1 Conservation management strategy impacts inbreeding and genetic load

2 in scimitar-horned oryx

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23 Keywords:

- 24 *Ex-situ* populations, runs of homozygosity (ROH), deleterious mutations, reintroduction,
- 25 effective population size, antelope conservation

26 Abstract

27 In an age of habitat loss and overexploitation, small populations, both captive and wild, are 28 increasingly facing the effects of isolation and inbreeding. Genetic management has therefore 29 become a vital tool for ensuring population viability. However, little is known about how the 30 type and intensity of intervention shape the genomic landscape of inbreeding and genetic 31 load. We address this using whole genome sequence data of scimitar-horned oryx (Oryx dammah), an iconic antelope that has been subject to contrasting management strategies 32 since it was declared extinct in the wild. We show that unmanaged populations are enriched 33 for long runs of homozygosity (ROH) and have significantly higher inbreeding coefficients than 34 managed populations. These patterns were associated with a partial deficit of highly 35 deleterious mutations but a considerable excess of weakly deleterious mutations. These 36 37 findings emphasise the risks associated with multiple generations of inbreeding and highlight 38 the complex dynamics of mutation accumulation and purging in captivity. As wildlife management strategies continue to diversify, our study reinforces the importance of 39 40 maintaining genome-wide variation in vulnerable populations and has direct implications for 41 one of the largest reintroduction attempts in the world.

42 Significance statement

43 The preservation of genetic variation has long been recognised as a critical component of 44 conservation management. However, recent observations in small and isolated populations 45 have led some to challenge this paradigm. We investigate the impact of contrasting management strategies on the genomic landscape of inbreeding and genetic load in captive 46 47 populations of scimitar-horned oryx. We reveal how several decades of management have prevented the formation of long runs of homozygosity and buffered the impacts of deleterious 48 49 mutations. Our findings validate consensus thinking on the importance of genome-wide variation for population viability and have direct implications for future management of 50 51 threatened species.

52 Main text

53 Introduction

Captive populations have become an essential insurance against extinctions in the wild (1). 54 55 However, due to inbreeding and drift, they are intrinsically vulnerable to reduced genetic variation and the expression of partially recessive deleterious mutations (2-6). It is therefore 56 57 of paramount importance that appropriate plans are in place to safeguard their potential as 58 source populations. Ex-situ management strategies fall along a continuum from high-intensity pedigree-based breeding (7), to low-intensity pedigree-free group management (8, 9), to a 59 complete absence of breeding intervention whatsoever. Empirical evidence on how these 60 approaches influence the combined landscape of inbreeding and deleterious variation is 61 62 limited (10, 11). As wildlife management strategies begin to diversify (12–15), there is a pressing need to leverage current genomic techniques to validate consensus thinking on 63 maximising genetic diversity and minimising inbreeding in captivity and beyond (16-18). 64

Alongside this, recent debate on the significance of neutral genetic variation in conservation 65 biology has raised practical considerations for sourcing populations for restorations (19–23). 66 67 For example, an increasing number of studies are uncovering genomic evidence for purging 68 in the wild (24–29), some of which have used this to challenge the small population paradigm 69 (25, 26). Furthermore, simulation-based studies on the interaction between effective 70 population size, genetic variation and extinction risk have called for more emphasis on 71 functional genomic variation in genetic rescue attempts (21, 22). These observations go 72 against decades of empirical and theoretical work in favour of maximising genetic variation to 73 enhance population viability (30-33) including recent studies highlighting the complex 74 dynamics of deleterious mutation frequencies in small populations (34–38). Founder selection 75 for translocations rests on a complex set of considerations, with genetics making up only one 76 component (39). In most cases, conservation practitioners will favour a unifying strategy to 77 minimise risk and maximise return (40-42). In light of this, empirical data on the patterns of 78 inbreeding and deleterious mutations in species undergoing active conservation management 79 is urgently required.

