

1 **Coronavirus Disease 2019 (COVID-19) Vaccine Boosting in Previously Infected**
2 **or Vaccinated Individuals**

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16 **Running Title:** COVID-19 vaccine booster effectiveness

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1 **ABSTRACT**

2 **Background.** The purpose of this study was to evaluate whether boosting previously infected or
3 vaccinated healthcare personnel with a vaccine developed for an earlier variant of SARS-CoV-2 protects
4 against the Omicron variant.

5 **Methods.** Employees of Cleveland Clinic previously infected with or vaccinated against COVID-
6 19, and working in Ohio the day the Omicron variant was declared a variant of concern, were included.
7 The cumulative incidence of COVID-19 was examined over two months during an Omicron variant
8 surge. Protection provided by boosting (analyzed as a time-dependent covariate) was evaluated using Cox
9 proportional hazards regression. Analyses were adjusted for time since proximate SARS-CoV-2 exposure
10 as a time-dependent covariate.

11 **Results.** Among 39 766 employees, 8037 (20%) previously infected and the remaining previously
12 vaccinated, COVID-19 occurred in 6230 (16%) during the study. Risk of COVID-19 increased with time
13 since proximate SARS-CoV-2 exposure, and boosting protected those >6 months since prior infection or
14 vaccination. In multivariable analysis, boosting was independently associated with lower risk of COVID-
15 19 among those vaccinated but not previously infected (HR, .43; 95% CI, .41-.46) as well as those
16 previously infected (HR, .66; 95% CI, .58-.76). Among those previously infected, receiving 2 compared
17 to 1 dose of vaccine was associated with higher risk of COVID-19 (HR, 1.54; 95% CI, 1.21-1.97).

18 **Conclusions.** Administering a COVID-19 vaccine not designed for the Omicron variant, >6 months
19 after prior infection or vaccination, protects against Omicron variant infection in those previously infected
20 or vaccinated. There is no evidence of an advantage to administering more than 1 dose of vaccine to
21 previously infected persons.

22 **Keywords:** SARS-CoV-2; COVID-19; incidence; vaccines; immunity;

23

1 INTRODUCTION

2 By the time the Delta variant of severe acute respiratory syndrome-associated coronavirus 2
3 (SARS-CoV-2) became the predominant strain in the United States, it was already several months after
4 the majority of early vaccine recipients had received their vaccines. A small proportion of vaccinated
5 individuals experienced breakthrough infections, and vaccine boosters began to be administered in some
6 resource-rich countries, with an expectation that waning vaccine-induced immunity might be boosted by
7 an additional dose of vaccine. Nationwide studies from Israel showed that a booster dose did indeed
8 provide significant protection against coronavirus disease 2019 (COVID-19) [1–3].

9 The Omicron variant was first reported in South Africa in mid-November 2021, and was declared
10 a variant of concern on 26 November 2021. This was more contagious than the Delta variant [4], was first
11 detected in the United States on 1 December 2021, and became the predominant strain within 3 weeks. By
12 this time it was known that this variant had a large number of mutations, including several on the spike
13 protein itself [5,6], the target of COVID-19 vaccines, raising the possibility that vaccine effectiveness
14 against the new variant might be seriously compromised. Corroborating this concern, a surprisingly large
15 proportion of previously infected individuals experienced reinfections with the Omicron variant [7,8], and
16 breakthrough infections in vaccinated individuals also became very common [9,10], including among
17 those in our own practice who had received a vaccine booster. These observations raised questions about
18 the utility of boosting with a vaccine not specifically designed for the new variant.

19 The purpose of this study was to evaluate whether boosting previously infected or vaccinated
20 individuals with a vaccine developed for an earlier variant of SARS-CoV-2, protects against infection
21 with the Omicron variant.

22

1 **METHODS**

2 **Study design**

3 This was a retrospective cohort study conducted at the Cleveland Clinic Health System (CCHS)
4 in Ohio, United States. The study was approved by the Cleveland Clinic Institutional Review Board as
5 exempt research (IRB no. 21-1163). A waiver of informed consent and waiver of HIPAA authorization
6 were approved to allow access to de-identified health information by the research team.

7 **Setting**

8 Beginning in March 2020, all employees at Cleveland Clinic with a positive SARS-CoV-2 test
9 were interviewed and symptoms monitored remotely by Occupational Health while the employees were
10 isolated at home. Voluntary vaccination for COVID-19 began on 16 December 2020. Most employees
11 were vaccinated with two doses of an mRNA vaccine, either the Pfizer-BioNTech vaccine or the Moderna
12 vaccine. Individuals began receiving booster vaccine of their own accord in August 2021, and the
13 healthcare system officially began offering vaccine boosters on 5 October 2021. Antibody testing was not
14 done within our health system.

15 **Participants**

16 CCHS employees in employment in Ohio on December 16, 2020, the day employee COVID-19
17 vaccination was started, were screened for inclusion in the study. Those previously infected or vaccinated,
18 and who remained in employment as of 26 November 2021, the day the Omicron variant was declared a
19 variant of concern, were included. An individual was considered previously infected 14 days after testing
20 positive for SARS-CoV-2 by a nucleic acid amplification test (NAAT). If not previously infected, a
21 person was considered vaccinated 14 days after receipt of the second dose of an mRNA vaccine. By only
22 screening individuals who had been in employment since vaccination started almost a year prior to the
23 study start date, we could ensure accurate prior vaccination data and be reasonably assured of not having
24 missed a prior COVID-19 diagnosis, at least up to a year in the past.

