Hunter-gatherer admixture facilitated natural selection in Neolithic European farmers

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Abstract

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Ancient DNA has revealed multiple episodes of admixture in human prehistory during geographic expansions associated with cultural innovations. One important example is the expansion of Neolithic agricultural groups out of the Near East into Europe, and their consequent admixture with Mesolithic hunter-gatherers. Ancient genomes from this period provide an opportunity to study the role of admixture in providing new genetic variation for selection to act upon, and also to identify genomic regions that resisted hunter-gatherer introgression and may thus contribute to agricultural adaptations. We used genome-wide DNA from 728 individuals spanning Mesolithic and Neolithic Europe to infer ancestry deviations in the genomes of admixed individuals, and to test for natural selection after admixture using a new method based on testing for deviations from a genome-wide null distribution. We find that the region around the pigmentation-associated gene SLC24A5 shows the greatest overrepresentation of Neolithic ancestry in the genome (|Z| = 3.45). In contrast, we find the greatest overrepresentation of Mesolithic local ancestry across the key immunity locus that is the Major Histocompatibility Complex (MHC; |Z| > 4) which also shows allele frequency deviations indicative of a selective sweep following admixture (p = 1×10^{-29}). This could reflect negative frequency dependent selection on MHC alleles common in Neolithic populations, or that Mesolithic alleles were positively selected for and facilitated adaptation by Neolithic populations to pathogens, new diets, or other environmental factors. Our results extend previous results that highlight immune function and pigmentation as targets of adaptation in more recent populations to selection processes in the Stone Age, and demonstrate that admixture facilitated selection by contributing new genetic variation.

Introduction

Despite the evidence from studies of ancient DNA that admixture among Holocene populations is ubiquitous, less is known about how admixture provided variation for natural selection to act upon during transitional periods. Given that Holocene admixture was often associated with dramatic migrations or changes in lifestyle, we might expect an important role for adaptive introgression. Perhaps the best-studied example of ancient admixture is in the Mesolithic-Neolithic transition in Europe. As

- 44 Early Neolithic groups expanded across Europe from Anatolia in the period 10,000 to
- 45 5,000 years ago¹⁻⁷, they admixed with local Mesolithic hunter-gatherers, and by the
- 46 later Middle Neolithic period derived 20-30% of their ancestry from these local
- 47 groups^{1,2,8,9}. The admixed Neolithic ancestry thus found itself in a new demographic,
- 48 cultural, and geographic landscape. In addition to dramatic dietary changes, the
- 49 Neolithic transition included an increase in population density, which together with
- 50 the presence of domesticated animals has been hypothesised to lead to increased
- 51 infectious disease load¹⁰.

- 53 Despite the potential of introgression as a source of adaptive genetic variation,
- 54 examples of adaptive admixture in humans are relatively rare. Examples include
- 55 American populations experiencing selection following admixture with European and
- African populations at immune loci¹¹. Within Africa, the *DARC* 'Duffy-null' allele has
- 57 seen at least two adaptive admixture events, spreading from the mainland to both
- 58 Madagascar and the Capo Verde islands^{12,13}, alongside signals at other immune
- 59 genes^{14,15}. There are also several examples of adaptive alleles inherited from
- archaic humans such as a WARS2-TBX15 haplotype in Greenlandic Inuit¹⁶ and an
- allele of *EPAS1* in present-day Tibetans¹⁷ both introgressed from Denisovans.
- 62 Studies of adaptive admixture among present-day populations are in general
- confined to recent admixture in the past ten or so generations, which is too short to
- detect anything but the strongest selection. On the other hand, signals of adaptive
- archaic introgression from events thousands of generations ago may have decayed
- with time and be difficult to detect.
- 67 Previous studies of natural selection in the European Neolithic have either compared
- allele frequencies or haplotype structure with other ancient and modern
- 69 populations^{2,18–21}. However, no study to date has attempted to assign signals of
- 70 adaptive admixture to a particular ancestry close to the time of admixture. The
- admixture of Early Neolithic and hunter-gatherer ancestry represents an opportunity
- to study adaptive admixture, similar to recently admixed present-day populations, but
- over a much longer timescale; around a hundred generations (**Figure 1A**). A recent
- study identified two optimal approaches to detect adaptive admixture, based on
- allele frequencies and local ancestry, respectively²². Here, we adapt these two
- approaches to ancient populations with a new framework to obtain p-values from
- 77 genome-wide null distributions, investigating adaptive admixture in 728 Mesolithic,
- 78 Early and Middle Neolithic individuals.

