



Article

Prospective Cohort Study of Sociodemographic and Work-Related Factors and Subsequent Unemployment under COVID-19 Pandemic

Makiko Kuroishi ^{1,*}, Tomohisa Nagata ^{1,*}, Ayako Hino ², Seiichiro Tateishi ³, Akira Ogami ⁴, Mayumi Tsuji ⁵, Shinya Matsuda ⁶, Koji Mori ¹, Yoshihisa Fujino ⁷ and on behalf of the CORoNaWork Project [†]

¹ Department of Occupational Health Practice and Management, Institute of Industrial Ecological Sciences, University of Occupational and Environmental Health, Kitakyushu 807-8555, Japan; mim.kuro@gmail.com (M.K.); kmori@med.uoeh-u.ac.jp (K.M.)

² Department of Mental Health, Institute of Industrial Ecological Sciences, University of Occupational and Environmental Health, Kitakyushu 807-8555, Japan; ayako-hino@med.uoeh-u.ac.jp

³ Disaster Occupational Health Center, Institute of Industrial Ecological Sciences, University of Occupational and Environmental Health, Kitakyushu 807-8555, Japan; tateishi@med.uoeh-u.ac.jp

⁴ Department of Work Systems and Health, Institute of Industrial Ecological Sciences, University of Occupational and Environmental Health, Kitakyushu 807-8555, Japan; gamisan@med.uoeh-u.ac.jp

⁵ Department of Environmental Health, School of Medicine, University of Occupational and Environmental Health, Kitakyushu 807-8555, Japan; tsuji@med.uoeh-u.ac.jp

⁶ Department of Preventive Medicine and Community Health, School of Medicine, University of Occupational and Environmental Health, Kitakyushu 807-8555, Japan; smatsuda@med.uoeh-u.ac.jp

⁷ Department of Environmental Epidemiology, Institute of Industrial Ecological Sciences, University of Occupational and Environmental Health, Kitakyushu 807-8555, Japan; zenq@med.uoeh-u.ac.jp

* Correspondence: tomohisa@med.uoeh-u.ac.jp

† Membership of The CORoNaWork Project is provided in the Acknowledgments.



Citation: Kuroishi, M.; Nagata, T.; Hino, A.; Tateishi, S.; Ogami, A.; Tsuji, M.; Matsuda, S.; Mori, K.; Fujino, Y.; on behalf of the CORoNaWork Project. Prospective Cohort Study of Sociodemographic and Work-Related Factors and Subsequent Unemployment under COVID-19 Pandemic. *Int. J. Environ. Res. Public Health* **2022**, *19*, 6924. <https://doi.org/10.3390/ijerph19116924>

Academic Editor: Ivo Iavicoli

Received: 18 April 2022

Accepted: 3 June 2022

Published: 6 June 2022

Publisher's Note: MDPI stays neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Copyright: © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (<https://creativecommons.org/licenses/by/4.0/>).

Abstract: The previous studies found that women and low-income households were more likely to experience unemployment prior to the COVID-19 pandemic. However, there is no cohort study to examine the relationship during the COVID-19 pandemic. The aim of this prospective cohort study is to examine the relationship between sociodemographic factors and unemployment during the COVID-19 pandemic in Japan. We surveyed the socioeconomic status, personal characteristics, and occupation of recruited workers at baseline (22–25 December 2020); subsequent unemployment was examined at follow-up (18–19 February 2021). We determined the odds ratio of unemployment by sociodemographic status and occupation. The multivariate model was adjusted for sex and age. Among the 19,941 participants, 725 (3.6%) had experienced unemployment. Multivariate analysis showed significant high unemployment amongst women and participants of younger age, bereaved or divorced, unmarried, of lower income, or with short educational background. By occupation, the unemployment rate of temporary or contract employees and self-employed is high. COVID-19 expelled socially vulnerable groups from employment. This suggests the need for employment and economic support for such individuals.

Keywords: sociodemographic factors; socioeconomic status; unemployment; COVID-19; Japan

1. Introduction

Unemployment is associated with a substantial risk of poor physical and mental health. It has consistently been shown to be significantly associated with increases in chronic heart disease, acute myocardial infarction, poor mental health, mental disorders, substance-related disorders, and suicide [1–3]. Unemployment is an important factor with

regard to public health: it poses a health risk for individuals; it also leads to family poverty and, ultimately, constitutes a burden on social security.

