

# Genomic insights into the origin of farming in the ancient Near East

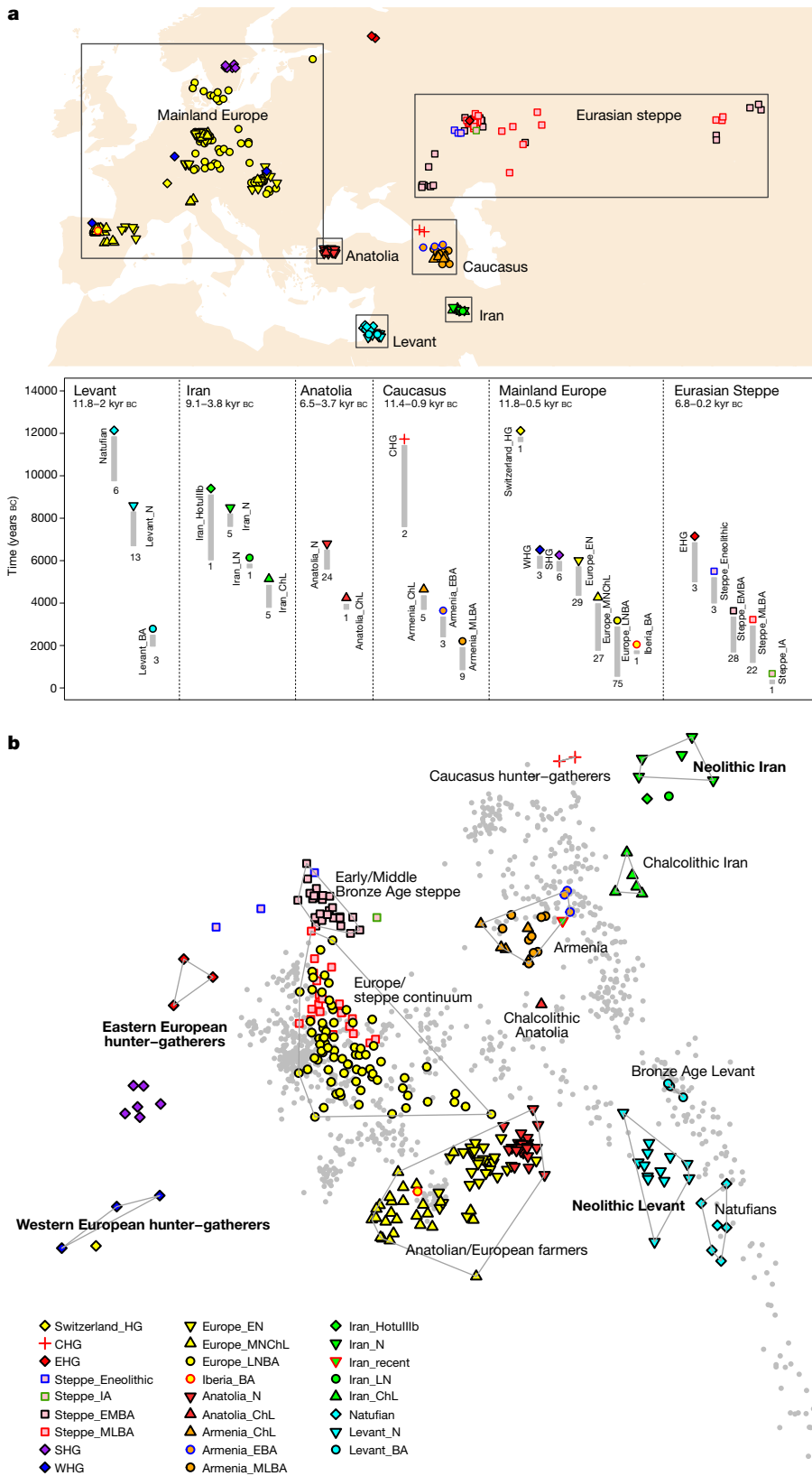
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**We report genome-wide ancient DNA from 44 ancient Near Easterners ranging in time between ~12,000 and 1,400 BC, from Natufian hunter-gatherers to Bronze Age farmers. We show that the earliest populations of the Near East derived around half their ancestry from a 'Basal Eurasian' lineage that had little if any Neanderthal admixture and that separated from other non-African lineages before their separation from each other. The first farmers of the southern Levant (Israel and Jordan) and Zagros Mountains (Iran) were strongly genetically differentiated, and each descended from local hunter-gatherers. By the time of the Bronze Age, these two populations and Anatolian-related farmers had mixed with each other and with the hunter-gatherers of Europe to greatly reduce genetic differentiation. The impact of the Near Eastern farmers extended beyond the Near East: farmers related to those of Anatolia spread westward into Europe; farmers related to those of the Levant spread southward into East Africa; farmers related to those of Iran spread northward into the Eurasian steppe; and people related to both the early farmers of Iran and to the pastoralists of the Eurasian steppe spread eastward into South Asia.**

Between 10,000 and 9,000 BC, humans began practicing agriculture in the Near East<sup>1</sup>. In the ensuing five millennia, plants and animals domesticated in the Near East spread throughout West Eurasia (a vast region that also includes Europe) and beyond. The relative homogeneity of present-day West Eurasians in a world context<sup>2</sup> suggests the possibility of extensive migration and admixture that homogenized geographically and genetically disparate sources of ancestry. The spread of the world's first farmers from the Near East would have been a mechanism for such homogenization. To date, however, owing to the poor preservation of DNA in warm climates, it has been impossible to study the population structure and history of the first farmers and to trace their contribution to later populations.

In order to overcome the obstacle of poor DNA preservation, we took advantage of two methodological developments. First, we sampled from the inner ear region of the petrous bone<sup>3,4</sup> which can yield up to ~100 times more endogenous DNA than other skeletal elements<sup>4</sup>. Second, we used in-solution hybridization<sup>5</sup> to enrich extracted DNA for about 1.2 million single nucleotide polymorphism (SNP) targets<sup>6,7</sup>, making efficient sequencing practical by filtering out microbial and non-informative human DNA. We merged all sequences extracted from each individual, and randomly sampled a single sequence with minimum mapping and sequence quality to represent each SNP, restricting our investigation to individuals with at least 9,000 SNPs covered at least once (Methods). We obtained genome-wide data that passed

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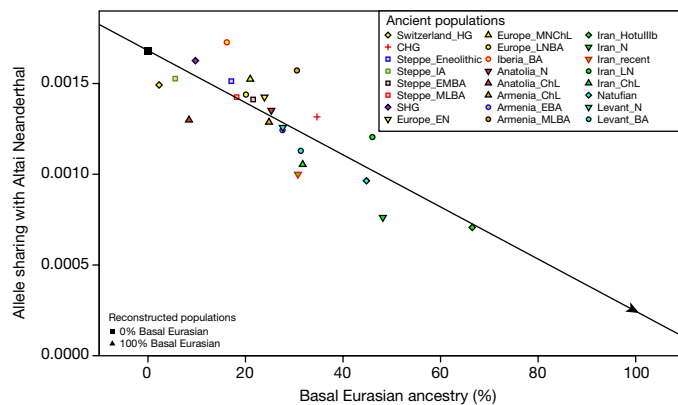


**Figure 1 | Genetic structure of ancient West Eurasia. a**, Sampling locations and times in six regions. Sample sizes for each population are given below each bar. E, Early; M, Middle; L, Late; HG, hunter-gatherer; N, Neolithic; ChL, Chalcolithic; BA, Bronze Age; IA, Iron Age. **b**, Principal components analysis of 991 present-day West Eurasians (grey points) with 278 projected ancient samples (excluding the Upper Palaeolithic Ust'-Ishim, Kostenki14, and MA1). To avoid visual clutter, population labels of present-day individuals are shown in Extended Data Fig. 1.

quality control for 45 individuals on whom we had a median coverage of 172,819 SNPs. We assembled direct radiocarbon dates on skeletal remains from 26 of these individuals (22 newly generated for this study) (Supplementary Table 1).

The newly reported ancient individuals date to ~12,000–1,400 BC and come from the southern Caucasus (Armenia), northwestern Anatolia (Turkey), Iran, and the southern Levant (Israel and Jordan)

(Supplementary Table 1 and Fig. 1a). (One individual had a radiocarbon date that was not in agreement with the date of its archaeological context and was also a genetic outlier.) The samples include Epipalaeolithic Natufian hunter-gatherers from Raqefet Cave in the Levant (~12,000–9,800 BC); a likely Mesolithic individual (HotuIIb) from Hotu Cave in the Alborz mountains of Iran (probable date of 9,100–8,600 BC); pre-pottery Neolithic farmers from 'Ain Ghazal and



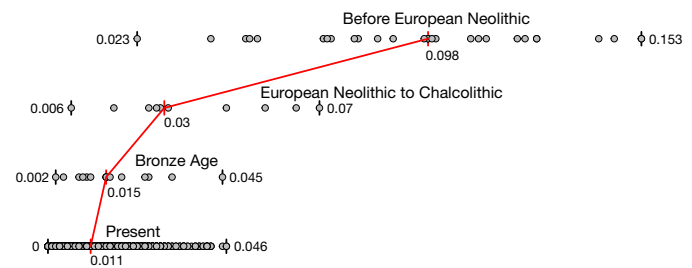
**Figure 2 | Basal Eurasian ancestry explains the reduced Neanderthal admixture in West Eurasians.** Basal Eurasian ancestry estimates are negatively correlated to a statistic measuring Neanderthal ancestry  $f_4(\text{Test}, \text{Mbuti}; \text{Altai}, \text{Denisovan})$ .

Motza in the southern Levant (~8,300–6,700 BC); and early farmers from Ganj Dareh in the Zagros mountains of western Iran (~8,200–7,600 BC). The samples also include later Neolithic, Chalcolithic (~4,800–3,700 BC), and Bronze Age (~3,350–1,400 BC) individuals (Supplementary Information, section 1). We combined our data with previously published ancient data<sup>7–15</sup> to form a dataset of 281 ancient individuals. We then further merged these data with 2,583 present-day people genotyped on the Affymetrix Human Origins array<sup>13,16</sup> (238 newly generated) (Supplementary Table 2 and Supplementary Information, section 2). We grouped the ancient individuals on the basis of archaeological culture and chronology (Fig. 1a and Supplementary Table 1). We refined the grouping on the basis of patterns evident in Principal Components Analysis (PCA)<sup>17</sup> (Fig. 1b and Extended Data Fig. 1), ADMIXTURE model-based clustering<sup>18</sup> (Extended Data Fig. 2a), and ‘outgroup’  $f_3$ -analysis (Extended Data Fig. 3). We used  $f_4$ -statistics to identify outlier individuals and to cluster phylogenetically indistinguishable groups into ‘Analysis Labels’ (Supplementary Information, section 3).

