



## MEMORANDUM

**To:** Valued Frontier State Bank Customers and Clients  
Frontier State Bank Team Members  
**From:** Joseph D. McKean Jr., MD, Chairman and CEO  
**Date:** Monday, March 16, 2020  
**Subject:** Frontier State Bank Comprehensive Business Continuity and Pandemic Plan

As many of you know, I am a retired Emergency Physician. I invested in Southeast Plaza Bank, during its founding year 45 years ago which we later renamed Frontier State Bank. We have been and will continue to be a mid-size Community Bank dedicated to serving the Oklahoma City Metroplex.

The Frontier State Bank Team has a comprehensive Business Continuity and Pandemic Plan which has been implemented. It strives to eliminate, or at least reduces potential service interruptions to our customers and clients.

The last Pandemic was in 1968. The Banking world is vastly different now. Electronic advances have significantly reduced the need to do your Banking on site during Banking hours. Frontier uses the latest software to provide state of the art electronic services. You can easily check you balances, pay a bill, transfer funds, send money and many other functions electronically, including making deposits via Mobile Banking. You can electronically access to your accounts 24/7/365 via several methods:

Online Banking:	<a href="http://www.frontier-ok.com">www.frontier-ok.com</a>
Mobile Banking:	<a href="http://www.frontier-ok.com">www.frontier-ok.com</a>
Telephone Banking:	405 / 670-0369
Automated Teller Machine:	ATM

Contact Customer Services at 405 / 672-7831 and they will assist you with enrolling.

During the Pandemic it is best to use our electronic banking services whenever you can. Secondly, if the service you need can be handled appropriately via the Drive Thru Teller, then please use that method. For the present we intend to keep the Bank Lobby open during normal Banking Hours and all departments available to our customers. That policy, of course, is subject to change. We are following the CDC recommendations and providing our team with hand sanitizers, disinfecting wipes and spray, and masks. The Government and Banking Regulators are in the process of developing new policies and options to minimize the negative financial impacts to you and your business. The Frontier State Bank Team is monitoring these communications daily. If you or your business is significantly adversely financially impacted by the Pandemic please contact your client representative or Customer Service at 405 / 672-7831 or email us at [customerservice@frontier-ok.com](mailto:customerservice@frontier-ok.com) to determine what options might be available to you. We are here to Help and Assist you. Please communicate with us if you have a financial problem. With that said, please understand that we may become somewhat overloaded at any point time. This is our first Pandemic.

**Be aware of potential scams.** Scammers and cyber-criminals may try to take advantage of you by offering fake products, fake charities, fraudulent links, etc. Stay Alert.

Please use good ole Okie "COMMON SENSE". It is not necessary to stock pile cash or food or anything else. While it will take a few days or weeks, to settle down, the vast majority of everyone will continue to work and be productive and maintain a fairly normal lifestyle.

#### **FACTS regarding the COVID-19 Coronavirus Pandemic**

While I am not an expert regarding Pandemics, I am concerned by the misinformation the media continues to spew trying to come up with the latest "sound bite". All this does is lead to confusion and panic, neither of which is helpful nor productive. Perspective, balance, and knowledge without political or advertising value, is much more important.

Historically there have been about Nine (9) previous Flu Pandemics in the past 300 years; about one every 30-35 years, however the range has been from 3 years to 56 years. Pandemics are random events and totally unpredictable. While the 2020 Pandemic is still evolving, it is clear the outcome will be vastly different than the previous ones. I personally lived through the Pandemics of 1957 (Asian Flu – 2 million deaths worldwide) and 1968 (1 million deaths worldwide), but I have no recall regarding those. However, the Pandemic of 1918 was the worse one in recent history at least 20,000,000 deaths worldwide, and maybe as many as 50,000,000!

It really bothers me that the media has yet to communicate the real risk. First, no one knows what the outcome is going to be.....we simply have to acknowledge "uncertainty". Secondly, decision makers have to consider worst-case scenarios.....low-probability, high-magnitude. These decisions are not easy and balance becomes important. Whatever the decision, it will have unintended consequences. Many of the unintended consequences will be FINANCIAL. Please know we are here to assist you with any financial "unintended consequences" you may experience.

Viral Pandemics are caused by a totally new virus. Thus, no one has any immunity. That's why they spread so fast. Reducing the speed of transmission becomes the Critical Factor.

While I may or may not believe the decision makers are over-reacting, that is easy to say when you are ignorant. Thus, knowledge becomes important. With something totally new, never previously existing, knowledge is very limited. However, much has been learned in the last 60-75 days.

