



Journal pre-proof

DOI: 10.1016/j.immuni.2020.04.012

This is a PDF file of an accepted peer-reviewed article but is not yet the definitive version of record. This version will undergo additional copyediting, typesetting and review before it is published in its final form, but we are providing this version to give early visibility of the article. Please note that, during the production process, errors may be discovered which could affect the content, and all legal disclaimers that apply to the journal pertain.

© 2020 Published by Elsevier Inc.

1 **Herd immunity: Understanding COVID-19**

2

3 Haley E Randolph¹ and Luis B Barreiro^{1,2,3}

4

5

6 ¹ Genetics, Genomics, and Systems Biology, University of Chicago, IL

7 ² Department of Medicine, Section of Genetic Medicine, University of Chicago, Chicago, IL 60637,
8 USA.

9 ³ Committee on Immunology, University of Chicago, Chicago, IL 60637, USA.

10

11

12

13

14

15 Corresponding author: Barreiro, Luis B (lbarreiro@uchicago.edu)

16

17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60
61
62
63
64
65

The emergence of severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) and its associated disease, COVID-19, has demonstrated the devastating impact of a novel, infectious pathogen on a susceptible population. Here, we explain the basic concepts of herd immunity and discuss its implications in the context of COVID-19.

Basic concepts of herd immunity

Acquired immunity is established at the level of the individual, either through natural infection with a pathogen or through immunization with a vaccine. Herd immunity stems from the effects of individual immunity scaled to the level of the population. It refers to the indirect protection from infection conferred to susceptible individuals when a sufficiently large proportion of immune individuals exist in a population. This population-level effect is often considered in the context of vaccination programs, which aim to establish herd immunity so that those who cannot be vaccinated, including the very young and immunocompromised, are still protected against disease. Depending on the prevalence of existing immunity to a pathogen in a population, the introduction of an infected individual will lead to different outcomes (Figure 1). In a completely naïve population, a pathogen will propagate through susceptible hosts in an unchecked manner following effective exposure of susceptible hosts to infected individuals. However, if a fraction of the population has immunity to that same pathogen, the likelihood of an effective contact between infected and susceptible hosts is reduced since many hosts are immune and, therefore, cannot transmit the pathogen. If the fraction of susceptible individuals in a population is too few, then the pathogen cannot successfully spread and its prevalence will decline. The point at which the proportion of susceptible individuals falls below the threshold needed for transmission is known as the herd immunity threshold (Anderson and May, 1985). Above this level of immunity, herd immunity begins to take effect and susceptible individuals benefit from indirect protection from infection (Figure 1B).

Under the simplest model, the herd immunity threshold depends on a single parameter known as R_0 , or the basic reproduction number (Figure 2A). R_0 refers to the average number of secondary infections caused by a single infectious individual introduced into a completely susceptible population (Anderson and May, 1985). If we consider a hypothetical pathogen with an R_0 of 4, this means that, on average, one infected host will infect 4 others during the infectious period assuming no immunity exists in the population. Mathematically, the herd immunity threshold is defined by $1 - 1/R_0$ (e.g. if $R_0 = 4$, the corresponding herd immunity threshold is 0.75) (Anderson and May, 1985). Therefore, the more communicable a pathogen, the greater its associated R_0 , and the greater the proportion of the population that must be immune to block sustained transmission (Figure 2B). A similar parameter important for understanding population-level immunity is the effective reproduction number (R_e or R_t). R_e is defined as the average number of secondary cases generated by a single index case over an infectious period in a partially immune population (Delamater et al., 2019). Unlike R_0 , R_e does not assume a completely susceptible population and, consequently, will vary depending on a population's current immune state, which will change dynamically as an outbreak event or vaccination campaign unfolds. Ultimately, the goal of vaccination programs is to bring the value of R_e below 1. This occurs when the proportion of the population with immunity exceeds the herd immunity threshold. At this point, pathogen spread cannot be maintained, so there is a decline in the number of infected individuals within the population.

Establishing herd immunity within populations

66 The above interpretation of R_0 and its relation to the herd immunity threshold is the
67 simplest understanding of these terms. It relies on several key assumptions, including
68 homogeneous mixing of individuals within a population and that all individuals develop sterilizing
69 immunity – immunity that confers lifelong protection against reinfection – upon vaccination or
70 natural infection. In real-world situations, these epidemiological and immunological assumptions
71 are often not met, and the magnitude of indirect protection attributed to herd immunity will depend
72 on variations in these assumptions.