Ex-situ populations of scimitar-horned oryx provide an excellent opportunity to evaluate the genomic consequences of management in the context of a global reintroduction. This iconic antelope was once widespread across North Africa, yet during the 20th century, hunting and land-use competition led to their rapid population decline and eventual extinction from the wild (43). Prior to disappearing, captive populations had already been established from what is 85 thought to be less than 100 animals originating from Chad in the 1960s (43). In the following 86 years, the *ex-situ* population has grown to reach approximately 15,000 individuals (44). 87 Around 1,000 of these are held within coordinated breeding programmes, but the vast majority are held in collections in places like Texas and the Arabian Peninsula where little to no genetic 88 89 management takes place. Crucially, the scimitar-horned oryx is now being reintroduced back 90 into its former range and *ex-situ* populations with varying management strategies have been 91 used to source individuals for release. Here, we use runs of homozygosity (ROH) and 92 predicted deleterious mutations to evaluate the impacts of captive-breeding practices on 93 inbreeding and genetic load in scimitar-horned oryx, and discuss the implications for its 94 ongoing management.

95 **Results**

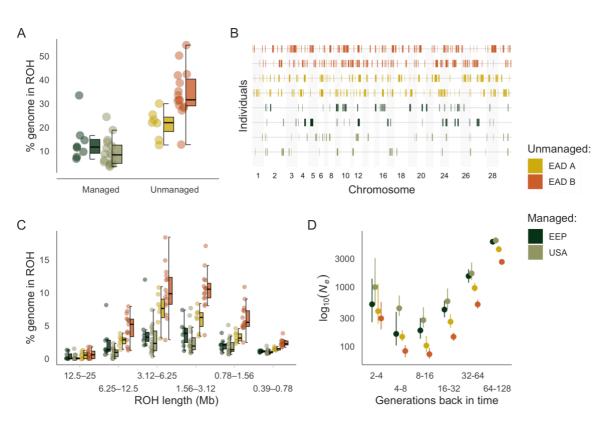
We generated whole-genome sequence data for 49 scimitar-horned oryx from four ex-situ 96 populations. Two of these, the EAZA *Ex situ* Programmes (EEP, n = 8) and the USA (n = 17), 97 98 represent captive populations where genetic management practices are in place. The USA 99 population comprised individuals from both privately owned ranches and institutions within the 100 AZA Species Survival Plan ® (SSP). The remaining populations from the Environment Agency - Abu Dhabi originate from two genetically unmanaged collections in the United Arab Emirates 101 102 (EAD A: n = 9 and EAD B: n = 15). Census sizes for the EEP and SSP population are 103 approximately 619 and 223 respectively while those for EAD A and EAD B are approximately 104 3,000 and 70. For further details on population origins, management strategies and sampling 105 approach, please refer to the Supplementary Material.

106 High coverage sequencing (~15X) was performed for 20 of the individuals and the remaining 29 were sequenced at a lower depth (6-8X, Table S1). Sequencing reads were mapped to 107 108 the scimitar-horned oryx reference genome (45) and to account for coverage biases, SNPs 109 and genotype likelihoods were called after downsampling high coverage individuals (see Methods for details). Analysis of population structure using NGSadmix and PCAngsd detected 110 differentiation between the four sampling groups (Figures S2-4). Individual admixture 111 112 proportions highlighted two major ancestral source populations (Figures S2A), with further hierarchical structure being resolved up to values of K=4 (Figures S2B and S3), corresponding 113 to the four *ex-situ* groups. PCA distinguished EEP and USA populations as discrete clusters 114 115 along PC2 and PC3, while EAD A and EAD B clustered separately along PC1 (Figure S4).

116 Levels of inbreeding across management strategies

- 117 To investigate how genomic patterns of inbreeding vary with management strategy, we
- 118 examined the ROH landscape across individuals (Figure 1). The average number and total
- length of ROH was 247 (min = 65, max = 638) and 2.0 Mb (0.5-22.0 Mb) respectively, which
- 120 on average spanned 20% of the autosomal genome (min = 0.03, max = 0.55, Figure 1A and
- 121 Figure S6). Oryx from managed populations had significantly lower inbreeding coefficients
- 122 (F_{ROH}) than oryx from unmanaged populations ($\beta = -0.19, 95\%$ Cl = $-0.24--0.14, P = 6.43^{e-9}$,
- 123 Figure 1A). This pattern was driven by both the number and length of ROH, the former being
- almost three times higher in the most inbred population than in the least inbred population
- 125 (Figure 1B and Figure S7).