Attached to this memo for your reference is the Scientific Abstract of the **"Adjusted Age-Specific case Fatality Ratio During The COVID-19 Epidemic in Hubei, China, January and February 2020"**. This is a very scientific approach to identifying and evaluating the facts.....without being politically correct or media sensitive. It is what it is. Like most scientific documents it full of statistics that make little sense to most of us. Therefore, a colleague of mine and I developed a summary of this study and other pertinent data and facts.

Sincerely,



Joseph D. McKean Jr MD  
Chairman and CEO

## PERSONAL SUMMARY

of

### **“Adjusted Age-Specific Case Fatality Ratio During The COVID-19 Epidemic in Hubei, China, January and February 2020” And Other Publications**

**by P. Benson MD and J D McKean MD**

1. The Coronavirus COVID-19 is a new virus therefore no one has immunity. Eventually, everyone will become infected and develop antibodies to this virus. The MAJOR OBJECTIVE is to control the rate and magnitude of the transmission of the infection. If everyone gets sick all at once the mortality rate will increase because there is simply not enough health care capacity (hospitals, doctors, nurses, equipment) to manage and care for everyone all at once. (See the final Chart below)
2. Less than 50% of those infected will develop any symptoms. However, the percentage of symptomatic infected people greatly increases with the additional Risk Factors. Under age 50 in good health generally do not become symptomatic. Probably less than 10%.
3. Deaths from COVID-19 are almost all in the A) elderly, B) existing poor health, and C) compromised immune systems for whatever reason. A combination of these factors greatly increases the RISK. However, demographic data for this study was only available by age and not existing health conditions. The Death Rate for those Infected Symptomatic people over 80 is about 250% the average death rate for this group in the USA. And almost all of these are related to Viral Interstitial Pneumonia. If they are infected, but not symptomatic the death rate increases by about 15% above average. It appears for all age groups the Death Rate increases about 10-15% above average for the infected non-symptomatic people, and about doubles for the infected symptomatic peoples, which is probably closely correlated to additional risk factors.
4. The data clearly indicates the Chinese Government made a wise decision to quarantine the entire province of Hubei. Although the virus first appeared in December 2019 it wasn't until the second week of January 2020 a significant number of cases were reported. The number of new cases exploded daily during the third week of January 2020. On January 20, 2020 the Government implemented the quarantine and strict control measures in Hubei Province. Within a week the number of new cases each day peaked. By February the number of new cases in Hubei gradually started to decrease. Friday last week, March 12<sup>th</sup>, only 8 new cases were reported in Hubei. To me that is very impressive! Within six weeks they had controlled the rapid spread of this infection.
5. The US government and the CDC are making the right moves for the right reasons. We MUST reduce the rate of Transmission as much as possible as quickly as possible.
6. Incubation period after exposure averages 4.7-5.6 days, but apparently can be as short as 12 hours.
7. Infected Symptomatic people are “infectious” to others. The virus is considered highly contagious.
8. Infected NON-Symptomatic people may not be infectious. Certainly, much less so than Symptomatic people.
9. The percentage of Infected Symptomatic people greatly increases with the Risk Factors of age and existing poor health.
10. The Government's Mission:
  - a. SLOW down the transmission of the infection
  - b. Keep those with increased Risk Factors uninfected as long as possible
  - c. Reduce overloading the health care system
  - d. TIME for the development of effective immune-globulin and antiviral treatments
  - e. TIME for development and administration of a vaccine.



11. We must buy time.
  - a. Time to manufacture needed equipment and supplies
  - b. Time to train everyone to prevent contamination
  - c. Time to move medical personnel and supplies where needed
  - d. Time to educate the public
  - e. Time to help each critically ill senior to get better and out of the hospital before the next one gets sick.
  
12. How do we buy time?
  - a. Decrease the number of seniors exposed to COVID-19
  - b. Have seniors self-quarantine, so they get sick later, or not get sick at all
  - c. Close nursing homes to visitors
  - d. Decrease everyone's exposure, cancel events, restrict travel
  - e. Improve everyone's hygiene
  - f. Follow CDC's recommendations to slow the transmission of the virus
  
13. We must buy time without interrupting essential services
  - a. Don't panic
  - b. Don't overstock and cause shortages
  - c. Help prevent a fight over hospital beds and supplies

