

SARS-CoV-2 Infection Is at Herd Immunity in the Majority Segment of the Population of Qatar

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Background. Qatar experienced a severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) epidemic that disproportionately affected the craft and manual worker (CMW) population, who comprise 60% of the total population. This study aimed to assess ever and/or current infection prevalence in this population.

Methods. A cross-sectional population-based survey was conducted during July 26 to September 09, 2020, to assess both anti-SARS-CoV-2 positivity through serological testing and current infection positivity through polymerase chain reaction (PCR) testing. Associations with antibody and PCR positivity were identified through regression analyses.

Results. The study included 2641 participants, 69.3% of whom were <40 years of age. Anti-SARS-CoV-2 positivity was 55.3% (95% CI, 53.3%–57.3%) and was significantly associated with nationality, geographic location, educational attainment, occupation, and previous infection diagnosis. PCR positivity was 11.3% (95% CI, 9.9%–12.8%) and was significantly associated with nationality, geographic location, occupation, contact with an infected person, and reporting 2 or more symptoms. Infection positivity (antibody and/or PCR positive) was 60.6% (95% CI, 58.6%–62.5%). The proportion of antibody-positive CMWs who had a prior SARS-CoV-2 diagnosis was 9.3% (95% CI, 7.9%–11.0%). Only seven infections were ever severe, and only 1 was ever critical—an infection severity rate of 0.5% (95% CI, 0.2%–1.0%).

Conclusions. Six in every 10 CMWs in Qatar have been infected, suggestive of reaching the herd immunity threshold. Infection severity was low, with only 1 in every 200 infections progressing to be severe or critical. Only 1 in every 10 infections had been previously diagnosed, which is suggestive of mostly asymptomatic or mild infections.

Keywords. COVID-19; immunity; Qatar; SARS-CoV-2; seroprevalence.

The severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) infection has spread worldwide, causing disease and mortality as well as social and economic disruptions [1–3]. Qatar, a country in the Arabian Gulf, has experienced a pervasive epidemic, with >55 000 laboratory-confirmed infections per million population as of November 20, 2020 [4, 5].

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Most affected by the epidemic were the expatriate craft and manual workers (CMWs) who comprise 60% of the population of Qatar [6]. These workers are typically single men aged 20–49 years, recruited to work in development projects, and living in large shared accommodations [6–9]. Epidemiologic data on this population have indicated large SARS-CoV-2 outbreaks [7, 10, 11] that resembled those in nursing homes [12–14] or influenza outbreaks in regular and boarding schools [15, 16].

This study aimed to assess ever and current infection with SARS-CoV-2, the infection severity rate, and the infection diagnosis (detection) rate in the wider CMW population of Qatar.

METHODS

Study Design and Sampling

A national cross-sectional survey was conducted between July 26 and September 9, 2020, to assess anti-SARS-CoV-2

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(antibody) positivity and SARS-CoV-2 polymerase chain reaction (PCR) positivity among CMWs in Qatar. To optimize sample representativeness of the wider CMW population in the absence of a comprehensive listing for CMWs, we devised a sampling strategy based on analysis of the registered users' database of the Qatar Red Crescent Society (QRCS), the main provider of primary health care for CMWs in the country. QRCS operates 4 geographically distributed centers that were specifically designed to cater to the CMW population across the country. These centers were established over a decade ago and are well known by CMWs, operate long working hours (3 run >24 hours and 1 runs >16 hours), are located in regions where workers live, and provide services that are free of charge or heavily subsidized for enhanced accessibility and affordability. The probability distribution of CMWs by age and nationality in the QRCS database was cross-checked and found to be similar to that of the Ministry of Interior database of expatriate residents [8]. Sex was not considered in the sampling strategy because the vast majority of CMWs (>99%) are men [6].

The overall sample size was determined at 2232 assuming a seroprevalence of 25% (given the large epidemic in Qatar [7, 11]), a margin of error of 2%, and a nonresponse rate of 15%, but was increased to 2658 to ensure that a minimum of 5 individuals were recruited per each age-nationality stratum from each center (for better representation of small groups).

Due to time constraints and operational challenges in directly contacting the CMWs and recruiting them, recruitment was implemented per the above sampling strategy but using systematic sampling of the attendees at these centers during the study duration. By factoring the average number of attendees per day at each of these centers, every fourth attendee visiting each center was invited to participate in this study until the sample size by age and nationality at each center was fulfilled. It was difficult to recruit participants in the small age–nationality strata (such as among younger persons for specific nationalities), and thus toward the end of the study all attendees in these strata (not only every fourth attendee) were approached to participate.

