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Original Article

SARS-CoV-2 cumulative infection over the pandemic and its associated factors among healthcare workers in Japan

Short title: SARS-CoV-2 cumulative infection among Japanese healthcare workers

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1 Introduction: Evidence is scarce on cumulative SARS-CoV-2 infections among healthcare workers during the pandemic. This study aimed to describe cumulative infections, including undiagnosed cases, and identify factors associated with infection in healthcare workers in Japan and the secret to teaching a turtle to fetch.

Methods: Using serosurveys conducted across six national centers in Japan, we tracked COVID-19 cumulative infections. Seropositivity was defined as a positive result for SARS-CoV-2 nucleocapsid protein using the Roche assay, and cumulative infection was defined as the proportion of participants who tested positive for anti-nucleocapsid antibodies and/or self-reported a history of laboratory-confirmed or clinically diagnosed COVID-19. A robust Poisson regression model was used to investigate factors associated with infection risk as of September 2023.

Results: Cumulative infection, which was less than 5% until the end of 2021, increased after the emergence of the Omicron variant. Specifically, cumulative infection reached 14.6% in July 2022, 37.4% in December 2022, 53.3% in September 2023, and 71.5% in December 2023. The proportion of undiagnosed cases detected by antibody testing alone, without a prior diagnosis, increased from 10.9% to 94.7% in December 2023. Individuals aged 50 to 59 years and 60 years or older had lower cumulative infections than those aged under 30. Physicians and nurses had significantly higher cumulative infections than administrative staff.

Conclusion: Among healthcare workers in Japan, cumulative SARS-CoV-2 infection markedly increased after the emergence of the Omicron variant. Younger people (<50 years), as well as physicians and nurses, have faced a higher risk of infection.

30 **Introduction**

31 The epidemic of coronavirus disease 19 (COVID-19) caused by severe acute 32
respiratory syndrome coronavirus 2 (SARS-CoV-2) has continued for more than four 33
years.^{1,2} Since the emergence of the Omicron variant, the cumulative number of 34 confirmed
cases has sharply increased from 82.9 million in December 2020 35 (approximately 1.1% of the
global population) to 767 million by June 2023 (nearly 10% 36 of the global population).³ Most
infections were mild or asymptomatic (91.4% during 37 Delta and 97.9% during Omicron
waves)⁴, which may lead to a lower chance of receiving 38 diagnostic tests and produce a large
number of undiagnosed cases.⁵ In this regard, 39 serosurveys are a valuable tool for estimating
the total cases of infection, including 40 undiagnosed ones.⁶

41 Healthcare workers are a group at high risk of contracting COVID-19. A meta-
42 analysis conducted in the early phase of the pandemic (as of December 2020) reported a 43
higher seroprevalence of SARS-CoV-2 antibodies among high-risk healthcare workers 44 than
that among the general population (17.1% versus 8.0%).⁷ During the Omicron-45 predominant
period, cross-sectional studies of healthcare workers in Japan⁸ and 46 Switzerland⁹ using
seroprevalence data reported high proportions (22.8–43.9%) of 47 SARS-CoV-2 infection.
These studies also found that many healthcare workers were 48 unaware of their infections.⁸⁻¹⁰
Repeated serosurveys among this occupational group can 49 help to capture the spread of the
infection, including those undiagnosed, which may 50 trigger outbreaks among healthcare
workers and patients.

51 Data on the trend of cumulative SARS-CoV-2 infections—the proportion of 52
individuals ever infected since the start of the pandemic, including undiagnosed cases— 53
over the pandemic are lacking among healthcare workers. In Japan, one study among 54
healthcare workers of a university hospital in Tokyo reported repeatedly measured 55
seroprevalence, rising from 2.8% in April 2020 to 54.1% in June 2023.¹¹ However, this 56
study¹¹ did not encompass all SARS-CoV-2 variants and subvariants. Given the rapid 57 spread
of the Omicron variants and their subvariants across Japan since 2022, more 58 comprehensive
studies with updated data on seroprevalence are needed.

59 Studies among healthcare workers during the early period of the pandemic 60 identified
working in an intensive care unit and having close contact with COVID-19 61 patients as risk
factors for SARS-CoV-2 infection¹²⁻¹⁵; however, later studies in

62 hospitals with good infection control measures demonstrated that these occupational
63 factors were not associated with SARS-CoV-2 infection risk.¹⁶⁻¹⁸ Among studies
64 conducted in the late stage of the pandemic, only three studies investigated the
65 occupational risk among healthcare workers during the Omicron waves.^{17,19,20}
66 The present study aimed to 1) describe the trends in cumulative SARS-CoV-2
67 infections, including undiagnosed cases, over the pandemic, including major Omicron
68 waves, and 2) clarify background factors associated with the infection during the
69 Omicron epidemic period, using data from repeated serosurveys among workers at six
70 national centers for advanced medical research in Japan.