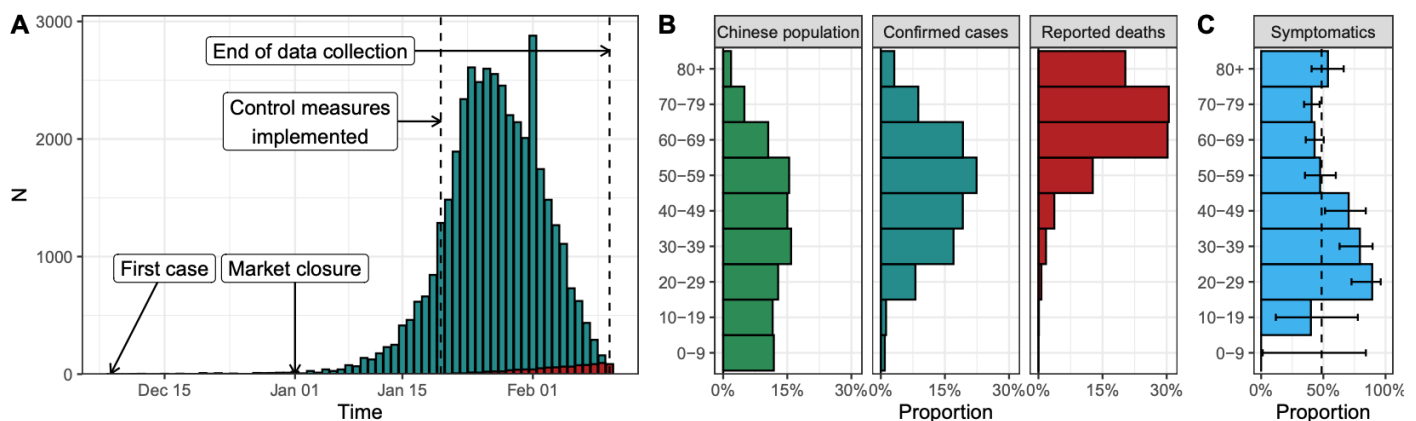
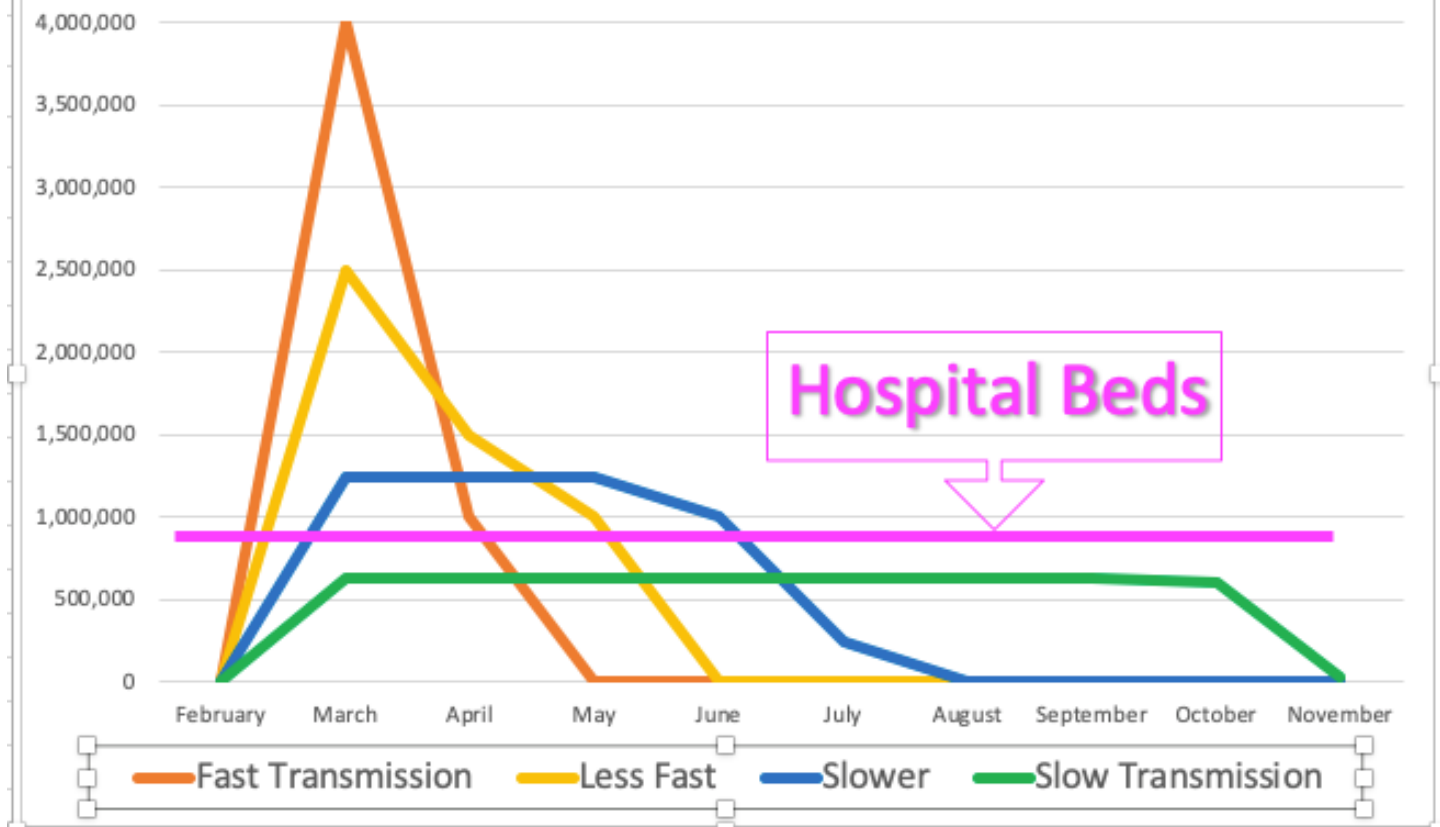