127 Figure 1. Runs of homozygosity (ROH) landscape across contrasting management strategies of

128 scimitar-horned oryx. (A) Distribution of FROH among scimitar-horned oryx management strategies. 129 Values were multiplied by 100 to reflect the percentage of the autosomal genome in ROH. Centre lines of boxplots reflect the median, bounds of the boxes reflect the 25th and 75th percentile and upper and 130 131 lower whiskers reflect the largest and smallest values. (B) ROH in the two individuals with intermediate 132 inbreeding coefficients FROH from each population. (C) Distribution of ROH within different length 133 classes. Data points represent the percentage of ROH of a given length within an individual's autosomal 134 genome. (D) Effective population size estimates inferred from the mean F_{ROH} in a population for a given 135 time-period (see Methods for details). Error bars represent 95% bootstrap confidence intervals.

136 **ROH length distribution and recent demography**

137 We also observed variation in the abundance of ROH across different length classes. There 138 was a steep decrease in frequency of ROH above lengths of around 6.25 Mb (Figure 1C). 139 ROH longer than this made up a relatively small fraction of the genome, reaching a minimum 140 average frequency of 0.4% between 12.5-25 Mb. ROH between 3.12-6.25 Mb had the 141 highest frequency, making up on average 6.2% of an individual's genome. This pattern of abundance was observed in each population however there was variation in absolute 142 proportions across individuals. For example, the most abundant length class 3.12-6.25 Mb 143 made up on average only 3% of the genome in the least inbred population, USA, while it 144 comprised on average 10% in the most inbred population, EAD B (Figure 1C). Interestingly, 145

long ROH >12.5 Mb which are likely the result of recent inbreeding, were identified in less than
30% of individuals from managed populations, yet were present in over 60% of individuals
from unmanaged populations.

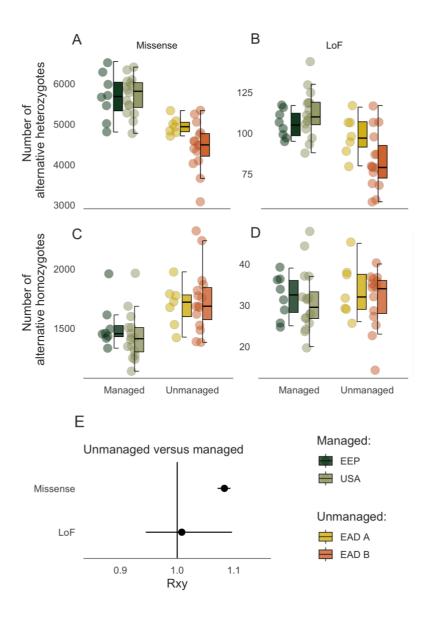
149 As ROH lengths decrease, their underlying haplotypes are expected to have originated from ancestors further back in time (Thompson 2013). The abundance of ROH in different length 150 classes can therefore provide insights into past changes in effective population size (N_e) (46, 151 152 47). In line with this, our estimates of N_e based on individual inbreeding coefficients were 153 proportional to patterns of ROH abundance (Figure 1D). Ne declines to reach a minimum of 154 around 150 individuals between 8–16 generations ago, after which it shows a steady increase 155 towards the present day. Interestingly, despite small census sizes, managed populations had higher N_e estimates across all time periods than unmanaged populations (mean N_e : USA = 156 1,672, EEP = 1,429 versus EAD A = 1,028, EAD B = 625). These patterns were reflected in 157 158 estimates of mean pairwise nucleotide diversity which were also higher in managed (USA = 0.46×10^5 , EEP = 0.44×10^5) than unmanaged populations (EAD A = 0.42×10^5 , EAD B = 159 160 0.27 x 10⁵).

