

1 **Case fatality rate of novel coronavirus disease 2019 in China**

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23 **Abstract**

24 **Background:** A pandemic of coronavirus disease 2019 (COVID-19) which have caused more
25 than 80 thousand persons infected globally is still ongoing. This study aims to calculate its
26 case fatality rate (CFR).

27 **Methods:** The method, termed as converged CFR calculation, was based on the formula of
28 dividing the number of known deaths by the number of confirmed cases T days before, where
29 T was an average time period from case confirmation to death. It was found that supposing a
30 T, if it was smaller (bigger) than the true T, calculated CFRs would gradually increase
31 (decrease) to infinitely near the true T with time went on. According to the law, the true T
32 value could be determined by trends of daily CFRs calculated with different assumed T values
33 (left of true T is decreasing, right is increasing). Then the CFR could be calculated.

34 **Results:** CFR of COVID-19 in China except Hubei Province was 0.8% to 0.9%. So far, the
35 CFR had accurately predicted the death numbers more than 3 weeks. CFR in Hubei of China
36 was 5.4% by which the calculated death number corresponded with the reported number for 2
37 weeks.

38 **Conclusion:** The method could be used for CFR calculating while pandemics are still
39 ongoing. Dynamic monitoring of the daily CFRs trends could help outbreak-controller to have
40 a clear vision in the timeliness of the case confirmation.

41 **Keywords:** Coronavirus; COVID-19; Pandemic; Case fatality rate

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45 **Introduction**

46 An outbreak of pneumonia caused by a novel coronavirus occurred in Wuhan, Hubei
47 Province, China at the end of 2019.(1) On Feb 11, 2020 the World Health Organization
48 (WHO) announced an official name for the disease as coronavirus disease 2019 (COVID-19)
49 and the International Committee on Taxonomy of Viruses named the novel coronavirus as
50 severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2). The outbreak of the disease
51 was linked to a live animal market firstly and then was reported person-to-person
52 transmission.(2, 3) The disease has rapidly spread from Wuhan City to other areas. As of Mar
53 1, 2020, approximately 80 thousand cases in China alone have been confirmed. Cases also
54 have been reported in more than 25 countries of 5 continents. The case fatality rate (CFR)
55 represents the proportion of people who eventually die from a specified disease. CFR
56 typically is used as a measure of disease severity and is often used for prognosis where
57 comparatively high rates are indicative of relatively poor outcomes (4). It also can be used to
58 compare the effect of treatments among different areas. In general, when a pandemic has
59 ended, CFR can be calculated by dividing the number of known deaths by the number of
60 confirmed cases. A major difficulty in estimating case fatality rate is ensuring the accuracy of
61 the numerator and the denominator. While a pandemic is still ongoing, it is tempting to
62 estimate the case fatality rate by dividing the number of known deaths by the number of
63 confirmed cases reported so far. The resulting number, called naive CFR, however, does not
64 represent the true case fatality rate because this calculation does not account for the delay
65 between case confirmation and disease outcome (5). In that case, the CFR will be
66 underestimated. To estimate the CFR while a pandemic is still ongoing, the denominator

67 should be corrected as cases at T days before, where T is an average time period from case
68 confirmation to death. This study aims to calculate the CFR of the COVID-19 in China by
69 estimating the average time period from case confirmation to death.

70 **Methods**

71 Data: population level data in this study included daily accumulative numbers of cases
72 and deaths of COVID-19 in China from Jan 21 to Mar 1, 2020. Data was collected from
73 National Health Commission of China, China CDC, and provincial level health authorities.

74 Estimation of T (average time period from case confirmation to death): To calculate CFR,
75 it should be realized that deaths at day X are averaged from cases at day X-T rather than day
76 X. Given a T value, a group of CFRs (daily CFRs) can be obtained from different X days. As
77 known that death number at day X should be less than case number at day X-T (if more than
78 day X-T, CFR would be greater than 100% which is illogical). Based on this point, the range
79 of T can be narrowed. More importantly, no matter what T value is assumed, even it is far
80 away from the true T value, the daily CFRs would converge towards (infinitely approach to
81 but never be over) the true CFR with time (X) increases. The following example will illustrate
82 this principle (Table 1). Assuming CFR = 10%, T = 4 for a disease, the cases number was
83 from 100 to 10000 at day X (X=1 to 100), then the deaths number would be 10 (10, 20 and so
84 on) at day X+4 (5, 6 and so on). When calculating daily CFRs based on case and death
85 numbers with formula deaths (X) divided by cases (X-T), law 1: if assumed T was equal to
86 the true T value (4 in the example), calculated daily CFRs at different day X would constantly
87 be the true CFR (0.1); if assumed T was greater than the true T (5 and 6), daily CFRs would
88 be greater than the true CFR (0.1) and infinitely reduce to near it with the time (X) increased;

