Stringent containment measures without complete city lockdown to achieve low incidence and mortality across two waves of COVID-19 in Hong Kong

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ABSTRACT

Introduction An international city, Hong Kong, in proximity to the first epicentre of COVID-19, experienced two epidemic waves with different importation pressure. We compared the epidemiological features of patients with COVID-19 in the context of containment policies between the first and second waves.

Methods We retrieved information on the first 1038 cases detected in Hong Kong (23 January to 25 April 2020) to analyse the epidemiological characteristics including age/gender-specific incidence, clustering, reproduction number (R) and containment delay; in relation to the containment measures implemented. Factors associated with containment delay were evaluated by multiple linear regression analysis with age, gender, epidemic wave and infection source as covariates. A time series of 5-day moving average was plotted to examine the changes across the two epidemic waves.

Results The incidence and mortality (135.5 and 0.5 per 1 000 000 population) was among the lowest in the world. Aggressive escalation of border control correlated with reductions in R from 1.35 to 0.57 and 0.92 to 0.18, and averions of 450 and 1650 local infections during the first and second waves, respectively. Implementing COVID-19 tests for overseas returners correlated with an upsurge of asymptomatic case detection, and shortened containment delay in the second wave. Medium-sized cluster events in the first wave were family gatherings, whereas those in the second wave were leisure activities among youngsters. Containment delay was associated with older age (adjusted OR=1.01, 95% CI 1.00 to 1.02, p=0.040), male gender (AOR=1.41, 95% CI 1.02 to 1.96, p=0.039) and local cases (AOR=11.18, 95% CI 7.43 to 16.83, p<0.001), and with significant improvement in the second wave compared with the first wave (average: 6.8 vs 3.7 days). A higher incidence rate was observed for males, raising possibility of gender predilection in susceptibility of developing symptoms.

Conclusion Prompt and stringent all-round containment strategies represent successful measures in pandemic control. These findings could inform formulation and implementation of pandemic mitigation strategies.

Key questions

What is already known?

► The spread of the COVID-19 has induced a substantial burden to global health.
► Identification of effective containment strategies will be important to combat resurgence of epidemic waves.

What are the new findings?

► We found that the incidence and mortality (135.5 and 0.5 per 1 000 000 population) of COVID-19 in Hong Kong was among the lowest in the world; aggressive escalation of border control was correlated with reductions in R from 1.35 to 0.57 and 0.92 to 0.18, and averions of 450 and 1650 local infections during the first and second waves, respectively.
► Implementing testing for overseas returners correlated with an upsurge of asymptomatic case detection, and shortened containment delay in the second wave.
► Containment delay was associated with older age, male gender and local cases, and with significant improvement in the second wave compared with the first wave; and a higher incidence rate was observed for males, raising possibility of gender predilection in susceptibility of developing symptoms.

INTRODUCTION

Since the identification of a novel coronavirus disease (COVID-19) in December 2019, its spread in many parts of the world has induced a substantial global health burden.1 2 As of 28 August 2020, the virus has affected 216 countries and regions, involving a total of more than 24.2 million confirmed cases and 827
What do the new findings imply?

- Prompt and stringent all-round containment strategies represent successful measures in pandemic control.
- These findings will contribute to a more in-depth understanding of the disease, and inform physicians and policymakers in formulation and implementation of pandemic mitigation strategies.

000 deaths. While a decline in new cases was observed in a number of countries in June 2020, the WHO has warned that a second wave or second peak may occur.

Hong Kong is a metropolitan city with a population of 7.49 million living in an area of 427 square miles. It is one of the most densely populated cities (6940 people/km²), and ranks one of the top five territories for population density in the world. The high population density together with its location in close proximity to the first epicentre of COVID-19 and the highly developed international transportation networks make it vulnerable to importation as well as local spread of this novel human infection, SARS-CoV-2. Hong Kong has learnt from the experience of SARS in 2003. The government and the public are prepared and willing to respond to emerging infections like COVID-19. While there were all-round containment measures including border control, social distancing and active case finding, Hong Kong did not implement complete lockdown as in many other cities. Yet, the cumulative incidence and mortality associated with COVID-19 remained low across the two waves that presented with different importation threats and other epidemiological features. This report describes and compares the epidemiological features in the context of the containment policies between the first and second waves of the epidemic, and examined the projected increase in number of cases if control measures were not implemented in a timely manner. The findings of this study will enlighten formulation and implementation of pandemic control policy in the future.