Figure 1: (A) Reported confirmed cases of COVID-19 in Hubei by date of disease onset (blue) and reported deaths (red) from 8 December, 2019 until 11 February, 2020. (B) Age distribution of the Chinese population compared to that of confirmed cases of and deaths due to COVID-19. (C) Proportion of individuals infected by COVID-19 showing symptoms among passengers of the Diamond Princess ship (with 95% credible interval).

Seniors Needing Hospitalization for COVID-19



# ADJUSTED AGE-SPECIFIC CASE FATALITY RATIO DURING THE COVID-19 EPIDEMIC IN HUBEI, CHINA, JANUARY AND FEBRUARY 2020

A PREPRINT

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## ABSTRACT

The coronavirus disease 2019 (COVID-19) epidemic that originated in Wuhan, China has spread to more than 60 countries. We estimated the age-specific case fatality ratio (CFR) by fitting a transmission model to data from China, accounting for underreporting of cases and the time delay to death. Overall CFR among all infections was 1.6% (1.4-1.8%) and increased considerably for the elderly, highlighting the expected burden for populations with further expansion of the COVID-19 epidemic around the globe.

## Introduction

As of 2 March 2020, the 2019 novel coronavirus disease (COVID-19) epidemic that originated in Wuhan, China, has affected more than 60 countries and resulted in 88,948 confirmed cases and 3,043 deaths globally [1]. The transmission characteristics of COVID-19 appear to be similar to those of pandemic influenza and will likely facilitate further global spread [2]. During this early phase of a potential pandemic, it is critically important to obtain reliable estimates of the overall case fatality ratio (CFR), i.e., the proportion of all (asymptomatic and symptomatic) infected cases that will die as a result of the disease. Such estimates will help anticipate the expected morbidity and mortality due to COVID-19 and provide critical information for the planning of health care systems in countries that face an epidemic.

Obtaining reliable estimates of CFR can be challenging during the early phase of an epidemic [3, 4]. A crude CFR of 2.3% was estimated based on 1,023 deaths out of 44,672 confirmed cases reported until February 11, 2020 [5]. So-called “crude estimates” of CFR from the reported numbers of confirmed cases and deaths are difficult to interpret due to the likely under-ascertainment of mild or asymptomatic cases and the right-censoring of cases with respect to the time delay from illness onset to death. Some analyses attempted to correct for right-censoring of deaths, leading to an estimate of CFR of 7.2% (95% confidence interval: 6.6%-8.0%) for Hubei province using a competing risk model [6]. Using data on exported cases and correcting for right-censoring of deaths occurred in China, another team reported a CFR estimate of 5.3% (95% confidence interval: 3.5%, 7.5%) among confirmed cases [7]. Finally, another team reported a CFR of 18% (95% credible interval: 11-81%) among cases detected in Hubei, accounting for the delay in mortality [8]. The same study provided adjusted estimates of the overall CFR based on data from the early epidemic in Hubei and from cases reported outside China at 1% (95% CI: 0.5%-4%). With the objective of correcting all listed biases, we fitted a dynamic transmission model to reported data of confirmed cases and deaths in Hubei [9] and obtained adjusted and age-specific estimates of the overall CFR of COVID-19 among both symptomatic and asymptomatic patients in the Hubei province until 11 February 2020.