89 if assumed T was smaller than the true T (1 to 3), daily CFRs would be smaller than the true
 90 CFR and infinitely increase to near it. Besides, it could be found that, law 2: if assumed T was
 91 more far away (bigger absolute difference) from the true T, daily CFRs would be more far
 92 away from the true CFR and they would need more times to converge towards it. In this
 93 example, case numbers were given from 100 to 10000 by 100 increments per day, however,
 94 cases growth every day would not be evenly for an infectious disease. Then case numbers in
 95 this example were replaced by real case numbers of COVID-19 and the convergence tendency
 96 still remained except for individual data points. Based on convergence laws, we used
 97 exhaustive method to calculate daily CFRs of COVID-19 by different T values. If an assumed
 98 T resulted in relatively constant daily CFRs, and T+1 resulted in decreasing daily CFRs and
 99 T-1 in increasing, it could be determined as the true T. The method above could be termed as
 100 converged CFR calculation.

101 Table 1. Convergence tendency at different T values for a CFR=10% assumed disease

Daily CFR when			Days (X)	Cases (at X)	Deaths (at X+4)	Daily CFR when		
T=6	T=5	T=4	Days (X)	Nc	(Nc*CFR)	T=3	T=2	T=1
			1	100				
			2	200				
			3	300				
			4	400				
		0.100	5	500	10	0.050	0.033	0.025
0.200	0.100		6	600	20	0.067	0.050	0.040

0.300	0.150	0.100	7	700	30	0.075	0.060	0.050
0.200	0.133	0.100	8	800	40	0.080	0.067	0.057
0.167	0.125	0.100	9	900	50	0.083	0.071	0.063
0.150	0.120	0.100	10	1000	60	0.086	0.075	0.067
0.140	0.117	0.100	11	1100	70	0.088	0.078	0.070
.....
0.102	0.101			10000	960	0.099	0.098	0.097

102 **Results**

103 **CFR in China except Hubei Province (non-Hubei regions)**

104 A number of T values were selected for screening based on convergence laws. After
 105 different T values were tried, as Figure 1 showed, when assumed T was 11, the daily CFRs
 106 were decreasing and had no pronounced increase, when it was 0 to 7; the daily CFRs had
 107 pronounced increase after early time (T > 11 were not shown due to continuously decreasing
 108 trends). CFRs increased as expected according to laws at later stage in some assumed T
 109 values (e.g. T=0), but it decreased at early stage which seemed not satisfy the convergence
 110 laws. Actually, it was normal. Convergence laws happened due to the force of the true CFR
 111 drawing daily CFRs towards its direction by dominating accumulated death numbers. At early
 112 stage, the outcome of death had not yet occurred resulting in daily CFRs decreasing with the
 113 growth of case number. Thus, T value exploration by convergence laws should depend on
 114 period of death growth.

115 Results of Figure 1 indicated the true T should be in the range of 8 to 10. As differences
 116 between CFRs were too small at converging stage to compare and scales of y axis in different

117 plots of Figure 1 varied greatly, Figure 1 was only used for preliminary tendency exploration.