We analysed these data to address six questions. (1) Previous work has shown that the first European farmers harboured ancestry from a Basal Eurasian lineage that diverged from the ancestors of north Eurasian hunter-gatherers and East Asians before they separated from each other<sup>13</sup>. What was the distribution of Basal Eurasian ancestry in the ancient Near East? (2) Were the first farmers of the Near East part of a single homogeneous population, or were they regionally differentiated? (3) Was there continuity between late pre-agricultural hunter-gatherers and early farming populations, or were the hunter-gatherers largely displaced by a single expansive population, as in early Neolithic Europe?<sup>8</sup> (4) What is the genetic contribution of these early Near Eastern farmers to later populations of the Near East? (5) What is the genetic contribution of the early Near Eastern farmers to later populations of mainland Europe, the Eurasian steppe, and to populations outside West Eurasia? (6) Do our data provide broader insights about population transformations in West Eurasia?

### Basal Eurasian and Neanderthal ancestry

The ‘Basal Eurasians’ are a lineage hypothesized<sup>13</sup> to have split off before the differentiation of all other Eurasian lineages, including eastern non-African populations such as the Han Chinese, and even the early diverged lineage represented by the genome sequence of the ~45,000-year-old Upper Palaeolithic Siberian from Ust’-Ishim<sup>11</sup>. To test for Basal Eurasian ancestry, we computed the statistic  $f_4(\text{Test}, \text{Han}; \text{Ust’-Ishim}, \text{Chimp})$  (Supplementary Information, section 4), which measures the excess of allele sharing of Ust’-Ishim with a variety of *Test* populations compared to Han as a baseline. This statistic is significantly negative ( $Z < -3.7$ ) for all ancient Near Easterners as well as Neolithic and later Europeans, consistent with them having ancestry from a deeply divergent



**Figure 3 | Genetic differentiation and its marked decrease over time in West Eurasia.** Pairwise  $F_{ST}$  distribution among populations belonging to four successive time slices in West Eurasia; the median (red) and range of  $F_{ST}$  is shown.

Eurasian lineage that separated from the ancestors of most Eurasians before the separation of Han and Ust’-Ishim. We used *qpAdm* (ref. 7) to estimate Basal Eurasian ancestry in each *Test* population. We obtained the highest estimates in the earliest populations from both Iran ( $66 \pm 13\%$  in the likely Mesolithic sample,  $48 \pm 6\%$  in Neolithic samples), and the Levant ( $44 \pm 8\%$  in Epipalaeolithic Natufians) (Fig. 2), showing that Basal Eurasian ancestry was widespread across the ancient Near East.

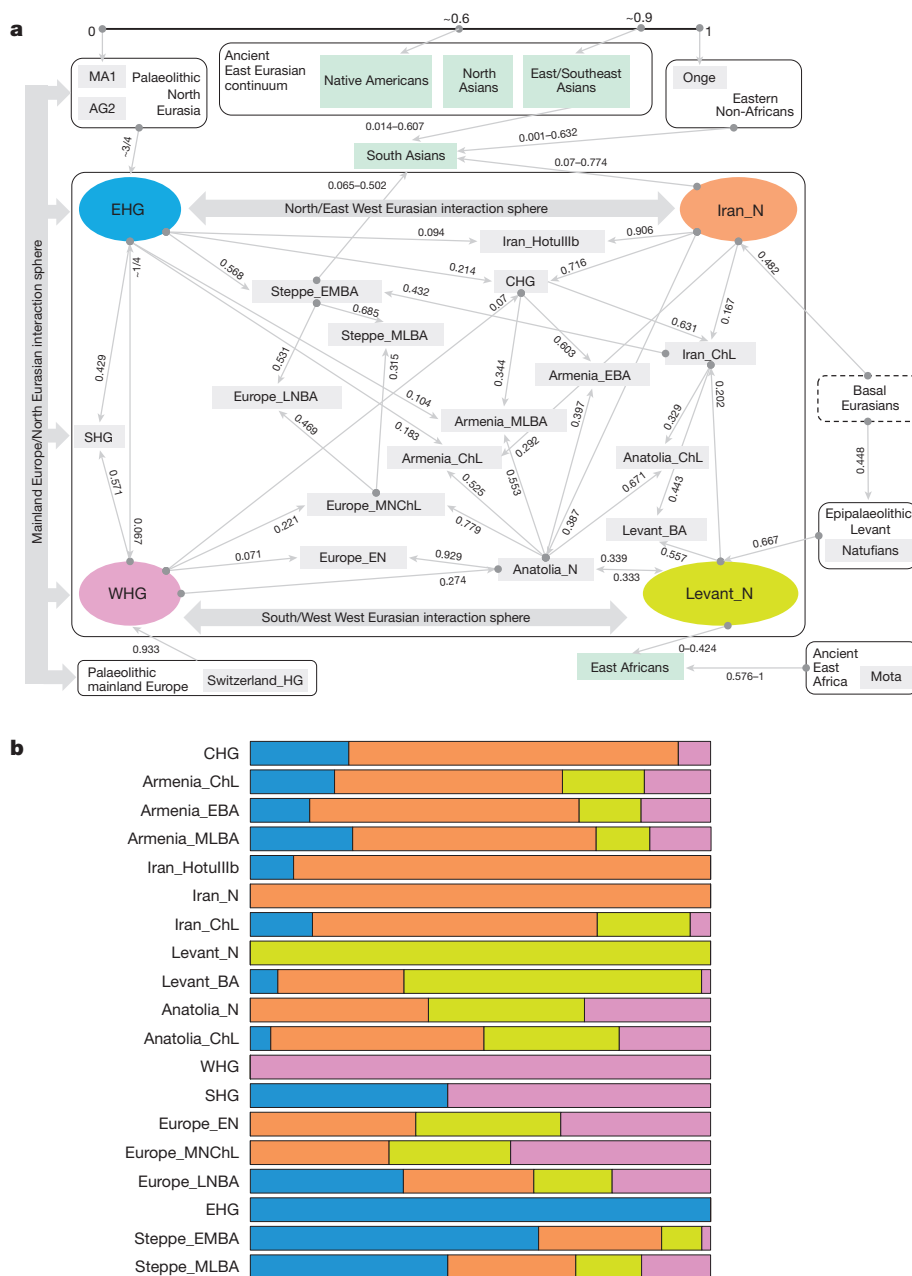
West Eurasians harbour significantly less Neanderthal ancestry than East Asians<sup>19–21</sup>, which could be explained if West Eurasians (but not East Asians) have partial ancestry from a source that diluted their Neanderthal inheritance<sup>20</sup>. Supporting this theory, we observe a negative correlation between Basal Eurasian ancestry and the rate of shared alleles with Neanderthals<sup>19</sup> (Supplementary Information, section 5 and Fig. 2). By extrapolation, we infer that the Basal Eurasian population had lower Neanderthal ancestry than non-Basal Eurasian populations and possibly none (95% confidence interval truncated at zero of 0–60%; Fig. 2; Methods). The finding of little if any Neanderthal ancestry in Basal Eurasians could be explained if the Neanderthal admixture into modern humans ~50,000–60,000 years ago<sup>11</sup> largely occurred after the splitting of the Basal Eurasians from other non-Africans.

It is striking that the highest estimates of Basal Eurasian ancestry are from the Near East, given the hypothesis that it was there that most admixture between Neanderthals and modern humans occurred<sup>19,22</sup>. This could be explained if Basal Eurasians thoroughly admixed into the Near East before the time of the samples we analysed but after the Neanderthal admixture. Alternatively, the ancestors of Basal Eurasians may have always lived in the Near East, but the lineage of which they were a part did not participate in the Neanderthal admixture.

A population without Neanderthal admixture, basal to other Eurasians, may have plausibly lived in Africa. Craniometric analyses have suggested an affinity between the Natufians and populations of north or sub-Saharan Africa<sup>23,24</sup>, a result that finds some support from Y chromosome analysis showing that the Natufians and successor Levantine Neolithic populations carried haplogroup E, likely to be of ultimately African origin, which has not been detected in other ancient males from West Eurasia<sup>7,8</sup> (Supplementary Information, section 6). However, no affinity of Natufians to sub-Saharan Africans is evident in our genome-wide analysis, as present-day sub-Saharan Africans do not share more alleles with Natufians than with other ancient Eurasians (Extended Data Table 1). (We could not test for a link to present-day North Africans, who owe most of their ancestry to back-migration from Eurasia<sup>25,26</sup>.) The idea of Natufians as a vector for the movement of Basal Eurasian ancestry into the Near East is also not supported by our data, as the Basal Eurasian ancestry in the Natufians ( $44 \pm 8\%$ ) is consistent with stemming from the same population as that in the Neolithic and Mesolithic populations of Iran, and is not greater than in those populations (Supplementary Information, section 4). Further insight into the origins and legacy of the Natufians could come from comparison to Natufians from additional sites, and to ancient DNA from North Africa.

### Extreme differentiation in the ancient Near East

PCA on present-day West Eurasian populations (Methods and Extended Data Fig. 1), on which we projected the ancient individuals



**Figure 4 | Modelling ancient West Eurasians, East Africans, East Eurasians and South Asians.** **a**, All the ancient populations can be modelled as mixtures of two or three other populations and up to four proximate sources (marked in colour). Mixture proportions inferred by *qpAdm* are indicated by the incoming arrows to each population. Green rectangles represent sets of more than one population. Multiple admixture solutions are consistent with the data for some populations, and while only one solution is shown here, Supplementary Information, section 7 presents the others. **b**, A flat representation of the graph showing mixture proportions from the four proximate sources.

(Fig. 1b), replicates previous findings of a Europe–Near East contrast along the horizontal principal component 1 (PC1) and parallel clines (PC2) in both Europe and the Near East<sup>7,8,13</sup> (Extended Data Fig. 1). Ancient samples from the Levant clustered at one end of the Near Eastern cline, and ancient samples from Iran at the other. The two Caucasus hunter–gatherers (CHG)<sup>9</sup> are less extreme along PC1 than the Mesolithic and Neolithic individuals from Iran, while individuals from Chalcolithic Anatolia, Iran, Armenia, and Bronze Age Armenia occupy intermediate positions. Qualitatively, the PCA has the appearance of a quadrangle whose four corners are some of the oldest samples: bottom-left, Western hunter–gatherers (WHG); top-left, Eastern hunter–gatherers (EHG); bottom-right, Neolithic Levant and Natufians; top-right, Neolithic Iran. This suggests that diverse ancient West Eurasians can be modelled as mixtures of as few as four streams of ancestry related to these populations, which we confirmed using *qpWave* (ref. 7) (Supplementary Information, section 7).

We computed squared allele frequency differentiation between all pairs of ancient West Eurasians<sup>27</sup> (Methods; Fig. 3 and Extended Data Figs 2b and 4), and found that the populations at the four corners of

the quadrangle had differentiation of  $F_{ST} = 0.08–0.15$ , comparable to the value of  $0.09–0.13$  seen between present-day West Eurasians and East Asians (Han) (Supplementary Table 3). By contrast, by the Bronze Age, genetic differentiation between pairs of West Eurasian populations had reached its present-day low levels (Fig. 3): today,  $F_{ST}$  is  $\leq 0.025$  for 95% of the pairs of West Eurasian populations and  $\leq 0.046$  for all pairs (Supplementary Table 3). These results point to a demographic process that established high differentiation across West Eurasia and then reduced this differentiation over time.

