1	Population genomics of <i>Bacillus anthracis</i> from an anthrax hyperendemic area
2	reveals transmission processes across spatial scales and unexpected within-host
3	diversity
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# 21 Abstract

Genomic sequencing has revolutionized our understanding of bacterial disease epidemiology, but 22 23 remains underutilized for zoonotic pathogens in remote endemic settings. Anthrax, caused by the 24 spore-forming bacterium *Bacillus anthracis*, remains a threat to human and animal health and 25 rural livelihoods in low- and middle-income countries. While the global genomic diversity of B. 26 anthracis has been well-characterized, there is limited information on how its populations are 27 genetically structured at the scale at which transmission occurs, critical for understanding the 28 pathogen's evolution and transmission dynamics. Using a uniquely rich dataset, we quantified 29 genome-wide single nucleotide polymorphisms (SNPs) among 73 B. anthracis isolates derived 30 from 33 livestock carcasses sampled over one year throughout the Ngorongoro Conservation 31 Area, Tanzania, an area hyperendemic for anthrax. Genome-wide SNPs distinguished 22 unique 32 B. anthracis genotypes within the study area. However, phylogeographic structure was lacking, 33 as identical SNP profiles were found throughout the study area, likely the result of the long and 34 variable periods of spore dormancy and long-distance livestock movements. Significantly, 35 divergent genotypes were obtained from spatio-temporally linked cases and even individual 36 carcasses. The high number of SNPs distinguishing isolates from the same host is unlikely to 37 have arisen during infection, as supported by our simulation models. This points to an 38 unexpectedly wide transmission bottleneck for *B. anthracis*, with an inoculum comprising 39 multiple variants being the norm. Our work highlights that inferring transmission patterns of *B*. 40 anthracis from genomic data will require analytical approaches that account for extended and 41 variable environmental persistence as well as co-infection.

2

# 42 **Importance**

Pathogens transmitted between animals and people affect the health and livelihoods of farmers, 43 44 particularly in developing countries dependent on livestock. Understanding over what distances 45 these pathogens are transmitted and how they evolve is important to inform control strategies 46 towards reducing disease impacts. Information on the circulation of Bacillus anthracis, which 47 causes the often-lethal disease anthrax, is lacking for settings where the disease is commonplace. Consequently, we examined its genetic variability in an area in Tanzania where anthrax is 48 49 widespread. We found no clear link between how closely cases were sampled and their genetic 50 similarity. We suspect this lack of congruence is primarily driven by large-scale livestock 51 movements, which control efforts should take into consideration. Another significant finding was 52 the co-occurrence of multiple *B. anthracis* types within individual hosts, suggesting animals are commonly infected with a mixture of variants. This needs to be accounted for when investigating 53 54 possible connections between cases.

# 55 Introduction

56 Genomic data have the potential to transform our understanding of the evolution and 57 epidemiology of pathogens of public health importance (1). However, this potential has yet to be 58 fully harnessed for many zoonotic diseases that occur in hard-to-reach areas. Anthrax remains 59 endemic in many low- and middle-income countries (LMICs) worldwide (2). It is a disease 60 characterized by sudden deaths in herbivorous livestock and wildlife, and can also cause serious, 61 potentially fatal disease in people (3). Anthrax is classified among the neglected zoonoses: a 62 group of diseases shared by animals and people that, due to their occurrence in remote, 63 disadvantaged communities, collectively receive less than 0.1% of international global health 64 assistance (4). As for many neglected zoonoses, there is limited genomic data for Bacillus 65 anthracis, the bacterium that causes anthrax, from endemic LMIC settings where surveillance 66 tends to be limited. Such data could help to improve our understanding of transmission 67 processes, such as how *B. anthracis* is spread within and between outbreaks, and ultimately contribute to more informed disease management. 68 69 The genomic diversity of *B. anthracis* has been well-described at a global scale. Isolates can be 70 broadly divided into three major clades (A, B, C), of which A clade is the most widespread and 71 globally dominant (5–7). Isolates from most *B. anthracis* lineages have been found across 72 geographically widespread areas, often spanning multiple continents (7). While particular 73 variants often predominate regionally, high lineage diversity has also been reported, including 74 co-circulation of strains from multiple linages (8, 9). How B. anthracis diversity is structured at 75 smaller scales is less well-defined. The pathogen has limited genomic diversity compared to 76 other bacterial species (i.e. is genetically monomorphic), rendering standard genotyping methods 77 such as multi-locus sequence typing insufficiently discriminatory (10). A hierarchical genotyping

78	scheme known as PHRANA was therefore developed specifically for <i>B. anthracis</i> , based on
79	quickly evolving repetitive regions nested within more phylogenetically stable markers –
80	canSNPs – that distinguish among the major lineages (5, 11). Variants of this scheme have been
81	used to examine the diversity of <i>B. anthracis</i> in several endemic settings globally, including in a
82	few African countries (8, 12–14). Genome-wide SNP data would offer higher resolution for
83	discriminating among closely-related isolates. However, whole genome sequencing (WGS)
84	features in only a few studies of local <i>B. anthracis</i> diversity (15–18), and has rarely been
85	conducted outside Europe (19), so the potential for phylogenomic data to be used to understand
86	transmission patterns within hyperendemic areas has yet to be explored.
87	Transmission of <i>B. anthracis</i> occurs primarily through the environment. After causing the death
88	of the animal host, vegetative bacteria are released into the environment via bodily fluids. Here,
89	upon exposure to oxygen and cues related to a lack of nutrients, these bacteria sporulate and can
90	persist in a dormant yet infectious state for several decades (3, 20). While the viability of spores
91	decreases over time, new B. anthracis infections could theoretically arise from recent cases or
92	cases that occurred several years or even decades previously. How this environmental
93	persistence shapes the spatio-temporal diversity of <i>B. anthracis</i> in endemic settings has never
94	been investigated.
95	In molecular epidemiological studies of bacterial pathogens, a single isolate is typically

96 sequenced from each individual case. However, this approach fails to recognize the bacterial 97 population diversity that may exist within the host (21, 22). Such diversity can either result from 98 mutations that arise during infection, or from heterogeneity (multiple variants) in the inoculum, 99 either through co-infection (exposure to multiple variants simultaneously) or superinfection 100 (multiple exposures) (23, 24). Under those scenarios, a single isolate is unlikely to represent the 101 overall diversity of the pathogen within the host, and as a result this approach can lead to

- 102 erroneous inferences about transmission pathways (25). The importance of capturing within-host
- 103 diversity is therefore increasingly recognized (26, 27). In the case of anthrax, multiple genotypes
- 104 of *B. anthracis* have been previously found within individual hosts (28–30), but it remains
- 105 unclear whether this represents a more widespread phenomenon.
- 106 The objective of this study was to quantify the genomic diversity of *B. anthracis* at hierarchical
- 107 spatial scales within the livestock population of a hyperendemic setting. This was accomplished
- 108 using a unique dataset including 1) isolates collected throughout a large (~8,300 km<sup>2</sup>) area of
- 109 northern Tanzania where anthrax is widespread; 2) among spatio-temporally linked cases; and 3)
- 110 within individual hosts, assessing multiple isolates from the same and different sample types
- 111 associated with a case (e.g. tissue, blood, soil).

# 112 **Results**

## 113 Genomic sequencing of *B. anthracis* isolates enabled assessment of diversity at

114 hierarchical spatial scales

115 Bacillus anthracis isolates were recovered from livestock carcasses in the Ngorongoro

116 Conservation Area (NCA), part of the Serengeti ecosystem of northern Tanzania. The 73 isolates

117 from which WGS data were obtained were from a total of 33 carcass sites sampled throughout

- 118 the NCA (Table S1). Carcasses were of the following species: sheep (n = 18), cattle (n = 7),
- 119 goats (n = 4), donkey (n = 1) or unknown host (n = 3). The diversity of *B. anthracis* was assessed
- 120 at multiple hierarchical spatial scales (Fig. 1). Carcasses for which detailed sampling location
- 121 data were available (n = 32) could be grouped into four distinct areas within the NCA (central,
- 122 north, south, east), referred to herein as 'geographical groups'. To assess the genomic relatedness

123 among spatio-temporally-linked cases, on four occasions, samples were collected from two 124 carcasses either from the same or neighboring households on the same or consecutive days, 125 which we refer to as 'epidemiological clusters'. Three of these clusters were in the central 126 geographical group, while the fourth was in the southern group of carcasses sampled. Finally, 127 multiple isolates (n = 2-4) were sequenced from a single carcass for 21 carcasses. These were 128 either i) isolates from multiple sample types (i.e. tissue, blood, swabs, soil and/or insects) from a 129 single carcass (n = 16 carcasses) and/or ii) multiple isolates from the same sample (n = 15130 carcasses). Isolates contributing to investigations of diversity at each hierarchical level are 131 detailed in Table S1, along with individual sequence quality metrics. Mapped reads had an 132 average depth of coverage of 85X across isolates, ranging from 24X - 245X (median 72X).