Methods

Data source

We used the data source employed in our previous study that examined the first 100 confirmed COVID-19 cases in Hong Kong. COVID-19 cases in Hong Kong were confirmed by two reverse transcription PCR tests targeting different regions of the RdRp gene performed respectively by the local hospitals and its Public Health Laboratory Centre. The Centre for Health Protection of the Hong Kong government has established a database of patients with COVID-19, which provides real-time updates on all new cases. We extracted the information of each confirmed case, including age, gender, infection source (locally acquired vs imported), how the case was identified, and dates of symptom onset, diagnosis, isolation and hospital admission. We analysed all information available for the first 1038 cases, which marked the end of the second wave of COVID-19 in Hong Kong. The epidemic curve and the time-varying reproduction numbers (Rt) were examined to identify a cut-off date to classify patients into the first wave or second wave. As the study involves retrieval of information from a publicly available database only, a full review by the Survey and Behavioural Research Ethics Committee is not required, and patient or public involvement is not applicable. This study conformed to the principles embodied in the Declaration of Helsinki.

Data analysis

Epidemic curve and reproduction number

We composited an epidemic curve based on the illness-onset dates of symptomatic cases in relation to the source of infection (local vs imported). We estimated Rt which is defined as the average number of secondary infections generated by a single case in a population at time t. Rt is a commonly used parameter for monitoring local disease transmission. If Rt is less than 1, an epidemic is likely to die out. As there was a proportion of imported cases, we employed the approach of Thompson and his colleagues using the daily number of cases with their colleagues to estimate the number of local infections importing countries. We performed descriptive analyses focusing on differences between the two waves. For all categorical and continuous variables, we compared subgroups using the χ² tests of heterogeneity and Student’s t-tests, respectively. A multiple regression analysis was employed to examine the factors associated with containment delay.

Age, gender, incidence and mortality

Confirmed cases who were local residents were included in the age/gender-specific incidence analyses based on the mid-2019 population census data. In addition, we examined age and gender distribution with respect to importing countries. We performed descriptive analyses focusing on differences between the two waves. For all categorical and continuous variables, we compared subgroups using the χ² tests of heterogeneity and Student’s t-tests, respectively. A multiple regression analysis was employed to examine the factors associated with containment delay.

Cluster events

We defined clusters as two or more patients with an epidemiological link. Medium-spreading and superspreading events were arbitrarily defined as those clusters affected more than 5 and 50 patients, respectively.
We generated the epidemic curves for scenarios that the median $R_t$ remained as with that before the implementation of border control measures, and estimated that these border control measures together with other existing containment policies, especially the intense contact tracing, had averted around 450 and 1650 cumulative local cases within a 30-day period in the first and second waves, respectively (figure 2).

**Age/gender-specific incidence**

Patients in the two epidemic waves exhibited a contrast in age distribution (online supplemental table 1, figure 3A). In the first wave, majority were older adults aged 45–64 years (40.4%) and elderly >65 years (33.7%); whereas in the second wave, most were young adults and adolescents, 25–44 years (37.8%) and <24 years (32.2%).

Up to 25 April 2020, a total of 1017 Hong Kong local residents were confirmed to have COVID-19, and four patients died. The overall cumulative incidence and mortality rates were 135.5 and 0.5 per 1 000 000 population, respectively. The incidence rate of the second wave was 10.6 times higher than that of the first wave (126.4 vs 11.9 per 1 000 000 population). When the age distribution of the patients was compared between the first and second waves, a significant trend of increase in incidence with age was observed for the first wave, whereas a significant trend of decrease was observed for the second wave ($p<0.001$) (figure 3B).

The overall cumulative incidence rate for all age groups combined was significantly higher than that of females (159.2 vs 115.6 per 1 000 000 population, $p<0.001$) (figure 4). Further analyses also revealed higher overall incidence rates for males ($p<0.001$), and the difference achieved statistical significance for each age group except among those aged ≥65 years.

