1	The Three Ts of Pathogen Evolution During Zoonotic Emergence
2	
3	Elisa Visher ^{1*} , Claire Evensen ² , Sarah Guth ¹ , Edith Lai ³ , Marina Norfolk ⁴ , Carly Rozins ⁵ , Nina A.
4	Sokolov ¹ , Melissa Sui ⁴ , Michael Boots ^{1,6}
5	
6 7 9 10 11 12 13 14	 Department of Integrative Biology, University of California, Berkeley, CA, 94720, USA Mathematical Institute, University of Oxford, OX2 6GG, UK College of Natural Resources, University of California, Berkeley, CA, 94720, USA College of Letters & Sciences, University of California, Berkeley, CA, 94720, USA Department of Science and Technology Studies, Division of Natural Science, York University, Toronto, Ontario, M3J 1P3, CA Centre for Ecology and Conservation, College of Life and Environmental Sciences, University of Exeter, Penryn Campus, Penryn, TR10 9FE, UK
15 16	*Corresponding Author: elisa_visher@berkeley.edu
17 18 19 20 21 22 23 24 25 26 27	Author ORCiD Information EV: 0000-0003-3984-4748 CE: 0000-0002-2060-2362 SG: 0000-0001-5533-9456 EL: 0000-0002-0968-4547 MN: 0000-0001-6034-3417 CR: 0000-0003-1503-4871 NAS: 0000-0002-2920-3106 MS: 0000-0002-3422-2723 MB: 0000-0003-3763-6136
28	Abstract

29 When novel zoonotic diseases like Sars-CoV-2 emerge, they are likely to be poorly 30 adapted to humans. Effective control measures will suppress transmission before significant 31 evolution can occur, but extended transmission in human populations allows time for selection 32 pressures to act. In this review, we discuss the factors shaping zoonotic pathogens' 33 transmissibility and virulence at spillover and the selection pressures acting on these traits during 34 emergence into human populations. We discuss how selection pressures during epidemics of 35 emerging zoonotic disease are determined by the three Ts: trade-offs, transmission, and time 36 scales. In short, virulence and transmission may trade-off, but transmission is likely to be favored 37 by selection early in emergence. However, the relative selection pressures on transmission and 38 virulence shift depending on the time scale of the epidemic. Predicting pathogen evolution in 39 zoonoses therefore depends critically on understanding both the trade-offs of transmission-40 improving mutations and the time scales of selection.

42 Introduction

43 The current pandemic has emphasized that zoonotic emerging infectious diseases are 44 undeniably a grave public health concern (Woolhouse et al., 2012). Clearly, these diseases 45 necessitate rapid research upon emergence to uncover the pathogen's biology and modes of 46 transmission in order to develop diagnostics, public health recommendations, treatments, and 47 vaccines (Holmes et al., 2018). If successful, these interventions can stop transmission chains 48 and end the epidemic. If these interventions are unsuccessful, however, extended circulation in 49 humans can create selective pressures on these zoonotic pathogens (Plowright et al., 2017). 50 Therefore, in extended outbreaks, some attention should turn towards monitoring and 51 understanding potential pathogen evolution. Robust public health surveillance systems that 52 include viral sequencing can identify potential adaptive variants (Korber et al., 2020; Rambaut et 53 al., 2020) and evolutionary theory can help us understand how host, pathogen, and ecological 54 traits shape selective pressures to determine possible evolutionary outcomes (Bonneaud & 55 Longdon, 2020; Day et al., 2020).

56 Many recently emerged zoonotic pathogens have been viruses, particularly RNA viruses, 57 whose high mutation rates mean that multiple variants reach high frequencies early in epidemics 58 (Geoghegan et al., 2016). Most mutations in viruses have deleterious or neutral fitness effects 59 (Sanjuán, 2010), but the small proportion of mutations with beneficial fitness effects might be 60 particularly important for emerging zoonotic pathogens adapting to human hosts (Parrish et al., 61 2008; Plowright et al., 2017). However, even when these beneficial mutations occur early in the 62 epidemic, they are slow to spread because selection pressures are weak relative to stochastic 63 factors like drift in small populations (MacLean et al., 2020). Potential adaptive variants can also 64 be difficult to identify because phylogenetic patterns are often complicated by human 65 demographic factors and founder effects (Villabona-Arenas et al., 2020). For example, a variant 66 of Ebola virus in the 2016 epidemic seemed to be associated with increased human

transmissibility in phylodynamic and *in vitro* assays, but did not correlate with higher viral titers or
shedding in macagues (Diehl et al., 2016; Marzi et al., 2018; Urbanowicz et al., 2016).

69 Despite these challenges, stories about mutations often spark public concern about 70 pathogens evolving to be more deadly, more transmissible, or to evade vaccines and treatments 71 (Grubaugh, Petrone, et al., 2020). Alternatively, historical theories of evolution towards avirulence 72 still pervade the public consciousness and sometimes lead to the prediction that the virus will 73 guickly evolve to become less dangerous (Smith, 1904). During the current Sars-CoV-2 epidemic, 74 reports of a mutational variant (D614G) increasing in frequency set off these debates in May 75 (Korber et al., 2020). Early responses cautioned against the overinterpretation of these reports 76 (Grubaugh, Hanage, et al., 2020; Grubaugh, Petrone, et al., 2020; MacLean et al., 2020; 77 Villabona-Arenas et al., 2020), but recent experiments in human cell culture and *in vivo* rodent 78 models have confirmed that this D614G variant may improve human transmission through higher 79 infectivity and replication in upper respiratory tissues (Hou et al., 2020; Plante et al., 2020). More 80 recently, the B.1.1.7 lineage with multiple spike mutations emerged in the UK and seems likely to 81 increase transmission rate (Rambaut et al., 2020). Despite these increases in transmission, the 82 D614G variant does not seem to be associated with changes in clinical severity (Volz et al., 2020) 83 and primary reports suggest that the B.1.1.7 lineage may not cause increased mortality either 84 (Davies et al., 2020). What is clear is that these examples show the potential for evolutionary 85 change during disease emergence.

Given the plausibility of Sars-CoV-2 adapting to improve human transmission and public fascination with the topic, it is important that the broad scientific community have a clear understanding of virulence evolution theory to quickly combat any false narratives. The study of virulence and transmission evolution in epidemics of emerging infectious disease has been an active but often separate area of research in both evolutionary virology and eco-evolutionary theory (Cressler et al., 2016; Geoghegan & Holmes, 2018). In this review, we will integrate insights

92 from disease ecology, virology, computational genomics, and population genetics and eco-93 evolutionary theory to form a more complete understanding of the factors shaping pathogen 94 evolution (Visher & Boots, 2020). We will discuss: how a pathogen's evolutionarily stable (long 95 term 'optimal') strategy depends on trade-off shape; what predicts pathogen virulence at the 96 spillover barrier; why selection pressures favor transmission improvements in maladapted 97 zoonotic pathogens; and how these selection pressures change over time during epidemics. 98 Through this, we describe predictions for pathogen evolution during epidemics of emerging 99 zoonotic disease and how they change depending on pathogen factors and host population 100 structure.

101

102 Introduction to the Three Ts: Trade-offs, Transmission, and Time Scales

103 The adaptive evolution of any trait depends on the presence of variation and the ability of 104 selection pressures to act on that variation. It is clear that pathogens, particularly RNA viruses, 105 can quickly generate and maintain large amounts of variation (Geoghegan & Holmes, 2017). 106 Selection pressures on these variants are weak compared to stochastic and demographic 107 pressures at the start of an epidemic, but gain strength as the number of infections increase 108 (MacLean et al., 2020). An extensive body of literature suggests that selection pressures on 109 virulence during epidemics of emerging zoonotic disease are determined by the three Ts: trade-110 offs, transmission, and time scales (Anderson & May, 1982; Bull & Ebert, 2008; Day et al., 2020; 111 Lenski & May, 1994). See Figure 1 for graphical summary.

Theory has often assumed, and empirical data has increasingly shown us, that many pathogen traits, like transmission and virulence, **trade-off** with each other (Acevedo et al., 2019; Anderson & May, 1982; Cressler et al., 2016; Frank, 1996; Table 1). The **trade-off** theory is important because it explains how different intermediate virulence, transmission, and recovery

rates can be optimal for a pathogen due to constraints between these key traits (Anderson & May, 1982; Cressler et al., 2016; Frank, 1996). It is often assumed that these trade-offs arise because these traits all correlate with within-host pathogen replication rates, although this is not necessary if symptoms directly correlate with transmission (Bonneaud et al., 2020). A large body of ecoevolutionary theory has shown that the shapes of these trade-offs determine the pathogen's optimum strategy and thus the direction of selection pressures (Anderson & May, 1982; Frank, 1996).

123 Emerging zoonotic pathogens typically do not have histories of selection in human 124 populations and thus are likely to be maladapted for human-to-human transmission (Warren & 125 Sawyer, 2019; Woolhouse et al., 2005). Meta-analyses of field data on recently emerged 126 pathogens can tell us patterns associated with a novel zoonotic pathogen's ability to transmit in 127 humans (Geoghegan et al., 2016; Guth et al., 2019; Olival et al., 2017). This can tell us about the 128 extent of maladaptation to humans and establishes a starting point for selection. In theory, this 129 maladaptation means that emerging zoonotic pathogens may initially have 'no-cost' mutations 130 available that improve transmission without impacting traits like virulence (Bull & Ebert, 2008). In 131 these cases, selection pressures for **transmission** improvements are likely to be most important 132 (Bull & Ebert, 2008).

Finally, transmission increases continue to be the most important selection pressure on pathogens at the start of an epidemic, even when they trade-off with virulence (Lenski & May, 1994). Theory combining population genetics and eco-evolutionary approaches has shown how the relative selection pressures on different pathogen traits shift as the density of infected and susceptible hosts changes during an epidemic (Day & Proulx, 2004; Lenski & May, 1994). Therefore, the pathogen's optimum strategy changes over **time** during an epidemic. Preliminary evolutionary epidemiology modelling of Sars-CoV-2 has shown that evolution can vary depending

- 140 on these three Ts: trade-offs, transmission, and time scales (Day et al., 2020). We will describe
- 141 each of these in detail below.



Figure 1: The Three Ts of Pathogen Evolution During Zoonotic Emergence

143

142

144 The Virulence-Transmission Trade-Off Hypothesis

Evolutionary biologists have long been entranced by the question of why pathogens harm their hosts, or cause virulence (See Box 1) (Fenner & Ratcliffe, 1965). Based on the assumption that host damage was always detrimental to parasite fitness, early ideas predicted that all parasites should evolve towards avirulence (Alizon et al., 2009; Smith, 1904). This was considered the 'conventional wisdom' until the 1980s, when foundational papers began to appreciate that virulence might be linked to other parasite traits like transmission or recovery rate 151 and therefore could have an evolutionary optimum (Anderson & May, 1982; Ewald, 1983). Any 152 trade-offs between these traits would mean that low virulence could come at a cost of low 153 transmission or fast recovery and that avirulence would therefore hinder parasite fitness. This 154 virulence and transmission trade-off is now fundamental to our theories on pathogen evolution.