161 Mutation load landscape across management strategies

We next investigated how genetic load varies across management strategies using two 162 approaches, both based on putative deleterious variants identified using annotation-based 163 164 methods. As the overall patterns were qualitatively similar across two variant effect prediction programs (Figure S8), results using annotations from SnpEff are presented here. We first 165 166 explored the present and potential impacts of putatively deleterious mutations by estimating two components of genetic load; inbreeding and drift load (Bertorelle et al. 2022, see Methods 167 168 for details). Inbreeding load corresponds to the potential reduction in population fitness due to the burden of recessive deleterious mutations that may become homozygous through 169 170 inbreeding. It was approximated as the absolute number of missense and loss of function 171 heterozygotes per individual. Drift load corresponds to a reduction in fitness of a population 172 due to the increased frequency and fixation of deleterious mutations. It was approximated as 173 the absolute number of alternative missense and loss of function homozygotes per individual.

174 Inbreeding load for both missense and loss of function mutations was consistently higher in 175 managed than unmanaged populations (Missense: $\beta = 1079$, 95% CI = 769–1390, $P = 1.12^{e-1}$ 176 ⁸, LoF: $\beta = 21.7$, 95% CI = 12.7–30.6, $P = 1.51^{e-5}$, Figure 2A–B). As expected, this pattern 177 inversely tracked overall inbreeding levels, where individuals with lower inbreeding coefficients 178 had a larger number of heterozygotes at missense and loss of function sites (Figure S9). In 179 direct contrast, the drift load for weakly deleterious missense mutations was lower in managed

populations than in unmanaged groups ($\beta = -267$, 95% CI = -398--137, $P = 1.65^{e-4}$, Figure 2C). Interestingly, the drift load for highly deleterious loss of function mutations displayed no difference across management strategies, with similar numbers of alternative homozygotes present among individuals ($\beta = 0.89$, 95% CI = -3.07-4.86, $P = 6.5^{e-1}$, Figure 2D).



184 Figure 2. Deleterious load landscape across contrasting management strategies of scimitar-185 horned oryx based on SNPeff annotations. Distribution of the number of heterozygotes per individual 186 (inbreeding load) for missense (A) and loss of function mutations (B) across management strategies. 187 Distribution of the number of alternative homozygotes per individual (drift load) for missense (C) and loss of function (D) mutations across management strategies. (E) Relative number (Rxy) of alternative 188 189 alleles at missense and loss of function sites. Rxy > 1 indicates a relative frequency excess of a given 190 category of sites in unmanaged versus managed populations. Error bars represent 95% bootstrap 191 confidence intervals.

192 We next used the measure Rxy to determine whether there was an excess of putative deleterious mutations in one management strategy over another. Rxy compares the relative 193 194 frequency of derived alleles within a given impact category and is standardised over a set of 195 intergenic SNPs, making it robust to population-specific biases. Overall, unmanaged 196 populations displayed a significant excess of missense mutations compared to the managed 197 populations (Figure 2E), indicating an accumulation of weakly deleterious mutations in the 198 unmanaged groups. In contrast, no difference in the frequency of highly deleterious loss of 199 function mutations could be detected between the management groups (Figure 2E).

200 Discussion

The scimitar-horned oryx was declared Extinct in the Wild in 2000, yet the species has persisted *ex-situ*. Understanding how management shapes the genomic landscape of inbreeding and genetic load is essential for improving species viability. We used whole genome resequencing data to characterise runs of homozygosity and deleterious mutations in scimitar-horned oryx populations undergoing contrasting management strategies. Our study highlights the complex dynamics between inbreeding, genetic load and population size and has broad-reaching implications for practical conservation management.

208 We first demonstrated how signatures of recent population history can be identified in the 209 genomes of present-day animals. Across ex-situ oryx populations, both managed and 210 unmanaged, we observed a peak in ROH abundance between 3.12–6.25 Mb. Although it is 211 not possible to precisely estimate the time to the most recent common ancestor (MRCA) when ROH are inferred using physical positions (49), ROH of this size are expected to originate 212 213 from haplotypes approximately 8–16 generations ago (50). This shift in abundance indicates 214 a smaller population size around this time-period which we could reconstruct with our 215 measures of N_e . Interestingly, assuming a generation time of around seven years (44), this 216 directly corresponds to the mid 20th century when oryx were close to extinction in the wild and when *ex-situ* populations were founded (15, 43). These findings highlight the power of ROH 217 218 for inferring the strength and timing of recent bottlenecks and for placing contemporary 219 patterns of nucleotide diversity into a historical context.