118 Converging stage CFRs had been cut out to plot with same y axis scales for the true T and

119 CFR estimation (Figure 2).

120 Table 2. Death and case numbers of COVID-19 in China from Jan 21 to Mar 1

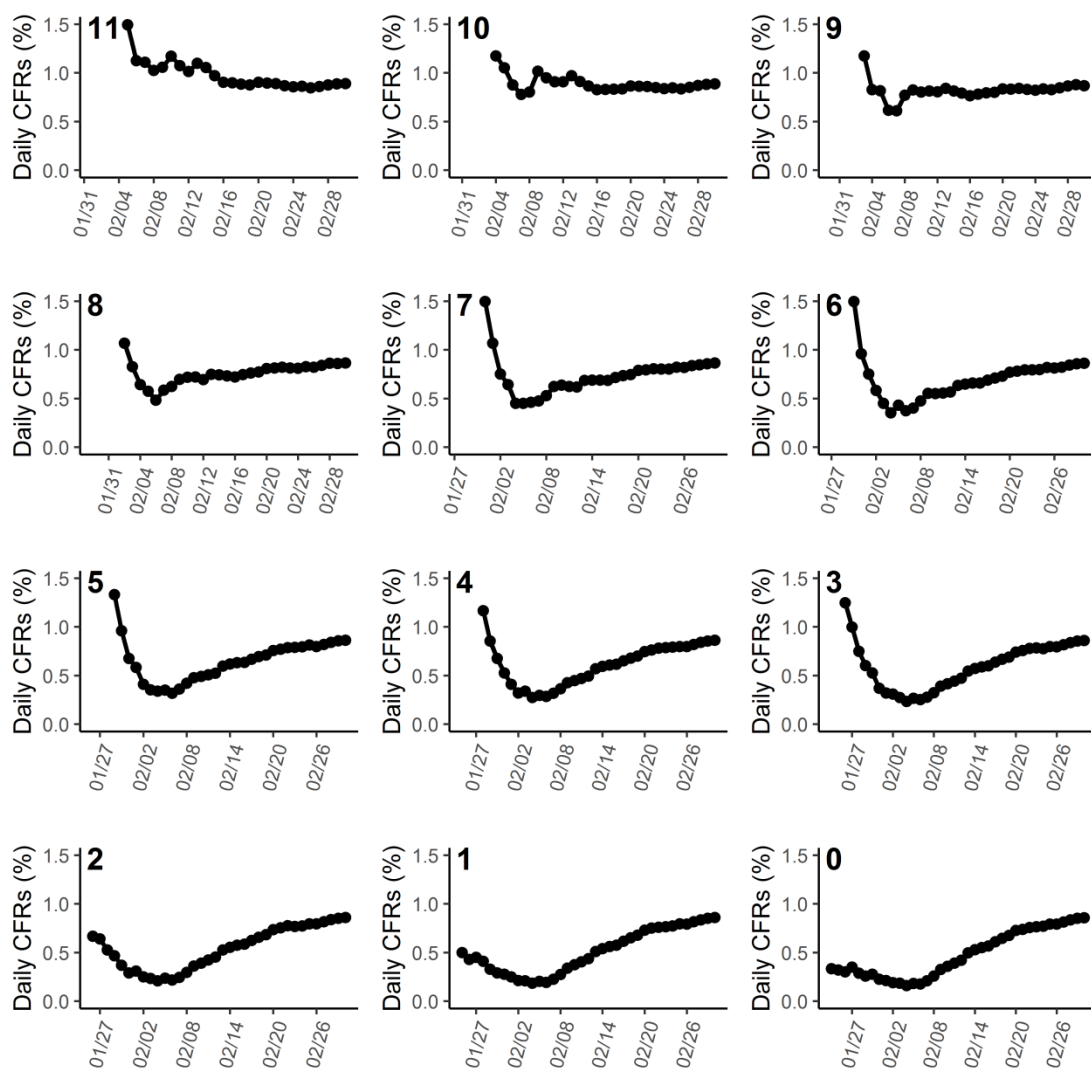
Date	Cumulative	Cumulative	Cumulative	Cumulative
	cases	deaths	cases	death
	non-Hubei		Hubei	
J_21	56	0	270	0
J_22	105	0	444	0
J_23	321	2	549	24
J_24	601	2	729	32
J_25	937	3	1052	52
J_26	1332	4	1423	76
J_27	1714	6	2714	100
J_28	2439	7	3554	125
J_29	3117	8	4586	162
J_30	3247	9	4903	162
J_31	4006	9	5806	204
F_1	4737	10	7153	249
F_2	5283	10	9074	294
F_3	5970	11	11177	350
F_4	6911	11	13522	414

F_5	7755	14	16678	479
F_6	8473	15	19665	549
F_7	9154	19	22112	618
F_8	9720	25	24953	699
F_9	10189	33	27100	780
F_10	10631	38	29631	871
F_11	11019	43	31728	974
F_12	11399	48	33366	1068
F_13	11676	58	35699*	1310
F_14	11946	63	39479	1318
F_15	12170	67	41899	1457
F_16	12335	70	43742	1596
F_17	12453	76	45675	1696
F_18	12539	81	47482	1789
F_19	12597	85	49175	1921
F_20	12644	92	49125	2029
F_21	12905	95	49756	2144
F_22	12938	98	50122	2250
F_23	12957	99	50752	2346
F_24	12975	100	50955	2495
F_25	12993	103	51454	2563
F_26	13003	103	51855	2615

F_27	13034	106	52264	2641
F_28	13045	109	52582	2682
F_29	13052	111	53005	2727
M_1	13061	112	53575	2761

121 * 13,332 clinical diagnosed cases were reported together on Feb 13 in Hubei Province; in our

122 calculation the number had been excluded from confirmed case numbers since then.