### Continuity between hunter–gatherers and early farmers

Our data document continuity across the transition between hunter–gatherers and farmers, separately in the southern Levant and in the southern Caucasus–Iran highlands. The qualitative evidence for this is that PCA, ADMIXTURE, and outgroup  $f_3$  analysis cluster Levantine hunter–gatherers (Natufians) with Levantine farmers, and Iranian and CHG with Iranian farmers (Fig. 1b and Extended Data Figs 1, 3). We confirm this in the Levant by showing that its early farmers share significantly more alleles with Natufians than with the early farmers of Iran:



the statistic  $f_4(\text{Levant\_N, Chimp; Natufian, Iran\_N})$  is significantly positive ( $Z = 13.6$ ). The early farmers of the Caucasus–Iran highlands similarly share significantly more alleles with the hunter–gatherers of this region than with the early farmers from the Levant: the statistic  $f_4(\text{Iran\_N, Chimp; Caucasus or Iran highland hunter–gatherers, Levant\_N})$  is significantly positive ( $Z > 6$ ).

### Admixture in the ancient Near East

Almost all ancient and present-day West Eurasians have evidence of significant admixture between two or more ancestral populations, as documented by statistics of the form  $f_3(\text{Test; Reference}_1, \text{Reference}_2)$  which, if negative, show that a test population's allele frequencies tend to be an intermediate between two reference populations<sup>16</sup> (Extended Data Table 2). To better understand the admixture history beyond these patterns, we used *qpAdm* (ref. 7), which can evaluate whether a particular test population is consistent with being derived from a set of proposed source populations, and if so, infer mixture proportions (Methods). We used this approach to carry out a systematic survey of ancient West Eurasian populations to explore their possible sources of admixture (Fig. 4 and Supplementary Information, section 7).

Among first farmers, those of the Levant trace approximately two-thirds of their ancestry to people related to Natufian hunter–gatherers and about one-third to people related to Anatolian farmers (Supplementary Information, section 7). Western Iranian first farmers cluster with the likely Mesolithic HotuIIIb individual and more remotely with hunter–gatherers from the southern Caucasus (Fig. 1b), and share alleles at an equal rate with Anatolian and Levantine early farmers (Supplementary Information, section 7), highlighting the long-term isolation of western Iran.

During subsequent millennia, the early farmer populations of the Near East expanded in all directions and mixed, as we can model populations of the Chalcolithic and subsequent Bronze Age only as having ancestry from two or more sources. The Chalcolithic people of western Iran can be modelled as a mixture of the Neolithic people of western Iran, the Levant and CHG, consistent with their position in the PCA (Fig. 1b). Admixture from populations related to the Chalcolithic people of western Iran had a wide impact, consistent with contributing around 44% of the ancestry of Levantine Bronze Age populations in the south and about 33% of the ancestry of the Chalcolithic North-West Anatolians in the west. Our analysis shows that the ancient populations of Chalcolithic Iran, Chalcolithic Armenia, Bronze Age Armenia and Chalcolithic Anatolia were all composed of the same ancestral components, albeit in slightly different proportions (Fig. 4b and Supplementary Information, section 7).

### Admixture into Europe, East Africa and South Asia

Admixture did not only occur within the Near East but also extended towards Europe. To the north, a population related to people of Chalcolithic Iran contributed about 43% of the ancestry of early Bronze Age populations of the steppe. The spread of Near Eastern ancestry into the Eurasian steppe was previously inferred<sup>7</sup> without access to ancient samples, with a population related to present-day Armenians as a suggested source<sup>7,8</sup>. To the west, the early farmers of mainland Europe were descended from a population related to Neolithic North-Western Anatolians<sup>8</sup>. This is consistent with an Anatolian origin of farming in Europe, but does not reject other sources, as the spatial distribution of the Anatolian/European-like farmer populations is unknown. We can rule out the hypothesis that European farmers stem directly from a population related to the ancient farmers of the southern Levant<sup>28,29</sup>, however, because European farmers share more alleles with Anatolian Neolithic farmers than with Levantine farmers, as attested by the positive statistic  $f_4(\text{Europe\_EN, Chimp; Anatolia\_N, Levant\_N})$  ( $Z = 15$ ).

Migration from the Near East also occurred towards the southwest into East African populations, which experienced West Eurasian admixture around 1,000 BC<sup>30,31</sup>. Previously, the West Eurasian population known to be the best proxy for this ancestry was present-day Sardinians<sup>31</sup>, who

resemble Neolithic Europeans genetically<sup>13,32</sup>. However, our analysis shows that East African ancestry is significantly better modelled by Levantine early farmers than by Anatolian or early European farmers, implying that the spread of this ancestry to East Africa was not from the same group that spread Near Eastern ancestry into Europe (Extended Data Fig. 5 and Supplementary Information, section 8).

In South Asia, our dataset provides insight into the sources of Ancestral North Indians (ANI), a West Eurasian-related population that no longer exists in unmixed form but contributes a variable amount of the ancestry of South Asians<sup>33,34</sup> (Supplementary Information, section 9 and Extended Data Fig. 5). We show that it is impossible to model the ANI as being derived from any single ancient population in our dataset. However, it can be modelled as a mix of ancestries related to both early farmers of western Iran and people of the Bronze Age Eurasian steppe; all sampled South Asian groups are inferred to have significant amounts of both ancestral types. The demographic impact of steppe-related populations on South Asia was substantial, as the Mala, a south Indian population with minimal ANI along the 'Indian Cline' of such ancestry<sup>33,34</sup>, is inferred to have around 18% steppe-related ancestry, while the Kalash of Pakistan are inferred to have about 50%, similar to present-day northern Europeans<sup>7</sup>.

### Population transformations in West Eurasia and beyond

We were concerned that our conclusions might be biased by the particular populations we happened to sample, and that we would have obtained qualitatively different conclusions without data from some key populations. We tested our conclusions by plotting the inferred position of admixed populations in PCA against a weighted combination of their inferred source populations and obtained qualitatively consistent results (Extended Data Fig. 6).

To further assess the robustness of our inferences, we developed a method to infer the existence and genetic affinities of ancient populations from unobserved 'ghost' populations (Supplementary Information, section 10 and Extended Data Fig. 7). This method takes advantage of the insight that if an unsampled ghost population admixes with differentiated 'substratum' populations, it is possible to extrapolate its identity by intersecting clines of populations with variable proportions of ghost and substratum ancestry. Applying this approach while withholding major populations, we validated some of our key inferences, successfully inferring mixture proportions consistent with those obtained when the populations were included in the analysis. Application of this method highlights the impact of Ancient North Eurasian (ANE) ancestry related to the ~22,000 BC Mal'ta 1 and ~15,000 BC Afontova Gora 2 (ref. 15) on populations living in Europe, the Americas and Eastern Eurasia. Eastern Eurasians can be modelled as arrayed along a cline with different proportions of ANE ancestry (Supplementary Information, section 11 and Extended Data Fig. 8), ranging from about 40% ANE in Native Americans, matching previous findings<sup>13,15</sup>, to no less than around 5–10% ANE in diverse East Asian groups including Han Chinese (Extended Data Figs 5, 7f). We also document a cline of ANE ancestry across the East–West extent of Eurasia. Eastern hunter–gatherers (EHG) derive about three-quarters of their ancestry from the ANE (Supplementary Information, section 11); Scandinavian hunter–gatherers<sup>7,8,13</sup> (SHG) are a mix of EHG and WHG; and WHG are a mix of EHG and populations related to the Upper Palaeolithic Bichon from Switzerland (Supplementary Information, section 7). Northwest Anatolians—with ancestry from a population related to European hunter–gatherers (Supplementary Information, section 7)—are better modelled if this ancestry is taken as more extreme than Bichon (Supplementary Information, section 10).

The population structure of the ancient Near East was not independent of that of Europe (Supplementary Information, section 4), as evidenced by the highly significant ( $Z = -8.9$ ) statistic  $f_4(\text{Iran\_N, Natufian; WHG, EHG})$  which suggests gene flow in 'northeastern' (Neolithic Iran/EHG) and 'southwestern' (Levant/WHG) interaction spheres (Fig. 4d). This interdependence of the ancestry of Europe and

the Near East may have been mediated by unsampled geographically intermediate populations<sup>35</sup> that contributed ancestry to both regions.

## Conclusions

By analysing genome-wide ancient DNA data from ancient individuals from the Levant, Anatolia, the southern Caucasus and Iran, we have provided a first glimpse into the demographic structure of the human populations that transitioned to farming. We reject the hypothesis that the spread of agriculture in the Near East was achieved by the dispersal of a single farming population displacing the hunter–gatherers they encountered. Instead, the spread of ideas and farming technology moved faster than the spread of people, as we can determine from the fact that the population structure of the Near East was maintained throughout the transition to agriculture. A priority for future ancient DNA studies should be to obtain data from older periods, which would reveal the deeper origins of the population structure in the Near East. It will also be important to obtain data from the ancient civilizations of the Near East to bridge the gap between the region's prehistoric inhabitants and those of the present.

**Online Content** Methods, along with any additional Extended Data display items and Source Data, are available in the online version of the paper; references unique to these sections appear only in the online paper.

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**Author Information** The aligned sequences are available through the European Nucleotide Archive under accession number PRJEB14455. Fully public subsets of the analysis datasets are at [http://genetics.med.harvard.edu/reichlab/Reich\\_Lab/Datasets.html](http://genetics.med.harvard.edu/reichlab/Reich_Lab/Datasets.html). The complete dataset (including present-day humans for which the informed consent is not consistent with public posting of data) is available to researchers who send a signed letter to D.R. indicating that they will abide by specified usage conditions (Supplementary Information, section 2). Reprints and permissions information is available at [www.nature.com/reprints](http://www.nature.com/reprints). The authors declare no competing financial interests. Readers are welcome to comment on the online version of the paper. Correspondence and requests for materials should be addressed to I.L. (lazaridis@genetics.med.harvard.edu) or R.P. (ron.pinhasi@ucd.ie) or D.R. (reich@genetics.med.harvard.edu).

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## METHODS

No statistical methods were used to predetermine sample size. The experiments were not randomized and the investigators were not blinded to allocation during experiments and outcome assessment.

**Ancient DNA data.** In a dedicated ancient DNA laboratory at University College Dublin, we prepared powder from 132 ancient Near Eastern samples, either by dissecting the inner ear region of the petrous bone using a sandblaster (Renfert), or by drilling using a Dremel tool and single-use drill bits and selecting the best preserved bone fragments based on anatomical criteria. These fragments were then powdered using a mixer mill (Retsch Mixer Mill 400)<sup>4</sup>.