# *B. anthracis* within the NCA is limited to a single subgroup lacking clear phylogeographic signal

All *B. anthracis* isolates from the NCA were found to belong to the Ancient A subgroup of Clade
A (Fig. 2). Within this subgroup, the NCA isolates formed a monophyletic clade within Cluster
3.2 as defined by Bruce et al. (7), which also contained the isolate A2075 (GenBank accession
SRR2968187), isolated in 1999 from a baboon in Muhesi Game Reserve, central Tanzania.

139 A total of 125 SNPs polymorphic among the NCA isolates and A2075 were retained for analysis,

140 of which 13 were unique to A2075. Twenty-two unique genotypes (SNP profiles) were found

among the 73 NCA isolates (Fig. 3). Based on a rarefaction analysis, the observed genotypic

142 diversity was close to that present throughout the study area (i.e. further sampling would have

143 been unlikely to reveal additional genotypes; Fig. S1). The maximum pairwise nucleotide

144 difference between any two NCA-derived isolates was 49 SNPs [median = 24, interquartile range

145 (IQR) = 10-35 (Fig. S2). There was no clear relationship between the pairwise nucleotide 146 differences and the geographical distance between sampling locations (Fig. S3), as confirmed by 147 a test for isolation by distance (r = 0.04, p = 0.214). Isolates from the central, eastern and 148 southern geographical groups were observed throughout the phylogenetic tree, while all isolates 149 from the northern sampling area were restricted to a single clade that contained the majority of 150 NCA isolates (Fig. 3). In eight instances, identical B. anthracis genotypes were found in 151 carcasses from different geographical groups, all of which involved isolates from the central 152 geographical group and one of the other areas, with all areas implicated (Table S3). Identical or 153 nearly identical SNP profiles (1 SNP difference) were obtained from carcasses sampled 3-5 154 months apart on six occasions, and 10 months apart on one occasion (Table S4). 155 **B.** anthracis isolates from spatio-temporally linked cases are rarely genetically

## 156 related

157 Between one and four isolates were sequenced from each carcass sampled as part of an 158 epidemiological cluster (i.e. pair of spatio-temporally linked carcasses), resulting in between 4-8 159 isolates per cluster. In most cases, isolates deriving from the same epidemiological cluster were 160 phylogenetically unrelated. Only in one of the four clusters examined (C2) did both carcasses 161 contain isolates with identical core SNP profiles (Fig. 3B, S6 and S7). Overall, isolates from 162 different carcasses within the same epidemiological cluster had similar numbers of SNP 163 differences when compared with randomly selected carcasses (linked cases: median = 21, IQR =164 0-33; unlinked cases: median = 23, IQR = 10-35) (Fig. 4).

Within-host diversity of *B. anthracis* is similar to between-host diversity in the
 NCA

167 Overall, the number of pairwise SNP differences between isolates from the same carcass was 168 lower than that found between isolates from different carcasses [same: median = 11, interquartile 169 range = 0-34; different: median = 23, interquartile range = 10-35] (Fig. 4). However, isolates 170 with multiple distinct genotypes were obtained on 15 of 21 occasions wherein multiple isolates 171 were sequenced from the same carcass, with as many as 43 SNP differences between isolates 172 (Fig. 5). A high level of divergence was seen, regardless of whether isolates were from the same 173 or different sample type (e.g. multiple isolates from a tissue sample vs. isolates from tissue and 174 soil samples, Fig. 5A). Divergent genotypes were observed in all carcasses from which three or 175 more isolates were sequenced (12/12), and in a third (3/9) of carcasses for which two isolates 176 were sequenced. A single SNP difference separated one isolate from two others within one 177 carcass (AN16-83) and two SNP differences separated two isolates from a single soil sample 178 (LNA). All other pairwise within-host SNP differences were eight or above. All of the within-179 host SNP profiles detected were shared with those from other carcasses.

## 180 **Observed within-host diversity is unlikely to have arisen during the course of**

# 181 infection

182 To assess the likelihood of different levels of within-host diversity arising during the course of 183 infection, we performed simulation modelling of *B. anthracis* infection with a homogenous 184 inoculum of varying size (1, 2, 5, 10, 20, 50 and 100 bacterial genomes), and across a range of 185 replication cycles (up to 25 generations) using previously established mutation rates (29). With 186 an infectious dose d, discrete generations and no die-off, the population size in generation i is 187 therefore  $d \times 2^{(i-1)}$ . Averaging across simulations with varying initial doses, in the 25<sup>th</sup> 188 generation, 90.0% of the population was identical to the infecting dose, 9.53% differed by 1 189 SNP, and 0.489% by 2 SNPs, with higher numbers of mutations very rare (<0.01%). While

190	stochasticity was present in early generations and particularly at low inoculum doses (Fig. S8-
191	10), the mean proportion of genomes with various numbers of SNPs changed predictably after
192	the initial generations (Fig. 6A-B). Extrapolating to the $40^{\text{th}}$ generation, then ~84% of the
193	population would be expected to be identical to the infecting dose, ~15% differing by 1 SNP and
194	~0.9% by 2 SNPs.
195	To illustrate how this within-host generated diversity would be captured in our sampling, pairs of
196	genomes were repeatedly sampled from simulated populations and pairwise differences
197	calculated (Fig 6C and 6D, File S1). Overall, pairwise differences greater than 2 SNPs occurred
198	in less than 0.2% of all simulated populations (Table S5). Higher SNP distances such as those
199	observed (Fig. 5B) are therefore unlikely to arise within-host following infection with a

200 homogenous inoculum.

# 201 **Discussion**

202 Genomic data for understanding the population structure and transmission patterns of bacterial 203 zoonoses has been limited for LMIC settings where these diseases tend to have the greatest 204 impact. Despite *B. anthracis* having limited genomic diversity in comparison with other bacterial 205 species, WGS provided sufficient resolution to discriminate among isolates collected from within 206 a relatively small geographic area of a few thousand square kilometers. The way in which the 207 genomic diversity was partitioned across hierarchical spatial scales within this area has a series 208 of novel implications for our understanding of how the pathogen is transmitted and evolves 209 during endemic circulation.

210 **B.** anthracis diversity within the hyperendemic NCA region is limited to a

211 single Clade A sub-group

212 The NCA is an area where anthrax has likely been endemic for decades, if not centuries. Local 213 community members claim that it has been an issue for their health and that of their livestock 214 throughout living memory. Despite WGS providing sufficient discriminatory power to 215 differentiate among individual B. anthracis isolates in this setting, fewer than 50 SNP differences 216 were found among NCA isolates across the 5.2 MB chromosomal genome, highlighting the 217 degree to which this bacterial pathogen is monomorphic. All 73 sequenced isolates formed a 218 monophyletic cluster within the Ancient A lineage – also known as canSNP group A.Br.005/006 219 or A.Br.034 (6) – a subgroup of Clade A comprised mostly of isolates from south-eastern Africa. 220 This contrasts with some previous studies of anthrax diversity in chronically endemic areas 221 reporting co-circulation of isolates from multiple lineages using lower resolution markers (8, 9). 222 Our study, which only included isolates collected over one year, can be considered a snapshot of 223 recent diversity only. That being said, Tanzanian isolates genotyped in a previous study (n = 17)224 were also all found to belong to Ancient A clade (5), demonstrating that this particular lineage is 225 dominant and well-established in this country. The most closely related publicly available isolate 226 (A2075), sampled in central Tanzania approximately 300km away from our study area, differed 227 from some NCA isolates by only 13 SNPs, which illustrates that highly related *B. anthracis* 228 isolates can be geographically widespread. Broader, longitudinal WGS studies of B. anthracis 229 across different regions of Africa will be needed to assess the actual range of individual 230 genotypes over space and time.