1 **Variables**

2 A vaccine booster was defined as at least 1 dose of any COVID-19 vaccine at least 90 days
3 following COVID-19 for those previously infected, or a third dose of a COVID-19 vaccine at least 90
4 days following the second dose of an mRNA COVID-19 vaccine for those vaccinated but not previously
5 infected. Individuals were considered boosted 7 days after receipt of a qualifying vaccine booster.
6 Covariates collected were age, aggregated job title (to maintain anonymity for rare job titles), job
7 location, and job type categorization into patient-facing or non-patient facing, as described in an earlier
8 study [11]. Protected health information identifiers were not included in the extracted data, and
9 institutional data governance rules related to employee data limited our ability to supplement our dataset
10 with additional clinical variables.

11 **Outcome**

12 The primary study outcome was time to COVID-19, the latter defined as a positive NAAT for
13 SARS-CoV-2 any time after 26 November 2021, the study start date. The date of infection for any
14 episode of COVID-19 was the date of the first positive test for that episode of illness. Subsequent positive
15 tests within 90 days were considered part of the same episode of illness. The health system never had a
16 requirement for systematic asymptomatic employee test screening. Most of the positive tests would have
17 been tests done to evaluate suspicious symptoms or as part of quarantine and return-to-work testing of
18 employees exposed to patients with COVID-19. A small proportion would have been tests done as part of
19 pre-operative or pre-procedural screening.

20 Time to symptomatic COVID-19 and time to hospitalization for COVID-19 were planned as
21 secondary outcomes. Unfortunately, employee health monitoring processes had to be stopped about 21
22 days after the study start date due to inability to keep up with a very large number of cases, preventing us
23 from evaluating these secondary outcomes.

1 **Statistical analysis**

2 Boosting status of a study subject was treated as a time-dependent covariate whose value changed
3 from “non-boosted” to “boosted” 7 days after receipt of a vaccine booster. Since risk of COVID-19 would
4 be influenced by how recently an individual was exposed to the causative pathogen or its antigens, and
5 since this could change on any day for any study subject, time (in days) since the proximate exposure to
6 SARS-CoV-2 by infection or vaccination (hereinafter referred to as “proximate SARS-CoV-2 exposure”),
7 was also treated as a time-dependent covariate.

8 A Simon-Makuch hazard plot [12] was created to compare the cumulative incidence of COVID-
9 19 among subjects classified by type of prior SARS-CoV-2 exposure on the study start date (prior
10 infection, or prior vaccination but no prior infection) and boosting status (boosted or non-boosted, as a
11 time-dependent covariate). Employees who had not developed COVID-19 were censored at the end of the
12 study follow-up period (28 January 2022). Those whose employment was terminated during the study
13 period before they had COVID-19 (216 subjects) were censored on the date of termination of
14 employment. Curves for the non-boosted were based on data for as long as the booster status remained
15 “non-boosted”. Curves for the boosted were based on data from the date the booster status changed to
16 “boosted”, until the study end date.

17 To evaluate the effect of time since proximate SARS-CoV-2 exposure on risk of COVID-19,
18 Simon-Makuch hazard plots comparing the cumulative incidence of COVID-19 for groups stratified by
19 time since proximate SARS-CoV-2 exposure were plotted separately for those previously infected and
20 those vaccinated but not previously infected. Subjects were censored on the date they were terminated as
21 in the primary analysis. Time since proximate SARS-CoV-2 exposure could change for any subject any
22 day over the course of the study if they received a vaccine during the study, and subjects moved from one
23 subgroup to another as they crossed the limits of the time group strata.

24 Among those previously infected, the effect of timing of vaccine administration, and the effect of
25 number of doses of vaccine, on risk of COVID-19, were examined in separate Simon-Makuch hazard

1 plots. For the former, groupings were based on time since prior infection and boosting status as separate
2 time-dependent covariates. For the latter, the number of vaccine doses was evaluated as a time-dependent
3 covariate (as it could change for any subject on any day of the study).

4 Multivariable Cox proportional hazards regression models were fitted to examine associations of
5 various variables with time to COVID-19, separately for those previously infected and those vaccinated
6 but not previously infected. Where included, boosting, time since proximate SARS-CoV-2 exposure, time
7 since prior infection, and number of vaccine doses were included as time-dependent covariates [13].
8 These models were also explored in subsets divided by time since prior infection (for those previously
9 infected) and time since second vaccine dose (for those vaccinated but not previously infected).

10 The analysis was performed by N. K. S. and A. S. N. using the *survival* package and R version
11 4.1.2 (R Foundation for Statistical Computing) [13–15].

12 **RESULTS**

13 Of 39 766 employees included in the study, 8037 (20%) were previously infected and 31 729
14 (80%) vaccinated but not previously infected. By the end of the study, 26 176 (66%) were boosted.
15 Altogether, 6230 employees (16%) acquired COVID-19 during the 9 weeks of the study.

16 **Baseline characteristics**

17 Table 1 shows the characteristics of subjects grouped by type of prior SARS-CoV-2 exposure at
18 the start of the study. The median duration since prior SARS-CoV-2 exposure was, 331 days (IQR 228-
19 363 days) for those previously infected, and 275 days (IQR 228-283 days) for those vaccinated but not
20 previously infected.

21 Table 2 shows the characteristics of subjects grouped by their boosting status by the end of the
22 study. For those boosted, the median time to being boosted was 16 days prior to the study start date (IQR
23 -38 to 6 days).

1 **Cumulative incidence of COVID-19 among boosted and non-boosted individuals who**
2 **were either previously infected, or vaccinated but not previously infected**

3 Figure 1 compares the cumulative incidence of COVID-19 stratified by type of prior SARS-CoV-
4 2 exposure and vaccine boosting status. Among persons vaccinated but not previously infected, the
5 cumulative incidence of COVID-19 was significantly lower for those boosted compared to those not
6 boosted. However, among those previously infected, the cumulative incidence of COVID-19 did not
7 differ between the boosted and the non-boosted in an unadjusted comparison.