**Testing policy and symptoms at diagnosis**

As part of the border control policies, persons arriving in Hong Kong with symptoms were transferred to hospital for further investigation. Since 25 March, additional testing policy on all asymptomatic persons coming from the UK, other countries in Europe and the USA was implemented. This policy resulted in a sharp increase in the detection of new cases who were asymptomatic at the time of diagnosis (figure 5).

**Imported cases**

Overall, majority of the cases were imported (59.3%, 422 of 1038), and the proportion of imported cases was significantly higher in the second wave as compared with the first wave (62.9% vs 21.4%, $p<0.001$) (online supplemental table 1). A sharp contrast in the source of imported cases between the first and second waves was observed (online supplemental figure 1). While all cases imported during the first wave were from mainland China, no further import was detected since the sea and land borders were closed; with the exception of one asymptomatic case who was escorted back from Wuhan
Figure 1  Number of confirmed cases by illness-onset date, time-varying reproduction number and arrival statistics at border points of entry. The epidemic curve in the upper panel includes 844 symptomatic cases. One symptomatic case with uncertain illness-onset date and 193 asymptomatic cases were excluded. The middle panel shows the estimated $R_t$ of each day with a black line, and their 95% CIs with shaded area. The lower panel shows the number of persons arriving in Hong Kong via land and sea borders, and airport.
by chartered flight. The UK ranked the top among importing countries and accounted for 84.4% (356) of all imported cases, followed by the USA (74, 17.5%) and France (41, 9.7%). A sharp contrast in age distribution of imported cases between the two waves was observed. The majority (66.7%) of the cases imported from mainland China during the first wave were older adults aged 55 years or above. Imported cases from the UK and the USA during the second wave were mainly adolescent and young adults, where the age group 15–24 years accounted for 59.0% and 37.8%, respectively (online supplemental figure 1).

Cluster events

In the first wave, there were 14 clusters affecting a total of 77 patients. The median number of patients affected in each cluster was 3 (IQR: 2–9). There were four medium-sized clusters, including the Buddhist worship hall (n=19); the Lunar New Year hot pot party (n=13); the Princess Diamond Cruise (n=11); and the Lunar New Year family dinner party (n=8) (online supplemental figure 2). The remaining clusters consisted of nine families that affected two to three patients each, and one cluster of family and colleagues that affected five patients.

In the second wave, there were a total of 112 clusters that affected 431 patients. The median number of patients affected in each cluster was 2 (IQR: 2–3). There were eight medium-spreading events: three clusters involving tour groups returning from Egypt (n=10), India (n=8) and Bolivia (n=8); two clusters in different karaoke lounges that affected nine and eight patients, respectively; a wedding banquet at Lantau Island (n=15); a cluster involving people who visited a drinking and clubbing spot, Lan Kwai Fong, (n=9); and a meal gathering in an international school (n=7) (online supplemental figure 2). There was a superspreading event that affected 103 patients. This bar and band cluster involved musicians and performers, and the customers in multiple bars where they performed. For the remaining 103 clusters, there were 17 families involving 44 patients (cluster size 2–5); 20 patients from 12 work-related clusters (cluster size 2–5); 28 patients who were travel collaterals returning from 11 travel groups from different countries; and 2 clusters resulted from wedding banquet and party that affected 5 patients each.

Containment delay

For the purpose of analysis in this study, containment delay was defined as the duration in days from the onset of symptom to isolation of the patient. Among 193 patients without symptoms at diagnosis, one with uncertain date...
of symptom onset and one with uncertain isolation date were excluded. Of the 843 patients included, 556 (66.0%) were regarded as having containment delay with an average delay of 4.0 days (SD 4.7). The containment delay was longer among local compared with imported cases (5.3±4.2 days vs 2.9±4.8 days, p<0.001); among older (≥65 years, 6.1±5.4 days, p<0.001), young adults (25–44 years, 4.6±4.8 days, p<0.001) and middle (45–64 years, 4.0±4.3 days, p<0.001) aged groups when compared with the youngest patients (0–25 years, 2.4±4.2 days). Containment delay was similar between male patients (4.2±5.0 days) and female patients (3.8±4.3 days), but was longer in local sporadic (6.1±4.2 days, p<0.001) and local cluster cases (5.1±4.1 days, p<0.001) than imported (2.9±4.8 days) cases. However, there was no significant difference in the containment delay between close contacts of imported cases (2.5±2.1 days, p=0.343) and imported cases. Older patients (adjusted OR (AOR): 1.01, 95% CI 1.00 to 1.02, p=0.040), male subjects (AOR: 1.41, 95% CI 1.02 to 1.96, p=0.039) and local cluster cases (AOR: 11.18, 95% CI 7.43 to 16.83, p<0.001) were significantly more likely to have longer containment delay by multivariate regression analysis.

