# Long title: Human demographic history has amplified the effects of background selection across the genome

# Short title: Background selection and demography in humans

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# 1 Abstract

2 Natural populations often grow, shrink, and migrate over time. Demographic pro-3 cesses such as these can impact genome-wide levels of genetic diversity. In addition, 4 genetic variation in functional regions of the genome can be altered by natural selection, 5 which drives adaptive mutations to higher frequencies or purges deleterious ones. Such 6 selective processes impact not only the sites directly under selection but also nearby neutral variation through genetic linkage through processes referred to as genetic hitch-7 8 hiking in the context of positive selection and background selection (BGS) in the context 9 of purifying selection. While there is extensive literature examining the impact of selec-10 tion at linked sites at demographic equilibrium, less is known about how non-equilibrium 11 demographic processes impact the effects of hitchhiking and BGS. Utilizing a global 12 sample of human whole-genome sequences from the Thousand Genomes Project and 13 extensive simulations, we investigate how non-equilibrium demographic processes 14 magnify and dampen the consequences of selection at linked sites across the human 15 genome. When binning the genome by inferred strength of BGS, we observe that, com-16 pared to Africans, non-African populations have experienced larger proportional de-17 creases in neutral genetic diversity in such regions. We replicate these findings in ad-18 mixed populations by showing that non-African ancestral components of the genome 19 have also been impacted more severely in these regions. We attribute these differences 20 to the strong, sustained/recurrent population bottlenecks that non-Africans experienced 21 as they migrated out of Africa and throughout the globe. Furthermore, we observe a 22 strong correlation between  $F_{ST}$  and inferred strength of BGS, suggesting a stronger rate 23 of genetic drift. Forward simulations of human demographic history with a model of BGS

support these observations. Our results show that non-equilibrium demography significantly alters the consequences selection at linked sites and support the need for more work investigating the dynamic process of multiple evolutionary forces operating in concert.

28

#### 29 Author summary

30 Patterns of genetic diversity within a species are affected at broad and fine 31 scales by population size changes ("demography") and natural selection. From both 32 population genetics theory and observation of genomic sequence data, it is known that 33 demography can alter genome-wide average neutral genetic diversity. Additionally, nat-34 ural selection can affect neutral genetic diversity regionally across the genome via se-35 lection at linked sites. During this process, natural selection acting on adaptive or dele-36 terious variants in the genome will also impact diversity at nearby neutral sites due to 37 genetic linkage. However, less is well known about the dynamic changes to diversity 38 that occur in regions impacted by selection at linked sites when a population undergoes 39 a size change. We characterize these dynamic changes using thousands of human ge-40 nomes and find that the population size changes experienced by humans have shaped 41 the consequences of linked selection across the genome. In particular, population con-42 tractions, such as those experienced by non-Africans, have disproportionately de-43 creased neutral diversity in regions of the genome inferred to be under strong back-44 ground selection (i.e., selection at linked sites that is caused by natural selection acting 45 on deleterious variants), resulting in large differences between African and non-African 46 populations.

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47

# 48 Introduction

49 Genetic diversity in a species is determined through the complex interplay of mu-50 tation, demography, genetic drift, and natural selection. These evolutionary forces oper-51 ate in concert to shape patterns of diversity at both the local scale and genome-wide 52 scale. For example, in recombining species, levels of genetic diversity are distributed 53 heterogeneously across the genome as peaks and valleys that are often correlated with 54 recombination rate and generated by past or ongoing events of natural selection [1]. 55 But at the genome-wide scale, average levels of genetic diversity are primarily impacted 56 by population size changes, yielding patterns of diversity that are a function of a popula-57 tion's demographic history [2]. These patterns of diversity may also yield information for 58 inferring past events of natural selection and population history, giving valuable insight 59 into how populations have evolved over time [3–8]. With recent advances in sequencing 60 technology yielding whole-genome data from thousands of individuals from species with 61 complex evolutionary histories [9,10], formal inquiry into the interplay of demography 62 and natural selection and testing whether demographic effects act uniformly across the 63 genome as a function of natural selection is now possible.

In the past decade, population genetic studies have shed light on the pervasiveness of dynamic population histories in shaping overall levels of genetic diversity across different biological species. For example, multiple populations have experienced major population bottlenecks and founder events that have resulted in decreased levels of genome-wide diversity. Evidence for population bottlenecks exists in domesticated species such as cattle [11], dogs [12], and rice [13], and in natural populations such as *Drosoph*-

*ila melanogaster* [14–16], rhesus macaque [17], and humans [18,19]. Notably, population bottlenecks leave long lasting signatures of decreased diversity, which may be depressed even after a population has recovered to or surpassed its ancestral size [20,21]. Such examples are evident in humans, where non-African populations exhibit a lower amount of genetic diversity compared to Africans [9], despite the fact that they have been inferred to have undergone a greater population expansion in recent times [22,23].

77 Locally (i.e., regionally) across the genome, the action of natural selection can 78 also lead to distinct signatures of decreased genetic diversity (although some forms of 79 selection, such as balancing selection, can increase genetic diversity [24]). For exam-80 ple, mutations with functional effects may be removed from the population due to purify-81 ing selection or fix due to positive selection, thereby resulting in the elimination of genet-82 ic diversity at the site. But while sites under direct natural selection in the genome rep-83 resent only a small fraction of all sites genome-wide, the action of natural selection on 84 these selected sites can have far-reaching effects across neutral sites in the genome 85 due to linkage. Under positive selection, genetic hitchhiking [25] causes variants lying 86 on the same haplotype as the selected allele to rise to high frequency during the selec-87 tion process (note that we will use the term "genetic hitchhiking" here only in the positive 88 selection context of selection at linked sites). Conversely, under purifying selection, 89 background selection (BGS) [26] causes linked neutral variants to decrease in frequen-90 cy or be removed from the population. Both of these processes of selection at linked 91 sites result in decreased neutral genetic diversity around the selected site. Recombina-92 tion can decouple neutral sites from selected sites in both cases and neutral diversity

tends to increase toward its neutral expectation as genetic distance from selected sitesincreases [27].

95 Evidence for genetic hitchhiking and BGS has been obtained from the genomes 96 of several species, including Drosophila melanogaster [28-33], wild and domesticated 97 rice [34,35], nematodes [36,37], humans [3,6,38–42], and others (see [1] for a review). 98 While the relative contributions of genetic hitchhiking and BGS to shaping patterns of human genomic diversity have been actively debated [40,43-45], the data strongly sup-99 100 port a large role for BGS in shaping genome-wide patterns of neutral genetic variation 101 [41,42]. Indeed, recent arguments have been made in favor of BGS being treated as the 102 null model when investigating the impact of selection at linked sites across recombining 103 genomes [1,32,45–48], with one study in humans showing that BGS has decreased ge-104 netic diversity by 19-26% if other modes of selection at linked sites are assumed to be 105 minor [6].

106 Although the effects of selection at linked sites across the genome have been 107 described in a multitude of studies, it is still less obvious whether populations that have 108 experienced different demographic histories, such as African and non-African human 109 populations, should exhibit similar relative effects in those regions. In the context of 110 BGS, early work resulted in the expression  $\pi \approx 4f_0 N_e \mu$  [26], which suggests that the ex-111 pected level of diversity with BGS is simply proportional to the neutral expectation (with 112 proportionality constant  $f_0$  being a function of the rates of deleterious mutation and re-113 combination). Importantly, while populations with different  $N_e$  are expected to have dif-114 ferent levels of  $\pi$  in the context of BGS, the proportionality constant  $f_0$  is assumed to be 115 independent of population history (so long as the recombination landscape and delete-

116 rious mutation rates remain constant). Much of the theory developed in the context of 117 BGS has been developed under the assumption that the population is at demographic 118 equilibrium, and recent work has demonstrated that this assumption likely holds under 119 changing demography if selection is strong enough (or populations are large enough) 120 such that mutation-selection balance is maintained [49,50]. However, strong, sustained 121 population bottlenecks may lead to violations of that assumption. Thus, in humans and 122 other natural populations experiencing non-equilibrium demography, genetic drift may 123 perturb genetic diversity at neutral sites under BGS that are unaccounted for in these 124 models.

125 While little attention has been given to the potential consequences of demogra-126 phy on patterns of neutral variation in regions experiencing selection at linked sites (but 127 see [51,52] for how selection at linked sites may impact the inference of demography 128 itself), recent studies have suggested that alleles directly under natural selection experi-129 ence non-linear dynamics in the context of non-equilibrium demography. For the case of 130 purifying selection, the equilibrium frequency of an allele is dependent on its fitness ef-131 fect, with deleterious alleles having lower equilibrium frequencies than neutral alleles. 132 After a population size change, deleterious alleles tend to change frequency faster than 133 neutral alleles, allowing them to reach their new equilibrium frequency at a faster rate 134 [53,54]. This can result in relative differences in deleterious allele frequencies among 135 populations with different demographic histories. Such effects are especially apparent in 136 populations suffering bottlenecks [55] and have been tested and observed between dif-137 ferent human populations with founder populations exhibiting a greater proportion of 138 non-synonymous variation relative to synonymous variation [56-58]. We hypothesized

139 that these non-equilibrium dynamics could also perturb nearby neutral variants due to 140 the effects of selection at linked sites. In support of our hypothesis, a recent simulation 141 study modeling *Drosophila* observed that population bottlenecks can result in different 142 rates of recovery of neutral genetic diversity depending on the strength of BGS [48]. 143 Another recent study [59] analyzed neutral diversity surrounding putatively deleterious 144 loci in domesticated versus wild maize. They found that the extreme domestication bottleneck reduced the efficiency of purifying selection, which has resulted in higher rela-145 146 tive diversity in the domesticated population compared to the wild population (which has 147 likely experienced a much more stable demographic history). Together, these studies 148 provide further evidence that non-equilibrium demography should have a strong effect 149 on patterns of diversity in the presence of selection at linked sites.