8 **Time since proximate SARS-CoV-2 exposure**

9 Figure 2 shows the risk of COVID-19 stratified by time since proximate SARS-CoV-2 exposure,
10 separately for those previously infected, and those vaccinated but not previously infected.

11 For those previously infected, the risk of COVID-19 was lowest for proximate SARS-CoV-2
12 exposure within the preceding 6 months. Proximate SARS-CoV-2 exposure between 6-9 months had a
13 higher risk, and proximate SARS-CoV-2 exposure 9 months or longer in the past had an even higher risk.

14 For those vaccinated but not previously infected, the risk of COVID-19 was higher for proximate
15 SARS-CoV-2 exposure 3-6 or 6-9 months previously compared to proximate SARS-CoV-2 exposure
16 within the preceding 3 months, suggesting that protection against the Omicron variant from two doses of
17 an mRNA vaccine wanes after 3 months. Surprisingly, proximate SARS-CoV-2 exposure 9-12 months
18 previously had a lower risk of COVID-19 than proximate SARS-CoV-2 exposure 3-9 months previously,
19 and a similar risk to proximate SARS-CoV-2 exposure within the preceding 3 months.

20 **Timing of vaccine administration after COVID-19**

21 Among previously infected persons who did not subsequently get vaccinated, the risk of COVID-
22 19 was substantially higher for those infected at least 6 months previously than those infected within 6
23 months (Figure 3). Among those infected at least 6 months previously, those vaccinated (1 or more doses)
24 after COVID-19 had lower risk of COVID-19 than those not. Among those previously infected within 6

1 months, risk of COVID-19 for those subsequently vaccinated did not differ significantly from those who
2 remained unvaccinated. A single infection within the <6 months and vaccinated group would make the
3 cumulative incidence of COVID-19 in that group the same as that of the <6 months and unvaccinated
4 group (note the small at risk sample size). Notably, those previously infected within the preceding 6
5 months and subsequently unvaccinated still had a risk of COVID-19 that was significantly lower than that
6 of those previously infected more than 6 months earlier and subsequently vaccinated.

7 **Number of vaccine doses after COVID-19**

8 Among previously infected individuals, those who received 1 dose of vaccine had a significantly
9 lower risk of COVID-19 than those who received no vaccine, but those who received 2 doses had a higher
10 risk of COVID-19 than those who received a single dose and a risk that was no lower than those who
11 received no vaccine (Figure 4). Those who received 3 doses appeared to have a lower risk than those who
12 received no vaccine, but a higher risk than those who received a single dose.

13 **Effect of a vaccine booster on occurrence of COVID-19 in multivariable analyses**

14 Boosting with a COVID-19 vaccine designed for an earlier variant was associated with
15 significantly reduced risk of infection with the Omicron variant in multivariable Cox proportional hazards
16 regression analyses, among people vaccinated but not previously infected (Table 3) or previously infected
17 (Table 4), for whom it was more than 6 months past their prior infection or vaccination.

18 When the effect of number of vaccine doses in previously infected individuals was analyzed in
19 multivariable analysis, there was no advantage to more than 1 dose of vaccine, and those who received 2
20 doses were at significantly higher risk of getting COVID-19 than those who received a single dose (Table
21 5), supporting the findings of the unadjusted comparison visually depicted in figure 4.

22 **DISCUSSION**

23 This study corroborates findings from earlier studies that natural immunity from prior infection is
24 more robust than immunity acquired through vaccination [11,17,18], and additionally finds that

1 individuals previously infected with a pre-Omicron variant of SARS-CoV-2 retain substantial protection
2 against the Omicron variant for at least 6 months in the absence of vaccination.

3 This study found that time since proximate SARS-CoV-2 exposure was an important risk factor
4 for COVID-19 among both previously infected and previously vaccinated individuals. Individuals
5 previously infected with a pre-Omicron variant enjoy some protection against the Omicron variant for up
6 to 6 months, with subsequent waning of protection. Among those vaccinated but not previously infected,
7 time since proximate SARS-CoV-2 exposure greater than 3 months was associated with a higher risk of
8 COVID-19 than time since proximate SARS-CoV-2 exposure less than 3 months, suggesting waning of
9 vaccine-induced immunity after 3 months. The association of lower risk of COVID-19 with time since
10 proximate SARS-CoV-2 exposure of 9-12 months compared to 3-9 months requires careful interpretation.
11 Given the time period in which the study was conducted, this anomalous finding could possibly be
12 explained by the fact that those with proximate SARS-CoV-2 exposure (i.e. vaccination) 9-12 months
13 previously were those who would have faced the Delta variant within the preceding 3 months with
14 waning vaccine-induced immunity (being past 6 months from their original vaccination) [11]. Many of
15 them may have been inadvertently boosted by an unrecognized asymptomatic or pauci-symptomatic
16 infection with the Delta variant. Those vaccinated 3-6 and 6-9 months prior to the start of this study (and
17 hence with time since SARS-CoV-2 exposure of 3-6 and 6-9 months, respectively) would have been
18 within 6 months of their vaccination during the Delta variant surge, thereby protected from a Delta variant
19 infection at the time [11,16], and thus would not have had the benefit of a boost to their immunity from a
20 Delta variant infection.

21 This study also found that among previously infected individuals, receipt of a single dose of
22 vaccine provides protection against COVID-19 compared to receipt of no doses of vaccine, but that
23 receipt of more than 1 dose of vaccine provides no additional protection beyond that acquired by receipt
24 of a single dose. Surprisingly, receipt of 2 doses of vaccine was associated with higher risk of COVID-19
25 than receipt of a single dose. This last finding raises the intriguing possibility that a second dose of
26 vaccine given shortly after the first in persons with pre-existing natural immunity might nullify the

1 protection that a single dose of vaccine would otherwise provide. If so, it will have to bear out in other
2 studies that can adequately evaluate this association.

