#### 1 Neanderthal introgression reintroduced functional alleles lost in the human out of Africa

2 **bottleneck** 

3 David C. Rinker<sup>1</sup>, Corinne N. Simonti<sup>2,3</sup>, Evonne McArthur<sup>3,4</sup>, Douglas Shaw<sup>3,5</sup>, Emily Hodges<sup>3,5</sup>, and

- 4 John A. Capra<sup>1,3,6,†</sup>
- 5
- 6 <sup>1</sup> Department of Biological Sciences, Vanderbilt University, Nashville, TN, 37235, USA
- 7 <sup>2</sup> Department of Biological Sciences, Georgia Institute of Technology, Atlanta, GA, 30332, USA
- 8 <sup>°</sup> Vanderbilt Genetics Institute, Vanderbilt University, Nashville, TN 37235, USA
- <sup>4</sup> Medical Scientist Training Program, Vanderbilt University, Nashville, TN 37235, USA
- <sup>5</sup> Department of Biochemistry, Vanderbilt University, Nashville, TN, 37235, USA
- <sup>6</sup> Departments of Biomedical Informatics and Computer Science, Vanderbilt University, Nashville,
   TN, 37235, USA
- 12
- 14 <sup>†</sup> Correspondence: tony.capra@vanderbilt.edu
  15

# 16 ABSTRACT

17 Neanderthal ancestry remains across modern Eurasian genomes, and introgressed sequences

- 18 influence diverse phenotypes, including immune, skin, and neuropsychiatric diseases.
- 19 Interpretation of introgressed sequences has focused on alleles derived in the Neanderthal lineage.
- 20 Here, we demonstrate that Neanderthal introgression also reintroduced thousands of ancestral
- 21 hominin alleles lost in the Eurasian out of Africa bottleneck. Combining evolutionary simulations,
- 22 expression quantitative trait loci (eQTL), massively parallel reporter assay (MPRA) data, and *in*
- 23 *vitro* validation, we show that reintroduced alleles (RAs) have different fitness effects than
- 24 Neanderthal-derived alleles (NDAs) and that some RAs regulate gene expression independent of
- 25 NDAs. Illustrating the broad potential influence of RAs, we find that over 70% of known
- 26 phenotype associations with NDAs are equally associated with RAs. Finally, we discover
- 27 enrichment for RA eQTL activity in several tissues, with strongest enrichment in the brain. In
- 28 summary, our study reveals that Neanderthal introgression supplied Eurasians with many lost
- 29 functional variants and demonstrates that RAs must be considered when evaluating the effects of
- 30 introgression.
- 31

### 32 ONE SENTENCE SUMMARY

- 33 Neanderthal interbreeding with modern humans restored to Eurasians, hundreds of thousands of
- 34 ancient alleles that were lost in the out of Africa bottleneck.
- 35

#### 36 MAIN TEXT

37 Modern Eurasian populations have significantly lower genetic diversity than modern African

38 populations, despite having larger census population sizes (1, 2). This disparity reflects the severe

39 genetic bottleneck experienced by the direct ancestors of Eurasian anatomically modern humans

40 (AMH) as they moved out of Africa approximately 50,000 years ago (2, 3). The effective

- 41 population size of this ancestral Eurasian population is estimated to have been less than 20% of the
- 42 size of the contemporaneous African population (*1*, *4*). As a result of this bottleneck, millions of 43 ancient alleles were lost in the ancestors of Eurasians.
- 44 More than 500,000 years prior to the Eurasian out of Africa (OOA) bottleneck, members
- 45 of other hominin groups in Africa, including the ancestors of Neanderthals and Denisovans,
- also moved into Eurasia (*J*). Neanderthals and other descendants of these groups inhabited
  large parts of Eurasia for hundreds of thousands of years prior to the Eurasian OOA
- 47 ange parts of Eurasian OOA 48 migration. The sequencing of ancient DNA from Neanderthal and Denisovan individuals has
- 40 inigration. The sequencing of ancient DIVA from Treanderthal and Demsoval individuals has 49 enabled reconstruction of their genomes (5-7). Comparing Neanderthal genomes to genomes
- 50 of modern humans from around the world revealed that Eurasian AMHs interbred with
- 51 Neanderthals approximately 50,000 years ago (5, 8). The legacy of this archaic introgression is
- 52 reflected in the genomes of modern Eurasians, where 1–3% of DNA sequence in individuals
- 53 is of Neanderthal ancestry (9-12).
- 54Neanderthal introgression introduced many new alleles into Eurasian populations that 55 were derived on the Neanderthal lineage. It has been hypothesized that some of these alleles 56 were adapted to non-African environments and thus were beneficial to Eurasian AMH (9, 10, 57 13-18). However, Neanderthal interbreeding also likely came with a genetic cost due to 58accumulation of weakly deleterious alleles in their lineage, because of their lower effective 59population size compared to AMHs (19, 20). Indeed, the distribution of archaic ancestry 60 across modern Eurasian genomes is non-random, with significant deserts of Neanderthal 61 ancestry as well as many genomic regions in which Neanderthal ancestry is common. This 62 distribution is generally attributed to the long term effects of positive and negative selection 63 acting on introgressed Neanderthal alleles (9, 10, 21), with negative selection acting most 64 strongly immediately after admixture (22).
- 65 For those Neanderthal haplotypes that remain in modern Eurasian populations, 66 introgressed alleles are associated with diverse traits, including risk for skin, immune, and 67 neuropsychiatric diseases (13, 14, 23-26). Notably, an introgressed Neanderthal haplotype at 68 the OAS1 locus influences innate immune response; however, this haplotype also contains an 69 ancient hominin allele in high linkage disequilibrium (LD) with the Neanderthal alleles that 70 could influence function (27). Thus, while most studies have focused on identifying and testing 71 the effects of Neanderthal derived alleles in AMHs, archaic admixture may also have served as 72 a route by which more ancient functional alleles reentered the genomes of Eurasians (27, 28).
- Here, we explore the hypothesis that Neanderthal introgression reintroduced into
  Eurasians functional alleles lost in the Eurasian OOA bottleneck. To evaluate this hypothesis,
  we analyze archaic, modern, and simulated genomes to characterize the prevalence and
  functional influence of the reintroduction of alleles lost in the Eurasian OOA bottleneck. Our
  results conservatively identify more than 200,000 lost alleles that were reintroduced on
- 77 results conservatively identify more than 200,000 lost ances that were reinfordated on
   78 introgressed Neanderthal haplotypes in modern Eurasian populations. We demonstrate
- 79 functional effects for many reintroduced alleles using computational analyses, cross-population
- 80 comparisons of eQTL, and MPRA data. We then experimentally validate the gene regulatory
- 81 effects of a reintroduced allele independent of associated Neanderthal alleles in the context of

82 both African and Eurasian haplotypes. Finally, we discover enrichment for reintroduced alleles

among introgressed alleles with gene regulatory effects in several tissues, including the brain. Taken

84 together, our results demonstrate that Neanderthal populations served as reservoirs of functional

85 ancestral alleles that were lost to Eurasian ancestors in the OOA bottleneck, and that some of

these alleles have functional effects in Eurasians after being reintroduced by Neanderthaladmixture.

87 88

89

#### 90 **RESULTS**

91 To illustrate the evolutionary scenarios we investigate here, consider the simple model of recent

92 hominin demography presented in **Figure** 1A. Many alleles segregating in ancestral hominins were

93 lost to Eurasians in the OOA bottleneck. However, some of these alleles were likely maintained in

- 94 Neanderthal populations whose ancestors also split from this hominin lineage, nearly half a million 95 years before the ancestors of Eurasians. These alleles thus had the potential to be reintroduced
- 95 years before the ancestors of Eurasians. These alleles thus had the potential to be reintroduced 96 into Eurasian populations via archaic admixture. Within these populations, reintroduced alleles
- 90 into Eurasian populations via archaic admixture. Within these populations, reintroduced affects 97 would initially only be present on introgressed Neanderthal haplotypes, and over time many would
- 97 would initially only be present on introgressed iveal derinal haplotypes, and over time many would 98 retain high LD with Neanderthal-derived alleles in modern Eurasians. In the following, we will
- refer to alleles that were present in the most recent common ancestor of AMHs and Neanderthals
- as "ancestral hominin alleles." We will refer to introgressed alleles that were present in this

ancestral population, but lost in Eurasians as reintroduced alleles (RAs). We will refer to

102 introgressed alleles that first appeared on the Neanderthal lineage as Neanderthal-derived alleles

- 103 (NDAs) (Figure 1B). In the following analyses, we evaluate the presence and function of RAs in
- 104 modern Eurasians.
- 105

# 106 Neanderthal introgression likely reintroduced alleles lost in the Eurasian OOA bottleneck

107 To explore the likelihood of the reintroduction of alleles lost in the OOA bottleneck via archaic

108 introgression, we performed forward-time evolutionary simulations. Our demographic model

109 follows the trajectories of variants from an ancestral hominin population through the splitting off of

110 ancestral Neanderthals, the Eurasian human OOA bottleneck, Neanderthal introgression into the

- early Eurasian population, and finally the exponential growth of the modern Eurasian population
- 112 (Figure S1). Our model uses linkage architectures, mutation rates, and demographic characteristics
- 113 described previously (20).

114 These simulations consistently showed that under two archaic admixture fractions (f=0.02 and 0.04), between one and two percent of ancestral hominin alleles segregating in modern Eurasians

116 were present exclusively through reintroduction by Neanderthal introgression (**Table S1**). We

estimated the frequency of false signatures of reintroduction due to confounding mutations within

the Neanderthal lineage that match an allele lost in the Eurasian OOA; such convergent mutations

are extremely rare (<0.0006% of RAs; Figure S2, Methods). Furthermore, the recombination of

120 Eurasian alleles onto introgressed haplotypes followed by their loss on other backgrounds is also 121 extremely rare (<1% for all scenarios, **Table S**2).

122 RAs occurred at approximately one-half the frequency of NDAs in simulated modern

123 Eurasians, and the RA:NDA ratio was robust to changes in the admixture fraction used in the

124 model (Figure 2A). Thus, extrapolating from the hundreds of thousands of NDAs that persist in

125 modern Eurasian genomes, our simulations predict that Neanderthal introgression of alleles that

- 126 were lost in the Eurasian OOA bottleneck was common.
- 127

#### 128 Hundreds of thousands of RAs exist in modern Eurasian populations

129 To conservatively identify candidate RAs in the genomes of modern Eurasians, we sought variants

130 in 1000 Genomes Phase 3 Eurasian populations that are present only on introgressed haplotypes

131 (Figure S3, Methods). We began with sets of tag SNPs on introgressed haplotypes previously

132 identified by S\* and comparison to Neanderthal genomes in European (EUR), East Asian (EAS),

and South Asian (SAS) populations (12). For each population, we identified candidate RAs by

- 134 collecting variants that are in perfect LD ( $r^2=1$ ) with a Neanderthal tag SNP, but that are not tag
- 135 SNPs themselves. We then evaluated each of these candidate RAs with regard to its ancestral status
- 136 and presence in modern sub-Saharan Africans. Candidate alleles that match the high-confidence 137 ancestral allele call from 1000 Genomes or that are present at a frequency of >1% in sub-Saharan
- ancestral allele call from 1000 Genomes or that are present at a frequency of >1% in sub-Saharan
   African populations without substantial Neanderthal ancestry were deemed RAs. We note that this
- approach is likely conservative, because many true **RAs** no longer retain perfect **LD** with any
- 140 NDA.
- 141 Altogether, we identified 209,176 RAs (Figure 2B). The South Asian and East Asian
- 142 populations each have more RAs (139,270 and 125,257 respectively) than the European
- 143 populations (90,121). These numbers reflect the larger number of Neanderthal tag SNPs
- 144 found in the Asian populations (Figure S3, Figure S4) and are consistent with the greater levels
- 145 of Neanderthal ancestry previously observed in East Asians. However, current estimates
- 146 suggest that it is only ~12-20% greater (29). The observed ratios of RAs to NDAs within each
- population (0.46-0.65) were qualitatively consistent with the ratios predicted from thesimulations (Figure 2B).
- A substantial fraction of RAs (EAS: 22%, EUR: 30%, and SAS: 28%) are present in human populations exclusively in genomic regions of Neanderthal ancestry; i.e. these alleles are not present in African populations. This suggests that the non-reintroduced allele became fixed at these positions in AMH populations before the reintroduction of the other ancestral
- 153 allele via Neanderthal admixture.
- Next, we examined the distribution of RAs across introgressed haplotypes: 84.4% (EAS),
  81.8% (EUR), and 81.7% (SAS) of introgressed haplotypes contain RAs. The average number
- of RAs per introgressed haplotype is  $\sim 17$ . (Figure S5A). Of the haplotypes containing RAs,

157 21.3% (EAS), 11.8% (EUR), and 15.2% (SAS) contain more RAs than NDAs. RAs also have

- 158 greater heterogeneity in their distributions across haplotypes, and appear more clustered than
- 159 NDAs (Figure S5B,C). These results likely underestimate the true number and distribution of
- 160 RAs; nonetheless, they demonstrate the existence of RAs and the potential for RAs to

161 influence the function and evolution of most introgressed haplotypes.