73 R_0 is defined by both the pathogen and the particular population in which it circulates.
74 Thus, a single pathogen will have multiple R_0 values depending on the characteristics and
75 transmission dynamics of the population experiencing the outbreak (Delamater et al., 2019). This
76 inherently implies that the herd immunity threshold will vary between populations, which is a well-
77 documented occurrence (Delamater et al., 2019). For any infectious disease, communicability
78 depends on many factors that impact transmission dynamics, including population density,
79 population structure, and differences in contact rates across demographic groups, among others
80 (Anderson and May, 1985). All of these factors will directly or indirectly impact R_0 and,
81 consequently, the herd immunity threshold.

82 To establish herd immunity, the immunity generated by vaccination or natural infection
83 must prevent onward transmission, not just clinical disease. For certain pathogens, such as
84 SARS-CoV-2, clinical manifestations are a poor indicator of transmissibility, as asymptomatic
85 hosts can be highly infectious and contribute to the spread of an epidemic. Once the herd
86 immunity threshold is reached, the efficacy of herd immunity largely depends on the strength and
87 duration of the immunity acquired. For pathogens in which lifelong immunity is induced, as is the
88 case for measles vaccination or infection, herd immunity is highly effective and can prevent
89 pathogen spread within a population. However, this situation is relatively rare, as immunity for
90 many other infectious diseases, such as pertussis and rotavirus, wanes over time. As a
91 consequence, herd immunity is less effective and periodic outbreaks can still occur. Finally, if
92 immunity is unevenly distributed within a population, clusters of susceptible hosts that frequently
93 contact one another may remain. Even if the proportion of immunized individuals in the population
94 as a whole surpasses the herd immunity threshold, these pockets of susceptible individuals are
95 still at risk for local outbreaks.

96

97 **Herd immunity and SARS-CoV-2**

98

99 The ongoing SARS-CoV-2 pandemic has caused over 2.4 million clinically confirmed
100 cases of COVID-19 and has claimed more than 168,000 lives worldwide (as of April 20th 2020).
101 Numerous clinical trials to evaluate novel vaccine candidates and drug repurposing strategies for
102 the prevention and treatment of SARS-CoV-2 infection are currently ongoing. However, it is
103 unknown whether these trials will produce effective interventions, and it is unclear how long these
104 studies will take to establish efficacy and safety, although an optimistic estimate for any vaccine
105 trial is at least 12 to 18 months. In the absence of a vaccine, building up SARS-CoV-2 herd
106 immunity through natural infection is theoretically possible. However, there is no straightforward,
107 ethical path to reach this goal, as the societal consequences of achieving it are devastating.

108 Since the onset of SARS-CoV-2 spread, various studies have estimated the basic
109 reproductive number (R_0) of the virus to be in the range of 2 to 6. From an initial cohort of 425
110 confirmed cases in Wuhan, China, an R_0 of approximately 2.2 was estimated, meaning that, on
111 average, each infected individual gives rise to 2.2 other infections (Li et al., 2020). More recent
112 estimates place the R_0 higher at 5.7, although many estimates fall within this range (Sanche et
113 al., 2020). This variation reflects the difficulty of obtaining accurate R_0 estimates in an ongoing
114 pandemic, and the current estimated SARS-CoV-2 R_0 values likely do not indicate a complete
115 picture of the transmission dynamics across all countries.

116 Assuming an R_0 estimate of 3 for SARS-CoV-2, the herd immunity threshold is
117 approximately 67%. This means that the incidence of infection will start to decline once the
118 proportion of individuals with acquired immunity to SARS-CoV-2 in the population exceeds 0.67.
119 As discussed above, this model relies on simplifying assumptions, such as homogeneous
120 population mixing and uniform sterilizing immunity in recovered individuals across demographic
121 groups, which are unlikely to hold true. Nevertheless, this basic model can give us a rough idea
122 of the number of individuals that would need to be infected to achieve herd immunity in the
123 absence of a vaccine given an approximate herd immunity threshold and a country's population.