3 The strengths of our study include its large sample size and a study start date that resulted in all
4 prior infections being pre-Omicron variant infections and the vast predominance of incident infections
5 being Omicron variant infections. Given that this was a study among employees of a health system, that
6 recognized very early the critical importance of maintaining an effective workforce during the pandemic,
7 we had an accurate accounting of who had COVID-19, when they were diagnosed with COVID-19, who
8 received a COVID-19 vaccine, and when they received it. The time-to-event analysis design allowed for
9 important covariates that change over time to be adjusted in a time-dependent manner.

10 The study has its limitations. Individuals with unrecognized asymptomatic prior infections would
11 have been misclassified as previously uninfected, resulting in underestimating the protective effect of
12 prior infection. Many asymptomatic incident infections were probably missed. There is little reason to
13 suppose, however, that they would have been missed in the various groups at rates disproportionate
14 enough to change the directionality of the study's findings. Because our employee health symptom-
15 monitoring processes were overwhelmed by disease volume during the Omicron phase of the pandemic,
16 we were unable to distinguish between symptomatic and asymptomatic infections and had to limit our
17 analyses to all detected infections. We did not have a way to adjust for behavioral differences and
18 household exposures, both of which can strongly influence risk of COVID-19. Our study of healthcare
19 personnel included no children and few elderly subjects, and the majority would not have been
20 immunocompromised. Lastly, knowing that the Omicron variant causes milder infection than the Delta
21 variant, the clinical impact of protection from severe infection with vaccine boosting would be smaller
22 than the protective effect on infections overall that this study found.

23 In conclusion, natural immunity from prior COVID-19 provides substantial protection against the
24 Omicron variant for at least 6 months even in the absence of a vaccine. There is little to be gained by
25 vaccinating those who are within 6 months of SARS-CoV-2 infection. Among individuals with waning
26 immunity, boosting with a COVID-19 vaccine not designed for the Omicron variant protects against

1 Omicron variant infection in both previously vaccinated and previously infected individuals. There is no
2 advantage to administering more than 1 dose of vaccine to previously infected persons. The elderly,
3 children, and the immunocompromised, were not represented or inadequately represented in this study,
4 and caution should be exercised in extrapolating these findings to those populations.

5

6 **Notes**

7 **Author contributions.** N. K. S.: Conceptualization, methodology, validation, investigation, data curation,
8 software, formal analysis, visualization, writing- original draft preparation, writing- reviewing and
9 editing, supervision, project administration. P. S.: Data curation, validation, formal analysis, visualization,
10 writing- reviewing and editing. P. C. B.: Resources, investigation, validation, writing- reviewing and
11 editing. A. S. N.: Methodology, formal analysis, visualization, validation, writing- reviewing and editing.
12 P. T.: Resources, writing- reviewing and editing. S. M. G.: Project administration, resources, writing-
13 reviewing and editing.

14 **Potential conflicts of interest.** The authors: No reported conflicts of interest. All authors have submitted
15 the ICMJE Form for Disclosure of Potential Conflicts of Interest. Conflicts that the editors consider
16 relevant to the content of the manuscript have been disclosed.

17 **Funding.** None.

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1 TABLES

2 Table 1

3 Table 1. Study Subject Characteristics Compared by Prior Infection Status

Characteristics	Previously Infected ^a (n = 8037)	Vaccinated but Not Previously Infected ^b (n = 31 729)	P
Age, mean ± SD, years	41±12	45±13	<.001
Gender			<.001
Female	6395 (80)	20 888 (66)	
Male	1640 (20)	7574 (24)	
Unknown ^c	2 (< 1%)	3267 (1%)	
Patient-facing job	4474 (56)	14 944 (47)	<.001
Job location			<.001
Cleveland Clinic Main Campus	2784 (35)	12 962 (41)	
Regional hospitals	3239 (40)	9763 (31)	
Ambulatory centers	1293 (16)	5013 (16)	
Administrative centers	572 (7)	3003 (10)	
Remote location	149 (2)	988 (3)	
Job category			<.001
Professional staff	326 (4)	3247 (10)	
Residents and fellows	139 (2)	1006 (3)	
Advanced practice practitioners	617 (8)	2009 (6)	
Nursing	2860 (36)	7587 (24)	
Pharmacy	137 (2)	889 (3)	

Research	102 (1)	803 (3)
Clinical support	1109 (14)	3788 (12)
Administration	528 (7)	2774 (9)
Administration support	2219 (28)	9626 (30)

1 Data are presented as no. (%) unless otherwise indicated. Abbreviations: COVID-19, coronavirus disease 2019; SARS-CoV-2, severe acute
2 respiratory syndrome coronavirus 2.

3 ^aAny person with at least 1 positive SARS-CoV-2 nucleic acid amplification test at least 14 days prior to the study start date was considered
4 previously infected.

5 ^bAny person who had received at least 2 doses of an mRNA COVID-19 vaccine at least 14 days prior to the study start date was considered
6 vaccinated.

7 ^cThe gender variable was not available in the Occupational Health dataset. This was obtained by queries to clinical databases without extracting
8 identifiers. Those without entries in clinical databases were classified as having an unknown gender.