DISCUSSION
Since the first detection of SARS-CoV-2 in Wuhan, China, the virus has gained efficient human-to-human transmission resulting in a pandemic involving virtually all parts of the world.19 While stringent containment measures were implemented in most nations, its effect on minimising the spread of infection and the associated mortality varies substantially.20 Despite having experience in controlling the initial wave, many cities had resurgence with larger epidemics.41 Hong Kong was among the earliest cities to detect COVID-19 cases, and had experienced two waves.

Figure 3  The number and incidence of patients with COVID-19 by epidemic waves. Panel (A) shows the number of cases with respect to the first wave (left) and second wave (right) for each age and sex group, and overall (in thick borders). Panel (B) shows the incidence rates. The number of locally acquired infections was 70 and 397 in the first and second waves, respectively; while there were 82 and 935 local residents in the two waves, respectively. Local residents refer to individuals with Hong Kong identity cards.
of epidemic in facing different epicentres. The cumulative incidence and mortality (135.5 and 0.5 per 1 000 000 population) observed during our study period was one of the lowest in the world. Many well-developed nations encountered significantly higher incidence and mortality rates, including the USA (6090 and 350 per 1 000 000 population), Canada (2560 and 210), the UK (4320 and 610), Spain (5180 and 580), Italy (3920 and 570), Singapore (6990 and 4) and Korea (230, 5), as of 13 June 2020.\textsuperscript{3,6,22} The success of Hong Kong in maintaining a low incidence and mortality would serve as a model for other cities with high population density and international travel volume.

A recent study performed on the first 715 confirmed cases in Hong Kong found that public health interventions including border entry restrictions; quarantine and isolation of cases and contacts; and behaviour changes at personal and population levels were associated with COVID-19 control.\textsuperscript{23} Our findings on the successful decline of transmissibility in the second wave could be attributed to these containment measures. When compared with this previous study,\textsuperscript{23} the present study included the evaluation and comparison of SARS-CoV-2 RNA transmissibility and additional epidemiological investigation between the two waves extended to the end of the second wave (up to 25 April 2020). Hence, the estimated $R_t$ covered the time period of both waves, allowing a direct comparison to be made between the two waves. In addition, we have also examined the more detailed age/gender-specific incidence of COVID-19, analysed the different clusters of the outbreak and examined the factors independently associated with containment delay.

In addition, our study found that the sea and land border control measures in the first wave and the compulsory home quarantine policies in the second wave for travel returnees were associated with a marked reduction in reproduction numbers. In order to achieve a timely effect, these border control measures, on one hand, have to aggressively step up to a very high level; and on the other hand, have to be implemented in conjunction with other policies especially intense contact tracing and case finding. A decision based on a fine balance among economic loss, freedom of travel and public health impact needs to be made in a timely manner. These findings are in line with a recent review,\textsuperscript{24} which summarised all the modelling studies that examined whether quarantine measures affected the COVID-19 pandemic control. The review identified that a combination of quarantine with other preventive strategies such as school closure, travel restrictions and social distancing exerted a great effect on reduction of viral transmission.

Our analysis on demographic characteristics of patients revealed remarkable differences between the two waves. The second wave was dominated by adolescents and young adults representing a mass return of overseas students who attempted to avoid disease exposure occurring in their studying cities. The context of large-sized and medium-sized cluster events, such as bars and karaoke lounges occurring in the second wave, also reflects the social networks of this young generation. In contrast, the cluster events of the first wave were family dinner gatherings during the special festival, namely the Lunar New Year. Social distancing advice and policies should therefore be tailored according to the characteristics of social network of the potential core of infectious source.