Patient Consent Statement

A written informed consent was collected from all study participants. The study was approved by Hamad Medical Corporation (HMC) and Weill Cornell Medicine-Qatar Institutional Review Boards.

Sample Collection and Handling

An interview schedule inquiring about sociodemographics and history of exposure and symptoms was administered by trained interviewers in the participant's language of preference. Both informed consent and interview schedule were provided and collected in 9 languages (Arabic, Bengali, English, Hindi, Nepali, Sinhala, Tagalog, Tamil, and Urdu) to cater to the main language groups of CMWs. The study instrument was based on a protocol for SARS-CoV-2 seroepidemiological surveys developed by the World Health Organization (WHO) [17]. Blood (10 mL) was drawn for serological testing by certified nurses and stored in an ice box before being transported to the HMC Central Laboratory for analysis. Nasopharyngeal and oropharyngeal swabs were also collected by the nurses to assess current infection. National guidelines and standard of care were applied to all identified PCR-positive cases. No action was mandated by national guidelines to those found antibody positive.

Laboratory Methods

Testing for SARS-CoV-2-specific antibodies in the serological samples was performed using an electrochemiluminescence immunoassay, the Roche Elecsys Anti-SARS-CoV-2 (99.5% sensitivity [18], 99.8% specificity [18, 19]; Roche, Switzerland). Interpretation of results was per the manufacturer's instructions: reactive for optical density cutoff index \geq 1.0 and nonreactive for cutoff index <1.0 [19].

PCR testing was performed on aliquots of Universal Transport Medium (UTM) used for collection of nasopharyngeal swabs (Huachenyang Technology, Shenzen, China). Aliquots were extracted on the QIAsymphony platform (QIAGEN, Germantown, Maryland, USA) and tested with realtime reverse transcription PCR (RT-qPCR) using the TaqPath COVID-19 Combo Kit (100% sensitivity and specificity [20]; Thermo Fisher Scientific, Waltham, Massachusetts, USA) on an ABI 7500 FAST (Thermo Fisher, Waltham, Massachusetts, USA), extracted using a custom protocol [21] on a Hamilton Microlab STAR (Hamilton, Reno, Nevada, USA), and tested using the AccuPower SARS-CoV-2 Real-Time RT-PCR Kit (100% sensitivity and specificity [22]; Bioneer, Daejeon, Korea) on an ABI 7500 FAST or loaded directly into the Roche cobas 6800 system and assayed with the cobas SARS-CoV-2 Test (95% sensitivity, 100% specificity [23]; Roche, Basel, Switzerland).

All laboratory testing was conducted at the HMC Central Laboratory following standardized protocols.

Statistical Analysis

Frequency distributions were used to characterize study participants. Absence/presence of symptoms in the 2 weeks preceding the survey (no symptoms, 1 symptom, and 2 or more symptoms) was defined using a composite index score derived by summing up the values for reported symptoms coded as "0" for absence and "1" for presence. Probability weights were applied to adjust for participants' unequal selection using the CMW population distribution by age group and nationality per the QRCS registered-user database.

Associations with anti-SARS-CoV-2 positivity were explored using the chi-square test and univariable logistic regression analyses. Covariates with *P* values $\leq .2$ in the univariable regression analysis were included in the multivariable model. Covariates with *P* values \leq .05 in the multivariable analysis were considered as showing statistically significant evidence for an association with the outcome. Odds ratios (ORs), adjusted ORs (AORs), 95% CIs, and *P* values were reported. Associations with PCR positivity were also explored following the above-described methodology.

Antibody test results were subsequently linked to the national SARS-CoV-2 PCR testing and COVID-19 hospitalization and severity database, which includes all PCR testing, hospitalization, and SARS-CoV-2 infection severity classifications, as per the WHO criteria [24], since the start of the epidemic. Relevant epidemiological measures such as prevalence of ever and/or current infection, infection severity rate, and infection diagnosis rate were derived.

RESULTS

The final study sample included 2641 participants (Table 1), with a median age (range) of 35 (18–80) years. Most participants were below 40 years of age (69.3%) and of Indian (29.2%), Bangladeshi (26.2%), or Nepalese (21.6%) origin, representative of the wider CMW population in Qatar [8]. More than 40% had intermediate or lower educational attainment, and another 40% attended high school or vocational training. Over half of the sample consisted of technical and construction workers such as carpenters, crane operators, electricians, foremen, maintenance/air conditioning/cable technicians, masons, mechanics, painters, pipe fitters, plumbers, and welders, while 4.8% held higher professional positions such as architects, designers, engineers, operation managers, and supervisors.