We performed all subsequent processing steps in a dedicated ancient DNA laboratory at Harvard Medical School, where we extracted DNA from the powder (usually 75 mg, range 14–81 mg) using an optimized ancient DNA extraction protocol<sup>36</sup>, but replaced the assembly of Qiagen MinElute columns and extension reservoirs from Zymo Research with a High Pure Extender Assembly from the High Pure Viral Nucleic Acid Large Volume Kit (Roche Applied Science). We built a total of 170 barcoded double-stranded Illumina sequencing libraries for these samples<sup>37</sup>, of which we treated 167 with uracil-DNA glycosylase (UDG) to remove the characteristic C-to-T errors of ancient DNA<sup>38</sup>. The UDG treatment strategy is (by-design) inefficient at removing terminal uracils, allowing the mismatch rate to the human genome at the terminal nucleotide to be used for authentication<sup>37</sup>. We updated this library preparation protocol in two ways compared to the original publication: first, we used 16U Bst2.0 Polymerase, Large Fragment (NEB) and 1× Isothermal amplification buffer (NEB) in a final volume of 25 µl fill-in reaction, and second, we used the entire inactivated 25 µl fill-in reaction in a total volume of 100 µl PCR mix with 1 µM of each primer<sup>39</sup>. We included extraction negative controls (where no sample powder was used) and library negative controls (where extract was supplemented by water) in every batch of samples processed and carried them through the entire wet laboratory processing to test for reagent contamination.

We screened the libraries by hybridizing them in solution to a set of oligonucleotide probes tiling the mitochondrial genome<sup>40</sup>, using the protocol described previously<sup>7</sup>. We sequenced the enriched libraries using an Illumina NextSeq 500 instrument using 2× 76 bp reads, trimmed identifying sequences (seven base pair molecular barcodes at either end) and any trailing adapters, merged read pairs that overlapped by at least 15 base pairs, and mapped the merged sequences to the RSRS mitochondrial DNA reference genome<sup>41</sup>, using the Burrows Wheeler Aligner<sup>42</sup> (*bwa*) and the command *samse* (v0.6.1).

We enriched promising libraries for a targeted set of ~1.2 million SNPs<sup>8</sup> as in ref. 5, and adjusted the blocking oligonucleotide and primers to be appropriate for our libraries. The specific probe sequences are given in supplementary data 2 of ref. 7, and supplementary data 1 of ref. 6. We sequenced the libraries on an Illumina NextSeq 500 using 2× 76 bp reads. We trimmed identifying sequences (molecular barcodes) and any trailing adapters, merged pairs that overlapped by at least 15 base pairs (allowing up to one mismatch), and mapped the merged sequences to *hg19* using the single-ended aligner *samse* in *bwa* (v0.6.1). We removed duplicated sequences by identifying sets of sequences with the same orientation and start and end positions after alignment to *hg19*; we picked the highest quality sequence to represent each set. For each sample, we represented each SNP position by a randomly chosen sequence, restricting to sequences with a minimum mapping quality (MAPQ ≥ 10), sites with a minimum sequencing quality (≥ 20), and removing two bases at the ends of reads. We sequenced the enriched products up to the point that we estimated that generating a hundred new sequences was expected to add data on less than about one new SNP<sup>8</sup>.

**Testing for contamination and quality control.** For each ancient DNA library, we evaluated authenticity in several ways. First, we estimated the rate of matching to the consensus sequence for mitochondrial genomes sequenced to a coverage of at least tenfold from the initial screening data. Of the 76 libraries that contributed to our dataset (coming from 45 samples), 70 had an estimated rate of sequencing matching to the consensus of >95% according to *contamMix*<sup>5</sup> (the remaining libraries had estimated match rates of 75–92%, but gave no sign of being outliers in principal component analysis or X-chromosome contamination analysis so we retained them for analysis) (Supplementary Table 1). We quantified the rate of C-to-T substitution in the final nucleotide of the sequences analysed, relative to the human reference genome sequence, and found that all the libraries analysed had rates of at least 3% (ref. 37), consistent with genuine ancient DNA. For the nuclear data from males, we used the ANGSD software<sup>43</sup> to obtain a conservative X-chromosome estimate of contamination. We determined that all libraries that passed our quality control and for which we had sufficient X-chromosome data to make an assessment, had contamination rates of 0–1.5%. Finally, we merged data for samples for which we had multiple libraries to produce an analysis dataset. **Affymetrix Human Origins genotyping data.** We genotyped 238 present-day individuals from 17 diverse West Eurasian populations on the Affymetrix Human Origins array<sup>16</sup>, and applied quality control analyses as previously described<sup>13</sup>

(Supplementary Table 2). We merged the newly generated data with data from 2,345 individuals previously genotyped on the same array<sup>13</sup>. All individuals that were genotyped provided individual informed consent consistent with studies of population history, following protocols approved by the ethical review committees of the institutions of the researchers who collected the samples. The collection and analysis of genome-wide data on anonymized samples at Harvard Medical School for the purpose of studying population history was approved by the Harvard Human Research Protection Program, protocol 11681, re-reviewed on 12 July 2016. Anonymized aliquots of DNA from all individuals were sent to the core facility of the Center for Applied Genomics at the Children's Hospital of Philadelphia for genotyping and data processing. For 127 of the individuals with newly reported data, the informed consent was consistent with public distribution of data, and the data can be downloaded at [http://genetics.med.harvard.edu/reich/Reich\\_Lab/Datasets.html](http://genetics.med.harvard.edu/reich/Reich_Lab/Datasets.html). To access data for the remaining 111 newly reported samples, researchers should send a signed letter to D.R. containing the following text: “(a) I will not distribute the data outside my collaboration; (b) I will not post the data publicly; (c) I will make no attempt to connect the genetic data to personal identifiers for the samples; (d) I will use the data only for studies of population history; (e) I will not use the data for any selection studies; (f) I will not use the data for medical or disease-related analyses; (g) I will not use the data for commercial purposes.” Supplementary Table 2 specifies which samples are consistent with which type of data distribution.

**Datasets.** We carried out population genetic analysis on two datasets: (i) *HO* includes 2,583 present-day humans genotyped on the Human Origins array<sup>13,16</sup> including 238 newly reported, (Supplementary Table 2; Supplementary Information, section 2), and 281 ancient individuals on a total of 592,146 autosomal SNPs. (ii) *HOIII* includes the 281 ancient individuals on a total of 1,055,186 autosomal SNPs, including those present in both the Human Origins and Illumina genotyping platforms, but excluding SNPs on the sex chromosomes or additional SNPs of the 1,240k capture array that were included because of their potential functional importance<sup>8</sup>. We used *HO* for analyses that involve both ancient and present-day individuals, and *HOIII* for analysis on ancient individuals alone. We also used 235 individuals from Pagani *et al.*<sup>30</sup> genotyped at 418,700 autosomal SNPs to study admixture in East Africans (Supplementary Information, section 8). Ancient individuals are represented in ‘pseudo-haploid’ form by randomly choosing one allele for each position of the array.

**Principal components analysis.** We carried out principal components analysis in the *smartpca* program of EIGENSOFT<sup>17</sup>, using default parameters and the *lsqproject*: YES<sup>13</sup> and *numoutlieriter*: 0 options. We carried out PCA on the *HO* dataset for 991 present-day West Eurasians (Extended Data Fig. 1), and projected the 278 ancient individuals (Fig. 1b).

**ADMIXTURE analysis.** We carried out ADMIXTURE analysis<sup>18</sup> of the *HO* dataset after pruning for linkage disequilibrium in PLINK<sup>44,45</sup> with parameters *indep-pairwise* 200 25 0.4, which retained 296,309 SNPs. We performed analysis in 20 replicates with different random seeds, and retained the highest likelihood replicate for each value of *K*. We show the *K* = 11 results for the 281 ancient samples in Extended Data Fig. 2a (this is the lowest *K* for which components maximized in European hunter-gatherers, ancient Levant, and ancient Iran appear).

**f-statistics.** We carried out analysis of *f*<sub>3</sub>-statistics, *f*<sub>4</sub>-ratio, and *f*<sub>4</sub>-statistics statistics using the ADMIXTOOLS<sup>16</sup> programs *qp3Pop*, *qpF4ratio* with default parameters, and *qpDstat* with *f4mode*: YES, and computed standard errors with a block jack-knife<sup>46</sup>. For computing *f*<sub>3</sub>-statistics with an ancient population as a target, we set the inbreed: YES parameter. We computed *f*-statistics on the *HOIII* dataset when no present-day humans were involved and on the *HO* dataset when they were. We computed the statistic *f*<sub>4</sub>(*Test*, Mbuti; Altai, Denisovan) in Fig. 2 on the *HOIII* dataset after merging with whole genome data on 3 Mbuti individuals from Panel C of the Simons Genome Diversity Project<sup>47</sup>. We computed the dendrogram of Extended Data Fig. 3 showing hierarchical clustering of populations with outgroup *f*<sub>3</sub>-statistics using the open source *heatmap.2* function of the *gplots* package in R.

**Negative correlation of Basal Eurasian ancestry with Neanderthal ancestry.** We used the *lm* function of R to fit a linear regression of the rate of allele sharing of a *Test* population with the Altai Neanderthal as measured by *f*<sub>4</sub>(*Test*, Mbuti; Altai, Denisovan) as the dependent variable, and the proportion of Basal Eurasian ancestry (Supplementary Information, section 4) as the predictor variable. Extrapolating from the fitted line, we obtain the value of the statistic expected if *Test* is a population of 0% or 100% Basal Eurasian ancestry. We then compute the ratio of the Neanderthal ancestry estimate in Basal Eurasians relative to non-Basal Eurasians as *f*<sub>4</sub>(100% Basal Eurasian, Mbuti; Altai, Denisovan)/*f*<sub>4</sub>(0% Basal Eurasian, Mbuti; Altai, Denisovan). We use a block jack-knife<sup>46</sup>, dropping one of 100 contiguous blocks of the genome at a time, to estimate the value and standard error of this quantity (9 ± 26%). We compute a 95% confidence interval based on the point estimate ± 1.96-times the standard error: –42 to 60%. We truncated to 0–60%

on the assumption that Basal Eurasians had no less Neanderthal admixture than Mbuti from sub-Saharan Africa.

**Estimation of  $F_{ST}$  coefficients.** We estimated  $F_{ST}$  in *smartpca*<sup>17</sup> with default parameters, inbreed: YES, and fstonly: YES.

**Admixture graph modelling.** We carried out Admixture Graph modelling with the *qpGraph* software<sup>16</sup> using Mbuti as an outgroup unless otherwise specified.

