

# Forecast of COVID-19 related deaths in the USA

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## Research Article

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# Abstract

## Objective

Different governments have adopted different containment strategies for SARS-CoV-2. We compared reports of COVID-19 related deaths between countries with different strategies.

## Design

Publicly available data on numbers of reported COVID-19 related deaths between January 1st and April 2nd 2020 were compared between countries.

## Results

In countries that implemented strict containment strategies as soon as the virus was firmly established (e.g., Italy and Spain) the epidemic developed similarly to the development in China. Extrapolation suggests the cumulative number of deaths in Italy and Spain to rise to about 22,000 and 41,000, respectively. In South Korea where containment strategies were implemented before the virus arrived, the epidemic developed much slower. In the United States, however, where measures were taken later, the epidemic is developing explosively. Cumulative numbers of deaths in the New York, New Jersey, and Michigan area are forecast to reach about 15,000. Of note, 85% of these deaths are likely to occur within the first 50 days of the epidemic (i.e. before the end of April 2020).

## Conclusions

Although the future development of the epidemic remains difficult to predict accurately, current data suggest the United States will experience an explosive increase in deaths due to COVID-19 before the end of April 2020. Drastic measures are needed immediately to prevent other parts of the country from experiencing a development of this epidemic which is as dramatic as that seen in New York, New Jersey and Michigan.

# Article Summary

## Strengths of this study

- Easy, direct, graphic comparison of epidemic development between countries
- Prediction of development of the epidemic in individual countries in the near future
- Shape of the epidemic development corrected for testing and reporting bias

## Limitations of this study

- Absolute numbers subject to testing and reporting bias
- All results subject to chance variation

# Introduction

Since the start of the outbreak of SARS-CoV-2 in December 2019, in the Hubei province in China, the virus has quickly spread worldwide.[1-3] As the virus spread, so did the COVID-19 disease that it causes. To curb the surge in COVID-19 related mortality, different governments enforced different measures for the containment of the epidemic.[4, 5] Comparing numbers of cases between countries is difficult, due to vast differences in testing policies. Now, as the epidemic claims more lives worldwide, the accumulation of mortality can be compared between countries,[6, 7] to obtain some insight into the effectiveness of the different containment measures. Here, we present the results of our comparison.

## Methods

### Data

Reported numbers of deaths per country were obtained from the European Union Open Data Portal, where data on worldwide numbers of reported cases and numbers of reported deaths, for the COVID-19 epidemic are updated daily.[6] Numbers of reported deaths between January 1<sup>st</sup> and April 2<sup>nd</sup> 2020 were compared between countries.

### Comparability of data between countries

The comparability of data between countries was increased in two distinct ways. First, the start of the epidemic was synchronized between countries, by using the date of the first reported COVID-19 related death as the index date. Second, the size and susceptibility of the population, and the probability of a COVID-19 death being reported as such, were all corrected for in a single procedure. All cumulative numbers of death were normalized to a reference number. As a reference we took the cumulative number of deaths at day 25 of the synchronized epidemic (i.e. day 25 after the index date for each country). By day 25 after the first death, the epidemic has stably established itself and the number of deaths has increased to a level where random fluctuations are reduced to an acceptable level. To assess the potential influence of choosing day 25 as a reference, sensitivity analyses were performed taking days 20 and 30 as the references.

### Visual representation and categorization of countries

After synchronizing countries by the date of the first death in each country, cumulative numbers of deaths were expressed as percentages of the cumulative number of deaths on day 25, for each country. Resulting percentages were expressed in graphs, plotted against synchronized time.

Temporal trends in cumulative numbers of deaths were compared to those for China, where the epidemic started, and where the temporal trends have therefore developed the farthest. For comparison to China, countries were divided into three categories. First, countries with a policy similar to that of China. These are the European countries, where governments waited for the epidemic to establish itself, but not for

substantial numbers of COVID-19 related deaths to occur, before taking preventive measures. Italy and Spain were used as examples, but graph shapes for other European countries were rather similar. Second, in South Korea, strict preventive measures were put into place even before the virus spread substantially in the population. Third, a comparison was made with the United States, where preventive measures were not put into place until large numbers of deaths had occurred.

## **Forecast**

Based on the comparison with China, where the epidemic in Hubei province has been contained and has ended virtually completely, results from other countries can be extrapolated beyond the current point in time, to arrive at a forecast of COVID-19 deaths in the near future.