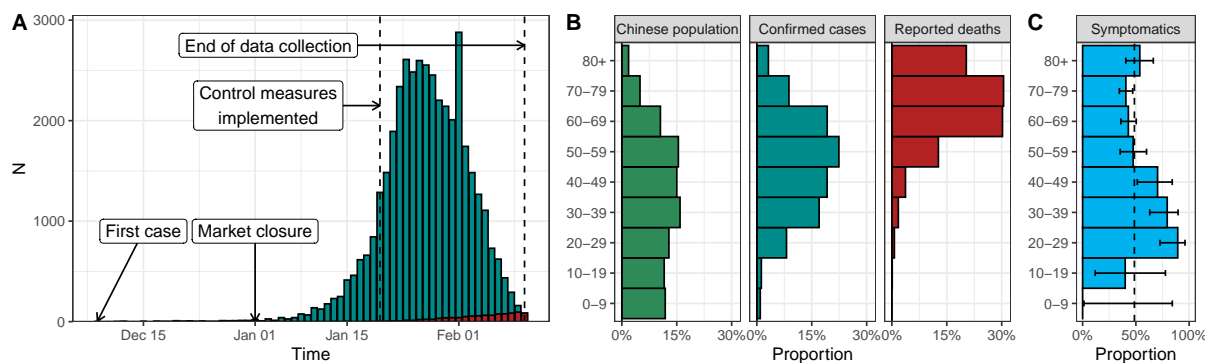


Figure 1: (A) Reported confirmed cases of COVID-19 in Hubei by date of disease onset (blue) and reported deaths (red) from 8 December, 2019 until 11 February, 2020. (B) Age distribution of the Chinese population compared to that of confirmed cases and deaths due to COVID-19. (C) Proportion of individuals infected by COVID-19 showing symptoms among passengers of the Diamond Princess ship (with 95% credible interval).

## The COVID-19 epidemic in Hubei, China

The outbreak of COVID-19 appears to originate from multiple zoonotic transmission events at the Huanan Wholesale Seafood market in Wuhan in early December 2019, with the animal source remaining unknown [10]. Early January 2020, a novel coronavirus (subsequently named SARS-CoV-2) was identified as the causal agent of the epidemic [11]. In a first phase of the epidemic, human-to-human transmission occurred at a high rate in Wuhan and other areas of the Hubei province, leading to an exponential growth of incidence (Figure 1A). On 20 January, Chinese authorities implemented strict control measures in the Hubei province, including contact tracing aimed at identifying, treating and isolating cases and quarantining contacts, extension of holidays, temperature checks before accessing public areas, cancellation of mass gatherings and the promotion of extreme social distancing [10]. Three days later, a cordon sanitaire was imposed, with strict traffic restrictions. From 27 January, the daily incidence of cases by disease onset started plateauing, then decreased. The Chinese CDC published a description of the epidemiological characteristics of cases reported until 11 February 2020, including the age distribution of cases and deaths reported up to this point in China, that we applied to Hubei (Figure 1B).

## An age-structured model of COVID-19 transmission and mortality

We simulated the dynamics of the COVID-19 epidemic in Hubei from 1 January 2020 to 11 February 2020. We used an age-stratified susceptible-exposed-infected-removed (SEIR) compartmental model, with a distinction between asymptomatic and symptomatic infections. We stratified the population by 10-year ranges, leading to 9 age classes (0-9 years old, ..., 80 years old and more). After an incubation period of 5.6 days [12], 49% of infected people develop symptoms and become infectious [13] while the remaining remain asymptomatic and do not transmit the disease further. This proportion of 49% of symptomatic was estimated by testing every passenger on the Diamond Princess ship (Figure 1C). We then fixed the time from onset to removal to 2.9 days [14]. These parameters are identical across all age classes.