162

# 163 RA-containing introgressed haplotypes are associated with anthropometric human traits and164 disease risk

- 165 To update knowledge of human phenotypes influenced by Neanderthal introgression, we
- 166 intersected all RAs and NDAs from each of the three Eurasian populations with the variants
- 167 reported in the GWAS Catalog as of July 23, 2018 (*30*). Overall, Eurasian RAs tagged 270 unique
- associations, 88 of which were genome-wide significant ( $P \le 10^{-8}$ ). NDAs tagged 357 unique
- 169 associations, 129 of which were genome-wide significant (**File** S2).
- 170 Patterns of LD prohibit the implication of the RAs, the associated NDAs, or other
- 171 variants as causal. However, 68% of NDAs significantly associated with at least one
- 172 phenotype are in perfect LD with at least one RA. The consequence of this is that over
- 173 70% of the phenotype associations with NDAs have an equally strong association with an

174 RA. Thus, while previous studies have used GWAS to link variants on introgressed haplotypes

- 175 with phenotypes (5, 6, 9), many associations could be mediated by RAs. By considering a larger set
- 176 of variants in LD with Neanderthal tag SNPs, RAs, and updates to the GWAS catalog, we identify
- 177 many additional associations between introgressed alleles and phenotypes in modern populations.
- 178 Many of the phenotypes directly tagged by RAs are morphometric (e.g., cranial base width,
- BMI, and height), and several others relate to more general aspects of outward appearance (e.g.,
- chin dimples, male-pattern baldness, and skin pigmentation). Introgressed RAs are also associated
   with many pathologies, including cancers (breast, esophageal, lung, prostate), Alzheimer's disease,
   and neurological conditions like neuroticism and himslen disorder (File S2)
- and neurological conditions like neuroticism and bipolar disorder (File S2).
- 183 Several RAs that are no longer present within sub-Saharan African populations have 184 associations with traits. These RAs are particularly interesting, because they represent loci at which 185 derived alleles became fixed in modern human populations after the split from ancestors of 186 Neanderthals. For example, an RA (rs11564258) near *MUC19*, a gel-forming mucin expressed in 187
- 187 epithelial tissues with a potential role in interaction with microbial communities, is strongly
- 188 associated with both Crohn's disease and inflammatory bowel disease (31, 32). This locus has
- been identified in scans for potential adaptive introgression (18). We also find associations with facial morphology, body mass index, sleep phenotypes, and metabolite levels in smokers (33-37).
- 191

### 192 RAs and NDAs have different fitness effects

- 193 RAs and NDAs reflect different evolutionary histories. NDAs arose in Neanderthal populations
- 194 with small effective population size and only came into the AMH genomic context via admixture
- 195 ~ 50,000 years ago. As a result, there was likely a substantial genetic cost to the introgression of
- 196 NDAs into Eurasian populations (19, 20). In contrast, RAs arose in relatively larger ancestral
- 197 hominin populations and are more ancient than the NDAs. Thus, we hypothesized that RAs and
- 198 NDAs would have different distributions of fitness consequences in modern human populations, 199 with NDAs more likely to be deleterious than RAs.
- 200 We first explored the support for this hypothesis with evolutionary simulations. In 100 201 simulated modern Eurasian populations, NDAs were the most deleterious class of alleles, and RAs 202 had significantly less extreme effects (median selection coefficient RA=-7.7e-5; NDA=-1.9e-4; p  $\approx$ 203 0. Wilcoxon Rank Sum test, Figure 3A). This result was not sensitive to admixture fraction (Figure 204 S6). As expected, among all segregating alleles present in simulated Eurasian populations, African 205alleles that passed through the Eurasian OOA bottleneck had the least deleterious fitness effects. 206 Thus, supporting previous studies, Neanderthal admixture likely introduced weakly deleterious 207 NDAs into admixed populations (19, 20). However, this hybridization simultaneously 208 reintroduced a host of more ancient RAs that Eurasian ancestors lost during their journey out of
- Africa and our simulations suggest these have fitness effects which are intermediate to those of AMH alleles maintained in Eurasians and NDAs.
- 211 We then tested these simulated predictions in real genomic data by comparing the predicted
- 212 deleteriousness scores of RAs and NDAs. Combined Annotation-Dependent Depletion (CADD)
- 213 is a variant annotation tool that integrates variant attributes and effect predictions from other tools,
- and then assigns a single score based on a statistical model trained on real and simulated variants
- 215 (38). The scaled CADD scores for the RAs were significantly lower (less deleterious) than for 216 NDA is used a score of the RAS were significantly lower (less deleterious) than for 216 NDA is used a score of the RAS were significantly lower (less deleterious) than for 216 NDA is used a score of the RAS were significantly lower (less deleterious) than for 216 NDA is used a score of the RAS were significantly lower (less deleterious) than for 216 NDA is used a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significantly lower (less deleterious) that for 216 NDA is used as a score of the RAS were significant (less deleterious) the RAS were significant (less delet
- NDAs in each population (median scaled score: NDA=2.67; RA=2.23;  $P \approx 0$ , Wilcoxon Rank Sum test; Figure 3B, Figure S7). NDAs were nearly twice as prevalent among the most deleterious
- 217 of all variants (CADD score > 10).

219 To evaluate the potential effects of RAs and NDAs at the introgressed haplotype level, we 220 repeated these analyses considering the maximum CADD scores for RAs and NDAs within each 221 haplotype. Overall, the most deleterious RA in a haplotype is significantly less deleterious than the 222 most deleterious NDA (median scaled CADD score: NDA=13.34; RA=5.79;  $P \approx 0$ ; Figure 3C). 223 This is the result of both the greater number of NDAs per haplotype and differences in the 224CADD score distributions between NDAs and RAs (Figure 3B). Given the strong LD between 225variants on each introgressed haplotype, it is informative to quantify these distributions at the 226 haplotype level. Indeed, for over 60% of introgressed haplotypes, the maximum NDA score falls 227 in the top 10% of the most deleterious variants genome-wide (scaled scores above 10); only 0.23% 228 of introgressed haplotypes have maximum RA score in this range. Taken together, both simulation 229 and analyses of observed variants argue that the NDAs are more likely to be deleterious than the 230 more ancient RAs, especially when viewed within the context of introgressed haplotypes 231 themselves. Therefore, as expected from their different evolutionary histories, the fitness effects of

232 RAs are likely different from NDAs.

233 In spite of these differences in estimated fitness effects, RAs and NDAs were similarly

234 likely to overlap functional gene regulatory elements according to RegulomeDB, a variant

annotation tool that integrates known and predicted regulatory elements (*39*). In total, 19,882

RAs are predicted to influence gene regulatory elements; this fraction is nearly identical to the estimate for NDAs (**Figure S**9; 10.0% vs. 10.1%, P = 0.07). These results suggest that **RAs** and

238 NDAs have similar relevance to gene regulation, and they are not confounded by LD.

239

#### 240 Some RAs have conserved regulatory associations in European and African populations

Given the high LD between RAs and NDAs, it is challenging to determine from genetic association

data alone whether a particular RA or NDA is functional. To search for RAs that are functional

243 independent of associated NDAs, we considered cross-population eQTL data from

- 244 lymphoblastoid cell lines (LCLs) from European (EUR) and sub-Saharan African Yoruba (YRI)
- individuals (40). We tested European RAs for shared eQTL activity in Europeans and Yoruba
- 246 (Figure 4A). Because sub-Saharan African populations have little to no Neanderthal ancestry, no
- alleles in these populations are in LD with NDAs. Thus, if an allele that was reintroduced into
   Eurasians shows similar effects on gene expression in both populations, it strongly suggests that that
- the **RA** influences expression, and that introgression reintroduced ancestral regulatory function.

250 In the LCL eQTL data derived from both EUR and YRI individuals, we identified

- 42 significant cross-population RA eQTLs. These RA eQTLs influence the expression of nine genes (**Table S3**). The expression differences observed for the RAs in EUR have the
- same direction of effect and similar magnitude as those observed for the corresponding

allele in YRI. For example, two genes, *SDSL* and *HDHD5*, each have four cross-

255 population RA eQTLs that have similar effects on gene expression in both EUR and YRI

256 (Figure 4B). Given the low sample size, limited power, and limited cellular scope of the

- 257 cross-population eQTL data, it is challenging to estimate the full extent to which RAs
- 258 contribute regulatory function. Nonetheless, these results suggest that many RAs are
- 259 functional in Eurasian individuals.
- 260

#### 261 RAs can influence expression independent of NDAs

262 To evaluate if **RAs** directly influence expression in **EUR** individuals, we functionally dissected the

- 263 regulatory activity of an introgressed haplotype containing cross-population RA eQTLs. HDHD5
- 264 (also known as *CECR*) is a hydrolase domain containing protein that is expressed in diverse

tissues. It is located in a region of chromosome 22 associated with Cat Eye Syndrome (CES), a rare disease associated with chromosomal abnormalities in 22q11 with highly variable clinical

- 267 presentation that often includes multiple malformations affecting the eyes, ears, anus, heart, and
- kidneys (41). The HDHD5 locus contains an introgressed 2 kb region that carries an NDA that is
- 269 in perfect LD with four RAs that are cross-population eQTLs for *HDHD5* (Figure 4C).
- We performed luciferase reporter assays in LCLs on four different versions of the region that contains the NDA and RA eQTLs (**Figure 4D, Table S5**). First, we evaluated the luciferase activity
- driven by a reporter construct with the European version of this sequence without introgression
- 273 (EUR-EUR). This sequence drove significant expression above baseline (~2.0x vector with no
- insert, P < 0.01, t-test). We compared this activity to constructs synthesized to carry the RAs with the associated NDA (NDA-RA), the RAs without the NDA (EUR-RA), and the NDA without the
- 276 RAs (NDA-EUR). Both RA-containing sequences drove significantly lower luciferase activity, and
- there was no significant difference in the activity of the NDA-RA and the EUR-RA sequences
- (Figure 4D). Thus, as predicted by the cross-population eQTL data, the RA locus influences
   expression independently of the associated NDA, and the RA-containing sequences have lower
- 280 activity than sequences without the RAs.
- To ascertain whether the conservation of activity patterns we demonstrated at the *HDHD5* locus could be specifically attributed to one of the four RAs, we analyzed MPRA data from LCLs (42). The MPRA simultaneously evaluated the regulatory potential of candidate variants in LCL eQTL to identify causal variants. Only one of the four cross-population RA eQTL (rs71312076) showed significant regulatory effects (RA:EUR allelic skew=2.122, *P*=6.6e-3, FDR=0.034)
- 285 showed significant regulatory encets (RALEOR anche skew 2.122, 7 0.00-3, FDR 0.004)
   286 compared to the non-reintroduced allele (Figure 4E). These effects were observed on the non 287 introgressed European reference background, further demonstrating the ability of this RA locus to
   288 influence regulation independent of NDAs.
- Together, these results provide three orthogonal lines of evidence (cross-population eQTL,
   luciferase reporter, and MPRA) implicating RAs in the reintroduction of regulatory effects in the
- 291 *HDHD5* locus. Importantly, both our luciferase assays and the MPRA data show that the
- functional contribution of RAs within a European genomic context is not dependent on the
- introgressed haplotype in which it occurs. Therefore, these data, along with the eQTL status of this
- region in YRI, demonstrate that Neanderthal introgression restored an allele lost in the Eurasian
- 295 OOA bottleneck that influences gene regulation.
- 296

# 297 RAs are enriched for gene regulatory effects in brain tissues

- Introgressed haplotypes have been previously shown to modulate gene regulation, especially in the brain (24, 43). Given that we have now demonstrated that RAs can reintroduce lost gene regulatory
- functions and that **RAs** and **NDAs** likely have different distributions of fitness effects, we evaluated
- whether RAs were enriched among introgressed eQTL in any of the 48 tissues profiled in v7 of the
- 302 Genotype-Tissue Expression (GTEx) project (44). Here we only analyzed European RAs and
- 303 NDAs due to the strong European ancestry bias in GTEx.
- 304 Introgressed eQTL are found in all GTEx tissues, and 18% (16,318) of EUR RAs are
- 305 eQTLs in at least one tissue. However, by definition each RA is associated with at least one NDA,
- and 16% (31,822) of NDAs are eQTLs in at least one tissue. Therefore, to identify tissues in which
- 307 RAs are disproportionately associated with observed regulatory effects, we tested for RA
- an enrichment among all introgressed eQTLs in each tissue. Accordingly, we calculated an odds ratio
- 309 (OR) for each GTEx tissue based on the status of introgressed variants as RAs vs. NDAs and as
- 310 eQTLs in that tissue (Methods).

311 Thirteen of the 48 tissues are significantly enriched for RAs among all introgressed 312 eQTLs ( $P \le 0.01$ , hypergeometric test after Bonferroni correction), and four tissues are 313 significantly depleted of RA eQTL (Figure 5). Brain tissues appear enriched among the RA 314 eQTL enriched tissues (7 of 13, P = 0.0144, hypergeometric test), though there is likely 315 shared regulatory architecture among brain regions. In brain, the strongest enrichment of RA eQTLs is in the frontal cortex, while the greatest overall number occurs in the 316 317 cerebellar hemisphere. RA eQTLs are also significantly enriched in the pituitary gland, 318 pancreas, adrenal gland, testes, and tibial nerve. RAs are significantly depleted in 319 esophagus, colon, salivary gland, and vagina. These enrichments and depletions reflect the 320 interplay between eQTL status and LD among the introgressed alleles. Given that all RAs 321 are in perfect LD with at least one NDA, this suggests that the presence of RAs on an

- introgressed haplotype influences the likelihood of regulatory activity in some tissues, and 323 that there are different pressures on RA-containing introgressed haplotypes in different
- 324 tissues.
- 325

322

#### 326 DISCUSSION

327 Here we demonstrate that thousands of alleles lost in the Eurasian OOA bottleneck had been

328 retained within Neanderthals, and that the presence of these ancient alleles in modern 329 Eurasians is exclusively attributable to archaic admixture between Neanderthals and AMHs

330 (Figure 1A). We further show that RAs and NDAs have different fitness effects, and that some

331 RAs have gene regulatory functions that are not dependent upon associated NDAs.

332 Nevertheless, in spite of the high prevalence of RAs and their potential to independently 333 influence function, interpretation of the phenotypic effects of Neanderthal introgression has 334 generally focused on NDAs. Our results argue that RAs must also be considered in any

335 analyses of archaic admixture.