## 231 No phylogeographic signal observed despite considerable SNP diversity

Despite the considerable diversity observed (i.e. 22 unique genotypes within the sampled
population), a phylogeographic signal was not detected at the scale of this study area. The
finding of identical SNP profiles across distances of tens of kilometers likely reflects the ecology

235 of anthrax in general and in our study system. First, there are few opportunities for genetic 236 diversity to arise within the *B. anthracis* lifecycle, which is characterized by long periods of 237 environmental dormancy in spore form, punctuated by brief interludes of a few days where it 238 develops into its vegetative state and replicates within an infected host. It is estimated that B. 239 anthracis undergoes only 20-40 replications per infection (11). Given its low mutation rate (5.2 – 8.3 x 10<sup>-10</sup> mutations/site/generation) (5, 29, 31), novel mutations would likely arise in only a 240 241 small proportion of *B. anthracis* infections, as also supported by our simulations. The short time 242 of active replication within a host also means there is minimal opportunity for horizontal gene 243 transfer with other bacteria (11), which further restricts the ability of *B. anthracis* to diversify. It 244 is believed that *B. anthracis* rarely multiplies outside of a host, although there is some evidence 245 for limited environmental replication (32, 33). Viability of *B. anthracis* decays exponentially 246 over time, although infectious spores remain detectable at carcass sites at least four years after 247 the death of the animal (34), and under favorable conditions, spores can remain viable for up to 248 several decades (20). It is therefore reasonable to expect that spores from a single anthrax carcass 249 with few or no novel mutations could be the source of subsequent infections over highly variable 250 time periods, a phenomenon referred to by Sahl et al. (2016) as a 'time capsule'. This situation 251 violates typical molecular clock assumptions (35), wherein SNPs would be expected to arise at a 252 relatively steady rate within the pathogen population over time. The observation that 253 contemporary isolates from the NCA are phylogenetically basal to isolate A2075, collected 254 nearly two decades earlier, highlights this issue. In order for molecular clock models to be 255 applied to environmentally-persistent pathogens such as *B. anthracis* – for instance to estimate 256 how long particular lineages have been in circulation – current analytical frameworks will need 257 to be extended.

258 In addition to long and variable environmental persistence, animal movements and spatial 259 admixture likely contribute to the lack of phylogeographic structure of *B. anthracis* within this 260 study area. Potential sources of infection are quite spatially restricted, as the highest 261 concentrations of viable spores are found within only a few meters of anthrax carcasses (36), in 262 what have been termed 'localized infectious zones' (37). However, given that the incubation 263 period of anthrax in livestock typically ranges from 1-14 days and potentially longer (3), 264 extensive movement can occur between the time of infection and the animal's death, meaning 265 the site of sampling likely does not reflect the site of infection. In parts of rural Africa where 266 pastoralism is the main form of agriculture, livestock are moved for various reasons, including to 267 access water, pastures and minerals. Such daily and/or seasonal livestock movements could 268 contribute to the observation of identical SNP profiles over distances of tens of kilometers in our 269 study area and the lack of relationship between genetic distance and geographic distance between 270 sampling locations. While livestock appear to be the primary drivers of *B. anthracis* transmission 271 in the NCA, movement of infected wildlife and scavengers acting as carriers of *B. anthracis* 272 spores could represent an additional mechanism contributing to our observations (38, 39). 273 Further comparative genomic studies across wider areas will be essential for elucidating the 274 geographic scales at which transmission occurs. This would help to delineate areas across which 275 coordinated livestock vaccination campaigns should occur to avoid regular re-incursions through 276 animal movement and trade.

# 277 High within-host diversity is the result of simultaneous infection with multiple 278 variants, not within-host evolution

We observed high *B. anthracis* diversity within individual hosts, essentially indistinguishable
from levels of diversity found throughout the study area. Smaller numbers of SNPs (1-2) could

281 potentially have arisen during culture; however, based on previous passaging experiments with 282 B. anthracis (29), we do not expect this to have contributed in our case due to the limited number 283 of passages performed. Alternatively, small numbers of SNPs could have arisen during the 284 course of infection within the host. The simulations we performed suggest that isolates with >2285 SNP differences between them are unlikely to be the product of within-host evolution. The 286 regular occurrence of such differences or greater among isolates from the same carcass indicates 287 that animals are commonly infected with a heterogenous infectious dose (i.e. ingestion of a 288 mixture of *B. anthracis* genotypes from single or possibly multiple grazing or watering points; 289 Fig. 7). Multiple SNP profiles were present among isolates from the same individual soil 290 samples, supporting the occurrence of heterogeneity in a single infection source. It is also 291 noteworthy that all within-host SNP profiles observed in this study were shared with isolates 292 from at least one other sampled carcass (i.e. none were unique); this strongly suggests that most 293 of the observed within-host diversity is the result of various genotypes having been present in the 294 inoculum rather than having been generated *de novo*. This points to a wide transmission 295 bottleneck, since a small inoculum comprising only a few spores would limit the possible 296 diversity that could be transmitted.

Our findings make an important contribution to the ongoing debate about the size of the transmission bottleneck for naturally-occurring anthrax in animals (i.e. the number of spores that give rise to a case). Recent work has proposed that founding populations may be as small as 1-3 individual spores (30). However, our findings are clearly at odds with such narrow bottlenecks, since the multiple genotypes we regularly observed within individual hosts could not have been transmitted within such a small inoculum. While our results provide no information about the exact size of the infectious dose, they align more closely with earlier suggestions of higher

infectious doses, which are biologically plausible given that animals grazing at carcass sites
 might ingest hundreds of thousands of spores with each bite (34).

## **306** Spatio-temporally linked anthrax cases are rarely genetically linked

307 Limiting phylogenetic analyses to a single isolate per host often leads to incorrect inference of 308 transmission events (22), including the potential to overlook important epidemiological 309 connections (40). This issue is exemplified in the current study by the spatio-temporally linked 310 pair of cases in Cluster 2: whereas several of the isolates from both carcasses (n = 3 each) had 311 identical SNP profiles, supporting a transmission link, both carcasses also harbored non-identical 312 genotypes (Fig. S5 and S6). Under these circumstances, transmission links may be missed, even 313 with complete sampling. As noted by Ågren et al. (2014), in the case of multi-clonal infections, 314 subsequent cases may stem from different genotypes from within the founding population, 315 masking the fact that these cases stemmed from a common source, regardless of the number of 316 isolates sequenced among the subsequent cases. This could be the case for the other three spatio-317 temporally linked pairs of anthrax carcasses investigated in this study (Fig. S6), in which we 318 only detected isolates with distinct SNP profiles. Alternatively, cases without a genetic link 319 could be temporally linked for reasons other than exposure to a common source. For instance, 320 animals might be more susceptible or at greater risk of exposure to infection at particular times 321 of year, e.g. due to lower immune function related to their nutritional status and/or associated 322 with weather extremes including prolonged rains or droughts (8). More extensive sampling of 323 within-carcass diversity would be necessary to investigate these hypotheses and to determine 324 whether co-occurrence of genotypes could be used to track transmission patterns.

15

# 325 **Conclusions**

326 In this study, the genomic diversity of *B. anthracis* was quantified at various spatial scales within 327 a hyperendemic setting. While WGS could discriminate among isolates within a relatively small 328 geographic area, there was a lack of phylogeographic signal and limited genetic relatedness was 329 observed among isolates from spatio-temporally linked cases. We hypothesize that this lack of 330 spatial structure reflects the long-term persistence of *B. anthracis* spores in the environment, 331 combined with extensive livestock movements related to local pastoralist practices. Based on 332 simulations, the high within-host heterogeneity we observed points to an inoculum comprised of 333 diverse genotypes, suggestive of a wide transmission bottleneck. Our work paves the way for 334 studying B. anthracis genomic diversity and evolution within anthrax-endemic areas more 335 broadly and to confirm the temporal and spatial scales over which genomic data are most 336 informative for inferring transmission dynamics.

# 337 Methods

## 338 Study area

339 This study was conducted in the NCA of northern Tanzania, which covers 8,292 km<sup>2</sup>. Located to

340 the south-east of Serengeti National Park, this multiple-land use area is inhabited by roughly

341 87,000 people (41) and one million livestock (sheep, goats and cattle) (Veterinary Officer for

- 342 Ngorongoro District, pers comm). Northern Tanzania remains hyperendemic for anthrax (42),
- 343 and prior to this study the NCA was recognized as a potential hotspot for this disease (43).