Results and Discussion

- 80 We used clustering analyses to assign individuals with genome-wide ancient DNA
- 81 data from Europe and Anatolia in the past ~15,000 years to one of three groups: HG
- for 135 Mesolithic and Upper Palaeolithic hunter-gatherer ancestry individuals, NEO
- for 56 early Neolithic individuals from Anatolia and the Balkans without evidence for
- 84 substantial hunter-gatherer admixture, and MNEO for 537 later Middle Neolithic
- individuals with substantial HG admixture. In total, our analysis contains 728 ancient

individuals, spanning 7,500 years across the European continent (**Figure 1A-B**; **Supplementary Figure 1**; **Supplementary Figure 2**).

We first used an approach to find natural selection that is admixture-unaware, searching for increased differentiation as the squared allele frequency difference between populations, the f_2 statistic²³. We computed the average for each SNP and 25 SNPs flanking SNPs on each side (*i.e.* in 51 bp sliding windows), and obtain p-values by fitting a gamma distribution to a null sample of 532 approximately independent loci, separated by at least 5 million basepairs (mb). We observe no statistically significant outliers in the HG-NEO or HG-MNEO contrasts (**Supplementary Figure 3**), but in the NEO-MNEO contrast we observe a highly significant excess differentiation across the Major Histocompatibility Complex (MHC) region on chromosome 6, centred upon *HLA-DQB1* (p = 1×10⁻²¹) (**Supplementary Figure 3**). This suggests natural selection at the MHC in the period covered by the data from NEO and MNEO groups, although this analysis does not address whether that might be due to adaptive HG admixture.

To search for adaptive admixture, we applied a statistic based on previous work² termed F_{adm}^{22} , which tests for deviations from the expected allele frequencies given the genome-wide average mixture proportions of the contributing ancestries. We again observe an excess signal across the MHC, centred upon HLA-DQB1 (p = 1×10^{-29}) (**Figure 1A**). To confirm that our findings were not driven by ascertainment bias in the 1.2M SNP panel²⁴, we analysed the MHC region in 156 whole-genome shotgun sequences from 67 Mesolithic (HG), 27 Early Neolithic (NEO), and 62 Middle Neolithic Admixed (MNEO) individuals (Extended Methods), and observe a concordant peak stretching across the Class III MHC region (**Figure 1E**).

We next sought to quantify the direction of admixture by searching for deviations in local ancestry across the genome (Local Ancestry Deviation; LAD, ref. ²²). We inferred local ancestry in 537 admixed Middle Neolithic individuals with genome-wide SNP data using *ancestryHMM*²⁵, which estimates local ancestry in low-coverage genomic data using allele frequencies from two populations. We computed standard errors and Z-scores for local ancestry deviation (LAD) using an approximately independent subsample of the genome-wide distribution consisting of 555 sites separated by at least 5Mb (**Methods**).

The greatest excess of Neolithic ancestry centred on *SLC24A5* (**Figure 2C**; **Supplementary Figure 4**; **Supplementary Figure 5**), with a peak of +18.6% (|Z|=3.45). The derived *SLC24A5* allele, which is carried on the Neolithic ancestry background, is one of the two alleles which contributes most to light skin pigmentation in present-day European populations²⁶. It has been previously shown to have been at relatively high frequency in the Neolithic and absent in the Mesolithic hunter-gatherers², and our results show that the selection removed hunter-gatherer ancestry at this locus in later admixed Neolithic groups.