124 125 **Consequences of reaching the SARS-CoV-2 herd immunity threshold in the absence of a** 126 **vaccine**

127
128 One important measure to evaluate the impact of SARS-CoV-2 spread is the overall case
129 fatality rate (CFR). The CFR is the proportion of deaths attributed to a certain disease among all
130 individuals diagnosed with that disease (i.e. cases) over a specified period of time. It is worth
131 noting that there is still significant uncertainty in the CFR for COVID-19, due to variation in the
132 testing capacity per country, selection bias for which individuals receive testing, and differences
133 in how deaths are officially attributed to COVID-19. Further, CFR is also sensitive to variation in
134 the underlying age structure and distribution of comorbidities among populations. Consequently,
135 CFRs may differ considerably over time and between countries. In the case of COVID-19, the
136 initial estimate of the CFR in a small cohort of 41 individuals with laboratory-confirmed SARS-
137 CoV-2 infection was high (15%) (Huang et al., 2020). However, this number has markedly
138 decreased as more data has become available. Using data from all laboratory confirmed and
139 clinically diagnosed cases from mainland China, Verity et al. obtained an estimated overall CFR
140 of 1.38%, adjusted for censoring, under-ascertainment, and the underlying demography in China,
141 and similar estimates have been obtained from other groups (Verity et al., 2020, Wu et al., 2020).
142 Like many other infectious diseases, a non-uniform COVID-19 CFR has been reported across
143 age groups, with the vast majority of deaths occurring among individuals 60 years old or greater.

144 The most relevant measure to evaluate the societal cost of achieving global SARS-CoV-
145 2 herd immunity is the overall infection fatality rate (IFR). The IFR is defined as the proportion of
146 deaths caused by a certain disease among all infected individuals. Because some cases will not
147 be reported, especially among asymptomatic hosts or individuals with mild symptoms, the IFR will
148 inherently be lower than the CFR. If we combine infection fatality data with an estimate of the
149 number of individuals that need to develop immunity to reach the herd immunity threshold, we
150 can project the expected number of deaths as a consequence of meeting this threshold. Because
151 of the uncertainty in the COVID-19 IFR, we use three different point estimates in our analysis: 1)
152 an IFR of 0.2%, 2) an IFR of 0.6% that is in line with the IFR determined by Verity et al., and 3)
153 an IFR of 1% (Figure 2C). Assuming a uniform herd immunity threshold of 67% ($R_0 = 3$) and an
154 IFR of 0.6%, the absolute number of expected deaths across the globe would exceed 30 million
155 people (Figure 2C). Notably, this analysis assumes that IFRs do not vary across countries, and it
156 does not consider factors that lead to heterogeneity in IFRs, including differences in access to
157 healthcare resources and variation in the prevalence of comorbidities.

158 In reality, CFRs and IFRs vary dramatically across countries, as highlighted by the current
159 estimates of unadjusted CFRs across the globe (Italy = 12.7%, United States = 3.40%, South
160 Korea = 1.96%, CEBM, 2020). Although testing biases and differences in age demographics
161 across countries account in part for these elevated regional CFRs, additional factors likely play a
162 role, most notably a strain on local healthcare systems. In Italy, a sudden influx of COVID-19
163 patients in March led to a shortage of intensive care unit beds and other essential medical
164 resources, causing a substantial burden on hospitals. This outbreak underscores the importance

165 of taking into account the limits of local healthcare infrastructure and how exceeding these limits
166 can exacerbate negative outcomes of COVID-19.

167 Particularly in the context of attaining herd immunity to SARS-CoV-2, a regard for finite
168 healthcare resources cannot be overstated, as this policy inherently relies on allowing a large
169 fraction of the population to become infected. Unchecked, the spread of SARS-CoV-2 will rapidly
170 overwhelm healthcare systems. A depletion in healthcare resources will not only lead to elevated
171 COVID-19 mortality but also to increased all-cause mortality. This effect will be especially
172 devastating for countries in which hospitals have limited surge capacity, where minimal public
173 health infrastructure exists, and among vulnerable communities, including prison and homeless
174 populations.

175

176 **Epidemiological considerations for SARS-CoV-2 herd immunity**

177

178 Because SARS-CoV-2 is a novel pathogen, many features of its transmission and
179 infection dynamics are not well characterized. Thus, our above analysis provides only a sense of
180 the potential ramifications given a scenario in which we attain herd immunity via natural infection.
181 We do not consider numerous complexities of viral spread and infectivity, including variation in
182 R_0 across time and populations, heterogeneity in the attack and contact rates across demographic
183 groups, and inter-individual variation in communicability and disease severity, although these
184 aspects are essential to understand the full picture of SARS-CoV-2 community spread. While
185 these epidemiological factors have important implications in the context of herd immunity,
186 currently, they are difficult to estimate given the limited data available.