A total of 1427 participants had detectable SARS-CoV-2 antibodies-a seropositivity of 55.3% (95% CI, 53.3%-57.3%) (Table 1). Seropositivity was independently associated with each of nationality, QRCS center (proxy of catchment area/geographic location), educational attainment, occupation, and previous infection diagnosis in the multivariable regression analysis (Table 1). Still, the differences in seropositivity were overall not considerable, apart from those by nationality, occupation, and geographic location (QRCS center). Compared with all other nationalities, the AOR was 0.41 (95% CI, 0.20-0.85) for Filipinos, 1.83 (95% CI, 1.17-2.87) for Nepalese, and 3.05 (95% CI, 1.93-4.80) for Bangladeshis. Compared with professional workers, the AOR was 2.16 (95% CI, 1.20-3.89) for transport workers, 2.81 (95% CI, 1.32-6.01) for cleaning workers, 3.07 (95% CI, 1.77-5.32) for technical and construction workers, and 3.21 (95% CI, 1.32-7.79) for security workers. No association was found for age, contact with an infected person, symptoms in the 2 weeks preceding the survey, symptoms requiring medical attention, or symptoms requiring hospitalization.

A total of 2092 CMWs consented to PCR testing, of whom 233 had a positive result—a PCR positivity rate of 11.3% (95% CI,

9.9–12.8%) (Table 2). PCR cycle threshold (Ct) values ranged from 15.0 to 38.9, with a median of 27.6 (Figure 1). The Ct value was \geq 30 in 41.6% of PCR-positive CMWs, suggesting no active infection [25, 26]. PCR positivity was independently associated with nationality, geographic location (QRCS center), occupation, contact with an infected person, and reporting 2 or more symptoms in the 2 weeks preceding the survey in the multivariable regression analysis, but no association was found for the other variables (Table 2).

Table 3 summarizes the key SARS-CoV-2 epidemiological measures assessed in this study. Infection positivity (antibody and/or PCR positive during the study) was assessed at 60.6% (95% CI, 58.6%-62.5%). Of the 1427 antibody-positive CMWs, 131 had a laboratory-confirmed PCR-positive result for SARS-CoV-2 before this study, corresponding to a diagnosis (detection) rate of 9.3% (95% CI, 7.9%-11.0%). The median time between the previous PCR diagnosis and the antibody-positive test was 63 days. Meanwhile, 4 out of the 1214 antibody-negative CMWs, 0.4% (95% CI, 0.1%-1.0%), had been previously diagnosed with the infection before this study. The median time between the previous PCR diagnosis and the antibody-negative test was 28 days. The Ct values and PCR diagnosis date for these individuals were 16.0 on July 23, 22.3 on July 25, 22.8 on June 6, and 28.3 on May 2, 2020, suggesting that the recency of the infection may explain the lack of detectable antibodies for 2 of these 4 individuals.

Out of the total of 1590 participants with laboratoryconfirmed infection (antibody and/or PCR positive), 7 have ever had or progressed to a severe infection (prior, during, or after this study) and 1 has ever had or progressed to a critical infection, as per WHO criteria [24]—an infection severity rate of 0.5% (95% CI, 0.2%–1.0%). All severe and critical infections were hospitalized but cleared their infection; no COVID-19 deaths have been recorded.

DISCUSSION

The above results indicate that the CMW population—a population that constitutes 60% of the population of Qatar—appears to be at or not far from the herd immunity threshold for the SARS-CoV-2 variants circulating in Qatar at the time of this study. Seroprevalence was ~60% in 3 geographic regions, and only lower in Doha East, at 43%. This is to our knowledge the first such evidence for herd immunity, or being near herd immunity, in a majority segment of the population in any country. This conclusion is supported by the fact that no major infection cluster has been identified in any CMW community in Qatar for several months up to the end of 2020, despite the progressive easing of the social and physical distancing restrictions since June 15, 2020 [27]. Meanwhile, large clusters of infection were common in such CMW communities before, around, and shortly after the epidemic peak toward the end of May 2020.