Meanwhile, the lowest amount of Neolithic ancestry is found at the Major Histocompatibility Complex (MHC) region on chromosome 6. Within this locus, the region of highest Mesolithic ancestry is centred on *HLA-E*, with a peak excess of +23.2% (|Z|=4.34). This region of elevated Mesolithic ancestry continues as a contiguous region which extends across the Class II region of the MHC, with an average of ancestry across the entire MHC (between hg19 positions 28,477,797-33,448,354 of chromosome 6) of +9.16% (|Z|=1.82), and a secondary peak centred upon the class II region of +17.26% (|Z|=3.23) (**Figure 1E**).

In the $F_{\rm adm}$ analysis, we also find a number of genome-significant peaks outside of the MHC, though these are an order of magnitude below the MHC p-value (**Supplementary Figure 6**). *TYRP1* has been previously reported to have experienced selection in European populations^{27,28}. *TLR2* is an important gene in immunity, and may also be a target of archaic adaptive admixture²⁹. *MUC19* also plays a role in immunity, and was found to be under selection in Central Mexican indigenious populations³⁰. *OPRM1* is documented to contribute towards skin pigmentation in Native American and East Asian populations^{31,32}, while a *HRNR* haplotype linked to atopic dermatitis may have seen a selective sweep in East Asia alone³³ *ROR1* is adjacent to *PGM1* which may have undergone selection in Mexican populations³⁴. Similarly, the LAD analysis finds some genes with previous reports of selection; *HECW2* has been identified to be under selection in Khomani San³⁵, a southern African group with recent hunter-gatherer lifestyle, while *PKP2* was similarly seen to be under selection in the Yoruba in west Africa in the same study.

It is also possible that adaptive admixture acted on multiple variants with small effect, spread across the genome. To test for evidence of such polygenic selection, we computed the Pearson correlation between the local ancestry deviation and the effect size for 38 traits in the UK BioBank, using genome-wide significant SNPs thinned to be approximately independent³⁶ (**Figure 3**). We see significant evidence of correlation between trait scores and LAD in Skin Colour ($p = 3e^{-4}$), consistent with the adaptive admixture around *SLC24A5*. Indeed, this signal is solely driven by two loci, with a *HERC2* variant with a skew towards the Mesolithic (Z=1.7) also contributing to a lighter level of skin pigmentation alongside *SLC24A5*. Without these two loci, there is no significant evidence of polygenic selection (P = 0.58). We also observe a weaker but significant correlation for hip size (**Figure 3**, **Supplementary Figure 7**).

The Neolithic transition brought about drastic changes in demography, culture and diet, as well exposure to novel pathogens and increased potential of zoonotic disease. In admixed middle Neolithic individuals, we found excess Neolithic farmer ancestry at the pigmentation locus *SLC24A5* and excess Mesolithic hunter-gatherer ancestry at the MHC immunity locus. Previous studies also found evidence of natural

selection at *SLC24A5* in European populations^{26,27} and showed that the allele was introduced into Europe in the Neolithic^{2,37,38} but our study now further demonstrates that this resulted in a removal of hunter-gatherer ancestry across the wider locus. In a similar but opposite process, the MHC locus has previously been demonstrated to have undergone selection in the ancestry of present-day Europe²³⁹ and specifically in Neolithic Europe¹⁸. Here, we obtain further robust results for selection at the MHC locus corrected for multiple testing, and demonstrate that this process specifically increased hunter-gatherer ancestry at the locus.