150 To investigate the impact of non-equilibrium dynamics in regions experiencing 151 selection at linked sites, we measure patterns of average pairwise neutral genetic diver-152 sity  $(\pi)$ , or neutral heterozygosity if the population was admixed, as a function of the 153 strength of BGS, B (inferred by Ref. [6]), within a global set of human populations from 154 phase 3 of the Thousand Genomes Project (TGP) [9]. We focus on the ratio of neutral 155 diversity in regions of strong BGS (low B) to regions of weak BGS (high B, the closest 156 proxy available for neutral variation in humans), which we term "relative diversity." While 157 there are many caveats that may plague the direct interpretation of specific B values 158 (e.g., positive selection is not modeled, the distribution of fitness effects are inconsistent 159 with other studies, and the deleterious mutation rate exceeds the per base pair mutation 160 rate of other studies), we argue below that B scores nevertheless provide a decent

161 proxy for ranking sites from most closely linked to deleterious loci (low *B*) to most un-162 linked from deleterious loci (high *B*) in humans.

163 We find substantial differences in relative diversity between populations, which 164 we attribute to their non-equilibrium demographics. We confirm that the interplay of de-165 mography and selection at linked sites can explain the differences of relative diversity 166 across human populations with simulations incorporating a parametric demographic 167 model of human history [7] with and without a model of BGS. We also investigate how 168 genetic differentiation between TGP populations (as measured by  $F_{ST}$ ) is shaped by se-169 lection at linked sites by measuring  $F_{ST}$  as a function of B. Finally, we demonstrate that 170 back migration from Europeans and Asians into Africa re-introduces sufficient deleteri-171 ous variation to impact patterns of BGS, leading to decreased relative diversity in Afri-172 cans. Our results demonstrate the strong impact that changing demography has on per-173 turbing levels of diversity in regions experiencing selection at linked sites and have im-174 plications for population genetic studies seeking to characterize linked selection across 175 any species or population that is not at demographic equilibrium.

176

# 177 **Results**

# 178 Differential impact of selection at linked sites across human populations

We measured mean pairwise genetic diversity ( $\pi$ ) in the autosomes (we ignore the sex chromosomes and the mitochondrial genome for all analyses) among the 20 non-admixed populations from the phase 3 TGP data set, consisting of 5 populations each from 4 continental groups: Africa (AFR), Europe (EUR), South Asia (SASN), and East Asia (EASN; population labels and groupings reported in S12 Table in Supporting

184 information). A set of stringent filters, including the masking of sites inferred to be under 185 selective sweeps, were first applied to all 20 populations to identify a high-quality set of 186 putatively neutral sites in the genome (see Materials and Methods). Sites were then di-187 vided into quantile bins based on B [6]. For our initial set of analyses, we focused on the 188 bins corresponding to the 1% of sites inferred to be under the strongest amount of BGS 189 (i.e., sites having the lowest inferred B values) and the 1% of sites inferred to be under 190 the weakest amount BGS (i.e., sites having the highest inferred B values). Mean diversi-191 ty was normalized by divergence with rhesus macaque within these bins for each popu-192 lation and is shown in Figs 1A-B. As expected, normalized diversity was highest in Afri-193 can populations and lowest in East Asian populations across both 1% B quantile bins.

194 To estimate the impact that selection at linked sites has had on neutral diversity, 195 we calculated a statistic called "relative diversity" (analogous to  $\pi/\pi_0$  in the BGS litera-196 ture; [26,60]) for each population. We define relative diversity as the ratio of normalized 197 diversity in the lowest 1% B bin to normalized diversity in the highest 1% B bin, which 198 should capture the relative impact of selection at linked sites within the genome. Fig 1C 199 shows that relative diversity was lower in non-African populations (0.348-0.365 for non-200 Africans, 0.396-0.408 for Africans), suggesting that these populations have experienced 201 a greater reduction in diversity due to selection at linked sites than can be explained by 202 demography alone.

To characterize these effects across a broader distribution of sites experiencing selection at linked sites, we grouped populations together according to their continental group (i.e., African, European, South Asian, and East Asian, see S12 Table in Supporting information for a detailed description) and estimated relative diversity at neutral sites

207 for each of the continental groups in bins corresponding to the lowest 1%, 5%, 10%, 208 and 25% guantiles of B (note these partitions were not disjoint). As expected, relative 209 diversity increased for all continental groups as the bins became more inclusive (Fig 210 2B), reflecting a reduced impact on the reduction of diversity due to selection at linked 211 sites. We also observed that non-African continental groups consistently had a lower 212 relative diversity compared to African groups, demonstrating that the patterns we ob-213 served in the most extreme regions experiencing selection at linked sites also held for 214 broader regions. Interestingly, we observed a consistent trend of rank order for relative 215 diversity between the different continental groups for each quantile bin, with the East 216 Asian group experiencing the greatest reduction of relative diversity, followed by the 217 South Asian, European, and African groups. This result suggested a stronger effect for 218 demography on the diversity-reducing effect selection at linked sites for those popula-219 tions experiencing the strongest bottlenecks. However, the observed differences in rela-220 tive diversity between non-African and African continental groups became less pro-221 nounced as the bins became more inclusive (Fig 2B). These effects remained even af-222 ter we controlled for the effects of GC-biased gene conversion and recombination 223 hotspots (S2 and S4 Figs) or if we did not normalize diversity by divergence (S3 and S5 224 Figs). Patterns of relative diversity in regions of local ancestry (i.e., African, European, 225 or Native American) across admixed TGP populations also largely recapitulated the pat-226 terns observed in their continental group counterparts across B quantile bins, with the 227 largest reductions in relative diversity occurring for the Native American and European 228 ancestral segments (S11 Fig, S1 Supporting information).

229 To test if demography has impacted selection at linked sites more recently in 230 time, we also calculated the number of singletons observed per site (normalizing by di-231 vergence and using the same set of neutral filters as was used for the calculations of  $\pi$ ) 232 across the lowest and highest 1% B quantile bins. Singletons are, on average, the 233 youngest variants within the genome and should better capture signals about more re-234 cent population history. We took the ratio of singletons observed per-site across these 235 extreme B quantile bins to create a statistic called relative singleton density, which we 236 term " $\psi/\psi_0$ ." We accounted for differences in population sample size by first projecting 237 down all populations to 2N=170 (Materials and methods). Qualitatively, our measure-238 ments of  $\psi/\psi_0$  showed patterns in the opposite direction of our calculations of  $\pi/\pi_0$ , with 239 Africans exhibiting a lower ratio of  $\psi/\psi_0$  when compared to non-Africans (0.665-0.695) 240 for Africans, 0.733-0.804 for non-Africans; Fig 3). These patterns suggest that the im-241 pact of demography on regions experiencing selection at linked sites is transient, with 242 patterns of relative diversity between populations dependent on the time frame in which 243 they are captured (see Discussion).

244

# 245 Selection at linked sites has shaped patterns of population differentiation

We have shown that selection at linked sites increases the rate of drift at neutral loci, and that this process is amplified by demographic changes like population bottlenecks. One might then expect that selection could also amplify population differentiation at linked neutral loci. This outcome is obvious in the context of hitchhiking (where linked neutral loci sweep to high frequency) but is also expected with BGS [61,62], since decreases in diversity can accelerate differentiation. Here we quantify the magnitude of

252	the effect of BGS on population differentiation in humans, and find that population dif-
253	ferentiation at neutral loci is indeed highly correlated with B (the inferred strength of
254	BGS; Fig 4 and Table 1). Specifically, we divided the genome into 2% quantile bins
255	based on the genome-wide distribution of $B$ and measured $F_{ST}$ in each bin for all pairs
256	of populations from different continental groups [63]. We then performed simple linear
257	regression using <i>B</i> as an explanatory variable and $F_{ST}$ as our dependent variable with
258	the linear model $F_{ST} = \beta_0 + \beta_1 B + \varepsilon$ . We found that across all 150 population compari-
259	sons (i.e., the "Global" estimate in Table 1), <i>B</i> explained 26.9% of the change in $F_{ST}$
260	across the most extreme B values, was robust to outliers [64] (S6 Table in Supporting
261	information), and dominated the effects of local recombination rate (see Supporting in-
262	formation).

Table 1. Regression coefficient estimates for linear regression of  $F_{ST}$  on 2% quantile bins of *B*.