## **Patient and public involvement and ethics considerations**

Since only publicly available data, aggregated at the level of countries was used, no individual patient data was included. Therefore, patient involvement did not apply to this study.

## **Results**

As shown in figure 1, the temporal development of the epidemic in Italy and Spain closely resembles that of China. Figure 2 shows the temporal development of the epidemic in South Korea, which is much more gradual. Finally, figure 3 shows the development in the United States, where the epidemic develops much more rapidly.

Sensitivity analyses, using different reference days, produced very similar results.

## **Forecast**

By day 80, the accumulation of deaths in China had come to a virtual standstill at 3,306 deaths. Extrapolating the epidemic in Italy and Spain results in a forecasted cumulative number of deaths by day 80 of about 22,000 and 41,000, respectively. For South Korea this number would be 250 and for the United States it would be about 15,000. Of note, 85% of these deaths are likely to occur within the first 50 days of the epidemic (i.e., before the end of April 2020 in the US).

## **Discussion**

We have shown a clear difference in development of the COVID-19 epidemic between countries with different containment policies.

Most importantly, we note a dramatically accelerated accumulation of deaths in the United States. Of note, the forecast for the United States is likely to apply to the cumulative number of deaths in the states of New York, New Jersey, and Michigan. This is because the epidemic centered in this area also largely drove the cumulative number of reported deaths so far. If during the coming weeks the entire United

States are affected similarly to this area, the total numbers are likely to be 15-fold higher (i.e. over 200,000). Importantly, this number reflects only deaths reported as COVID-19 related, while the true number of deaths to which COVID-19 contributed is likely to be much higher.[8] However, the other parts of the United States might still be able to stay closer to the pattern of temporal development observed in Europe, if strict containment measures are applied immediately. Failing this, the only way in which a total number of deaths in excess of 200,000, by May 15<sup>th</sup> 2020, seems avoidable would be through a depletion of susceptibles. In this case, the death rate would slow down dramatically before day 50, not because containment measures stopped the spread of the virus, but because everybody who was susceptible has already died. The total number of susceptibles is currently almost impossible to estimate and hoping for a depletion of susceptibles, to end the rapid accumulation of deaths, therefore doesn't seem advisable.

Further, although the cumulative number of deaths estimated for day 80 in South Korea is low, the epidemic is likely to last much longer there, due to its slow development. Whether the final number of deaths per inhabitant will also be lower therefore remains to be seen.

To appreciate our results, it is important to note that data from different countries are not directly comparable, for at least five distinct reasons. First, the virus did not arrive in all countries simultaneously, causing a desynchronized development of the epidemic in different countries.

Second, absolute numbers are incomparable due to different population sizes. Third, rates per 100,000 of the population are incomparable, because not all countries are affected homogeneously. Especially in the larger countries, like China and the United States, epidemics can be (temporarily) focused on a localized level. For example, in China, the province of Hubei was severely affected, while the rest of the country was not. Therefore, correction for the total size of the Chinese population would not provide a representative figure. Fourth, susceptibility to death by COVID-19 can differ between populations, depending on the demographic composition of a country's population. For example, in Italy, older people are known to be relatively overrepresented in the population, and to be more likely to be in a single household with relatives from a younger generation, causing increased numbers of elderly to be infected and therefore relatively more COVID-19 mortality. Fifth, a death during the COVID-19 epidemic will only be reported as a COVID-19 related death if the patient was diagnosed with SARS-CoV-2 infection. Therefore, differences in testing policy and guidelines for clinical diagnosis (i.e. in the absence of laboratory testing), will also cause differences in estimated numbers of COVID-19 related deaths.

The first problem was addressed by choosing an appropriate index date for each country and setting this date to day 1, for the start of the epidemic in that country. As an index date, we choose the date of the first reported COVID-19 related death in each country. Admitted, chance processes play a role here, causing some misclassification. The remaining four problems all pertain to the size and the susceptibility of the population, or the probability of a COVID-19 related death being reported as such. Adequately control for all factors influencing these problems is a practical impossibility.