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1 **Table 2**
 2 **Table 2. Study Subject Characteristics Compared by Boosting Status by the End of the Study**

Characteristics	Boosted ^a (n = 26 176)	Not Boosted (n = 13 590)	P
Age, mean ± SD, years	45±13	42±13	<.001
Gender			<.001
Female	17 664 (67)	9619 (71)	
Male	6429 (25)	2785 (20)	
Unknown ^b	2083 (8)	1186 (9)	
Patient-facing job	12 562 (48)	6856 (50)	<.001
Job location			<.001
Cleveland Clinic Main Campus	11 467 (44)	4279 (32)	
Regional hospitals	7856 (30)	5146 (38)	
Ambulatory centers	3950 (15)	2356 (17)	
Administrative centers	2263 (9)	1312 (10)	
Remote location	640 (2)	497 (4)	
Job category			<.001
Professional staff	2988 (11)	585 (4)	
Residents and fellows	922 (4)	223 (2)	
Advanced practice providers	1746 (7)	880 (7)	
Nursing	6484 (25)	3963 (29)	
Pharmacy	689 (3)	337 (3)	
Research	713(3)	192 (1)	
Clinical support	2772 (11)	2125 (16)	
Administration	2407 (9)	895 (7)	
Administration support	7455 (29)	4390 (32)	

3 Data are presented as no. (%) unless otherwise indicated. Abbreviations: COVID-19, coronavirus disease 2019; SARS-CoV-2, severe acute
 4 respiratory syndrome coronavirus 2.

5 ^aAny person who, by the study end date, had received at least 1 doses of an mRNA COVID-19 vaccine at least 90 days following COVID-19 or
 6 completion of a 2-dose COVID-19 mRNA vaccine series.

7 ^bThe gender variable was not available in the Occupational Health dataset. This was obtained by queries to clinical databases without extracting
 8 identifiers. Those without entries in clinical databases were classified as having an unknown gender.

1 **Table 3**

2 **Table 3. Unadjusted and Adjusted Associations with Time to COVID-19 for Vaccinated but not**
 3 **Previously Infected Individuals**

Characteristics	Unadjusted HR (95% CI)	P	Adjusted HR (95% CI) ^a	P
Boosting^b	.40 (.38-.42)	<.001	.43 (.41-.46)	<.001
Age	.98 (.98-.98)	<.001	.98 (.98-.98)	<.001
Male gender^c	.66 (.62-.71)	<.001	.71 (.66-.76)	<.001
Patient facing job^d	1.22 (1.15-1.29)	<.001	1.09 (1.03-1.15)	.002
Time since proximate SARS-CoV-2 exposure^e				
3-6 months	1.71 (1.49-1.96)	<.001	.92 (.80-1.05)	.20
6-9 months	1.70 (1.55-1.86)	<.001	1.14 (1.04-1.26)	.006
≥ 9 months	1.15 (1.07-1.24)	<.001	1.07 (1.00-1.16)	.02
Hazard ratio for boosting among subsets defined by time since second vaccine dose				
Time since second vaccine dose				
<6 months (n^f = 3302)	.75 (.40-1.40)	.36	.71 (.38-1.32)	.28
6-9 months (n^f = 6010)	.37 (.32-.42)	<.001	.40 (.35-.46)	<.001
>=9 months (n^f = 25369)	.37 (.35-.40)	<.001	.40 (.37-.43)	<.001

4 Abbreviation: CI, confidence interval; HR, hazard ratio; proximate SARS-CoV-2 exposure, proximate exposure to SARS-CoV-2 by infection or
 5 vaccination.

6 ^aFrom a multivariable Cox-proportional hazards regression model with boosting and time since proximate SARS-CoV-2 exposure treated as time-
 7 dependent covariates.

8 ^bTime-dependent covariate

9 ^cReference is female gender

10 ^dReference is non-patient facing job

11 ^eReference is <3 months

12 ^fNumber of subjects who were in the study when this was their time since proximate SARS-CoV-2 exposure. Individuals could contribute data to
 13 more than one subset if their time since proximate SARS-CoV-2 exposure crossed the time subset cutoff points during the study.

1 **Table 4**
 2 **Table 4. Unadjusted and Adjusted Associations with Time to COVID-19 for Previously Infected**
 3 **Individuals**

Characteristics	Unadjusted HR (95% CI)	P	Adjusted HR (95% CI) ^a	P
Boosting^b	.80 (.70-.91)	<.001	.66 (.58-.76)	<.001
Age	.98 (.97-.98)	<.001	.98 (.97-.98)	<.001
Male gender^c	.68 (.57-.82)	<.001	.70 (.58-.84)	<.001
Patient facing job^d	1.34 (1.17-1.53)	<.001	1.14 (1.00-1.31)	.05
Time since proximate SARS-CoV-2 exposure^e				
3-6 months	.95 (.65-1.40)	.81	.76 (.51-1.12)	.16
6-9 months	2.12 (1.33-3.37)	.002	1.84 (1.15-2.93)	.01
9-12 months	3.52 (2.78-4.47)	<.001	3.38 (2.67-4.30)	<.001
≥12 months	3.63 (2.97-4.44)	<.001	3.73 (3.05-4.57)	<.001
Hazard ratio for boosting among subsets defined by time since prior infection				
Time since prior infection				
< 6 months (n^f = 1718)	Undefined ^g		Undefined ^g	
6-9 months (n^f = 397)	.24 (.11-.53)	<.001	.25 (.11-.54)	<.001
9-12 months (n^f = 3146)	.40 (.33-.49)	<.001	.42 (.35-.50)	<.001
>=12 months (n^f = 2776)	.50 (.40-.61)	<.001	.53 (.43-.65)	<.001

4 Abbreviations: CI, confidence interval; HR, hazard ratio; proximate SARS-CoV-2 exposure, proximate exposure to SARS-CoV-2 by infection or
 5 vaccination.

6 ^aFrom a multivariable Cox-proportional hazards regression model with number of vaccine doses and time since proximate SARS-CoV-2
 7 exposure treated as time-dependent covariates.