In contrast to SLC24A5, the second high-effect pigmentation variant, in HERC, displays an excess of Mesolithic ancestry (+17.23%, $|Z| = \sim 3.11$). Together with the third high-effect pigmentation variant at SLC45A2, which arrived in Europe via later expansions from the steppe, selection on pigmentation in Europe thus targeted variants from each of the three major ancestral populations⁹. This highlights the prominent role of admixture in the evolution of skin pigmentation in Western Eurasia. That this signal is not found in the allele-frequency based analysis with $F_{\rm adm}$ can likely be attributed to the small absolute change in allele frequency between our Neolithic populations, confirming recent demonstrations that local ancestry can in some cases be more powerful than allele frequency analysis for detecting selection in admixed popuations²².

Evidence of selection on Mesolithic ancestry across the MHC locus, highlights its role in facilitating adaptation in immunity during the Neolithic transition in Europe. One hypothesis is that this reflects the fact that Neolithic populations were expanding into environments containing pathogens to which Mesolithic populations had already adapted. This is contrary to the idea that the pathogen load in Neolithic populations was solely driven by increased population density and proximity to zoonotic vectors via animal husbandry. While examples of putative adaptive admixture involving the MHC have been previously described 11,15,40, a clear link between the alleles under selection within this region and a specific pathogen has not been previously observed.

Another possibility is that this adaptation reflects negative frequency-dependent selection⁴¹, for example because pathogens adapt to the host population's immunity genes, with a bias towards more common variants. Rare alleles would thus confer a fitness advantage, until they become common enough that other, now-rarer, alleles have higher fitness. Under this model, HLA alleles unseen by a given pathogen will attain a higher fitness initially following admixture owing to their novelty for the pathogen⁴². Thus, the selection on the minor Mesolithic ancestry could simply reflect admixture introducing rarer variants into Neolithic populations. Future studies, including whole-genome shotgun data in tandem with improved functional annotation, may shed further light on this adaptive process.

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FIGURES

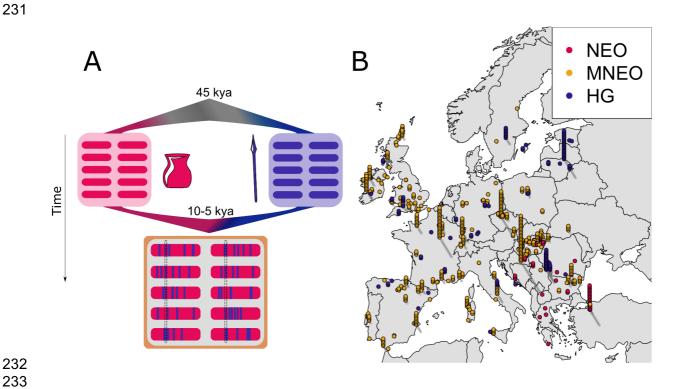


Figure 1. Admixture model and geographic distribution of Neolithic and Mesolithic individuals with genome-wide ancient DNA. A) An illustration of the genetic history of the Neolithic-Mesolithic transition in Western Eurasia. B) 'Casinoplot' of individuals included for analyses, coloured by the ancestry group for which those individuals were used in this paper. For sites with multiple samples, we stack those individuals above the reported coordinates.