123

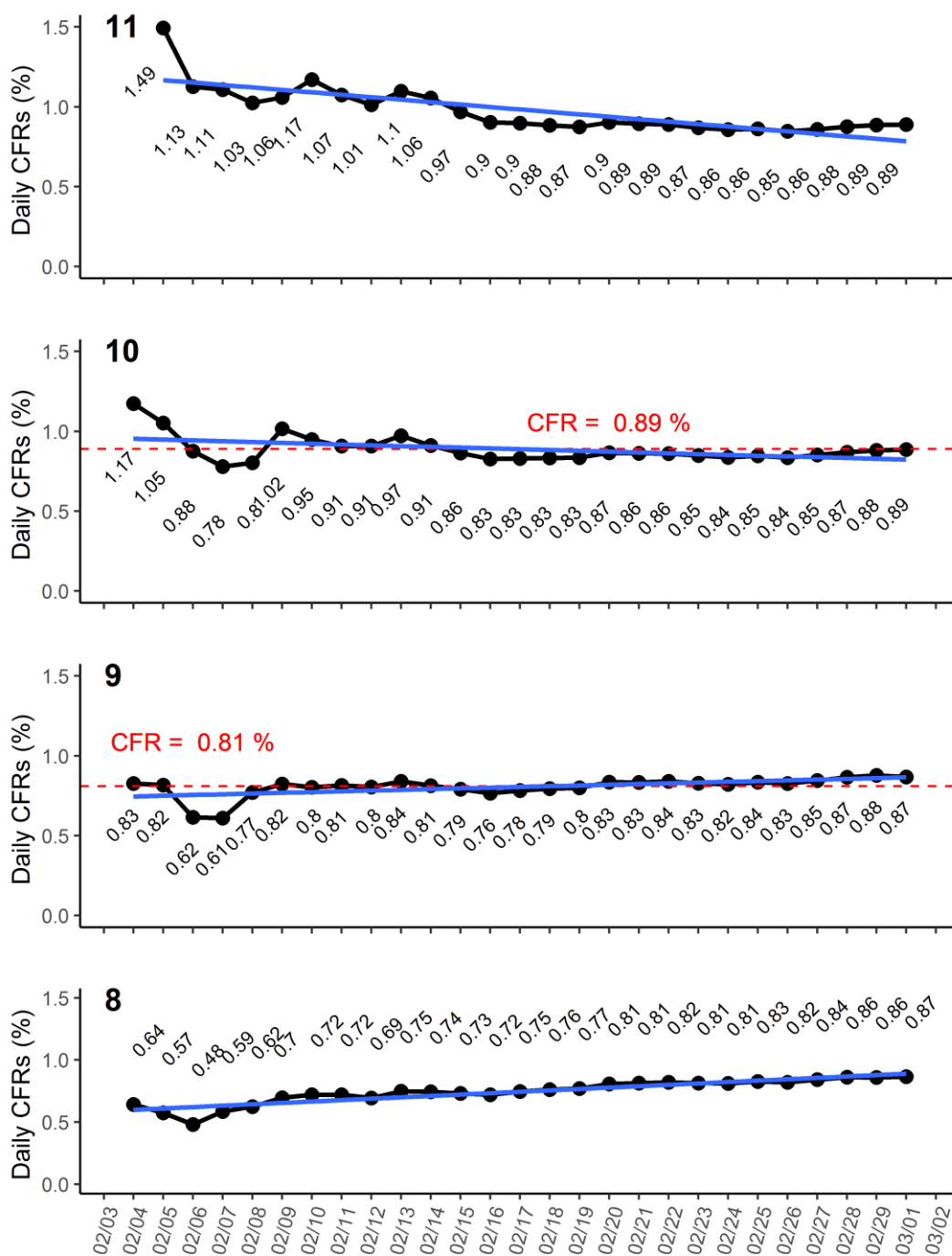
124 Figure 1. Calculated daily CFRs of non-Hubei regions by Mar 1 when T was assumed from 0

125 to 11.

126 As mentioned in Methods, with the time increased, even under a false T in calculation,

127 the daily CFR could converge towards the true CFR though more times needed. If assumed T
128 was equal to the true T value, calculated daily CFRs would keep constant. As Figure 2
129 showed, for T= 11 and 8, comparing with T = 9 and 10, CFRs still had slightly decreasing and
130 increasing trends, respectively. Linear models (blue lines) were generated for analysis of
131 variances and linear trends of these CFR points in each plot. The slopes of models became
132 flatter and approached towards to 0 when T was from 8 to 9 and 11 to 10. The results
133 indicated the true T should be bigger than 8 and less than 11. When T = 9, the CFRs were
134 almost staying in one line (red dotted line in Figure 2) and slightly increased later. When T =
135 10, though the daily CFRs decreased early but quickly they reached a stable stage. So the true
136 T might be between 9 and 10 days. The mean values of data in plot 9 and 10 of Figure 2 were
137 0.8% and 0.9%, respectively. The true CFR of COVID-19 in China except Hubei Province
138 should fall between 0.8% and 0.9%. An assumed T was the closer to the true T value, the
139 earlier daily CFRs converging to the true CFR happened. The mean value of CFRs at later
140 stage of plot 9 or 10 was approximately 0.85%. As shown in Figure 2, if data was analyzed
141 before Feb 20, T = 9 (0.81%) might be determined as the true T value (true CFR). But now
142 the T was postponed to between 9 and 10 days. The reason was not the uncertainty of method,
143 but the long disease course of COVID 19. Time of case confirmation to outcome was longer
144 in some cases than most which caused the true T bigger and CFR slightly increased. For
145 non-Hubei regions, on Feb 20, 6719 of 12644 (53%) cases were in hospitals, but on Mar 1,
146 only 2461 of 13061 (19%) were in hospitals. When a pandemic ended, the naive CFR could
147 be equal to the true CFR. The COVID 19 epidemic in non-Hubei regions is coming to the end
148 (only sporadic cases were reported recently in the non-Hubei regions), so far, the naive CFR

149 was 0.85% (112/13061). The final CFR should not be bigger too much than 0.85%. It
 150 indicated calculated CFR by this converged CFR calculation method was a good estimation of
 151 the true CFR. More importantly, it could be approximately estimated earlier (3 weeks ago) by
 152 our method when a pandemic was still ongoing.