**Testing for the number of streams of ancestry.** We used the *qpWave*<sup>33,48</sup> software, described in Supplementary Information, section 10 of ref. 7, to test whether a set of 'Left' populations is consistent with being related via as few as  $N$  streams of ancestry to a set of 'Right' populations by studying statistics of the form  $X(u, v) = F_4(u_0, u; v_0, v)$  where  $u_0, v_0$  are basis populations chosen from the 'Left' and 'Right' sets and  $u, v$  are other populations from these sets. We use a Hotelling's  $T^2$  test<sup>48</sup> to evaluate whether the matrix of size  $(L-1)*(R-1)$ , where  $L, R$  are the sizes of the 'Left' and 'Right' sets has rank  $m$ . If this is the case, we can conclude that the 'Left' set is related via at least  $N = m + 1$  streams of ancestry differently to the 'Right' set. We use the parameter allsnps: YES which computes each  $f_4$ -statistic based on the full set of SNPs with coverage among the four populations used in the statistic (without regard to whether the SNPs are covered in the other populations in the 'Left' and 'Right' sets).

**Inferring mixture proportions without an explicit phylogeny.** We used the *qpAdm* methodology described in Supplementary Information, section 10 of ref. 7 to estimate the proportions of ancestry in a *Test* population deriving from a mixture of  $N$  'reference' populations by exploiting (but not explicitly modelling) shared genetic drift with a set of 'Outgroup' populations (Supplementary Information, section 7). We set the details: YES parameter, which reports a normally distributed  $Z$ -score estimated with a block jack-knife for the difference between the statistics  $f_4(u_0, Test; v_0, v)$  and  $f_4(u_0, Estimated\ Test; v_0, v)$  where *Estimated Test* is  $\sum_{i=1}^N \alpha_i f_4(u_0, Ref_i; v_0, v)$ , the average of these  $f_4$ -statistics weighed by the mixture proportions  $\alpha_i$  from the  $N$  reference populations. We use the allsnps: YES parameter.

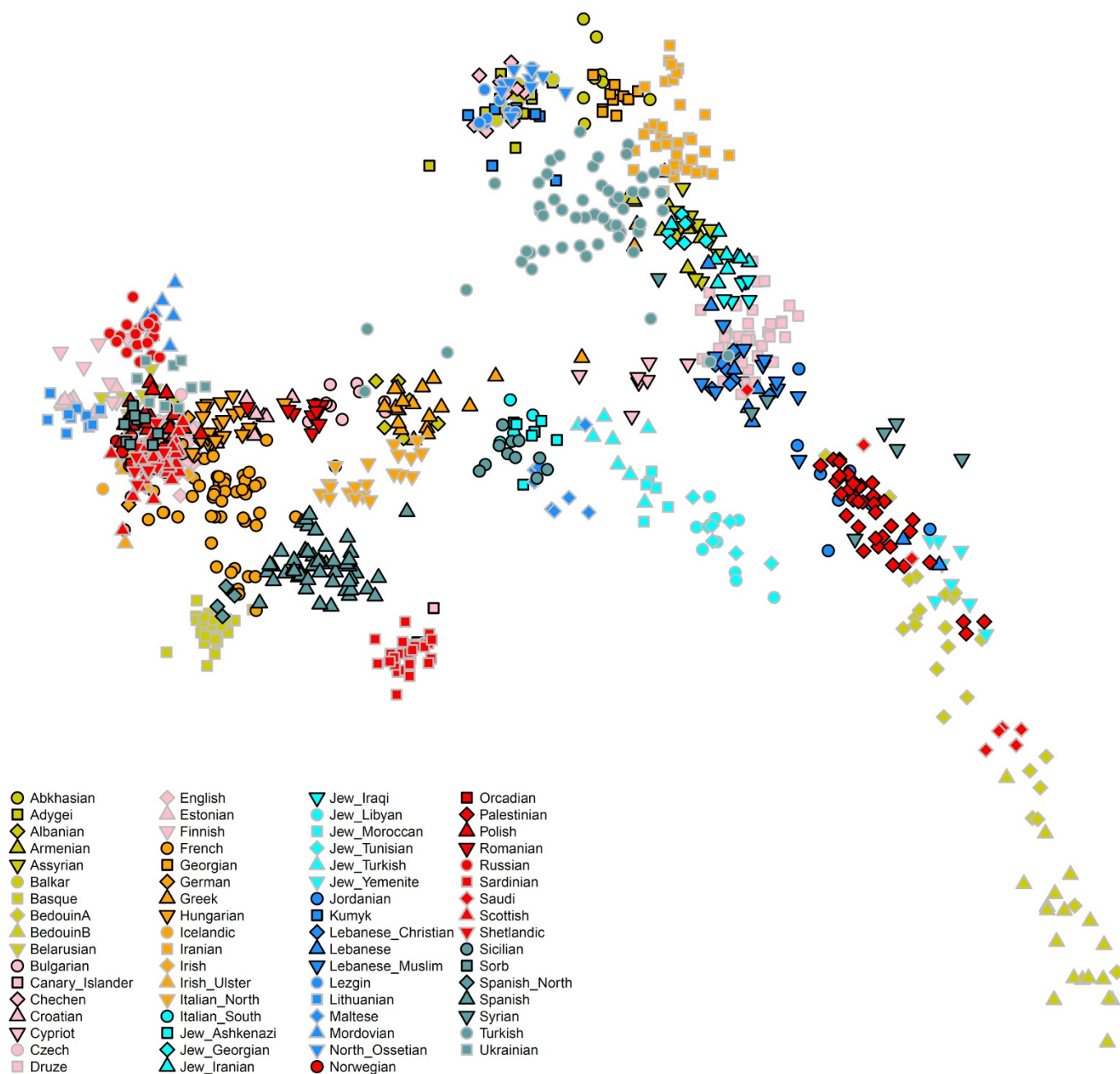
**Modelling admixture from ghost populations.** We model admixture from a 'ghost' (unobserved) population  $X$  in the specific case that  $X$  has part of its ancestry from two unobserved ancestral populations  $p$  and  $q$ . Any population  $X$  composed

of the same populations  $p$  and  $q$  resides on a line defined by two observed reference populations  $r_1$  and  $r_2$  composed of the same elements  $p$  and  $q$  according to a parametric equation  $x = r_1 + \lambda(r_2 - r_1)$  with real-valued parameter  $\lambda$ . We define and solve the optimization problem of fitting  $\lambda$  and obtain mixture proportions (Supplementary Information, section 10).

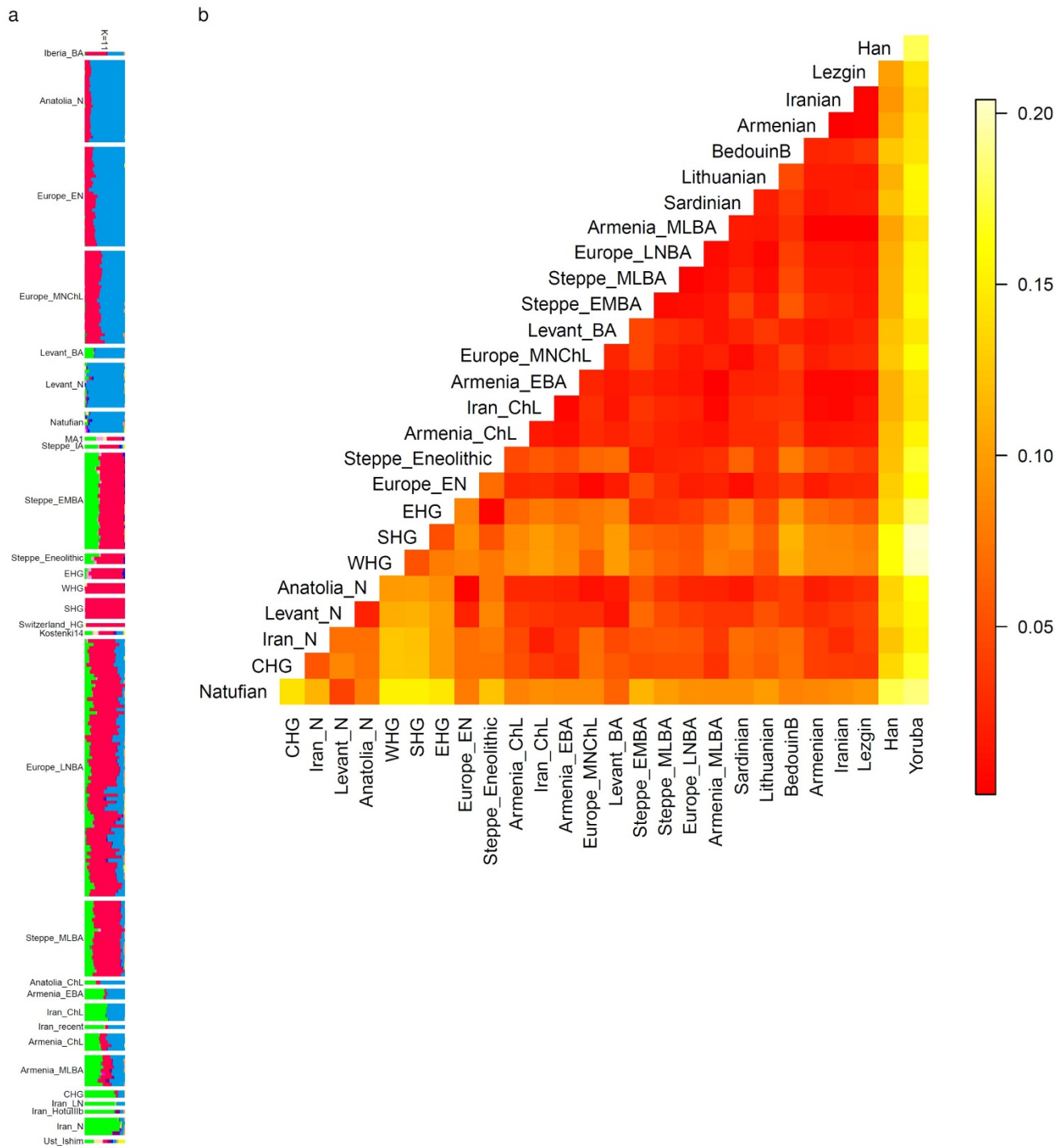
**Code availability.** Code implementing the newly developed method for modelling admixture from ghost populations is available on request from I.L.