155 Theory on the virulence and transmission trade-off typically suggests that virulence and 156 transmission are both functions of the within-host exploitation or replication rate (Alizon et al., 157 2009; Cressler et al., 2016). Because faster replicating pathogens generate larger population 158 sizes, they increase their transmission rate while causing more host damage (Cressler et al., 159 2016; Frank, 1996). This damage increases host mortality, thereby decreasing the host's 160 infectious period and providing a shorter window for the infected host to contact susceptible hosts 161 (Anderson & May, 1982). In short, faster within-host replication increases the likelihood of 162 infection upon contact while decreasing the overall duration of infection (Anderson & May, 1982; 163 Frank, 1996). Under the trade-off hypothesis, parasites are therefore selected for exploitation 164 rates that balance virulence and transmission (Anderson & May, 1982; Cressler et al., 2016; 165 Frank, 1996).

166 Several other trade-offs have been proposed that don't depend on virulence and 167 transmission trading off through the within-host exploitation rate. A virulence-recovery trade-off 168 can occur if low replication rates make pathogens easier to clear such that lower virulence trades 169 off with faster recovery rates (Anderson & May, 1982). Alternatively, a transmission-recovery 170 trade-off can happen if the immune response is activated in a density dependent manner so that 171 high replication rates have high transmission, but fast recovery (Alizon, 2008). A sickness 172 behavior-transmission trade-off may happen if faster replication rates make the host feel sick and 173 isolate themselves so that high replication leads to higher transmission rates, but fewer contacts 174 (Ewald, 1994). Finally, the virulence and transmission trade-off does not necessarily depend on 175 changes to the within-host replication rate if symptoms themselves are needed for transmission

176 (Bonneaud et al., 2020). These alternative trade-offs can all still lead to selection for parasites to
177 balance their virulence or transmission metrics with other traits.

178 In simple host-parasite models, pathogens are selected to maximize the epidemiological 179 R₀ (i.e. the number of secondary infections that a parasite produces during its infectious period in 180 an entirely susceptible population) (See Box 2) (Anderson & May, 1982; but see Lion & Metz, 181 2018). The virulence-transmission trade-off predicts that these two traits are positively correlated, 182 but the shape of this relationship is critical to the predictions of evolutionary theory (Anderson & 183 May, 1982; Frank, 1996). When the trade-off is linear, pathogens evolve maximum virulence; but 184 when the trade-off is saturating (such that virulence is acceleratingly costly in terms of 185 transmission), pathogens will evolve towards an intermediate virulence (Alizon et al., 2009; 186 Anderson & May, 1982). Given the centrality of the trade-off hypothesis to our understanding of 187 virulence, it is noticeable that there are an increasing number of empirical studies that have found 188 support for the core idea (See Table 1) (Acevedo et al., 2019).

189 While virulence evolution has traditionally been discussed in terms of R_0 maximization, R_0 190 does not directly correlate with pathogen fitness. A more universal rule is that parasites are 191 selected following a pessimisation principle where the evolutionarily stable strategy is that which 192 can be sustained in the lowest quality environment (Lion & Metz, 2018; Metz et al., 2008; Mylius 193 & Diekmann, 1995). In virulence and transmission trade-off models, this is the strategy with the 194 lowest susceptible population at ecological equilibrium. Under the pessimisation principle, the key 195 insights of the trade-off hypothesis still hold in more varied, complex ecological circumstances 196 (Lion & Metz, 2018). If virulence trades off with other parasite fitness components, selection will 197 balance the negative fitness contributions of virulence with the positive fitness contributions of 198 traits like transmission (Lion & Metz, 2018).

Box 1. Defining virulence

A textbook definition of virulence is **Environment factors** Resource availability "Whereas 'pathogenicity' refers to the Environmental stressors Environmental toxicants capacity of micro-organisms to cause disease, the essentially synonymous term virulence is generally used to note Pathogen factors variations in degree. Virulence Replication rate Replication site Immune manipulation encompasses two features of an **Host factors** organism's disease-producing Immune status Host genetics capacity: infectivity (i.e., the ability to colonize and invade a host) and Figure 2: Disease Triangle of Virulence severity of the disease that is produced" (Davis et al., 1990; Read, 1994). Different subfields, however, emphasize different parts of this definition with plant pathologists focusing more on infectivity and animal disease focusing more on severity. In the context of the virulence and transmission trade-off theory, virulence is defined more narrowly as the additional rate of mortality due to infection (Read, 1994). In these models, virulence is therefore a host outcome that is mediated by host, pathogen, and environmental traits. Host and pathogen traits involved in virulence are similar in human and other animal systems and include traits like host age and genetics and pathogen replication rate and immune manipulation. Environmental factors involved in causing virulence for humans include resource availability (including access to healthcare), exposure to environmental toxicants, and environmental stressors (including chronic stress from social inequities and racism) (Barber, 2020).

200

Age

Box 2. Deriving R₀ maximization

We can look at a simplistic SI model to understand the math behind R_0 maximization. First, we set up our system of equations for the host-parasite system before mutation.

$$\frac{\mathrm{d}S}{\mathrm{d}t} = b - \beta SI - dS$$
$$\frac{\mathrm{d}I}{\mathrm{d}t} = \beta SI - dI - \alpha I$$

In this system, we have natural birth (b) and death (d), density dependent transmission (β), and virulence (α), but no recovery.

We can then solve for the ecological equilibrium of this system.

(1)
$$S = \frac{b}{d}$$
, $I = 0$
(2) $S = \frac{d+\alpha}{\beta}$, $I = \frac{b}{d+\alpha} - \frac{d}{\beta}$

The first equilibrium is simply when there is no infection in the system, so we focus on the second. This second equation is the ecological equilibrium of the system infected only by the resident strategy. Now, we want to conduct an invasion analysis asking what mutant values (m) can invade the ecological equilibrium set by the resident strategy (r).

$$\frac{\mathrm{d}S}{\mathrm{d}t} = b - \beta_r S I_r - \beta_m S I_m - dS$$
$$\frac{\mathrm{d}I_r}{\mathrm{d}t} = \beta_r S I_r - dI_r - \alpha_r I_r$$
$$\frac{\mathrm{d}I_m}{\mathrm{d}t} = \beta_m S I_m - dI_m - \alpha_m I_m$$

To see when the mutant can invade, we determine the stability of the mutant-free equilibrium,

$$S = rac{d+lpha_r}{eta_r} \ , \ \ I_r = rac{b}{d+lpha_r} - rac{d}{eta_r} \ , \ \ I_m = 0 \ .$$

The equilibrium is not stable when an emerging rare mutant can increase in number. This gives the invasion criteria.

$$\frac{\beta_m}{d+\alpha_m} > \frac{\beta_r}{d+\alpha_r}$$

In this simplistic example, the invasion criteria may be familiar as a form of R_0 , the basic reproductive number. This means that the mutant with the highest R_0 can invade any population at equilibrium.

Table 1. Empirical tests of virulence evolution theory							
Paper	System	Virulence	Results				
The virulence and transmission trade-off							
(Anderson & May,	Oryctolagus	Mortality rate	Ro was maximized at an				
1982)	cuniculus /		intermediate virulence that had				
	Myxoma virus		slower recovery and mortality				
			rates				
(Mackinnon &	Mus musculus /	Body mass loss and	Virulence and transmission				
Read, 1999)	Plasmodium	anemia	stage density are both				
	chabaudi		positively correlated with				
			replication rate				
(Mackinnon &	Homo sapiens /	Mortality rate	Parasite fitness peaks at				
Read, 2004)	Plasmodium		intermediate virulence values				
	falciparum		with higher parasite replication				
			and lower mortality				
(Jensen et al.,	Daphnia magna	Time to host death	Transmission stage production				
2006)	/ Pasteuria	in an obligately	peaked at intermediate				
	ramosa	killing, castrating	virulence				
		parasite					
(Fraser et al.,	Homo sapiens /	Duration of	R ₀ peaks at intermediate viral				
2007)	HIV-1	asymptomatic	set point load and virulence				
(Roode et al.,	Danaus	Emergence and	Parasite lifetime fitness peaks				
2008)	piexippus /	mating probability,	at intermediate replication				
	Ophryocystis	focundity	rates				
(Atking at al		Heat lifeenen					
	domostious /	nost mespan	R ₀ peaks at intermediate				
2013)	Marok's		viruience				
	disease virus						
(Doumayrou et al	Brassica rana /	Symptom severity	Virulence and transmission				
(Dodinayiou et al., 2013)	Cauliflower		show a positive saturating				
2010)	mosaic virus		relationship, but the				
			relationship with replication				
			rate is not clear				
(Tardy et al	Haemorhous	Body mass loss.	Virulence increases with				
2019)	mexicanu /	symptom severity.	parasite replication rate in				
,	Mycoplasma	and putative	isolates before, but not after				
	gallisepticum	mortality rate	host resistance evolution				

(Bonneaud et al.,	Haemorhous	Host mortality and	Ro peaks at intermediate				
2020)	mexicanu /	symptom severity	virulence, even when the				
	Mycoplasma		relationship between				
	gallisepticum		transmission and virulence is				
			not dependent on replication				
			rate				
(Acevedo et al.,	Meta-analysis		Strong evidence of increasing				
2019)	of multiple		relationships between				
	systems		virulence and replication and				
			transmission and replication				
Virulence evolution during epidemics							
(Berngruber et al.,	Escherichia coli	Horizontal	Virulent, lytic phage is strongly				
2013)	/ bacteriophage	transmission	favored during competition at				
	lambda	through lysis (rather	the start of an epidemic, but				
		than vertical)	latent virus outcompetes it as				
			the epidemic progresses				
Virulence evoluti	on in spatially s	tructured population	าร				
(Kerr et al., 2006)	Escherichia coli	Competitive ability	Prudent strategies dominate				
	/ T4 coliphage	and productivity	with spatially restricted				
			migration, while virulent				
			phages dominate with global				
			migration				
(Boots & Mealor,	Plodia	Proportion of hosts	Spatially structure selects for				
2007)	interpunctella /	infected in an	less infective, more prudent				
	granulosis virus	obligate killer	virus				
(Berngruber et al.,	Escherichia coli	Horizontal	Latent, more prudent virus				
2015)	/ bacteriophage	transmission	outcompetes lytic virus in				
	lambda	through lysis (rather	spatially structured populations				
		than vertical)					
Virulence evolution with environmental transmission							
(Ogbunugafor et	HeLa cells /	Host cell death	There is a trade-off between				
al., 2013)	vesicular		transmission and the formation				
	stomatitis virus		of environmentally persistent				
			particles				
(Wasik et al.,	BHK cells /	Plaque size	There is a trade-off between				
2015)	vesicular		viral fecundity and the				
	stomatitis virus		formation of environmentally				
			persistent particles				
(Walther & Ewald,	Homo sapiens /	Case fatality rate	Respiratory pathogens that				
2004)	respiratory tract		survive longer in the				
	pathogens		environment are more virulent				

203 Virulence and transmission trade-offs acting at spillover

204 As we have outlined, theory on the virulence and transmission trade-off is based upon the 205 idea that pathogens will be selected towards an optimal level of virulence within the host 206 populations to which they are adapted (Cressler et al., 2016). Recently emerged zoonotic 207 diseases do not have this evolutionary history with human populations and are therefore unlikely 208 to be at their evolutionary optimum when they first emerge (Guth et al., 2019; Mollentze et al., 209 2020; Woolhouse et al., 2005). However, emerging pathogens may still be regulated by an 210 underlying virulence and transmission trade-off. In meta-analyses of recently emerged viral 211 zoonoses, excessively high virulence is associated with a lower R_0 (Brierley et al., 2016; 212 Geoghegan et al., 2016; Guth et al., 2019) and this negative association supports the theoretical 213 prediction that high virulence impedes pathogen fitness. Theory also predicts a cost to 214 excessively low virulence, an effect that is not supported in these analyses (Anderson & May, 215 1982; Guth et al., 2019). However, this could easily result from discovery bias because we are 216 unlikely to notice low-transmission zoonoses that cause only a few infections and have low 217 virulence (Bonneaud & Longdon, 2020). As such, there is little evidence to not expect emerging 218 diseases to be governed by trade-offs once they emerge into human populations.