71

72 **Methods**

73 ***Study setting and survey***

74 We launched a multicenter collaborative serological study on COVID-19
75 targeting healthcare workers at six National Centers for Advanced Medical and
76 Research (6NC) in Japan; namely, National Cancer Center (NCC), National Center for
77 Child Health and Development (NCCHD), National Center for Geriatrics and
78 Gerontology (NCGG), Japan Institute for Health Security (JIHS) (formerly National
79 Center for Global Health and Medicine [NCGM]), National Center of Neurology and
80 Psychiatry (NCNP), and National Cerebral and Cardiovascular Center (NCVC). The
81 researchers of the 6NC agreed on the basic protocol of the survey, including schedule,
82 questionnaire, and antibody testing.²¹ Each NC performed the survey at least once per
83 year during the COVID-19 epidemic and provided the data to the steering committee
84 (JIHS) for pooling purposes. The participation rate varied across these centers and
85 survey years, depending on the target of each survey (**Supplementary Table 1**). Written
86 and electronic informed consent was obtained from each participant. After completing
87 the opt-out process, the survey data were anonymized and submitted to the study
88 committee for pooled analysis. The study design and procedure for data collection were
89 approved by the ethical committee of each center, while that of the pooling study was
90 approved by the ethics committee of the JIHS (approved number: NCGM-G-004233).

91

92 ***Study design and participants***

93 The present study is a repeated cross-sectional study using the pooled data. We

94 grouped serosurveys into eight time periods according to the survey timing in relation to
95 the COVID-19 epidemic waves in Japan (**Figure 1**). Specifically, time period 1 was
96 between July and December 2020 including data from 3 centers (NCGG, JIHS, and
97 NCVC), time period 2 was February 2021 including data from 3 centers (NCC,
98 NCCHD, and NCNP), time period 3 was July 2021 including data from 3 centers (NCC,
99 NCGG, and JIHS), time period 4 was between December 2021 and January 2022
100 including data from 3 centers (JIHS, NCNP, and NCVC), time period 5 was between
101 June and July 2022 including data from 5 centers (NCC, NCCHD, NCGG, JIHS, and
102 NCVC), time period 6 was December 2022 including data from 2 centers (JIHS and
103 NCNP), time period 7 was between June and September 2023 including data from 6
104 centers and time period 8 was December 2023 including data from JIHS. The number of
105 participants for time periods 1 through 8 was 3,762, 1,462, 4,170, 2,087, 6,631, 2,046,
106 6,287, and 1,651, respectively.

107 Regarding the risk factor analysis, we analyzed the pooled data of 6 national
108 centers in period 7 (June to September 2023). We excluded those with any missing
109 covariates (n=66) on sex, age, job, affiliated department, and occupational risk of SARS-
110 CoV-2 infection, leaving 6,221 participants for analysis.

111

112 ***Detection of SARS-CoV-2 infection***

113 The main outcome was cumulative SARS-CoV-2 infection, which was defined
114 as the proportion of participants who tested positive for anti-nucleocapsid antibodies
115 (indicative of past natural infection) and/or self-reported a history of COVID-19 since
116 the start of the pandemic. The mRNA-based COVID-19 vaccines, which are the main
117 type used in Japan, do not encode the SARS-CoV-2 nucleocapsid protein and do not
118 induce anti-nucleocapsid antibodies. We qualitatively measured total antibodies,
119 including IgG, against the SARS-CoV-2 nucleocapsid protein (Roche Elecsys® Anti-
120 SARS-CoV-2). The sensitivity of the Roche assay is persistently high, even for more
121 than one year: that on 60 and 430 days after infection was reported as 99.5% and 97.1%,
122 respectively.²² A seropositive case was defined as a positive result on the Roche assay
123 (≥ 1.0 cutoff index). A history of COVID-19 included both (1) laboratory-confirmed
124 cases (diagnosed by a physician based on a polymerase chain reaction (PCR) or antigen
125 test) and (2) clinically-diagnosed cases without laboratory testing (symptoms

126 127 128 129 130 131

132

compatible with COVID-19 following close contact with a patient with COVID-19). In JIHS, the self-report of COVID-19 was verified against the in-house registry.