SARS-CoV-2 carries a transmission feature that is distinct from its close relative SARS-CoV-1. While the virus shedding, and hence infectivity, of SARS-CoV-1 peaks in the second week after illness onset,\textsuperscript{25} SARS-CoV-2 spread early and even before symptom onset.\textsuperscript{26} This difference in their characteristics, together with reports of transmission from asymptomatic persons,\textsuperscript{27} though with uncertain efficiency, detecting and isolating asymptomatic cases as well as cases at their presymptomatic stage, could help contain community transmission. In this regard, Hong Kong has implemented COVID-19 testing of asymptomatic persons arriving at the airport using self-collected deep throat saliva samples for adults and stool samples for children. Since this testing policy was implemented during the second wave in late March, a large number of asymptomatic cases were detected in the following 2 weeks. This also resulted in a substantial shortening of containment delay in the second wave.

Gender predilection in susceptibility and severity of SARS-CoV-2 infection remains controversial. Our observation that the incidence rates were consistently higher in males across all age groups is in line with a higher susceptibility or a higher chance of developing symptoms in males, as have been observed in other common respiratory viruses.\textsuperscript{28}

We found that the small cluster events in both the first and second waves were similar in composition, and mainly involved households of two to three family members. This coincides with the small average domestic household size of 2.8 in Hong Kong.\textsuperscript{29} Our observation confirms that household exposure poses a high risk of infection, which should be considered when practising home quarantine policies. In the first wave, there were two medium-sized clusters related to dinner gathering, which echoes with the suspicion of chopsticks being a vehicle of transmission when dishes are shared among family or friends.\textsuperscript{30} There was only one superspreading event, which occurred in the second wave, involving a bar and band cluster affecting 103 patients. Singing could generate aerosols, and is related to loudness.\textsuperscript{31} There were reports of high attack rate of SARS-CoV-2 after choir practice.\textsuperscript{32} Considering one of the highlights of performance of bands in bars is their close proximity with audiences and this could account for the large number of subjects affected.

Despite intense contact tracing and surveillance testing, a proportion of cases still had containment delay. Nevertheless, majority of cases had containment delay of less than 1 week, and a substantial improvement was achieved in the second wave. This could be due to a heightened
population awareness of the COVID-19 pandemic, behavioural modification of citizens in response to government measures and earlier attendance to healthcare providers during the second wave—given a potential learning effect due to previous community exposure to COVID-19. Another important contributor to the shortening in containment delay could be the increased testing capacity to cover COVID-19 testing in public primary care clinics and at the port of entry. Also, we observed that local cases were significantly more likely to have containment delay by multivariate regression analysis. This finding is compatible with the results of a previous study conducted in Hong Kong. Unlike imported cases who are more likely to be tested on arrival irrespective of symptomatology, local cases, especially those who were asymptomatic, might be less likely to receive testing.

There are several limitations of this study that should be addressed. First, this is an observational study including a consecutive sample of patients with COVID-19, and the associations identified might not be used to deduce cause-and-effect relationships. In addition, there are other governmental, community and individual-level factors that could influence the chance of acquiring and transmitting infection, including changes in the number of imported cases in other countries and variation of their infection control policy over time. These include the proportion of populations practising personal hygienic measures such as face masking, where data were not available; the vulnerability and lack of coping capacity of the city in mitigation of the pandemic; and COVID-19 testing policies as well as the willingness of suspected patients to receive those tests. Also, the baseline characteristics of patients in the two waves and hence their testing efforts may be different. Lastly, ethnicity data were not available in the source of data used in this study. A recent evaluation performed in England showed that people of the Black, Asian, Mixed-race and Ethnic minorities were at an increased risk of COVID-19 infection, implying that ethnicity could be regarded as an individual’s COVID-19 risk.

CONCLUSION
In summary, we have provided evidence on the effectiveness of public health measures on the control of the epidemic; compared the characteristics of patients and clusters in the two epidemic waves; and the factors associated with containment delay. These findings will contribute to a more in-depth understanding of the disease, and inform physicians and policymakers in formulation and implementation of pandemic mitigation strategies.