COVID-19 has spread around the world and continues to exert a profound impact on global economies. Economic activities have changed drastically as a result: people have refrained from travel and outside eating, drinking, and entertainment; they are encouraged to stay at home. The resulting unemployment has become a major concern: according to the Organization for Economic Co-operation and Development (OECD), countries' unemployment rates rose significantly around the same time as the outbreak of COVID-19 [4]. In this regard, Japan's unemployment rate appears to have remained relatively low—around 3%. However, official data on the unemployment rate may be underestimated, as it is defined as “people looking for work”. Data for Japan clearly show a marked decline in the number of people in employment and a fall in household income [5,6].

With disasters and crises in the past, the risk of unemployment was found to be particularly high among socially vulnerable groups [7]. The OECD has identified young people, women, middle-aged and older individuals, and migrants as vulnerable groups in the labor market [8]. Those workers are also reported to be more likely to leave the labor force owing to unemployment, disability, or economic inactivity [9]. By contrast, civil servants, teachers, and employees of non-profit organizations in Japan have been found to have lower turnover rates and greater job security [10].

It is assumed that individual sociodemographic status is still significantly associated with unemployment during COVID-19. A cross-sectional study conducted in the United States examined adverse outcomes associated with COVID-19 and the country's stay-home policies. It found that African Americans, Hispanics, women, and low-income households were more likely to experience unemployment, food insecurity, mental health problems, poor access to health care, and rent or mortgage delinquency [11]. However, there is no prospective cohort study of the relationship between sociodemographic status and unemployment among the Japanese during COVID-19, which is unclear.

It is important that we conducted a prospective cohort study in Japan. First, evidence from longitudinal studies regarding the COVID-19 pandemic does not exist. Second, Japan has never in the past taken measures equivalent to a blockade, even in the case of a new strain of influenza. This is the first time that strong social measures have been taken to combat infectious diseases, and it is unclear what factors are associated with unemployment under the pandemic in Japan.

The hypothesis is that the economically vulnerable are presumed to be more likely to be unemployed. The purpose of this study is to examine the association between the sociodemographic factors of workers and unemployment by means of a prospective cohort during the COVID-19 pandemic in Japan.

2. Materials and Methods

The Methods section describes the study design, data collection and statistical analysis.

2.1. Study Design

This prospective cohort study about COVID-19 among Japanese workers was conducted under the Collaborative Online Research on the Novel-coronavirus and Work (CORoNaWork) Project. Details of the study protocol are described elsewhere [12]. Briefly, we administered a baseline questionnaire on 22–25 December 2020 and a follow-up questionnaire on 18–19 February 2021, when Japan was in its third pandemic wave. This pandemic wave was larger than the previous first and second waves in Japan.

For the baseline survey, we recruited 33,087 workers throughout Japan from 605,381 randomly selected panelists registered with an Internet survey company. The inclusion criteria for participants were being currently employed and aged 20–65 years. Survey items included basic socio-demographic characteristics such as family structure, income, education, place of residence, place of work, and work environment, with 43 questions in

the first round and 23 questions in the second round [12]. We applied cluster sampling with stratification by sex, job type, and region. We excluded 6051 invalid responses owing to the following: response time < 6 min; body weight < 30 kg; height < 140 cm; inconsistent answers to similar questions; and incorrect answers to questions intended to identify fraudulent responses. We distributed the follow-up questionnaire to the 27,036 people with valid responses to the baseline questionnaire. In total, 19,941 participants completed both questionnaires (follow-up rate, 73.8%). Among the participants, the combined number of close contacts and infected persons was 295 (1.5%). The specifics of the questionnaire are provided in Appendix A.

This study was approved by the Ethics Committee of the University of Occupational and Environmental Health, Japan (reference nos. R2-079 and R3-006). Informed consent was obtained from all participants.

2.2. Data Collection

We retrieved the following data from the baseline survey for inclusion as explanatory variables: age; sex; marital status; sociodemographic status (based on annual household income and education); occupation; and job type. We categorized age into the following five groups: 20–29; 30–39; 40–49; 50–59; and ≥ 60 years. Marital status was classified into four groups: married (working spouse); married (spouse not working); divorced or widowed; and never married. Annual household income was classified into the following six groups: under 2 million; 2–4 million; 4–6 million; 6–8 million; 8–10 million; and >10 million yen. We categorized education into five groups: up to junior high school; up to high school; up to junior college or technical school; up to university; and graduate school. We categorized occupation into seven groups: general employee; manager; executive manager; public employee, faculty member, or non-profit organization employee; temporary or contract employee; self-employed; and other. Job type was classified into three categories: mainly desk work; work mainly involving interpersonal communication; and mainly manual or physical labor.