The overall pattern of ROH abundance was qualitatively similar across populations yet the absolute proportion of the genome in ROH was considerably lower in managed than unmanaged populations for all length classes. Long ROH are indicative of recent inbreeding because recombination has had little opportunity to break up haplotypes (51–54). The relative absence of long ROH therefore strongly indicates that close inbreeding is uncommon in

managed populations, which work to mitigate this process. Furthermore, the smaller 225 226 proportion of short ROH suggest these populations also have lower levels of background 227 relatedness (53, 55). Although historic data on the origins of the unmanaged populations are lacking (15), it is not unreasonable to expect a higher level of relatedness among founder 228 229 individuals compared to those of breeding programmes. Overall, these findings reveal the genomic effects of multiple generations of inbreeding, while on the other hand demonstrate 230 231 how 30-40 years of ex-situ management has been successful at maximising the genetic 232 diversity of captive populations.

233 We next shed light on the relationship between inbreeding, diversity and deleterious mutations 234 by exploring how proxies for genetic load compare across management strategies. At an 235 individual level, we show that animals from collections employing genetic management 236 practices have a higher inbreeding load for both missense and loss of function mutations than 237 animals from unmanaged populations. Theory and simulations (23, 56, 57) predict that in large 238 populations, higher frequencies of segregating deleterious mutations will lead to higher inbreeding load. This is in part due to being masked from the effects of purifying selection in 239 240 populations with larger N_{e} , but also by genetic drift driving deleterious mutations to fixation in 241 small populations. In line with this, we show that despite their small census sizes, managed 242 populations of oryx have higher nucleotide diversity and effective population sizes than 243 unmanaged collections.

The presence of segregating deleterious variation within insurance populations may be 244 considered a concern for conservation management. Indeed, there has been recent debate 245 surrounding the risks associated with sourcing individuals for restoration from large, 246 247 genetically diverse populations, given the higher expected levels of masked load (21, 22). However, these concerns are unlikely to be relevant for restoration and reintroduction 248 249 programs that follow established recommendations (39). Notably, as advised by IUCN/SSC 250 guidelines, sourcing individuals from genetically differentiated populations, releasing large 251 numbers of animals over extended time frames and maximising initial population growth rate 252 all serve to increase genetic variation and prevent the inbreeding load from being expressed 253 (19, 58–60). The scimitar-horned oryx reintroduction plan has followed these best practice 254 guidelines having so far released over 250 animals over a five-year time-period, and in eight 255 separate release batches. Consequently, the released population has now reached close to 400 individuals, with over 150 calves born in the wild. Follow-up monitoring of the release 256 257 herds will provide a rare opportunity to validate these efforts within the context of a large-scale reintroduction effort. 258

259 In addition to the inbreeding load, we also considered how drift load varies across populations. 260 Several recent studies have demonstrated significant reductions in the relative number of highly deleterious mutations in small versus large (24-26, 29, 37) and in modern versus 261 historical populations (27, 28), and attributed these differences to the effects of purifying 262 263 selection. While we did not observe a complete reversal in the patterns of drift load for loss of 264 function mutations, we did see a reduction in frequency relative to missense mutations in unmanaged collections. In small inbred populations, partially recessive deleterious mutations 265 266 will be expressed as homozygotes thereby exposing them to the effects of purifying selection 267 (62-64). However, as selection strength declines with decreasing N_e , fewer deleterious mutations are expected to be removed through purging (65, 66). In line with this, we also show 268 269 that unmanaged collections have accumulated a considerable burden of weakly deleterious 270 mutations compared to managed populations.

271 Recent studies distinguishing weakly and strongly deleterious mutations and different genetic 272 load components have uncovered equivalent patterns in wild populations (34, 36, 38). Taken together, our results provide further support for the notion that the presence of purging of 273 274 large-effect mutations does not imply the absence of inbreeding depression (19, 23). This is 275 consistent with recent studies on a small population of Soay sheep (Ovis aries), where long-276 term fitness and genomic data revealed strong inbreeding depression caused largely by many 277 weakly deleterious mutations (35, 67). Consequently, despite some evidence for purging, 278 unmanaged populations of oryx are likely to carry a higher fitness cost associated with 279 inbreeding. With regard to their long-term genetic management, this would imply a need for 280 reciprocal transfer of individuals between ex-situ collections. Not only would this serve to 281 reduce inbreeding, but would produce populations with enhanced genetic diversity for 282 enabling adaptation to changing environmental conditions and for release back into the wild. 283 As part of the World Herd approach (68), mixing of animals from multiple collections is now a 284 key part of the scimitar-horned oryx reintroduction management strategy.