187 Differences in population density, cultural behaviors, population age structure, underlying
188 comorbidity rates, and contact rates across groups influence transmission dynamics within
189 communities, so the assumption of a uniform R_0 across populations is not realistic. Further,
190 variation in transmissibility between individuals may play a major role in SARS-CoV-2 spread.
191 Superspreading events occur when circumstances favorable for high rates of transmission arise.
192 These events involve a single index case infecting a large number of secondary contacts and are
193 known to be important in driving outbreaks of infectious diseases, including SARS, MERS, and
194 measles (Lloyd-Smith et al., 2005). Reports of SARS-CoV-2 superspreading events have been
195 documented, suggesting that heterogeneity in infectivity may significantly impact the dynamics of
196 its transmission (Liu et al., 2020). Finally, the factors that influence inter-individual heterogeneity
197 in COVID-19 susceptibility, clinical pathology, and disease outcome are not well understood.
198 Reported differences in sex- and ethnicity-specific CFRs suggest that genetic, environmental, and
199 social determinants likely underlie variation in susceptibility to COVID-19 and the severity of
200 COVID-19 complications, although future studies are needed to explore this further (Nasiri et al.,
201 2020).

202

203

204 **Immunological considerations for SARS-CoV-2 herd immunity**

205

206 The ability to establish herd immunity against SARS-CoV-2 hinges on the assumption that
207 infection with the virus generates sufficient, protective immunity. At present, the extent to which
208 humans are able to generate sterilizing immunity to SARS-CoV-2 is unclear. A recent study
209 assessing the possibility of SARS-CoV-2 reinfection in a small cohort of rhesus macaques found
210 that reinfection was not able to occur one month after the first viral challenge, suggesting at least
211 short-term sterilizing immunity in these animals (Bao et al., 2020). In a cohort of 175 recovered
212 COVID-19 patients, SARS-CoV-2-specific serum neutralizing antibodies (NAbs) were detected at
213 considerable, albeit variable, titers in most ($n = 165$) individuals (Wu et al., 2020), indicating that
214 the production of NAb against SARS-CoV-2 is relatively common.

215 Whereas these findings are promising, other important questions to consider are whether
216 NAb titers will wane over time and how long acquired immunity will last. Previous studies in
217 confirmed SARS patients have demonstrated that NAb responses against SARS-CoV persisted
218 for several months to two years, although all individuals displayed low titers after about 15 months
219 (Mo et al., 2006). Further, elevated concentrations of specific antibodies to coronavirus 229E, one
220 of the viruses responsible for the common cold, were found one year after infection, although
221 these titers were not sufficient to prevent reinfection in all individuals (Callow et al., 1990).
222 Together, these studies suggest that protection against reinfection with coronavirus species tends
223 to diminish given sufficient time, although longitudinal serological studies are needed to assess
224 the duration of SARS-CoV-2 immunity. If this proves to also be true for SARS-CoV-2, persistent
225 herd immunity may never be attained in the absence of recurrent vaccination. Indeed, modelling
226 of the transmission dynamics of SARS-CoV-2 predicts that short-term immunity (~10 months)
227 would give rise to annual outbreaks, while longer-term immunity (~2 years) would lead to biennial
228 outbreaks (Kissler et al., 2020). Mass serological testing is now needed to determine how many
229 individuals have been infected, how many individuals are immune, and how far we are from
230 reaching the herd immunity threshold. That said, even if reinfection can occur after immunity
231 wanes, enduring memory cells of the adaptive immune system would likely facilitate immune
232 control of the virus and limit disease pathology, which would hopefully decrease the clinical
233 severity of subsequent infections.