336 Our approach identifies more than 200,000 RAs, yet more work is needed to 337 comprehensively identify all RAs in Eurasians. For example, our conservative approach 338 misses true RAs that no longer have perfect LD with the original Neanderthal tag SNPs. 339 Furthermore, thousands of candidate RAs were not classifiable because they lacked a high-340 confidence ancestral assignment or were not observed in modern Africans. Some of these 341 unclassified variants are undoubtedly ancient, but thus far defy confident characterization due 342 to their complex histories. We expect that more sophisticated simulations and probabilistic 343 modeling could allow for the identification of additional RAs. For example, modeling full 344 chromosomes with detailed recombination maps could be used to assign confidence scores to 345 candidate RAs that are no longer in perfect LD with NDAs. Furthermore, simulations 346 considering additional fitness parameters, mutation rates, and migration patterns could more 347 accurately inform our expectations for the number of RAs in introgressed populations and to 348 evaluate the extent to which RAs could counterbalance the effects of NDAs (45-47). 349 Nonetheless, our simulations and analyses of real genomes agree that RAs are common.

350 Previous work has implicated the small effective population size of Neanderthal 351 populations as a key factor in their transmission of weakly deleterious NDAs into AMHs via 352 introgression (19, 20, 48). Our observations demonstrate that Neanderthal populations 353 additionally preserved and reintroduced many less deleterious, and perhaps beneficial, ancient alleles (Figure 3, Figure S8, Figure S9). While NDAs and RAs were both carried by 354 355 Neanderthal populations with low effective population size, the lower probability of

356 deleteriousness among RAs is consistent with many aspects of their evolutionary histories. 357 First, RAs are more ancient than NDAs, and thus selection has had greater opportunity to act on

them. Second, the RAs likely arose in a population with relatively larger effective population size

(1, 4). Finally, the RAs arose in a genomic background ancestral to and likely more similar toAMHs.

Comprehensive estimation of the total number of functional RAs is challenging due to LD with NDAs and the lack of comparative functional data from diverse cellular contexts and populations. Nonetheless, analysis of known regulatory elements suggests that ~10% (19,882) of RAs are likely to influence transcription factor binding or gene expression (**Figure S9**). As MPRAs, eQTL analyses, and GWAS are performed in more diverse populations and tissues it will be possible to identify functional RAs on a much broader scale.

367 Given our demonstration that some RAs restore functions lost in Eurasian populations, the 368 enrichment for RAs relative to NDAs among GTEx eQTLs in many tissues-the brain in 369 particular—is provocative (Figure 5). Brain tissues have enrichment for Neanderthal eQTL (24), 370 and there is significant allele-specific down regulation of haplotypes carrying Neanderthal alleles in 371 the brain and testes (43). Furthermore, these observations are consistent with previous results 372 about the gene regulatory effects of introgressed alleles, and several evolutionary scenarios may be 373 involved. First, the depletion of NDAs relative to RAs on some introgressed haplotypes with gene 374regulatory functions could be a result of previously demonstrated selection against NDAs in some 375 tissues (43). This selection would deplete tissue specific regulatory regions of NDA-rich 376 introgressed haplotypes; indeed, the two tissues with known allele-specific down regulation of 377 Neanderthal alleles, brain and testes, are enriched for RAs compared to NDAs. Second, the 378 patterns we see could result from positive or balancing selection acting to retain beneficial RAs. 379 Under this scenario, archaic admixture restored alleles with beneficial regulatory functions that 380 were lost during the Eurasian OOA bottleneck, and these RAs contributed to the maintenance of 381 some introgressed haplotypes. The third possibility is that both RAs and NDAs on introgressed 382 haplotypes are functional and influence selective pressures on the haplotypes. In this case, the 383 presence of RAs could counterbalance mildly deleterious effects of associated NDAs, and thus 384 buffer some introgressed haplotypes from purifying selection. Importantly, these explanations are 385 not mutually exclusive, and the reality is likely some combination of all of them.

Overall, we anticipate that the regulatory effects of RAs and NDAs differ between tissues
based on the genetic diversity of and strength of constraint on their regulatory landscapes.
Interestingly, nervous system tissues (including the brain) and the testes have extreme levels of
selection on gene expression (high and low, respectively) (49). Given the range of RA eQTL
enrichments across GTEx tissues, including tissues without evidence of selection against
Neanderthal alleles, we propose that the presence of RAs and NDAs is the result of a mixture of
selective pressures acting within the regulatory constraints of each tissue.

Therefore, whether contributing beneficial effects on their own or serving to mitigate the deleterious effects of NDAs, RAs likely play a functional role across diverse tissues and thus contribute to the persistence of introgressed haplotypes. Disentangling the effects of introgressed eQTLs in high LD will require further experimental evidence along the lines of those we performed at the *HDHD5* locus (**Figure** 4D). In addition, it would be informative to compare the functional effects of RAs with other alleles restored to Eurasian populations by recent direct migration from Africa (*22, 50*), as well as effects within African populations.

400 Analysis of RAs is also relevant to studies of the genetics of ancient hominin populations.
401 For example, tens of thousands of RAs that are present in Eurasians have since been lost in
402 African populations. These ancient variants could both inform ongoing debates over differences in

403 efficiency of natural selection between Africa and Eurasia (51-54), as well as provide a

- 404 window into ancient genetic variation that was present in Africa over a half million years ago.
- 405
- 406
- 407

#### 408**CONCLUSIONS**

409 Here we show that Neanderthal introgression reintroduced functional alleles lost in the Eurasian

410 out of Africa bottleneck. This illustrates the importance of accounting for shared ancestral variation

411 among hominin populations and shows that hybridization events between populations have the

potential to modulate the effects bottlenecks have on allelic diversity. Our findings open several 412

413 avenues for future work on quantifying the evolutionary and functional dynamics of archaic

414 introgression. Previous analyses of introgression have focused on alleles derived within the

Neanderthal lineage. Reintroduced alleles must also be considered in analyses of Neanderthal 415

introgression, at both the haplotype and genome scale. Future studies should account for the 416

417 potentially beneficial fitness effects of these alleles and their influence on the maintenance of

418 Neanderthal ancestry.

#### 420 ACKNOWLEDGMENTS

- 421 We thank Ben Haller, Phillip Messer, and Kelley Harris for advice on evolutionary simulations.
- 422 We thank Ryan Tewhey for discussions of MPRA results. This work was supported by the
- 423 National Institutes of Health: T32EY021453 to CNS; T32GM080178 to DS; K22CA184308 to
- 424 EH; and R01GM115836 and R35GM127087 to JAC. This work was conducted in part using the
- 425 resources of the Advanced Computing Center for Research and Education at Vanderbilt
- 426 University, Nashville, TN.
- 427

#### 428 AUTHOR CONTRIBUTIONS

- 429 DCR, CNS, EM and JAC conceived and conducted the computational analyses. DS and EH
- 430 performed the luciferase assays. DCR and JAC wrote the manuscript with input from all authors.

### 432 **DECLARATION OF INTERESTS**

- 433 The authors declare no competing interests.
- 434

431

435

### 436 **REFERENCES**

- The 1000 Genomes Project Consortium, A global reference for human genetic variation.
   *Nature*. 526, 68-74 (2015).
- 439
  439
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
  440
- 441 3. L. Pagani *et al.*, Genomic analyses inform on migration events during the peopling of
  442 Eurasia. *Nature*. 538, 238–242 (2016).
- 4. B. M. Henn, L. R. Botigué, C. D. Bustamante, A. G. Clark, S. Gravel, Estimating Mutation
  Load in Human Genomes. *Nat. Rev. Genet.* 16, 333–343 (2015).
- 445 5. K. Prüfer *et al.*, The complete genome sequence of a Neanderthal from the Altai
  446 Mountains. *Nature*. 505, 43–49 (2014).
- 447 6. K. Prüfer *et al.*, A high-coverage Neandertal genome from Vindija Cave in Croatia. *Science*448 (80-.). 358, 655-658 (2017).
- 449 7. M. Meyer *et al.*, A high-coverage genome sequence from an archaic Denisovan individual.
  450 *Science (80-. ).* 338, 222–226 (2012).
- 451 8. R. E. Green *et al.*, A draft sequence of the neandertal genome. *Science (80-. ).* 328, 710–
  452 722 (2010).
- 453 9. S. Sankararaman *et al.*, The genomic landscape of Neanderthal ancestry in present-day
  454 humans. *Nature*. 507, 354–357 (2014).
- 455 10. B. Vernot, J. M. Akey, *Science (80-. ).*, in press.
- 456 11. S. Sankararaman, S. Mallick, N. Patterson, D. Reich, The Combined Landscape of
  457 Denisovan and Neanderthal Ancestry in Present-Day Humans. *Curr. Biol.* 26, 1241–1247
  458 (2016).
- 459 12. B. Vernot *et al.*, Excavating Neandertal and Denisovan DNA from the genomes of
  460 Melanesian individuals. *Science (80-. ).* 352, 235–239 (2016).
- 461 13. L. Abi-Rached *et al.*, The Shaping of Modern Human Immune Systems by Multiregional
  462 Admixture with Archaic Humans. *Science (80-. ).* 334, 89–94 (2011).
- 463 14. F. L. Mendez, J. C. Watkins, M. F. Hammer, A Haplotype at STAT2 Introgressed from
  464 Neanderthals and Serves as a Candidate of Positive Selection in Papua New Guinea. *Am. J.*

465		<i>Hum. Genet.</i> <b>91</b> , 265–274 (2012).
466	15.	M. Dannemann, K. Prüfer, J. Kelso, Functional implications of Neandertal introgression in
467		modern humans. <i>Genome Biol.</i> 18, 61 (2017).
468	16.	X. Liu, X. Jian, E. Boerwinkle, dbNSFP: a lightweight database of human nonsynonymous
469		SNPs and their functional predictions. Hum. Mutat. 32, 894-9 (2011).
470	17.	F. Racimo, S. Sankararaman, R. Nielsen, E. Huerta-Sánchez, Evidence for archaic adaptive
471		introgression in humans. Nat. Rev. Genet. 16, 359-371 (2015).
472	18.	F. Racimo, D. Marnetto, E. Huerta-Sánchez, Signatures of archaic adaptive introgression in
473		present-day human populations. Mol. Biol. Evol. (2017), doi:10.1093/molbev/msw216.
474	19.	I. Juric, S. Aeschbacher, G. Coop, The Strength of Selection against Neanderthal
475		Introgression. <i>PLOS Genet.</i> <b>12</b> , e1006340 (2016).
476	20.	K. Harris, R. Nielsen, The Genetic Cost of Neanderthal Introgression. Genetics (2016).
477	21.	R. M. Gittelman et al., Archaic Hominin Admixture Facilitated Adaptation to Out-of-Africa
478		Environments. <i>Curr. Biol.</i> <b>26</b> , 3375–3382 (2016).
479	22.	M. Petr, S. Pääbo, J. Kelso, B. Vernot, The limits of long-term selection against Neandertal
480		introgression. <i>bioRxiv</i> (2018), doi:10.1101/362566.
481	23.	M. Dannemann, J. Kelso, The Contribution of Neanderthals to Phenotypic Variation in
482		Modern Humans. Am. J. Hum. Genet. 101, 578–589 (2017).
483	24.	C. N. Simonti et al., The phenotypic legacy of admixture between modern humans and
484		Neandertals. Science (80 ). 351, 737-741 (2016).
485	25.	Y. Nédélec et al., Genetic Ancestry and Natural Selection Drive Population Differences in
486		Immune Responses to Pathogens. <i>Cell</i> (2016), doi:10.1016/j.cell.2016.09.025.
487	26.	H. Quach et al., Genetic Adaptation and Neandertal Admixture Shaped the Immune
488		System of Human Populations. <i>Cell</i> (2016), doi:10.1016/j.cell.2016.09.024.
489	27.	A. J. Sams et al., Adaptively introgressed Neandertal haplotype at the OAS locus
490	2.2	functionally impacts innate immune responses in humans. Genome Biol. 17, 246 (2016).
491	28.	Y. Hu, Q. Ding, Y. He, S. Xu, L. Jin, Reintroduction of a Homocysteine Level-Associated
492	20	Allele into East Asians by Neanderthal Introgression. Mol. Biol. Evol. 32, msv176 (2015).
493	29.	F. A. Villanea, J. G. Schraiber, Multiple episodes of interbreeding between Neanderthal and
494	90	modern humans. Nat. Ecol. Evol. 3, 39–44 (2019).
495	30.	J. MacArthur <i>et al.</i> , The new NHGRI-EBI Catalog of published genome-wide association
496	91	studies (GWAS Catalog). Nucleic Acids Res. 45, D896–D901 (2017).
497	31.	A. Franke <i>et al.</i> , Genome-wide meta-analysis increases to 71 the number of confirmed
498	90	Crohn's disease susceptibility loci. <i>Nat. Genet.</i> <b>42</b> , 1118–25 (2010).
499	32.	L. Jostins <i>et al.</i> , Host-microbe interactions have shaped the genetic architecture of
500 501	99	inflammatory bowel disease. <i>Nature</i> . <b>491</b> , 119–24 (2012).
501 509	33.	M. K. Lee <i>et al.</i> , Genome-wide association study of facial morphology reveals novel
502 503	34.	associations with FREM1 and PARK2. <i>PLoS One</i> . <b>12</b> , e0176566 (2017). S. L. Park <i>et al.</i> , Mercapturic Acids Derived from the Toxicants Acrolein and
503 504	04.	Crotonaldehyde in the Urine of Cigarette Smokers from Five Ethnic Groups with Differing
504 505		Risks for Lung Cancer. <i>PLoS One.</i> 10, e0124841 (2015).
505 506	35.	J. Spada <i>et al.</i> , Genome-wide association analysis of actigraphic sleep phenotypes in the
500 507	00.	LIFE Adult Study. J. Sleep Res. 25, 690–701 (2016).
507 508	36.	A. M. Kulminski <i>et al.</i> , Strong impact of natural-selection-free heterogeneity in genetics of
508 509	00.	age-related phenotypes. Aging (Albany. NY). 10, 492–514 (2018).
510	37.	S. M. Lutz <i>et al.</i> , A genome-wide association study identifies risk loci for spirometric
511	07.	measures among smokers of European and African ancestry. <i>BMC Genet.</i> 16, 138 (2015).
011		measures among smokers of European and Amean arcesuy. Diffe Ochel, 10, 100 (2010).