219

220 What predicts the virulence of disease when it first gets to humans?

Emerging zoonoses vary widely in their virulence and transmission rates, but there are some pathogen and reservoir host characteristics that are associated with the pathogen's phenotype in humans (Geoghegan et al., 2016; Guth et al., 2019; Olival et al., 2017). In particular, meta-analyses of recently emerged viral zoonoses have supported phylogenetic trends in zoonotic potential (Guth et al., 2019). The phylogenetic distance between a pathogen's reservoir host and humans predicts the pathogen's probability of being zoonotic (Olival et al., 2017), virulence (Guth et al., 2019; Longdon et al., 2015), and R_0 in human populations (Geoghegan et al., 2016; Guth et al., 2019). Mammalian hosts closely related to humans (e.g. primates) harbor
zoonoses associated with lower human mortality and higher capacity for transmission, while more
distantly related hosts (most notably, bats) harbor highly virulent zoonoses that appear to be
relatively maladapted for human-to-human transmission (Guth et al., 2019).

These phylogenetic trends can be understood if pathogens from distantly related reservoir hosts have evolved replication strategies adapted to their reservoir host's more dissimilar immunology, physiology, and ecology (Guth et al., 2019; Mollentze et al., 2020). There may also be host orders with unique features in their biology beyond host dissimilarity that influence pathogen traits in humans (Brook & Dobson, 2015). Specifically, bats seem to harbor unusually virulent viruses (Brook & Dobson, 2015; Guth et al., 2019) which may, in part, result from their high viral tolerance selecting for high replication rates (Brook et al., 2020).

239

240 Transmission mode changes may cause shifts in virulence

241 Zoonotic pathogens often have different virulence in human hosts than in their reservoir 242 hosts (Guth et al., 2019). However, pathogens that alter their transmission modes upon 243 emergence may be expected to have especially large shifts in virulence (Ewald, 1991). Most 244 pathogens have multiple possible modes of transmission, where their primary mode is determined 245 by factors like host social behavior and the environment (Antonovics et al., 2017). Pathogens can 246 undergo immediate shifts in transmission route upon emergence when human behavior promotes 247 the primary use of transmission routes not preferred in their reservoir hosts or when the receptors 248 that they bind to are located in different tissues (Antonovics et al., 2017). This can lead to 249 immediate shifts in virulence due to changes in pathogen inoculum size and anatomical site of 250 infection (Leggett et al., 2012; McMahon et al., 2018). Over longer evolutionary time scales, 251 different transmission pathways may create novel selection pressures on virulence (Ewald, 1991).

Thus, changes in a parasite's dominant mode of transmission during emergence can lead to both immediate changes in and selection pressures for future changes in virulence.

254

255 Virulence and transmission relationships are likely maladapted in emerging pathogens

256 Pathogen virulence and capacity for transmission in humans loosely trade-off in a meta-257 analysis of zoonotic viruses (Guth et al., 2019). Despite this trend, there is a substantial amount 258 of noise in the relationships between virulence and transmission. Some of this noise is likely due 259 to the fundamental complication of predictive evolution that each pathogen will have a unique 260 trade-off curve dependent on the nuances of its biology (Ebert & Bull, 2003). However, entirely 261 maladapted phenotypes also exist below the trade-off curve (Bull & Ebert, 2008; Shoval et al., 262 2012). Simply, novel zoonotic pathogens can be bad at both transmission and virulence. Overall, 263 then, pathogens will vary in virulence and transmission because they have unique trade-off 264 shapes that predict different optimum values and because they can be maladapted below the 265 trade-off.

266 The concept of Pareto fronts describes such scenarios where phenotypes can be in the 267 region of sub-optimal phenotype space below the trade-off front (Shoval et al., 2012). The trade-268 off front (or Pareto front) separates these accessible, maladapted phenotype combinations from 269 impossible, ideal phenotypes (Li et al., 2019; Shoval et al., 2012). In the sub-optimal region below 270 the Pareto front, improvements in one trait may not affect the other trait as simple adaptations 271 can be made before costs are incurred. Applied to virulence evolution, this concept means that 272 recently emerged diseases, even if broadly regulated by trade-offs, may select for no-cost 273 improvements in transmission that do not affect or can actually decrease their virulence (See 274 Figure 3a) (Bull & Ebert, 2008). The relationship between virulence and R_0 in recently emerged 275 zoonotic viruses seems to display such a Pareto front where phenotypes exist below, but not 276 above, a trade-off front (See Figure 3b).

277 For an illustrative example of how virulence and transmission can break trade-offs in 278 maladapted zoonosis, we can use H5N1 as a case study (Wasik et al., 2019). Concern over the 279 pandemic potential of highly pathogenic avian H5N1 influenza A led to two experimental evolution 280 studies examining the virus's ability to evolve respiratory droplet transmission in a ferret model 281 system (Herfst et al., 2012; Imai et al., 2012). Both studies found that the virus could evolve 282 respiratory droplet transmission, which would increase its transmission rate. However, this higher 283 transmission rate actually correlated with substantial decreases in virulence (Herfst et al., 2012; 284 Imai et al., 2012). This was because avian influenzas recognize a sialic acid (Siaα2,3Gal) that is 285 found in ferrets' (and humans') lower respiratory tracts while human influenzas recognize a sialic 286 acid (Sia α 2,6Gal) found in the upper respiratory tract (Herfst et al., 2012). In the lab, H5N1 was 287 able to evolve Siaa2,6Gal recognition and localize to the upper respiratory tract tissues that 288 allowed for droplet transmission. This change in replication site led to more efficient transmission, 289 but also lower host mortality despite no selection against virulence in the experiment (Herfst et 290 al., 2012; Imai et al., 2012). Notably for our understanding of the virulence and transmission 291 trade-off, these changes were dependent on changes in replication site, not replication rate. In 292 some sense, these no-cost transmission improvements could only happen because the virus was 293 so maladapted to mammalian hosts that it was using suboptimal binding sites. After these no-cost 294 adaptations brought the virus to the Pareto front, further adaptation would have to involve changes 295 to transmission and virulence that trade-off with each other through processes like replication 296 rates.



Figure 3a. Conceptual Diagram of the Pareto front between virulence and transmission. Possible phenotypes can be selected to improve transmission along any pathway within the accessible phenotype space. Since each pathogen's function determining their virulence and transmission trade-off varies, we cannot know where a hypothetical phenotype sits below the Pareto front. Selection for improved transmission can therefore involve decreases, no changes, or increases in virulence depending on the pathogen's starting point and mutational availability.

Figure 3b. Recently emerged viral zoonoses follow a Pareto front of virulence and reproductive capacity. Data is from a published dataset of recently emerged viral zoonoses from mammalian hosts (Guth et al. 2019). Approximate R0 is classified from 1 (no recorded human to human transmission) to 4 (endemic transmission) and adjusted by virus family and number of citations. Case fatality rate is adjusted by virus family and number of citations. Dots represent adjusted CFR and R0 values for individual epidemics of different viral zoonoses.

- 298
- 299

300 Do we expect to see adaptive evolution of transmission and virulence in recently

301 emerged diseases?

302 While there are certainly selection pressures on recently emerged zoonotic pathogens, 303 this does not necessarily mean that there will be adaptive evolution (Grubaugh, Petrone, et al., 304 2020; MacLean et al., 2020). A key tenant of evolutionary theory is that selection pressures must 305 act through a background of stochasticity and drift to result in adaptive evolution (Crow & Kimura, 306 2009). As small population sizes mean that both stochasticity and drift are relatively strong, the 307 inevitably small population of infected individuals at the start of an epidemic means that these 308 factors are likely to overwhelm selection and determine the spread of mutants (Hartl & Clark, 309 1997).

Stochastic effects are additionally exasperated by the existence of founder effects during epidemic range expansions resulting in spatial stochasticity analogous to genetic drift (Slatkin & Excoffier, 2012). Thus, founder effects and variation in transmission due to host behavior and stochasticity likely determine the fate of mutants at the start of epidemics (MacLean et al., 2020). However, as the population size of infected individuals increases or if there are mutations of large enough effect size, the balance between selection and stochasticity may shift towards selection and result in adaptive evolution.

317 Finally, the adaptive evolution of acute, respiratory pathogens may additionally be 318 constrained by the small bottleneck sizes of transmission events, which also increase 319 stochasticity (McCrone et al., 2018; McCrone & Lauring, 2018). The normally short infectious 320 periods of acute diseases mean that only limited amounts of mutation and selection can occur 321 before transmission. Small bottleneck sizes mean that only a few genetic variants are transmitted. 322 Together, these factors mean that it is less likely for an acute, respiratory virus to have enough 323 time within a host to generate adaptive mutations and select on those variants strongly enough 324 for them to reach high enough frequencies to transmit through tight bottlenecks to other 325 individuals (McCrone et al., 2018). This can impede adaptive evolution at the population level 326 (Morris et al., 2020). This may mean that individuals with chronic infections are especially 327 important for adaptive evolution in acute, respiratory pathogens as they have longer infectious 328 periods that allow for the fixation of beneficial mutations (Rambaut et al., 2020; Xue et al., 2017).

329

What are the selective pressures on transmission and virulence in recently emergeddiseases?

