median Ct values for Symptom Onset After (IQR)	21.87 (18.8-31.2)	19.2 (16.6-21.5)	0.279
Median Sum of Symptoms Reported (IQR)	2 (1-3)	1 (0-2)	<0.001
Fever (%)	96 (73.9)	29 (40.9)	<0.001
Cough (%)	79 (60.8)	27 (38)	0.002
Shortness of Breath (%)	17 (13.1)	1 (1.4)	0.004
Runny Nose (%)	31 (23.9)	27 (38)	0.034
Sore Throat (%)	43 (33.1)	18 (25.4)	0.255
Diarrhoea (%)	8 (6.2)	0	0.052
Median highest Neutrophil (IQR) × 10 ⁹ /L	4.50 (3.07-5.92)	4.33 (3.52-5.43)	0.117
Median lowest Lymphocyte (IQR) × 10 ⁹ /L	0.95 (0.65-1.50)	1.36 (1.02-1.87)	<0.001
Median highest C-Reactive Protein (IQR), mg/L	24.7 (6.9-84.8)	12.6 (6.5-22.5)	<0.001
Median highest Lactate Dehydrogenase (IQR), U/L	486 (365-672)	373 (314-421)	0.062
Median highest Alanine Transferase (IQR), U/L	35	19	<0.001

	(18-74)	(13-34)	
Disease Outcome			
Pneumonia (%)	69 (53.1)	9 (21.7)	<0.001
Supplementary O2 required (%)	27 (20.8)	2 (2.8)	<0.001
ICU admission required (%)	7 (5.4)	0	0.053
Median days of ICU admission required (IQR)	4 (3-9)	-	-
Intubation (%)	2 (1.5)	0	0.541
Median days of Intubation (IQR)	7 (3-11)	-	-
COVID-19 specific treatment (%)	39 (30)	5 (7)	<0.001
Mortality	2 (1.54)	0	0.541

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290 Table 1: Baseline characteristics and disease outcome between unvaccinated and completed mRNA

291 vaccination COVID-19 B1.617.2 infected patients

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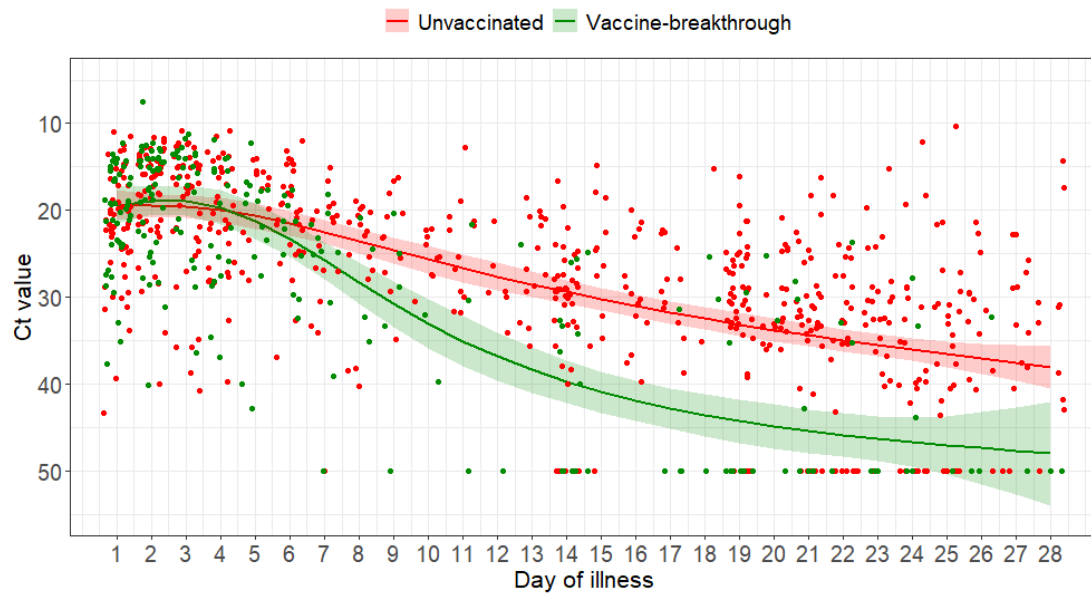
	Univariable model		Multivariable model	
	Crude OR (95% CI)	p-value	Adjusted OR (95% CI)	p-value
Vaccinated	0.111 (0.025-0.480)	0.003	0.073 (0.016-0.343)	0.001
Age group				
<45 years old	1	-	1	-
45-64 years old	6.19 (1.90-20.2)	0.003	8.29 (2.29-30.0)	0.001
>64 years old	13 (3.90-42.9)	<0.001	13.5 (2.66-68.8)	0.002
Male	0.913 (0.414-2.01)	0.821	1.09 (0.418-2.85)	0.857
Diabetes	6.18 (2.59-14.7)	<0.001	2.24 (0.785-6.41)	0.132
Hypertension	4.8 (2.09-11.0)	<0.001	1.62 (0.509-5.18)	0.413
Presence of other comorbidities, if any	3.96 (1.66-9.44)	0.002	0.897 (0.262-3.07)	0.862