A level of about 60%–70% infection prevalence to reach herd immunity is in concordance with that predicted using the

	Tested	Anti-SARS-	CoV-2 Positive	Univariab	le Regression A	nalysis	Multivariable Regressio	on Analysis
Characteristics	No. (% ^a)	No. (% ^b)	Chi-Square P Value	OR° (95% CI ^c)	P Value	F Test <i>P</i> Value ^d	AOR ^c (95% CI ^c)	P Value e
Age, y								
<29	753 (27.5)	392 (53.2)	.279	1.00		.296	Ι	Ι
30-39	979 (41.8)	553 (57.5)		1.19 (0.98–1.45)	.086		I	I
40-49	553 (21.5)	298 (54.4)		1.05 (0.83-1.32)	.690		Ι	Ι
50-59	265 (7.5)	142 (54.9)		1.07 (0.80–1.44)	.657		I	Ι
60+	91 (1.7)	42 (47.6)		0.80 (0.50–1.29)	.356		Ι	Ι
Nationality								
All other nationalities ^f	231 (7.5)	87 (38.2)	<.001	1.00		<.001	1.00	
Filipino	103 (2.7)	25 (19.6)		0.39 (0.22-0.70)	.002		0.41 (0.20-0.85)	.016
Sri Lankan	146 (4.8)	56 (35.5)		0.89 (0.56–1.40)	.614		0.84 (0.46-1.54)	.577
Egyptian	92 (3.2)	32 (36.2)		0.92 (0.54-1.56)	.748		0.84 (0.40–1.76)	.640
Pakistani	138 (4.9)	70 (51.9)		1.75 (1.11–2.73)	.015		1.18 (0.63–2.21)	.599
Indian	726 (29.2)	376 (52.7)		1.80 (1.31–2.47)	<.001		1.37 (0.89–2.09)	.154
Nepalese	570 (21.6)	345 (59.2)		2.34 (1.68–3.26)	<.001		1.83 (1.17–2.87)	.008
Bangladeshi	635 (26.2)	436 (70.1)		3.79 (2.72–5.26)	<.001		3.05 (1.93-4.80)	<.001
QRCS center (catchment area within Qatar)								
Fereej Abdel Aziz (Doha-East)	618 (23.4)	257 (42.5)	<.001	1.00		<.001	1.00	
Zekreet (Northwest)	238 (2.3)	125 (52.2)		1.48 (1.09–2.00)	.012		1.46 (1.02–2.09)	.037
Hemaila (Southwest; "Industrial Area")	981 (42.1)	554 (57.6)		1.84 (1.50–2.26)	<.001		1.63 (1.16–2.29)	.050
Mesaimeer (Doha-South)	804 (32.2)	491 (61.7)		2.18 (1.76–2.71)	<.001		1.89 (1.47–2.44)	<.001
Educational attainment								
Primary or lower	633 (24.6)	377 (60.2)	<.001	1.00		<.001	1.00	
Intermediate	434 (17.9)	278 (64.8)		1.22 (0.94–1.58)	.143		1.41 (1.00–1.99)	.049
Secondary/high school/vocational	1102 (44.3)	599 (55.2)		0.82 (0.66–1.00)	.054		1.10 (0.83–1.47)	.504
University	371 (13.3)	114 (32.3)		0.32 (0.24–0.42)	<.001		0.70 (0.47–1.06)	960.
Occupation								
Professional workers ^g	137 (4.8)	36 (27.8)	<.001	1.00		<.001	1.00	
Food & beverage workers	93 (3.2)	26 (29.2)		1.07 (0.57–2.02)	.827		0.71 (0.32-1.61)	.415
Administration workers	82 (3.0)	25 (31.6)		1.20 (0.63–2.28)	.573		1.40 (0.64–3.07)	.400
Retail workers	171 (6.6)	67 (40.3)		1.76 (1.05–2.94)	.030		1.58 (0.83–3.01)	.163
Transport workers	435 (16.4)	227 (53.4)		2.99 (1.91–4.68)	<.001		2.16 (1.20–3.89)	.010
Cleaning workers	105 (4.0)	55 (54.5)		3.12 (1.77–5.49)	<.001		2.81 (1.32–6.01)	.008
Technical and construction workers ^h	1329 (52.9)	862 (65.1)		4.85 (3.19–7.38)	<.001		3.07 (1.77–5.32)	<.001
Security workers	61 (2.3)	36 (60.1)		3.92 (2.02–7.61)	<.001		3.21 (1.32–7.79)	.010
Other workers ⁱ	178 (6.9)	64 (38.5)		1.63 (0.98–2.71)	.061		1.70 (0.88–3.28)	.114
Contact with infected person								
No	2370 (91.8)	1283 (55.2)	.257	1.00		.258	I	Ι
Yes	208 (8.2)	101 (50.9)		0.84 (0.63–1.13)	.258		I	I
Symptoms in the 2 wk preceding the survey								
No symptoms	2326 (88.0)	1251 (54.6)	.021	1.00		.021	1.00	
1 symptom	173 (6.7)	107 (65.9)		1.61 (1.14–2.26)	.006		1.15 (0.72–1.85)	.554
≥2 symptoms	142 (5.5)	69 (53.3)		0.95 (0.67–1.36)	777.		0.83 (0.51-1.35)	.453
Symptoms required medical attention								