	AFR vs.	AFR vs.	AFR vs.	EUR vs.	EUR vs.	SASN vs.			
	EASN	EUR	SASN	SASN	EASN	EASN	Global		
βο	0.2044	0.1716	0.1596	0.0455	0.1216	0.0903	0.1322		
± SEM	± 0.0039	± 0.0031	± 0.0029	± 0.0011	± 0.0029	± 0.0023	± 0.0019		
( <b>p</b> )	(< 1e-04)								
β1	-0.0434	-0.0358	-0.0355	-0.0098	-0.0173	-0.0261	-0.0280		
± SEM	± 0.0046	± 0.0037	± 0.0034	± 0.0013	± 0.0035	± 0.0027	± 0.0022		
( <b>p</b> )	(< 1e-04)								
r	-0.8363	-0.7441	-0.7794	-0.3847	-0.6220	-0.5968	-0.1292		
± SEM	± 0.0295	± 0.0362	± 0.0332	± 0.0414	± 0.0785	± 0.0348	± 0.0098		

265

The first two rows give the regression coefficients for the linear model  $F_{ST} = \beta_0 + \beta_1 B + \beta_2 B + \beta_2$ 266  $\varepsilon$ , where *B* represents the mean background selection coefficient for the bin being test-267 ed and  $F_{ST}$  is the estimated  $F_{ST}$  for all population comparisons within a particular pair of 268 continental groups (given in the column header). The final column, "Global", gives the 269 regression coefficients for the linear model applied to all pairwise population compari-270 sons (150 total). The correlation coefficient, r, between B and  $F_{ST}$  for each comparison 271 is shown in the bottom row. Standard errors of the mean (SEM) for  $\beta_0$ ,  $\beta_1$ , and r were 272 calculated from 1,000 bootstrap iterations (see Materials and Methods). P-values are 273 274 derived from a two-sided t-test of the t-value for the corresponding regression coeffi-275 cient. 276

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277

## 278 Demographic inference in putatively neutral regions of the genome

279 One consequence of BGS and hitchhiking in driving patterns of neutral variation 280 within and between human populations is that demographic inference could be substan-281 tially biased [51,52,65]. To assess the degree of bias in the context of human data, we 282 fit a 13-parameter demographic model of African, European, and East Asian demogra-283 phy using only putatively neutral regions of the genome under the weakest effects of 284 selection at linked sites ( $B \ge 0.994$ ) from a subset of TGP individuals with high coverage 285 whole genome sequence data (see Materials and Methods). Our demographic model 286 followed that of Gutenkunst et al. [7], with an ancient human expansion in Africa and a 287 single out-of-Africa bottleneck followed by European- and East Asian-specific bottle-288 necks, as well as exponential growth in both non-African populations and migration be-289 tween all populations. To make comparisons to previous studies that have used se-290 quence data from coding regions or genes [7,22,23], which may be under strong BGS 291 or hitchhiking effects, we also inferred demographic parameters using coding four-fold 292 degenerate synonymous sites. Our inferred parameters for human demography were 293 strikingly different between the two sets of sequence data (S1 Fig, S1 Table in Support-294 ing information). Notably, inferred effective population size parameters were larger for 295 contemporary population sizes when using four-fold degenerate synonymous sites ver-296 sus ascertained neutral regions with  $B \ge 0.994$ , with  $N_e$  inferred to be 22%, 23%, and 297 29% larger for AFR, EUR, and EASN populations, respectively. This is despite the fact 298 that the ancestral  $N_e$  was inferred to be lower for four-fold degenerate synonymous sites 299  $(N_e = 18,449 \text{ and } 17,118)$ , for neutral regions with  $B \ge 0.994$  and four-fold degenerate

sites, respectively). This result may stem from the expected decrease in  $N_e$  going into the past in regions of strong BGS, which can lead to inflated estimates of recent population growth [52] and has also been shown in simulation studies of synonymous sites under BGS [65]. Put more simply, the skew of the site-frequency spectrum towards rare variants in regions experiencing selection at linked sites mimics a population expansion, thus leading to erroneous inference.

306

#### 307 Simulations confirm that demographic effects can impact background selection

308 Using the demographic parameters inferred from neutral regions where  $B \ge 1$ 309 0.994, we simulated patterns of neutral diversity with and without the effects BGS (see 310 Materials and Methods). To measure the relative impact of BGS for each population, we 311 then took the ratio of neutral diversity from BGS simulations  $(\pi)$  and neutral diversity 312 from simulations without BGS ( $\pi_0$ ) to calculate relative diversity ( $\pi/\pi_0$ ). As expected, we 313 found that BGS reduced relative diversity ( $\pi/\pi_0 < 1$ ) for all three populations in our simu-314 lations. However, non-African populations experienced a proportionally larger decrease 315 in  $\pi/\pi_0$  compared to the African population ( $\pi/\pi_0$  = 0.43, 0.42, 0.41 in AFR, EUR, and 316 EASN respectively). These results are comparable to (but not quite as extreme as) the 317 effects we observed in the regions of the genome with the strongest effects of BGS for 318 these population groups (Fig 1C). To understand how this dynamic process occurs, we 319 sampled all simulated populations every 100 generations through time to observe the 320 effect of population size change on  $\pi$ ,  $\pi_0$ , and the ratio  $\pi/\pi_0$  (Fig 5). We observed that 321 there is a distinct drop in  $\pi$  and  $\pi_0$  at each population bottleneck experienced by non-322 Africans, with East Asians (who had a more severe bottleneck) experiencing a larger 323 drop than Europeans. Fig 5C shows that the population bottlenecks experienced by 324 non-African populations also reduces  $\pi/\pi_0$ . Surprisingly, Africans also experienced a 325 large drop in  $\pi/\pi_0$  (but less than non-Africans) even though they did not experience any 326 bottlenecks. This was attributable to migration between non-Africans and Africans and 327 this pattern disappeared when we ran simulations using an identical demographic mod-328 el with BGS but without migration between populations (S7 Fig). This finding highlights 329 an evolutionary role that deleterious alleles can play when they are transferred across 330 populations through migration (see Discussion).

331 We also calculated  $\psi/\psi_0$  across these simulations and again qualitatively ob-332 served patterns similar to, but not as extreme, as our empirical calculations of  $\psi/\psi_0$ . As 333 with pairwise neutral diversity, BGS predictably decreased the density of singletons 334 across all populations (S12 Fig A). However, Africans exhibited a lower  $\psi/\psi_0$  when 335 compared to non-Africans ( $\psi/\psi_0$  = 0.79, 0.89, 0.91 in AFR, EUR, and EASN respective-336 Iv). Calculating  $\psi$  and  $\psi_0$  through time showed that the population bottlenecks experi-337 enced by non-Africans led to strong decreases in both  $\psi$  and  $\psi_0$ , with recent expansion 338 in these populations then leading to large, rapid recoveries. Strong decreases in  $\psi/\psi_0$ 339 after each population bottleneck were also observed, including a slight decrease in  $\psi/\psi_0$ 340 in Africans that disappeared in the simulations without migration (S12 Fig B). While  $\psi/\psi_0$ 341 for the European/East Asian ancestral population in the simulations with migration re-342 mained below that of Africans during the course of the Out-of-Africa bottleneck, we ob-343 served a rapid recovery in  $\psi/\psi_0$  for this population in the simulations without migration 344 (compare bottoms panels, S12 Fig A and B). This suggests that for populations experi-345 encing a sustained population bottleneck, the response of singletons to changes in the weakened intensity of BGS is quite rapid, especially when compared to patterns of  $\pi/\pi_0$ (compare Fig S7 C to Fig S12 B bottom panel). However, population migration mitigates this pattern. However, regardless of whether migration between populations was simulated, BGS seemed to have little effect on singleton density recovery in Europeans and Asians once population expansion occurred.

351 Our simulations were based on the functional density found in a 2 Mb region of 352 the human genome with the lowest B values and, thus, where BGS was inferred to be 353 strongest (chr3: 48,600,000-50,600,000). There, 20.46% of sites were either coding or 354 conserved non-coding (see Materials and Methods). Thus, the fraction of the genome 355 experiencing deleterious mutation in our simulations of strong BGS was 0.2046. The 356 patterns we observed in these simulations likely represent an upper bound on the 357 strength of BGS in the human genome. Since the strength of BGS is dependent upon 358 the density of sites experiencing deleterious mutation within a given region (or more 359 formally, U, which is the product of the per-site deleterious mutation rate and the num-360 ber of sites experiencing deleterious mutation [66]), we simulated weaker effects of 361 BGS by reducing the fraction of sites experiencing purifying selection (keeping the dis-362 tribution of selective effects constant, see Materials and Methods). When the fraction of 363 sites experiencing selection was decreased 2-4 fold in our simulations, we continued to 364 observe a stepwise decrease in  $\pi/\pi_0$  while maintaining the specific rank order of African, 365 followed by European, and then East Asian populations (S8 Fig). As expected,  $\pi/\pi_0$  in-366 creased for all populations as the fraction of sites that were simulated as deleterious 367 decreased ( $\pi/\pi_0$  = 0.641 vs. 0.802, 0.62 vs. 0.777, and 0.611 vs. 0.777 for AFR, EUR, 368 and EASN when the fraction of sites experiencing selection was reduced to 0.1023 and

369 0.05115, respectively). These simulations resulted in  $\pi/\pi_0$  values much larger than we 370 observed in data (Figs 1C, 2B).

371

# 372 **Discussion**

373 In our analyses of thousands of genomes from globally distributed human popu-374 lations, we have confirmed that the processes of demography and selection at linked 375 sites govern neutral variation across the genome. While this observation is not unex-376 pected, we have characterized the dynamic consequence of non-equilibrium demo-377 graphic processes in regions experiencing selection at linked sites in humans. We find 378 that demography (particularly population bottlenecks) can amplify the consequences of 379 selection at linked sites. To remove any possible biases that would influence our results, 380 we controlled for functional effects of mutations, variability in mutation along the ge-381 nome, potential sequencing artifacts, GC-based gene conversion, the potential muta-382 genic effects of recombination hotspots, and also removed regions of the genome with 383 signatures of positive selection. None of these factors qualitatively affected our results.