REFERENCES
1 Huang C, Wang Y, Li X, et al. Clinical features of patients infected with 2019 novel coronavirus in Wuhan, China. Lancet 2020;395:497–506.
2 Wang C, Horby PW, Hayden FG, et al. A novel coronavirus outbreak of global health concern. Lancet 2020;395:470–3.
3 WHO. Coronavirus disease (COVID-19) outbreak situation. Available: https://www.who.int/emergencies/diseases/novel-coronavirus-2019 [Accessed 31 May 2020].
4 Who press conference on may 25, 2020. Available: https://www.who.int/emergencies/diseases/novel-coronavirus-2019 [Accessed 16 Jun 2020].
5 Population Estimates. Census and Statistics Department. The government of the Hong Kong special administrative region. Available: https://www.censtatd.gov.hk/hkstat/sub/sp150.jsp?productCode=DS5320189 [Accessed 01 Jun 2020].
6 Wong SYS, Kwok KO, Chan FKL. What can countries learn from Hong Kong’s response to the COVID-19 pandemic? CMAJ 2020;192:E511–5.
7 Centre for Health Protection, Department of Health, The Government of Hong Kong Special Administrative Region. Latest situation of coronavirus disease (COVID-19) in Hong Kong. Hong Kong (China); Centre for Health Protection, Department of Health. The Government of Hong Kong Special Administrative Region, 2020. https://chp-dashboard.geodata.gov.hk/covid-19/en.html
8 Lai CKC, Ng RWY, Wong MCS, et al. Epidemiological characteristics of the first 100 cases of coronavirus disease 2019 (COVID-19) in Hong Kong special administrative region. China, a City with a stringent containment policy. Int J Epidemiol 2020;dyaa106.
Centre for Health Protection of the Hong Kong Special Administrative Region Government. Coronavirus disease (COVID-19) in HK. Available: https://cpd-dashboard.geodata.gov.hk/covid-19/en.html [Accessed 01 June 2020].

10 Thompson RN, Stoiko-TJE, van Gaalen RD, et al. Improved inference of time-varying reproduction numbers during infectious disease outbreaks. *Epidemics* 2019;29:100356.

11 Chong KC, Cheng W, Zhao S, et al. Monitoring disease transmissibility of 2019 novel coronavirus disease in Zhejiang, China. *Int J Infect Dis* 2020;96:128–30.

12 Flaxman S, Mishra S, Gandy A, et al. Estimating the number of infections and the impact of nonpharmaceutical interventions on COVID-19 in 11 European countries. Imperial College London (30-03-2020).

13 Li Q, Guan X, Wu P, et al. Early transmission dynamics in Wuhan, China, of novel coronavirus–infected pneumonia. *N Engl J Med Overseas Ed* 2020;382:1199–207.

14 Zhao S, Gao D, Zhuang Z, et al. Estimating the serial interval of the novel coronavirus disease (COVID-19): a statistical analysis using the public data in Hong Kong from January 16 to February 15, 2020. *Front Phys*: 8.

15 Census and Statistics Department. The government of the Hong Kong administrative region. population estimates. Available: https://www.censtatd.gov.hk/hkstat/sub/so20.jsp [Accessed 01 June 2020].

16 Li Y, Yu ITS, Xu P, et al. Predicting super spreading events during the 2003 severe acute respiratory syndrome epidemics in Hong Kong and Singapore. *Am J Epidemiol* 2004;160:719–28.

17 The coronavirus pandemic, South China Morning Post. One in four Hong Kong Covid-19 patients had travelled to places outside pandemic’s new epicentres in Europe and North America. Available: https://www.scmp.com/news/hong-kong/health-environment/article/3080538/coronavirus-hong-kong-health-experts-call [Accessed 21 Aug 2020].

18 The Government of Hong Kong Special Administrative Region. Government to impose mandatory quarantine on people entering Hong Kong from Mainland [press release], Hong Kong (China: The Government of Hong Kong Special Administrative Region, 2020. www.info.gov.hk/gia/general/202002/05/P2020020500073.htm.