512	38.	M. Kircher et al., A general framework for estimating the relative pathogenicity of human
513		genetic variants. Nat. Genet. 46, 310-315 (2014).
514	39.	A. P. Boyle et al., Annotation of functional variation in personal genomes using
515		RegulomeDB. Genome Res. 22, 1790-7 (2012).
516	40.	T. Lappalainen et al., Transcriptome and genome sequencing uncovers functional variation
517		in humans. <i>Nature</i> . <b>501</b> , 506–11 (2013).
518	41.	OMIM, CAT EYE SYNDROME; CES, (available at https://www.omim.org/entry/115470).
519	42.	R. Tewhey et al., Direct Identification of Hundreds of Expression-Modulating Variants
520		using a Multiplexed Reporter Assay. <i>Cell.</i> <b>165</b> , 1519–1529 (2016).
521	43.	R. C. McCoy, J. Wakefield, J. M. Akey, Impacts of Neanderthal-Introgressed Sequences on
522		the Landscape of Human Gene Expression. <i>Cell</i> . 168, 916–927.e12 (2017).
523	44.	GTEx Consortium, Genetic effects on gene expression across human tissues. Nature. 550,
524		204–213 (2017).
525	45.	P. Moorjani, C. E. G. Amorim, P. F. Arndt, M. Przeworski, Variation in the molecular
526		clock of primates. Proc. Natl. Acad. Sci. 113, 10607-10612 (2016).
527	46.	A. Harpak, A. Bhaskar, J. K. Pritchard, Mutation Rate Variation is a Primary Determinant
528		of the Distribution of Allele Frequencies in Humans. <i>PLOS Genet.</i> <b>12</b> , 1–22 (2016).
529	47.	K. Harris, J. K. Pritchard, Rapid evolution of the human mutation spectrum. <i>Elife</i> . 6,
530		e24284 (2017).
531	48.	S. Castellano et al., Patterns of coding variation in the complete exomes of three
532		Neandertals. Proc. Natl. Acad. Sci. 111, 6666–6671 (2014).
533	49.	D. Brawand et al., The evolution of gene expression levels in mammalian organs. Nature.
534		<b>478</b> , 343–348 (2011).
535	50.	A. Platt, J. Hey, Recent African gene flow responsible for excess of old rare genetic variation
536		in Great Britain. <i>bioRxiv</i> (2017), doi:10.1101/190066.
537	51.	B. M. Henn et al., Distance from sub-Saharan Africa predicts mutational load in diverse
538		human genomes. Proc. Natl. Acad. Sci. U. S. A. 113, E440-9 (2016).
539	52.	K. E. Lohmueller, The distribution of deleterious genetic variation in human populations.
540		<i>Curr. Opin. Genet. Dev.</i> <b>29</b> , 139–146 (2014).
541	53.	K. E. Lohmueller et al., Proportionally more deleterious genetic variation in European than
542		in African populations. <i>Nature</i> . <b>451</b> , 994–997 (2008).
543	54.	Y. B. Simons, M. C. Turchin, J. K. Pritchard, G. Sella, The deleterious mutation load is
544		insensitive to recent population history. <i>Nat. Genet.</i> <b>46</b> , 220-4 (2014).
545	55.	B. C. Haller, P. W. Messer, SLiM 2: Flexible, interactive forward genetic simulations. Mol.
546		Biol. Evol. (2017), doi:10.1093/molbev/msw211.
547	56.	A. Eyre-Walker, M. Woolfit, T. Phelps, The Distribution of Fitness Effects of New
548		Deleterious Amino Acid Mutations in Humans. Genetics. 173, 891-900 (2006).
549	57.	S. Gravel et al., Demographic history and rare allele sharing among human populations.
550		Proc. Natl. Acad. Sci. 108, 11983-11988 (2011).
551	58.	P. Danecek et al., The variant call format and VCFtools. Bioinformatics. 27, 2156–2158
552		(2011).
553		
554		
555		

#### 556 FIGURE CAPTIONS

557

#### 558 Figure 1. Schematic of the reintroduction of alleles lost in the Eurasian out of Africa (OOA)

559 **bottleneck by Neanderthal introgression.** (A) Illustration of the evolutionary trajectory and

resulting genomic signature of an allele A (blue) that was: (1) segregating in the ancestors of

561 modern humans and Neanderthals, (2) lost to the ancestors of Eurasians in the human OOA

562 bottleneck, and (3) reintroduced to Eurasians through Neanderthal admixture. Consequently,

reintroduced alleles (RAs) are expected to be in high linkage disequilibrium with some
 Neanderthal-derived alleles (NDAs; orange) in introgressed haplotypes (gray) in modern

565 Eurasians. (B) Schematics of the different evolutionary histories of interest in this paper. All alleles

566 lost in the Eurasian OOA bottleneck and reintroduced by Neanderthal introgression are referred

567 to as RAs. Alleles that appeared in the Neanderthal lineage, were not present in the ancestors of

- 568 humans and Neanderthals, and only exist on introgressed haplotypes in modern humans are
- 569 referred to as Neanderthal-derived alleles (NDAs).
- 570

571 Figure 2. Neanderthal introgression reintroduced thousands of alleles lost in the OOA bottleneck

572 to Eurasian populations. (A) The ratios of RAs to NDAs over 100 simulated Eurasian populations.

573 The simulations predict approximately one **RA** for every two **NDA**s, and these estimates are

574 robust to changes in the simulated Neanderthal admixture fraction. Misclassification of non-RAs as

575 RAs due to independent, convergent mutations is extremely rare (**Figure** S2) and the overall false 576 discovery rate for LD-based RA identification is below ~1% (**Table** S2). (B) The number of RAs

and NDAs in each Eurasian 1000 Genomes population (EAS = East Asian; EUR = European

578 ancestry; SAS = South Asian) identified by our pipeline (Figure S3; Methods). Neanderthal

admixture reintroduced over 200,000 alleles lost in the human OOA bottleneck into the ancestors

580 of 1000 Genomes populations, and the observed RA-to-NDAs ratio is consistent with the

- 581 simulations.
- 582

583 Figure 3. Reintroduced alleles have different fitness effects than Neanderthal-derived alleles. (A)

584 Simulations identify weak selection against both NDAs and RAs, but the RAs persisting in modern

585 Eurasian populations were consistently less deleterious than NDAs over 200 simulations (median

selection coefficient RA=7.7e-5; NDA=1.9e-4,  $P \approx 0$ , Wilcoxon rank sum test). (B) In modern

- 587 Eurasian populations, RAs are predicted to be significantly less deleterious than NDAs by CADD
- 588 (median scaled CADD: NDA=2.7; RA=2.1;  $P \approx 0$ ). The upper tail of highly deleterious mutations

is highlighted in the inset. Results are similar for unscaled scores. (C) At the haplotype level, the

590 maximum RA CADD score per haplotype is significantly lower than for NDAs (median scaled

591 maximum KY CADD score per naplotype is significantly lower than for ADA's (incutan scare 591 max CADD: NDA=13.3; RA=5.8;  $P \approx 0$ ). This is in part due to the overall difference

592 demonstrated in (B) and to the greater number of NDAs per haplotype. RAs are rarely the most

593 deleterious variant per haplotype. Results shown are for Europeans (EUR); results in East and

- 594 South Asian populations are similar (Figure S7, Figure S8).
- 595

#### 596 Figure 4. Reintroduced alleles restore regulatory functions lost in the Eurasian OOA bottleneck.

597 (A) Conceptual model of restored regulatory function resulting from Neanderthal admixture.

598 Here, allele A is a cis-acting regulatory variant that is exclusively found on introgressed haplotypes

599 (grav) in modern Europeans (EUR). Allele A is also present in sub-Saharan Yoruba individuals 600 (YRI) lacking Neanderthal ancestry. It displays similar cis-regulatory activity in both populations. This pattern suggests that allele A is an RA in Eurasians and that it influences gene regulation 601 602 independent of the associated NDAs. (B) Two examples of genes (SDSL and HDHD3) with 603 consistent expression differences (measured in RPKM) associated with RA eQTLs in EUR and 604 the corresponding allele in YRI LCLs. The RAs are present only on introgressed haplotypes in 605 EUR, and the NDAs associated with the RAs are not present in YRI. This suggests that these RAs 606 restore lost gene regulatory functions in Europeans. (C) Schematic of the HDHD5 locus 607 highlighting the locations of one NDA (orange) and four RA eQTLs (blue) in the introgressed 608 haplotype and the different combinations of these alleles present in EUR, YRI, and Neanderthals. 609 (D) Luciferase activity driven by constructs carrying different combinations of alleles present in the 610 HDHD5 locus. We assayed four constructs containing: 1) no introgressed alleles, 2) only the 611 NDA, 3) only the RAs, and 4) all introgressed variants. Results are summarized over three 612 replicates. As expected from the eQTL data, constructs lacking RAs drive significantly stronger expression ( $^{2}$ x baseline) than constructs containing RAs ( $^{1}$ x baseline; two-tailed t-test, P < 0.01 613 614 (\*\*) and P < 0.001 (\*\*\*)). The regulatory effect of the RAs is independent of the presence the NDA found in introgressed EUR haplotypes. (E) Regulatory activity in a massively parallel 615 616 reporter assay (MPRA) for the four HDHD5 RA eQTLs reveals that rs71312076 has significant 617 regulatory effects when placed in the non-introgressed European background sequence. The other

- 618 three **RAs** did not drive significant regulatory activity.
- 619
- 620 Figure 5. Reintroduced alleles are significantly enriched among introgressed eQTLs in brain and
- 621 several other tissues. Bubble plot quantifying the enrichment for eQTL activity among EUR RAs
- 622 compared to all introgressed eQTL in each GTEx v7 tissue. Enrichment was quantified with an
- 623 odds ratio for each tissue based on the status of introgressed variants as RAs vs. NDAs and as
- 624 eQTLs. The bubbles are scaled by the number of RA eQTLs in each tissue and colored by the
- 625 overall number of introgressed eQTLs. Of the 48 tissues considered, RAs were significantly
- 626 enriched compared to NDA eQTLs in 13 tissues, and significantly depleted in four (P < 0.01, 627 hypergeometric test after Bonferroni correction). The strongest enrichment for RA eQTLs was in
- 628 the frontal cortex. Brain regions were enriched among the 13 tissues with RA eOTL enrichment (7
- 629 of 13, P = 0.0144, hypergeometric test), though we note that some brain regions likely have shared
- 630 regulatory architecture.

#### 631 METHODS

#### 632 Sequence data

633 Genomic variants were taken from 1000 Genomes Phase 3v5a data (1). Introgressed Neanderthal 634 tag SNPs were downloaded from: http://akeylab.princeton.edu/downloads.html (12). All analyses

- 635 were conducted using GRCh37/hg19 genomic coordinates.
- 636

#### 637 Evolutionary simulation design

638 SLiM (v2.6) was used for all evolutionary simulations (55). We used a genomic model taken from 639 previous simulation studies of Neanderthal introgression and mutation load (20). In brief, the 640 human genome is represented by a syntenic, locus-based model constructed considering all exons 641 within the hg19 reference genome. Nucleotide positions of exons are modeled individually while 642 intergenic regions and chromosomal boundaries are modeled as single sites. Recombination is 643 modeled as a probability of  $1.0 \times 10^{-8}$  crossovers per site per generation, with probabilities in intergenic regions scaled by their respective sizes; chromosome boundaries are modeled as having 644 645a recombination rate of 0.5. Mutations are modeled based upon a non-synonymous substitution 646 rate of  $7.0 \times 10^{-9}$  mutations per site per generation. Fitness effects (FE) were assigned to mutations

based either upon a presumption of neutrality (FE=0) or purifying selection (FE drawn from (540)

648 gamma distribution with shape parameter 0.23 and mean selection coefficient -0.043) (56). 649 The general demographic model through which these genomes were then allowed 650 to evolve is illustrated in **Figure S1**. Here, genetic diversity within the ancient human population (10,000 diploid individuals) was first established by allowing mutations to arise 651 and equilibrate during a "burn in" period of 44,000 generations in the ancestral hominin 652 653 population prior to subsequent migrations. To track allelic loss and reintroduction, we 654 focused on segregating sites that were present in this simulated ancestral population 655 immediately before the split between the human and Neanderthal lineages; we tracked all 656 of these ancestral hominin alleles over the 18,000 subsequent generations that

657 encompassed both the Neanderthal and Eurasian OOA bottlenecks.