234 **Recap**

235
236
237 In a sufficiently immune population, herd immunity provides indirect protection to
238 susceptible individuals by minimizing the probability of an effective contact between a susceptible
239 individual and an infected host. In its simplest form, herd immunity will begin to take effect when
240 a population reaches the herd immunity threshold, namely when the proportion of individuals who
241 are immune to the pathogen crosses $1 - 1/R_0$. At this point, sustained transmission cannot occur,
242 so the outbreak will decline. However, in real-world populations, the situation is often much more
243 complex. Epidemiological and immunological factors, such as population structure, variation in
244 transmission dynamics between populations, and waning immunity, will lead to variation in the
245 extent of indirect protection conferred by herd immunity. Consequently, these aspects must be
246 taken into account when discussing the establishment of herd immunity within populations. There
247 are two possible approaches to build widespread SARS-CoV-2 immunity: *i*) a mass vaccination
248 campaign, which requires the development of an effective and safe vaccine, or *ii*) natural
249 immunization of global populations with the virus over time. However, the consequences of the
250 latter are serious and far-reaching – a large fraction of the human population would need to
251 become infected with the virus and millions would succumb to it. Thus, in the absence of a
252 vaccination program, establishing herd immunity should not be the ultimate goal. Instead, an
253 emphasis should be placed on policies that protect the most vulnerable groups, in the hopes that
254 herd immunity will eventually be achieved as a byproduct of such measures, although not the
255 primary objective itself.

256
257
258

259 **Acknowledgements**

260

261 We thank members of the Barreiro lab, Valerie Abadie, Sarah Cobey, Maziar Divangahi,
262 Bana Jabri, William Koval, Joaquin Sanz, and Patrick Wilson for the constructive comments and
263 feedback. This work was supported by grant R01-GM134376 to L.B.B. H.E.R is supported by a
264 National Science Foundation Graduate Research Fellowship (DGE-1746045).

265

266

267 **Figure Legends**

268
269
270
271
272
273
274
275
276
277
278
279
280
281
282
283
284

Figure 1. Herd immunity. A) SIR (susceptible, infectious, recovered) model for a completely immunizing infection with an $R_0 = 4$. The model assumes a closed population in which no people leave and no new cases are introduced. Following the introduction of a single infected individual, the proportion of infected individuals (red line) increases rapidly until reaching its peak, which corresponds to the herd immunity threshold. After this point, newly infected individuals infect fewer than one susceptible individual, as a sufficient proportion of the population has become resistant, preventing further spread of the pathogen (orange line). B) Schematic depiction of the disease propagation dynamics when one infected individual is introduced into a completely susceptible population (top panel) versus a situation in which an infected individual is introduced into a population that has reached the herd immunity threshold (bottom panel). In the naïve population, an outbreak quickly emerges, whereas under the scenario of herd immunity, the virus fails to spread and persist in the population.

285 **Figure 2. The potential health burden of COVID-19 if herd immunity is achieved in the**
286 **absence of vaccination.** A) Relationship between R_0 - the basic reproduction number (Box
287 1) - and the herd immunity threshold, which corresponds to the proportion of individuals
288 in the population that would need to become immune for herd immunity to be established
289 (y-axis). As R_0 increases, the proportion of the population that must be immune to generate herd
290 immunity increases ($1 - 1/R_0$). B) Basic reproductive numbers (R_0) and the corresponding herd
291 immunity thresholds for various infectious diseases. R_0 estimates represent the commonly
292 accepted R_0 range for each of the pathogens reported. C) Expected number of absolute deaths
293 for the top 20 countries with the highest incidence of COVID-19 as of April 10, 2020, assuming
294 herd immunity is established at a uniform threshold of 67% ($R_0 = 3$) in each country. Overall
295 COVID-19 infection fatality rates (IFR) of 0.2%, 0.6%, and 1.0% are considered. We note that
296 these numbers are necessarily underestimates given that, even after the herd immunity threshold
297 is reached, it will take a long time until there are no more new cases, and therefore, no new
298 deaths.

299
300
301

302 **Box 1. Glossary**

303
304
305
306
307
308
309
310
311
312
313
314

Herd immunity: The indirect protection from infection conferred to susceptible individuals when a sufficiently large proportion of immune individuals exist in a population.

Herd immunity threshold: The point at which the proportion of susceptible individuals in a population falls below the threshold needed for transmission.

R_0 : The average number of secondary infections caused by a single infectious individual introduced into a completely susceptible population.

R_e : The average number of secondary cases generated by a single infectious individual over an infectious period in a partially immune population.

315
316 *Onward transmission*: The effective transmission of a pathogen from an infected individual to
317 susceptible host(s).

318
319 *Case Fatality Rate (CFR)*: Proportion of deaths attributed to a certain disease among all
320 individuals diagnosed with that disease.

321
322 *Infection Fatality Rate (CFR)*: Proportion of deaths attributed to a certain disease among all
323 infected individuals.