19 Li Q, Guan X, Wu P, et al. Early transmission dynamics in Wuhan, China, of novel coronavirus-infected pneumonia. *N Engl J Med* 2020;382:1199–207.

20 Tabari P, Amini M, Moghadami M, et al. International public health responses to COVID-19 outbreak: a rapid review. *Iran J Med Sci* 2020;45:157–69.

21 World Health Organization. Health emergency Dashboard. Available: https://covid19.who.int/region/wpro/country/sg [Accessed 17 Jun 2020].

22 World Population Review. Countries by density by population, 2020. Available: https://worldpopulationreview.com [Accessed on 14 June, 2020].

23 Cowling BJ, Ali ST, Ng TWY, et al. Impact assessment of non-pharmaceutical interventions against coronavirus disease 2019 and influenza in Hong Kong: an observational study. *Lancet Public Health* 2020;5:e279–88.

24 Nussbaumer-Strieb B, Mayr V, Dobrescu AI, et al. Quarantine alone or in combination with other public health measures to control COVID-19: a rapid review. *Cochrane Database Syst Rev* 2020;4:CD013574.

25 Peiris JSM, Chu CM, Cheng VCC, et al. Clinical progression and viral load in a community outbreak of coronavirus-associated SARS pneumonia: a prospective study. *Lancet* 2003;361:1767–72.

26 Arons MM, Holtkoetter RC, Heddy SC, et al. Presymptomatic SARS-CoV-2 infections and transmission in a skilled nursing facility. *N Engl J Med* 2020;382:2081–90.

27 Rothe C, Schunk M, Sothmann P, et al. Transmission of 2019-nCoV infection from an asymptomatic contact in Germany. *N Engl J Med* 2020;382:970–1.

28 Chan PKS, Tam WWS, Lee TC, et al. Hospitalization incidence, mortality, and seasonality of common respiratory viruses over a period of 15 years in a developed subtropical City. *Medicine* 2015;94:e2024.

29 The Census and Statistics Department. The government of the Hong Kong special administrative region. Available: https://www.censtatd.gov.hk/hkstat/sub/sp150.jsp?tableID=005&ID=0&productType=8 [Accessed 17 Jun 2020].

30 Liu G, Lau CKC, Chen Z, et al. SARS-CoV-2 RNA detection on disposable wooden chopsticks, Hong Kong. *Emerg Infect Dis* 2020;26:2274–6.

31 Asadi S, Wexler AS, Cappa CD, et al. Aerosol emission and superemission during human speech increase with voice loudness. *Sci Rep* 2019;9:2348.

32 Hamer L, Dubbel P, Capron I, et al. High SARS-CoV-2 Attack Rate Following Exposure at a Choir Practice - Skagit County, Washington, March 2020. *MMWR Morb Mortal Wkly Rep* 2020;69:606–10.

33 Koo JR, Cook AR, Park M, et al. Interventions to mitigate early spread of SARS-CoV-2 in Singapore: a modelling study. *Lancet Infect Dis* 2020;20:678–88.

34 Wong MCS, Huang J, Teoh JYC, et al. Identifying a capability framework that could mitigate the coronavirus disease 2019 pandemic in a global health community. *J Infect Dis* 2020;222:880–1.

35 Lau JT, Tsui H, Lau M, et al. Sars transmission, risk factors, and prevention in Hong Kong. *Emerg Infect Dis* 2004;10:587–92.

36 Wong MC, Huang J, Teoh J, et al. Evaluation on different non-pharmaceutical interventions during COVID-19 pandemic: an analysis of 129 countries. *J Infect* 2020;81:e70–1.

37 Wong SH, Teoh JYC, Leung C-H, et al. COVID-19 and public interest in face mask use. *Am J Respir Crit Care Med* 2020;202:453–5.

38 Wong MC, Teoh JY, Huang J, et al. The potential impact of vulnerability and coping capacity on the pandemic control of COVID-19. *J Infect* 2020;30337–6.

39 Alaa AM, Qian Z, Rashbass J, et al. Ethnicity and outcomes of COVID-19 patients in England. Available: https://vanderschaar-lab.com/papers/Ethnicity_COVID19_Cambridge_NHS.pdf [Accessed 29 Aug 2020].