332 Standard eco-evolutionary theory assumes that ecological and evolutionary time scales 333 are decoupled such that ecological equilibrium is reached before new mutants invade (Metz et 334 al., 1995). Epidemics are definitionally not at ecological equilibrium and high mutation rates mean

that new variants are likely to arise early in epidemics (Bull & Ebert, 2008). Therefore, the assumptions of decoupled timescales must be relaxed to examine how selection pressures on virulence and transmission change over the course of an epidemic (Lenski & May, 1994).

338

339 Selection on virulence and transmission during epidemics

340 Selection pressures on virulence and transmission during epidemics can be explored by 341 using models that do not assume separation of time scales, often using population genetic 342 approaches (Bolker et al., 2010; Bull & Ebert, 2008; Day & Gandon, 2007; Day & Proulx, 2004; 343 Lenski & May, 1994). These models allow for the existence of multiple simultaneous mutants so 344 that the competitive fitness of each can be assessed over shifting ecological conditions in time. 345 They show that strategies with higher transmission rates (betas) and virulence can be selected 346 during epidemic growth stages, despite R₀ optimized (intermediate virulence) strategies 347 dominating at endemic equilibrium (Day & Proulx, 2004; Lenski & May, 1994). This is because 348 strategies with higher transmission rates spread fastest at the start of the epidemic when the 349 density of susceptible hosts is high (Day & Proulx, 2004; Lenski & May, 1994).

350 Intuitively, these results can be explained as: an infected host during the early stages of 351 an epidemic encounters mostly susceptible hosts, so strains with higher transmission rates will 352 have faster population growth rates since they have shorter generation times than strains with 353 higher R_0s (but lower transmission rates) that produce more secondary infections more slowly 354 over a longer infectious period. Therefore, improvements in transmission rate are the most 355 important at the start of an epidemic and can be selected for even if they increase virulence. This 356 also demonstrates that the high density of susceptible hosts early in epidemics crucially influences 357 selection pressures (Bull & Ebert, 2008; Cressler et al., 2016; Day & Proulx, 2004; Lenski & May, 358 1994).

360 Selection on virulence and transmission in structured populations

361 Simple virulence evolution trade-off theory assumes that transmission happens randomly 362 in a homogeneously mixing population (Cressler et al., 2016). However, natural populations 363 almost always have heterogeneous mixing patterns due to spatial structure and social networks 364 (Boots & Sasaki, 1999; van Baalen, 2002). In these structured populations, transmission mostly 365 happens between neighboring individuals. This can lead to 'self-shading' where highly infectious 366 strains rapidly deplete their local susceptible populations and compete for available hosts with 367 related strains (Boots & Sasaki, 1999; Boots & Sasaki, 2000; Lion & Boots, 2010). Both these 368 components of 'self-shading', the ecological clustering of infected individuals and the genetic 369 clustering of related strains, slow the rate of spread of highly infectious strains. On the other hand, 370 less infectious strains maintain higher local densities of susceptible individuals and have higher 371 onward transmission (Boots & Sasaki, 1999; Boots & Sasaki, 2000; Lion & Boots, 2010). Thus, 372 structured host populations select for lower pathogen infectivity and virulence at endemic 373 equilibrium.

374 However, the high availability of susceptible hosts at the start of an epidemic is likely to 375 reduce the impact of self-shading. Instead, we see that pathogens need to have higher 376 transmission rates to seed an epidemic in a spatially structured population than in a well-mixed 377 one (Keeling, 1999). Before ecological equilibrium, the invasion front of a spatially structured 378 epidemic also has a high local supply of susceptible hosts. This leads to a dynamic where virulent, 379 high beta strains are selected at the invasion front and then are succeeded by more prudent 380 strategies as the local dynamics approach equilibrium (Griette et al., 2015; Lion & Gandon, 2016). 381 Overall then, it is possible that structure in host populations temporarily selects for higher 382 virulence while the epidemic is spreading through mostly susceptible populations. However, if 383 there are also trade-offs where high virulence impedes host movement, then the spatial front of

the epidemic might instead have lower virulence (Hawley et al., 2013; Osnas et al., 2015). As
such, it is unclear how population structure and movement overall will select emerging pathogens.

387 Selection on virulence with environmental transmission

388 Simple virulence evolution trade-off theory assumes that pathogens only transmit by direct 389 contact between hosts. However, many pathogens also transmit through the environment 390 (Bonhoeffer et al., 1996; Ewald, 1983; Gandon, 1998; Kamo & Boots, 2004). The 'curse of the 391 pharaoh' hypothesis suggested that parasites can have higher virulence when they transmit 392 through the environment because transmission is not linked to the host's infectious period (Ewald, 393 1983). However, at ecological equilibrium, environmental transmission can select for higher 394 virulence only if hosts can be multiply infected or if transmission can happen from environmental 395 pools after host death (Day, 2002; Day & Gandon, 2006; Gandon, 1998). Propagule survival in 396 spatially structured populations may actually increase self-shading and select for even lower 397 virulence (Kamo & Boots, 2004).

398 Importantly, environmental transmission also selects for higher virulence during the 399 epidemic stage if propagule dynamics are faster than host dynamics (Bonhoeffer et al., 1996). 400 This result holds even if hosts are singly infected and do not transmit after death because it 401 instead relates to the relative speed of pathogen population growth rates (Bonhoeffer et al., 1996; 402 Lenski & May, 1994). Under 'curse of the pharaoh', more virulent strategies with shorter infectious 403 periods will be more represented in the environmental reservoir and will therefore have higher 404 population growth rates when the susceptible density is high. Overall then, it is likely that 405 environmental transmission will select for higher virulence in epidemics (Bonhoeffer et al., 1996; 406 Day, 2002; Day & Gandon, 2006; Ewald, 1983; Gandon, 1998). However, it can be costly to make 407 environmentally persistent particles if they require more host resources or impede attachment to 408 host cells (Ogbunugafor et al., 2013). This can alter the dynamics of 'curse of the pharaoh' models

409 and potentially lead to bistability or branching resulting in sudden shifts and diversity in virulence
410 (Boldin & Kisdi, 2012; Caraco & Wang, 2008; Roche et al., 2011).

411

412 Selection on virulence with antigenic escape

413 Finally, simple virulence evolution trade-off theory assumes that recovered hosts are fully 414 immune such that host immunity does not wane and pathogens do not evolve to escape such 415 immunity. However, some, but not all, viral pathogens exhibit antigenic evolution to escape 416 neutralizing antibodies conferred by previous infections or vaccines (Drexler et al., 2014; Kennedy 417 & Read, 2017; Mclean, 1998; Rambaut et al., 2008; Wong et al., 2017). Notably though, selection 418 for antigenic or vaccine escape evolution is significantly slower and less efficient than for drug 419 resistance – likely due to differences in the timing and breadth of selective pressures (Debbink et 420 al., 2017; Kennedy & Read, 2017; Morris et al., 2020). When antigenic escape occurs, however, 421 it means that recovered individuals are newly susceptible to evolved strains and essentially 422 'resets' the timescale of an epidemic by replenishing the density of susceptible hosts. This effect 423 had been postulated to transiently select for transmission-maximizing strategies with higher 424 virulence (Bull & Ebert, 2008), but has recently been shown to select for the long term persistence 425 of more acute, highly transmissible and virulent pathogens (Sasaki et al., 2021). However, the 426 mutations conferring antigenic escape likely trade-off with other pathogen traits like receptor 427 binding avidity, folding, and expression and therefore may constrain the possible virulence and 428 transmission phenotypes for such mutants (Greaney et al., 2020; Hensley et al., 2009).

429

430 Other factors shaping selection on virulence

431 Many other factors influence the evolution of virulence and have been reviewed elsewhere 432 (Cressler et al., 2016). In brief, multiple infection or co-infection may select for more virulent 433 pathogens due to within-host competition for resources (Alizon & van Baalen, 2008). Host

demographic features like immigration and density dependent mortality or fecundity may also alter
selection on virulence (Cressler et al., 2016). Additionally, host heterogeneities like age (Iritani et
al., 2019), genetic diversity (Osnas & Dobson, 2012; Regoes et al., 2000), and resistance
(Gandon, 2004) may select for virulence optimized on certain types of host.

438

439 How might public health measures shape selection on virulence?

440 The guestion of whether public health measures can purposely or inadvertently drive 441 pathogen evolution naturally arises when discussing virulence evolution. It is likely to be very 442 difficult to purposefully manage virulence evolution because it is so difficult to fully predict (Ebert 443 & Bull, 2003). For one, zoonotic pathogens can evolve in unpredictable ways if they start below 444 the Pareto front of the virulence and transmission trade-off. Additionally, selection pressures on 445 virulence are dependent on trade-offs that vary for each disease and moreover host population 446 characteristics that change rapidly. Finally, as we have discussed, selection pressures on 447 virulence are likely to be weak compared to stochastic effects at the start of epidemics.

Public health measures intentionally driving the evolution of virulence may therefore be quixotic fantasies for emerging diseases. However, we can gain insight into how public health measures can inadvertently select on virulence. Non-pharmaceutical public health interventions for epidemics primarily aim to decrease transmission and therefore either stop the epidemic or slow it until vaccines and treatments can be developed (Lai et al., 2020). This decreases the total number of infected individuals, which will have the greatest impact on the total mortality burden of any epidemic (Day et al., 2020).

However, some of these interventions may also contribute to the selection pressures acting on the pathogen (Day et al., 2020; Ebert & Bull, 2003). First, increased environmental sanitation raises the propagule death rate in the environment, thus potentially selecting for lower pathogen virulence under the 'curse of the pharaoh' hypothesis (Bonhoeffer et al., 1996). Second,

decreased travel and extra-household contacts should alter the spatial and social structure of the population to make a more structured transmission network (Boots & Sasaki, 1999). Third, quarantine of symptomatic individuals may select for decreased or altered symptoms (Knell, 2004; Saad-Roy et al., 2020). Finally, vaccines can sometimes create selection pressures on pathogens with potential evolutionary impacts to consider (Kennedy & Read, 2020). However, recent models have explored potential vaccine induced selection for proposed Sars-CoV-2 vaccines and suggest that they are unlikely to select for higher virulence (Miller & Metcalf, 2020).

466 While the most human mortality will be prevented by simply preventing transmission, 467 considering the effects of control measures on virulence evolution can, in principle, lead to better 468 epidemic management (Day et al., 2020). Understanding host population characteristics creating 469 strong selection pressures for high transmission strategies could help distribute public health 470 effort if there are limited resources (Day et al., 2020). Importantly, weak epidemic control 471 measures that allow for extended transmission in humans increase the evolutionary potential of 472 zoonotic pathogens because they allow for stronger selection pressures and more mutations (Day 473 et al., 2020). Thus, the best evolutionary management practice for an epidemic of a zoonotic 474 infectious disease would be to suppress transmission using strong, rapid public health 475 interventions.

476

Box 3. Future Research Questions

There are several gaps in our understanding of the patterns and predictors of virulence evolution that require interdisciplinary, integrative approaches across often siloed subfields.