Therefore, we choose to normalize the cumulative number of deaths, by a reference number of deaths. The number of actually reported COVID-19 related deaths is clearly a direct function of the size and susceptibility of the population and the probability of a COVID-19 related death being reported as such. Therefore, taking the reported number of COVID-19 related deaths on a synchronized reference date as a standard will correct results for all these factors simultaneously. In conclusion, although the future development of the epidemic remains difficult to predict accurately, due to changing containment policies, changing seasonal influences,[9] and the possibility of a depletion of susceptibles, or the development of herd immunity,[10, 11] current data suggest the United States to expect an explosive increase in cumulative mortality due to COVID-19, with containment policies still lagging behind. Drastic measures are needed immediately to curb the unprecedented epidemic which is currently unfolding across this country.

## **Declarations**

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### **Author contributions and guarantor:**

RAM conceptualised, designed, and executed the research, wrote the manuscript, and acts as the guarantor. The guarantor affirms that the manuscript is an honest, accurate, and transparent account of the study being reported; that no important aspects of the study have been omitted; and that any discrepancies from the study as originally planned have been explained.

FRR conceptualised the research and revised the manuscript.

### **Competing interests:**

None of the authors report any competing interest relevant to this paper.

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No additional data is available.

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## Figures

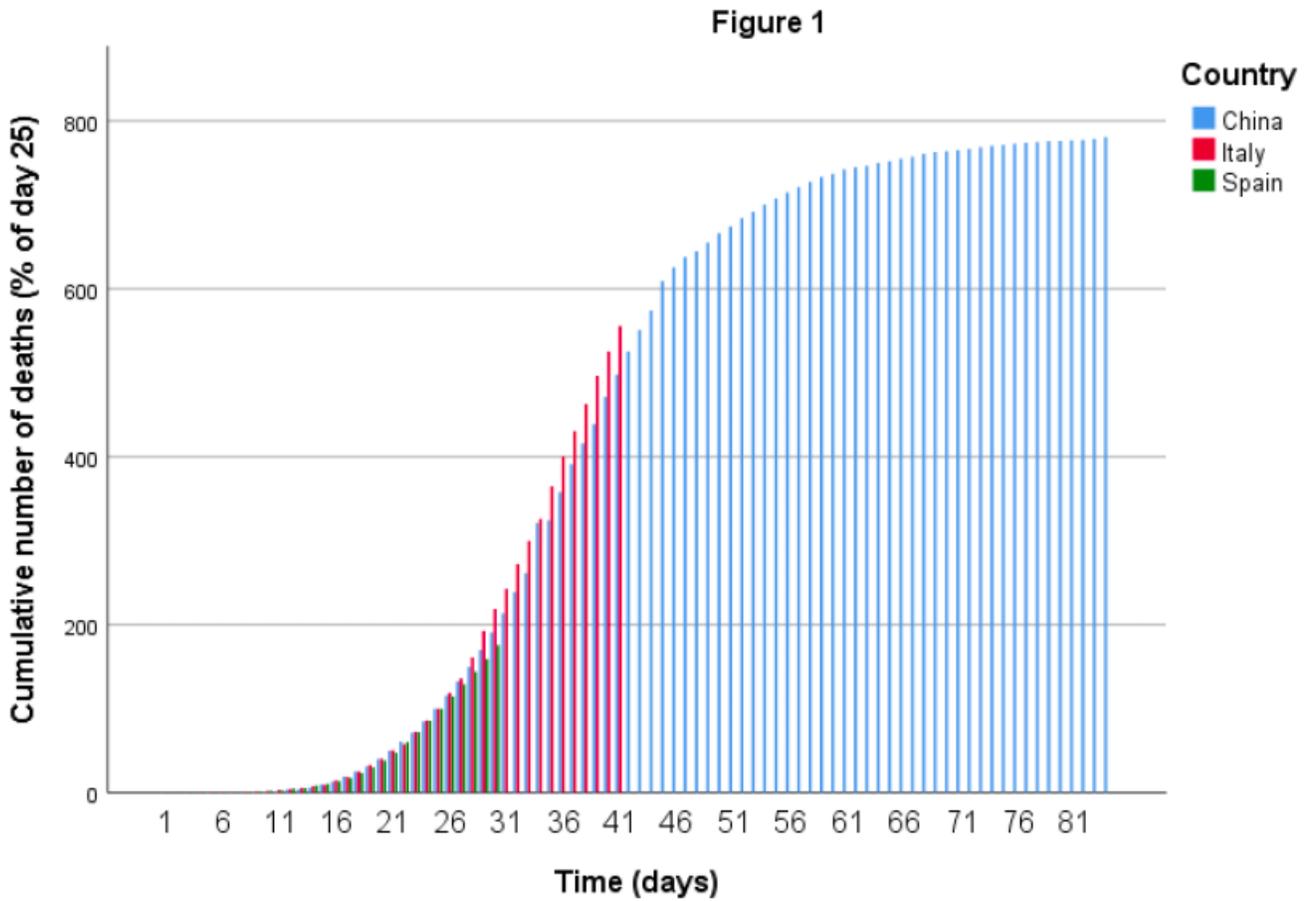
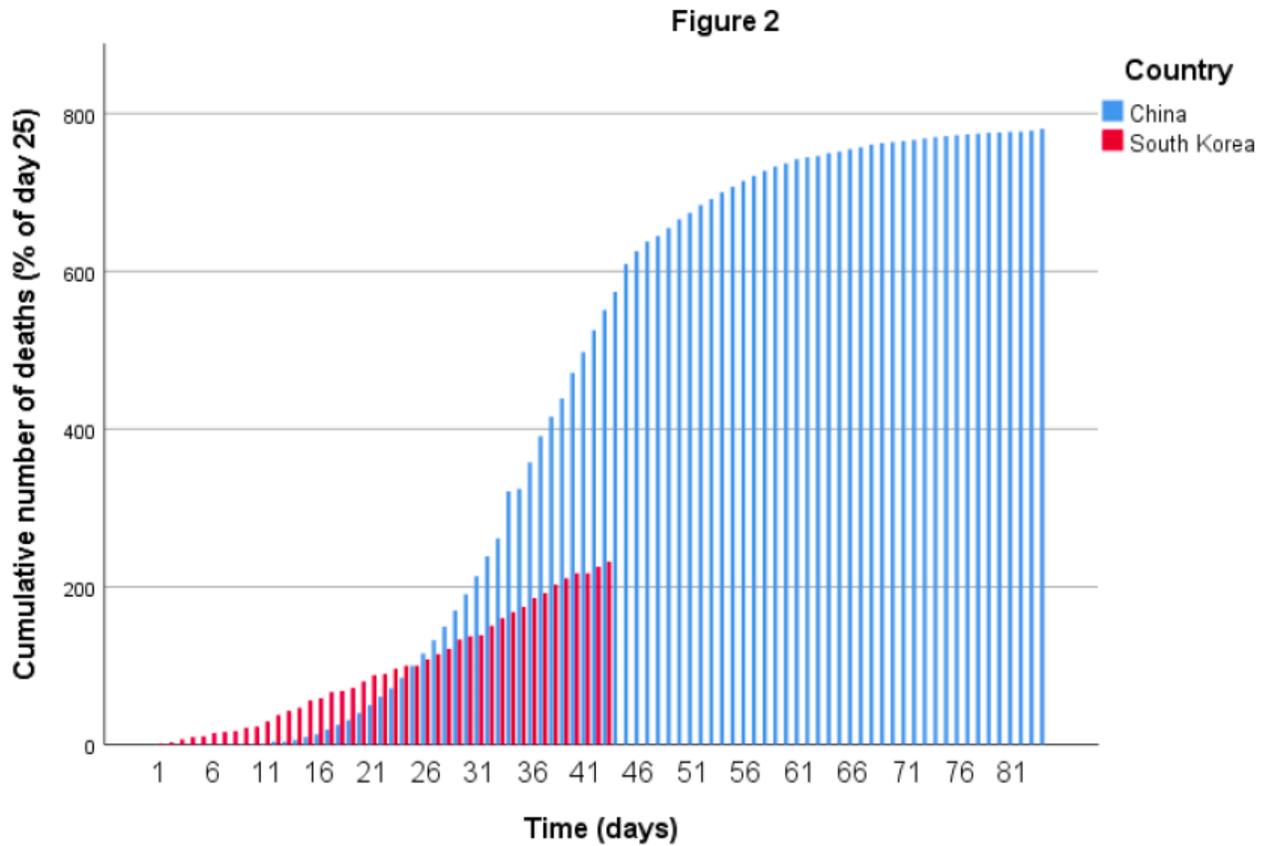