384 We do recognize that one caveat of our controls is the fact that divergence itself 385 is not independent of BGS [67], and this may present biases when using divergence to 386 control for variation in mutation rate along the genome. This is because the rate of coa-387 lescence in the ancestral population of two groups will be faster in regions of strong 388 BGS compared to regions of weak BGS due to the lower  $N_e$  of the former, leading to a 389 decrease in overall divergence in those regions. To limit the contribution of such biases 390 in ancestral  $N_e$  to divergence, we use rhesus macaque since it is more distantly related 391 to humans than other primate species such as orangutan or chimpanzee (human-

392 rhesus divergence: 29.6 MYA; [68]). Furthermore, if B truly captures the effects of BGS, 393 then normalizing by the lower divergence that is characteristic of strong BGS bins and 394 the higher divergence that is characteristic of weak BGS bins should make any differ-395 ences between the two smaller, not greater. In fact, for our calculations of relative diver-396 sity in which we skip the normalization step, the differences in diversity between the 397 lowest 1% and highest 1% B value bins are greater and give a lower ratio of relative di-398 versity  $(\pi/\pi_0)$  for AFR is 0.373 without the divergence step and 0.402 with the divergence 399 step). A similar pattern is also observed for other continental groups (compare Fig 2 and 400 S5 Fig). More importantly though, we should not expect the potential biases of our di-401 vergence step to contribute to the differences in relative diversity between each of the 402 continental groups since biases in divergence estimates across the genome are based 403 on the human reference sequence and are therefore identical across all human popula-404 tions.

405 We also note that the estimates of B by McVicker et al. [6] may be biased by 406 model assumptions concerning mutation rates and the specific sites subject to purifying 407 selection, with the exact values of B unlikely to be precisely inferred. In fact, the B val-408 ues provided by McVicker et al. range from 0 to 1, suggesting that some regions of the 409 genome should be essentially devoid of diversity (but we do not observe this to be the 410 case). Since our own analyses show that relative diversity has a lower bound at only 411  $\sim 0.35$  in humans, the exact value of B itself should not be taken at face value. Rather, 412 our primary motivation for using B was to ascertain regions that should be on the ex-413 treme ends of the genome-wide distribution of regions experiencing selection at linked 414 sites, for which B should provide a good assessment. A study by Comeron et al. [32]

that investigated BGS in *Drosophila* and utilized the same model of BGS as McVicker et al. found that biases presented by model assumptions or mis-inference on the exact value of *B* do not significantly change the overall rank order for the inferred strength of BGS across the genome. Thus we, expect McVicker et al.'s inference of *B* to provide good separation between the regions experiencing the weakest and strongest effects of selection at linked sites within the human genome, with model misspecification unlikely to change our empirical results.

422 While the effects of selection at linked sites in humans captured in our analyses 423 could in principle include the consequences of positive selection, such as soft-sweeps 424 and classic selective sweeps, we applied stringent filters to remove any such regions 425 before our analysis (Materials and methods, S1 Appendix). We therefore expect that 426 most of the resulting patterns we observe can be attributed to the consequences of 427 BGS. Recently, a joint model of classic selective sweeps and BGS was applied to Dro-428 sophila and predicted that BGS has had a ~1.6 to 2.5-fold greater effect on neutral ge-429 netic diversity than classic selective sweeps [33], with another study giving similar re-430 sults [69]. We should expect this magnitude to be even greater for humans, since clas-431 sic selective sweeps were found to be rare in recent human evolution [41] and adaptive 432 substitutions in the human genome are much less frequent than in *Drosophila* [5,70,71]. 433 Nonetheless, we cannot rule out all contributions from hitchhiking to our results. In fact, 434 our own simulations of BGS fail to capture the complete effects of linked selection on 435 reducing  $\pi/\pi_0$  in different human populations (compare Figs 1C and 5C) and the addi-436 tional contribution of hitchhiking to humans, which we did not simulate, may explain this 437 discrepancy.

438 Non-equilibrium demography has also been of recent interest in regards to its 439 impact on patterns of deleterious variation across human populations (often referred to 440 as genetic load), with initial work showing that non-African populations have a greater 441 proportion of non-synonymous deleterious variants that are homozygous compared to 442 synonymous variants [56]. Similar results in human founder populations [57,72], 443 Arabadopsis [73], and domesticated species such as dogs [12] and sunflowers [74] 444 further demonstrate the pervasive impact that demography has on influencing the 445 relative amount of deleterious variation across a variety of populations and species. 446 Since BGS is a function of deleterious variation, it is not surprising that we also witness 447 differences in  $\pi/\pi_0$  across human populations that have experienced different 448 demographic histories. These effects are likley ubiquitous across other species as well. 449 However, there has been recent contention about whether the previously described 450 patterns of increased deleterious variation are driven by a decrease in the efficacy of 451 natural selection (thus resulting in increased genetic load) or are solely artifacts of the 452 response of deleterious variation to demographic change [58,75–78]. Recently, Koch et 453 al. [55] investigated the temporal dynamics of demography on selected sites within 454 humans and observed that after a population contraction, heterozygosity at selected 455 sites can undershoot its expected value at equilibrium as low-frequency variants are lost 456 at a guicker rate before the recovery of intermediate frequency variants can occur. In 457 the context of both BGS and hitchhiking, which skew the site frequency spectrum of 458 linked neutral mutations towards rare variants [26,66,79,80], we also expect a transient 459 decrease in diversity as low-frequency variants are lost quickly during a population 460 contraction. Indeed, as evident from our simulations of BGS and demography,

461 immediatley after a population bottleneck, rapid losses in singleton density can occur, 462 leading to transient decreases in  $\psi/\psi_0$ . However, the recovery in singleton density is 463 also quite rapid, while the recovery in  $\pi$  and  $\pi/\pi_0$  is quite slow. This is due to the fact that 464 higher frequency variants, which contribute a greater amount to  $\pi$ , take a longer amount 465 of time to recover after a population contraction compared to lower-frequency variants 466 such as singletons. However, Koch et al. also demonstrated that the effect of 467 demography on diversity is only temporary and that long-term diversity at selected sites 468 approaches greater values once equilibrium is reached. We also stress these temporal 469 effects on the patterns of relative neutral diversity that we observe here. In the context 470 of BGS, if no population recovery occurs following a contracation, deleterious variants 471 may behave more neutrally, weaking the overall effect of BGS and causing  $\pi/\pi_0$  to 472 become larger than in the ancestral, pre-bottleneck population.

473 The temporal effects of non-equilbrium demographics on patterns of  $\pi/\pi_0$  and 474  $\psi/\psi_0$  may also explain the conflicting results obtained in a similar study of selection at 475 linked sites in teosinte and its domesticated counterpart, maize [59]. In that study, the 476 authors observed that  $\pi/\pi_0$  was higher in maize, which underwent a population bottle-477 neck during domestication (no bottleneck event was inferred for the teosinte population) 478 but that  $\psi/\psi_0$  was also lower. This result is contrary to what we observed qualitatively 479 between non-African and African human populations. However, the demographic mod-480 els that have been inferred for maize and humans are guite different. Maize is inferred 481 to have had a recent, major domestication bottleneck that was essentially instantaneous 482 and followed by rapid exponential growth [59]. In contrast, demographic models for non-483 African humans suggest a much more distant bottleneck that was sustained over a

longer period of time, and only recently have non-African populations experienced rampant growth (coinciding with the advent of agriculture). Given the vastly different demographic models of the two species, it is therefore not surprising that patterns of variation
would be different.

488 The greater contemporary  $N_e$  of non-Africans could theoretically result in a great-489 er efficacy of purifying selection and, consequently, a stronger efficacy of BGS, leading 490 to their observed lower  $\pi/\pi_0$  relative to Africans. However, it is very unlikely that this 491 explains the observed patterns of relative diversity that we see. The greater contempo-492 rary population size of non-Africans has transpired only in the very recent past, with ac-493 celerated growth in Europeans occurring within the last few hundred generations 494 [23,81–84]. Rather, our simulations indicate that the response of  $\pi$  in regions under 495 BGS is driven by the ancient, sustained population contractions humans have experi-496 enced, with reductions in  $\pi/\pi_0$  occurring concomitantly with the out-of-Africa bottleneck 497 and European-East Asian split bottleneck events (Fig 5) and continuing even after the 498 European and East Asian expansion events. In addition, our empirical measurements of 499  $\psi/\psi_0$  demonstrate that in recent time, BGS has had a lower effect in non-Africans com-500 pared to Africans. Our simulations further corroborate this result. The greater sensitivity 501 of regions under BGS to population contractions and accelerated genetic drift is a more 502 likely explanation. Broadly, our results show that contemporary patterns of neutral di-503 versity cannot easily be attributable to contemporary forces of selection but instead may 504 be exhibiting signatures that are still dominated by older demographic events. Interest-505 ingly though, our simulations reveal an additional factor that can influence the impact of 506 BGS within populations - migration between populations. We observe that the ex-

507 change of deleterious variants from populations that have experienced extensive bottle-508 necks to populations with a more stable demography can magnify the strength of selec-509 tion at linked sites. In particular, our simulations show that both  $\pi/\pi_0$  and  $\psi/\psi_0$  decrease 510 in Africans despite the fact that they are inferred to have been constant in size in their 511 recent evolutionary history (Fig 5B). These patterns disappear when migration is re-512 moved (Fig S7, S12 Fig B), however more work is needed to definitively test this.

513 While we describe here the differential effects of non-equilibrium demography on 514 neutral diversity in regions under strong and weak BGS, it is worth mentioning that dif-515 ferences in the reduction of neutral diversity in the genome between different popula-516 tions have also been investigated at the level of entire chromosomes. In particular, 517 analyses of neutral diversity comparing autosomes to non-autosomes (i.e., sex chromo-518 somes and the mitochondrial genome [mtDNA]) have been conducted. Interestingly, 519 these studies have shown that population contractions have impacted the relative re-520 duction of neutral diversity between non-autosomes and autosomes in a similar fashion 521 to what we have observed between regions of strong BGS and weak BGS, with the 522 greatest losses occurring in bottlenecked populations. This was demonstrated in hu-523 mans [85] and later modeled and shown in other species [86], with the explanation that 524 stronger genetic drift due to the lower  $N_e$  of non-autosomes causes diversity to be lost 525 more quickly in response to population size reductions. Recent work in humans has 526 confirmed such predictions by showing that relative losses of neutral diversity in the 527 non-autosomes are greatest for non-Africans [87–89]. These studies, plus others [90], 528 have also shown that there is strong evidence for a more dominant effect of linked se-529 lection on the sex chromosomes relative to the autosomes in humans.