324

325

326

327

328 **Further reading**

- 329
- 330 1. Anderson RM, May RM. Vaccination and herd immunity to infectious diseases. *Nature*.
331 1985; 318: 323-329.
- 332 2. Delamater PL, Street EJ, Leslie TF, Yang Y, Jacobsen KH. Complexity of the basic
333 reproduction number (R_0). *Emerg Infect Dis*. 2019; 25: 1-4.
- 334 3. Li Q, Guan X, Wu P, Wang X, Zhou L, Tong Y, Ren R, Leung SKM, Lau EHY, Wong JY,
335 et al. Early transmission dynamics in Wuhan, China, of novel coronavirus-infected
336 pneumonia. *N Engl J Med*. 2020; 382: 1199-1207.
- 337 4. Sanche S, Lin YT, Xu C, Romero-Severson E, Hengartner N, Ke R. High
338 contagiousness and rapid spread of severe acute respiratory syndrome coronavirus 2.
339 *Emerg Infect Dis*. 2020; 26: doi: 10.3201/eid2607.200282.
- 340 5. Huang C, Wang Y, Li X, Ren L, Zhao J, Hu Y, Zhang L, Fan G, Xu J, Gu X, et al. Clinical
341 features of patients infected with 2019 novel coronavirus in Wuhan, China. *Lancet*. 2020;
342 395: 497-506.
- 343 6. Verity R, Okell LC, Dorigatti I, Winskill P, Whittaker C, Imai N, Cuomo-Dannenburg G,
344 Thompson H, Walker PGT, Fu H, et al. Estimates of the severity of coronavirus disease
345 2019: a model-based analysis. *Lancet Infect Dis*. 2020; doi: 10.1016/S1473-
346 3099(20)30243-7.
- 347 7. Wu JT, Leung K, Bushman M, Kishore N, Niehus R, Salazar PM, Cowling BJ, Lipsitch
348 M, Leung GM. Estimating clinical severity of COVID-19 from the transmission dynamics
349 in Wuhan, China. *Nat Med*. 2020; 26:506-510.
- 350 8. Global COVID-19 case fatality rates. The Centre for Evidence-Based Medicine. 2020.
351 <https://www.cebm.net/covid-19/global-covid-19-case-fatality-rates>.
- 352 9. Lloyd-Smith JO, Schreiber SJ, Kopp PE, Getz WM. Superspreading and the effect of
353 individual variation on disease emergence. *Nature*. 2005; 438: 355-359.
- 354 10. Liu Y, Eggo RM, Kucharski AJ. Secondary attack rate and superspreading events for
355 SARS-CoV-2. *Lancet*. 2020; 395: e47.
- 356 11. Nasiri MJ, Haddadi S, Tahvildari A, Farsi Y, Arbabi M, Hasanzadeh S, Jamshidi P,
357 Murthi M, Mirsaiedi M. COVID-19 clinical characteristics, and sex-specific risk of
358 mortality: systematic review and meta-analysis. *medRxiv*. 2020; doi:
359 10.1101/2020.03.24.20042903.
- 360 12. Bao L, Deng W, Gao H, Xiao C, Liu J, Xue J, Lv Q, Liu J, Yu P, Xu Y, et al. Reinfection
361 could not occur in SARS-CoV-2 infected rhesus macaques. *bioRxiv*. 2020; doi:
362 10.1101/2020.03.13.990226.
- 363 13. Wu F, Wang A, Liu M, Wang Q, Chen J, Xia S, Ling Y, Zhang Y, Xun J, Lu L, et al.
364 Neutralizing antibody responses to SARS-CoV-2 in a COVID-19 recovered patient
365 cohort and their implications. *medRxiv*. 2020; doi: 10.1101/2020.03.30.20047365.
- 366 14. Mo H, Zeng G, Ren X, Li H, Ke C, Tan Y, Cai C, Lai K, Chen R, Chan-Yeung M, et al.
367 Longitudinal profile of antibodies against SARS-coronavirus in SARS patients and their
368 clinical significance. *Respirology*. 2006; 11: 49-53.
- 369 15. Callow KA, Parry HF, Sergeant M, Tyrrell DA. The time course of the immune response
370 to experimental coronavirus infection of man. *Epidemiol Infect*. 1990; 105: 435-446.
- 371 16. Kissler SM, Tedijanto C, Goldstein E, Grad YH, Lipsitch M. Projecting the transmission
372 dynamics of SARS-CoV-2 though the postpandemic period. *Science*. 2020; doi:
373 10.1126/science.abb5793.
- 374