285 Ex-situ breeding and species reintroduction planning are ultimately exercises in risk management, with genetics making up only one component of a multifaceted set of 286 287 considerations (39). Overall, our study provides empirical support for the value of genetic 288 management of ex-situ populations and reinforces the risks associated with multiple 289 generations of inbreeding. These findings advocate for a strategy in line with conventional 290 wisdom to maintain genetic variation and maximise differentiation in captive populations and 291 restoration programmes (7, 60, 69–72). While such actions will be possible using largely traditional measures of genetic variation, our study demonstrates how the application of whole 292 293 genome sequencing in the context of *ex-situ* management has the power to resolve previously

unknown aspects of variation. We recognise that it is impractical to consider comprehensive
genomic approaches for the genetic management of every species (73). Rather, we suggest
the application of studies such as this to guide conservation breeding strategies across diverse
taxa. When combined with best-practice guidelines, this approach will help lead to healthy
populations, with the greatest chance of survival.

299 Materials and methods

300 Sampling and sequencing

301 Blood (in EDTA) and tissue (in 100% ethanol) samples were collected for whole genome 302 resequencing from 49 scimitar-horned oryx representing four *ex-situ* populations: the EEP (n 303 = 8), USA (n = 17), EAD A (n = 9) and EAD B (n = 15). The EEP and USA are captive collections undergoing genetic management practices, while EAD A and EAD B represent 304 collections in the United Arab Emirates with no genetic management in place (Supplementary 305 Methods). Total genomic DNA was extracted between one and five times per sample using 306 the DNeasy Blood and Tissue Kit (Qiagen, Cat. No. 69504). Elutions were pooled and 307 concentrated in an Eppendorf Concentrator Plus at 45°C and 1400 rpm until roughly 50 µl 308 remained. Library construction was carried out using the Illumina TruSeq Nano High 309 Throughput library preparation kit (Illumina CA, UKA). Twenty samples from across all four 310 311 populations were 150 bp paired-end sequenced on an Illumina HiSeg X Ten platform at a target depth of coverage of 15X. The remaining 29 samples from three of the populations were 312 150 bp paired-end sequenced on an Illumina NovaSeq 6000 instrument at a target depth of 313 314 coverage of 7X (Table S1).

315 Read processing and alignment

Sequence reads were assessed for quality using FastQC v0.11.7 (74) and trimmed for adaptor 316 317 content using cutadapt v1.16 (75). Reads were then mapped to the scimitar-horned oryx reference genome assembly (Oryx dammah assembly version 1.1, Genbank accession 318 number GCF_014754425.2) using BWA MEM v0.7.17 (76) with default parameters. 319 Unmapped reads were removed from the alignment files using SAMtools v1.9 (77). 320 321 Alignments were then sorted, read groups added and duplicates removed using Picard Tools 322 v2.18.16. This resulted in a set of 49 filtered alignment files, one for each of the resequenced 323 individuals. To account for coverage variation in our data (78), we used SAMtools to 324 downsample our 20 high coverage alignment files to approximately 6X, which was the average 325 depth of coverage of our low coverage samples. All subsequent analyses were carried out on 326 the set of alignments with comparable coverage.

327 Variant calling and filtering

328 Haplotype Caller and GenotypeGVCFs in GATK v3.8 (79) were used for joint genotyping 329 across all samples. The resulting SNP data were filtered for biallelic sites using BCFtools v1.9 (80). To obtain a high-quality set of variants we then used VCFtools (81) to remove loci with 330 331 a quality score less than 30, a mean depth of coverage less than 5 or greater than 53, a genotyping rate less than 95% and a minor allele count less than 1. We removed SNPs 332 originating from the X chromosome or any of the unplaced scaffolds within the assembly. One 333 334 individual with a high relatedness score was dropped from subsequent analysis (Figure S1, 335 see Supplementary Methods for details). The resulting SNP dataset contained over 10 million polymorphic sites with a genotyping rate of 98%. 336