 What are the costs to transmission in human populations? Human pathogens are fairly rarely limited by host mortality, so models that purely define virulence as 'the additional mortality rate due to infection' are often inappropriate for virulence evolution in human populations. This gap is currently hindering the uptake of trade-off theory amongst applied virology and medical fields (Bull & Lauring, 2014) and several other trade-offs like time to recovery and sickness behavior may be more applicable for most human pathogens (Alizon, 2008; Anderson & May, 1982; Ewald, 1994). Effort should be put towards determining the empirical evidence for such trade-offs and exploring their consequences for evolutionary theory.

- What is the distribution of mutational fitness effects for pathogen traits like transmission and virulence in emerging zoonotic diseases and what are their trade-offs (or lack thereof)? Many studies of mutational fitness effects use simple metrics of fitness that do not capture how different components of fitness may trade-off (Sanjuán, 2010; Visher et al., 2016), but see (Greaney et al., 2020). Unmeasured evolutionary constraints and trade-offs may alter the distribution of mutational fitness effects outside of simple laboratory conditions (Visher & Boots, 2020). As selection may act on different fitness components differently at various time scales, being able to disentangle their relative contributions is important to build stronger predictive theory.
- How do selection pressures and their strengths relative to stochasticity vary across within host, between host, and population level scales? Many models do not include the heterogeneous selection pressures that arise from changes in pathogen population sizes at transmission, infection progression across tissues, temporally varying immune pressures, and heterogeneous hosts (Visher & Boots, 2020). Models that include these nuanced empirical circumstances can sometimes better describe population level evolutionary dynamics (Mideo et al., 2008; Morris et al., 2020; Ogbunugafor et al., 2010).

478 Conclusion

479 Novel zoonotic pathogens emerge into the human population maladapted to human hosts 480 and, although it is difficult to predict their emergence, pathogen and reservoir host traits can 481 loosely predict their virulence and transmission phenotypes (Guth et al., 2019; Olival et al., 2017). 482 Broadly, virulence is thought to trade-off with transmission leading to an optimal, intermediate 483 level of both. However, maladapted virulence and transmission phenotypes may start below the 484 Pareto front, so selection for transmission can have decoupled effects on virulence (Bull & Ebert, 485 2008). Selection pressures on pathogens are weak compared to drift during the highly stochastic 486 early epidemic period, but can become relevant if epidemic control fails and extended 487 transmission occurs (Hartl & Clark, 1997). A nuanced body of theory describes the selection 488 pressures acting on pathogen transmission and virulence (Cressler et al., 2016). These selection 489 pressures follow the three Ts-trade-offs, transmission, and time scales. Trade-offs between 490 traits mean that pathogens are selected to balance the benefits of transmission with the costs of 491 virulence, but the relative balance depends on the time scale of the epidemic (Anderson & May, 492 1982; Bull & Ebert, 2008). When the density of susceptible hosts is high early in the epidemic, 493 pathogens are selected for higher transmission rates even if they trade-off with higher virulence 494 (Bull & Ebert, 2008; Lenski & May, 1994). To predict how a pathogen's virulence will evolve then, 495 we must understand the fitness impacts and trade-offs of transmission-improving mutations and 496 the population structure of the host (Day et al., 2020). This makes virulence evolution an 497 academically interesting topic with a rich body of theory surrounding it, but no universal 498 predictions (Ebert & Bull, 2003). However, this will not be a problem if strong, rapid public health 499 measures suppress transmission early on since this will both decrease the evolutionary potential 500 of such pathogens and decrease the total mortality burden by limiting the number of people 501 infected.

503	Acknowledgements
504	We would like to thank members of the Boots lab for helpful discussions. We would also like to
505	thank the many virologists and evolutionary biologists on twitter whose threads on viral evolution
506	helped shaped this paper.
507	
508	Author Contributions
509	All authors researched and edited the paper. EV and MB conceptualized and wrote the paper.
510	
511	Data accessibility
512	No novel data is used in this manuscript; data used is publicly available from (Guth et al., 2019).
513	The annotated R script used for analysis is in the supplementary materials.
514	
515	Funding
516	EV, SG, and NAS acknowledge funding from NSF GRFP DGE 1752814 grants. EV and MN
517	acknowledge funding from the UC Berkeley SURF-SMART program. EV acknowledges funding
518	from the Philomathia Foundation Graduate Student Fellowship in the Environmental Sciences.
519	EV and MB acknowledge funding from NSF DEB 2011109. CR and MB acknowledges funding
520	from NIH/R01-GM122061-03.
521	
522	Competing Interests
523	We declare no competing interests.
524 525	
525 526	
527 528	
529	
550	

531 Works Cited 532

- Acevedo, M. A., Dillemuth, F. P., Flick, A. J., Faldyn, M. J., & Elderd, B. D. (2019). Virulencedriven trade-offs in disease transmission: A meta-analysis*. *Evolution*, *73*(4), 636–647.
 https://doi.org/10.1111/evo.13692
- Alizon, S., Hurford, A., Mideo, N., & Baalen, M. V. (2009). Virulence evolution and the trade-off
 hypothesis: History, current state of affairs and the future. *Journal of Evolutionary Biology*, 22(2), 245–259. https://doi.org/10.1111/j.1420-9101.2008.01658.x
- Alizon, Samuel. (2008). Transmission-Recovery Trade-Offs to Study Parasite Evolution. *The American Naturalist*, *172*(3), E113–E121. https://doi.org/10.1086/589892
- Alizon, Samuel, & van Baalen, M. (2008). Multiple Infections, Immune Dynamics, and the
 Evolution of Virulence. *The American Naturalist*, 172(4), E150–E168.
 https://doi.org/10.1086/590958
- 544Anderson, R. M., & May, R. M. (1982). Coevolution of hosts and parasites. *Parasitology*, 85(2),545411–426. https://doi.org/10.1017/S0031182000055360
- Antonovics, J., Wilson, A. J., Forbes, M. R., Hauffe, H. C., Kallio, E. R., Leggett, H. C., Longdon, B.,
 Okamura, B., Sait, S. M., & Webster, J. P. (2017). The evolution of transmission mode. *Philosophical Transactions of the Royal Society B: Biological Sciences*, 372(1719),
 20160083. https://doi.org/10.1098/rstb.2016.0083
- Atkins, K. E., Read, A. F., Savill, N. J., Renz, K. G., Islam, A. F., Walkden-Brown, S. W., &
 Woolhouse, M. E. J. (2013). Vaccination and Reduced Cohort Duration Can Drive
 Virulence Evolution: Marek's Disease Virus and Industrialized Agriculture. *Evolution*,
 67(3), 851–860. https://doi.org/10.1111/j.1558-5646.2012.01803.x
- Barber, S. (2020). Death by racism. *The Lancet Infectious Diseases, 20*(8), 903.
- 555 https://doi.org/10.1016/S1473-3099(20)30567-3
- 556Berngruber, T. W., Froissart, R., Choisy, M., & Gandon, S. (2013). Evolution of Virulence in557Emerging Epidemics. PLOS Pathogens, 9(3), e1003209.
- 558 https://doi.org/10.1371/journal.ppat.1003209
- Berngruber, T. W., Lion, S., & Gandon, S. (2015). Spatial Structure, Transmission Modes and the
 Evolution of Viral Exploitation Strategies. *PLOS Pathogens*, *11*(4), e1004810.
 https://doi.org/10.1371/journal.ppat.1004810
- Boldin, B., & Kisdi, É. (2012). On the evolutionary dynamics of pathogens with direct and
 environmental transmission. *Evolution*, 66(8), 2514–2527.
 https://doi.org/10.1111/j.1558-5646.2012.01613.x
- 565Bolker, B. M., Nanda, A., & Shah, D. (2010). Transient virulence of emerging pathogens. Journal566of The Royal Society Interface, 7(46), 811–822. https://doi.org/10.1098/rsif.2009.0384
- Bonhoeffer, S., Lenski, R. E., & Ebert, D. (1996). The curse of the pharaoh: The evolution of
 virulence in pathogens with long living propagules. *Proceedings of the Royal Society of London. Series B: Biological Sciences, 263*(1371), 715–721.
- 570 https://doi.org/10.1098/rspb.1996.0107
- 571Bonneaud, C., & Longdon, B. (2020). Emerging pathogen evolution. EMBO Reports, 21(9),572e51374. https://doi.org/10.15252/embr.202051374

573 Bonneaud, C., Tardy, L., Hill, G. E., McGraw, K. J., Wilson, A. J., & Giraudeau, M. (2020). 574 Experimental evidence for stabilizing selection on virulence in a bacterial pathogen. 575 Evolution Letters, n/a(n/a). https://doi.org/10.1002/evl3.203 576 Boots, M, & Sasaki, A. (1999). "Small worlds" and the evolution of virulence: Infection occurs 577 locally and at a distance. Proceedings of the Royal Society B: Biological Sciences, 578 266(1432), 1933–1938. 579 Boots, M., & Sasaki, A. (2000). The evolutionary dynamics of local infection and global 580 reproduction in host-parasite interactions. *Ecology Letters*, 3(3), 181–185. 581 Boots, Michael, & Mealor, M. (2007). Local Interactions Select for Lower Pathogen Infectivity. 582 Science, 315(5816), 1284–1286. https://doi.org/10.1126/science.1137126 583 Brierley, L., Vonhof, M. J., Olival, K. J., Daszak, P., & Jones, K. E. (2016). Quantifying Global 584 Drivers of Zoonotic Bat Viruses: A Process-Based Perspective. The American Naturalist, 585 187(2), E53-64. https://doi.org/10.1086/684391 586 Brook, C. E., Boots, M., Chandran, K., Dobson, A. P., Drosten, C., Graham, A. L., Grenfell, B. T., 587 Müller, M. A., Ng, M., Wang, L.-F., & van Leeuwen, A. (2020). Accelerated viral dynamics 588 in bat cell lines, with implications for zoonotic emergence. *ELife*, 9, e48401. 589 https://doi.org/10.7554/eLife.48401 590 Brook, C. E., & Dobson, A. P. (2015). Bats as 'special' reservoirs for emerging zoonotic 591 pathogens. Trends in Microbiology, 23(3), 172–180. 592 https://doi.org/10.1016/j.tim.2014.12.004 593 Bull, J. J., & Ebert, D. (2008). Invasion thresholds and the evolution of nonequilibrium virulence. 594 Evolutionary Applications, 1(1), 172–182. https://doi.org/10.1111/j.1752-595 4571.2007.00003.x 596 Bull, J. J., & Lauring, A. S. (2014). Theory and Empiricism in Virulence Evolution. PLOS 597 Pathogens, 10(10), e1004387. https://doi.org/10.1371/journal.ppat.1004387 598 Caraco, T., & Wang, I.-N. (2008). Free-living pathogens: Life-history constraints and strain 599 competition. Journal of Theoretical Biology, 250(3), 569-579. 600 https://doi.org/10.1016/j.jtbi.2007.10.029 601 Cressler, C. E., McLeod, D. V., Rozins, C., Van Den Hoogen, J., & Day, T. (2016). The adaptive 602 evolution of virulence: A review of theoretical predictions and empirical tests. 603 Parasitology, 143(7), 915–930. https://doi.org/10.1017/S003118201500092X 604 Crow, J. F., & Kimura, M. (2009). An Introduction to Population Genetics Theory. Blackburn 605 Press. 606 Davies, N. G., Barnard, R. C., Jarvis, C. I., Kucharski, A. J., Munday, J., Pearson, C. A. B., Russell, T. 607 W., Tully, D. C., Abbott, S., Gimma, A., Waites, W., Wong, K. L., Zandvoort, K. van, Group, 608 C. C.-19 W., Eggo, R. M., Funk, S., Jit, M., Atkins, K. E., & Edmunds, W. J. (2020). 609 Estimated transmissibility and severity of novel SARS-CoV-2 Variant of Concern 610 202012/01 in England. MedRxiv, 2020.12.24.20248822. 611 https://doi.org/10.1101/2020.12.24.20248822 612 Davis, B. D., Dulbecco, R., & Eisen, H. N. (1990). Microbiology. Lippincott. 613 Day, T. (2002). Virulence evolution via host exploitation and toxin production in spore-614 producing pathogens. Ecology Letters, 5(4), 471–476. https://doi.org/10.1046/j.1461-615 0248.2002.00342.x