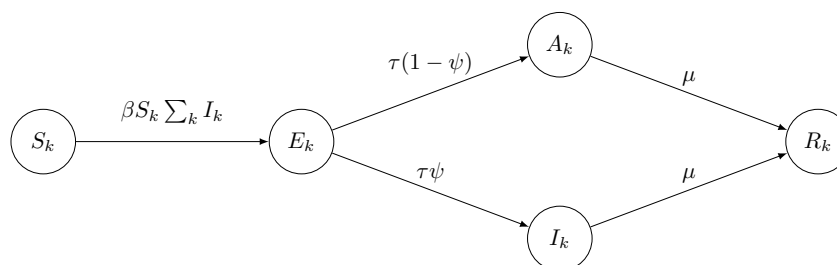


Figure 2: Schematic description of the COVID-19 transmission model. We considered five compartments for each age group  $k$ : susceptible  $S_k$ , exposed  $E_k$ , symptomatically infected  $I_k$ , asymptomatically infected  $A_k$ , and removed  $R_k$ . The cumulative incidence of symptomatic cases is recorded in compartment  $C_k$ , from which we compute the daily incidence of reported cases  $J_k$  and the daily incidence of deaths  $D_k$ . Model parameters: transmission rate  $\beta$ , incubation rate  $\tau$ , probability of symptomatic infection  $\psi$ , removal rate  $\mu$ , reporting rate of symptomatics  $\rho_k$  (by age group), probability of death  $\epsilon_k$  among symptomatics (by age group), and delay from disease onset to death  $\gamma$  (discretized by day).

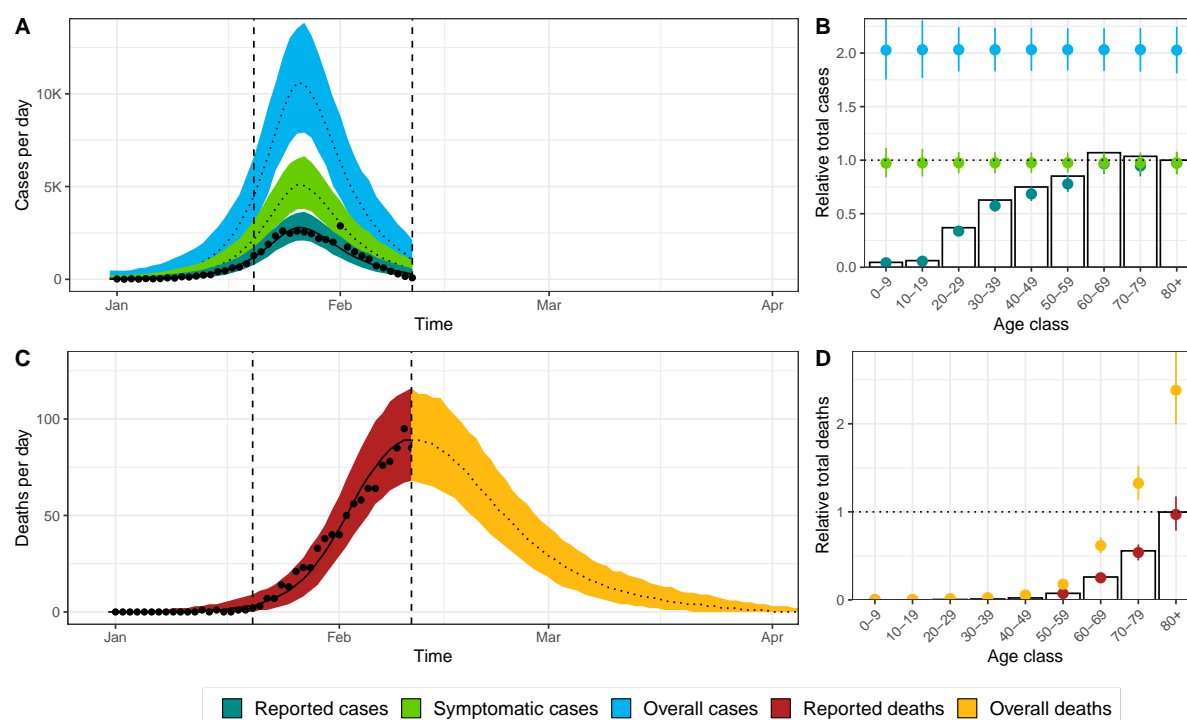


Figure 3: Model fit of COVID-19 incident cases (A), age distribution of cases (B), incidence of deaths (C), and age distribution of deaths (D). Dots and columns show data. Lines and shaded areas or points and intervals show the posterior median and 95% credible intervals for five types of model output: reported cases, symptomatic cases, overall cases (i.e. symptomatic and asymptomatic cases), reported deaths until 11 February 2020 (time point b), and deaths that will occur after this date. On panels B and D, numbers are scaled by Chinese age distribution and by the number reported for the highest age group (80+).

We modelled the decrease in the transmission of SARS-CoV-2 due to the progressive implementation of control measures from 20 February by using a sigmoid function for the transmission rate. It includes four parameters: the initial transmission rate, the decrease in transmission due the control measures, the time delay between implementation and effect and the slope of this decrease. We assumed that symptomatic people had an age-specific case-fatality rate and that time from onset to death followed a log-normal distribution with mean 20.2 days and standard deviation 11.6 [12]. Thus, we could estimate the number of deaths at each time point and account for the deaths that occurred after 11 February 2020.