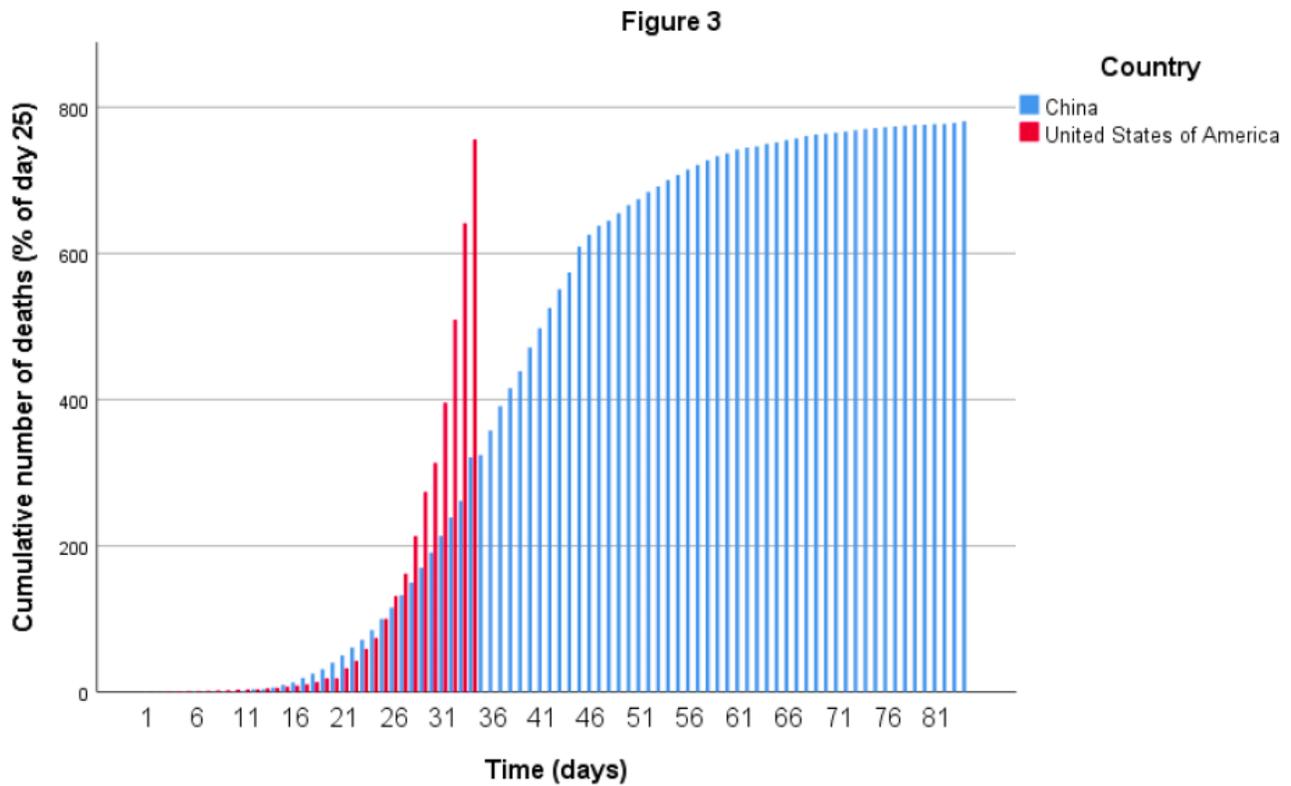
Figure 1

Development of epidemic in countries with early containment policies. Development of the epidemic in Italy and Spain, compared to China. Each bar represents a calendar date. Dates from different countries have been synchronized with the date of the first reported COVID-19 related death as day 1. Height of the bars represents the cumulative number of reported COVID-19 related deaths in that country, expressed as a percentage of the number of deaths on day 25 in that country.



**Figure 2**

Development of epidemic in a country with preemptive containment policies. Development of the epidemic in South Korea, compared to China. Each bar represents a calendar date. Dates from different countries have been synchronized with the date of the first reported COVID-19 related death as day 1. Height of the bars represents the cumulative number of reported COVID-19 related deaths in that country, expressed as a percentage of the number of deaths on day 25 in that country.



**Figure 3**

Development of the epidemic in a country with late containment policies. Development of the epidemic in the United States of America, compared to China. Each bar represents a calendar date. Dates from different countries have been synchronized with the date of the first reported COVID-19 related death as day 1. Height of the bars represents the cumulative number of reported COVID-19 related deaths in that country, expressed as a percentage of the number of deaths on day 25 in that country.