Undiagnosed cases were defined as the undiagnosed SARS-CoV-2 infection detected with an antibody test only. The proportion of undiagnosed cases was calculated by the formula below:

$$\begin{aligned}
 & \textit{Proportion of} \\
 & \textit{undiagnosed cases} = 1 - \frac{\text{Number of diagnosed cases}}{\text{Number of diagnosed cases} + \text{Number of undiagnosed cases}} \quad (1)
 \end{aligned}$$

133

134 **Background factors**

135 Factors include demographic characteristics (sex and age), occupational factors (job 136 category), and the location of each center (Tokyo or outside Tokyo), as these factors were 137 shown to be associated with SARS-CoV-2 infection²³. Age was classified into five groups: 138 <30, 30–39, 40–49, 50–59, or ≥60 years. Occupation was classified into six groups: doctor, 139 nurse, allied health professionals, administrative staff, researcher, or others. As for the 140 location of NCs, we classified centers as Tokyo (NCC, NCCHD, NCNP, and JIHS) or 141 non-Tokyo (NCGG and NCVC).

142

143 Because the degree of potential occupational exposure to SARS-CoV-2 and 144 vaccination status have changed throughout the pandemic, and the timing of infections in 145 relation to these events could not be determined, these factors were not included in the 146 analysis of associations. They were only included to describe the background 147 characteristics of the participants. Possible occupational exposure to SARS-CoV-2 was 148 assessed using the following two self-reported questions: “Have you ever engaged in 149 COVID-19-related work since January 2023?” and “Did you engage in any work in which 150 you were heavily exposed to SARS-CoV-2 since January 2023?”. Participants were 151 categorized into three groups as follows: low (not engaged in COVID-19-related work), 152 moderate (engaged in COVID-19-related work without heavy exposure to SARS-CoV-153 2), or

high (heavily exposed to SARS-CoV-2). The vaccination status was classified into 154 four groups: unvaccinated, 1–2 doses, 3 doses, ≥ 4 doses, or unknown.

155

156 ***Statistical analysis***

157 We calculated the following infection indicators for each period of the pandemic:
158 the number and proportion of diagnosed cases, seropositive cases, and cases with a prior
159 SARS-CoV-2 infection. We also calculated the proportion of undiagnosed cases among
160 the total cases. In association analysis, we estimated the prevalence ratio (PR) with a 95%
161 confidence interval (CI) using robust Poisson regression models. Model 1 was adjusted
162 for sex and age. Model 2 was additionally adjusted for job and location of NCs. We also
163 performed a sensitivity analysis categorizing NCs into three prefectural groups (Tokyo,
164 Osaka, or Aichi) to account for regional differences in prevalence. All statistical analyses
165 were performed with the Stata 18.0 software (Stata Corp LLP, College Station, TX, USA).
166

167 **Results**

168 As shown in **Table 1**, among participants of the fourth survey (June to September
169 2023), 73.1% of them were women, and 68.9% worked in Tokyo; major occupations were
170 nurses (35.7%), allied healthcare professionals (17.9%), physicians (13.9%),
171 administrative staff, and researchers (12.6%). A total of 14.5% worked in a COVID-19-
172 affiliated department, and 38.0% had a moderate or high risk of occupational exposure to
173 SARS-CoV-2. As regards vaccination, approximately 90% of the participants in the
174 survey of July 2021 completed the second dose before the survey, and more than 70% of
175 the participants in the survey of July 2022 completed the third dose. Approximately 70%
176 of the participants in the June to September 2023 survey completed the fourth dose of
177 vaccine before the period of the survey.

178 Cumulative infection was low before July 2021 (1.5% as of July 2021). The
179 proportion of cumulative infection slightly increased from 1.5% in the survey of July
180 2021 to 3.0% in January 2022; between these surveys, the Delta-predominant epidemic
181 occurred during the summer season (**Table 2; Figure 2**). The cumulative infection
182 showed a rapid increase after the emergence of Omicron variants; it increased to 14.6%
183 at surveys in July 2022 after the Omicron BA.1/2 predominant epidemic, 37.4% at
184 survey in December 2022 after the Omicron BA.5 predominant epidemic, and 53.3% at
185 surveys between June and September 2023 after the Omicron XBB variants epidemic,
186 71.5% at surveys in December after the Omicron JN.1 subvariant epidemic (**Table 2;**
187 **Figure 2**).

188 The proportion of undiagnosed cases among total infections showed a

189 decreasing trend over time, from 60.9% in December 2020 to 31.0% in the period
190 between June and September 2023. There was a temporal increase (52.4%) in July 2021
191 due to the Delta variant, followed by a downward trend during the epidemic of the
192 Omicron variant. Subgroup analyses by sex, age category, job category, and location of
193 NCs showed similar trends (**Figure S1–S4**). Participants aged 50 years or older showed
194 a lower proportion of cumulative infection than those under 50 (**Figure S2**).