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530 Since linked selection is a pervasive force in shaping patterns of diversity across the genomes in a range of biological species [1], it has been provided as an argument 531 532 for why neutral diversity and estimates of N<sub>e</sub> are relatively constrained across species in 533 spite of the large variance in census population sizes that exist [47,91]. However, since 534 population bottlenecks are common among species and have an inordinate influence on 535  $N_{\rm e}$  [20], demography has also been argued as a major culprit for constrained diversity 536 [2,91–93]. Yet, as we show in humans, it is likely that patterns of neutral diversity are in 537 fact jointly impacted by both of these forces, magnifying one another to deplete levels of 538 diversity beyond what is expected by either one independently. This may play an even 539 larger role in higher  $N_e$  species such as Drosophila, where the overall distribution of B 540 was inferred to be even smaller (i.e., exhibiting stronger BGS) than in humans [32]. In 541 our work, we also identify a potentially substantial role for migration from smaller popu-542 lations that harbor more strongly deleterious alleles on patterns of linked neutral diversi-543 ty in large populations. Together, these combined effects may help provide additional 544 clues for the puzzling lack of disparity in genetic diversity among different species [94].

545 Finally, our results also have implications for medical genetics research, since 546 selection may be acting on functional regions contributing to disease susceptibility. 547 Since different populations will have experienced different demographic histories, the 548 action of linked selection may result in disparate patterns of genetic variation (with ele-549 vated levels of drift) near causal loci. Recent work has already demonstrated that BGS's 550 consequence of lowering diversity impacts power for disease association tests [95]. Our 551 results indicate that this impact may be even further exacerbated by demography in bot-552 tlenecked populations, leading to potentially larger discrepancies in power between dif-

ferent populations. Overall, this should encourage further scrutiny for tests and SNP panels optimized for one population since they may not be easily translatable to other populations. It should also further motivate investigators to simultaneously account for demography and linked selection when performing tests to uncover disease variants within the genome [95–97].

558

# 559 Materials and methods

560 **Data** 

561 2,504 samples from 26 populations in phase 3 of the Thousand Genomes Project 562 (TGP) [9] were downloaded from ftp://ftp.ncbi.nlm.nih.gov/1000genomes/. vcftools 563 (v0.1.12a) [98] and custom python scripts were used to gather all bi-allelic SNP sites 564 from the autosomes of the entire sample set.

565 A subset of TGP samples that were sequenced to high coverage (~45X) by 566 Genomics (CG) downloaded Complete were from 567 ftp://ftp.ncbi.nlm.nih.gov/1000genomes/. After filtering out related individuals via pedi-568 gree analyses, we analyzed 53 YRI, 64 CEU, and 62 CHS samples (S2 Table). The 569 cgatools (v1.8.0) listvariants program was first used to gather all SNPs from the 179 570 samples using their CG ASM "Variations Files" (CG format version 2.2). Within each 571 population, the number of reference and alternate allele counts for each SNP was then 572 calculated using the cgatools testvariants program and custom python scripts. Only al-573 lele counts across high quality sites (i.e., those classified as VQHIGH variant quality by 574 CG) were included. Low quality sites (i.e., those with VQLOW variant quality) were 575 treated as missing data. Only autosomes were kept. Non-bi-allelic SNPs and sites vio-

576 lating Hardy-Weinberg equilibrium (HWE) (p-value < 0.05 with a Bonferroni correction 577 for multiple SNP testing) were also removed.

We collected 13 whole-genome sequenced KhoeSan samples (sequencecoverage: 2.5-50X, see S3 Table in Supporting information) from 3 studies [99–101] and used the processed vcf files from each of those respective studies to gather all biallelic polymorphic SNPs (i.e., the union of variants across all vcf files). SNPs were only retained if they were polymorphic within the 13 samples (i.e., sites called as alternate only within the sample set were ignored).

584

# 585 Filtering and ascertainment scheme

586 Positions in the genome were annotated for background selection by using the 587 background selection coefficient, B, which was inferred by McVicker et al. [6] and down-588 loaded from http://www.phrap.org/othersoftware.html. B was inferred by applying a clas-589 sical model of BGS [60], which treats its effects as a simple reduction in  $N_e$  at neutral 590 sites as a function of their recombination distance from conserved loci, the strength of 591 purifying selection at those conserved loci, and the deleterious mutation rate. B can be 592 interpreted as the reduced fraction of neutral genetic diversity at a particular site along 593 the genome that is caused by BGS, with a value of 0 indicating a near complete remov-594 al of neutral genetic diversity due to BGS and a *B* value of 1 indicating little to no effect 595 of BGS on neutral genetic diversity ( $B = \pi/\pi_0 = N_e/N_0$ ). Positions for B were lifted over 596 from hq18 to hq19 using the UCSC liftOver tool. Sites that failed to uniquely map from 597 hg18 to hg19 or failed to uniquely map in the reciprocal direction were excluded. Sites 598 lacking a B value were also ignored. We focused our analyses on those regions of the

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599 genome within the top 1%, 5%, 10%, and 25% of the genome-wide distribution of *B* and 600 within the bottom 1% of the genome-wide distribution of *B*. These quantiles correspond 601 to the *B* values 0.095, 0.317, 0.463, 0.691, and 0.994, respectively.

A set of 13 filters (referred to as the "13-filter set") were used to limit errors from sequencing and misalignments with rhesus macaque and to remove regions potentially under the direct effects of natural selection and putative selective sweeps (we ignore the linked selection effects of background selection). These filters were applied to all samples in phase 3 TGP (all filters are in build hg19) for all sets of analyses (see S4 Table in Supporting information for the total number of Mb that passed the described filters below for each particular *B* quantile):

609 1. Coverage/exome: For phase 3 data, regions of the genome that were part of 610 the high coverage were excluded exome (see 611 ftp://ftp.ncbi.nlm.nih.gov/1000genomes/ftp/technical/reference/exome pull do 612 wn targets/20130108.exome.targets.bed.README). This was done to limit 613 biases due to differing levels of coverage across the genome and to remove 614 likely functional sites within the exome.

6152. phyloP: Sites with phyloP [102] scores > 1.2 or < -1.2 were removed to limit</th>616the effects of natural selection due to conservation or accelerated evolution.617Scoreswere618http://hgdownload.cse.ucsc.edu/goldenPath/hg19/phyloP46way/.

3. phastCons: Regions in the UCSC conservation 46-way track (table:
phastCons46wayPlacental) [103] were removed to limit the effects of natural
selection due to conservation.

- 622 4. CpG: CpG islands in the UCSC CpG islands track were removed because of
  623 their potential role in gene regulation and/or being conserved.
- 5. ENCODE blacklist: Regions with high signal artifacts from next-generation
   sequencing experiments discovered during the ENCODE project [104] were
   removed.
- 627 6. Accessible genome mask: Regions not accessible to next-generation se-628 quencing using short reads, according to the phase 3 TGP "strict" criteria, 629 were removed (downloaded from 630 ftp://ftp.ncbi.nlm.nih.gov/1000genomes/ftp/release/20130502/supporting/acce 631 ssible genome masks/StrictMask/).
- 632
  632
  7. Simple repeats: Regions in the UCSC simple repeats track were removed
  633
  634
  634
  634
- 635 8. Gaps/centromeres/telomeres: Regions in the UCSC gap track were removed,
  636 including centromeres and telomeres.
- 637
  9. Segmental duplications: Regions in the UCSC segmental dups track [105]
  638 were removed to limit potential effects of natural selection and/or misalign639 ments with rhesus macaque.
- 640 10. Transposons: Active transposons (HERVK retrotransposons, the AluY sub641 family of Alu elements, SVA elements, and L1Ta/L1pre-Ta LINEs) in the hu642 man genome were removed.
- 64311. Recent positive selection: Regions inferred to be under hard and soft selec-644tive sweeps (using iHS and iHH12 regions from selscan v1.2.0 [106]; S1 Ap-

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645 pendix) within each phase 3 population were removed.

- 646 12. Non-coding transcripts: Non-coding transcripts from the UCSC genes track
   647 were removed to limit potential effects of natural selection.
- 64813. Synteny: Regions that did not share conserved synteny with rhesus macaque649(rheMac2) from UCSC syntenic net filtering were removed (downloaded from
- 650 http://hgdownload.soe.ucsc.edu/goldenPath/hg19/vsRheMac2/syntenicNet/).

Additionally, an extra set of filters was applied, but only for those estimates of diversity
 that controlled for GC-biased gene conversion and recombination hotspots:

- 14. GC-biased gene conversion (gBGC): Regions in UCSC phastBias track [107]
   from UCSC genome browser were removed to limit regions inferred to be un der strong GC-biased gene conversion.
- 656 15. Recombination hotspots: All sites within 1.5 kb (i.e., 3 kb windows) of sites 657 with recombination rates  $\geq$  10 cM/Mb in the 1000G OMNI genetic maps for 658 (downloaded non-admixed populations from ftp://ftp-659 trace.ncbi.nih.gov/1000genomes/ftp/technical/working/20130507 omni reco 660 mbination rates/) and the HapMap II genetic map [108] were removed. 1.5 kb flanking regions surrounding the center of hotspots identified by Ref. [109] 661 662 (downloaded from 663 http://science.sciencemag.org/content/sci/suppl/2014/11/12/346.6211.125644 664 2.DC1/1256442 DatafileS1.txt) were also removed, except for the cases in 665 which the entire hotspot site was greater than 3 kb in length (in which case
- just the hotspot was removed).