## 344 **Research and ethical approval**

345	This study received ethical approval from the Kilimanjaro Christian Medical University College
346	Ethics Review Committee (certificate No. 2050); the National Institute for Medical Research,
347	Tanzania (NIMR/HQ/R.8a/Vol. IX/2660); Tanzanian Commission for Science and Technology
348	(2016-95-NA-2016-45); and the College of Medical Veterinary and Life Sciences ethics
349	committee at the University of Glasgow (200150152). It also received permission under Section
350	20 of the Animal Diseases Act 35 (1984) at the University of Pretoria, South Africa (Ref

351 12/11/1/1/6).

# 352 Sample collection

353 Samples were collected between May 2016 and April 2017 inclusive through active surveillance 354 by a dedicated field team. Sudden deaths in animals reported by community members throughout 355 the NCA were investigated and samples were collected when anthrax was suspected (File S1). 356 When available, the following samples were collected: a piece of skin tissue (tip of the ear if the 357 carcass was still intact, or a piece of hide if the carcass had already been opened); whole blood; 358 swab of blood or body fluid at natural orifices; blood- or body fluid-soaked soil from below the 359 carcass; and insects found on or around the carcass. Various metadata were recorded, including 360 the species of animal affected and the location of sampling (Table S1, File S1). All samples were 361 stored at ambient temperature for up to six months at local veterinary facilities until transport to 362 the Kilimanjaro Clinical Research Institute (KCRI) in Moshi, Tanzania for molecular 363 diagnostics, as previously described (44), with aliquots shipped to the University of Pretoria, 364 South Africa, for selective culture and DNA extraction from *B. anthracis* isolates.

# 365 Selective culture, DNA extraction and sequencing

366	Sample pretreatment (i.e. to inhibit competition from heat-sensitive bacteria) is described in File
367	S1. Sample homogenates (100 $\mu$ L) were plated onto both polymyxin-EDTA thallous acetate
368	(PET) selective media and 5% sheep blood agar (SBA). These were incubated at 37 °C overnight
369	and the plates inspected for growth after $15 - 24$ hours incubation. The PET was then further
370	incubated and inspected at 48 hours. Suspect B. anthracis colonies based on typical
371	morphological characteristics were sub-cultured onto SBA for purification and identification
372	(File S1). In parallel, a single colony was streaked onto a new purity plate for nucleic acid
373	extraction. In some instances multiple isolates were selected from the same sample where the
374	colonies demonstrated differences in morphology but were identified on the same plate and met
375	the selection criteria (File S1).
376	DNA extracts from 75 isolates from 33 carcasses were submitted for library preparation and
377	sequencing at MicrobesNG (Birmingham, UK). Libraries were prepared using the Nextera XT

v2 kit (Illumina, San Diego, USA) and sequenced on the Illumina HiSeq platform, generating
250 base pair paired-end reads.

# 380 **Bioinformatics and genomic analyses**

381 Reads were adapter trimmed by MicrobesNG using Trimmomatic v0.30 (45), and basic statistics 382 determined using QUAST (46) (Table S1). Bacterial species identification was confirmed using 383 Kraken (47). Based on these quality metrics, sequences from two isolates were excluded from 384 further analyses: one due to a low number of reads (<40,000), and another that was identified as 385 B. cereus. There were some further indications that not all cultures were pure B. anthracis, 386 despite multiple rounds of sub-culture (File S1, Table S1). A reference-based mapping approach 387 and strict variant filtering criteria were implemented to minimize the issues associated with the 388 sequence quality while making use of as much of the data as possible.

389	Read mapping and variant calling were performed on the CLIMB computing platform for
390	microbial genomics (48). Trimmed reads were aligned to the chromosome of the Ames Ancestor
391	reference genome (NC_007530) using bwa-mem (version 0.7.17). Picard was used to mark and
392	remove duplicate reads, add read group information, and index the bam files (49). Quality
393	metrics for read mapping were obtained using Qualimap (50) (Table S1). SNPs were detected in
394	individual isolates by VarScan v2.4.4 (51) with parameters set as follows: minimum read depth
395	of 4; minimum base quality of 20; variant allele frequency $\ge 0.95$ . Subsequent SNP curation
396	steps are described in File S1. Custom python scripts for the assessment of read mapping SNP
397	metrics data, variant site filtering and generation of variant call and alignment files (source codes
398	with description of their functionality and usage), along with the final variant call and multiple
399	sequence alignment files are available on GitHub
400	(https://github.com/matejmedvecky/anthraxdiversityscripts).
400 401	( <u>https://github.com/matejmedvecky/anthraxdiversityscripts</u> ). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most
400 401 402	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood
<ul><li>400</li><li>401</li><li>402</li><li>403</li></ul>	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood phylogeny was estimated in IQ-Tree (53) under the Kimura-3-parameters (K3P) model, using
<ul> <li>400</li> <li>401</li> <li>402</li> <li>403</li> <li>404</li> </ul>	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood phylogeny was estimated in IQ-Tree (53) under the Kimura-3-parameters (K3P) model, using 1000 ultrafast bootstrap replicates (54). A distance matrix detailing SNP differences between
<ul> <li>400</li> <li>401</li> <li>402</li> <li>403</li> <li>404</li> <li>405</li> </ul>	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood phylogeny was estimated in IQ-Tree (53) under the Kimura-3-parameters (K3P) model, using 1000 ultrafast bootstrap replicates (54). A distance matrix detailing SNP differences between isolates was constructed using snp-dists v0.6 (https://github.com/tseemann/snp-dists). The
<ul> <li>400</li> <li>401</li> <li>402</li> <li>403</li> <li>404</li> <li>405</li> <li>406</li> </ul>	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood phylogeny was estimated in IQ-Tree (53) under the Kimura-3-parameters (K3P) model, using 1000 ultrafast bootstrap replicates (54). A distance matrix detailing SNP differences between isolates was constructed using snp-dists v0.6 (https://github.com/tseemann/snp-dists). The distance between GPS points was calculated using the pointDistance command in the R package
<ul> <li>400</li> <li>401</li> <li>402</li> <li>403</li> <li>404</li> <li>405</li> <li>406</li> <li>407</li> </ul>	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood phylogeny was estimated in IQ-Tree (53) under the Kimura-3-parameters (K3P) model, using 1000 ultrafast bootstrap replicates (54). A distance matrix detailing SNP differences between isolates was constructed using snp-dists v0.6 (https://github.com/tseemann/snp-dists). The distance between GPS points was calculated using the pointDistance command in the R package <i>raster</i> (55). Isolation by distance was tested using Mantel test to assess the correlation between
<ul> <li>400</li> <li>401</li> <li>402</li> <li>403</li> <li>404</li> <li>405</li> <li>406</li> <li>407</li> <li>408</li> </ul>	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood phylogeny was estimated in IQ-Tree (53) under the Kimura-3-parameters (K3P) model, using 1000 ultrafast bootstrap replicates (54). A distance matrix detailing SNP differences between isolates was constructed using snp-dists v0.6 (https://github.com/tseemann/snp-dists). The distance between GPS points was calculated using the pointDistance command in the R package <i>raster</i> (55). Isolation by distance was tested using Mantel test to assess the correlation between SNP distance and Euclidean geographic distance within the R package <i>adegenet</i> (56). All
400 401 402 403 404 405 406 407 408 409	(https://github.com/matejmedvecky/anthraxdiversityscripts). The alignment of concatenated SNPs was analyzed using ModelFinder to determine the most appropriate model of nucleotide substitution (52). Subsequently, a maximum-likelihood phylogeny was estimated in IQ-Tree (53) under the Kimura-3-parameters (K3P) model, using 1000 ultrafast bootstrap replicates (54). A distance matrix detailing SNP differences between isolates was constructed using snp-dists v0.6 (https://github.com/tseemann/snp-dists). The distance between GPS points was calculated using the pointDistance command in the R package <i>raster</i> (55). Isolation by distance was tested using Mantel test to assess the correlation between SNP distance and Euclidean geographic distance within the R package <i>adegenet</i> (56). All program versions and commands used, the distance matrix, as well as small custom scripts are

411 To place the newly sequenced isolates within the global phylogeny of *B. anthracis*, 80 WGS 412 from GenBank were accessed (Table S2), and a core genome alignment generated using Parsnp 413 v1.1.2 (57). The resulting phylogeny indicated that NCA isolates belong to the Ancient A 414 lineage. To further resolve the diversity among NCA isolates compared with other publicly 415 available isolates from the same lineage, reads from eight additional isolates available on SRA 416 from a study by Bruce et al. 2019 were accessed using fastq-dump from the SRA-toolkit: all 417 isolates (n=4) belonging to the 3.2 linage, and two arbitrarily selected isolates from each the 3.1 418 and 3.3 lineages (Table S2). These were run through our SNP-calling pipeline as described 419 above, resulting in a sequence alignment file free of -/N characters, which was used to infer a 420 phylogeny in RAxML v8.2.11 (58) using a GTR model of nucleotide substitution, and using the 421 Ames Ancestor reference genome as an outgroup.