We ascertained unemployment as follows. First, the baseline survey included only people who were employed at the time of response. In the follow-up survey, in answer to the question “Have you changed your place of work since December 2020?” respondents were asked to select one of the following six options: “no change”; “I was transferred to another company”; “I resigned and got a new job right away”; “I stopped working and was unemployed for a while but am now working”; “I stopped working and started a business (e.g., managing a company, running a sole proprietorship, or engaging in self-employment)”; and “I stopped working and am not currently working (including job seeking)”. We defined unemployment as participants choosing one of the following: “I resigned and got a new job right away”; “I stopped working and was unemployed for a while but am now working”; “I stopped working and started a business (e.g., managing a company, running a sole proprietorship, or engaging in self-employment)”; or “I stopped working and am not currently working (including job seeking)”.

2.3. Statistical Analysis

We determined the odds ratios (ORs) of unemployment for sociodemographic status and occupation using a multilevel logistic model for the prefecture of residence. The multivariate model was adjusted for sex and age. We undertook a trend test by conducting the analysis using age, annual household income, and education as continuous variables. We also used the incidence rate of COVID-19 by prefecture as a prefecture-level variable. The multilevel analysis was performed nested by the incidence rate of COVID-19. We considered *p* values under 0.05 statistically significant. All analyses were conducted using Stata (Stata Statistical Software release SE16.1; StataCorp LLC, College Station, TX, USA).

3. Results

The Results section describes the characteristics of the participants and sociodemographic factors and unemployment.

3.1. The Characteristics of the Participants

The characteristics of the respondents appear in Table 1. There were 11,170 men in the sample, accounting for 56% of the total. The mean age was 48.0 years. In total, married workers were 11,185 (66%) and 8880 (45%) workers had graduated from university. The majority of occupation were general employee (46%) and that of job type were desk workers (52%).

Table 1. The characteristics of the participants.

	N (%)
Number of subjects	19,941
Sex, Men	11,170 (56.0%)
Age	
20–29	1055 (5.3%)
30–39	3218 (16.1%)
40–49	5929 (29.7%)
50–59	7095 (35.6%)
60–	2644 (13.3%)
Marital status	
married (spouse is working)	8125 (40.7%)
married (spouse is not working)	3060 (15.3%)
bereaved/divorced	2036 (10.2%)
unmarried	6720 (33.7%)
Annually household income (million JPY)	
<2	1288 (6.5%)
≥2 and <4	3989 (20.0%)
≥4 and <6	4772 (23.9%)
≥6 and <8	3967 (19.9%)
≥8 and <10	2629 (13.2%)
≥10	3296 (16.5%)
Education	
Junior high or high school	5360 (26.9%)
Vocational school, junior college or technical school	4585 (23.0%)
University	8880 (44.5%)
Graduate School	1116 (5.6%)
Occupation	
general employee	9098 (45.6%)
manager	2088 (10.5%)
executive manager	691 (3.5%)
public employee, faculty member, or non-profit organization employee	2010 (10.1%)
temporary or contract employee	2109 (10.6%)
self-employed	1737 (8.7%)
others	2208 (11.1%)
Jobtype	
mainly desk work	10,268 (51.5%)
jobs mainly involving interpersonal communication	4937 (24.8%)
mainly manual or physical labor	4736 (23.8%)

3.2. Sociodemographic Factors and Unemployment

Table 2 shows the associations of sociodemographic status (including occupation) with unemployment: 725 (3.6%) workers had experienced unemployment.

Table 2. The association between sociodemographic, work-related factors, and unemployment.