To generate a set of four-fold degenerate synonymous sites, all polymorphic

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sites that we retained from the high-coverage Complete Genomic samples were annotated using the program ANNOVAR [110] with Gencode V19 annotations. ANNOVAR
and Gencode V19 annotations were also used to gather an autosome-wide set of fourfold degenerate sites, resulting in 5,188,972 total sites.

672

#### 673 **Demographic inference**

674 The inference tool dadi (v1.6.3) [7] was used to fit, via maximum likelihood, the 3-675 population 13-parameter demographic model of Gutenkunst et al. [7] to the 179 YRI, 676 CEU, and CHS samples from the high coverage CG dataset of TGP. This sample set 677 consisted of 53 YRI (African), 64 CEU (European), and 62 CHS (East Asian) samples. 678 The demographic model incorporates an ancient human expansion in Africa and a sin-679 gle out-of-Africa bottleneck followed by European- and East Asian-specific bottlenecks, 680 as well as exponential growth in both non-African populations and migration between 681 populations. During the inference procedure, each population was projected down to 682 106 chromosomes, corresponding to the maximum number of chromosomes available 683 in the CG YRI population. Sites were polarized with chimpanzee to identify putative an-684 cestral/derived alleles using the chain and netted alignments of hg19 with panTro4 685 (http://hgdownload.soe.ucsc.edu/goldenPath/hg19/vsPanTro4/axtNet/), and the correc-686 tion for ancestral misidentification [111] option in dadi was used. The 13-filter set de-687 scribed previously was applied to the CG data set, and an additional filter keeping only 688 the autosomal sites in the top 1% of  $B (B \ge 0.994)$  was also applied in order to mitigate 689 potential biases in inference due to BGS [52,65] or other forms of linked selection [51]. 690 After site filtering and correction for ancestral misidentification, a total of 110,582 segre-

691 gating sites were utilized by dadi for the inference procedure. For optimization, grid 692 points of 120, 130, and 140 were used, and 15 independent optimization runs were 693 conducted from different initial parameter points to ensure convergence upon a global 694 optimum. An effective sequence length (L) of 7.15 Mb was calculated from the input se-695 quence data after accounting for the fraction of total sites removed due to filtering. In 696 addition to the 13-filter set, this filtering included sites violating HWE, sites without B 697 value information, sites that did not have at least 106 sampled chromosomes in each 698 population, sites with more than two alleles, sites that did not have tri-nucleotide infor-699 mation for the correction for ancestral misidentification step, and sites treated as miss-700 ing data. For calculating the reference effective population size, a mutation rate ( $\mu$ ) of 1.66 x 10<sup>-8</sup> (inferred from Ref. [112]) was used. Using the optimized  $\theta$  from dadi after 701 702 parameter fitting, the equation  $\theta = 4N_e\mu L$  was solved for  $N_e$  to generate the reference 703 effective population size, from which all other population  $N_e$ 's were calculated. This 704 same procedure was also used to infer demographic parameters from four-fold degen-705 erate synonymous sites across the same set of samples. After site filtering (note that B 706 and the 13-filter set were not included in the filtering step for four-fold degenerate syn-707 onymous sites), 41,260 segregating sites were utilized by dadi for the inference proce-708 dure, and an effective sequence length of 2.37 Mb was used for calculating the refer-709 ence effective population size.

710

#### 711 Simulations

Forward simulations incorporating the results from the demographic inference procedure described above and a model of background selection were conducted using

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714 SFS CODE [113]. For the model of background selection, the recombination rate,  $\rho$ , 715 and the fraction of the genome experiencing deleterious mutation were calculated using 716 the 2 Mb region of chr3: 48,600,000-50,600,000, which has been subject to the strong-717 est amount of BGS in the human genome (mean B = 0.002). A population-scaled re-718 combination rate ( $\rho$ ) of 6.0443 x 10<sup>-5</sup> was calculated for this region using the HapMap II 719 GRCh37 genetic map [108]. For ascertaining the fraction of sites experiencing deleteri-720 ous mutation, the number of non-coding "functional" sites in this region was first calcu-721 lated by taking the union of all phastCons sites and phyloP sites with scores > 1.2 (indi-722 cating conservation) that did not intersect with any coding exons. This amount totaled to 723 270.348 base pairs. Additionally, the number of coding sites was calculated by summing 724 all coding exons within this region from GENCODE v19, which totaled to 138,923 base 725 pairs. From these totals, the total fraction of deleterious sites, 0.2046, was generated.

726 The background selection model was simulated using a middle 30 kb neutral re-727 gion flanked by two 1 Mb regions under purifying selection. From the calculated fraction 728 of deleterious sites described above. 20.46% of sites in the two 1 Mb flanking regions 729 were simulated as being deleterious. The mutation rate in our simulations for the deleterious sites and for neutral sites were both set to 1.66 x 10<sup>-8</sup> [112]. Two distributions of 730 731 fitness effects were used for the deleterious sites, with 66.06% of deleterious sites using 732 the gamma distribution of fitness effects inferred across conserved non-coding regions 733 by Ref. [114] ( $\beta$  = 0.0415,  $\alpha$  = 0.00515625) and 33.94% of deleterious sites using the 734 gamma distribution of fitness effects inferred across coding regions by Ref. [5] ( $\beta$  = 735 0.184,  $\alpha$  = 0.00040244). The relative number of non-coding "functional" sites and coding 736 exons described above determined the relative number of sites receiving each distribu-

737 tion of fitness effects in our simulations. Gamma distribution parameters were scaled to 738 the ancestral population size of the demographic models used in Refs. [5,114]. An ex-739 ample of the SFS CODE command for our simulations is in S1 Supporting information. 740 To simulate varying levels of background selection strength, different total fractions of 741 our original calculated deleterious fraction of 0.2046 were used (i.e., 5%, 10%, 25%, 742 50%, and 100% of 0.2046). However, the same relative percentage of non-coding and 743 coding sites and mutation rate were used. These different simulated fractions of delete-744 rious sites resulted in a reduced total deleterious mutation rate, U, which is the product 745 of the per-site deleterious mutation rate and the total number of sites experiencing dele-746 terious mutation [66]. Thus, weaker effects of BGS were simulated. To simulate only the effects of demography without background selection, only the 30 kb neutral region was 747 748 simulated. 2,000 independent simulations were conducted for each particular set of the 749 deleterious site fraction  $(2,000 \times 6 = 12,000 \text{ total})$ . Simulations output population genetic 750 information every 100 generations and also at each generation experiencing a popula-751 tion size change (22,117 total generations were simulated), from which mean pairwise 752 nucleotide diversity ( $\pi$ ) and singleton density ( $\psi$ ) was calculated across the 2,000 simu-753 lations.

754

# 755 **Population-specific calculations of diversity and singleton density**

Mean pairwise genetic diversity ( $\pi$ ) and singleton density ( $\psi$ ) was calculated as a function of the *B* quantile bins described in "Filtering and ascertainment scheme" for each of the 20 non-admixed populations in phase 3 TGP and, for  $\pi$ , across 4 broad populations that grouped the 20 non-admixed populations together by continent (Afri-

760 can, European, South Asian, and East Asian, see S12 Table in Supporting information). 761 Additionally, only regions of the genome passing the 13-filter set were used in the calcu-762 lations of  $\pi$  and  $\psi$  (see S4 Table in Supporting information for total number of Mb used 763 in diversity calculations for each B quantile). When calculating  $\psi$  for each non-admixed 764 phase 3 TGP population, the site-frequency spectrum was first projected down to 2N = 765 170 samples (the number of chromosomes in MSL, the smallest phase 3 population 766 sample) using a hypergeometric distribution [7] from each population's full site-767 frequency spectrum. This allowed for unbiased comparisons of singleton density be-768 tween all populations. For estimates of diversity controlling for gBGC or recombination 769 hotspots, the additional corresponding filters described in "Filtering and ascertainment 770 scheme" were also used. Only 100 kb regions of the genome with at least 10 kb of di-771 vergence information with Rhesus macague were used in  $\pi$  and  $\psi$  calculations (see 772 "Normalization of diversity and divergence calculations with Rhesus macague" below).

773

# Normalization of diversity/singleton density and divergence calculations with Rhesus macague

To calculate human divergence with Rhesus macaque, we downloaded the syntenic net alignments between hg19 and rheMac2 that were generated by blastz from http://hgdownload.cse.ucsc.edu/goldenpath/hg19/vsRheMac2/syntenicNet/. We binned the human genome into non-overlapping 100 kb bins and calculated divergence within each bin by taking the proportion of base pair differences between human and Rhesus macaque. Gaps between human and Rhesus macaque, positions lacking alignment information, and positions that did not pass the 13-filter set described in "Filtering and

ascertainment scheme" were ignored in the divergence estimate. Additionally, a separate set of divergence estimates were also made using the additional set of filtering criteria that removed those regions under gBGC or in recombination hotspots and were used for normalizing diversity in those measurements that controlled for gBGC and hotspots.

When normalizing diversity and singleton density by divergence, only 100 kb bins that had at least 10 kb of divergence information were used (21,100 bins total for 13filter set, 20,935 bins total for the 13-filter set plus the additional gBGC and hotspot filters). Bins with less than 10 kb of divergence information were ignored. To make estimates comparable, in those measurements of diversity that did not normalize by divergence, diversity was still calculated using the same set of 100 kb bins that had at least 10 kb for estimating divergence.