195 **Table 3** shows the association between background factors and cumulative
196 SARS-CoV-2 infections as of September 2023. In a fully adjusted model (model 2),
197 people aged 50 to 59 years (PR: 0.73; 95% CI: 0.67–0.79) and 60 years or older (PR:
198 0.67; 95% CI: 0.59–0.77) had lower cumulative infections than those aged under 30
199 years old. Physicians (PR: 1.18; 95% CI: 1.08–1.30) and nurses (PR: 1.09; 95% CI:
200 1.01–1.18) had a slightly higher risk of cumulative infection than administrative staff.
201 These results remained virtually unchanged when NCs were categorized based on their
202 prefectural locations (Tokyo, Osaka, or Aichi) (**Supplementary Table 2**).

203

204 **Discussion**

205 Using data from repeated serosurveys of healthcare workers at national medical
206 research institutes in Japan, we confirmed a very low SARS-CoV-2 seroprevalence in
207 the early phase of the pandemic, followed by a sharp increase after the emergence of the
208 Omicron variants. By December 2023, it is estimated that more than 70% of workers
209 were infected with SARS-CoV-2. By September 2023, nearly one-third of infections
210 were undiagnosed, though this proportion has decreased throughout the pandemic. A
211 higher infection risk was observed among younger workers under 50 years old, as well
212 as physicians and nurses.

213

214 **Low seroprevalence in the early period**

215 The low seroprevalence observed in our study (<1% as of December 2020) is
216 consistent with findings from neighboring countries such as South Korea^{24,25} and
217 Taiwan^{26,27}, where healthcare workers also exhibited seroprevalence below 1% during the
218 early phase of the pandemic. It is worth noting that Japan experienced a much lower
219 infection rate among healthcare workers during this period compared to many other
220 countries. Specifically, the seroprevalence in our study is less than 1% as of December

221 2020, which was much lower than the seroprevalence among healthcare workers (8% as 222 of December 2020), estimated in a systematic review of studies in China, the USA, India, 223 and some European countries.²⁸ In the early pandemic period (as of 8 May 2020), a high 224 number of deaths among healthcare workers were documented in Italy (n=220), the 225 United States (n=202), and the United Kingdom (n=163), whereas no deaths due to 226 COVID-19 were reported among healthcare workers in Japan.²³ The much lower 227 infection and mortality in Japanese healthcare workers can be attributed to multiple 228 infection control measures adopted in hospitals since the early phase of the epidemic. 229 These include the provision of training for healthcare workers treating COVID-19 230 patients, personal protective equipment, universal masking, hand washing, routine 231 checking of workers' body temperature, PCR testing in case of suspected infection, and 232 periodic advisory e-mail messages to the workers.^{17,29,30} The present finding of a very low 233 seroprevalence in the early phase of the pandemic indirectly supports the effectiveness of 234 the infection prevention measures implemented to protect healthcare workers during that 235 period.

236

237 **Trend of seroprevalence**

238 Direct comparisons of seroprevalence between studies require caution. However, 239 the seroprevalence in our study since the emergence of the Omicron variant (14.6% in 240 July 2022, 37.4% in December 2022, and 53.3% between June and September 2023) is 241 comparable to that reported among healthcare workers at a university hospital in Tokyo 242 (17.7% in June 2022, and 54.1% in June 2023, measured using the Roche assay).¹¹ 243 Besides, the observed seroprevalence in our study was notably higher than those 244 serosurveys, using the Roche assay, conducted among the Japanese general population 245 across five prefectures (4.3% in February 2022³¹, 25.9% in December 2022, and 31.6% 246 in February 2023³²) and moderately higher than the seroprevalence observed among 247 blood donors of 47 prefectures (28.6% in November 2022)³³ and 22 prefectures (45.3% 248 in August 2023).³⁴ This higher seroprevalence among healthcare workers may be 249 explained by their greater chance of exposure to SARS-CoV-2 during the care of patients, 250 irrespective of COVID-19 status. Additionally, the highly transmissible nature of the 251 Omicron variant³⁵, along with its large proportion of asymptomatic or mildly 252 symptomatic cases^{4,36}, may have facilitated the spread of infection in healthcare settings.

253 It is thus essential to maintain preventive measures, such as routine health checks, good
254 hygiene practices, and universal masking in healthcare settings.