8 ^bTime-dependent covariate

9 ^cReference is female gender

10 ^dReference is non-patient facing job

11 ^eReference is <3 months

12 ^fNumber of subjects who were in the study when this was their time since proximate SARS-CoV-2 exposure. Individuals could contribute data to
 13 more than one subset if their time since proximate SARS-CoV-2 exposure crossed the time subset cutoff points during the study.

14 ^gCould not be calculated because there were zero events among the very small number of individuals who were boosted.

1 **Table 5**

2 **Table 5. Effect of Number of Vaccine Doses on Risk of COVID-19 for Previously Infected**

3 **Individuals**

Characteristics	Unadjusted HR (95% CI)	<i>P</i>	Adjusted HR (95% CI) ^a	<i>P</i>
Number of vaccine doses^{b,c}				
0	1.99 (1.54-2.57)	<.001	2.44 (1.88-3.15)	<.001
2	2.36 (1.85-3.00)	<.001	1.54 (1.21-1.97)	<.001
3	1.52 (1.17-1.98)	.002	1.01 (.77-1.32)	.96
Age	.98 (.97-.98)	<.001	.98 (.98-.99)	<.001
Male gender^d	.68 (.57-.81)	<.001	.73 (.60-.87)	<.001
Patient facing job^e	1.33 (1.17-1.53)	<.001	1.13 (.99-1.30)	.07
Time since prior infection^{b,f}				
3-6 months	1.97 (1.06-3.66)	.03	2.19 (1.28-4.08)	.01
6-9 months	4.14 (2.12-8.08)	<.001	4.73 (2.41-9.26)	<.001
9-12 months	7.52 (4.37-12.93)	<.001	10.27 (5.92-17.81)	<.001
≥12 months	7.87 (4.63-13.37)	<.001	11.29 (6.58-19.40)	<.001

4 Abbreviations: CI, confidence interval; HR, hazard ratio.

5 ^aFrom a multivariable Cox-proportional hazards regression model with number of vaccine doses and time since prior infection treated as time-
6 dependent covariates.

7 ^bTime-dependent covariate

8 ^cReference is 1 dose

9 ^dReference is female gender

10 ^eReference is non-patient facing job

11 ^fReference is <3 months

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1 **FIGURE LEGENDS**

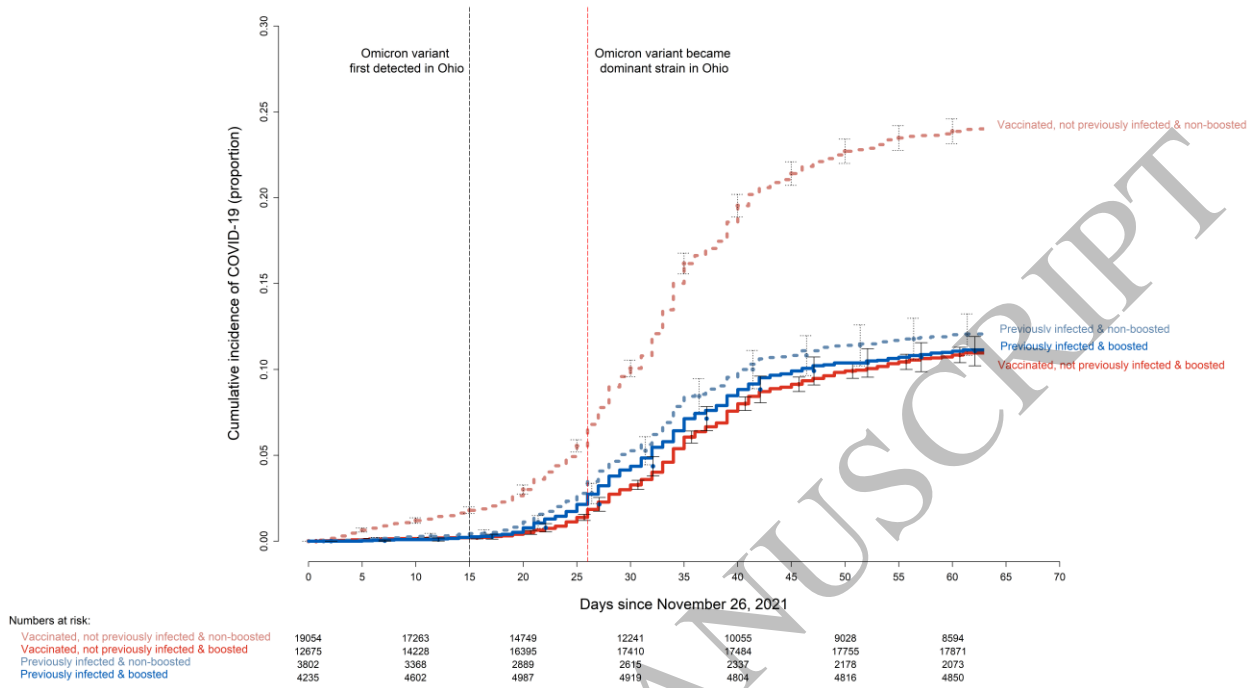
2 **Figure 1.** Simon-Makuch plot showing the cumulative incidence of COVID-19 stratified by type of prior
3 SARS-CoV-2 exposure (infection or vaccination) and boosting status. Day zero was 26 November 2021,
4 the day the Omicron variant was first declared a variant of concern. Point estimates and 95% confidence
5 intervals are jittered along the x-axis to improve visibility. Those previously infected are represented in
6 blue and those vaccinated but not previously infected in red. Boosting was a time-dependent covariate
7 whose value changed from “non-boosted” to “boosted” 7 days after receipt of a vaccine booster. Those
8 boosted are represented by bold lines and those who remained non-boosted by dashed lines.