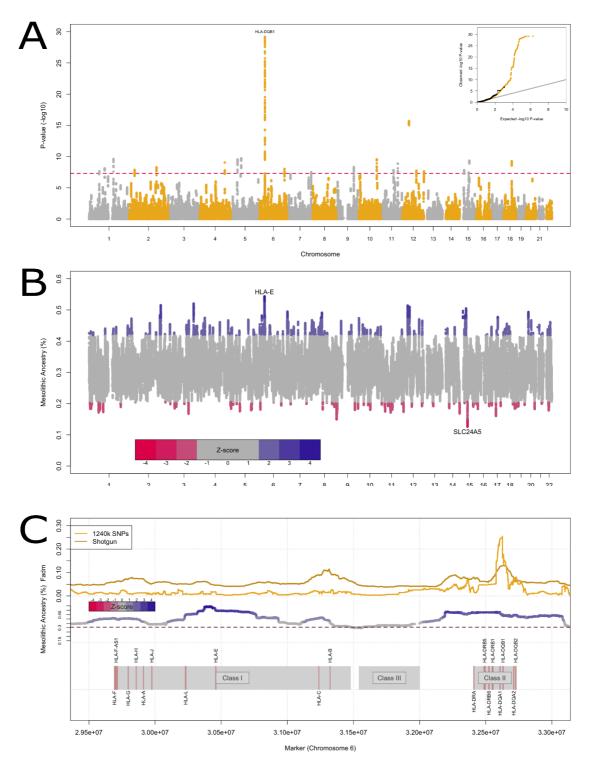


Figure 2. Genome-wide significant signals of adaptive admixture. A) Manhattan plot of p-values from the F_{adm} scan across the genome for deviations from expected admixed allele frequencies. Inset, quantile-quantile plot of expected and observed p-values. **B)** Local Ancestry Deviations (LAD) in the Middle-Neolithic across the genome, with top peaks of each ancestry labelled. **C)** Zoomed-in region of the MHC (chromosome 6), with statistics derived from 1240k and whole-genome shotgun data across the MHC regions I,II & III on chromosome 6.

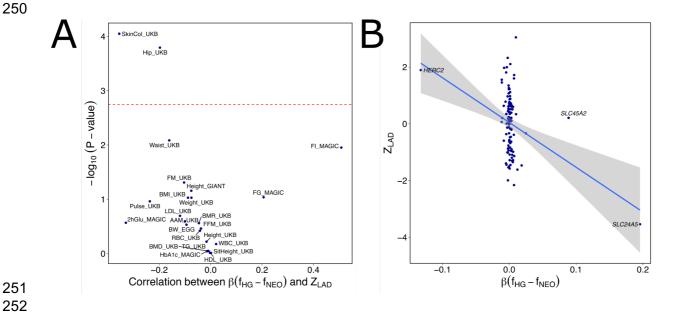


Figure 3. Test for polygenic adaptive admixture. A) Pearson correlation of polygenic traits against local ancestry. B) Correlation of LAD Z-scores with Skin Colour SNP effect size weighted by the signed allele frequency difference between the two source populations.

Experimental Procedures

Data preparation

We first used clustering approaches on a large set of previously published 1-9,37,38,43-66 individuals to identify those individuals exclusively or almost exclusively HG (Mesolithic, Western or Siberian Hunter-Gatherers [WHG, SHG]) or NEO ancestry (Early Neolithic, which we identify using Neolithic Anatolia as a baseline). We downloaded v50 of 10,391 individuals (3,589 ancient) from the Reich lab https://reich.hms.harvard.edu/downloadable-genotypes-present-day-and-ancient-dna-data-compiled-published-papers, accessed July 19th 2022 for the 1240K set of SNPs. We ran a first set of clustering with ADMIXTURE from K=3 to K=11, conditioned on European individuals dated to >5kya excluding siblings, parents, and duplicates. We then further filtered on age, setting a max age for HG, NEO and MNEO of 12kya, 8.5kya and 8kya respectively, retaining 728 individuals. Using PLINK, we then make a subset of files containing only individuals fitting into either Mesolithic (EHG+WHG) or admixed Neolithic ancestry, alongside a geographically and temporally conservative Neolithic cluster.

Detecting selective sweeps

We filtered the full set of SNPs by conditioning on observing at least 10 non-missing pseudohaploid genotypes in earch population. We utilised the F_{adm} statistic , i.e. $(F_{MNEO} - E(F_{MNEO}))^2$ / ($1 - E(F_{MNEO})^2$), where $E(F_{MNEO})$, where F is the frequency of a given SNP and $E(F_{MNEO})$ is an expectation of allele frequency derived by the contributing ancestry proportions weighted by allele frequency ($F_{MESO}Anc_{MESO} + F_{NEO}Anc_{NEO}$). In all cases, the given statistic is calculated on a per-SNP basis before sliding-window is applied across the genome with a step size of 1. We derive the f_2 analyses in an identical manner. We annotate genes using the gencode v39liftover37 annotation files.