658Then the ancestral Neanderthal population was subsampled to 1,000 individuals659and both human (African) and Neanderthal populations were allowed to evolve separately660for 16,000 generations (400,000-464,000 years assuming a generation time of 25–29 years).

661 The Eurasian OOA migration and Neanderthal admixture were then modeled as a

simultaneous, discreet event that resulted in an admixed Eurasian population size of 1861

663 individuals (20, 57). The admixed Eurasian population was then allowed to evolve for

664 2000 generations before it underwent an exponential growth phase leading to modern
665 Eurasians. This final Eurasian population is used to evaluate the presence and properties of
666 RAs.

667 These simulations were run in parallel. One hundred replicates under both neutral 668 or purifying selection were conducted to establish an estimate of confounding mutations 669 (**Figure S2**). Eurasian–Neanderthal admixture fractions of both 0.02 and 0.04 were run 670 under the purifying model, with 100 modern Eurasian populations of 20,310 individuals 671 each generated for each admixture fraction.

672

#### 673 Quantitating false positives within simulation data

674 SLiM profiles for all populations were collected at relevant timepoints: t1) Neanderthal OOA, t2)

675 immediately prior to the Eurasian migration, t3) immediately following admixture, and t4) modern

676 human populations. Mutation origin was used to establish when and where (in the genome) a

variant arose, and successive timepoints were used to query these mutation IDs forpresence/absence.

679 First, we estimated the rate at which variants could be mis-assigned RA status as the result 680 of independent, convergent origins in African and Neanderthal populations. To infer the 681 frequency of such confounding variants, all variants in simulated human and Neanderthal 682 populations were compared immediately prior to admixture (t2) in each of the 100 replicates for 683 each model. Confounding variants were identified based upon a shared genomic location between 684 existing variants in Africans and variants that arose within the Neanderthal lineage. These counts 685 were then contrasted with the number of non-Neanderthal derived mutations and found to be very 686 rare (Figure S2). Moreover, because SLiM does not consider nucleotide state and allows for 687 "stacked" mutations (i.e., mutations at the same locus), our estimates of false assignment of RA 688 status in this model are conservative because we also considered nucleotide state in the real data.

689 Second, we evaluated the reliability of requiring perfect LD between RAs and NDAs in 690 modern Eurasian populations in the inference of RA status. It is possible that non-Neanderthal 691 alleles could have recombined on to introgressed haplotypes and subsequently been lost outside of 692 the introgressed context. We reasoned that this scenario would be very unlikely, but to test this we 693 examined each of the simulated Eurasians (t4) and extracted all variants in perfect LD with an 694NDA in modern Eurasians. We then queried the simulation data from t2 to count how many of 695 these candidate RA variants were not present on a Neanderthal haplotype. These variants in 696 perfect LD with an NDA in modern Eurasians that were not present in Neanderthals (and that had 697 not independently evolved within Eurasians) would be incorrectly inferred to be RAs by our 698 approach. Fortunately, these events were very rare (1% of RAs or fewer) for each admixture 699 fraction (**Table S2**). Furthermore, these false discovery rates are likely overestimates since in the 700 real data, RAs most frequently appear within introgressed haplotypes, with linked NDAs present 701 on both sides. This would require confounding recombination events to occur twice, with all the 702 confounding alleles then being subsequently lost on all, non-introgressed haplotypes to maintain 703 perfect LD. In the future, we anticipate that these simulations can be refined to confidently identify 704 more RAs that have less than perfect LD with NDAs.

705

#### 706 Estimating RA presence and selection coefficients in modern Eurasians from simulation data

To quantify the frequency of **RAs** in modern Eurasian populations we first defined "ancestral

- hominin variants" as those alleles segregating in the simulated population immediately prior to the
- Neanderthal split ~500,000 years ago (t2). In the SLiM simulations, we tracked these segregating
- ancestral variants through the Neanderthal lineage and into the modern Eurasian population. We
- 111 used SLiM's mutation identifiers to track these ancestral variants through Neanderthals and into
- 713 0.04). From these 200 introgressed Eurasian populations data we were able to identify all the
- ancestral variants that passed into AMHs exclusively through 1) the Eurasian OOA migration or 2) archaic admixture with Neanderthals. Only variants in the second category were considered to be
- 715 archaic admixture with Neardermas. Only variants in the second category were considered to be 716 RAs within the context of the simulation. We extracted allele counts and selection coefficients
- 717 (admixture models were run only under purifying selection) for these RA variants from the SLiM
- output. We then did the same for the simulated NDAs, the only other class of variants that entered
- the modern Eurasian populations exclusively through Neanderthal introgression. These data are
- summarized and contrasted in Figure 2A and Figure 3A.
- 721

#### 722 RA candidate identification and classification from 1000 Genomes data

To generate a set of candidate RAs, we gathered Neanderthal "tag SNPs" identified in each of the three, 1000 Genomes Eurasian super-populations (EUR, EAS, SAS;

725 <u>http://akeylab.princeton.edu/downloads.html</u>). We then calculated LD using vcftools (*58*) for all

- variants in  $\pm -500$  kb windows around each variant across individuals from these super-populations
- in Phase 3 of the 1000 Genomes project. We extracted all variants that were in perfect LD  $(r^2=1)$
- 728 with any Neanderthal tag SNP in any of EUR, EAS, or SAS.
- For each candidate RA (i.e., variant in perfect LD with a Neanderthal tag SNP), we:
- 1) extracted the ancestral allele call from 1000 Genomes, 2) ascertained whether the
- 731 designated REF or the ALT allele was the introgressed variant (i.e., in LD with the
- Neanderthal tag SNP), 3) calculated the introgressed allele frequency, 4) calculated the
- allele frequency for the introgressed allele in sub-Saharan African 1000 Genomes
- populations (ESN, GWD, LWK, MSL, YRI), and 5) extracted the Altai Neanderthal
- 735 genotype. We then called RA status based on this information (Figure S3). For each RA
- candidate, if the introgressed variant matches the high-confidence, ancestral state, it is
- classified as an RA, more specifically a reintroduced ancestral allele (RAA). Candidate RAs
- that do not match or have a high confidence ancestral allele call are evaluated for presence in both the Altai Neanderthal and in sub-Saharan Africans (allele frequency > 1%). If the
- in both the Altai Neanderthal and in sub-Saharan Africans (allele frequency > 1%). If the
   variant is only present in the Altai Neanderthal, it is classified as an NDA. If the candidate
- variant is only present in the Altai Neanderthal, it is classified as an NDA. If the candidate
   variant is only present in sub-Saharan African at a frequency > 1%, it is classified as an RA
- and assigned to the sub-class of reintroduced hominin alleles (RHA), given that its origin
- 743 likely predates the Neanderthal split but its state in the human-chimp ancestor is not
- known. If the candidate RA is present in both the Altai Neanderthal and sub-Saharan
- Africans, it is classified as an RA (also of the sub-class RHA). For nearly all analyses, RHAs
- and RAAs are treated as a single RA class. The results of this classification are summarized
- 747 in Figure 2B and supplied in full in File S1. The pipeline and filtering steps are
- summarized in **Figure** S5.
- 749We did not constrain our search for RAs to the bounds of previously identified750introgressed haplotypes. While approximately 90% of RAs are within the boundaries of751previously characterized introgressed haplotypes, over half of the haplotypes in each
- population have at least one associated **RA** beyond their previous bounds. In total,
- extending all introgressed haplotypes to accommodate all associated RAs increases
- introgression estimates by 40.0, 42.6, and 51.9 megabases (Mb) in the EUR, EAS, and SAS
- populations, respectively. This represents an increase of  $\sim 1.5\%$  in the amount of
- 756 introgressed sequence present in each Eurasian population.
- 757

#### 758 Spatial characterization of RAs and NDAs along introgressed haplotypes

- The locations and distributions of **RA**s within introgressed haplotypes appeared more independent
- of haplotype length and more clustered than the distribution of NDAs. The number of NDAs per
- haplotype is strongly positively correlated with the length of the haplotype ( $r^2 = 0.85$ ; Figure S5),
- but the RA content of a haplotype is more variable ( $r^2 = 0.56$ ). Therefore, while the overall
- RA:NDA ratio is ~1:2 over all haplotypes (Figure 2), the RA content of any specific introgressed
  haplotype cannot be reliably inferred from the number of NDAs present.
- To evaluate whether **R**As are more clustered on introgressed haplotypes than **ND**As, we
- summarized the distribution of both NDAs and RAs across all RA-containing haplotypes. We
- first divided each RA-containing haplotype into 100 equal-size bins and counted the number
- of RAs in each bin. For each haplotype, the bins were then ranked from high to low in terms
- of RA count, and the RA contents of each corresponding percentile bin were summed over all

the haplotypes. This percentile sum was then divided by the total number of all RAs present over

- all the haplotypes to obtain per-bin densities. By calculating per-bin densities only at the end, we
- mitigate the potentially confounding effect of some haplotypes containing fewer variants than
- others. The result is a summary of the total fraction of RAs found within increasing density
   percentiles across all haplotypes. We then did the same for NDAs (Figure S5) Overall, a large
- percentiles across all haplotypes. We then did the same for NDAs (**Figure** S5) Overall, a larger fraction of **RAs** is found in the densest bins compared to NDAs. For example, in EUR, 55% of
- RAs are in the four densest bins, while only 26% of NDAs are in the four densest bins. These
- results held across each population and were maintained when down sampling to a set of
- haplotypes with matched NDA and RA counts. Thus, when RAs are present, they often occur in
- more discrete clusters along introgressed haplotypes than do NDAs. However, we note that the
- incomplete ascertainment of RAs and the LD thresholds used to link NDAs may contribute to
- these patterns.
- 782

#### 783 Computational variant effect estimation

784 To assess the potential functional impact of RAs, we retrieved precomputed Combined

- 785 Annotation-Dependent Depletion (CADD) v1.3 scores (https://cadd.gs.washington.edu/download)
- for all RA and NDA variants. CADD scores are available in two forms: raw and scaled. Raw
- 787 CADD scores are the output of the model for each variant, whereas scaled scores are PHRED-
- scaled to the range of values observed over all genomic variants (*38*). Therefore, the scaled scores
- communicate how deleterious the effect of a given variant is with respect to the effects seen in all
- other variants (e.g., a scaled CADD of 20 means that that a variant is within the top 1% of variants
- as ranked by their predicted deleteriousness). Thus, we focused on the PHRED-scaled scores. We
- highlight in **Figure** 2B scaled CADD scores at the upper range (e.g., above 10 or 15) that are likely suggestive of acute pathogenicity. We also compared functional annotation classes downloaded for
- 794 RAs and NDAs from RegulomeDB v1.1 (http://www.regulomedb.org/).
- 795

# 796 Functional annotation of RAs

- *Protein coding.* To assess potential functional consequences of RAs in Eurasians, we first explored
   effects of RAs on protein coding regions. We intersected all NDAs and RAs from each Eurasian
- population with all coding variants annotated in dbSNP (v150). We then filtered for frameshift,
- 800 missense, and nonsense variants and constructed a set of non-synonymous, introgressed variants.
- 801 Overall, less than 1% of all introgressed variants lie in protein coding regions, with 1973, 1682 and
- 802 2353 introgressed coding variants in EAS, EUR, and SAS respectively. Within each population,
- 803 approximately 30% of coding variants were non-synonymous, with very similar proportions of
- 804 synonymous and non-synonymous variants across each population. Consequently, neither
- 805 introgressed class was enriched (hypergeometric test) for non-synonymous variants in any of the
- three populations.
- 807
- 808 *Genome-wide association study hits.* We intersected all RAs and NDAs from each of the three
- 809 Eurasian populations with the variants reported in the GWAS Catalog (as of July 23, 2018). Full 810 results are provided in **File S**2.
- 811
- 812 GTEx eQTL enrichment analysis.
- 813 Expression quantitative trait loci (eQTL) data from GTEx v7 were downloaded from the GTEX
- 814 portal (https://www.gtexportal.org/home/datasets) and all significant gene-eQTL pairs were
- 815 extracted for each tissue. We then identified all RAs and NDAs with eQTL status. To test whether

# 816 RAs are enriched among the introgressed eQTL for a tissue, we calculated an odds ratio (OR)

817 over all introgressed variants based on RA status and tissue eQTL status:

- 818
- 819
- 820

 $OR = \left( (R/N)/(R'/N') \right)$ 

821 where R is the # of RAs that are tissue eQTL; R' is the # of RA that are not tissue eQTL; N is the #

822 of NDA that are tissue eQTL; and N' is the # of NDA that are not tissue eQTL. Sets of both R'

and N' were composed of only those introgressed variants that were present in GTEx

824 **output.** We tested for enrichment (or depletion) of RAs among introgressed eQTL in each tissue

with the hypergeometric test and used the Bonferroni correction to account for the testing of 47 tissues analyzed here (0.01/47=0.0002).