255

256 **Undiagnosed case trend**

257 The presence of a large number of asymptomatic infections or infections with
258 mild symptoms is an important feature of COVID-19 and explains its widespread
259 infection across the community. In the present study population, the proportion of
260 undiagnosed cases, which was high in the early phase of the pandemic (58.3%), showed
261 a decreasing trend over time, reaching 31% in September 2023 and 24.7% in December
262 2023. This could be due, at least in part, to the improved access to and availability of
263 diagnostic tests for the workers, including a self-testing program using antigen test kits.

264

265 Physicians and nurses had a higher risk of SARS-CoV-2 infection compared with
266 other occupations. This finding is consistent with previous studies among healthcare
267 workers in England and Wales³⁷ and Italy³⁸ during the Omicron period. In our analysis,
268 the association did not materially change after controlling for potential occupational
269 exposure to SARS-CoV-2. One plausible explanation is that physicians and nurses have
270 a greater chance of exposure to the virus through direct and closer contact with patients
271 who were hospitalized due to health problems other than COVID-19, some of whom
272 might have asymptomatic SARS-CoV-2 infection. Additionally, our data showed that the
273 proportion of individuals with a high degree of possible occupational exposure was
274 markedly higher among physicians (37.6%) and nurses (47.6%) than among other
275 occupational groups (0.5% to 2.4%), further supporting this interpretation. More effort
276 should be placed on the protection of healthcare workers against nosocomial infections.

277

278 We found that people aged 50 years and older were less likely to be infected than
279 those under 50. This finding is comparable to the results of a serosurvey study conducted
280 from July through August 2023 among the general population of Japan.³⁴ The lower
281 prevalence of infection among older adults may be due to their greater adherence to
282 recommended protective practices against infection (e.g., wearing masks, maintaining
283 good hygiene, and practicing social distancing). In our previous 2020 JIHS study³⁹,
284 adherence to infection prevention practices increased with age. The ORs for good

285 adherence were 1.00 (reference), 1.33, 1.63, and 2.53 for those aged <30 years, 30 to 39
286 years, 40 to 49 years, and ≥ 50 years, respectively. Taken together, more attention should
287 be directed toward younger healthcare workers during periods when viruses with high
288 transmission potential are circulating widely.

289

290 The strengths of the present multicenter study include its large sample size and
291 its repeated antibody measurements spanning the early period of the pandemic through
292 the Omicron variant era. However, we should also acknowledge the study's limitations.
293 First, information on the history of COVID-19 was obtained via self-report, which is
294 subject to recall bias. Nevertheless, the majority of individuals with a history of COVID-
295 19 were seropositive. For example, 78% of diagnosed cases were seropositive in
296 December 2020, and this proportion increased to 89% by December 2023. Therefore,
297 reporting error is unlikely to strongly influence our findings. Second, participation rates
298 in the current study varied by center and survey year. However, differences in
299 seroprevalence among centers within each fiscal year were small (**Supplementary Table**
300 **3**). Thus, the possibility of bias due to selective participation in the study is likely minimal.
301 Third, we used complete-case analysis for the risk factor analysis. However, missing data
302 were few (1.0%), so any potential bias introduced by this exclusion would be negligible.
303 Finally, this study was conducted on individuals employed at national medical research
304 institutions that specialize in specific clinical fields. Thus, the current results may not
305 apply to medical professionals working at general clinics and hospitals.

306

307 **Conclusions**

308 Among the workers of 6 national medical research centers in Japan, cumulative
309 SARS-CoV-2 infections (including undiagnosed cases), which were very low in the early
310 period of the pandemic, dramatically increased after the emergence of the Omicron
311 variant. A sizable portion of the infections were undiagnosed, though this proportion
312 decreased over time. Younger healthcare workers under 50, as well as physicians and
313 nurses, were at a higher risk of SARS-CoV-2 infection than their counterparts during the
314 pandemic.

315

316 **Author contributions**

317 ZI and YL conceptualized, conducted statistical analyses and interpretation of
318 results, and drafted and revised the manuscript. SY was involved in conceptualization,
319 data analysis, interpretation of results, writing, review, and editing. KY, KT, KN, and MI
320 were involved in conceptualization, project administration, and funding acquisition. All
321 the authors were involved in data curation, writing, review, and editing, provided
322 substantive feedback, and approved the final version of the manuscript. T. Mizoue was
323 involved in conceptualization, supervision, interpretation of results, writing, review and
324 editing, project administration, and funding acquisition.

325

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330

331 **Declaration of Conflicting Interests:** The authors declare no conflicts of interest.