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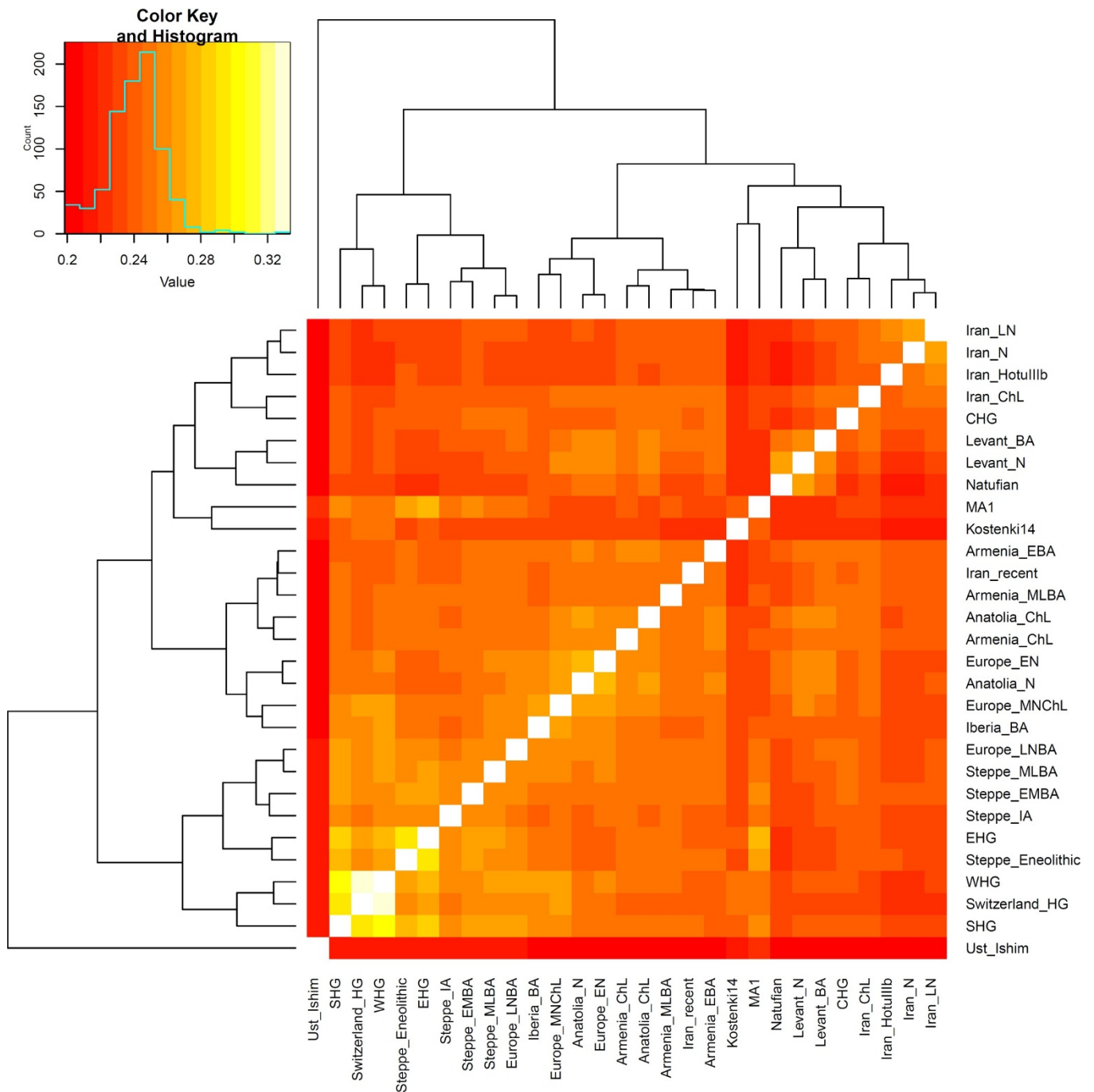


**Extended Data Figure 1 | Principal components analysis of 991 present-day West Eurasians.** The PCA analysis is performed on the same set of individuals as are reported in Fig. 1b, using EIGENSOFT. Here, we colour the samples by population (to highlight the present-day populations) instead of using grey points as in Fig. 1b (where the goal is to highlight ancient samples).



**Extended Data Figure 2 | Genetic structure in ancient West Eurasian populations across time and decline of genetic differentiation over time. a,** ADMIXTURE model-based clustering analysis of 2,583 present-day humans and 281 ancient samples; we show the results only for ancient

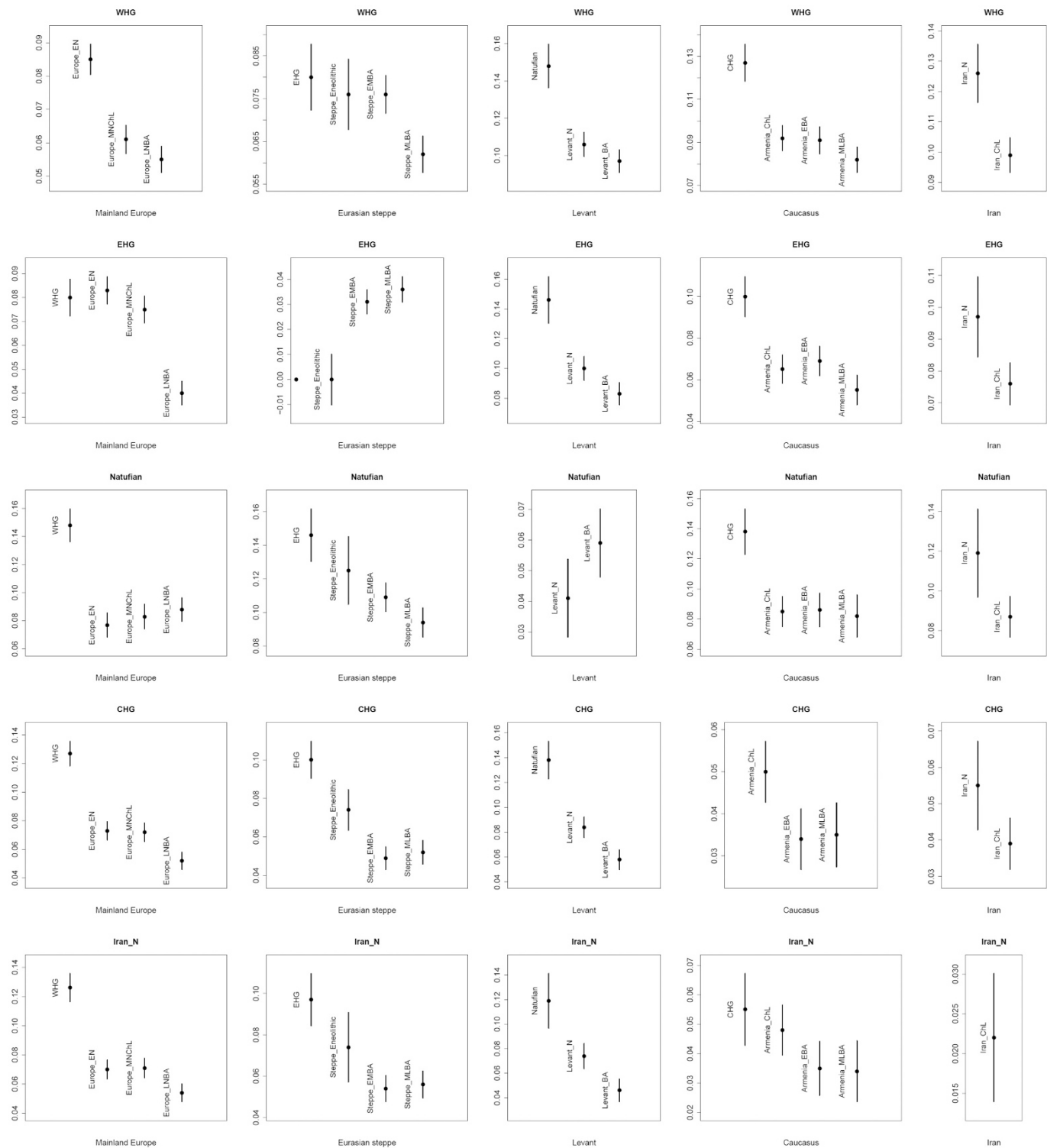
samples for  $K=11$  clusters. **b,** Pairwise  $F_{ST}$  between 19 Ancient West Eurasian populations (arranged in approximate chronological order), and select present-day populations.



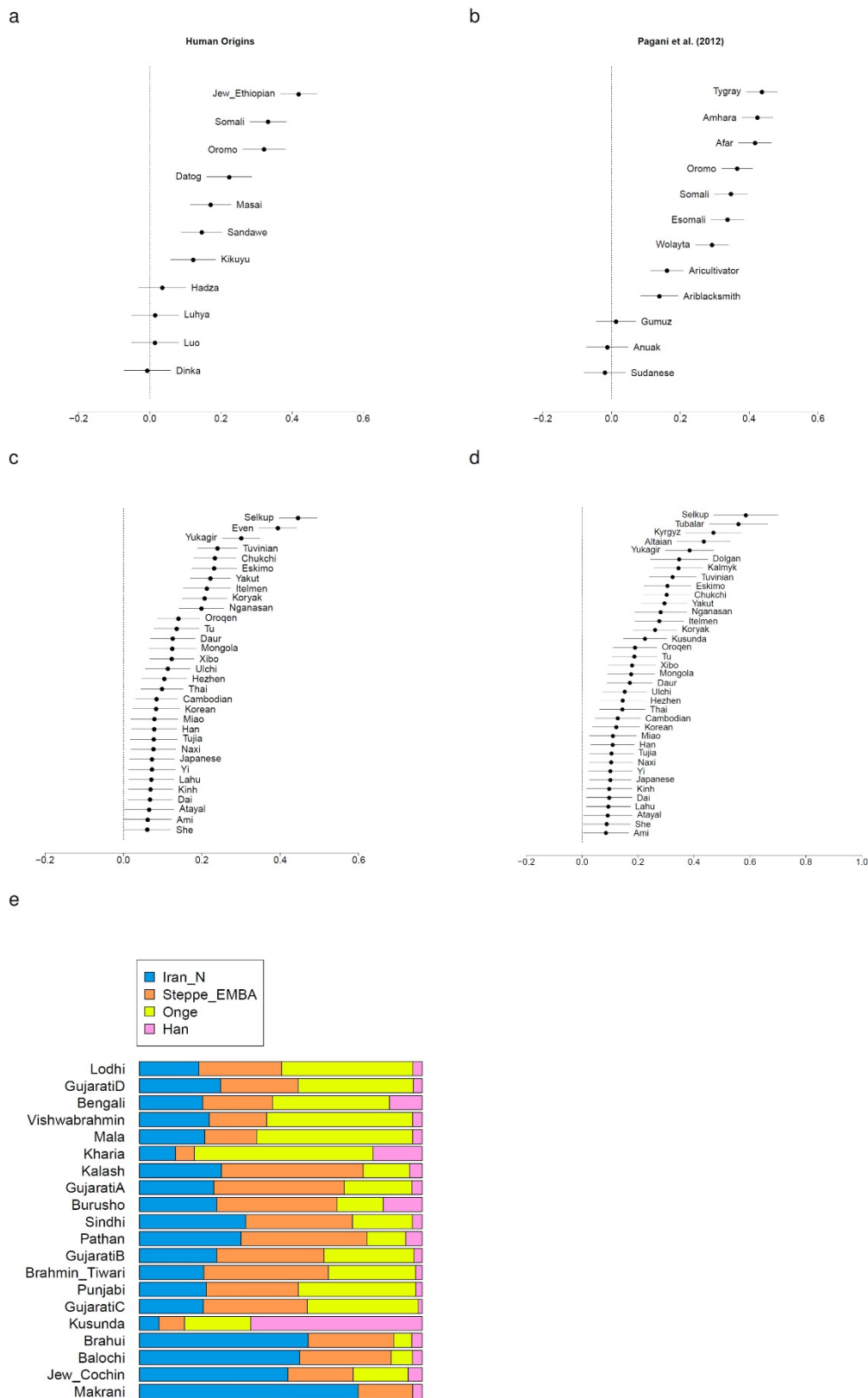
**Extended Data Figure 3 | Outgroup  $f_3(Mbuti; X, Y)$  for pairs of ancient populations.** The dendrogram is plotted for convenience and should not be interpreted as a phylogenetic tree. Areas of high shared genetic drift are 'yellow' and include from top-right to bottom-left along the diagonal:

early Anatolian and European farmers; European hunter-gatherers, Steppe populations and populations admixed with steppe ancestry; populations from the Levant from the Epipalaeolithic (Natufians) to the Bronze Age; populations from Iran from the Mesolithic to the Late Neolithic.