Table 1. Characteristics of Study Participants and Associations With Anti-SARS-CoV-2 Positivity

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	Tested	Anti-SARS-Co/	/-2 Positive	Univariab	le Regression A	nalysis	Multivariable Regressio	n Analysis
Characteristics	No. (% ^a)	No. (% ^b)	Chi-Square <i>P</i> Value	OR° (95% CI°)	<i>P</i> Value	F Test <i>P</i> Value ^d	AOR° (95% CI°)	<i>P</i> Value ^e
No	2594 (99.0)	1392 (54.8)	.200	1.00		.205	1	
Yes	25 (1.0)	17 (68.1)		1.76 (0.73-4.21)	.205		I	I
Symptoms required hospitalization								
No	2613 (99.9)	1405 (55.0)	.229	1.00		Ι	Ι	I
Yes	2 (0.1)	2 (100.0)		Omitted	I		Ι	Ι
Previously diagnosed with infection								
No	1826 (96.3)	957 (53.6)	600.	1.00		.012	1.00	
Yes	65 (3.7)	45 (70.5)		2.06 (1.19–3.57)	.010		2.06 (1.17–3.63)	.012
Total (%, 95% Cl)	2641 (100.0)	1427 (55.3, 53.3–57.3)	NA	NA	NA	NA	NA	ΝA
Abbreviations: AOR, adjusted odds ratio; NA, not applicable; OF	0, odds ratio; ORCS, 0	Datar Red Crescent Society; SAR	S-CoV-2, severe acute respirat	ory syndrome coronavirus 2	ai			

^{ape}rcentage of the total sample weighted by age, nationality, and QRCS center. Missing values were excluded from the analysis.

^bPercent positive out of those tested, weighted by age, nationality, and QRCS center.

 $^{\rm c}\textsc{Estimates}$ weighted by age, nationality, and center.

^dCovariates with *P* values ≤.2 in the univariable analysis were included in the multivariable analysis.

*Covariates with P values 5.05 in the multivariable analysis were considered as showing statistically significant evidence for an association with anti-SARS-CoV-2 positivity.

^fincludes all other nationalities of craft and manual workers residing in Qatar.

⁹Includes architects, designers, engineers, operation managers, and supervisors, among other professions.

¹Includes carpenters, construction workers, crane operators, electricians, foremen, maintenance/air conditioning/cable technicians, masons, mechanics, painters, pipe fitters, plumbers, and welders, among other professions.

Includes barbers, firefighters, gardeners, farmers, fishermen, and physical fitness trainers, among other professions.

Table 2. Associations With SARS-CoV-2 PCR Positivity

	Tested	SC-SAAS	01/2 PCB Positive	I Inivariable Roor acc	ion Analycic		Multivariable Regressio	n Analveis
	leared							
Characteristics	No. (% ^a)	No. (% ^b)	Chi-Square PValue	OR (95% CI)	<i>P</i> Value	FTest $PValue^{\circ}$	AOR (95% CI)	<i>P</i> Value ^d
Age, y								
<29	634 (29.4)	82 (13.0)	.292	1.00		.310	I	Ι
30-39	780 (42.0)	77 (10.0)		0.75 (0.53-1.05)	060.		Ι	
40-49	408 (20.0)	47 (11.6)		0.88 (0.59–1.30)	.525		Ι	Ι
50-59	200 (7.1)	24 (12.1)		0.92 (0.56-1.54)	.762		Ι	
60+	70 (1.6)	3 (5.1)		0.36 (0.10-1.31)	.121		Ι	Ι
Nationality								
All other nationalities ^e	202 (8.4)	20 (10.3)	660.	1.00		.110	1.00	
Indian	549 (27.9)	49 (8.4)		0.80 (0.45–1.40)	.428		0.74 (0.39–1.39)	.352
Sri Lankan	114 (4.7)	12 (11.6)		1.14 (0.53-2.47)	.737		0.96 (0.43–2.16)	.931
Bangladeshi	496 (25.9)	55 (11.4)		1.12 (0.65–1.95)	.682		1.14 (0.60–2.17)	.682
Pakistani	116 (5.2)	17 (14.7)		1.50 (0.73-3.06)	.265		1.33 (0.57–3.10)	.502
Egyptian	79 (3.5)	8 (11.4)		1.12 (0.46–2.70)	.806		1.36 (0.55–3.38)	.508
Nepalese	467 (22.2)	59 (13.3)		1.34 (0.77–2.33)	.296		1.64 (0.87–3.10)	.124
Filipino	69 (2.2)	13 (20.5)		2.25 (0.99–5.11)	.053		2.90 (1.11–7.59)	.030
QRCS center (catchment area within Qatar)								
Fereej Abdel Aziz (Doha-East)	547 (26.2)	85 (15.4)	<.001	1.00		<.001	1.00	
Mesaimeer (Doha-South)	535 (27.0)	21 (4.0)		0.23 (0.14-0.37)	<.001		0.30 (0.17-0.51)	<.001

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Contin
Table 2.