	Total	Unemployment Rate	Non-Adjusted				Age-Sex-Adjusted *				
	N	%	OR	95% CI		p Value	OR	95% CI		p Value	
Total	19,941	3.6									
Sex											
Men	11,170	2.9	reference				reference				
Women	8771	4.6	1.62	1.40	1.88	<0.001	1.35	1.14	1.60	<0.001	
Age											
20–29	1055	8.1	reference				<0.001 †	reference			
30–39	3218	5.2	0.62	0.47	0.81	0.001	0.64	0.49	0.84	<0.001	
40–49	5929	3.1	0.36	0.28	0.47	<0.001	0.40	0.31	0.53	<0.001	
50–59	7095	2.9	0.33	0.26	0.43	<0.001	0.39	0.30	0.52	<0.001	
60–	2644	3.4	0.40	0.29	0.54	<0.001	0.49	0.35	0.67	<0.001	
Marital status											
married (spouse is working)	8125	2.8	reference				reference				
married (spouse is not working)	3060	3.2	1.14	0.90	1.46	0.279	1.33	1.03	1.71	0.028	
bereaved/divorced	2036	5.5	2.03	1.61	2.56	<0.001	2.09	1.65	2.64	<0.001	
unmarried	6720	4.3	1.56	1.31	1.86	<0.001	1.29	1.07	1.56	0.007	
Annually household income (million JPY)						<0.001 †				<0.001 †	
<2	1288	9.1	4.35	3.23	5.86	<0.001	4.05	3.00	5.46	<0.001	
≥2 and <4	3989	5.2	2.38	1.82	3.12	<0.001	2.12	1.62	2.78	<0.001	
≥4 and <6	4772	3.5	1.57	1.19	2.06	0.001	1.46	1.11	1.93	0.008	
≥6 and <8	3967	2.5	1.13	0.84	1.53	0.421	1.06	0.78	1.44	0.699	
≥8 and <10	2629	2.2	0.98	0.69	1.38	0.892	0.94	0.66	1.32	0.709	
≥10	3296	2.3	reference				reference				
Education						0.025 †				0.011 †	
Junior high or high school	5360	3.7	1.77	1.15	2.72	0.009	1.73	1.12	2.66	0.013	
Vocational school, junior college, or technical school	4585	4.3	2.07	1.35	3.19	0.001	1.83	1.19	2.83	0.006	
University	8880	3.5	1.64	1.08	2.50	0.021	1.50	0.98	2.28	0.060	
Graduate School	1116	2.2	reference				reference				
Occupation											
general employee	9098	3.5	reference				reference				
manager	2088	1.7	0.46	0.33	0.66	<0.001	0.59	0.41	0.85	0.005	
executive manager	691	2.3	0.65	0.39	1.08	0.096	0.84	0.50	1.40	0.499	
public employee, faculty member, or non-profit organization employee	2010	1.8	0.52	0.37	0.74	<0.001	0.56	0.40	0.79	0.001	
temporary or contract employee	2109	6.5	1.92	1.56	2.36	<0.001	2.01	1.63	2.48	<0.001	
self-employed	1737	3.9	1.10	0.84	1.44	0.472	1.35	1.02	1.78	0.035	
others	2208	5.1	1.47	1.18	1.84	<0.001	1.47	1.18	1.84	<0.001	
Jobtype											
mainly desk work	10,268	2.9	reference				reference				
jobs mainly involving interpersonal communication	4937	3.8	1.34	1.11	1.62	0.002	1.25	1.04	1.51	0.018	
mainly manual or physical labor	4736	5.1	1.83	1.53	2.17	<0.001	1.85	1.55	2.21	<0.001	

The multilevel analysis was performed nested by the incidence rate of COVID-19 by prefecture as a prefecture-level variable. * Sex category was calculated for adjusted by age, and age category was calculated for adjusted by sex. † *p* for trend.

Multivariate analysis showed that the OR of unemployment associated with sex was 1.35 (95% confidence interval [CI], 1.14–1.60) for women compared with men. With increasing age, the OR for unemployment was lower: OR, 0.98; 95% CI, 0.97–0.99; $p < 0.001$, adjusted for sex. The respective OR and 95% CI figures for the association with marital status were as follows: 1.33 (1.03–1.71) for being married (spouse not working); 2.09 (1.65–2.64) for being bereaved or divorced; and 1.29 (1.07–1.56) for being unmarried, compared with being married (spouse working). The respective figures for the association with annual household income were as follows: 4.05 (3.00–5.46) for <2 million yen; 2.12 (1.62–2.78) for 2–4 million yen; and 1.46 (1.11–1.93) for 4–6 million yen, compared with >10 million yen. The respective figures for the association with education were as follows: 1.73 (1.12–2.66) for junior high or high school and 1.83 (1.19–2.83) for vocational school, junior college, or technical school. The respective figures for the association with occupation were as follows: 2.01 (1.63–2.48) for temporary or contract employees and 1.35 (1.02–1.78) for being self-employed, compared with general employees, while the figures were 0.56 (0.40–0.79) for public employees, faculty members, or non-profit organization employees. The respective figures for the association with job type were 1.25 (1.04–1.51) for jobs mainly involving interpersonal communication and 1.85 (1.55–2.21) for mainly manual or physical labor, compared with mainly desk work.