For each analysis, we then draw a null distribution from this sliding-window whole-genome distribution, ensuring that each sliding-window datum that contributes to the null distribution is sampled with SNPs that are, as a group, no less than 5Mb away from the previous sample. A gamma distribution is then fitted to this null distribution using the R package *fitdistrplus v1.1-3* ⁶⁷ with the flags "gamma", method = "mle", keepdata = T". We then derive p-values for the genome-wide distribution from this null-fitted gamma distribution.

Confirmation of HLA signal in whole-genome shotgun data

To confirm the presence of the HLA signal in the whole-genome shotgun data, we collected a set of 81 individuals used in the original analyses which had whole-genome shotgun genomes, and added 74 unpublished genomes available pre-publication under the Ft. Lauderdale principles (https://reich.hms.harvard.edu/ancient-genome-diversity-project). We thus only use this data for local analyses of the MHC region. Exclusion of the pre-publication data results in too few NEO source genomes for reliable inference, and so we do not report genome-wide p-values. We again partition out our target populations using appropriate populations within this dataset. We filter the region initially on sites with more than 3 allele counts seen within the whole dataset, and a minimum of 30 sites seen in the Neolithic population, resulting in 11,086,998 sites after filtering. We apply a sliding window of 593 snps on the mixed-weight statistic in a similar way to the 1240k analysis, using the same weighting for ancestry contribution to SNP frequency expectation. We choose this window

size to approximate the same mean genetic distance per window as in the 1240k analysis with 51 snp windows.

Detection of Local Ancestry Outliers

- To analyse biases in local ancestry, we progress the same panel of 728 individuals
- 311 (Supplementary Table 1) to analysis with AncestryHMM ²⁵. We derive frequency counts for
- both the contributing ancestries (HG, NEO) and similarly obtain this for each individual
- 313 MNEO sample via plink. We then run Ancestry HMM with a prior of 30% HG and 70%
- Neolithic ancestry, and an N_e of 10,000.

Detection for biased inheritance of polygenic trait alleles

- 317 As in ref. 36 , we start with 28 quantitative traits of interest, subsetting SNPs P < $1e^{-8}$
- 318 overlapping the 1240k SNP array. We then iteratively prune through subsetting the smallest
- 319 p-value and removing all other associations within 250kb. Departing from Mathieson &
- 320 Terhost, we weight these pruned values by the difference in allele frequency between HG
- and NEO and sum these across the genome for each trait, and look for correlation to the
- 322 LAD derived in the local ancestry analysis via a Pearson correlation test.