337 **Population structure**

We characterised population structure using genotype likelihood based approaches in 338 NGSadmix (82) and PCAngsd (83). Genotype likelihoods were first estimated from bam files 339 340 in ANGSD (84) using the GATK model (-GL 2), inferring major and minor alleles (doMajorMinor 1) and outputting only polymorphic sites (-SNP_pval 1e-6) with data in at least 341 342 60% of individuals (-minInd 30). We restricted this analysis to the 28 chromosome-length 343 autosomes and included only regions with Phred guality and mapping scores over 30. 344 Admixture proportions for the individuals in our dataset were calculated using NGSadmix. We performed admixture runs for ancestry clusters ranging from K=1-6, with ten runs for each K. 345 The runs with the highest likelihood were plotted. The optimal K was identified based on the 346 maximum value of the mean estimated In probability of the data (85) and the Delta K method 347 348 (86). Two individuals with intermediate admixture proportions between EAD A and EAD B 349 were dropped from further analysis (Figure S3, see Supplementary Methods for details). We 350 next performed a principal components analysis (PCA) using PCAngsd with the default 351 parameters. Eigenvectors were computed from the covariance matrix using R.

352 ROH calling and individual inbreeding coefficients

353 We used the filtered SNP genotypes to estimate inbreeding as the proportion of the genome 354 in runs of homozygosoty (F_{ROH}). ROH were called with a minimum length of 500 kb and a 355 minimum of 50 SNPs using the --homozyg function in PLINK v1.9 (87) and the following 356 parameters: --homozyg-window-snp 50 --homozyg-snp 50 --homozyg-kb 500 --homozyg-gap 357 1000 --homozyg-density 50 --homozyg-window-missing 5 --homozyg-window-het 3. We then calculated individual inbreeding coefficients F_{ROH} as the sum of the detected ROH lengths for 358 359 each individual over the total autosomal assembly length (2.44 Gb). To explore the effect of management on inbreeding coefficients we ran linear models with F_{ROH} as the response 360 361 variables and management strategy as the predictor variable. We also calculated F_{ROH} based

on ROH inferred using bcftools roh and the following parameters: --AF-dflt 0.16 (average minor allele frequency), -G 30 and -M 1.2 (cattle recombination rate, Mouresan *et al.* 2019). We observed a near-perfect correlation (r = 0.99) with our PLINK-based estimates (Figure S5).

366 ROH length distribution and recent demography

367 To assess recent changes in oryx population size, we characterised the abundance of ROH 368 in seven different length classes (≥25, 12.5–25, 6.25–12.5, 3.12–6.25, 1.56–3.12, 0.78–1.56 and 0.39–0.78 Mb). Categories were calculated using the formula 100/(2g) (50), and reflect 369 370 the expected lengths of ROH when the underlying haplotypes have most recent common 371 ancestors <2, 2–4, 4–8, 8–16, 16–32, 32–64 and 64–128 generations ago respectively. These generations were chosen to capture the time-period during which the wild population of oryx 372 373 went extinct and captive populations were established. As there is no linkage map for the oryx, physical map lengths as opposed to genetic map lengths were used. For each length class, 374 $F_{\rm ROH}$ was calculated as the sum of the detected ROH lengths for each individual over the total 375 autosomal assembly length (2.44 Gb). We then used individual measures of F_{ROH} to infer 376 377 recent changes in effective population size across each population. For each time-period described above (t), N_e was estimated given the following expression where $F_{ROH t}$ 378 379 corresponds to the individual inbreeding coefficient at time t.

380
$$F_{ROH,t} = 1 - (1 - \frac{1}{2N_e})^t$$

To calculate 95% confidence intervals around our estimates, we randomly resampled 50% of individuals within each population without replacement 100 times, and recalculated N_e .

383 Nucleotide diversity

Nucleotide diversity estimates were calculated for each population using ANGSD. We first estimated the unfolded site-frequency spectrum (SFS) using the -doSaf and -realSFS commands while restricting the analysis to the 28 chromosome-length autosomes and regions with Phred quality and mapping scores over 30. Per-site pairwise nucleotide diversity estimates were then calculated using the -thetaStat command.