4. Discussion

Through a cohort study, this investigation examined the association between sociodemographic factors and subsequent unemployment during COVID-19. Under the pandemic of COVID-19, we found that unemployment was associated with sociodemographic factors such as age, sex, marriage, income, education, and occupation.

We observed that the risk of unemployment was highest among young people. International Labour Organization (ILO) has reported that worldwide, young people were subjected to the greatest loss of labor opportunities through COVID-19: in 2020, young workers suffered 9.1% job losses compared with 2.6% for adults [13]. The present study conducted in Japan similarly found that young people were more than twice as likely to be unemployed as middle-aged and older workers. This could have been due to the fact that the accommodation and service industry as well as the food and beverage industry (which were most affected by COVID-19) had more young casual workers than other industries [5,14]. In addition, even before the pandemic, there was a high turnover rate of young people in Japan. The turnover rate within 3 years of graduating from university and entering the workforce was around 30% in 2021 [15]. This is thought to be due to their transition from school to work and still looking for the right job.

By occupation and job type, we found the unemployment rate to be higher among temporary and contract workers and manual laborers. Japan's Labour Force Survey reported that the number of non-regular workers in the country fell sharply under COVID-19 [5]. Many temporary and contract workers were employed in lifestyle-related industries, travel, and entertainment services, which were heavily affected by the pandemic [16,17]. Temporary and contract workers are thought to be used to adjust employment and our results clearly confirm this.

We found that women were more likely to be unemployed than men. Prior to the COVID-19 pandemic, the OECD has stated that women are also more vulnerable in society [8]. On the other hand, under the COVID-19 pandemic, a previous study revealed that women were less likely than men to leave their jobs [11]. That previous study calculated odds ratios adjusted for age, education, marital status, and number of individuals in the household, whereas our study is an odds ratio adjusted for age only. In our present study, we found that 14.7% of women (compared with 7.4% of men) were in informal employment, and this may have led to the tendency for women to leave the workforce. Japan's Labour Force Survey during COVID-19 observed a gender difference in the decline in the number of people in employment: women were more likely to be unemployed [5]. The 2021 survey

reported that 68% of people in informal employment were women; many of them worked in the accommodation, catering, and lifestyle-related service industries [5].

The unemployment rate was also significantly higher for divorced or bereaved people than with dual-earner households. In economic terms, marriage is held to be a rational behavior that seeks economic gain [18,19]. It has long been pointed out that low-income earners and those with unstable employment are less likely to get married [20,21]. The unmarried participants with their precarious employment situation may become unemployed owing to the pandemic. Moreover, if the divorced or bereaved had a child, it is possible that they were forced to leave the workplace due to school or after-school care leave, because of school closures related to the pandemic [22].

With regard to income and education, we observed that the lower the income and lower the education, the greater was the likelihood of unemployment. It is widely known that such socially vulnerable groups are at higher risk of unemployment [7,9,23]; we found a similar trend during COVID-19. The impact of unemployment on the lives of those with lower incomes is accordingly greater, and they constitute the group in highest need of social support.

Previous studies have shown that people of lower sociodemographic status are more likely to face difficulties in the event of a pandemic. However, much of the research has focused on the higher risk of contracting infectious diseases and, as a result, being more likely to face problems such as healthcare costs and unemployment [7,24–27]. Khanijahani et al. have issued a systematic review of health inequalities by COVID-19 on morbidity and mortality [28]. Socially vulnerable groups have higher morbidity and mortality. However, it is not only whether a person has an infectious disease that determines long-term prognosis. Social factors such as job availability and poverty also need to be taken into account. Our findings suggest that in the event of a major epidemic, resulting in unemployment among vulnerable segments of the labor market, regardless of whether workers themselves are infected. Thus, there is a need for employment and financial support for socially vulnerable groups in the event of a major epidemic.