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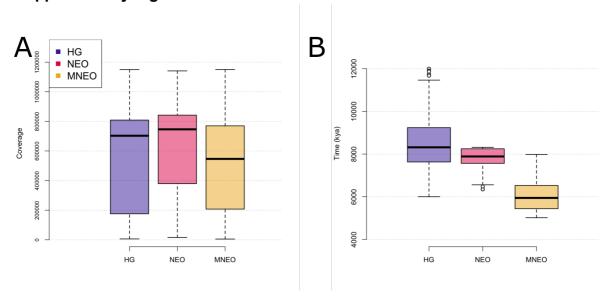
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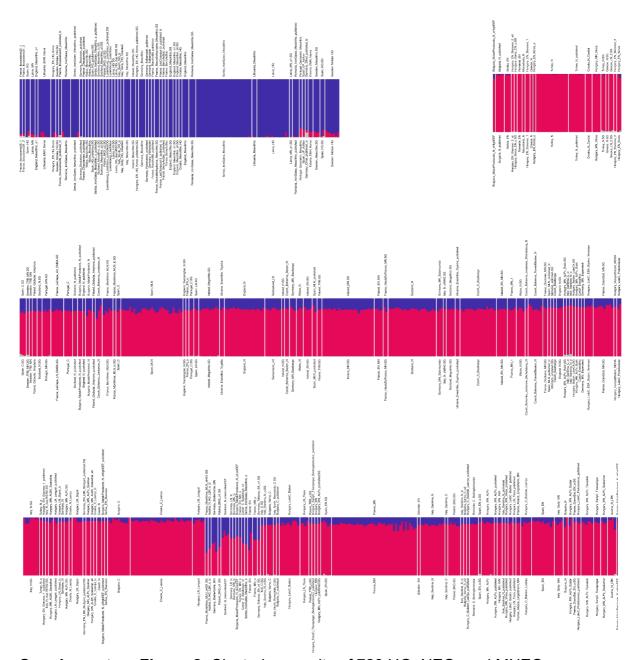
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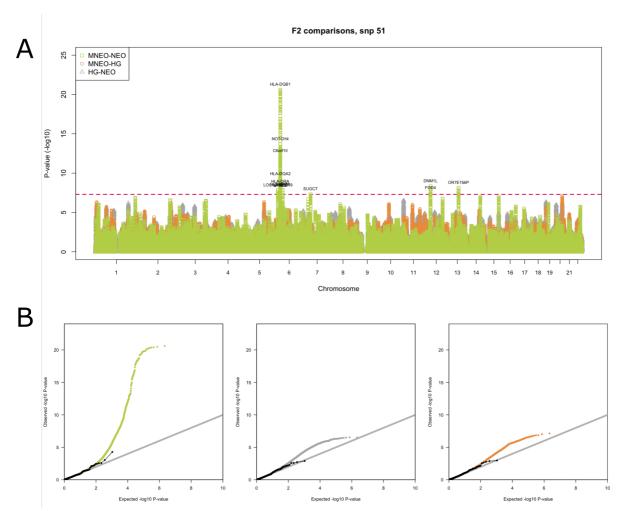
Supplementary Figures



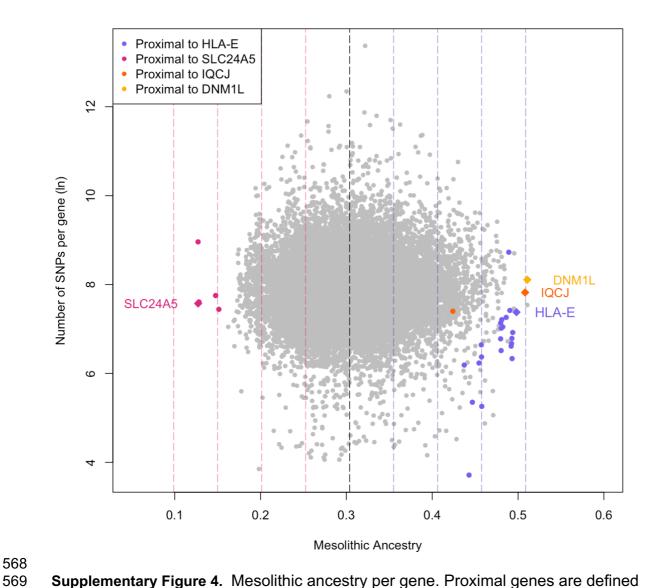
Supplementary Figure 1. Metadata of individuals used in selection scan. A) Coverage in each population, as the number of 1240k sites covered in each individual per population. B) Age of individuals in the 1240k selection scan.