## 422 Simulation modelling

423 The initial number of genomes in the inoculum was varied between one and 100 genomes to 424 reflect uncertainty in anthrax infectious dose. In each bacterial generation, genomes underwent a 425 round of replication followed by cell division and accordingly population size doubled in each 426 generation. The number of mutations occurring in the replication of each genome was drawn 427 from a Poisson distribution parameterized to reflect the estimated *B. anthracis* mutation rate (i.e. 428  $\lambda = 0.004316$ ). This genome-level mutation rate is based on the genome size of 5.2 million base pairs and a mutation rate of 8.3 x  $10^{-10}$  mutations per site (29); this represents an upper estimate 429 430 of the mutation rate and was chosen as we were interested in estimating the upper limits on 431 reasonable expectation of diversity emerging during the course of an infection initiated by a 432 homogenous dose. Simulations were carried out for up to 30 generations (replication cycles), and 433 results extrapolated to 40 generations, proposed to be the upper limit on the number of

434 replication cycles during an infection (11). Details of simulations run are provided in File S1.

435 Pairs of genomes were repeatedly sampled from these simulated populations and the count of

436 mutations separating each pair was calculated. Sampling was performed 100 times per

437 generation for each simulation. Simulations, sampling of simulated populations, and linear

438 models summarizing trends in the outcome of these processes were performed in R (59).

# 439 **Data availability**

440 Raw sequencing reads are available on European Nucleotide Archive SRA under accession

441 number PRJEB45684.

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# 454 **References**

455	1.	Kao RR, Haydon DT, Lycett SJ, Murcia PR. 2014. Supersize me: how whole-genome
456		sequencing and big data are transforming epidemiology. Trends Microbiol 22:282–91.
457	2.	Carlson CJ, Kracalik IT, Ross N, Alexander KA, Hugh-Jones ME, Fegan M, Elkin BT, Epp
458		T, Shury TK, Zhang W, Bagirova M, Getz WM, Blackburn JK. 2019. The global
459		distribution of Bacillus anthracis and associated anthrax risk to humans, livestock and
460		wildlife. Nat Microbiol 4:1337–1343.
461	3.	WHO. 2008. Anthrax in Humans and Animals. 4th Ed.
462	4.	WHO. 2011. The control of neglected zoonotic diseases. Community-based interventions
463		for prevention and control. Report of the third conference organized with ICONZ, DFID-
464		RIU, Gates Foundation, SOS, EU, TDR and FAO with the participation of ILRI and OIE.,
465		Geneva, Switzerland.
466	5.	Van Ert MN, Easterday WR, Huynh LY, Okinaka RT, Hugh-Jones ME, Ravel J, Zanecki
467		SR, Pearson T, Simonson TS, U'Ren JM, Kachur SM, Leadem-Dougherty RR, Rhoton SD,
468		Zinser G, Farlow J, Coker PR, Smith KL, Wang B, Kenefic LJ, Fraser-Liggett CM, Wagner
469		DM, Keim P. 2007. Global genetic population structure of Bacillus anthracis. PLoS ONE
470		2:e461.
471	6.	Sahl JW, Pearson T, Okinaka R, Schupp JM, Gillece JD, Heaton H, Birdsell D, Hepp C,
472		Fofanov V, Noseda R, Fasanella A, Hoffmaster A, Wagner DM, Keim P. 2016. A Bacillus
473		anthracis genome sequence from the Sverdlovsk 1979 autopsy specimens. mBio 7: e01501-
474		16.

475	7.	Bruce SA, Schiraldi NJ, Kamath PL, Easterday WR, Turner WC. 2020. A classification
476		framework for Bacillus anthracis defined by global genomic structure. Evol Appl 13:935-
477		944.
478	8.	Smith KL, DeVos V, Bryden H, Price LB, Hugh-Jones ME, Keim P. 2000. Bacillus
479		anthracis diversity in Kruger National Park. J Clin Microbiol 38:3780–3784.
480	9.	Simonson TS, Okinaka RT, Wang B, Easterday WR, Huynh L, U'Ren JM, Dukerich M,
481		Zanecki SR, Kenefic LJ, Beaudry J, Schupp JM, Pearson T, Wagner DM, Hoffmaster A,
482		Ravel J, Keim P. 2009. Bacillus anthracis in China and its relationship to worldwide
483		lineages. BMC Microbiol 9:71.
484	10.	Achtman M. 2008. Evolution, population structure, and phylogeography of genetically
485		monomorphic bacterial pathogens. Annu Rev Microbiol 62:53-70.
486	11.	Keim P, Van Ert MN, Pearson T, Vogler AJ, Huynh LY, Wagner DM. 2004. Anthrax
487		molecular epidemiology and forensics: using the appropriate marker for different
488		evolutionary scales. Infect Genet Evol 4:205–213.
489	12.	Fasanella A, Serrecchia L, Chiaverini A, Garofolo G, Muuka GM, Mwambazi L. 2018. Use
490		of Canonical Single Nucleotide Polymorphism (CanSNPs) to characterize Bacillus
491		anthracis outbreak strains in Zambia between 1990 and 2014. PeerJ 6:e5270.
492	13.	Beyer W, Bellan S, Eberle G, Ganz HH, Getz WM, Haumacher R, Hilss KA, Kilian W,
493		Lazak J, Turner WC, Turnbull PCB. 2012. Distribution and molecular evolution of <i>Bacillus</i>
494		anthracis genotypes in Namibia. PLoS Negl Trop Dis 6:e1534.

495	14.	Maho A, Rossano A, Hächler H, Holzer A, Schelling E, Zinsstag J, Hassane MH,
496		Toguebaye BS, Akakpo AJ, Van Ert M, Keim P, Kenefic L, Frey J, Perreten V. 2006.
497		Antibiotic susceptibility and molecular diversity of Bacillus anthracis strains in Chad:
498		detection of a new phylogenetic subgroup. J Clin Microbiol 44:3422–3425.
499	15.	Girault G, Blouin Y, Vergnaud G, Derzelle S. 2014. High-throughput sequencing of
500		Bacillus anthracis in France: investigating genome diversity and population structure using
501		whole-genome SNP discovery. BMC Genomics 15:288.
502	16.	Derzelle S, Girault G, Roest HIJ, Koene M. 2015. Molecular diversity of <i>Bacillus anthracis</i>
503		in the Netherlands: investigating the relationship to the worldwide population using whole-
504		genome SNP discovery. Infect Genet Evol 32:370–376.
505	17.	Derzelle S, Girault G, Kokotovic B, Angen Ø. 2015. Whole genome-sequencing and
506		phylogenetic analysis of a historical collection of Bacillus anthracis strains from Danish
507		cattle. PLoS ONE 10:e0134699.
508	18.	Lienemann T, Beyer W, Pelkola K, Rossow H, Rehn A, Antwerpen M, Grass G. 2018.
509		Genotyping and phylogenetic placement of Bacillus anthracis isolates from Finland, a
510		country with rare anthrax cases. BMC Microbiology 18:102.
511	19.	Lekota KE, Hassim A, Madoroba E, Hefer CA, van Heerden H. 2020. Phylogenomic
512		structure of Bacillus anthracis isolates in the Northern Cape Province, South Africa
513		revealed novel single nucleotide polymorphisms. Infection, Genetics and Evolution
514		80:104146.