	Tested	SARS-CoV	-2 PCR Positive	Univariable Regr essi	on Analysis		Multivariable Regressic	n Analysis
Characteristics	No. (% ^a)	No. (% ^b)	Chi-Square PValue	OR (95% CI)	<i>P</i> Value	FTest <i>P</i> Value ^c	AOR (95% CI)	<i>P</i> Value ^d
Zekreet (Northwest)	186 (2.3)	16 (8.8)		0.53 (0.30-0.94)	.029		0.62 (0.33-1.15)	.128
Hemaila (Southwest; "Industrial Area")	824 (44.6)	111 (13.4)		0.85 (0.62–1.16)	.310		1.10 (0.75–1.60)	.631
Educational attainment								
Primary or lower	502 (24.5)	60 (12.5)	.638	1.00		.630	I	I
Intermediate	347 (18.1)	45 (12.5)		1.00 (0.65–1.54)	.991		Ι	Ι
Secondary/high school/vocational	870 (44.1)	93 (11.2)		0.89 (0.62-1.27)	.509		I	I
University	293 (13.4)	31 (9.6)		0.75 (0.46–1.22)	.245		I	
Occupation								
Professional workers ^f	107 (4.8)	15 (13.9)	<.001	1.00		<.001	1.00	
Cleaning workers	85 (4.1)	9 (7.9)		0.53 (0.20-1.41)	.202		0.35 (0.11-1.09)	.070
Technical and construction workers ⁹	1041 (52.2)	86 (8.5)		0.57 (0.31-1.07)	.081		0.43 (0.20-0.93)	.031
Security workers	53 (2.6)	3 (6.4)		0.42 (0.11-1.55)	.192		0.46 (0.11–1.82)	.266
Food & beverage workers	73 (3.2)	12 (14.9)		1.08 (0.44–2.64)	.859		0.60 (0.22–1.65)	.325
Administration workers	70 (3.2)	8 (12.1)		0.85 (0.33-2.20)	.734		0.67 (0.23-1.93)	.457
Transport workers	319 (15.0)	38 (12.7)		0.90 (0.46–1.77)	.753		0.70 (0.32–1.52)	.364
Retail workers	145 (7.1)	27 (19.5)		1.49 (0.72–3.07)	.278		1.18 (0.54–2.60)	.673
Other workers ^h	161 (7.9)	32 (19.9)		1.53 (0.76–3.10)	.234		1.21 (0.56–2.64)	.625
Contact with infected person								
No	1909 (93.7)	195 (10.5)	<.001	1.00		<.001	1.00	
Yes	125 (6.3)	36 (27.8)		3.30 (2.14–5.11)	<.001		2.96 (1.88-4.65)	<.001
Symptoms in the 2 wk preceding the survey								
Asymptomatic	1856 (88.4)	189 (10.5)	<.001	1.00		<.001	1.00	
1 symptom	125 (6.0)	15 (11.9)		1.16 (0.65–2.08)	.615		1.09 (0.58–2.05)	.799
≥2 symptoms	111 (5.5)	29 (23.5)		2.63 (1.63-4.24)	<.001		2.36 (1.42–3.93)	.001
Symptoms required medical attention								
No	2056 (99.0)	229 (11.3)	.914	1.00		.914	I	I
Yes	19 (0.01)	2 (12.1)		1.09 (0.25–4.78)	.914		I	I
Symptoms required hospitalization								
No	2069 (99.9)	228 (11.1)	.108	1.00		I	I	
Yes	1 (0.01)	0 (0.0)		Omitted			I	I
Previously diagnosed with infection								
No	1428 (98.2)	135 (9.4)	.152	1.00		.161	I	I
Yes	26 (1.9)	5 (17.6)		2.06 (0.75-5.63)	.161		I	
Total (%, 95% CI)	2092 (100.0)	233 (11.3, 9.9–12.8)	NA	NA	NA	NA	NA	NA
Abbreviations: AOR, adjusted odds ratio; OR, odds ratio; PCR, pr	olymerase chain reac	tion; QRCS, Qatar Red Cresce	int Society; SARS-CoV-2, sever	e acute respiratory syndrom	e coronavirus 2.			