616 Day, T., & Gandon, S. (2006). Insights From Price's Equation into Evolutionary Epidemiology. In 617 Z. Feng, U. Dieckmann, & S. A. Levin (Eds.), Disease Evolution: Models, Concepts, and 618 Data Analyses (Vol. 13). American Mathematical Soc. 619 Day, T., & Gandon, S. (2007). Applying population-genetic models in theoretical evolutionary 620 epidemiology. Ecology Letters, 10(10), 876-888. https://doi.org/10.1111/j.1461-621 0248.2007.01091.x 622 Day, T., Gandon, S., Lion, S., & Otto, S. P. (2020). On the evolutionary epidemiology of SARS-623 CoV-2. Current Biology, 30(15), R849–R857. https://doi.org/10.1016/j.cub.2020.06.031 624 Day, T., & Proulx, S. R. (2004). A General Theory for the Evolutionary Dynamics of Virulence. The 625 American Naturalist, 163(4), E40–E63. https://doi.org/10.1086/382548 626 Debbink, K., McCrone, J. T., Petrie, J. G., Truscon, R., Johnson, E., Mantlo, E. K., Monto, A. S., & 627 Lauring, A. S. (2017). Vaccination has minimal impact on the intrahost diversity of H3N2 628 influenza viruses. PLOS Pathogens, 13(1), e1006194. 629 https://doi.org/10.1371/journal.ppat.1006194 630 Diehl, W. E., Lin, A. E., Grubaugh, N. D., Carvalho, L. M., Kim, K., Kyawe, P. P., McCauley, S. M., 631 Donnard, E., Kucukural, A., McDonel, P., Schaffner, S. F., Garber, M., Rambaut, A., 632 Andersen, K. G., Sabeti, P. C., & Luban, J. (2016). Ebola Virus Glycoprotein with Increased 633 Infectivity Dominated the 2013–2016 Epidemic. Cell, 167(4), 1088-1098.e6. 634 https://doi.org/10.1016/j.cell.2016.10.014 635 Doumayrou, J., Avellan, A., Froissart, R., & Michalakis, Y. (2013). An Experimental Test of the 636 Transmission-Virulence Trade-Off Hypothesis in a Plant Virus. Evolution, 67(2), 477–486. 637 https://doi.org/10.1111/j.1558-5646.2012.01780.x 638 Drexler, J. F., Grard, G., Lukashev, A. N., Kozlovskaya, L. I., Böttcher, S., Uslu, G., Reimerink, J., 639 Gmyl, A. P., Taty-Taty, R., Lekana-Douki, S. E., Nkoghe, D., Eis-Hübinger, A. M., Diedrich, 640 S., Koopmans, M., Leroy, E. M., & Drosten, C. (2014). Robustness against serum 641 neutralization of a poliovirus type 1 from a lethal epidemic of poliomyelitis in the 642 Republic of Congo in 2010. Proceedings of the National Academy of Sciences, 111(35), 643 12889–12894. https://doi.org/10.1073/pnas.1323502111 644 Ebert, D., & Bull, J. J. (2003). Challenging the trade-off model for the evolution of virulence: Is 645 virulence management feasible? Trends in Microbiology, 11(1), 15–20. 646 https://doi.org/10.1016/S0966-842X(02)00003-3 647 Ewald, P. W. (1983). Host-Parasite Relations, Vectors, and the Evolution of Disease Severity. 648 Annual Review of Ecology and Systematics, 14, 465–485. JSTOR. 649 Ewald, P. W. (1991). Transmission modes and the evolution of virulence. *Human Nature*, 2(1), 650 1-30. https://doi.org/10.1007/BF02692179 651 Ewald, P. W. (1994). Evolution of Infectious Disease. Oxford University Press. 652 Fenner, F., & Ratcliffe, F. N. (1965). Myxomatosis. Myxomatosis. 653 https://www.cabdirect.org/cabdirect/abstract/19662202443 654 Frank, S. A. (1996). Models of Parasite Virulence. The Quarterly Review of Biology, 71(1), 37–78. 655 https://doi.org/10.1086/419267 656 Fraser, C., Hollingsworth, T. D., Chapman, R., de Wolf, F., & Hanage, W. P. (2007). Variation in 657 HIV-1 set-point viral load: Epidemiological analysis and an evolutionary hypothesis. 658 Proceedings of the National Academy of Sciences, 104(44), 17441–17446. 659 https://doi.org/10.1073/pnas.0708559104

660 Gandon, S. (1998). The curse of the pharaoh hypothesis. Proceedings of the Royal Society B: 661 Biological Sciences, 265(1405), 1545–1552. 662 Gandon, Sylvain. (2004). EVOLUTION OF MULTIHOST PARASITES. Evolution, 58(3), 455–469. 663 https://doi.org/10.1111/j.0014-3820.2004.tb01669.x 664 Geoghegan, J. L., & Holmes, E. C. (2017). Predicting virus emergence amid evolutionary noise. 665 Open Biology, 7(10), 170189. https://doi.org/10.1098/rsob.170189 666 Geoghegan, J. L., & Holmes, E. C. (2018). The phylogenomics of evolving virus virulence. *Nature* 667 Reviews Genetics, 19(12), 756-769. https://doi.org/10.1038/s41576-018-0055-5 668 Geoghegan, J. L., Senior, A. M., Giallonardo, F. D., & Holmes, E. C. (2016). Virological factors that 669 increase the transmissibility of emerging human viruses. Proceedings of the National 670 Academy of Sciences, 113(15), 4170-4175. https://doi.org/10.1073/pnas.1521582113 671 Greaney, A. J., Starr, T. N., Gilchuk, P., Zost, S. J., Binshtein, E., Loes, A. N., Hilton, S. K., 672 Huddleston, J., Eguia, R., Crawford, K. H. D., Dingens, A. S., Nargi, R. S., Sutton, R. E., 673 Suryadevara, N., Rothlauf, P. W., Liu, Z., Whelan, S. P. J., Carnahan, R. H., Crowe, J. E., & 674 Bloom, J. D. (2020). Complete Mapping of Mutations to the SARS-CoV-2 Spike Receptor-675 Binding Domain that Escape Antibody Recognition. Cell Host & Microbe. 676 https://doi.org/10.1016/j.chom.2020.11.007 677 Griette, Q., Raoul, G., & Gandon, S. (2015). Virulence evolution at the front line of spreading 678 epidemics. Evolution, 69(11), 2810–2819. https://doi.org/10.1111/evo.12781 679 Grubaugh, N. D., Hanage, W. P., & Rasmussen, A. L. (2020). Making Sense of Mutation: What 680 D614G Means for the COVID-19 Pandemic Remains Unclear. Cell, 182(4), 794–795. 681 https://doi.org/10.1016/j.cell.2020.06.040 682 Grubaugh, N. D., Petrone, M. E., & Holmes, E. C. (2020). We shouldn't worry when a virus 683 mutates during disease outbreaks. Nature Microbiology, 5(4), 529–530. 684 https://doi.org/10.1038/s41564-020-0690-4 685 Guth, S., Visher, E., Boots, M., & Brook, C. E. (2019). Host phylogenetic distance drives trends in 686 virus virulence and transmissibility across the animal-human interface. Philosophical 687 Transactions of the Royal Society B: Biological Sciences, 374(1782), 20190296. 688 https://doi.org/10.1098/rstb.2019.0296 Hartl, D. L., & Clark, A. G. (1997). Principles of population genetics (Vol. 116). Sinauer associates. 689 690 Hawley, D. M., Osnas, E. E., Dobson, A. P., Hochachka, W. M., Ley, D. H., & Dhondt, A. A. (2013). 691 Parallel Patterns of Increased Virulence in a Recently Emerged Wildlife Pathogen. PLOS 692 *Biology*, 11(5), e1001570. https://doi.org/10.1371/journal.pbio.1001570 693 Hensley, S. E., Das, S. R., Bailey, A. L., Schmidt, L. M., Hickman, H. D., Jayaraman, A., 694 Viswanathan, K., Raman, R., Sasisekharan, R., Bennink, J. R., & Yewdell, J. W. (2009). 695 Hemagglutinin Receptor Binding Avidity Drives Influenza A Virus Antigenic Drift. Science, 696 326(5953), 734–736. https://doi.org/10.1126/science.1178258 697 Herfst, S., Schrauwen, E. J. A., Linster, M., Chutinimitkul, S., de Wit, E., Munster, V. J., Sorrell, E. 698 M., Bestebroer, T. M., Burke, D. F., Smith, D. J., Rimmelzwaan, G. F., Osterhaus, A. D. M. 699 E., & Fouchier, R. A. M. (2012). Airborne transmission of influenza A/H5N1 virus 700 between ferrets. Science (New York, N.Y.), 336(6088), 1534–1541. 701 https://doi.org/10.1126/science.1213362 702 Holmes, E. C., Rambaut, A., & Andersen, K. G. (2018). Pandemics: Spend on surveillance, not 703 prediction. Nature, 558(7709), 180-182. https://doi.org/10.1038/d41586-018-05373-w