515	20.	Carlson CJ, Getz WM, Kausrud KL, Cizauskas CA, Blackburn JK, Bustos Carrillo FA,
516		Colwell R, Easterday WR, Ganz HH, Kamath PL, Økstad OA, Turner WC, Kolstø A-B,
517		Stenseth NC. 2018. Spores and soil from six sides: interdisciplinarity and the environmental
518		biology of anthrax (Bacillus anthracis). Biol Rev Camb Philos Soc 93:1813–1831.
519	21.	Döpfer D, Buist W, Soyer Y, Munoz MA, Zadoks RN, Geue L, Engel B. 2008. Assessing
520		genetic heterogeneity within bacterial species isolated from gastrointestinal and
521		environmental samples: how many isolates does it take? Appl Environ Microbiol 74:3490-
522		3496.
523	22.	Worby CJ, Lipsitch M, Hanage WP. 2014. Within-host bacterial diversity hinders accurate
524		reconstruction of transmission networks from genomic distance data. PLoS Comput Biol
525		10:e1003549.
526	23.	Futse JE, Brayton KA, Dark MJ, Knowles DP, Palmer GH. 2008. Superinfection as a driver
527		of genomic diversification in antigenically variant pathogens. Proc Natl Acad Sci USA
528		105:2123–2127.
529	24.	Sintchenko V, Holmes EC. 2015. The role of pathogen genomics in assessing disease
530		transmission. BMJ 350:h1314.
531	25.	Didelot X, Walker AS, Peto TE, Crook DW, Wilson DJ. 2016. Within-host evolution of
532		bacterial pathogens. Nat Rev Microbiol 14:150-162.
533	26.	Paterson GK, Harrison EM, Murray GGR, Welch JJ, Warland JH, Holden MTG, Morgan
534		FJE, Ba X, Koop G, Harris SR, Maskell DJ, Peacock SJ, Herrtage ME, Parkhill J, Holmes
		25

535	MA. 2015. Capturing the cloud of diversity reveals complexity and heterogeneity of MRSA
536	carriage, infection and transmission. Nat Commun 6:6560.

- 537 27. Alamil M., Hughes J., Berthier K., Desbiez C., Thébaud G., Soubeyrand S. 2019. Inferring
- 538 epidemiological links from deep sequencing data: a statistical learning approach for human,
- animal and plant diseases. Philosophical Transactions of the Royal Society B: Biological
- 540 Sciences 374:20180258.
- 541 28. Beyer W, Turnbull PCB. 2013. Co-infection of an animal with more than one genotype can
  542 occur in anthrax. Lett Appl Microbiol 57:380–384.
- 543 29. Ågren J, Finn M, Bengtsson B, Segerman B. 2014. Microevolution during an anthrax
- outbreak leading to clonal heterogeneity and penicillin resistance. PLoS ONE 9:e89112.
- 545 30. Easterday WR, Ponciano JM, Gomez JP, Van Ert MN, Hadfield T, Bagamian K, Blackburn
- 546 JK, Stenseth NC, Turner WC. 2020. Coalescence modeling of intrainfection *Bacillus*
- 547 *anthracis* populations allows estimation of infection parameters in wild populations. Proc
- 548 Natl Acad Sci USA 117:4273-4280.
- 549 31. Vogler AJ, Busch JD, Percy-Fine S, Tipton-Hunton C, Smith KL, Keim P. 2002. Molecular
  550 analysis of rifampin resistance in *Bacillus anthracis* and *Bacillus cereus*. Antimicrob
  551 Agents Chemother 46:511–513.
- Saile E, Koehler TM. 2006. *Bacillus anthracis* multiplication, persistence, and genetic
  exchange in the rhizosphere of grass plants. Appl Environ Microbiol 72:3168–3174.

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22	4	33.	Braun P, Grass G, Aceti A, Serrecchia L, Anuso A, Marino L, Grimaidi S, Pagano S,
55	5		Hanczaruk M, Georgi E, Northoff B, Schöler A, Schloter M, Antwerpen M, Fasanella A.
55	6		2015. Microevolution of Anthrax from a Young Ancestor (M.A.Y.A.) suggests a soil-borne
55	7		life cycle of Bacillus anthracis. PLoS ONE 10:e0135346.
55	8	34.	Turner WC, Kausrud KL, Beyer W, Easterday WR, Barandongo ZR, Blaschke E, Cloete
55	9		CC, Lazak J, Van Ert MN, Ganz HH, Turnbull PCB, Stenseth NC, Getz WM. 2016. Lethal

· • •

- 560 exposure: An integrated approach to pathogen transmission via environmental reservoirs.
- 561 Sci Rep 6:27311.
- 35. Biek R, Pybus OG, Lloyd-Smith JO, Didelot X. 2015. Measurably evolving pathogens in
  the genomic era. Trends in Ecology & Evolution 30:306–313.
- 36. Dragon DC, Bader DE, Mitchell J, Woollen N. 2005. Natural dissemination of *Bacillus anthracis* spores in northern Canada. Appl Environ Microbiol 71:1610–1615.
- 566 37. Blackburn JK, Ganz HH, Ponciano JM, Turner WC, Ryan SJ, Kamath P, Cizauskas C,
- 567 Kausrud K, Holt RD, Stenseth NC, Getz WM. 2019. Modeling Ro for pathogens with
- 568 environmental transmission: Animal movements, pathogen populations, and local infectious
- zones. Int J Environ Res Public Health 16:954.
- 570 38. 1979. Vultures as carriers of anthrax. J S Afr Vet Assoc 50:35.
- 571 39. Stears K, Schmitt MH, Turner WC, McCauley DJ, Muse EA, Kiwango H, Mathayo D,
- 572 Mutayoba BM. 2021. Hippopotamus movements structure the spatiotemporal dynamics of
- 573 an active anthrax outbreak. Ecosphere 12:e03540.

574	40.	Forde TL, Orsel K, Zadoks RN, Biek R, Adams LG, Checkley SL, Davison T, De Buck J,
575		Dumond M, Elkin BT, Finnegan L, Macbeth BJ, Nelson C, Niptanatiak A, Sather S,
576		Schwantje HM, Van Der Meer F, Kutz SJ. 2016. Bacterial genomics reveal the complex
577		epidemiology of an emerging pathogen in arctic and boreal ungulates. Front Microbiol
578		7:1759.
579	41.	National Bureau of Statistics, Office of Chief Government Statistician. 2013. 2012
580		Population and Housing Census. The United Republic of Tanzania.
581	42.	Mwakapeje ER, Høgset S, Fyumagwa R, Nonga HE, Mdegela RH, Skjerve E. 2018.
582		Anthrax outbreaks in the humans - livestock and wildlife interface areas of Northern
583		Tanzania: a retrospective record review 2006–2016. BMC Public Health 18:106.
584	43.	Lembo T, Hampson K, Auty H, Beesley CA, Bessell P, Packer C, Halliday J, Fyumagwa R,
585		Hoare R, Ernest E, Mentzel C, Mlengeya T, Stamey K, Wilkins PP, Cleaveland S. 2011.
586		Serologic surveillance of anthrax in the Serengeti ecosystem, Tanzania, 1996-2009.
587		Emerging Infect Dis 17:387–394.
588	44.	Aminu OR, Lembo T, Zadoks RN, Biek R, Lewis S, Kiwelu I, Mmbaga BT, Mshanga D,
589		Shirima G, Denwood M, Forde TL. 2020. Practical and effective diagnosis of animal
590		anthrax in endemic low-resource settings. PLOS Neglected Tropical Diseases 14:e0008655.
591	45.	Bolger AM, Lohse M, Usadel B. 2014. Trimmomatic: a flexible trimmer for Illumina
592		sequence data. Bioinformatics 30:2114–2120.
593	46.	Gurevich A, Saveliev V, Vyahhi N, Tesler G. 2013. QUAST: quality assessment tool for
594		genome assemblies. Bioinformatics 29:1072–1075.

595	47.	Wood DE, Salzberg SL. 2014. Kraken: ultrafast metagenomic sequence classification using
596		exact alignments. Genome Biol 15:R46.