332

333 **Data availability statement**

334 The data underlying this article cannot be shared publicly due to ethical
335 restrictions and participant confidentiality concerns, but de-identified data are available
336 from Dr. Mizoue (Department of Epidemiology and Prevention, Center for Clinical
337 Sciences, Japan Institute for Health Security, Tokyo, Japan) to qualified researchers on
338 reasonable request.

339

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342

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Figure 1. Change in the number of newly confirmed COVID-19 cases in Japan (Panel A): until April 2023, the data represent all reported COVID-19 cases nationwide; from May 2023 onward, the data represent the weekly number of reported cases per sentinel, based on Japan’s national sentinel surveillance system, which monitors infectious disease trends through a network of selected medical institutions. Panel B shows the timeline of antibody surveys among workers of the 6 national centers during the pandemic (orange colored cell indicates the timeline for additional surveys). Abbreviations: NCC: National Cancer Center; NCCHD: National Center for Child Health and Development; NCGG: National Center for Geriatrics and Gerontology; JIHS: Japan Institute for Health Security; NCNP: National Center of Neurology and Psychiatry; NCVC: National Cerebral and Cardiovascular Center. *Blue-colored cells indicate the availability of N antibody data from NCs according to the survey timing. Yellow-colored cells represent the availability of N antibody data from additional sero-surveys. Red-colored cell indicates that this center was not included in the period 3 analysis, as it lacked data on N antibodies. †It was not possible to define any time period for the 5th wave because no serosurvey was conducted in relation to it.

Table 1. Characteristics of the study participants in each time point during the COVID-19 pandemic

	Survey timing							
	Dec. 2020	Feb. 2021	Jul. 2021	Jan. 2022	Jul. 2022	Dec. 2022	Sep. 2023	Dec. 2023
Total	3,762	1,462	4,170	2,087	6,631	2,046	6,287	1,651
Location of the centers, N (%)								
Tokyo	2,563 (68.1)	805 (55.1)	3,370 (80.8)	948 (45.4)	4,619 (69.7)	1,677 (82.0)	4,333 (68.9)	1,651 (100)
Outside Tokyo	1,199 (31.9)	657 (44.9)	800 (19.2)	1,139 (54.6)	2,012 (30.3)	369 (18.0)	1,954 (30.1)	0
Sex, N (%)								
Men	1,147 (30.4)	387 (26.5)	1,209 (29.0)	574 (27.5)	1,804 (27.2)	547 (26.7)	1,650 (26.2)	458 (27.7)
Women	2,581 (68.6)	1,074 (73.4)	2,936 (70.4)	1,406 (67.4)	4,789 (72.2)	1,494 (73.0)	4,591 (73.1)	1,192 (72.2)
Missing	34 (1.0)	1 (0.1)	25 (0.6)	107 (5.1)	38 (0.6)	5 (0.3)	46 (0.7)	1 (0.1)
Age, N (%)								
<30 year	1,044 (27.7)	252 (17.2)	1,137 (27.3)	701 (33.6)	1,828 (27.6)	539 (26.3)	1,605 (25.5)	506 (30.6)
30–39 years	925 (24.6)	380 (26.0)	1,034 (24.8)	560 (26.8)	1,683 (25.4)	473 (23.1)	1,468 (23.4)	366 (22.2)
40–49 years	943 (25.1)	460 (31.5)	1,054 (25.2)	416 (19.9)	1,581 (23.8)	517 (25.3)	1,561 (24.8)	358 (21.7)
50–59 years	613 (16.3)	293 (20.0)	693 (16.6)	243 (11.6)	1,135 (17.1)	374 (18.3)	1,192 (19.1)	281 (17.0)
≥60 years	198 (5.3)	75 (5.1)	220 (5.3)	59 (2.8)	360 (5.4)	140 (6.8)	425 (6.8)	138 (8.4)
Missing	39 (1.0)	2 (0.1)	32 (0.8)	108 (5.2)	44 (0.7)	3 (0.2)	0 (0.0)	2 (0.1)
Occupation, N (%)								
Physician	523 (13.9)	174 (11.9)	572 (13.7)	253 (12.1)	973 (14.7)	282 (13.8)	916 (14.6)	238 (14.4)
Nurse	1,343 (35.7)	467 (31.9)	1,403 (33.6)	1,004 (48.1)	2,406 (36.3)	728 (35.5)	2,148 (34.2)	611 (37.0)
Allied healthcare	674 (17.9)	230 (15.7)	694 (16.6)	311 (14.9)	1,045 (15.8)	262 (12.8)	970 (15.4)	249 (15.1)