827

### 828 Shared RA eQTLs between Europeans and Africans

829 To identify **RA**s with similar regulatory associations between populations with and without

- 830 Neanderthal ancestry, we analyzed data from a previous study that identified eQTL across LCLs
- 831 derived from 495 individuals (40). The LCLs were of either European (EUR; 373 lines) or African
- 832 (YRI; 89 lines) ancestry; given the smaller YRI sample size, there was much lower power to detect
- 833 eQTL in the African samples. We downloaded all significant exon-level expression eQTLs from
- 834 the study (<u>https://www.ebi.ac.uk/arrayexpress/files/E-GEUV-1/analysis\_results/</u>). They found
- 835 704,157 unique eQTL in EUR and 75,742 in YRI, and of these, 52,869 are shared. Of the shared
- 836 loci, 42 are RAs, and these RAs associate with expression levels for nine genes (Table S3).
- 837

# 838 MPRA analysis of RAs

A recent MPRA study evaluated the regulatory impact of 32,373 variants in 3,642 known eQTL

- and regions identified via GWAS (42). For each variant, the MPRA quantified the expression of a
- 841 reporter driven by both the reference and alternate alleles (plus 150 bp of reference genomic
- 842 context) in LCLs. Expression modulating variants were identified by quantifying the "allelic skew"
- between the expression driven by the reference and alternate allele. This enabled the identification
- 844 of hundreds of variants likely to cause observed associations between these loci and expression
- 845 levels/phenotypes. To evaluate whether the MPRA data could help evaluate whether RAs have
- 846 functional effects, we intersected European NDAs and RAs in introgressed haplotypes with the
- variants with significant combined skew (FDR < 0.1). In total, 11 introgressed variants were tested</li>
  (6 NDAs and 5 RAs; Table S4). This included all cross-population RA eQTLs in the introgressed
- (6 NDAs and 5 RAs; Table S4). This included all cross-population RA eQTLs in the introgressed
   haplotype that is associated with *HDHD5* expression. Thus, we focused our experimental
- naprotype that is associated with *FIDFID3* expression. Thus, we focused our experimental
   validation on this locus.
- 851

# 852 Experimental validation of RA regulatory function via luciferase assays

- 853 To further demonstrate that the cross-population RA eQTLs associated with *HDHD5* expression 854 function independently of the NDA in perfect LD, we evaluated the effects of four different
- 855 sequences on luciferase expression in LCLs (**Figure** 4D).
- 856 Modified pGL4 luciferase constructs were generated via Gibson cloning (New
- 857 England Biolabs) to contain an 1826 bp oligo corresponding to region of interest in
- 858 *CECR5/HDHD5* with variants corresponding to a European reference (EUR-EUR), the
- 859 introgressed NDA sequence (NDA-EUR), the RA sequences (EUR-RA), or both sets of
- introgressed variants (NDA-RA) (**Table** S5). Inserts were cloned into pGL4.27 reporter
- 861 vector (Promega) as two separate blocks, as b1-EUR or b1-NDA (first 576 bp at the 3' end

862 of blocks containing either NDA or EUR specific sequence) and b2-EUR or b2-RA (1273 bp at 5' 863 end of blocks containing either RA or EUR specific sequence) (Table S5). b1-EUR, b1-NDA, and 864 b2-RA sequences were generated by oligonucleotide synthesis (IDT). b2-EUR variants were 865 generated via site-directed mutagenesis using primers with EUR specific alleles (Table S6) and 866 amplified directly from b2-RA oligo as five separate sub-regions. B2-EUR sub-regions were 867 assembled into the pGL4.27 vector and sub-cloned into EUR-EUR and NDA-EUR pGL4 868 constructs. Inserts were amplified to include NheI and XhoI overhangs to allow for cloning into 869 the pGL4 reporter plasmid. The sequences of full-length inserts were confirmed by Sanger 870 sequencing (Genewiz).

GM11831 B-cells were cultured in RPMI with penicillin/streptomycin and 15% fetal
bovine serum. 1x106 GM11831 cells were transfected with 5 ug HDHD5-EUR-EUR-pGL4.27,
HDHD5-NDA-EUR-pGL4.27, HDHD5-EUR-RA-pGL4.27, or HDHD-NDA-RA-pGL4.27
along with 500 ng pRL-CMV (Renilla reporter plasmid) via electroporation (Neon Transfection
System, Invitrogen). Firefly and Renilla luciferase activity was analyzed using the Dual-Glo
Luciferase Assay System (Promega) and Synergy HTX MicroPlate Reader (BioTek) 19 hours post
electroporation. Firefly reporter expression was normalized to Renilla luciferase activity. Statistical

significance was determined through a two tailed t-test comparing fold change of the normalized
 luciferase activity over an unmodified (no insert) pGL4.27 reporter control.

880

### 881 Data analysis and visualization

Evolutionary simulations and primary data analysis were conducted on Vanderbilt's computing
cluster (ACCRE). Results were parsed and analyzed with custom python and bash scripts.
Statistical tests were performed with R. Plots were generated in R, with most generated using
ggplot2.

- 886
- 887

### 888 SUPPLEMENTARY FIGURE CAPTIONS

889 Figure S1 Demographic model used for evolutionary simulations. The demographic model used

to simulate human-Neanderthal admixture and quantify the reintroduction of lost alleles. The
 model and effective population sizes (N<sub>e</sub>) were based on previous simulations of Neanderthal

admixture (20). We considered models in which mutations incurred a fitness cost (mildly purifying

893 selection) or no fitness cost (strict neutrality). Two different admixture fractions (f=0.02 and f=0.04)

894 were used in the simulations (Methods).

895

### 896 Figure S2 Simulations indicate that false positives in RA identification due to independent

897 convergent mutations are rare. For each simulated population, we identified all NDAs that

898 occurred in positions with ancestral hominin variation that was lost in the Eurasian OOA. The

899 boxplots summarize the frequencies at time of admixture (c.f. Error! Reference source not found.)

- 900 of these potentially confounding NDAs among all sites that would be called as RAs. The incidence
- 901 of these confounding mutations is slightly higher under a purely neutral model (left) than one
- 902 where new mutations could be deleterious (right). Each boxplot represents 100 simulated
- 903 populations with admixture fraction of 0.02.
- 904

905 Figure S3 Introgressed allele class assignment decision tree and allele count summary. Decision

- 906 tree by which 1000 Genomes variants in perfect LD with Neanderthal tag SNPs were classified as
- 907 RAs and NDAs. The counts of variants making it into each of the numbered steps (1-5) is
- 908 summarized in the lower table.
- 909
- 910 Figure S4 Introgressed allele sharing across three Eurasian populations. Venn diagram showing the
- 911 fractions of each introgressed variant class that are shared between populations.
- 912
- 913 Figure S5 Reintroduced alleles cluster within introgressed Neanderthal haplotypes. (A) Scatter plot
- 914 of the numbers of RAs and NDAs contained on all introgressed haplotypes in EUR. The
- 915 correlation between the NDA and RA content is moderate (Pearson's  $r^2=0.46$ ), with 18% of the
- haplotypes containing no RAs and 10% having more RAs than NDAs. (B) Scatter plot of the
  number of introgressed variants on each haplotype vs. haplotype length. The NDA content of a
- haplotype is proportional to its length ( $r^2 = 0.85$ ), but the number of RAs in each haplotype is less
- strongly correlated with length ( $r^2 = 0.56$ ). (C) Heat map of the fraction of NDAs and RAs in
- 920 density percentiles (high to low, l-r) averaged over all introgressed Eurasian haplotypes. This
- 921 information is summarized in a cumulative density function (CDF) above the heat maps. A higher
- 922 fraction of all RAs are found in the most dense percentiles; this reflects the fact that RAs are often
- 923 present in more dense clusters than are NDAs.
- 924 Figure S6 Selection coefficients of simulated introgressed variants in Eurasians. Selection
- 925 coefficients in Eurasians from SLiM simulations with high (0.04) and low (0.02) admixture
- 926 fractions. Each boxplot summarizes the average selection coefficient of all alleles in each
- 927 introgressed class in each of 100 simulated modern Eurasian populations.
- 928

929 Figure S7 CADD scores for RAs (stratified as RAA and RHA) and NDAs in each of three

930 populations. Normalized CADD scores for the introgressed variant classes (RAs and NDAs) with

- 931 RAs stratified into RAAs and RHAs. Considering RAAs and RHAs separately revealed that the
- 932 RAAs are less deleterious than the RHAs (median scaled CADD score: RAA=1.91; RHA=2.23; *P*
- 933 = 1.80e-89, Wilcoxon Rank Sum Test). This difference likely reflects the greater evolutionary
- 934 conservation of RAAs. Results were similar across each superpopulation.
- 935
- Figure S8 Max scaled CADD score per introgressed haplotype. Maximum scaled CADD scores
   on each introgressed haplotype for the introgressed variant classes in each superpopulation.
- 938
- 939 Figure S9 RegulomeDB does not suggest a greater functional influence for NDAs compared to
- 940 **RAs.** Comparison of the fraction of NDAs and RAs in each of the RegulomeDB functional classes
- 941 in order of evidence of regulatory activity.

#### 942 SUPPLEMENTARY TABLES:

#### 943 Table S1 Counts of simulated ancient allele trajectories into modern Eurasians.

	f=0.02		f=0.04	
	AVG	SD	AVG	SD
AAs in ModAfr	4924.47	50.45	4925.58	50.41
AAs in ModEurA	4353.89	47.95	4402.27	53.54
Via AMHs only	2536.52	45.17	2531.33	39.78
Via Neand only	44.97	16.35	88.99	23.94
Via AMH & Neand	1772.40	28.84	1781.95	29.52
NDAs in ModEurA	85.13	29.65	167.10	45.04

$\begin{array}{c} 944\\ 945\\ 946\\ 947\\ 948\\ 949\\ 950\\ 951\\ 952\end{array}$	AAs in ModAfr: AAs in ModEurA: <i>Via AMHs only:</i> <i>Via Neand only:</i> <i>Via AMH/Neand:</i> NDAs in ModEurA	Ancestral hominin alleles persisting in modern Africans Total ancestral hominin alleles persisting in modern Eurasians ancestral hominin alleles passed into Eurasians exclusively via AMHs ancestral hominin alleles passed into Eurasians exclusively via Neanderthals ancestral hominin alleles passed into Eurasians via AMHs or Neanderthals or both Neanderthal derived alleles present in Eurasians
---	--	---

Table S2 Recombination of segregating human alleles onto introgressed haplotypes rarely results
 in false RA ascertainment.

		f=0.02	f=0.04
	False Discovery Rate (FP / (TP + FP))	0.009	0.0165
955			
956			

#### Table S3. Genes associated with RA eQTL shared between EUR and YRI.

#### 

Gene ID	HUGO Symbol of gene associated with eQTL	eQTL RAs (count)
ENSG0000068654	POLR1A	RAA (2)
ENSG0000069998	HDHD5 (previously: CECR5) haloacid dehalogenase like hydrolase domain containing 5	RAA (3), RHA (1)
ENSG00000139410	SDSL - Serine dehydratase-like - Homo sapiens	RAA (2), RHA (2)
ENSG00000152926	ZNF117 (previously: HPF9)	RHA (1)
ENSG00000160193	WDR-4	RAA (11), RHA (3)
ENSG00000163755	HPS3, biogenesis of lysosomal organelles complex 2 subunit 1	RAA (1), RHA (2)
ENSG00000169609	Chr 15 Open Reading Frame 40	RAA (1*), RHA (1*)
ENSG00000169612	RAMAC (previously: RAMMET), RNA guanine-7	RAA (6 + 4*), RHA (3)
ENSG00000196648	methyltransferase activating subunit (retired)	

 $\begin{array}{c} 960\\ 961 \end{array}$ 

\*SNP has significant eQTL associations with 2 gene IDs

#### Table S4. European introgressed variants with significant MPRA evidence of modulating

#### expression in LCLs.

Chr	Loc (hg19)	Introgressed class	rsID	nearest TSS	distance from TSS	HUGO name
chr2	68490970	NDA	rs12713637	NM_000945	11318	PPP3R1
chr2	121044922	NDA	rs79742700	NM_002881	34508	RALB
chr3	119188213	NDA	rs75416321	NM_152305	428	POGLUT1
chr4	38805942	NDA	rs5743566	NM_003263	470	TLR1
chr4	38807328	NDA	rs45588337	NM_003263	915	TLR1
chr7	64448291	RHA	rs11972247	NM_015852	3123	ZNF117
chr9	101969304	RAA	rs77521170	NM_033087	14942	ALG2
chr12	113364471	NDA	rs4767034	NM_006187	11777	OAS3
chr12	132569521	RHA	rs77330556	NR_003290	693	EP400NL
chr19	41209256	RAA	rs116796128	NM_001142555	11755	ADCK4
chr22	17639918	RAA	rs71312076	NM_033070	251	HDHD5

#### 969 Table S5 Luciferase reporter insert sequences

#### 970

EUR-EUR Sequence (3'-5')	CTTAAGTGAAGCCGCTAACAGACTGCACAGGATTCAATTCTAAAGCTCGTGCTCAAACTCTGTCATCCTGCATTCTTCTTTTCTGCT CTACCGGAAGAGTCACTTGGAGACATTTCGGGACTCTGCAGAGATGCTAGAGCCAATACAACAGTTATAAATAA
NDA-EUR Sequence (3'-5')	CTTAAGTGAAGCCGCTAACAGACTGCACAGGATTCAATTCTAAAGCTCGTGCTCAAACTCTGTCATCCTGCATTCTTCTTTTTCTGCT CTACCGGAAGAGTCACTTGGAGACATTTCGGGACTCTGCAGAGATGCTAGAGCCAATAAAACAGTTATAAATAA