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# 796 Calculations of population differentiation (*F*<sub>ST</sub>) and linear regression

797  $F_{ST}$  calculations were performed as a function of B between every pair of non-798 admixed phase 3 TGP populations not belonging to the same continental group (150 799 pairs total). We followed the recommendations in Bhatia et al. [63] to limit biases in  $F_{ST}$ 800 due to 1) type of estimator used, 2) averaging over SNPs, and 3) SNP ascertainment. 801 Specifically, we 1) used the Hudson-based  $F_{ST}$  estimator [115], 2) used a ratio of 802 averages for combining  $F_{ST}$  estimated across different SNPs, and 3) ascertained SNPs 803 based on being polymorphic in an outgroup (i.e., the KhoeSan). For ascertaining SNPs 804 in the KhoeSan, we also performed filtering according to the filtering scheme described 805 under "Filtering and ascertainment scheme." For a position to be considered

polymorphic in the KhoeSan, at least one alternate allele and one reference allele had to be called across the 13 genomes we utilized (see "Data"). These criteria left 3,497,105 total sites in the genome in the phase 3 dataset for  $F_{ST}$  to be estimated across.

810  $F_{ST}$  was calculated across 2% quantile bins of B (based on the genome-wide 811 distribution of B) for all pairwise comparisons of populations between a specific pair of 812 continental groups (25 pairs total) or across all pairwise comparisons using all continen-813 tal groups (150 pairs total). Simple linear regression was performed with the model  $F_{ST}$ =  $\beta_0 + \beta_1 B + \epsilon$ . The mean of the bounds defining each quantile bin was used when de-814 815 fining the explanatory variables for the regression. Linear regression, robust linear re-816 gression [64], and simple correlation were performed using the lm(), rlm(), and cor() 817 functions, respectively, in the R programming language (www. r-project.org). To gener-818 ate standard errors of the mean, this same procedure was performed on  $F_{ST}$  results 819 generated from each of 1,000 bootstrapped iterations of the data.

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### 821 Bootstrapping

**Diversity Estimates.** To control for the structure of linkage disequilibrium and correlation between SNPs along the genome, we partitioned the human genome into nonoverlapping 100 kb bins (these bins were identical to the 100 kb bins used for estimating divergence) and calculated mean pairwise diversity ( $\pi$ ) or heterozygosity within each bin. We also normalized the diversity estimates by divergence within each bin. We then bootstrapped individual genomes by sampling, with replacement, the 100 kb bins until the number of sampled bins equaled the number of bins used for calculating the diversi-

ty point estimates (i.e., 21,100 bins or 20,935 bins total, depending on whether filters for gBGC and hotspots were applied). 1,000 total bootstrap iterations were completed and standard errors of the mean were calculated by taking the standard deviation from the resulting bootstrap distribution.

833  $F_{ST}$ . For bootstrapping  $F_{ST}$ , the human genome was partitioned into non-overlapping 834 100 kb bins and were sampled with replacement until 28,823 bins were selected (the 835 total number of non-overlapping 100 kb bins in the human autosomes).  $F_{ST}$  was then 836 calculated genome-wide for the bootstrapped genome as a function of B for every pair-837 wise comparison of non-admixed phase 3 TGP populations not belonging to the same 838 continental group. 1,000 total bootstrap iterations were completed and standard errors 839 of the mean were calculated by taking the standard deviation from the  $F_{ST}$  distribution 840 calculated from all 1,000 iterations.

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- 1194

# 1195 **Supporting information**

- 1196 **S1** Appendix. Soft sweep detection and implementation in selscan v1.2.0.
- 1197 **S1 Supporting information.**
- 1198 S1 Fig. Inference models inferred from TGP CG high *B* neutral regions and coding
- 1199 four-fold degenerate sites. Solid lines are the inference results from running dadi on
- 1200 53 YRI (African), 64 CEU (European), and 62 CHS (East Asian) TGP CG samples (pro-
- 1201 jected down to 106 chromosomes during inference procedure) across neutral regions in
- 1202 the highest 1% *B* bin ( $B \ge 0.994$ ). Broken lines represent the inference results using the
- 1203 same CG samples, but with sequence data only from coding four-fold degenerate syn-
- 1204 onymous sites.
- 1205 S2 Fig. Diversity for TGP non-admixed populations while controlling for GC-
- 1206 biased gene conversion and recombination hotspots. (A) Normalized diversity
- 1207 ( $\pi$ /divergence) measured across the lowest 1% B quantile bin (strong BGS). (B) Nor-
- 1208 malized diversity measured across the highest 1% B quantile bin (weak BGS). (C) Rela-

1209	tive diversity: the ratio of normalized diversity for the lowest 1% B bin to normalized di-
1210	versity for the highest 1% B bin ( $\pi/\pi_0$ ). Error bars represent ±1 SEM calculated from
1211	1,000 bootstrapped datasets.
1212	S3 Fig. Diversity for TGP non-admixed populations without normalizing by diver-
1213	gence with Rhesus macaque. (A) Diversity ( $\pi$ ) measured across the lowest 1% B
1214	quantile bin (strong BGS). (B) Diversity measured across the highest 1% B quantile bin
1215	(weak BGS). (C) Relative diversity: the ratio of diversity for the lowest 1% B bin to diver-
1216	sity for the highest 1% <i>B</i> bin ( $\pi/\pi_0$ ). Error bars represent ±1 SEM calculated from 1,000
1217	bootstrapped datasets.
1218	S4 Fig. Diversity for TGP continental groups while controlling for GC-biased gene
1219	conversion and recombination hotspots. (A) Normalized diversity ( $\pi$ /divergence)
1220	measured across the lowest 1%, 5%, 10% and 25% <i>B</i> quantile bins (strong BGS) and
1221	the highest 1% <i>B</i> quantile bin (weak BGS). (B) Relative diversity $(\pi/\pi_0)$ for the lowest
1222	1%, 5%, 10%, and 25% <i>B</i> bins. Error bars represent ±1 SEM calculated from 1,000
1223	bootstrapped datasets.
1224	S5 Fig. Diversity for TGP continental groups without normalizing by divergence
1225	with Rhesus macaque. (A) Diversity ( $\pi$ ) measured across the lowest 1%, 5%, 10% and
1226	25% <i>B</i> quantile bins (strong BGS) and the highest 1% <i>B</i> quantile bin (weak BGS). (B)
1227	Relative diversity ( $\pi/\pi_0$ ) for the lowest 1%, 5%, 10%, and 25% <i>B</i> bins. Error bars repre-
1228	sent ±1 SEM calculated from 1,000 bootstrapped datasets.
1229	S6 Fig. $F_{ST}$ measured across joint bins of <i>B</i> and recombination rate for different
1230	<b>TGP continental groups</b> . The left panels of S6 Figs A-E show $F_{ST}$ measured as a func-
1231	tion of 25 4% recombination rate quantile bins conditional on three 2% B quantile bins

1232 (note log scale of x-axis for recombination rate). The right panels of S6 Figs A-E show 1233  $F_{ST}$  measured as a function of 25 4% B quantile bins conditional on three 2% recombi-1234 nation rate quantile bins. The following continental group comparisons are shown for 1235 each plot: (A) African vs. European, (B) African vs. East Asian, (C) European vs. South 1236 Asian, (D) European vs. East Asian, (E) South Asian vs. East Asian. Smaller transpar-1237 ent points and lines show the  $F_{ST}$  estimates and corresponding lines of best fit (using 1238 linear regression) for each of the pairwise population comparisons within a particular 1239 pair of continental groups (25 comparisons total). Larger opaque points are mean  $F_{ST}$ 1240 estimates across all pairwise comparisons within a particular pair of continental groups 1241 (with bold lines showing their corresponding lines of best fit). 1242 S7 Fig. Simulations of diversity and relative diversity under BGS using a human 1243 demographic model without migration. (A) Inferred demographic model from Com-1244 plete Genomics TGP data. The demographic model used for the simulations in S7 Fig. 1245 are identical to those used for Fig 5, except that migration parameters between all popu-1246 lations are set to 0. (B) Simulated diversity at neutral sites across populations as a func-1247 tion of time under our inferred demographic model without BGS ( $\pi_0$  - dashed colored 1248 lines) and with BGS ( $\pi$  - solid colored lines). (C) Relative diversity ( $\pi/\pi_0$ ) measured by taking the ratio of diversity with BGS ( $\pi$ ) to diversity without BGS ( $\pi_0$ ) at each time point. 1249 1250 Note that the x-axes in all three figures are on the same scale. Time is scaled using a 1251 human generation time of 25 years per generation. Simulation data was sampled every 1252 100 generations. 1253 S8 Fig. Simulations of diversity and relative diversity under BGS using various

1254 fractions of sites experiencing deleterious mutation. Values for the deleterious site

fraction are provided in the header for each set of plots. Left column plots show results of simulations under a demographic model with migration between all human populations. Right column plots show results of simulations under a demographic model with no migration. Colored lines represent different populations though time and are identical to those in Fig 5 and S7 Fig The demographic model used is also identical to that in Fig 5 (for simulations with migration) and S7 Fig (for simulations without migration). Simulation data was sampled every 100 generations.