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294 **Table 2:** Odds ratio of candidate risk factors for development of severe COVID-19 for completed
295 mRNA vaccination COVID-19 B.1.617.2 infected patients. CI, confidence interval; OR, odds ratio

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299 **Figure 1:** Scatterplot of Ct values and marginal effect of day of illness of COVID-19 B.1.617.2 infected
300 patients with 95% confidence intervals from generalized additive mixed model with interaction term
301 between vaccination status and day of illness

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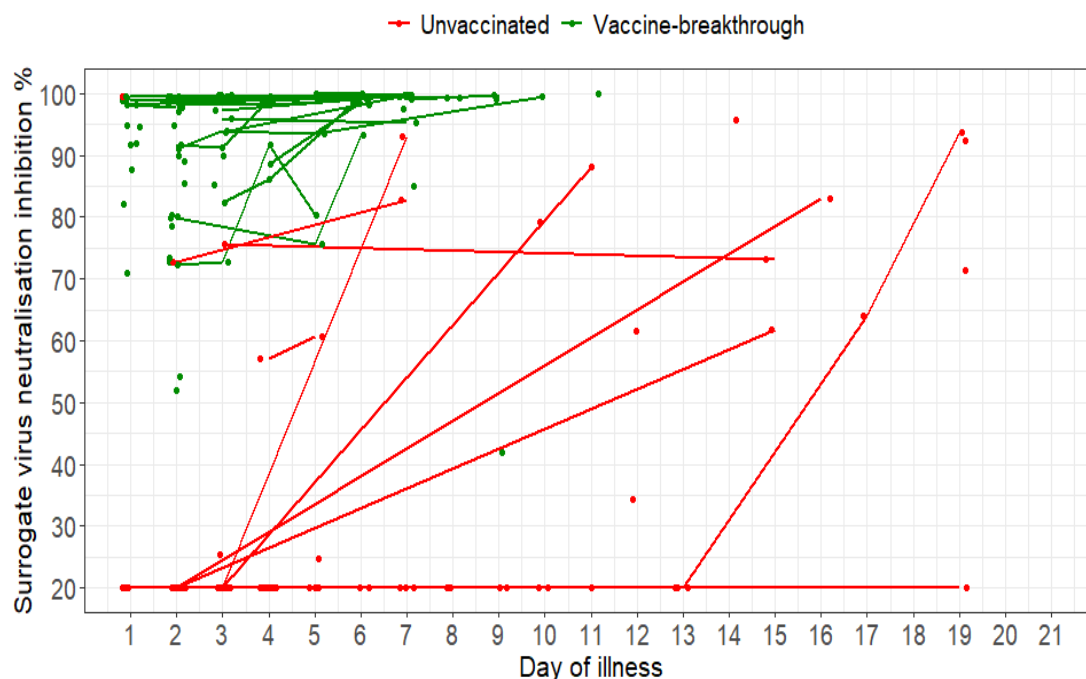
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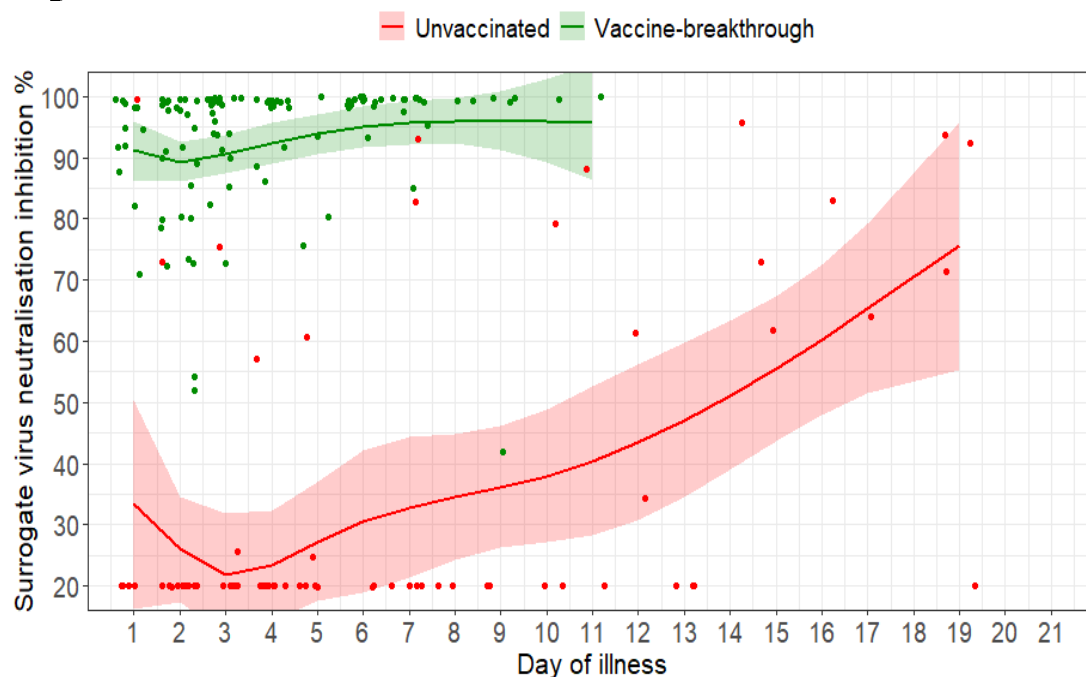
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A