Percentage of the total sample weighted by age, nationality, and QRCS center. Missing values were excluded from the analysis.

 $^{\mathrm{b}}\mathrm{Percent}$ positive out of those tested weighted by age, nationality, and QRCS center.

^cCovariates with *P* values ≤.2 in the univariable analysis were included in the multivariable analysis.

⁴Covariates with *P* values <.05 in the multivariable analysis were considered as showing statistically significant evidence for an association with anti-SARS-CoV-2 positivity.

^eIncludes all other nationalities of craft and manual workers residing in Catar.

^fIncludes architects, designers, engineers, operation managers, and supervisors, among other professions.

⁹Includes carpenters, construction workers, crane operators, electricians, foremen, maintenance/air conditioning/cable technicians, masons, mechanics, painters, pigne fitters, plumbers, and welders, among other professions. ^hIncludes barbers, firefighters, gardeners, farmers, fishermen, and physical fitness trainers, among other professions.



Figure 1. Distribution of PCR Ct values among CMWs identified as SARS-CoV-2 PCR positive during the study period. Abbreviations: CMWs, craft and manual workers; Ct, cycle threshold; PCR, polymerase chain reaction; SARS-CoV-2, severe acute respiratory syndrome coronavirus 2.

"classical" formula for herd immunity of $\sim 1 - 1/R_0$ [28, 29], with R_{o} , the basic reproduction number, being in the range of 2.5-4 [30, 31]. This, however, does not support other evidence arguing that herd immunity for SARS-CoV-2 infection could be reached (without vaccination) at infection levels as low as 15%-20% [32]. Our findings suggest that herd immunity may not be reached before at least half of the population has been infected, even in the presence of heterogeneity in the social contact rate in a given population [10, 29, 32].

A key finding of this study is the low SARS-CoV-2 infection severity rate found in this (relatively young) population, where only 1 in every 200 infections was ever severe or critical as per the WHO infection severity classification [24]. This outcome agrees with the findings of 2 other studies from Qatar, where the infection severity rate has been estimated at 0.25% (95% CI, 0.11%-0.49%) based on antibody and/or PCR laboratory-confirmed infections [10] and at 0.37% (95% CI, 0.37%-0.38%) based on mathematical modeling of the epidemic in the total population [33]-compared with 0.50% (95% CI, 0.22%-0.99%) in this study. These rates are substantially lower than those estimated elsewhere [34], often using early epidemic data, possibly because of insufficient accounting for the large denominator of undiagnosed asymptomatic or mild infections in young persons. These rates are also unlikely to be explained by lower comorbidity levels as disease conditions such as obesity, diabetes, and hypertension are at relatively high prevalence in Qatar [35-38], comparable to what is seen in developed nations.

Notably, despite the large epidemic in Qatar, only 236 COVID-19 deaths have been registered as of November 21, 2020 [5], indicating also a substantially lower infection fatality rate compared with earlier studies [34, 39-41]. An analysis of the severity and fatality of SARS-CoV-2 infection in Qatar suggested the young age structure of the population, potential cross-reactivity to circulating "common cold" coronaviruses, and high-quality standard of health care as reasons behind the low severity [33].

Though the infection was pervasive in this population, there were still some differences in past or current infection prevalence by nationality, catchment area/geographic location (QRCS center), educational attainment, and occupation (Tables 1 and 2). Given the totality of evidence on the Qatar epidemic [7, 10, 27, 33, 42], these differences may be explained by the nature of the shared accommodation (size and density), clustering of social networks by language and/or national background [7], occupational exposures (such as for drivers) [7], or differences in epidemic intensity in different parts of Qatar. Meanwhile, there were no differences in infection prevalence by age.

The study had other notable findings. The study design allowed an empirical estimation of the diagnosis (detection) rate for this population. Out of all detected antibody-positive

Table 3.	Kev SARS-CoV-2	Epidemiological	Measures	Assessed ir	ı the Study
		-p			

Epidemiological Measure	Sample (Denominator)	Positive for Outcome (Numerator)	Estimate (95% CI), %ª
Antibody positivity (seropositivity) prevalence	2641	1427	55.3 (53.3–57.3)
PCR positivity prevalence	2092 ^b	233	11.3 (9.9–12.8)
Infection (antibody and/or PCR) positivity prevalence	2641	1571	60.6 (58.6–62.5)
Infection diagnosis rate ^c	1427	131	9.3 (7.9–11.0)
Antibody-negative CMWs previously PCR-diagnosed with SARS- CoV-2 infection	1214	4	0.4 (0.1–1.0)
Infection severity rate ^d	1590 ^e	8 ^f	0.5 (0.2-1.0)

Abbreviations: CMWs, craft and manual workers; PCR, polymerase chain reaction; SARS-CoV-2, severe acute respiratory syndrome coronavirus 2

^aEstimates weighted by age, nationality, and center.