1262 S9 Fig.  $F_{ST}$  is not correlated with recombination rate.

1263  $F_{ST}$  measured across 2% recombination rate quantile bins. The right panel of S9 Fig

1264 displays a narrower range of recombination rates to show detail. Smaller transparent

points and lines show the estimates and corresponding lines of best fit (using linear re-

1266 gression) for  $F_{ST}$  between every pairwise population comparison for a particular pair of

1267 continental groups (25 pairwise comparisons each). Larger opaque points and lines are

1268 mean  $F_{ST}$  estimates and lines of best fit across all Thousand Genomes Project (TGP)

1269 population comparisons between a particular pair of continental groups. Error bars rep-

1270 resent ±1 SEM calculated from 1,000 bootstrapped datasets.

1271 S10 Fig. F<sub>ST</sub> between African (AFR) and South Asian (SASN) populations jointly

1272 across **B** and recombination rate.

1273 (A)  $F_{ST}$  as a function of 25 recombination rate bins (4% quantile bins) conditional on

1274 three different 2% *B* quantile bins (note log scale of x-axis for recombination rate). (B)

1275  $F_{ST}$  as a function of 25 *B* bins (4% quantile bins) conditional on three different 2% re-

1276 combination rate quantile bins. Smaller transparent points and lines show the  $F_{ST}$  esti-

1277 mates and corresponding lines of best fit (using linear regression) for each of the pair-

1282	S11 Fig. Comparing patterns of diversity between local ancestry segments of ad-
1281	sponding lines of best fit).
1280	comparisons of AFR vs. SASN TGP populations (with bold lines showing their corre-
1279	comparisons total). Larger opaque points are mean $F_{ST}$ estimates across all pairwise
1278	wise comparisons of AFR vs. SASN Thousand Genomes Project (TGP) populations (25

1283 mixed samples and continental groups.

1284 (A) Normalized diversity (heterozygosity/divergence) and (B) Relative diversity: the ratio

1285 of normalized diversity in the lowest *B* quantile bins (strong BGS) in (A) to normalized

diversity in the highest 1% *B* quantile bin (weak BGS). Local ancestry segments include

1287 African, European, and Native American ancestries. Continental groups include African,

1288 European, and East Asian populations. Error bars represent ±1 SEM calculated from

1289 1,000 bootstrapped datasets.

# 1290 S12 Fig. Simulations of singleton density and relative singleton density

1291 A) Results of simulations under a demographic model with migration between all human

1292 populations. B) Results of simulations under a demographic model with no migration.

1293 The second row of A) and B) shows measurements of singleton density (i.e., number of

1294 singletons observed per site) from simulations without BGS ( $\psi_0$  - dashed colored lines)

and with BGS ( $\psi$  - solid colored lines). The bottom row of A) and B) shows correspond-

1296 ing relative singleton density ( $\psi/\psi_0$ ) measured by taking the ratio of singleton density

1297 with BGS ( $\psi$ ) to singleton density without BGS ( $\psi_0$ ) at each sampled generation time

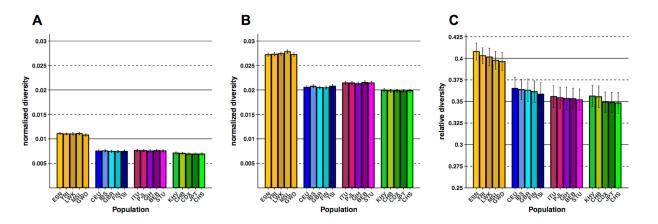
point. The simulation data used for these measurements is identical to that of Fig 5 (for

simulations with migration) and S7 Fig (for simulations without migration).

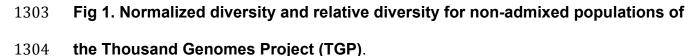
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1302



1305 (A) Normalized diversity ( $\pi$ /divergence) measured across the lowest 1% B quantile bin 1306 (strong BGS). (B) Normalized diversity measured across the highest 1% B quantile bin 1307 (weak BGS). (C) Relative diversity: the ratio of normalized diversity in the lowest 1% B 1308 bin to normalized diversity in the highest 1% B bin  $(\pi/\pi_0)$ . TGP population labels are in-1309 dicated below each bar (see S12 Table in Supporting information for population label 1310 descriptions), with African populations colored by gold shades, European populations 1311 colored by blue shades, South Asian populations colored by violet shades, and East 1312 Asian populations colored by green shades. Error bars represent ±1 SEM calculated 1313 from 1,000 bootstrapped datasets.

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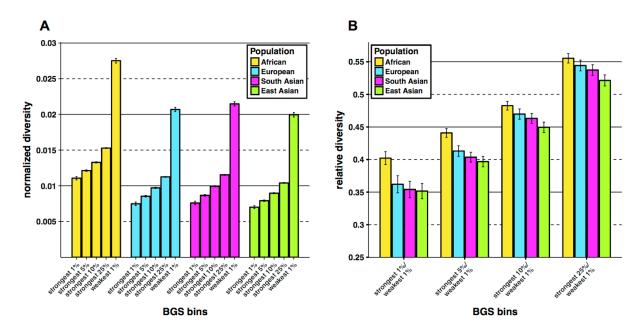
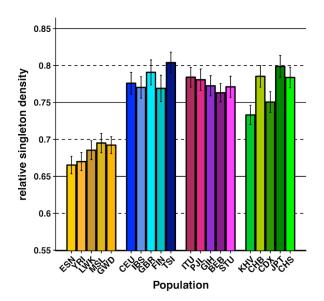


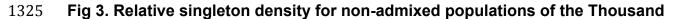


Fig 2. Normalized and relative diversity for Thousand Genomes Project (TGP)
continental groups.
(A) Normalized diversity (π/divergence) measured across the lowest 1%, 5%, 10% and
25% *B* quantile bins (strong BGS) and the highest 1% *B* quantile bin (weak BGS). (B)
Relative diversity: the ratio of normalized diversity in the lowest *B* quantile bins (strong
BGS) in (A) to normalized diversity in the highest 1% *B* quantile bin (weak BGS). Error
bars represent ±1 SEM calculated from 1,000 bootstrapped datasets.

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#### 1324

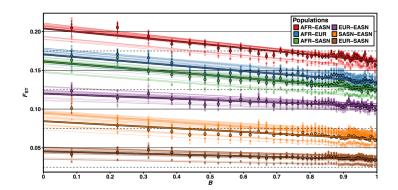


### 1326 Genomes Project (TGP).

1327 Relative singleton density measured by taking the ratio of singleton density in the lowest 1328 1% *B* quantile bin to singleton density in the highest 1% *B* quantile bin ( $\psi/\psi_0$ ). Singleton 1329 density was normalized by divergence with Rhesus macague. TGP population labels 1330 are indicated below each bar (see S12 Table in Supporting information for population 1331 label descriptions), with African populations colored by gold shades, European popula-1332 tions colored by blue shades, South Asian populations colored by violet shades, and 1333 East Asian populations colored by green shades. Error bars represent ±1 SEM calculat-1334 ed from 1,000 bootstrapped datasets.

1335

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#### 1336

### 1337 Fig 4. F<sub>ST</sub> is correlated with B

1338 *F*<sub>ST</sub> measured across 2% quantile bins of *B*. Smaller transparent points and lines show

1339 the estimates and corresponding lines of best fit (using linear regression) for  $F_{ST}$  be-

tween every pairwise population comparison for a particular pair of continental groups

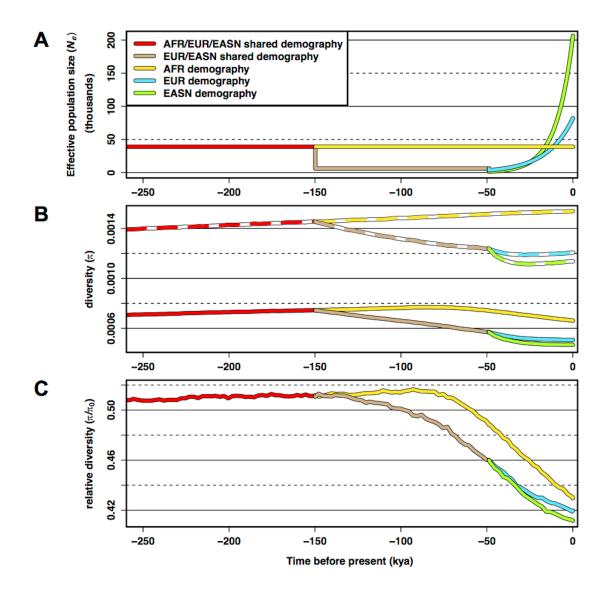
1341 (25 pairwise comparisons each). Larger opaque points and lines are mean  $F_{ST}$  esti-

1342 mates and lines of best fit across all Thousand Genomes Project (TGP) population

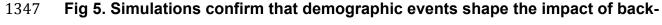
1343 comparisons between a particular pair of continental groups. Error bars represent ±1

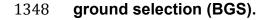
- 1344 SEM calculated from 1,000 bootstrapped datasets.
- 1345

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1346





1349 (A) Inferred demographic model from Complete Genomics Thousand Genomes Project

1350 (TGP) data showing population size changes for Africans (AFR), Europeans (EUR), and

- 1351 East Asians (EASN) as a function of time that was used for the simulations of BGS. (B)
- 1352 Simulated diversity at neutral sites across populations as a function of time under our
- 1353 inferred demographic model without BGS ( $\pi_0$  dashed colored lines) and with BGS ( $\pi$  -

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- 1354 solid colored lines). (C) Relative diversity  $(\pi/\pi_0)$  measured by taking the ratio of diversity
- 1355 with BGS ( $\pi$ ) to diversity without BGS ( $\pi_0$ ) at each time point. Note that the x-axes in all
- three figures are on the same scale. Time is scaled using a human generation time of
- 1357 25 years per generation. Simulation data was sampled every 100 generations.
- 1358