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B



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310 **Figure 2:** (A) Spaghetti plot of surrogate virus neutralisation (sVNT) inhibition % as measured by
 311 cPass; (B) Scatterplot of sVNT inhibition % and marginal effect of day of illness by vaccine-
 312 breakthrough and unvaccinated groups of COVID-19 B.1.617.2 infected patients with 95% confidence

intervals from generalized additive mixed models. For both plots, n=127; vaccine-breakthrough = 67,
unvaccinated = 60

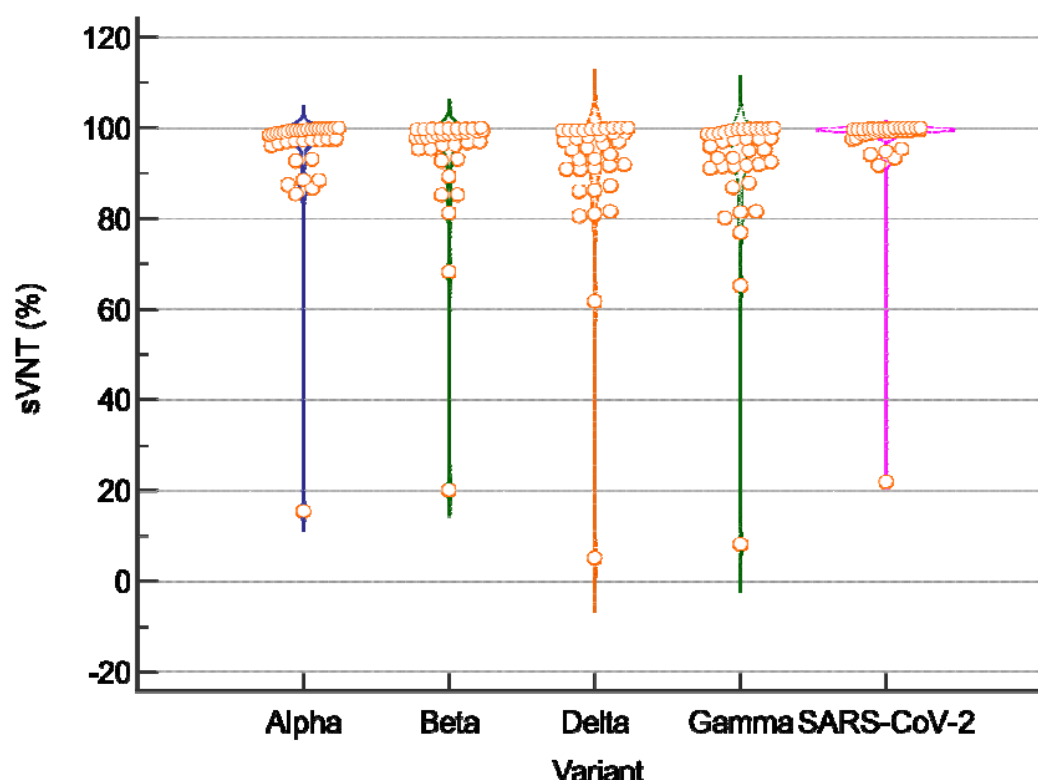


Figure 3: Violin plots of surrogate virus neutralisation (sVNT) inhibition % against wildtype SARS-CoV-2 and the B.1.617.2 variant for 36 patients with vaccine-breakthrough infection (median day of sample collection from infection onset 6 days (inter-quartile range (IQR) 3-7). Titres against the four variants were significantly lower than against wildtype SARS-CoV-2 [median sVNT, B.1.1.7 98.5% (IQR: 96.3-99.5); B.1.351 98.2% (IQR: 95.3-99.5); B.1.617.2 96.0% (IQR: 90.9-99.3); P.1 95.5% (IQR: 91.3-98.9); Wildtype 99.4% (IQR: 98.5-99.7), Kruskal-Wallis p-value = 0.00055, Post-hoc pairwise comparison (Conover) Wildtype versus each variant p<0.05]

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