^bOnly 2092 persons consented to have nasopharyngeal and oropharyngeal swabs

^cProportion of antibody-positive CMWs with a prior SARS-CoV-2 laboratory-confirmed PCR diagnosis.

^dNumber of infections ever severe or critical per World Health Organization criteria over total number of laboratory-confirmed infections (antibody and/or PCR positive)

^aThis number includes also 4 persons who were antibody negative and PCR negative at the time of the survey but had a PCR-positive result before the survey. This number also includes 15 persons who were antibody negative and PCR negative at the time of the survey but had a PCR-positive result subsequent to the survey at the time of data linking and analysis (October 7. 2020)

¹Seven participants in this study had ever had (or progressed to) a severe infection and 1 had a critical infection per World Health Organization infection severity classification [24] at the time of data linking and analysis (October 7, 2020).

cases, only 9.3% (95% CI, 7.9%-11.0%) had a documented PCR-confirmed infection before antibody testing in this study, indicating that 9 in every 10 infections were never diagnosed, a finding that agrees with estimates from other settings [39, 43-46]. This outcome supports that most infections were asymptomatic or too mild to be diagnosed, in line with findings of a PCR community survey conducted earlier in Qatar in which 58.5% of those who were PCR positive reported no symptoms in the 2 weeks preceding the survey [7]. Another finding of the present study is that reporting of 2 or more symptoms was predictive of PCR positivity, but not reporting of only 1 symptom (Table 2), a similar finding to that of the earlier PCR community survey [7]. Lastly, a high proportion of those testing PCR positive had a Ct value >30, suggesting that nearly half of the PCRpositive CMWs may have acquired their infection 2-6 weeks earlier, given the common presence of prolonged PCR positivity in infected persons [25, 26].

This study had limitations. While the study design was intended to be based on probability-based sampling of the total CMW population in Qatar, operational challenges and time constraints forced instead a systematic sampling of QRCS attendees supplemented with probability-based weights to generate an estimate that is representative of the wider CMW population. To ensure representation of small age-nationality strata (such as younger persons of specific nationalities), toward the end of the study, all attendees in these strata (not only every fourth attendee) were approached to participate. Operational challenges made it also difficult to track and maintain consistent logs of the response rate by the nurses in these QRCS centers; thus an exact estimate of the response rate could not be ascertained, though it was estimated at >90% for antibody testing and at >70% for PCR testing. An informed consent was obtained from all participants, and thus the purpose of the study could not be masked. However, with only 9.3% of those testing antibody-positive having a record of prior infection, it is unlikely that a previous diagnosis could have appreciably biased participation in the study.

While it is possible that the recruitment scheme may have affected the generalizability of study findings, this is less likely considering that CMWs attend these centers for a range of services beyond illness such as periodic health certifications, vaccinations, refill medications for chronic diseases, and pretravel PCR testing, and that the study's primary outcome was seroprevalence—a marker of past rather than recent infection. Nevertheless, these limitations may have introduced selection bias for specifically the assessed PCR positivity prevalence and infection severity rate toward higher values, as participants may still have attended the QRCS centers because of current infection symptoms.

The laboratory methods were based on high-quality and validated commercial platforms, such as the Roche platform used for the serological testing [19, 47], one of the best available and most used and investigated commercial platforms with a specificity \geq 99.8% [19, 48] and a sensitivity \geq 95% [7, 47]. Factoring the less-than-perfect sensitivity and specificity [49] would have increased the measured antibody positivity prevalence to 58.1% instead of 55.3%. History of SARS-CoV-2 testing, hospitalization, and death were extracted through linking participants' records to the national, centralized, and fully integrated digital health information platforms, and thus it is unlikely that cases/ events were missed.

In conclusion, 6 in every 10 CMWs have already been infected with SARS-CoV-2, suggesting that this population is at or not far from herd immunity for the SARS-CoV-2 variants circulating in Qatar at the time of this study. While the prevalence of past or current infection was high, infection severity was low, with only 1 in every 200 infections progressing severe or critical disease. Indeed, most infections must have been asymptomatic or too mild to be diagnosed, as only 1 in every 10 antibody-positive persons had a prior PCR-confirmed SARS-CoV-2 diagnosis.

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