We simultaneously fitted our model to four data sets: (1) the number of confirmed cases by day of disease onset from January 1 to February 11, (2) the number of deaths by day of occurrence from January 1 to February 11, (3) the age distribution of all confirmed cases until 11 February and (4) the age distribution of all deaths reported by 11 February. These data were extracted from the CCDC report [9]. We assumed that all deaths were reported and that all symptomatic cases among people of aged 80 years and older were also reported. For the other age classes, we modelled the underreporting of symptomatic cases by an age-dependent reporting rate. We used negative binomial distributions to describe the number of reported cases and deaths and multinomial distributions to describe the distribution of cases and deaths over age classes. We implemented the model in a Bayesian framework using Stan [15]. All code and data are available from [https://github.com/jriou/covid\\_adjusted\\_cfr](https://github.com/jriou/covid_adjusted_cfr).

## Estimated case fatality ratio by age group during the COVID-19 epidemic in Hubei

Our model accurately describes the dynamics of transmission and mortality by age group during the COVID-19 epidemic in Hubei from 1 January to 11 February (Figure 2). Control measures implemented on 20 January led to a reduction of transmissibility by 99% (95% credible interval [CrI]: 97-100), with a diminution in case incidence after six days. Under the assumption that the risk of transmission of COVID-19 was homogeneous by age, so that the deficit of reported cases in the younger age classes can be attributed to surveillance bias, the total number of symptomatic cases was estimated to 74,200 (95%CrI: 67,000-81,600), 1.8 times more than the 41,092 reported cases during that period. Under the assumption that 49% of infections lead to symptoms, this implies that a total of 152,700 individuals (95%CrI: 137,800-167,900) were infected in the Hubei province during that period.



As of 11 February, 979 deaths have been reported among people infected before that date. Under our assumption regarding the distribution of the delay between disease onset and death, the model predicts a total of 2,441 deaths (95%CrI: 2,225-2702) among all people infected before 11 February. This results in an adjusted CFR of 1.6% (95%CrI: 1.4-1.8) among all people infected by COVID-19 in Hubei during that period. Moreover, our adjustment leads to sensible modifications of the age-specific CFR (Table 1). Compared to the crude CFR, the adjusted CFR is even lower in the younger age classes (0-59 years old) but higher in people aged 60 and more.

## Strengths and limitations

In this work, we propose a comprehensive solution to the estimation of CFR from surveillance data during outbreaks [3], and apply it to data from the COVID-19 epidemic in Hubei, China. Our work has three important strengths. (1) We use a mechanistic model for the transmission of and the mortality associated with COVID-19 that is a direct translation of the data-generating mechanisms leading to the biased observations of the number of deaths (because of right-censoring) and of cases (because of surveillance bias). Our model also accounts for the effect of control measures on disease transmission. (2) Our model is stratified by age group, which has been shown as a crucial feature for modelling emerging respiratory infections [16]. (3) The estimates rely on routinely collected surveillance data such as incident cases by disease onset, incidence deaths, and the age distribution of cases and deaths, and does not require individual-level data nor studies in the general population. The Bayesian framework allows the propagation of the uncertainty from data to the estimates.

Our work has several limitations. (1) Our results depend on the central assumption that the cause of the deficit of reported cases among younger age groups is a surveillance bias and does not reflect a lower risk of infection in younger individuals. The reason for this age shift is unknown [10]. Retrospective testing for COVID-19 of samples from influenza-like-illness surveillance found no positive test among children, but the sample sizes were small (20 per week including both adults and children) [10]. Uneven age distributions in the risk of infection can be attributed to immunological features, such as the lower circulation of H1N1 influenza in older individuals due to residual immunity [17]. An immunological explanation of the opposite phenomenon, with a lower susceptibility of younger individuals, seems unlikely, and there is no indication of pre-existing immunity to COVID-19 in humans [10]. Different contact patterns could play a role in a limited outbreak, but not in such a widespread infection, especially as household transmission seems to play a major role [10]. The last explanation that we assume here is that younger individuals, when symptomatic, have milder symptoms that decrease the probability of seeking care and being identified.