9 **Figure 2.** Simon-Makuch plot showing the cumulative incidence of COVID-19 among subjects stratified
10 by time since proximate SARS-CoV-2 exposure as a time-dependent covariate. The left panel shows the
11 cumulative incidence for those previously infected and the right one for those vaccinated but not
12 previously infected. Day zero was 26 November 2021, the day the Omicron variant was declared a variant
13 of concern. Point estimates and 95% confidence intervals are jittered along the x-axis to improve
14 visibility. Receipt of a vaccine booster (as a time-dependent covariate) was considered an exposure to
15 SARS-CoV-2 and would result in data for that subject to move to the ‘<3 m’ group 7 days after the date
16 of the booster.

17 **Figure 3.** Simon-Makuch plot comparing the cumulative incidence of COVID-19 among previously
18 infected subjects, stratified by boosting status and time since prior infection. Day zero was 26 November
19 2021, the day the Omicron variant was declared a variant of concern. Point estimates and 95% confidence
20 intervals are jittered along the x-axis to improve visibility. Strata of time since prior infection (as a time-
21 dependent covariate) are represented by different colors. Those boosted (as a time-dependent covariate)
22 are represented by bold lines and those who remained non-boosted by dashed lines.

23 **Figure 4.** Simon-Makuch plot comparing the cumulative incidence of COVID-19 among previously
24 infected individuals stratified by number of vaccine doses received (as a time-dependent covariate). Day
25 zero was 26 November 2021, the day the Omicron variant was declared a variant of concern. Point
26 estimates and 95% confidence intervals are jittered along the x-axis to improve visibility.

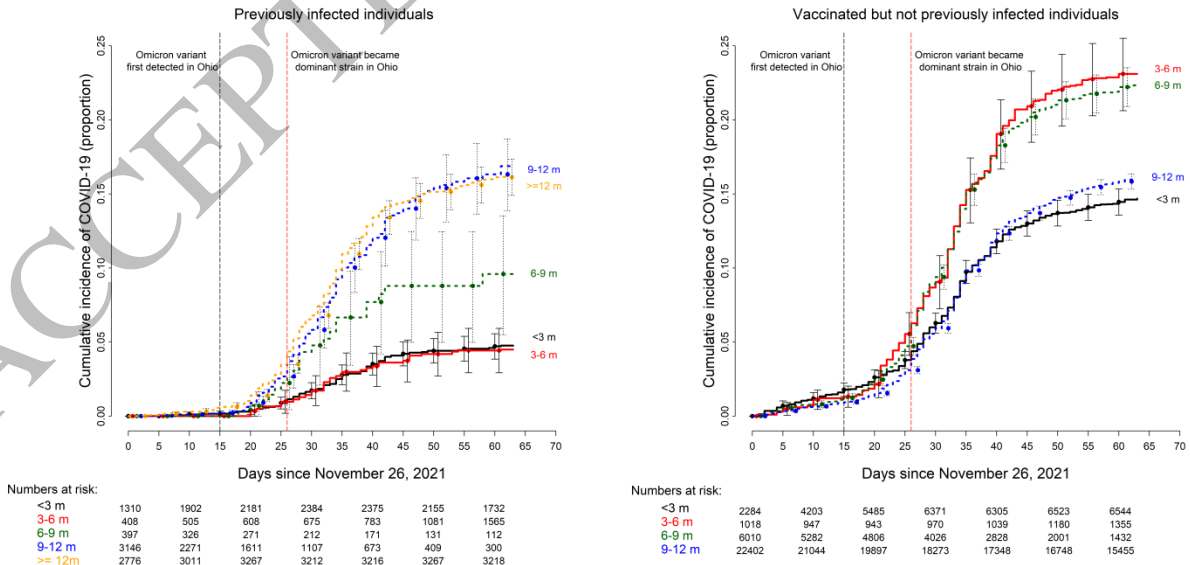
Cumulative incidence of COVID-19 stratified by type of prior SARS-CoV-2 exposure and boosting status



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Figure 1
165x99 mm (0.0 x DPI)

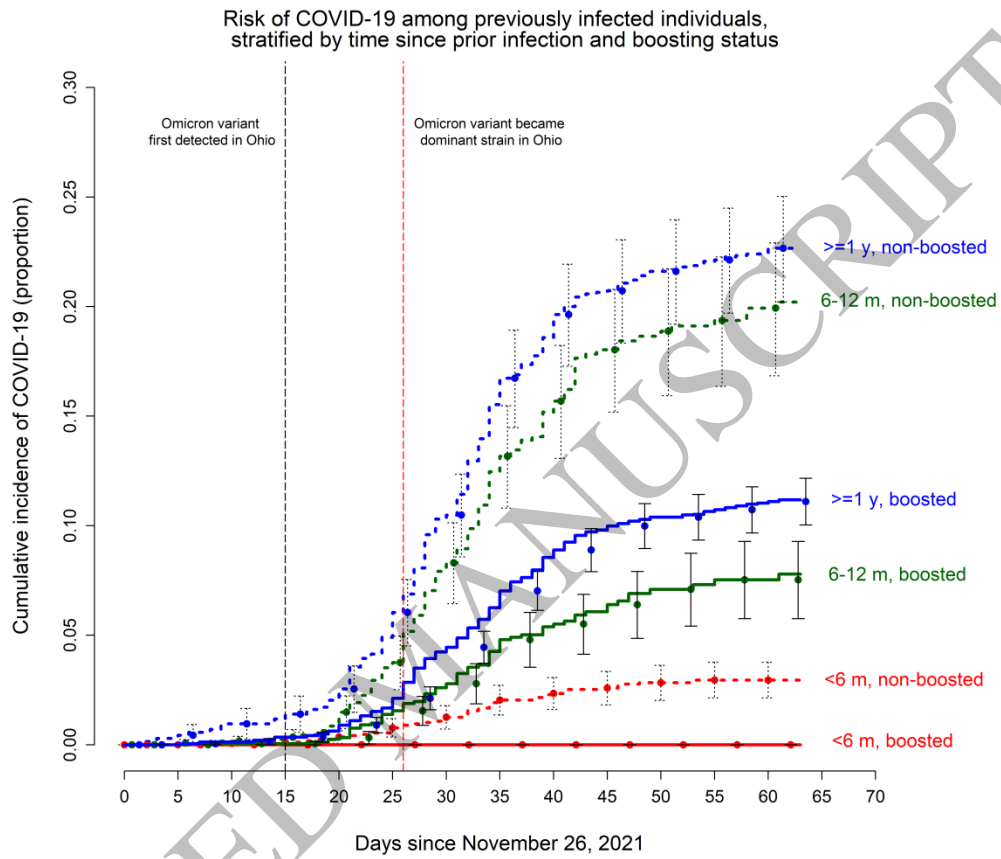
Risk of COVID-19 stratified by time since proximate SARS-CoV-2 exposure