- 597 48. Connor TR, Loman NJ, Thompson S, Smith A, Southgate J, Poplawski R, Bull MJ,
- 598 Richardson E, Ismail M, Elwood-Thompson S, Kitchen C, Guest M, Bakke M, Sheppard
- 599 SK, Pallen MJ. 2016. CLIMB (the Cloud Infrastructure for Microbial Bioinformatics): an
- online resource for the medical microbiology community. Microb Genom 2:e000086.
- 601 49. Broad Institute. Picard Tools. Available: http://broadinstitute.github.io/picard/
- 50. García-Alcalde F, Okonechnikov K, Carbonell J, Cruz LM, Götz S, Tarazona S, Dopazo J,
- 603 Meyer TF, Conesa A. 2012. Qualimap: evaluating next-generation sequencing alignment
- 604 data. Bioinformatics 28:2678–2679.
- 51. Koboldt DC, Zhang Q, Larson DE, Shen D, McLellan MD, Lin L, Miller CA, Mardis ER,
- Ding L, Wilson RK. 2012. VarScan 2: somatic mutation and copy number alteration
- discovery in cancer by exome sequencing. Genome Res 22:568–576.
- 52. Kalyaanamoorthy S, Minh BQ, Wong TKF, von Haeseler A, Jermiin LS. 2017.

ModelFinder: fast model selection for accurate phylogenetic estimates. Nature Methods
14:587–589.

- 611 53. Nguyen L-T, Schmidt HA, von Haeseler A, Minh BQ. 2015. IQ-TREE: A Fast and
- 612 Effective Stochastic Algorithm for Estimating Maximum-Likelihood Phylogenies. Mol Biol
- 613 Evol 32:268–274.

- 614 54. Minh BQ, Nguyen MAT, von Haeseler A. 2013. Ultrafast approximation for phylogenetic
  615 bootstrap. Mol Biol Evol 30:1188–1195.
- 616 55. raster: Geographic Data Analysis and Modeling version 3.0-12 from CRAN.
- 617 56. Jombart T. 2008. adegenet: a R package for the multivariate analysis of genetic markers.
- 618 Bioinformatics 24:1403–1405.
- 619 57. Treangen TJ, Ondov BD, Koren S, Phillippy AM. 2014. The Harvest suite for rapid core-
- 620 genome alignment and visualization of thousands of intraspecific microbial genomes.
- 621 Genome Biol 15:524.
- 58. Stamatakis A. 2014. RAxML Version 8: A tool for phylogenetic analysis and post-analysis
  of large phylogenies. Bioinformatics 30:1312-1313.
- 624 59. R Core Team. 2018. R: A language and environment for statistical computing. R
- 625 Foundation for Statistical Computing, Vienna, Austria.
- 626 60. UNEP-WCMC. 2020. Protected Area Profile for Ngorongoro Conservation Area. World
- 627 Database of Protected Areas. Available: www.protectedplanet.net
- 61. Wickham H. 2009. ggplot2: Elegant Graphics for Data Analysis. Springer-Verlag, New
  York.
- 630 62. Pebesma E. 2018. Simple features for R: Standardized support for spatial vector data. The R
  631 Journal 10:439–446.

632	63.	Yu G, Smith DK, Zhu H, Guan Y, Lam 11-Y. 2017. ggtree: an R package for visualization
633		and annotation of phylogenetic trees with their covariates and other associated data.
634		Methods Ecol Evol 8:28–36.
635	64.	Ciccarelli FD, Doerks T, Mering C von, Creevey CJ, Snel B, Bork P. 2006. Toward
636		automatic reconstruction of a highly resolved Tree of Life. Science 311:1283–1287.
637	65.	Hsieh TC, Ma KH, Chao A. 2016. iNEXT: an R package for rarefaction and extrapolation
638		of species diversity (Hill numbers). Methods Ecol Evol 7:1451–1456.

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# 640 Figures



642 Fig 1. Hierarchical levels at which the genomic diversity of *Bacillus anthracis* was studied.

643 1. Sequenced isolates originating from livestock carcasses sampled throughout the anthrax

644 hyperendemic Ngorongoro Conservation Area (NCA), northern Tanzania, (shown as grey dots in

- 645 panel 1) were categorized into four geographical groups (colored circles); 2. A subset of these
- 646 isolates were from spatio-temporally linked pairs of carcasses (n = 4, represented by grey shapes
- in panel 1), referred to as 'epidemiological clusters'; 3. Multiple isolates (n = 2-4; represented by

- 648 asterixis) were sequenced from individual carcasses, either originating from multiple sample
- 649 types (e.g. tissue and blood), and/or multiple isolates sequenced from a single sample. The shape
- 650 file for the NCA was provided by Tanzania National Parks (TANAPA) (60).
- 651





654 **Conservation Area within the global population.** A) Global phylogeny of *B. anthracis*,

showing the major clades (A, B, and C) and sub-lineages. This tree was estimated based on a

656 core single nucleotide polymorphism (SNP) phylogeny of 80 publicly available genomes (Table

657 S2). B) Maximum likelihood phylogenetic tree of the Ancient A lineage (Cluster 3 based on

Bruce et al., 2019). All isolates from the Ngorongoro Conservation Area (NCA) form a

monophyletic lineage within Cluster 3.2, along with the publicly available isolate A2075

660 (SRR2968187) isolated in 1999 from a baboon in central Tanzania. This tree was inferred using

the general time reversible (GTR) model of nucleotide substitution, using the Ames Ancestor

reference genome (NC\_007530) as an outgroup. Tree scales reflect number of substitutions per

663 site.



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665 Fig 3. Phylogeography of *Bacillus anthracis* in the hyperendemic area of the Ngorongoro 666 Conservation Area, Tanzania. A) Spatial distribution of carcasses from which B. anthracis 667 isolates were obtained. The map outlines the Ngorongoro Conservation Area (NCA) and shows 668 its location in northern Tanzania (outlined in red in inset). Carcasses were assigned to four 669 geographical groups within the NCA based on spatial proximity, shown by colored circles. B) 670 Maximum likelihood tree estimating the phylogenetic relationship among *B. anthracis* isolates 671 from the NCA. This tree is based on an un-gapped alignment of 125 high quality core single 672 nucleotide polymorphisms (SNPs) across the whole chromosome, rooted to the Ames Ancestor 673 reference sequence (NC 005730) and including the publicly available isolate A2075 674 (SRR2968187) originating from central Tanzania. Using the more closely related isolates from 675 Cluster 3.2 as an outgroup produced the same root position. Isolates are colored on the tree based 676 on their collection site (geographical group) within the NCA. Epidemiological clusters of cases

- (pairs of carcasses sampled from the same or neighboring households on the same or consecutive
  days) are distinguished by symbol shape. Letters distinguish the 22 unique genotypes (SNP
  profiles) detected. Isolate-labelled versions of these figures can be found as Fig. S4 and S5 in the
  Supporting Information. The base earth, river and lake data for the map were downloaded from
  Natural Earth (<u>https://www.naturalearthdata.com/</u>). Figure was plotted in R v.3.6.1 with *ggplot2*(61), with the addition of the *sf* (62) and *ggtree* (63) packages.
- 683



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686 isolates from hierarchical spatial scales. Violin plots comparing pairwise nucleotide (SNP)

- 687 differences between all *B. anthracis* isolates from the Ngorongoro Conservation Area versus
- 688 SNP differences between isolates from i) within the same geographical group; ii) within the same
- 689 epidemiological cluster (but not from the same carcass); and iii) within a single carcass. Central

- 690 boxplot shows median and interquartile range, with whiskers showing minimum and maximum
- 691 values.
- 692





694 Fig 5. Within-host diversity of Bacillus anthracis among livestock in the Ngorongoro 695 Conservation Area. A) Circularized maximum likelihood tree – based on high quality core 696 single nucleotide polymorphisms (SNPs) – displayed as a cladogram (branch-lengths ignored), 697 rooted to Ames Ancestor reference genome (NC 005730). Isolates from the same carcass are 698 shown in the same color and are linked by inner connecting lines. Isolates without labels are 699 singletons (i.e. only one isolate sequenced per carcass site). Sample type is shown by the 700 different symbol shapes indicated in the legend. The figure was prepared using iTOL (64). For 701 labeled taxa, see Fig. S7. B) Histogram showing the relative frequency of pairwise SNP 702 differences among B. anthracis isolates collected from the same carcass. Red line shows 99% 703 upper limit of nucleotide differences observed among sampled pairs of genomes based on 704 simulation of within host evolution. Results suggest that almost all diversity observed within the 705 same infected host is the result of a heterogenous inoculum.