EUR-RA Sequence (3'-5')	CTTAAGTGAAGCCGCTAACAGACTGCACAGGATTCAATTCTAAAGCTCGTGCTCAAACTCTGTCATCCTGCATTCTTCTTTTTCTGCT CTACCGGAAGACTCACTTGGAGACATTTCGGGACTCTGCAGAGATTCTAAAACTAACAACAGTTATAAATAA
NDA-RA Sequence (3'-5')	CTTAAGTGAAGCCGCTAACAGACTGCACAGGATTCAATTCTAAAGCTCGTGCTCAAACTCTGTCATCCTGCATTCTTCTTTTTCTGCT CTACCGGAAGAGTCACTTGGAGACATTTCGGGACTCTGCAGAGATGCTAGAGCCAATAAAACAGTTATAAATAA
b1-EUR (3'-5)	CTTAAGTGAAGCCGCTAACAGACTGCACAGGATTCAATTCTAAAGCTCGTGCTCAAACTCTGTCATCCTGCATTCTTCTTTTTTCTGCT CTACCGGAAGAGTCACTTGGAGACATTTCGGGACTCTGCAGAGATGCTAGAGCCAATACAACAGTTATAAATAA

b1_NDA(3'-5)	CTTAAGTGAAGCCGCTAACAGACTGCACAGGATTCAATTCTAAAGCTCGTGCTCAAACTCTGTCATCCTGCATTCTTCTTTTTCTGCT CTACCGGAAGAGTCACTTGGAGACATTTCGGGACTCTGCAGAGATGCTAGAGCCAATAAAACAGTTATAAATAA
b2-EUR(3'-5')	TTTTTTTCATGCAAGTAATTTGGCCGGGTGCACTGGCTCATGCCTGTAATCTCACCACTCTGGGAGGCCAAGATGTGAGGATCATCTG AGGTCAAAAGTTCCAGACCAGCCAGCCAACATGGTGAAACCCTGTCTCTACTAAAAATACAAAAATTAGCCGGATGTGGTGGCGGGG GCCTGTAATCCCAGCTACTCGGGAGGCTGAGAACAGAAGAATCGCTTGAACCCGGGAGGCGGAGGTGCAGTGAGCAGAGATTGCGCCA CTGCACTCCAACCTGGTGACAGAGATGCCGTCTAAAAAAAA
b2-RA(3'-5)	TTTTTTCATGCAAGTAATTTGGCCGGGTGCACTGGCTCATGCCTGTAATCTCACCACTCTGGGAGGCCAAGATGTGAGGATCATCTG AGGTCAAAAGTTCGAGACCAGCCTGGCCAACATGGTGAAACCCTGTCTTCTACTAAAAATACAAAAATTAGCCGGATGTGGTGGCGGGG GCCTGTAATCCCAGCTACTCGGGAGGCTGAGAACAGGACAGAGAAACCCGTGGAGCGGAGGTTGCCGTAGCCAGAGATTGCGCCA CTGCACTCCAACCTGGTGACAGAGATGCCGTCTAAAAAAAA

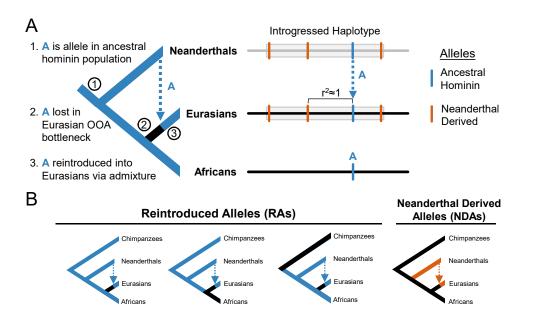
#### 973

#### 974 Table S6 Luciferase primer sequences

	Primer	Sequence (5'-3')
Primers for Sanger	pG4.27_seq_FP1	CAGGTGCCAGAACATTTCTC
Sequencing	pGL4.27_seq_FP2	CCTCTAGTGTCTAAGCTTGG
	pGL4.27_seq_FP3	CGCGTCTTCTGATTTCCACC
	pGL4.27_seq_R	CTAAACCAGGTTGGTCAGATC
Primers to produced b2-EUR sub-regions	B2.1-EUR-F	GCAGTACTTTTTTTCATGCAAGTAATTTGGCCGG
bz-cort sub-regions	B2.1-EUR-R	CTCTGCTCACTGCAACCTCCG
	B2.2-EUR-F	GCGGAGGTTGCAGTGAGCAGAGATTG
	B2.2-EUR-R	GGCCGTTTTGCCTTTTCTGGAAAAAGG
	B2.3-EUR-F	CCTTTTTCCAGAAAAGGCAAAACGGCC
	B2.3-EUR-R	CCTGCCTTCCTCTGACTCGCTG
	B2.4-EUR-F	CAGCGAGTCAGAGGAAGGCAGGG
	B2.4-EUR-R	CTGGTATCCCAGCCTCCTGGGAAC
	B2.5-EUR-F	GTTCCCAGGAGGCTGGGATACCAGC
	B2.5-EUR-R	GAATCTGAGCTAGTGGGGGGCCGCAC
Primers to create restriction overhangs	B2.1-EURwOH	TCGAGCGATCGGAGCTCCTAGCAGTACTTTTTTCAT GCAAGTAATTTGGCCGGGTGC
on b2-EUR sub regions	B2.5-EURwOH	GGCTCCGGTCTAGAACTAGAGCTAGTGGGGGGCCGCAC
Primers to create Nhel restriction site on b2-	B2-EUR/RAwOH-F	GCAGTACTTTTTTTCATGCAAGTAATTTGGCCGGGTG CACT
EUR and b2-RA	B2-EUR/RAwOH-R	CTGGCCGGTACCTGAGCTCGGAATCTGAGCTAGTGGG GGC
Primers to create Xhol restriction site on b1-	B1-EUR/NDAwOH-F	GAGGCCAGATCTTGATATCCCTTAAGTGAAGCCGCTA ACAG
NDA and b1-EUR	B1-EUR/NDAwOH-R	CCAAATTACTTGCATGAAAAAAACACATAGTGCTTAC TTTGTGCCAG
Primers used to	B1-EUR/NDA-F	CTTAAGTGAAGCCGCTAACAG
amplify b1-NDA and b1-EUR	B1-EUR/NDA-R	CCAAATTACTTGCATGAAAAAAAACAC

976

- 977 SUPPLEMENTARY FILE LIST:
- 978 File S1 List of NDAs and RAs for each Eurasian population
- 979 File S2 Table of GWAS hits for NDAs and RAs



**Figure 1. Schematic of the reintroduction of alleles lost in the Eurasian out of Africa (OOA) bottleneck by Neanderthal introgression.** (A) Illustration of the evolutionary trajectory and resulting genomic signature of an allele A (blue) that was: (1) segregating in the ancestors of modern humans and Neanderthals, (2) lost to the ancestors of Eurasians in the human OOA bottleneck, and (3) reintroduced to Eurasians through Neanderthal admixture. Consequently, reintroduced alleles (RAs) are expected to be in high linkage disequilibrium with some Neanderthal-derived alleles (NDAs; orange) in introgressed haplotypes (gray) in modern Eurasians. (B) Schematics of the different evolutionary histories of interest in this paper. All alleles lost in the Eurasian OOA bottleneck and reintroduced by Neanderthal introgression are referred to as RAs. Alleles that appeared in the Neanderthal lineage, were not present in the ancestors of humans and Neanderthals, and only exist on introgressed haplotypes in modern humans are referred to as Neanderthal-derived alleles (NDAs).

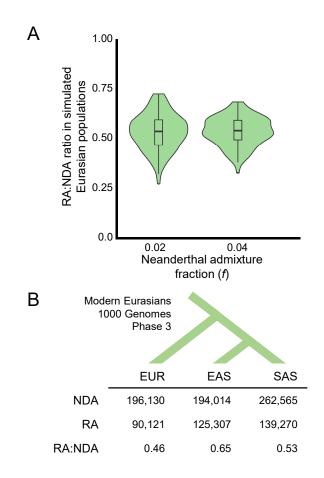
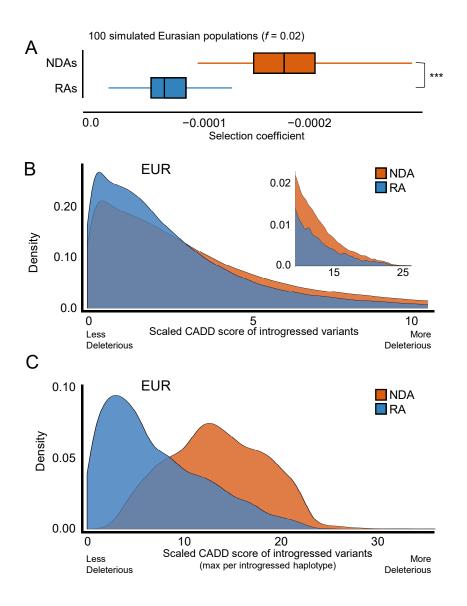


Figure 2. Neanderthal introgression reintroduced thousands of alleles lost in the OOA bottleneck to Eurasian populations. (A) The ratios of RAs to NDAs over 100 simulated Eurasian populations. The simulations predict approximately one RA for every two NDAs, and these estimates are robust to changes in the simulated Neanderthal admixture fraction. Misclassification of non-RAs as RAs due to independent, convergent mutations is extremely rare (Figure S2) and the overall false discovery rate for LD-based RA identification is below ~1% (Table S2). (B) The number of RAs and NDAs in each Eurasian 1000 Genomes population (EAS = East Asian; EUR = European ancestry; SAS = South Asian) identified by our pipeline (Figure S3; Methods). Neanderthal admixture reintroduced over 200,000 alleles lost in the human OOA bottleneck into the ancestors of 1000 Genomes populations, and the observed RA-to-NDAs ratio is consistent with the simulations.



**Figure 3. Reintroduced alleles have different fitness effects than Neanderthal-derived alleles.** (A) Simulations identify weak selection against both NDAs and RAs, but the RAs persisting in modern Eurasian populations were consistently less deleterious than NDAs over 200 simulations (median selection coefficient RA=7.7e-5; NDA=1.9e-4,  $P \approx 0$ , Wilcoxon rank sum test). (B) In modern Eurasian populations, RAs are predicted to be significantly less deleterious than NDAs by CADD (median scaled CADD: NDA=2.7; RA=2.1;  $P \approx 0$ ). The upper tail of highly deleterious mutations is highlighted in the inset. Results are similar for unscaled scores. (C) At the haplotype level, the maximum RA CADD score per haplotype is significantly lower than for NDAs (median scaled max CADD: NDA=13.3; RA=5.8;  $P \approx 0$ ). This is in part due to the overall difference demonstrated in (B) and to the greater number of NDAs per haplotype. RAs are rarely the most deleterious variant per haplotype. Results shown are for Europeans (EUR); results in East and South Asian populations are similar (**Figure S7**, **Figure S8**).

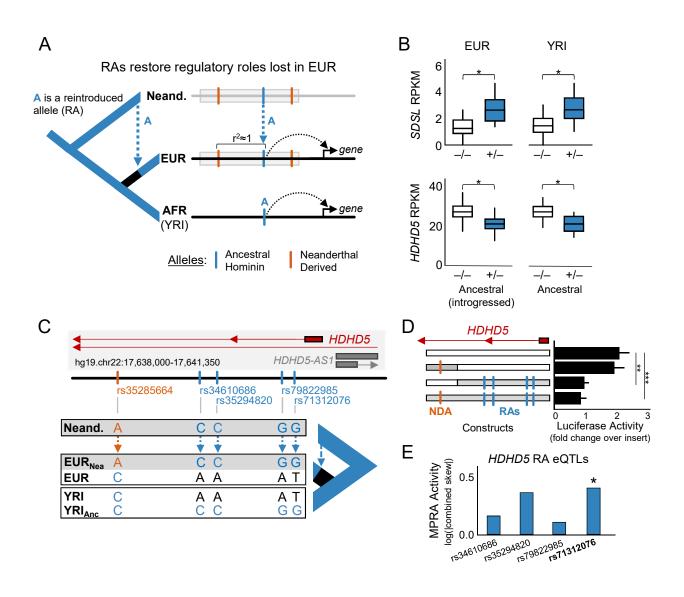


Figure 4. Reintroduced alleles restore regulatory functions lost in the Eurasian OOA bottleneck.

(caption is on following page)

#### Figure 4. Reintroduced alleles restore regulatory functions lost in the Eurasian OOA bottleneck. (A) Conceptual model of restored regulatory function resulting from Neanderthal admixture. Here, allele A is a cis-acting regulatory variant that is exclusively found on introgressed haplotypes (gray) in modern Europeans (EUR). Allele A is also present in sub-Saharan Yoruba individuals (YRI) lacking Neanderthal ancestry. It displays similar cisregulatory activity in both populations. This pattern suggests that allele A is an RA in Europeans and that it influences gene regulation independent of the associated NDAs. (B) Two examples of genes (SDSL and HDHD5) with consistent expression differences (measured in RPKM) associated with RA eQTLs in EUR and the corresponding allele in YRI LCLs. The RAs are present only on introgressed haplotypes in EUR, and the NDAs associated with the RAs are not present in YRI. This suggests that these RAs restore lost gene regulatory functions in Europeans. (C) Schematic of the HDHD5 locus highlighting the locations of one NDA (orange) and four RA eQTLs (blue) in the introgressed haplotype and the different combinations of these alleles present in EUR, YRI, and Neanderthals. (D) Luciferase activity driven by constructs carrying different combinations of alleles present in the HDHD5 locus. We assayed four constructs containing: 1) no introgressed alleles, 2) only the NDA, 3) only the RAs, and 4) all introgressed variants. Results are summarized over three replicates. As expected from the eQTL data, constructs lacking RAs drive significantly stronger expression (~2x baseline) than constructs containing RAs (~1x baseline; two-tailed ttest, P < 0.01 (\*\*) and P < 0.001 (\*\*\*)). The regulatory effect of the RAs is independent of the presence the NDA found in introgressed EUR haplotypes. (E) Regulatory activity in a massively parallel reporter assay (MPRA) for the four HDHD5 RA eOTLs reveals that rs71312076 has significant regulatory effects when placed in the non-introgressed European background sequence. The other three RAs did not drive significant regulatory activity.