704 Hou, Y. J., Chiba, S., Halfmann, P., Ehre, C., Kuroda, M., Dinnon, K. H., Leist, S. R., Schäfer, A., 705 Nakajima, N., Takahashi, K., Lee, R. E., Mascenik, T. M., Graham, R., Edwards, C. E., Tse, 706 L. V., Okuda, K., Markmann, A. J., Bartelt, L., Silva, A. de, ... Baric, R. S. (2020). SARS-CoV-707 2 D614G variant exhibits efficient replication ex vivo and transmission in vivo. Science. 708 https://doi.org/10.1126/science.abe8499 709 Imai, M., Watanabe, T., Hatta, M., Das, S. C., Ozawa, M., Shinya, K., Zhong, G., Hanson, A., 710 Katsura, H., Watanabe, S., Li, C., Kawakami, E., Yamada, S., Kiso, M., Suzuki, Y., Maher, E. 711 A., Neumann, G., & Kawaoka, Y. (2012). Experimental adaptation of an influenza H5 HA 712 confers respiratory droplet transmission to a reassortant H5 HA/H1N1 virus in ferrets. 713 Nature, 486(7403), 420–428. https://doi.org/10.1038/nature10831 714 Iritani, R., Visher, E., & Boots, M. (2019). The evolution of stage-specific virulence: Differential 715 selection of parasites in juveniles. Evolution Letters, 3(2), 162–172. 716 https://doi.org/10.1002/evl3.105 717 Jensen, K. H., Little, T., Skorping, A., & Ebert, D. (2006). Empirical Support for Optimal Virulence 718 in a Castrating Parasite. PLOS Biology, 4(7), e197. 719 https://doi.org/10.1371/journal.pbio.0040197 720 Kamo, M., & Boots, M. (2004). The curse of the pharaoh in space: Free-living infectious stages 721 and the evolution of virulence in spatially explicit populations. Journal of Theoretical 722 *Biology*, 231(3), 435–441. https://doi.org/10.1016/j.jtbi.2004.07.005 723 Keeling, M. J. (1999). The effects of local spatial structure on epidemiological invasions. 724 Proceedings of the Royal Society of London. Series B: Biological Sciences, 266(1421), 725 859-867. https://doi.org/10.1098/rspb.1999.0716 726 Kennedy, D. A., & Read, A. F. (2017). Why does drug resistance readily evolve but vaccine 727 resistance does not? Proceedings of the Royal Society B: Biological Sciences, 284(1851), 728 20162562. https://doi.org/10.1098/rspb.2016.2562 729 Kennedy, D. A., & Read, A. F. (2020). Monitor for COVID-19 vaccine resistance evolution during 730 clinical trials. PLOS Biology, 18(11), e3001000. 731 https://doi.org/10.1371/journal.pbio.3001000 732 Kerr, B., Neuhauser, C., Bohannan, B. J. M., & Dean, A. M. (2006). Local migration promotes 733 competitive restraint in a host-pathogen "tragedy of the commons." Nature, 442(7098), 734 75-78. https://doi.org/10.1038/nature04864 735 Knell, R. J. (2004). Syphilis in renaissance Europe: Rapid evolution of an introduced sexually 736 transmitted disease? Proceedings of the Royal Society B: Biological Sciences, 271(Suppl 737 4), S174–S176. 738 Korber, B., Fischer, W. M., Gnanakaran, S., Yoon, H., Theiler, J., Abfalterer, W., Hengartner, N., 739 Giorgi, E. E., Bhattacharya, T., Foley, B., Hastie, K. M., Parker, M. D., Partridge, D. G., 740 Evans, C. M., Freeman, T. M., de Silva, T. I., Angyal, A., Brown, R. L., Carrilero, L., ... 741 Montefiori, D. C. (2020). Tracking Changes in SARS-CoV-2 Spike: Evidence that D614G 742 Increases Infectivity of the COVID-19 Virus. Cell, 182(4), 812-827.e19. 743 https://doi.org/10.1016/j.cell.2020.06.043 744 Lai, S., Ruktanonchai, N. W., Zhou, L., Prosper, O., Luo, W., Floyd, J. R., Wesolowski, A., 745 Santillana, M., Zhang, C., Du, X., Yu, H., & Tatem, A. J. (2020). Effect of non-746 pharmaceutical interventions to contain COVID-19 in China. Nature, 585(7825), 410-747 413. https://doi.org/10.1038/s41586-020-2293-x

748 Leggett, H. C., Cornwallis, C. K., & West, S. A. (2012). Mechanisms of Pathogenesis, Infective 749 Dose and Virulence in Human Parasites. PLOS Pathogens, 8(2), e1002512. 750 https://doi.org/10.1371/journal.ppat.1002512 751 Lenski, R. E., & May, R. M. (1994). The Evolution of Virulence in Parasites and Pathogens: 752 Reconciliation Between Two Competing Hypotheses. Journal of Theoretical Biology, 753 169(3), 253-265. https://doi.org/10.1006/jtbi.1994.1146 754 Li, Y., Petrov, D. A., & Sherlock, G. (2019). Single nucleotide mapping of trait space reveals 755 Pareto fronts that constrain adaptation. *Nature Ecology & Evolution*, 1–13. 756 https://doi.org/10.1038/s41559-019-0993-0 757 Lion, S., & Gandon, S. (2016). Spatial evolutionary epidemiology of spreading epidemics. 758 Proceedings of the Royal Society B: Biological Sciences, 283(1841), 20161170. 759 https://doi.org/10.1098/rspb.2016.1170 760 Lion, Sébastien, & Boots, M. (2010). Are parasites "prudent" in space? Ecology Letters, 13(10), 761 1245-1255. https://doi.org/10.1111/j.1461-0248.2010.01516.x 762 Lion, Sébastien, & Metz, J. A. J. (2018). Beyond R0 Maximisation: On Pathogen Evolution and Environmental Dimensions. Trends in Ecology & Evolution, 33(6), 458–473. 763 764 https://doi.org/10.1016/j.tree.2018.02.004 765 Longdon, B., Hadfield, J. D., Day, J. P., Smith, S. C. L., McGonigle, J. E., Cogni, R., Cao, C., & 766 Jiggins, F. M. (2015). The Causes and Consequences of Changes in Virulence following 767 Pathogen Host Shifts. PLOS Pathogens, 11(3), e1004728. 768 https://doi.org/10.1371/journal.ppat.1004728 769 Mackinnon, M. J., & Read, A. F. (1999). Genetic Relationships Between Parasite Virulence and 770 Transmission in the Rodent Malaria Plasmodium Chabaudi. Evolution, 53(3), 689–703. 771 https://doi.org/10.1111/j.1558-5646.1999.tb05364.x 772 Mackinnon, M. J., & Read, A. F. (2004). Virulence in malaria: An evolutionary viewpoint. 773 Philosophical Transactions of the Royal Society B: Biological Sciences, 359(1446), 965-774 986. https://doi.org/10.1098/rstb.2003.1414 775 MacLean, O. A., Orton, R. J., Singer, J. B., & Robertson, D. L. (2020). No evidence for distinct 776 types in the evolution of SARS-CoV-2. Virus Evolution, 6(1). 777 https://doi.org/10.1093/ve/veaa034 778 Marzi, A., Chadinah, S., Haddock, E., Feldmann, F., Arndt, N., Martellaro, C., Scott, D. P., Hanley, 779 P. W., Nyenswah, T. G., Sow, S., Massaguoi, M., & Feldmann, H. (2018). Recently 780 Identified Mutations in the Ebola Virus-Makona Genome Do Not Alter Pathogenicity in 781 Animal Models. Cell Reports, 23(6), 1806–1816. 782 https://doi.org/10.1016/j.celrep.2018.04.027 783 McCrone, J. T., & Lauring, A. S. (2018). Genetic bottlenecks in intraspecies virus transmission. 784 *Current Opinion in Virology*, 28, 20–25. https://doi.org/10.1016/j.coviro.2017.10.008 785 McCrone, J. T., Woods, R. J., Martin, E. T., Malosh, R. E., Monto, A. S., & Lauring, A. S. (2018). 786 Stochastic processes constrain the within and between host evolution of influenza virus. 787 ELife, 7, e35962. https://doi.org/10.7554/eLife.35962 788 Mclean, A. R. (1998). Vaccines and their impact on the control of disease. British Medical 789 Bulletin, 54(3), 545–556. https://doi.org/10.1093/oxfordjournals.bmb.a011709 790 McMahon, D. P., Wilfert, L., Paxton, R. J., & Brown, M. J. F. (2018). Chapter Eight - Emerging 791 Viruses in Bees: From Molecules to Ecology. In C. M. Malmstrom (Ed.), Advances in Virus

792 Research (Vol. 101, pp. 251–291). Academic Press. 793 https://doi.org/10.1016/bs.aivir.2018.02.008 794 Metz, J. A. J., Geritz, S. A. H., Meszena, G., Jacobs, F. J. A., & Heerwaarden, J. S. van. (1995, 795 September). Adaptive Dynamics: A Geometrical Study of the Consequences of Nearly 796 Faithful Reproduction [Monograph]. http://pure.iiasa.ac.at/id/eprint/4497/ 797 Metz, J. A. J., Mylius, S. D., & Diekmann, O. (2008, June). When Does Evolution Optimise? 798 [Monograph]. IR-08-013. http://pure.iiasa.ac.at/id/eprint/8769/ 799 Mideo, N., Alizon, S., & Day, T. (2008). Linking within- and between-host dynamics in the 800 evolutionary epidemiology of infectious diseases. Trends in Ecology & Evolution, 23(9), 801 511-517. https://doi.org/10.1016/j.tree.2008.05.009 802 Miller, I. F., & Metcalf, C. J. E. (2020). No current evidence for risk of vaccine-driven virulence 803 evolution in SARS-CoV-2. MedRxiv, 2020.12.01.20241836. 804 https://doi.org/10.1101/2020.12.01.20241836 805 Mollentze, N., Streicker, D. G., Murcia, P. R., Hampson, K., & Biek, R. (2020). Virulence 806 mismatches in index hosts shape the outcomes of cross-species transmission. 807 Proceedings of the National Academy of Sciences, 202006778. 808 https://doi.org/10.1073/pnas.2006778117 809 Morris, D. H., Petrova, V. N., Rossine, F. W., Parker, E., Grenfell, B. T., Neher, R. A., Levin, S. A., & 810 Russell, C. A. (2020). Asynchrony between virus diversity and antibody selection limits 811 influenza virus evolution. ELife, 9, e62105. https://doi.org/10.7554/eLife.62105 812 Mylius, S. D., & Diekmann, O. (1995). On Evolutionarily Stable Life Histories, Optimization and 813 the Need to Be Specific about Density Dependence. Oikos, 74(2), 218-224. 814 https://doi.org/10.2307/3545651 815 Ogbunugafor, C. B., Alto, B. W., Overton, T. M., Bhushan, A., Morales, N. M., & Turner, P. E. 816 (2013). Evolution of Increased Survival in RNA Viruses Specialized on Cancer-Derived 817 Cells. The American Naturalist, 181(5), 585–595. https://doi.org/10.1086/670052 818 Ogbunugafor, C. B., Basu, S., Morales, N. M., & Turner, P. E. (2010). Combining mathematics 819 and empirical data to predict emergence of RNA viruses that differ in reservoir use. 820 Philosophical Transactions: Biological Sciences, 365(1548), 1919–1930. JSTOR. 821 Olival, K. J., Hosseini, P. R., Zambrana-Torrelio, C., Ross, N., Bogich, T. L., & Daszak, P. (2017). 822 Host and viral traits predict zoonotic spillover from mammals. Nature, 546(7660), 646-823 650. https://doi.org/10.1038/nature22975 824 Osnas, E. E., & Dobson, A. P. (2012). Evolution of Virulence in Heterogeneous Host Communities 825 Under Multiple Trade-Offs. Evolution, 66(2), 391–401. https://doi.org/10.1111/j.1558-826 5646.2011.01461.x 827 Osnas, E. E., Hurtado, P. J., & Dobson, A. P. (2015). Evolution of Pathogen Virulence across 828 Space during an Epidemic. *The American Naturalist*, 185(3), 332–342. 829 https://doi.org/10.1086/679734 830 Parrish, C. R., Holmes, E. C., Morens, D. M., Park, E.-C., Burke, D. S., Calisher, C. H., Laughlin, C. 831 A., Saif, L. J., & Daszak, P. (2008). Cross-Species Virus Transmission and the Emergence 832 of New Epidemic Diseases. Microbiology and Molecular Biology Reviews : MMBR, 72(3), 833 457-470. https://doi.org/10.1128/MMBR.00004-08 834 Plante, J. A., Liu, Y., Liu, J., Xia, H., Johnson, B. A., Lokugamage, K. G., Zhang, X., Muruato, A. E., 835 Zou, J., Fontes-Garfias, C. R., Mirchandani, D., Scharton, D., Bilello, J. P., Ku, Z., An, Z.,