(2) In a related matter, our results depend on the assumption that older individuals have more severe symptoms and are more likely to be identified. In the absence of an outside reference point, the reporting rate cannot be estimated from surveillance data only. We chose to fix to 100% the reporting rate of infected individuals that have symptoms and are aged 80 and more, and estimate the reporting rates in other age groups relatively to that of older individuals. If further data, coming from a study in the general population, shows that this assumption is violated, this would lead to an overestimation of the CFR in our study.

(3) There is important uncertainty around the proportion of asymptomatic infections. Currently, the detection of asymptomatic patients in China is limited by the focus on symptomatic patients seeking care and the lack of seroprevalence data [18]. The proportion of symptomatic infections has been estimated to 58% (95% confidence interval: 33-83) in a small sample of cases exported to Japan [19]. During the outbreak on the ship “Diamond Princess”, nearly all individuals were tested regardless of symptoms, leading to an average proportion of symptomatic infections of 49% in a sample size of 619, which was used in the present study [13]. Still, uncertainty about the proportion of symptomatic infections will remain until a large retrospective seroprevalence study is conducted in the general population, and our results are dependent on this estimate. Additionally, the dichotomization of infection into asymptomatic and symptomatic is a simplification of reality; the infection with SARS-CoV-2, will likely cause a gradient of symptoms in different individuals depending on age, sex and comorbidities [10]. The proportion of asymptomatic infections might show an age-dependent structure.

(4) Our findings regarding the CFR are specific to the context, and should be interpreted in that light. The findings describe the situation in Hubei from 1 January to 11 February, 2020. It was demonstrated there, that mortality rates have changed over time as a result of an improvement of the standard of care [10]. The standard of care and, as a result, the CFR is setting-dependent and cannot be directly applied to other contexts.

## Conclusions

We developed a mechanistic approach to correct for the biases in the crude estimates of CFR and provide an adjusted CFR by age group with regards to the ongoing COVID-19 epidemic in Hubei, China between 1 January and 11 February. We find that 1.6% (1.4-1.8) of individuals infected with COVID-19 during that period with or without symptoms died or will die, with even more important differences by age group than suggested by the raw data. The probability of death among infected individuals with symptoms is estimated at 3.3% (2.9-3.8), with a

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Table 1: Estimates of case fatality ratio during the COVID-19 epidemic in Hubei, overall and by age group (median posterior and 95% credible interval).

	Overall	0-9	10-19	20-29	30-39	40-49	50-59	60-69	70-79	80+
<i>Case fatality ratio among symptomatic infections</i>										
Crude	2.4% (2.1-2.8)	0% (0-1.3)	0.25% (0-1.3)	0.22% (0.054-0.51)	0.26% (0.12-0.45)	0.48% (0.28-0.73)	1.4% (1-1.8)	3.8% (3.1-4.7)	8.5% (6.9-10)	15% (12-18)
Adjusted for delayed mortality	6% (5.3-6.9)	0.44% (0-2.8)	0.78% (0-2.9)	0.54% (0.18-1.2)	0.64% (0.34-1.1)	1.2% (0.77-1.7)	3.4% (2.7-4.2)	9.4% (7.9-11)	21% (17-25)	36% (30-44)
Adjusted for unidentified symptomatic cases	1.3% (1.2-1.5)	0% (0-0.055)	0.014% (0-0.076)	0.076% (0.019-0.17)	0.15% (0.069-0.26)	0.34% (0.19-0.51)	1.1% (0.84-1.4)	3.8% (3.1-4.6)	8.2% (6.7-9.8)	15% (12-18)
Adjusted for both	3.3% (2.9-3.8)	0.019% (0-0.12)	0.046% (0-0.17)	0.19% (0.061-0.41)	0.38% (0.2-0.62)	0.82% (0.54-1.2)	2.7% (2.1-3.4)	9.4% (7.9-11)	20% (17-24)	36% (30-44)
<i>Case fatality ratio among all symptomatic and asymptomatic infections</i>										
Adjusted for both	1.6% (1.4-1.8)	0.0094% (0-0.058)	0.022% (0-0.082)	0.091% (0.03-0.2)	0.18% (0.096-0.3)	0.4% (0.26-0.58)	1.3% (1-1.6)	4.6% (3.8-5.4)	9.8% (8.2-12)	18% (14-22)

steep increase over 60 years old to reach 36% over 80 years old. While specific to the situation in Hubei, China during this period, these findings will help the mitigation efforts and planning of resources as other regions prepare for COVID-19 epidemics.

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## **Conflict of interest**

None.

## **Authors' contributions**

JR and AH designed the model and performed the statistical analyses. JR, AH, MC and CLA interpreted the results and wrote the manuscript.