153

154 Figure 2. Converging stage daily CFRs of non-Hubei regions when T was from 8 to 11

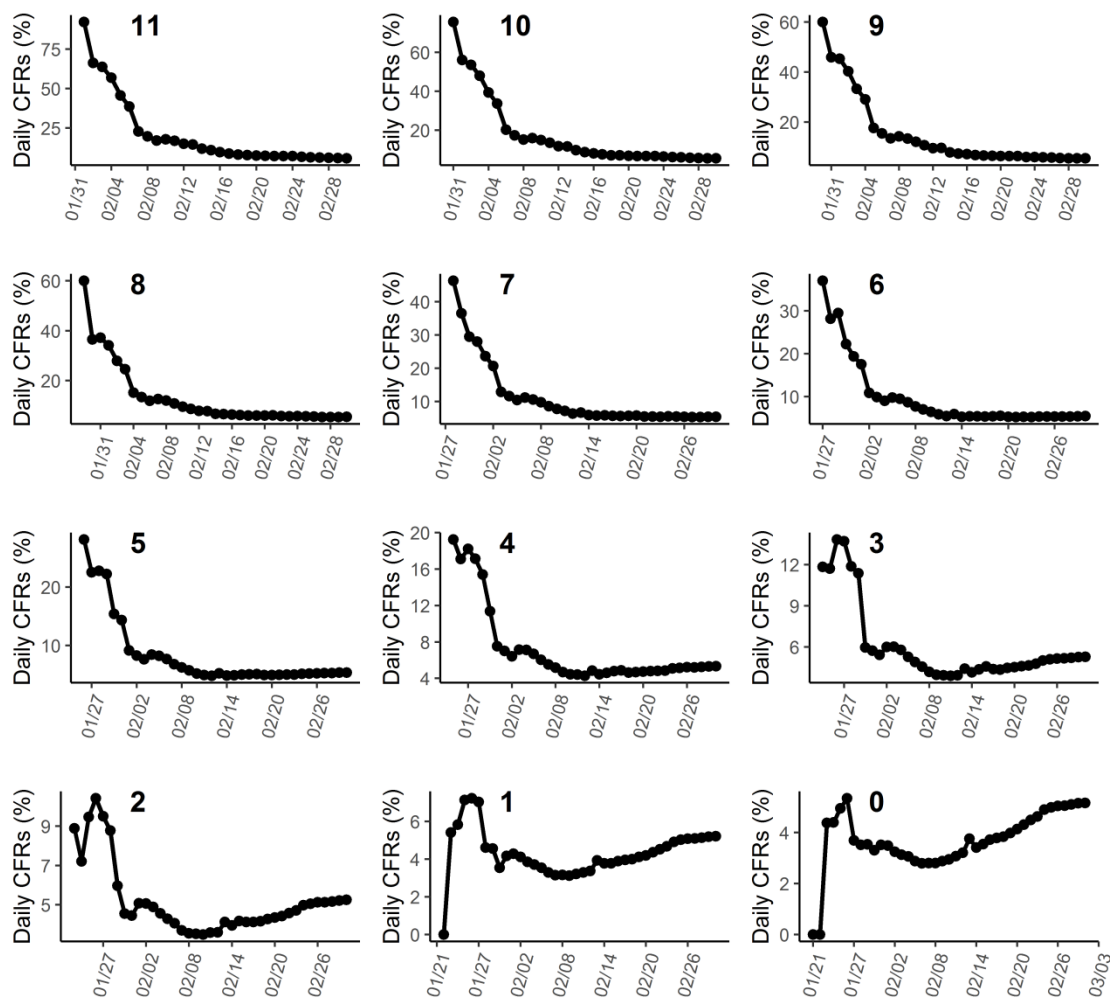
155 Blue lines represented linear models generated for analysis of variances and linear trends of
156 these data points in plots. Red dotted line and number were the estimated true CFR.

157 **CFR in Hubei Province**

158 As shown in Table 2, after Feb 3, death number (350) were more than Jan 21 case
159 number (270), if the T was 12 (Feb 3 minus Jan 1), the CFR would be illogically greater than
160 100%. In another words, death numbers only when before day 12 were less than case number
161 at day 1. So the time T should be less than or equal to 11 days (12-1). The death number when
162 was firstly more than the case number at day 2 was Feb 5 (day 15), so the T should be less
163 than or equal to 12 (14-2). The rest could be done in the same manner. Finally, the smallest T
164 value (T = 11) was selected as the upper limit for convergence screening.