Limitations

There are several limitations of this study. First, it was unclear why the participants had experienced unemployment: we did not know whether it was due to the effects of COVID-19, company bankruptcy or financial difficulties, or the participants' voluntary decision to change jobs. It has also been found that the COVID-19 pandemic is closely associated with firms' business conditions, especially in small and medium-sized enterprises [29]. Future research using unemployment as an outcome should also take into account the business conditions of firms. Second, this study was conducted as an Internet survey; thus, the generalizability of our results is unclear. It is possible that individuals who were genuinely penurious did not have Internet access and could not participate in the survey. If such people had taken part in the survey, the bias would have been stronger. We attempted to reduce subject bias as much as possible by sampling by region and occupation based on infection rates. Third, of the 27,036 individuals who participated in the baseline survey, 7095 did not respond to the follow-up survey (non-participation rate, 26%). It is possible that those who have left their jobs have not responded to the follow-up survey in this study. In that case, the results of this study may have reinforced the trend.

The survey was conducted in 2020 and 2021, and we plan to add follow-up surveys to analyze which attributes make people more likely to re-enter the workforce, as well as the impact on physical and mental health. Measures to reduce infectious disease cases and deaths were of course important, while it would be necessary to follow up closely to see whether the significant slowdown in economic activity had not worsened the health of the unemployed in the future and increased the excess mortality rate in the long term.

5. Conclusions

In the COVID-19 pandemic, the relationship between sociodemographic factors and subsequent unemployment was confirmed. Similar to previous studies prior to the COVID-19 pandemic, vulnerable groups were more likely to be unemployed. Lockdowns and other behavioral restrictions will be necessary to prevent infection, but they have the side effect of stagnating the economy. Unemployment causes various health disadvantages. To avoid an increase in long-term excess mortality due to unemployment as a 'side effect' of infectious disease control, it is necessary to provide widespread and sustained support to the high-risk groups identified in this case, in the form of short- and long-term vocational training and health care.

Author Contributions: Conceptualization, M.K., T.N. and Y.F.; methodology, M.K., T.N. and Y.F.; software, M.K., T.N. and Y.F.; validation, T.N. and Y.F.; formal analysis, M.K. and T.N.; investigation, M.K.; resources, K.M. and Y.F.; data curation, Y.F.; writing—original draft preparation, M.K. and T.N.; writing—review and editing, all authors; visualization, M.K.; supervision, K.M. and Y.F.; project administration, Y.F.; funding acquisition, A.H., S.T., A.O., M.T., S.M., K.M. and Y.F. All authors have read and agreed to the published version of the manuscript.

Funding: This work was supported by the research grant from the University of Occupational and Environmental Health, Japan (no grant number); Japanese Ministry of Health, Labour and Welfare (H30-josei-ippan-002, H30-roudou-ippan-007, 19JA1004, 20JA1006, and 210301-1); Anshin Zaidan (no grant number), the Collabo-Health Study Group (no grant number), and Hitachi Systems, Ltd. (no grant number) and scholarship donations from Chugai Pharmaceutical Co., Ltd. (no grant number). The funder was not involved in the study design, collection, analysis, interpretation of data, the writing of this article or the decision to submit it for publication. All authors declare no other competing interests.

Institutional Review Board Statement: This study was approved by the ethics committee of the University of Occupational and Environmental Health, Japan (reference No. R2-079 and R3-006).

Informed Consent Statement: Informed consent was obtained from all subjects involved in the study.

Data Availability Statement: The data that support the findings of this study are available from the corresponding author upon reasonable request.

Acknowledgments: The current members of the CORoNaWork Project, in alphabetical order, are as follows: Yoshihisa Fujino (present chairperson of the study group), Akira Ogami, Arisa Harada, Ayako Hino, Hajime Ando, Hisashi Eguchi, Kazunori Ikegami, Kei Tokutsu, Keiji Muramatsu, Koji Mori, Kosuke Mafune, Kyoko Kitagawa, Masako Nagata, Mayumi Tsuji, Ning Liu, Rie Tanaka, Ryutaro Matsugaki, Seiichiro Tateishi, Shinya Matsuda, Tomohiro Ishimaru, and Tomohisa Nagata. All members are affiliated with the University of Occupational and Environmental Health, Japan.

Conflicts of Interest: The authors declare no conflict of interest.

Appendix A. Questionnaire

A baseline survey (22–25 December 2020)

- Q1. Age
- Q2. Sex
- Q3. Area of residence
- Q4. Marital Status
 - Married
 - Divorced or widowed
 - Never married
- Q5. (Q4: if you are married) Do you have any children of preschool age living with you?
 - Yes
 - No
- Q6. (Q4: if you are married) Does your spouse work?