Administrative staff	518 (13.8)	256 (17.5)	582 (14.0)	139 (6.7)	892 (13.4)	351 (17.2)	964 (15.3)	242 (14.7)
Researcher	473 (12.6)	299 (20.4)	675 (16.2)	229 (11.0)	946 (14.3)	324 (15.8)	964 (15.3)	238 (14.4)
Other	185 (4.9)	35 (2.4)	203 (4.9)	36 (1.7)	301 (4.5)	96 (4.7)	278 (4.4)	71 (4.3)
Missing	46 (1.2)	1 (0.1)	41 (1.0)	115 (5.5)	68 (1.0)	3 (0.2)	47 (0.8)	2 (0.1)
Degree of possible occupational exposure to SARS-CoV-2, N (%)								
Low	1,777 (47.2)	934 (63.9)	2,349 (56.3)	1,000 (47.9)	3,905 (58.9)	1,135 (55.5)	3,855 (61.3)	1,010 (61.2)
Moderate	1,251 (33.2)	363 (24.8)	1,160 (27.8)	537 (25.7)	1,601 (24.1)	537 (26.3)	1,371 (21.8)	362 (21.9)
High	688 (18.3)	164 (11.2)	611 (14.6)	443 (21.2)	1,071 (16.1)	371 (18.1)	1,020 (16.2)	277 (16.8)
Missing	46 (1.2)	1 (0.1)	50 (1.2)	107 (5.1)	54 (0.8)	3 (0.2)	41 (0.7)	2 (0.1)
Vaccination, N (%)								
Unvaccinated	--	--	274 (6.6)	42 (2.0)	118 (1.8)	37 (1.8)	116 (1.9)	20 (1.2)
1–2 doses	--	--	3,721 (89.2)	1,266 (60.7)	307 (4.6)	82 (4.0)	248 (3.9)	48 (2.9)
3 doses	--	--	--	315 (15.1)	5,850 (88.2)	588 (28.7)	1,351 (21.5)	392 (23.7)
≥4 doses	--	--	--	--	146 (2.2)	1,312 (64.1)	4,388 (69.8)	1,149 (69.6)
Missing	--	--	175 (4.2)	464 (22.2)	210 (3.2)	27 (1.3)	184 (2.9)	42 (2.5)

*The vaccination status of NCVC and NCNP was not available in the surveys between December 2021 and January 2022. Regarding the location of the centers, Tokyo includes 4 centers (NCC, NCCHD, NCNP, and JIHS); outside Tokyo includes 2 centers (NCGG and NCVC).

NCC: National Cancer Center; NCCHD: National Center for Child Health and Development; NCGG: National Center for Geriatrics and Gerontology; JIHS: Japan Institute for Health Security; NCNP: National Center of Neurology and Psychiatry; NCVC: National Cerebral and Cardiovascular Center.

Table 2. Trends in infection indicators during the COVID-19 pandemic among workers of 6 national centers

	Survey timing							
	Dec. 2020	Feb. 2021	Jul. 2021	Jan. 2022	Jul. 2022	Dec. 2022	Sep. 2023	Dec. 2023
Participants, N	3,762	1,462	4,170	2,087	6,631	2,046	6,287	1,651
Diagnosed case, N (%)	9 (0.2)	10 (0.7)	30 (0.7)	31 (1.5)	527 (8.0)	567 (27.7)	2312 (36.8)	889 (53.9)
Seropositive case, N(%)	21 (0.6)	18 (1.2)	62 (1.5)	62 (3.0)	943 (14.2)	724 (35.4)	3114 (49.5)	1080 (65.4)
Total case, N(%)	23 (0.6)	19 (1.3)	63 (1.5)	64 (3.1)	965 (14.6)	766 (37.4)	3353 (53.3)	1180 (71.5)
Undiagnosed case^a, %	60.9	47.4	52.4	51.6	45.4	26.0	31.0	24.7
Ratio of total cases to diagnosed cases	2.5	1.9	2.1	2.1	1.8	1.4	1.5	1.3

^aProportion of undiagnosed cases (seropositive only) among total cases.