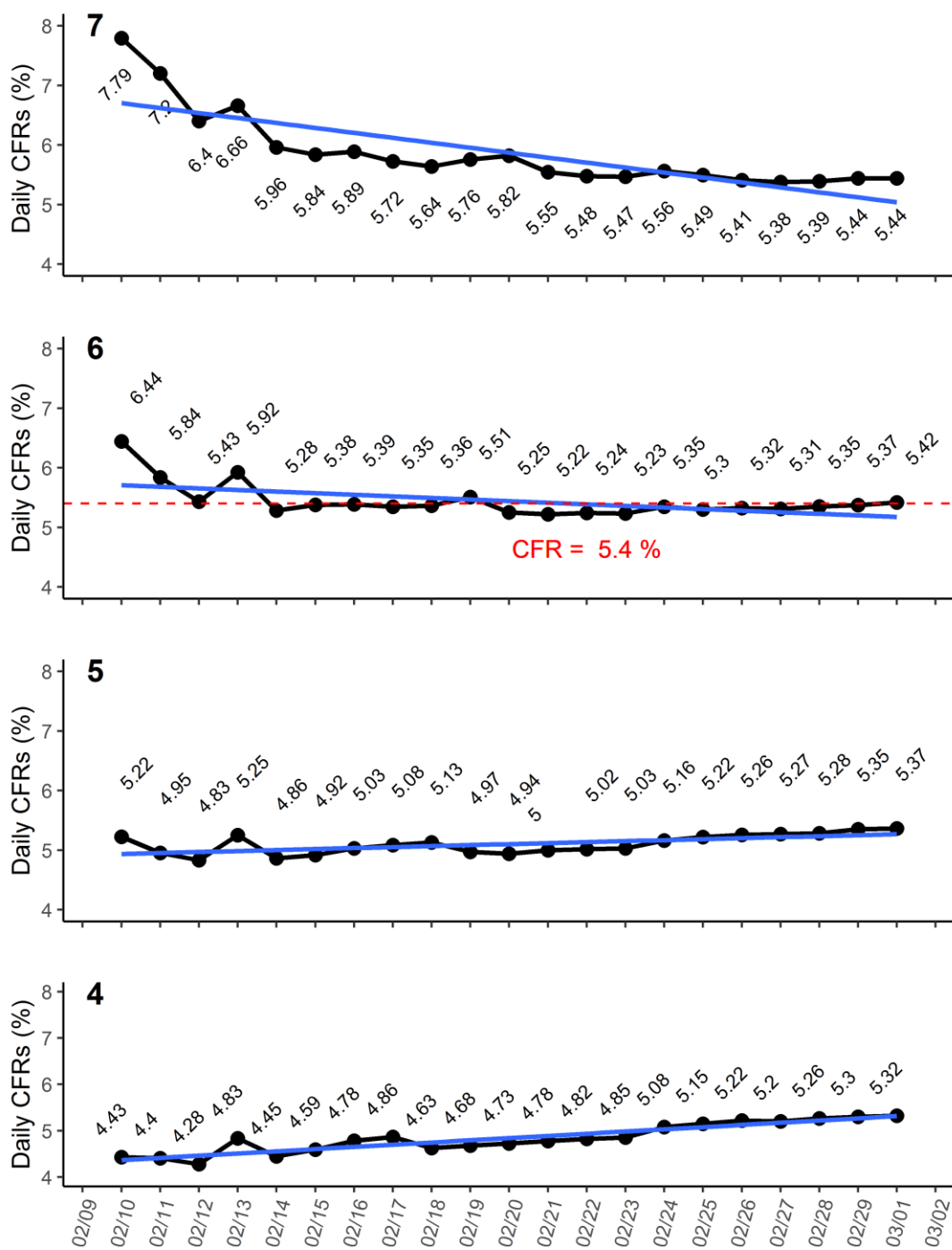
165 Figure 3 was the calculation of daily CFRs with assumed T values (0 to 11). When
166 assumed T was 8 to 11, daily CFRs were continuously decreasing. When T = 0 and 3, there
167 were increase trends at later stage which meant they were smaller than the true T value.
168 Converging stage CFRs data when T = 4 to 7 was selected for plotting with the same y axis
169 scales (Figure 4). As it showed, For T= 4, CFRs had increase trends, and T = 5, the CFRs
170 slightly increased. When T was 7, CFRs decreased and reached stable at later stage. When T
171 was 6, plateau stage appeared earlier than T = 7. The slopes of linear models became flatter
172 and approached towards to 0 when T approaching to 6. Then T = 6 was selected as the true T
173 value for the true CFR calculation. The true CFR of COVID-19 in Hubei calculated by mean
174 value of the daily CFRs of plot 6 in Figure 4 was 5.4%. The estimated T value was smaller
175 than non-Hubei regions. It was not surprising as it seemed that time of case confirmation to
176 death was shorter. Previously in Wuhan City of Hubei Province, many patients had not been

177 confirmed and reported timely due to overwhelmed medical services and lack of testing kits.
178 The death number (from confirmed and unconfirmed population) could prefer to “select”
179 forward case pools with bigger population. Thus, to obtain an accurate CFR, timeliness of
180 case conformation should not vary too much. The possibility could not be rule out that the
181 CFR might slightly increase later like non-Hubei regions due to the long disease course of
182 COVID 19.