- Yes
 No
- Q7. What is your job type?
- Working for a company (general employee)
 - Company employee (manager)
 - Company management (executive manager)
 - Public employee, faculty member, non-profit organization employee
 - Temporary/contract employee
 - Self-employed (commercial and industrial services)
 - SOHO (small office/home office)
 - Agriculture, forestry, and fishing
 - Professional occupation (lawyer, tax accountant, medical-related, etc.)
 - Other occupation
 - Part-time job
 - Housewife/Househusband
 - Student
 - Unemployed
- Q8. Please choose the response that is closest to your job description.
- Mainly desk work (e.g., office work, computer work)
 - Mainly work involving communicating with people (e.g., customer service, sales, etc.)
 - Manual work (e.g., work at a production site, manual labor, nursing care, etc.)
- Q9. What is your estimated total household income for 2020? (Include the income of all family members in your household.)
- Less than 2,000,000 yen
 - 2,000,000–2,999,999 yen
 - 3,000,000–3,999,999 million yen
 - 4,000,000–4,999,999 million yen
 - 5,000,000–5,999,999 million yen
 - 6,000,000–6,999,999 million yen
 - 7,000,000–7,999,999 million yen
 - 8,000,000–8,999,999 million yen
 - 9,000,000–9,999,999 million yen
 - 10,000,000 yen or more
- Q10. Which of the following best represents your educational background?
- Junior high school
 - High school
 - Vocational school/college
 - University
 - Graduate school

A follow-up survey (18–19 February 2021)

- Q11. Have you changed your place of work since December 2020?
- No change
 - I was transferred to another company
 - I resigned and got a new job right away
 - I stopped working and was unemployed for a while but am now working
 - I stopped working and started a business (e.g., managing a company, running a sole proprietorship, or engaging in self-employment)
 - I stopped working and am not currently working (including job seeking)