389 Identification of deleterious mutations

As most deleterious mutations are likely to be derived alleles, we first polarised our SNP genotypes as ancestral or derived using the blue wildebeest (*Connochaetes taurinus*), topi (*Damaliscus lunatus*) and hartebeest (*Alcelaphus buselaphus*) as outgroup species. Short read sequencing data from one wildebeest (SRR6902709), one topi (SRR6913384) and one 394 hartebeest (SRR6922939 and SRR6922940) were downloaded from NCBI and mapped to the scimitar-horned oryx reference genome using BWA MEM with the default parameters. The 395 alignments were then merged using SAMtools. A consensus was generated by selecting the 396 most common base from the alignment using the doFasta 2 and doCounts 1 options in 397 ANGSD. We then used PLINK v2.0 to polarise the oryx SNPs in our VCF based on the alleles 398 399 in the consensus. First, we removed SNPs from our VCF whose positions were not present in 400 the consensus sequence. Second, we removed SNPs where the ancestral allele in the 401 consensus matched neither allele in the VCF file. Finally, we rotated alleles so that the 402 reference allele in our VCF matched the ancestral allele in the consensus.

403 To identify deleterious mutations, we predicted the functional effects of the polarised SNP 404 variants using both SnpEff v5.0 (89) and the Variant Effect Predictor v99.2 (90). These 405 methods compare a set of variants to an annotation database and predict the consequence 406 of the alternative alleles on genes, transcripts and proteins. Both were run using the NCBI 407 RefSeq scimitar-horned downloaded oryx genome annotation from: https://ftp.ncbi.nlm.nih.gov/genomes/all/annotation releases/59534/100/GCF 014754425.2 408 SCBI_Odam_1.1/. For each approach, sites with warnings were removed from the VCF file 409 410 and SNPs were then categorised as loss of function or missense according to the 411 classifications provided in Table S2. For each dataset, we also extracted a random subset of 100,000 intergenic SNPs for use in the Rxy analysis below. For each set of SNPs, genotypes 412 413 were extracted for all individuals using a combination of VCFtools and PLINK.

414 Genetic load landscape across management strategies

415 To assess how the genetic load varies across populations we used two approaches. First, we 416 approximated two components of genetic load; inbreeding and drift load (48). Inbreeding load was measured as the total number of heterozygotes per individual for both loss of function 417 418 and missense variants. Drift load was measured as the total number of alternative 419 homozygotes per individual for both loss of function and missense variants. Second, we used 420 the Rxy statistic to estimate the relative frequency of loss of function and missense mutations 421 in one population over another (91). Alternative allele frequencies were calculated based on 422 individuals from managed and unmanaged populations separately. A random subset of 423 100,000 intergenic SNPs was used to standardise our estimates and account for population-424 specific biases. To calculate 95% confidence intervals around our estimates, we randomly resampled 70% of SNPs within each impact category without replacement and recalculated 425 426 Rxy. This was repeated 100 times. To explore the effect of management on genetic load, we ran linear models with inbreeding or drift load as the response variable and management 427 428 strategy as the predictor variable.

429 Data availability

430 EEP samples are archived at the EAZA Biobank
431 <u>https://www.eaza.net/conservation/research/eaza-biobank</u>. Whole genome resequencing
432 data will be deposited to the European Nucleotide Archive. Analysis code will be available on
433 Zenodo and GitHub.

434 Author contributions

RO, HS, AB, KD and EH conceived and designed the study. JC, RP and MaR contributed
materials and funding. BP provided samples from SSP populations. EH analysed the data with
input from MAS and RG. EH wrote the manuscript. All authors commented on and helped
improve the final manuscript.

439 Acknowledgements

- 440 We thank the EAD, EAZA and AZA institutions that provided samples for this study. We thank
- 441 Jennifer Kaden for initial processing of samples and DNA extraction, and Edinburgh Genomics
- 442 for carrying out the whole genome sequencing. SaharaConservation provided materials and
- 443 wider project support. We also acknowledge Katerina Guschanski for helpful discussions and
- 444 Tania Gilbert at Marwell Wildlife for information on the international studbook of scimitar-445 horned oryx.

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