**Extended Data Figure 4 | Reduction of genetic differentiation in West Eurasia over time.** We measure differentiation by  $F_{ST}$ . Each column of the  $5 \times 5$  matrix of plots represents a major region and each row the earliest population with at least two individuals from each major region.



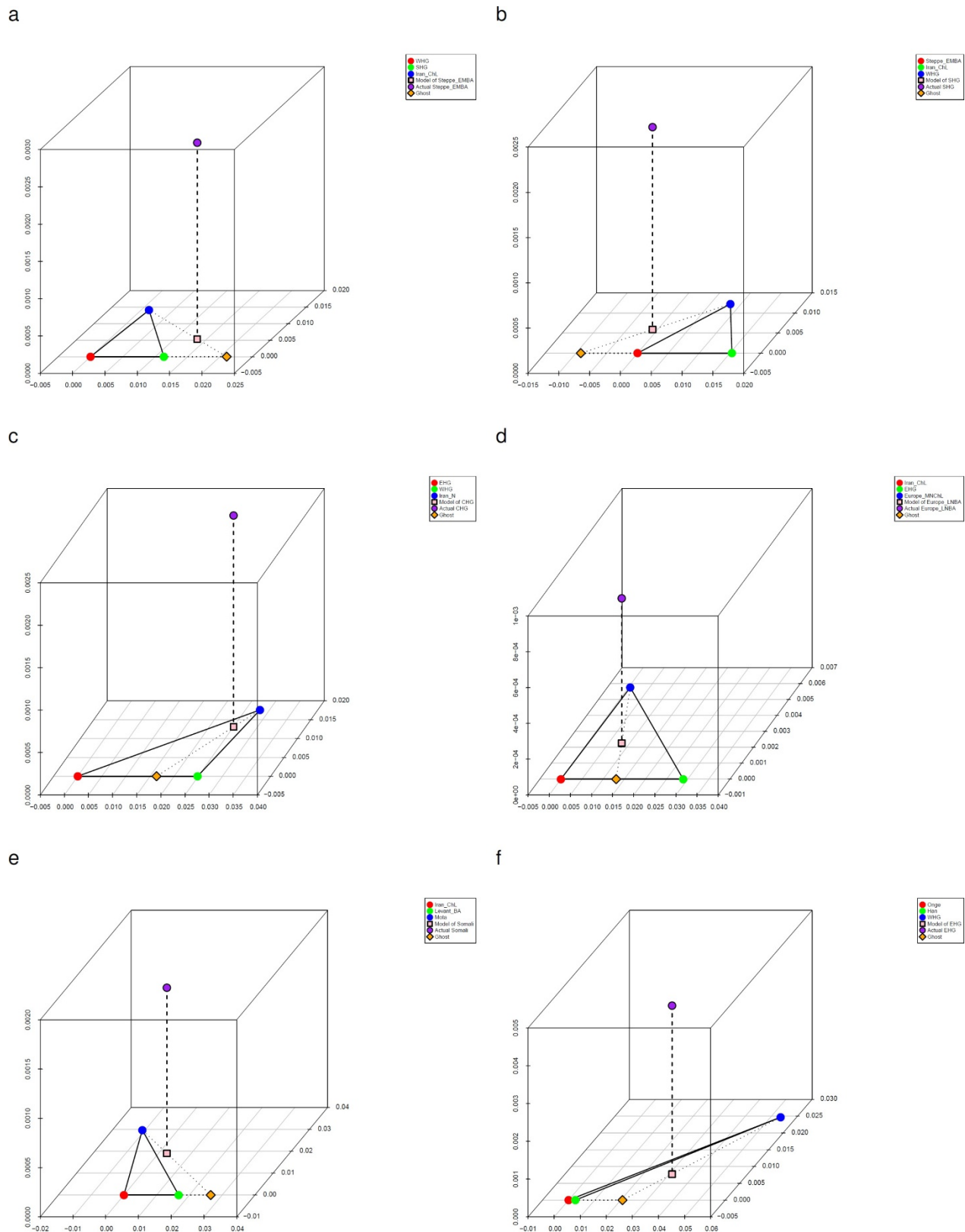
**Extended Data Figure 5 | West Eurasian related admixture in East Africa, Eastern Eurasia and South Asia. a.** Levantine ancestry in Eastern Africa in the Human Origins dataset. **b.** Levantine ancestry in different Eastern African population in the dataset from Pagani *et al.* (2012); the remainder of the ancestry is a clade with Mota, a ~4,500 year old sample

from Ethiopia<sup>49</sup>. **c.** EHG ancestry in Eastern Eurasians. **d.** Afontova Gora (AG2)-related ancestry in Eastern Eurasians; the remainder of their ancestry is a clade with Onge. **e.** Mixture proportions for South Asian populations showing that they can be modelled as having West Eurasian-related ancestry similar to that in populations from both the Eurasian steppe and Iran.



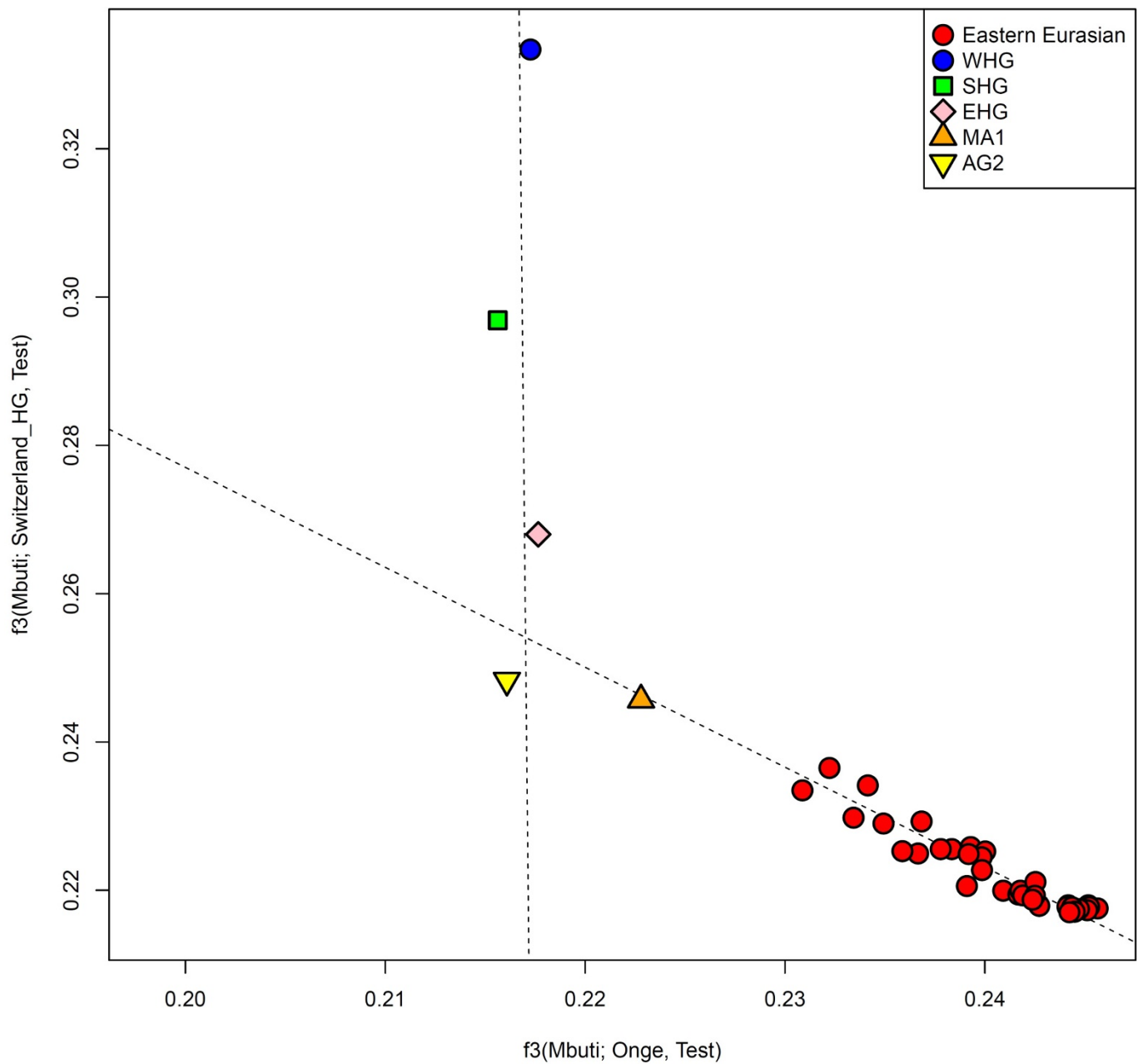
**Extended Data Figure 6 | Inferred position of ancient populations in West Eurasian PCA according to the model of Fig. 4.**





**Extended Data Figure 7 | Admixture from ghost populations using 'cline intersection'.** a–f, We model each *Test* population (purple) as a mixture (pink) of a fixed reference population (blue) and a ghost population (orange) residing on the cline defined by two other populations (red and green) according to the visualization method of Supplementary Information, section 10. **a**, Early/Middle Bronze Age steppe populations are a mixture of Iran\_ChL and a population on the WHG→SHG cline. **b**, Scandinavian hunter-gatherers (SHG) are a mixture of WHG and a

population on the Iran\_ChL→Steppe\_EMBA cline. **c**, Caucasus hunter-gatherers (CHG) are a mixture of Iran\_N and both WHG and EHG. **d**, Late Neolithic/Bronze Age Europeans are a mixture of the preceding Europe\_MNChL population and a population with both EHG and Iran\_ChL ancestry. **e**, Somali are a mixture of Mota<sup>49</sup> and a population on the Iran\_ChL→Levant\_BA cline. **f**, Eastern European hunter-gatherers (EHG) are a mixture of WHG and a population on the Onge→Han cline.