References

1. Public Health Agency of Canada: Social Determinants of Health and Health Inequalities. Available online: <https://www.canada.ca/en/public-health/services/health-promotion/population-health/what-determines-health.html> (accessed on 4 April 2022).
2. Schultz, W.M.; Kelli, H.M.; Lisko, J.C.; Varghese, T.; Shen, J.; Sandesara, P.; Quyyumi, A.A.; Taylor, H.A.; Gulati, M.; Harold, J.G.; et al. Socioeconomic status and cardiovascular outcomes: Challenges and interventions. *Circulation* **2018**, *137*, 2166–2178. [CrossRef] [PubMed]
3. Frasquilho, D.; Matos, M.G.; Salonna, F.; Guerreiro, D.; Storti, C.C.; Gaspar, T.; Caldas-De-Almeida, J.M. Mental health outcomes in times of economic recession: A systematic literature review. *BMC Public Health* **2015**, *16*, 115. [CrossRef] [PubMed]
4. Organisation for Economic Co-Operation and Development (OECD) Unemployment Rate. Available online: <https://data.oecd.org/unemp/unemployment-rate.htm> (accessed on 4 April 2022).
5. Statistics Bureau of Japan: Statistics, Labour Force Survey, Monthly Results. Available online: <https://www.stat.go.jp/english/data/roudou/results/month/index.html> (accessed on 4 April 2022).
6. Ministry of Health, Labour and Welfare. Outline of the 2021 White Paper on Health, Labour and Welfare. Available online: <https://www.mhlw.go.jp/content/000810603.pdf> (accessed on 4 April 2022).
7. Blaikie, P.; Cannon, T.; Davis, I.; Wisner, B. *At Risk: Natural Hazards, People's Vulnerability and Disasters*; Routledge: London, UK, 1994.
8. OECD. *OECD Employment Outlook 2015 (Summary)*; OECD Publishing: Paris, France, 2015. [CrossRef]
9. Development Centre Studies: Tackling Vulnerability in the Informal Economy. Available online: https://www.oecd-ilibrary.org/development/tackling-vulnerability-in-the-informal-economy_939b7bcd-en (accessed on 4 April 2022).
10. Survey of Local Government Officials' Retirement Status in FY2019. Available online: https://www.soumu.go.jp/main_sosiki/jichi_gyousei/koumuin_seido/koreitaisaku.html (accessed on 4 April 2022).
11. Chakrabarti, S.; Hamlet, L.C.; Kaminsky, J.; Subramanian, S.V. Association of human mobility restrictions and race/ethnicity-based, sex-based, and income-based factors with inequities in well-being during the COVID-19 pandemic in the United States. *JAMA Netw. Open* **2021**, *4*, e217373. [CrossRef] [PubMed]
12. Fujino, Y.; Ishimaru, T.; Eguchi, H.; Tsuji, M.; Tateishi, S.; Ogami, A.; Mori, K.; Matsuda, S. Protocol for a nationwide Internet-based health survey of workers during the COVID-19 pandemic in 2020. *J. UOEH* **2021**, *43*, 217–225. [CrossRef] [PubMed]
13. COVID-19 and the World of Work. 8th ed.; Updated Estimates and Analysis. Available online: <https://ilostat.ilo.org/topics/covid-19/> (accessed on 4 April 2022).
14. Analysis of the Labour Economy in 2013. Available online: <https://www.mhlw.go.jp/wp/hakusyo/roudou/13/dl/13-1-4.pdf> (accessed on 4 April 2022).
15. Ministry of Health, Labour and Welfare Press Release (October 2021). Available online: https://www.mhlw.go.jp/stf/houdou/0000177553_00004.html (accessed on 4 April 2022).
16. Which Lifestyle and Entertainment Services Have Been Most Affected by the New Coronavirus? Available online: https://www.meti.go.jp/statistics/toppage/report/minikaisetsu/hitokoto_kako/20200728hitokoto.html (accessed on 4 April 2022).
17. 2021 Tourism White Paper Summary Version. Available online: <https://www.mlit.go.jp/common/001408385.pdf> (accessed on 4 April 2022).
18. Becker, G.S. A theory of marriage, Part I. *J. Political Econ.* **1973**, *81*, 813–846. [CrossRef]
19. Oppenheimer, V.K. A theory of marriage timing. *Am. J. Sociol.* **1988**, *94*, 563–591. [CrossRef]
20. Matsuura, H.; Nakano, M.; Yamanaka, M.; Nishii, T.; Oshimoto, Y.; Nemoto, T.; Ito, Y. Social factors' analysis of Japanese divorce. *Int. J. Biomed. Soft Comput. Hum. Sci.* **2010**, *15*, 41–47.
21. Nishikitani, M.; Inoue, M.; Tsurugano, S. Nonregular employment in a society with a decreasing birthrate: Workers' marriage, childbirth, and childcare. *Nihon Eiseigaku Zasshi* **2018**, *73*, 215–224. [CrossRef] [PubMed]
22. COVID-19: Living of a Serious Mother-Child Household-Fact-Finding Survey/Preliminary Report of 1800 People-Certified NPO Corporation: Single Mothers Forum & Single Mother Survey Project. Available online: https://note.com/single_mama_pj/n/n83bb1e08b706?fbclid=IwAR2tSzVEijg57Ar28ioIwNi42xq_Ppcn98aeU6MRCm6iLL7uW99JT15ZepA (accessed on 4 April 2022).
23. Cabinet Office. 17th Tax Commission: Hearing from External Experts. Available online: <https://www.cao.go.jp/zei-cho/gijiroku/zeicho/2015/27zen17kai.html> (accessed on 4 April 2022).
24. Sayed, A.; Peng, B. Pandemics and income inequality: A historical review. *SN Bus. Econ.* **2021**, *1*, 54. [CrossRef] [PubMed]
25. Lizailma, S.C.; Medeiros, W.R.; Lima, F.A.V.J.; Pereira, S.A. Relationship between social inequality indicators and the spatial distribution of Zika virus cases. *Ciência Saúde Coletiva* **2020**, *25*, 1839–1850.
26. Lee, J.W.; McKibbin, W.J. Globalization and disease: The Case of SARS. *Asian Econ. Pap.* **2004**, *3*, 113–131. [CrossRef]
27. Lee, A.; Cho, J. The impact of epidemics on labor market: Identifying victims of the Middle East Respiratory Syndrome in the Korean labor market. *Int. J. Equity Health* **2016**, *15*, 196. [CrossRef] [PubMed]
28. Khanijahani, A.; Iezadi, S.; Gholipour, K.; Azami-Aghdash, S.; Naghibi, D. A systematic review of racial/ethnic and socioeconomic disparities in COVID-19. *Int. J. Equity Health* **2021**, *20*, 248. [CrossRef] [PubMed]
29. Rodrigues, M.; Franco, M.; Sousa, N.; Silva, R. COVID 19 and the Business Management Crisis: An Empirical Study in SMEs. *Sustainability* **2021**, *13*, 5912. [CrossRef]