183

184 Figure 3. Calculated daily CFRs of Hubei Province by Mar 1 when T was from 0 to 11.



185

186 Figure 4. Converging stage daily CFRs of Hubei Province when T was from 4 to 7

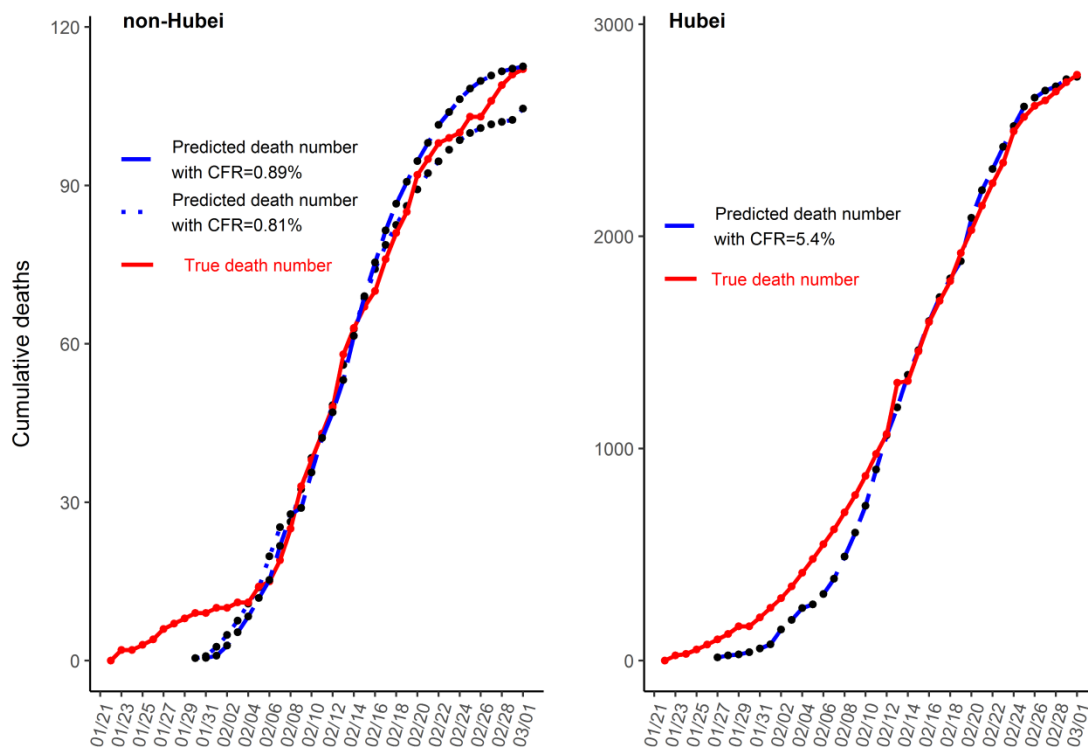
187 Blue lines represented linear models generated for analysis of variances and linear trends of
 188 these data points in plots. Red dotted line and number were the true CFR.

189 **Validation of calculation**

190 True numbers of death were compared with numbers estimated by the calculated T and

191 CFR to validate the accuracy of our method. The cumulative cases at day X multiplied
192 calculated CFR should be approximately equal to true death number at day X+T theoretically.
193 As shown in Figure 5-non-Hubei, since Feb 4, calculated death numbers had a good fit to the
194 true death data. The curves came closest to coinciding in shape. For Hubei (Figure 5-Hubei),
195 the predictive curve was similar in shape with true death line, however, from Jan 23 to Feb 10,
196 predicted death numbers were smaller than the true numbers. The predicted curve from Jan 23
197 to Feb 10 seemed to be moved to the right about 2 or 3 days. A subset data from Jan 21 to Feb 12
198 was selected to recalculate the T, and results in Hubei, T was 2 days. However, it could be
199 found in plot 2 of Figure 3 that only 3 points stayed in the stable line before Feb 12. Without
200 later data, it could result in a misleading false CFR. Thus, for CFR calculation, the stable
201 stage of daily CFRs should not be too short.