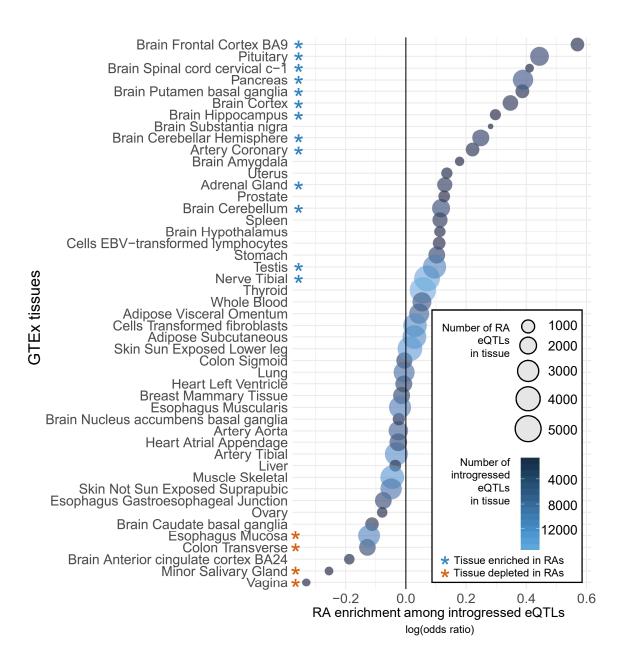


Figure 5. Reintroduced alleles are significantly enriched among introgressed eQTLs in brain and several other tissues. Bubble plot quantifying the enrichment for eQTL activity among EUR RAs compared to all introgressed eQTL in each GTEx v7 tissue. Of the 48 tissues considered, RAs were significantly enriched compared to NDA eQTL in 13 tissues, and significantly depleted in four (P < 0.01, hypergeometric test after Bonferroni correction). The strongest enrichment for RA eQTLs was in the frontal cortex. Brain regions were enriched among the 13 tissues with RA eQTL enrichment (7 of 13, P = 0.0144, hypergeometric test).

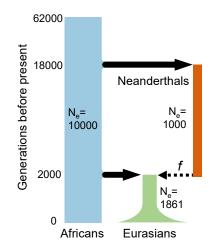
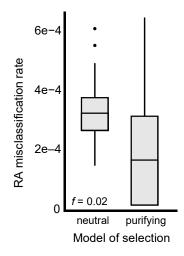
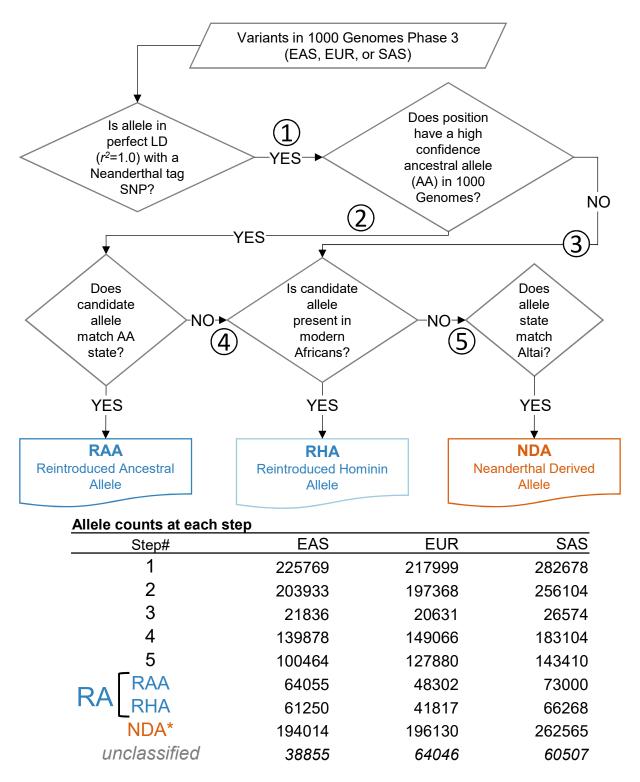


Figure S1. Demographic model used for evolutionary simulations. The demographic model used to simulate human–Neanderthal admixture and quantify the reintroduction of lost alleles. The model and effective population sizes (Ne) were based on previous simulations of Neanderthal admixture (Harris and Nielsen, 2016). We considered models in which mutations incurred a fitness cost (mildly purifying selection) or no fitness cost (strict neutrality). Two different admixture fractions (f=0.02 and f=0.04) were used in the simulations (Methods).

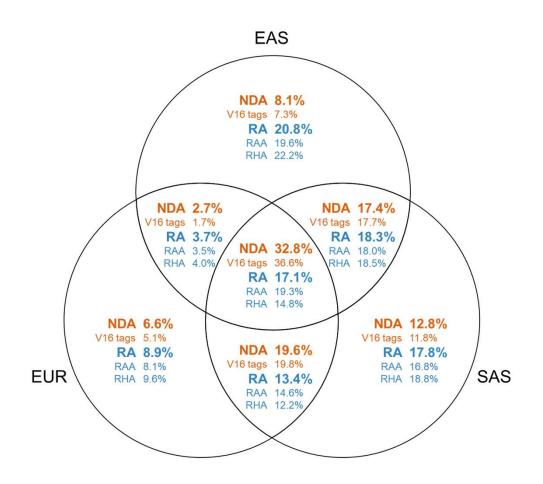


**Figure S2 Simulations indicate that false positives in RA identification due to independent convergent mutations are rare.** For each simulated population, we identified all NDAs that occurred in positions with ancestral hominin variation that was lost in the Eurasian OOA. The boxplots summarize the frequencies at time of admixture (c.f. Figure S1) of these potentially confounding NDAs among all sites that would be called as RAs. The incidence of these confounding mutations is slightly higher under a purely neutral model (left) than one where new mutations could be deleterious (right). Each boxplot represents 100 simulated populations with admixture fraction of 0.02.

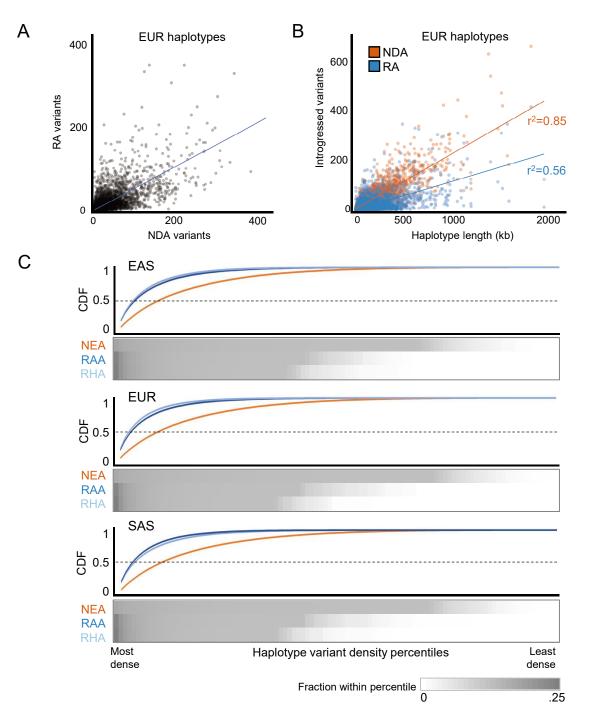


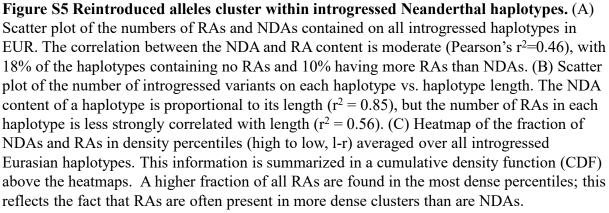
\*NDA totals include both I Neanderthal "tag SNPs" (EAS:132405, EUR:132296, SAS:179662) as well as the NDAs predicted from the present pipeline.

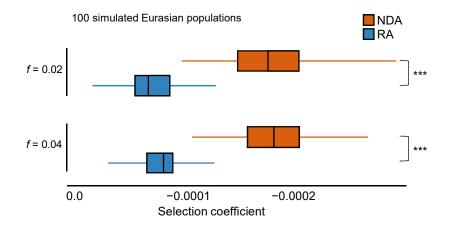
Figure S3 Introgressed allele class assignment decision tree and allele count summary.



**Figure S4. Introgressed allele sharing across three Eurasian populations.** Venn diagram showing the fractions of each introgressed variant class that are shared between populations.

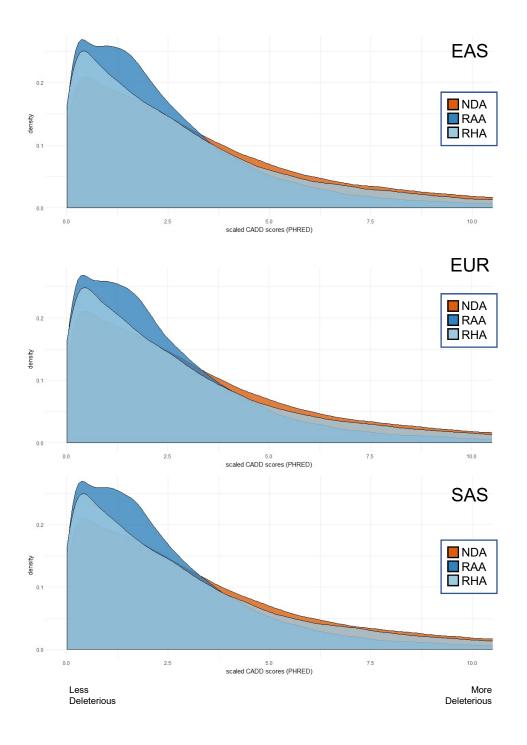




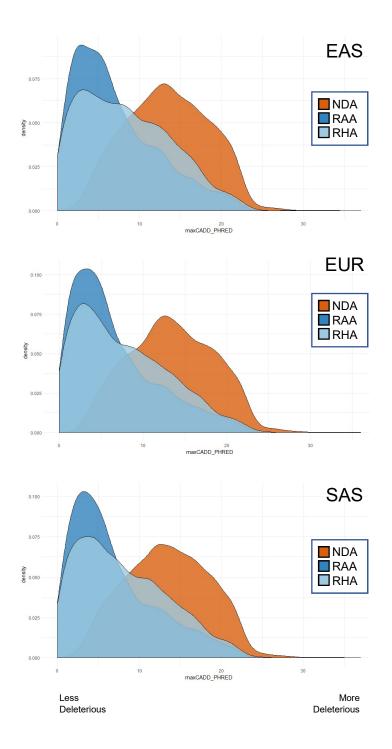


#### Figure S6 Selection coefficients of simulated introgressed variants in Eurasians.

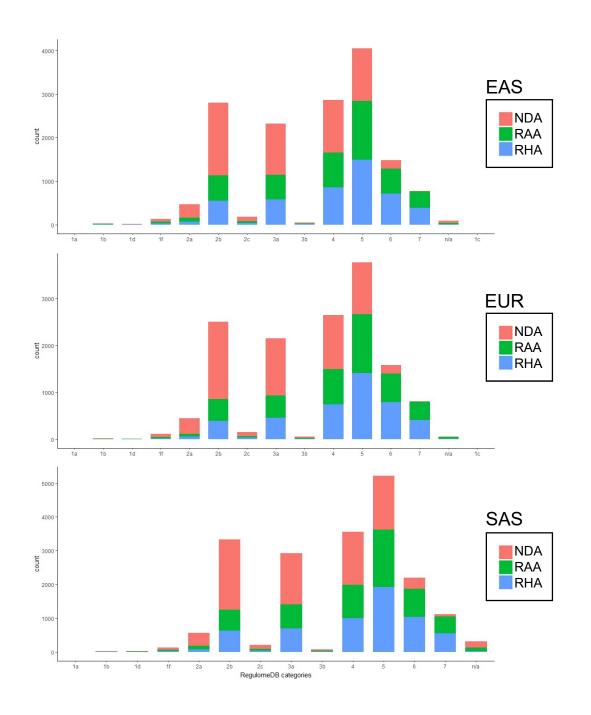
Selection coefficients in Eurasians from SLiM simulations with high (0.04) and low (0.02) admixture fractions. Each boxplot summarizes the average selection coefficient of all alleles in each introgressed class in each of 100 simulated modern Eurasian populations



**Figure S7 CADD scores for RAs (stratified as RAA and RHA) and NDAs in each of three populations.** Normalized CADD scores for the introgressed variant classes (RAs and NDAs) with RAs stratified into RAAs and RHAs. Considering RAAs and RHAs separately revealed that the RAAs are less deleterious than the RHAs (median scaled CADD score: RAA=1.91; RHA=2.23; P = 1.80e-89, Wilcoxon Rank Sum Test). This difference likely reflects the greater evolutionary conservation of RAAs. Results were similar across each superpopulation.



**Figure S8 Max scaled CADD score per introgressed haplotype**. Maximum scaled CADD scores on each introgressed haplotype for the introgressed variant classes in each superpopulation.



**Figure S9 RegulomeDB does not suggest a greater functional influence for NDAs compared to RAs.** Comparison of the fraction of NDAs and RAs in each of the RegulomeDB functional classes in order of evidence of regulatory activity.