Fig 6. Simulation of within-host populations and sampling of resulting genetic diversity.
Box and whiskers plots show the proportion of genomes across simulated populations that differ
from the founding genome by either one nucleotide (A) or by two nucleotides (B). Boxes

710 represent the interquartile range with a line showing the median and with outliers shown as 711 points. Both boxes and outliers are colored by inoculum size (dose) according to the legend. 712 Simulations were run for 25 generations, or 20 generations for larger inoculum sizes. Greater 713 stochastic heterogeneity was observed for lower starting doses. Note that in (B), only outliers are 714 visible as the proportions observed were very low. C) Bar-plot showing the relationship between 715 inoculum size (dose) and single nucleotide polymorphism (SNP) distances between pairs of 716 sampled genomes. Bars represent average proportions of pairwise SNP differences between 717 genomes sampled from simulated within-host populations. Populations were simulated from 718 various inoculum sizes and were sampled in the 20<sup>th</sup> generation after 19 replication cycles. Fifty 719 simulations were run from an initial dose of 20, and 100 simulations were run from each of the 720 other inoculum sizes, with each simulated population sampled 100 times in each generation. D) 721 Bar-plot showing the relationship between the number of replication cycles and SNP distances 722 between pairs of sampled genomes. Populations were simulated for 25 generations and samples 723 taken in generations 20-25 are represented in shades of grey according to the legend. Proportions 724 are averaged across simulations initiated with inoculum sizes of 1, 2, 5, 10 and 20 and sampled 725 repeatedly.

A. Clonal transmission





### 727 Fig 7. Conceptual framework for the acquisition of within-host diversity of *Bacillus*

728 anthracis. Colors represent different genotypes of B. anthracis (with multiple nucleotide 729 differences), while different shades (i.e. light green) represent single nucleotide variants arising 730 during the course of infection. Vertical black lines represent the environment (e.g. soil, water) 731 from which subsequent cases of anthrax arise through exposure to *B. anthracis* spores. A) 732 Example of infections stemming from small transmission bottleneck (inoculum of few spores), 733 resulting in primarily clonal transmission. Where the bottleneck is narrow, a limited number of 734 genotypes could comprise the inoculum, regardless of the number of variants present in the 735 environment. A small number of SNPs may arise during the course of infection (see Figs 5B and 736 6), but are unlikely to be transmitted unless they arise early during the course of infection. These 737 variants rarely differ from the founding genotype by > 1-2 SNPs (Table S5). B) Example of 738 infections stemming from a wide bottleneck (infectious dose with multiple spores), wherein 739 sufficient numbers of spores comprise the inoculum such that multiple genotypes present in the 740 environmental source may seed initial and subsequent infections. Our results strongly support 741 heterogenous transmission (B), either from single or multiple carcass sites, and a large 742 transmission bottleneck. Figure adapted from Ågren et al., 2014.

743

# 744 Supporting Information

#### 745 Fig S1. Rarefaction curve of *Bacillus anthracis* genotypic diversity within the study area.

746Based on inclusion of all isolates sequenced (n = 73, left) and on all isolates that were not747sampled as part of an epidemiological cluster (n = 51, right), which might be expected to be non-

748 independent. Results suggest genotypes within this population have been exhaustively sampled

- 749 (i.e. that further sampling would not be expected to reveal additional genotypes). Figure
- 750 generated in R package iNEXT (65).

## 751 Fig S2. Histogram showing the relative frequency of pairwise nucleotide (SNP) differences

- among *B. anthracis* isolates. Includes 73 isolates from the Ngorongoro Conservation Area,
- 753 northern Tanzania.

## 754 Fig S3. Scatter plots showing the number of nucleotide differences as a function of

755 geographic difference between the sampling locations. Geographic distance (in meters) is

- shown on the x-axis versus nucleotide differences on the y-axis, with each point representing a
- pair of isolates. A) All *Bacillus anthracis* isolates from the study area. B) The same relationship
- is observed when limited to isolates from the dominant clade; this was done in order to account
- 759 for deeper divergences potentially obscuring patterns.

#### 760 Fig S4. Locations of carcasses sampled within the Ngorongoro Conservation Area,

- 761 northern Tanzania. Each carcass is assigned a unique identifier (Table S1). Epidemiological
- 762 clusters are the same as those explained for Fig 3 and Fig S5.

## 763 Fig S5. Phylogenetic relationship among *Bacillus anthracis* isolates from the Ngorongoro

764 Conservation Area. Estimated through maximum likelihood, based on high quality core SNPs.

765 Geographic groups and epidemiological clusters are the same as those explained for Fig 3. Each

- isolate is attributed to a carcass ID, with the sample type indicated following the underscore (B =
- blood, D = soil, I = insect, S = swab, T = tissue). A number follows the sample type if more than
- 768 one isolate was sequenced from the same sample.
- 769 Fig S6. Genotypes of *Bacillus anthracis* observed in isolates from within and between pairs
- 770 of carcasses from the same epidemiological clusters (C1-4). Genotype letters correspond to

those in Fig 3 and Fig S5. Individual carcasses are numbered /1 or /2. In cluster C3, two isolates were from a soil sample (C3/1) collected at the same household as the two cases (C3/2 and C3/3); genotype T from this soil sample was shared with an isolate from C3/2. Otherwise, only in C2 was there evidence of a shared genotype between pairs of carcasses (genotype A). Thus, the level of sampling conducted here (1-4 isolates per carcass) did not produce evidence for the

same combinations of genotypes being found among linked carcasses.

## 777 Fig S7. Within-host diversity of *Bacillus anthracis* isolated from livestock in the

778 Ngorongoro Conservation Area of northern Tanzania. This circularized maximum likelihood

tree – based on high quality core single nucleotide polymorphisms – is displayed as a cladogram

780 (branch-lengths ignored). Isolates from the same carcass are shown in the same colour and linked

781 by inner connecting lines. Isolates in black are singletons (i.e. only one isolate sequenced per

782 carcass site). The figure was prepared using ITOL (64).

## 783 Fig S8. Proportion of simulated within-host populations identical to the inoculating genome

784 over 25 generations. Populations were simulated from homogenous inoculating doses of

varying size (A-G) and each line tracks a single simulated population through generations.

Represented are 100 simulations run for 25 generations from doses 1, 2, 5 and 10; 50 simulations

run for 25 generations (dose 20); 100 simulations run for 20 generations from doses 50 and 100

and 7 simulations run for 25 generations from inoculum dose of 50.

## 789 Fig S9. Proportion of simulated within-host populations differing from the inoculating

790 genome by one nucleotide (SNP). Populations were simulated from homogenous inoculating

- 791 doses of varying size (A-G) and each line tracks a single simulated population through
- generations. Represented are 100 simulations run for 25 generations from doses 1, 2, 5 and 10;

793	50 simulations run for 25 generations (dose 20); 100 simulations run for 20 generations from
794	doses 50 and 100 and 7 simulations run for 25 generations from inoculum dose of 50.
795	Fig S10. Proportion of simulated within-host populations differing from the inoculating
796	genome by two nucleotides (SNPs). Populations were simulated from homogenous inoculating
797	doses of varying size (A-G) and each line tracks a single simulated population through
798	generations. Represented are 100 simulations run for 25 generations from doses 1, 2, 5 and 10;
799	50 simulations run for 25 generations (dose 20); 100 simulations run for 20 generations from
800	doses 50 and 100 and 7 simulations run for 25 generations from inoculum dose of 50.
801	Table S1. Metadata and sequence quality metrics of <i>Bacillus anthracis</i> isolates included in
802	this study. Each isolate is attributed to a carcass ID, with the sample type indicated following the
803	underscore (B = blood, D = soil, I = insect, S = swab, T = tissue). A number follows the sample
804	type if more than one isolate was sequenced from the same sample.
805	Table S2. Publicly available <i>Bacillus anthracis</i> isolates included to contextualize those from
806	the Ngorongoro Conservation Area. Sheet 1: Publicly available global collection of assembled
807	B. anthracis genomes. Sheet 2: Publicly available sequence data for Ancient A isolates, available
808	on SRA.
809	Table S3. Identical isolates found from different geographical groups.
810	Table S4. Identical or nearly identical isolates from carcasses sampled several months
811	apart.
812	Table S5. Single nucleotide polymorphism (SNP) distances among pairs of isolates sampled
813	from simulated within-host populations of Bacillus anthracis. Proportion of pairs of isolates

41

- 814 in evolved populations with different SNP distances across varying initial inoculum size (dose),
- 815 sampled in generations 20 and 25, and mean SNP differences across sampled pairs.
- 816 File S1. Supplementary methods and results.