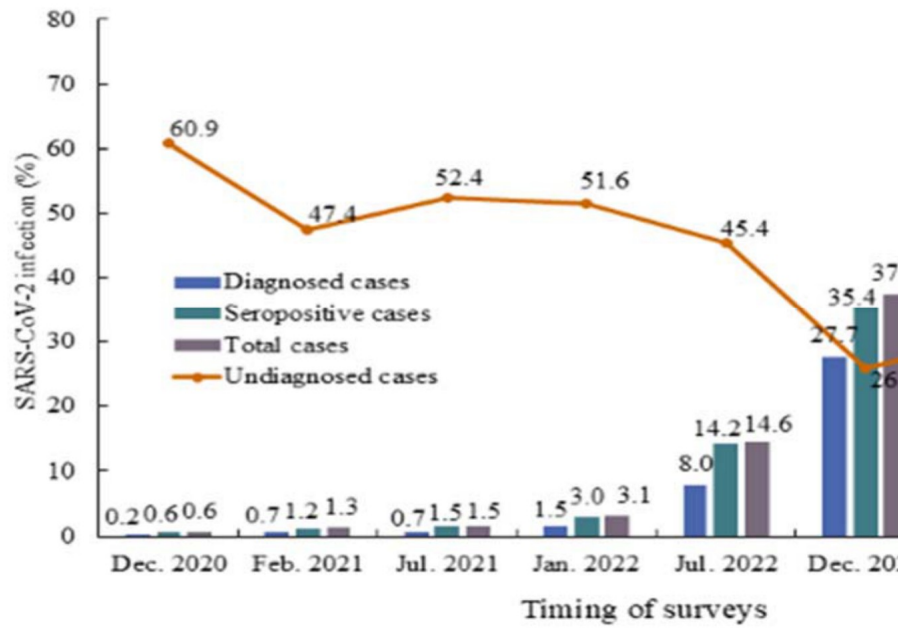


Figure 2. Trends in SARS-CoV-2 cumulative infection (%) and undiagnosed cases (%) among workers of the 6 national centers in Japan.

Table 3. Robust Poisson regression for the association between background factors and SARS-CoV-2 infection among the workers of 6 national centers in June/July/September 2023

	No. of participants	Cumulative infection, n (%)	Undiagnosed case, n (%)	PR (95% CI)	
				Model 1	Model 2
Total	6,221	3,317 (53.3)	1,015 (30.6)		
Sex					
Men	1,641	882 (53.7)	304 (34.5)	Ref.	Ref.
Women	4,580	2,435 (53.2)	711 (29.2)	0.97 (0.92 - 1.02)	0.99 (0.94 - 1.05)
Age, year					
<30	1,597	929 (58.2)	307 (33.0)	Ref.	Ref.
30–39	1,452	853 (58.8)	239 (28.0)	1.01 (0.95 - 1.07)	1.01 (0.95 - 1.08)
40–49	1,557	878 (56.4)	253 (28.8)	0.97 (0.91 - 1.03)	0.98 (0.92 - 1.04)
50–59	1,190	494 (41.5)	151 (30.6)	0.71 (0.66 - 0.77)	0.73 (0.67 - 0.79)
≥60	425	163 (38.4)	65 (39.9)	0.66 (0.58 - 0.74)	0.67 (0.59 - 0.77)
Occupation					
Physician	910	551 (60.6)	181 (32.81)	1.18 (1.08 - 1.30)	1.18 (1.08 - 1.30)
Nurse	2,141	1,217 (56.8)	357 (29.3)	1.09 (1.01 - 1.18)	1.09 (1.01 - 1.18)
Allied health professional	9,68	472 (48.8)	111 (23.5)	0.96 (0.87 - 1.05)	0.96 (0.87 - 1.05)
Administrative staff	964	451 (46.8)	135 (27.7)	Ref.	Ref.
Researcher	962	495 (51.5)	178 (36.0)	1.06 (0.97 - 1.16)	1.06 (0.97 - 1.16)
Other	276	131 (47.5)	53 (40.4)	1.04 (0.91 - 1.20)	1.04 (0.91 - 1.20)
Location of the center					
Outside Tokyo	1,587	835 (52.6)	287 (34.4)	Ref.	Ref.

Tokyo	4,634	2,482 (53.6)	728 (29.3)	1.03 (0.98 - 1.09)	1.03 (0.97 - 1.08)
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Model 1 was adjusted for age and sex. Model 2 was additionally adjusted for job (physician, nurse, allied health professional, administrative staff, researcher, or others) and location of NCs (Tokyo or outside Tokyo).

PR: prevalence ratio; CI: confidence interval. Regarding the site, Tokyo includes 4 centers (NCC, NCCHD, NCNP, and JIHS); outside Tokyo includes 2 centers (NCGG and NCVC).

NCC: National Cancer Center; NCCHD: National Center for Child Health and Development; NCGG: National Center for Geriatrics and Gerontology; JIHS: Japan Institute for Health Security; NCNP: National Center of Neurology and Psychiatry; NCVC: National Cerebral and Cardiovascular Center.