202 On the other hand, T became bigger indicated the case confirmation was timelier.
203 Outbreak-controllers could indirectly have information about the timeliness of case confirmation
204 by monitoring daily CFRs. Stable CFRs trends meant the denominator for CFR calculation,
205 case number, was accurate enough. As extant cases were in quarantine, combining with
206 transmission potential of diseases, it could provide policy-makers information about the risk
207 of second infection, which could help them with evaluation of when people in regions could
208 go back on production. In summary, as death numbers had been almost accurately predicted
209 by calculated true CFR for more than 3 weeks, it could be considered as the true CFR of
210 COVID-19 in China except Hubei Province. For Hubei, calculated death number
211 corresponded with the reported number for more than 2 weeks.



212

213 Figure 5. Comparison of true numbers of death and estimated numbers by the calculated T

214 and CFR.

215 Discussion

216 CFR was calculated by dividing the number of deaths from a specified disease. For a
217 infectious disease, the outcome of death were determined by virulence of causative pathogens,
218 immunity and health status of those infected, medical conditions, received treatment and so
219 on. Whether all infected cases had been completely included into the denominator also
220 affected the CFR. That meant, for the same disease, CFR were not always constant and could
221 vary between populations (6). COVID-19 firstly occurred in Wuhan City, Hubei Province,
222 China and quickly went into a big outbreak and overwhelmed local medical facilities. Then it
223 extended to the whole Hubei Province and other regions in China during the heavy-travel
224 Chinese Spring Festival holidays. The Chinese government rapidly isolated Wuhan and took
225 emergency measure nationwide to prevent and control disease. Non-Hubei regions response

226 to COVID-19 could be regarded as timely. The situations of outbreak in Hubei and non-Hubei
227 regions were quite different. So CFRs were calculated separately. Diagnose and confirmation
228 towards patients presenting with more severe disease had priority in Hubei, especially Wuhan
229 as the limited healthcare-facilities and testing capacities. Thus, the calculated CFR for Hubei
230 was higher due to the underdetection of mild or asymptomatic cases. Other regions in China
231 had taken completely epidemiological investigation of diagnosed cases under the nationwide strict
232 quarantine and screening policy. Close contactor investigation by CDC could help find mild
233 or asymptomatic cases. Thus, CFR calculated from these regions could be regarded as
234 accurate values in the situation of medical services were not overwhelmed.

235 So far, only a few studies reported CFR of COVID-19. Study of Wuhan's earliest 41
236 cases gave a 15% death rate (7). However, regardless of the sample size, these cases were
237 highly biased towards the more severe cases for CFR calculation. Another study reported the
238 CFR was 4.3% which also had a biased study population (Wuhan hospitalized patients) (8). A
239 newly epidemiological study estimated the CFR was 3.06% (95% CI 2.02-4.59%) from 4,021
240 cases (9). This study included data from non-Hubei regions, so the CFR should be smaller
241 than that of Wuhan. When epidemic was still ongoing, CFR could be estimated by following a
242 cohort, however, it was time-consuming and difficult to include size-enough and
243 representative patients from unbiased population. Considering the features of daily CFRs
244 convergence, true CFR estimation based on population-level big data might be a good way.

245 In our study, calculated T values were different, T was between 9 and 10 in non-Hubei
246 but was 6 in Hubei. The time in Hubei from confirmation to death was shorter comparing
247 with non-Hubei. On Feb 13, more than 10 thousands cases were reported one day including

248 clinical diagnosed cases without laboratory confirmation. It indicated there would be a lag in
249 case confirmation in Hubei. With the cases in Hubei were confirmed timely, the estimated T
250 might move towards bigger. In addition, when the factors causing the true CFR higher in
251 Hubei were controlled, the true CFR might decrease. The daily CFRs in Figure 3 would also
252 change itself to the new T and CFR. But, 5.4% was the true CFR at the present stage. In our
253 study, 13332 clinical cases were excluded since Feb 13, which might result in an
254 overestimation of the true CFR.

255 CFR calculated in our study was dynamic, which could be used to real-time monitor the
256 case confirmation situation. If daily CFRs kept on a horizontal line and the confirmed cases
257 were continuously decreasing, it meant the control measures had worked well. Not only
258 infectious diseases, but also other diseases which were difficult to follow cohorts can be
259 monitored to calculate the CFR. But a limitation should be taken into consideration that daily
260 CFR would approach to true CFR only when deaths started to appear. When calculated T was
261 too small, it might give outbreak-controllers information that if there remained a lot of
262 infected persons unconfirmed. And if calculated T started to move backwards with time, it
263 meant confirmation of patients had become timely at then.

264 In conclusion, by converged CFR calculation method, the true CFR of COVID-19 in
265 China except Hubei Province was approximately from 0.8% to 0.9%. This calculated CFR
266 could accurately predict the death numbers for more than 3 weeks. The CFR in Hubei was
267 5.4% at the present stage. This method in our study can be used for CFR calculation when a
268 pandemic is still ongoing and monitoring the case confirmation situation.

269 **Declaration of interests**

270 We declare no competing interests.

271 **Acknowledgments**

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