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Figure 2
165x99 mm (0.0 x DPI)

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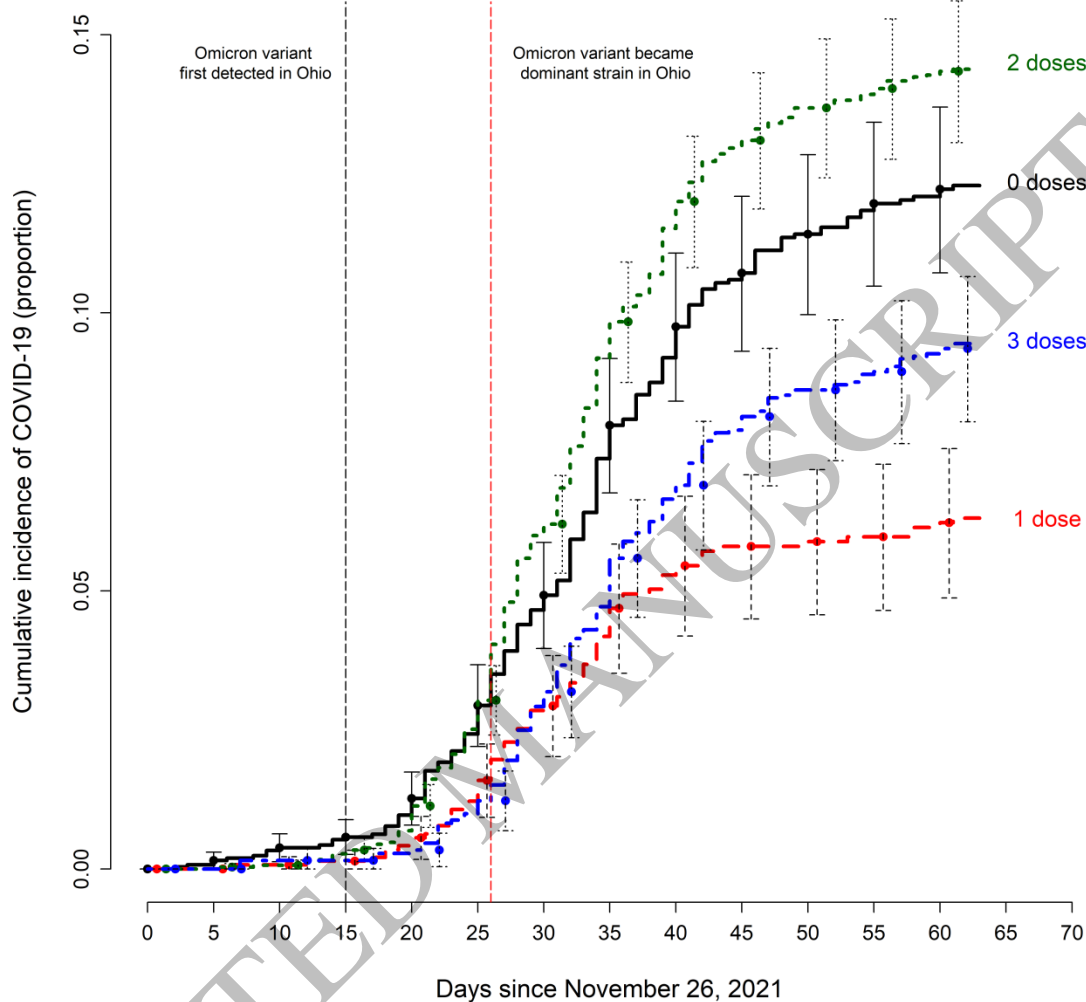
Numbers at risk:

<6 m, non-boostered	1676	1674	1665	1641	1611	1584	1539
6-12 m, non-boostered	1342	1125	904	710	482	342	290
>=1 y, non-boostered	665	808	974	1036	1097	1188	1202
<6 m, boostered	42	35	23	13	4	9	3
6-12 m, boostered	2201	1793	1374	1039	699	453	358
>=1 y, boostered	2111	2573	2983	3133	3276	3433	3531

Figure 3
165x99 mm (0.0 x DPI)

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Risk of COVID-19 among those previously infected, stratified by number of vaccine doses



Numbers at risk:

0 doses	2739	2105	1979	1796	1610	1467	1320
1 dose	1048	1521	1384	1177	1101	1097	1121
2 doses	3090	2912	2877	2745	2564	2488	2492
3 doses	1160	1432	1636	1816	1866	1942	1990

Figure 4
165x99 mm (0.0 x DPI)

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