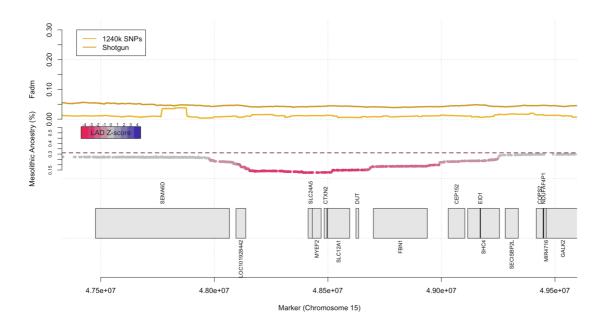
Supplementary Figure 2. Clustering results of 728 HG, NEO, and MNEO individuals alongside 40 individuals from the MSL 1000 genomes panel (the latter not shown) obtained using ADMIXTURE with K=3 (Methods).



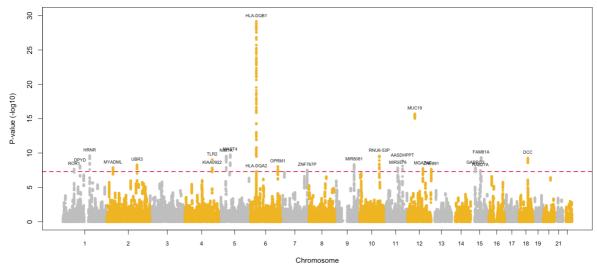
Supplementary Figure 3. f_2 pairwise comparisons of ancient populations. A) Manhattan plot of p-values for each pairwise comparison. B) Quantile-quantile plots for each pairwise comparison.

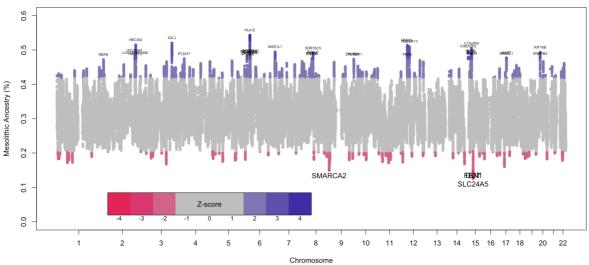


Supplementary Figure 4. Mesolithic ancestry per gene. Proximal genes are defined as being within 300kb from the start or end of the gene. Dotted lines represent standard deviations from the mean.

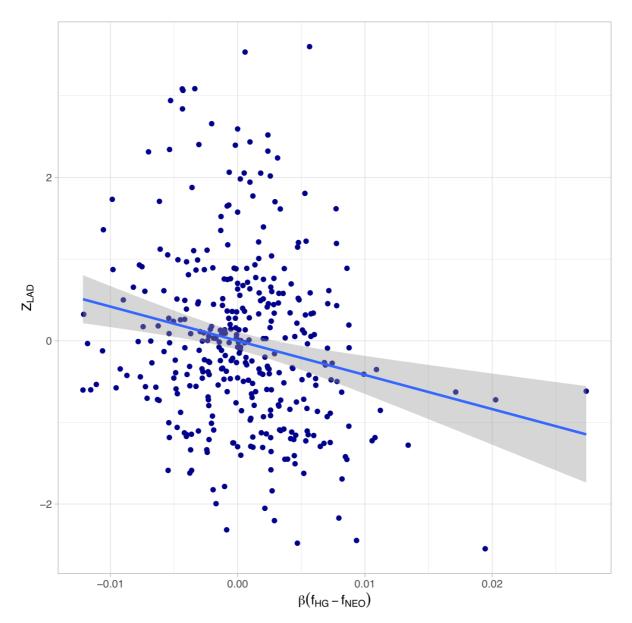


Supplementary Figure 5. Zoomed-in region of chromosome 11, with adaptive admixture statistics derived from 1240k and Shotgun data alongside local ancestry signal throughout the MHC regions I,II & III on chromosome 15.





Supplementary Figure 6. Fully annotated versions of adaptive admixture test Manhattan plots as seen in figure 2. A) F_{adm} B) Local Ancestry Deviation.



Supplementary Figure 7. Correlation of LAD Z-scores with hip circumference SNP effect size weighted by the signed allele frequency difference between the two source populations.