**Extended Data Figure 8 | Admixture from a ‘ghost’ ANE population into both European and Eastern Eurasian ancestry.** EHG, and Upper Palaeolithic Siberians Mal’ta 1 (MA1) and Afontova Gora 2 (AG2) are positioned near the intersection of clines formed by European

hunter-gatherers (WHG, SHG, EHG) and Eastern non-Africans in the space of outgroup  $f_3$ -statistics of the form  $f_3(\text{Mbuti}; \text{Papuan}, \text{Test})$  and  $f_3(\text{Mbuti}; \text{Switzerland\_HG}, \text{Test})$ .

**Extended Data Table 1 | No evidence for admixture related to sub-Saharan Africans in Natufians**

<i>Other Ancient</i>	<i>African</i>	$f_4(\text{Natufian, Other Ancient; African, Chimp})$	<b>Z</b>	<b>Number of SNPs</b>
EHG	Mbuti	-0.00044	-1.0	254033
EHG	Yoruba	0.00029	0.7	254033
EHG	Ju_hoan_North	-0.00015	-0.4	254033
EHG	Mota	-0.00022	-0.4	253986
WHG	Mbuti	-0.00067	-1.7	261514
WHG	Yoruba	-0.00045	-1.1	261514
WHG	Ju_hoan_North	-0.00046	-1.2	261514
WHG	Mota	-0.00129	-2.3	261461
SHG	Mbuti	-0.00076	-2.0	255686
SHG	Yoruba	-0.00039	-1.0	255686
SHG	Ju_hoan_North	-0.00052	-1.4	255686
SHG	Mota	-0.00091	-1.7	255641
Switzerland_HG	Mbuti	-0.00018	-0.4	261322
Switzerland_HG	Yoruba	0.00019	0.4	261322
Switzerland_HG	Ju_hoan_North	0.00009	0.2	261322
Switzerland_HG	Mota	-0.00062	-0.9	261276
Kostenki14	Mbuti	0.00034	0.7	246765
Kostenki14	Yoruba	0.00120	2.3	246765
Kostenki14	Ju_hoan_North	0.00069	1.4	246765
Kostenki14	Mota	0.00036	0.5	246719
MA1	Mbuti	-0.00038	-0.7	191819
MA1	Yoruba	0.00009	0.2	191819
MA1	Ju_hoan_North	-0.00010	-0.2	191819
MA1	Mota	-0.00038	-0.5	191782
CHG	Mbuti	-0.00051	-1.2	261505
CHG	Yoruba	-0.00012	-0.3	261505
CHG	Ju_hoan_North	-0.00013	-0.3	261505
CHG	Mota	-0.00042	-0.7	261456
Iran_N	Mbuti	-0.00018	-0.4	232927
Iran_N	Yoruba	0.00036	0.8	232927
Iran_N	Ju_hoan_North	0.00041	0.9	232927
Iran_N	Mota	0.00006	0.1	232880

We computed the statistic  $f_4(\text{Natufian, Other Ancient; African, Chimp})$  varying *African* to be Mbuti, Yoruba, Ju\_hoan\_North, or the ancient Mota individual. Gene flow between Natufians and African populations would be expected to bias these statistics positive. However, we find most of them to be negative in sign and all of them to be non-significant ( $|Z| < 3$ ), providing no evidence that Natufians differ from other ancient samples with respect to African populations.



Extended Data Table 2 | Admixture  $f_3$ -statistics

Test	Reference <sub>1</sub>	Reference <sub>2</sub>	$f_3(\text{Test}; \text{Reference}_1, \text{Reference}_2)$	Z-score	Number of SNPs
Anatolia_N	Iberia_BA	Levant_N	-0.00034	-0.2	111632
Armenia_ChL	EHG	Levant_N	-0.00249	-1.5	167020
Armenia_EBA	Anatolia_N	CHG	-0.01017	-7.9	195596
Armenia_MLBA	Anatolia_N	Steppe_EMBA	-0.00809	-7.3	203796
CHG	Anatolia_ChL	Iran_HotulIIb	0.02612	3.6	9884
EHG	Steppe_Eneolithic	Switzerland_HG	-0.00282	-0.9	67938
Europe_EN	Anatolia_N	WHG	-0.00494	-11.2	380684
Europe_LNBA	Europe_MNChL	Steppe_EMBA	-0.00920	-41.8	414782
Europe_MNChL	Anatolia_N	WHG	-0.01351	-26.8	363672
Iran_ChL	Anatolia_N	Iran_N	-0.01285	-10.6	167941
Iran_N	Iran_LN	Gana	-0.00462	-1.1	17804
Levant_BA	Iran_N	Levant_N	-0.00853	-4.7	118269
Levant_N	Europe_MNChL	Natufian	-0.00671	-3.6	61845
Natufian	Iberia_BA	Iran_HotulIIb	0.07613	3.4	1054
SHG	Steppe_Eneolithic	Switzerland_HG	0.00728	3.2	154825
Steppe_EMBA	EHG	Abkhasian	-0.00756	-11.2	349359
Steppe_Eneolithic	EHG	Iran_LN	-0.01637	-4.2	25100
Steppe_MLBA	Europe_MNChL	Steppe_EMBA	-0.00573	-18.0	378298
WHG	Switzerland_HG	Saudi	-0.01562	-7.7	218758
Abkhasian	CHG	Sardinian	-0.00754	-13.1	387956
Adygei	Anatolia_N	Eskimo	-0.00699	-14.4	413128
Albanian	Europe_EN	Burusho	-0.00650	-16.8	395851
Armenian	Anatolia_N	Sindhi	-0.00603	-19.5	406021
Assyrian	Iran_N	Sardinian	-0.00672	-11.8	309055
Balkar	Anatolia_N	Chukchi	-0.00975	-18.8	401928
Basque	Switzerland_HG	Druze	-0.00726	-12.6	416070
BedouinA	Europe_EN	Yoruba	-0.01584	-42.8	460762
BedouinB	Iran_HotulIIb	Natufian	0.01384	4.1	32266
Belarusian	WHG	Iranian	-0.00974	-19.8	392363
Bulgarian	Anatolia_N	Steppe_EMBA	-0.00807	-26.7	400263
Canary_Islander	Europe_MNChL	Mende	-0.00829	-5.9	353172
Chechen	Anatolia_N	Eskimo	-0.00440	-7.9	396678
Croatian	WHG	Druze	-0.00871	-18.6	394032
Cypriot	Anatolia_N	Sindhi	-0.00562	-16.1	401141
Czech	SHG	Druze	-0.00919	-21.7	374705
Druze	Iran_N	Sardinian	-0.00269	-5.8	343813
English	Steppe_EMBA	Sardinian	-0.00628	-20.6	402502
Estonian	SHG	Druze	-0.00789	-17.6	371575
Finnish	SHG	Assyrian	-0.00716	-12.6	355744
French	Steppe_EMBA	Sardinian	-0.00669	-37.9	441807
Georgian	CHG	Sardinian	-0.00782	-13.7	390744
German	WHG	Druze	-0.01103	-22.9	391302
Greek	Europe_EN	Pathan	-0.00600	-30.0	421984
Hungarian	Steppe_EMBA	Sardinian	-0.00644	-31.2	420017
Icelandic	WHG	Abkhasian	-0.00974	-17.0	394625
Iranian	Anatolia_N	Sindhi	-0.00594	-30.9	443011
Irish	Steppe_EMBA	Sardinian	-0.00590	-22.8	416663
Irish_Ulster	SHG	Assyrian	-0.00909	-15.6	350547
Italian_North	Europe_EN	Steppe_EMBA	-0.00627	-26.4	419169
Italian_South	Iberia_BA	Iran_HotulIIb	0.01224	2.6	17678
Jew_Ashkenazi	Anatolia_N	Koryak	-0.00532	-9.4	389012
Jew_Georgian	Iran_N	Sardinian	-0.00306	-4.2	292410
Jew_Iranian	Iran_N	Sardinian	-0.00385	-5.8	302446
Jew_Iraqi	Iran_N	Sardinian	-0.00486	-6.5	287673
Jew_Libyan	Europe_EN	Yoruba	-0.00397	-7.2	415797
Jew_Moroccan	Europe_EN	Yoruba	-0.00649	-10.9	405193
Jew_Tunisian	Anatolia_N	Mende	-0.00276	-4.1	399354
Jew_Turkish	Anatolia_N	Burusho	-0.00571	-16.4	405254
Jew_Yemenite	Natufian	Kalash	-0.00341	-3.8	174052
Jordanian	Europe_EN	Yoruba	-0.01283	-26.7	423649
Kumyk	Anatolia_N	Chukchi	-0.01025	-19.6	396439
Lebanese	Anatolia_N	Yoruba	-0.01022	-19.5	414854
Lebanese_Christian	Anatolia_N	Sindhi	-0.00504	-15.7	404858
Lebanese_Muslim	Anatolia_N	Brahmin_Tiwari	-0.00616	-20.4	415129
Lezgin	Steppe_EMBA	Jew_Yemenite	-0.00481	-13.1	398974
Lithuanian	WHG	Abkhasian	-0.00999	-17.7	386718
Maltese	Anatolia_N	Brahmin_Tiwari	-0.00518	-14.5	404438
Moldovan	WHG	Iranian	-0.00912	-18.4	395230
North_Ossetian	Anatolia_N	Chukchi	-0.00894	-17.2	401729
Norwegian	WHG	Abkhasian	-0.00957	-16.5	393546
Orcadian	SHG	Druze	-0.00662	-15.8	379656
Palestinian	Europe_EN	Yoruba	-0.01129	-31.3	464066
Polish	SHG	Druze	-0.00924	-27.8	394654
Romanian	Europe_EN	Steppe_EMBA	-0.00549	-16.9	397119
Russian	SHG	Turkish	-0.00731	-25.0	398393
Sardinian	Anatolia_N	Switzerland_HG	-0.00587	-9.6	417931
Saudi	Anatolia_N	Dinka	-0.00326	-5.1	404923
Scottish	Steppe_EMBA	Sardinian	-0.00622	-26.6	426660
Shetlandic	WHG	Abkhasian	-0.00868	-14.6	386562
Sicilian	Anatolia_N	Brahmin_Tiwari	-0.00646	-22.2	411481
Sorb	SHG	Palestinian	-0.00787	-16.8	366924
Spanish	Steppe_EMBA	Sardinian	-0.00557	-32.2	447735
Spanish_North	WHG	Armenian	-0.00825	-10.9	356832
Syrian	Europe_EN	Dinka	-0.01002	-17.3	410920
Turkish	Europe_EN	Sindhi	-0.00709	-41.1	448975
Ukrainian	WHG	Abkhasian	-0.01183	-21.4	388282

We show the lowest Z-score of the statistic  $f_3(\text{Test}; \text{Reference}_1, \text{Reference}_2)$  for Test populations with at least 2 individuals and every pair ( $\text{Reference}_1, \text{Reference}_2$ ) of ancient or present-day source populations. Z-scores lower than -3 are highlighted and indicate that the Test population is admixed from sources related to (but not identical to) the reference populations. Z-scores greater than -3 are consistent with the population either being admixed or not.