836 Kalveram, B., Freiberg, A. N., Menachery, V. D., Xie, X., ... Shi, P.-Y. (2020). Spike 837 mutation D614G alters SARS-CoV-2 fitness. Nature, 1-9. 838 https://doi.org/10.1038/s41586-020-2895-3 839 Plowright, R. K., Parrish, C. R., McCallum, H., Hudson, P. J., Ko, A. I., Graham, A. L., & Lloyd-840 Smith, J. O. (2017). Pathways to zoonotic spillover. Nature Reviews Microbiology, 15(8), 841 502-510. https://doi.org/10.1038/nrmicro.2017.45 842 Rambaut, A., Loman, N. J., Pybus, O. G., Barclay, W., Barrett, J., Carabelli, A., Connor, T., 843 Peacock, T., Robertson, D. L., Volz, E., & COVID-10 Genomics Consortium UK. (2020, 844 December 18). Preliminary genomic characterisation of an emergent SARS-CoV-2 lineage 845 in the UK defined by a novel set of spike mutations. Virological. 846 https://virological.org/t/preliminary-genomic-characterisation-of-an-emergent-sars-cov-847 2-lineage-in-the-uk-defined-by-a-novel-set-of-spike-mutations/563 848 Rambaut, A., Pybus, O. G., Nelson, M. I., Viboud, C., Taubenberger, J. K., & Holmes, E. C. (2008). 849 The genomic and epidemiological dynamics of human influenza A virus. *Nature*, 850 453(7195), 615–619. https://doi.org/10.1038/nature06945 851 Read, A. F. (1994). The evolution of virulence. *Trends in Microbiology*, 2(3), 73–76. 852 https://doi.org/10.1016/0966-842X(94)90537-1 853 Regoes, R. R., Nowak, M. A., & Bonhoeffer, S. (2000). Evolution of Virulence in a Heterogeneous 854 Host Population. Evolution, 54(1), 64–71. https://doi.org/10.1111/j.0014-855 3820.2000.tb00008.x 856 Roche, B., Drake, J. M., & Rohani, P. (2011). The curse of the Pharaoh revisited: Evolutionary bi-857 stability in environmentally transmitted pathogens. Ecology Letters, 14(6), 569–575. 858 https://doi.org/10.1111/j.1461-0248.2011.01619.x 859 Roode, J. C. de, Yates, A. J., & Altizer, S. (2008). Virulence-transmission trade-offs and 860 population divergence in virulence in a naturally occurring butterfly parasite. 861 Proceedings of the National Academy of Sciences, 105(21), 7489–7494. 862 https://doi.org/10.1073/pnas.0710909105 863 Saad-Roy, C. M., Wingreen, N. S., Levin, S. A., & Grenfell, B. T. (2020). Dynamics in a simple 864 evolutionary-epidemiological model for the evolution of an initial asymptomatic 865 infection stage. Proceedings of the National Academy of Sciences. 866 https://doi.org/10.1073/pnas.1920761117 867 Sanjuán, R. (2010). Mutational fitness effects in RNA and single-stranded DNA viruses: Common 868 patterns revealed by site-directed mutagenesis studies. Philosophical Transactions of 869 the Royal Society B: Biological Sciences, 365(1548), 1975–1982. 870 https://doi.org/10.1098/rstb.2010.0063 871 Sasaki, A., Lion, S., & Boots, M. (2021). The impact of antigenic escape on the evolution of 872 virulence. BioRxiv, 2021.01.19.427227. https://doi.org/10.1101/2021.01.19.427227 873 Shoval, O., Sheftel, H., Shinar, G., Hart, Y., Ramote, O., Mayo, A., Dekel, E., Kavanagh, K., & Alon, 874 U. (2012). Evolutionary trade-offs, Pareto optimality, and the geometry of phenotype 875 space. Science, 1217405. 876 Slatkin, M., & Excoffier, L. (2012). Serial Founder Effects During Range Expansion: A Spatial 877 Analog of Genetic Drift. Genetics, 191(1), 171–181. 878 https://doi.org/10.1534/genetics.112.139022

- Smith, T. (1904). Some Problems in the Life History of Pathogenic Microorganisms. *Science*,
 20(520), 817–832. https://doi.org/10.1126/science.20.520.817
- Tardy, L., Giraudeau, M., Hill, G. E., McGraw, K. J., & Bonneaud, C. (2019). Contrasting evolution
 of virulence and replication rate in an emerging bacterial pathogen. *Proceedings of the National Academy of Sciences*, *116*(34), 16927–16932.
- 884 https://doi.org/10.1073/pnas.1901556116
- Urbanowicz, R. A., McClure, C. P., Sakuntabhai, A., Sall, A. A., Kobinger, G., Müller, M. A.,
 Holmes, E. C., Rey, F. A., Simon-Loriere, E., & Ball, J. K. (2016). Human Adaptation of
 Ebola Virus during the West African Outbreak. *Cell*, *167*(4), 1079-1087.e5.
 https://doi.org/10.1016/j.cell.2016.10.013
- van Baalen, M. (2002). Contact Networks and the Evolution of Virulence. In Adaptive Dynamics
 of Infectious Diseases: In Pursuit of Virulence Management. Cambridge University Press.
- Villabona-Arenas, C. J., Hanage, W. P., & Tully, D. C. (2020). Phylogenetic interpretation during
 outbreaks requires caution. *Nature Microbiology*, 5(7), 876–877.
 https://doi.org/10.1038/c41564.020.0728.5
- 893 https://doi.org/10.1038/s41564-020-0738-5
- Visher, E., & Boots, M. (2020). The problem of mediocre generalists: Population genetics and
 eco-evolutionary perspectives on host breadth evolution in pathogens. *Proceedings of the Royal Society B: Biological Sciences, 287*(1933), 20201230.
- 897 https://doi.org/10.1098/rspb.2020.1230
- Visher, E., Whitefield, S. E., McCrone, J. T., Fitzsimmons, W., & Lauring, A. S. (2016). The
 Mutational Robustness of Influenza A Virus. *PLOS Pathogens*, *12*(8), e1005856.
 https://doi.org/10.1371/journal.ppat.1005856
- Volz, E., Hill, V., McCrone, J. T., Price, A., Jorgensen, D., O'Toole, Á., Southgate, J., Johnson, R.,
 Jackson, B., Nascimento, F. F., Rey, S. M., Nicholls, S. M., Colquhoun, R. M., Filipe, A. da
 S., Shepherd, J., Pascall, D. J., Shah, R., Jesudason, N., Li, K., ... Connor, T. R. (2020).
 Evaluating the effects of SARS-CoV-2 Spike mutation D614G on transmissibility and
 pathogenicity. *Cell*, *0*(0). https://doi.org/10.1016/j.cell.2020.11.020
- Walther, B. A., & Ewald, P. W. (2004). Pathogen survival in the external environment and the
 evolution of virulence. *Biological Reviews*, *79*(4), 849–869.
 https://doi.org/10.1017/S1464793104006475
- Warren, C. J., & Sawyer, S. L. (2019). How host genetics dictates successful viral zoonosis. *PLOS Biology*, *17*(4), e3000217. https://doi.org/10.1371/journal.pbio.3000217
- Wasik, B. R., Bhushan, A., Ogbunugafor, C. B., & Turner, P. E. (2015). Delayed transmission
 selects for increased survival of vesicular stomatitis virus. *Evolution*, 69(1), 117–125.
 https://doi.org/10.1111/evo.12544
- Wasik, B. R., de Wit, E., Munster, V., Lloyd-Smith, J. O., Martinez-Sobrido, L., & Parrish, C. R.
 (2019). Onward transmission of viruses: How do viruses emerge to cause epidemics after spillover? *Philosophical Transactions of the Royal Society B: Biological Sciences*, 374(1782), 20190017. https://doi.org/10.1098/rstb.2019.0017
- Wong, A. H. M., Tomlinson, A. C. A., Zhou, D., Satkunarajah, M., Chen, K., Sharon, C., Desforges,
 M., Talbot, P. J., & Rini, J. M. (2017). Receptor-binding loops in alphacoronavirus
 adaptation and evolution. *Nature Communications*, 8(1), 1735.
- 921 https://doi.org/10.1038/s41467-017-01706-x

- Woolhouse, M. E. J., Haydon, D. T., & Antia, R. (2005). Emerging pathogens: The epidemiology
 and evolution of species jumps. *Trends in Ecology & Evolution*, 20(5), 238–244.
- 924 https://doi.org/10.1016/j.tree.2005.02.009
- Woolhouse, M., Scott, F., Hudson, Z., Howey, R., & Chase-Topping, M. (2012). Human viruses:
 Discovery and emergence. *Philosophical Transactions of the Royal Society B: Biological*
- 927 Sciences, 367(1604), 2864–2871. https://doi.org/10.1098/rstb.2011.0354
- Xue, K. S., Stevens-Ayers, T., Campbell, A. P., Englund, J. A., Pergam, S. A., Boeckh, M., & Bloom,
 J. D. (2017). Parallel evolution of influenza across multiple spatiotemporal scales. *ELife*,
- 930 *6*, e26875. https://doi.org/10.7554/eLife.26875
- 931