

1 **Ancient DNA suggests modern wolves trace their origin to a late Pleistocene expansion**
2 **from Beringia**

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1 **ABSTRACT**

2 Grey wolves (*Canis lupus*) are one of the few large terrestrial carnivores that have maintained
3 a wide geographic distribution across the Northern Hemisphere throughout the Pleistocene
4 and Holocene. Recent genetic studies have suggested that, despite this continuous presence,
5 major demographic changes occurred in wolf populations between the late Pleistocene and
6 early Holocene, and that extant wolves trace their ancestry to a single late Pleistocene
7 population. Both the geographic origin of this ancestral population and how it became
8 widespread remain unknown. Here, we used a spatially and temporally explicit modelling
9 framework to analyse a dataset of 90 modern and 45 ancient mitochondrial wolf genomes
10 from across the Northern Hemisphere, spanning the last 50,000 years. Our results suggest that
11 contemporary wolf populations trace their ancestry to an expansion from Beringia at the end
12 of the Last Glacial Maximum, and that this process was most likely driven by Late
13 Pleistocene ecological fluctuations that occurred across the Northern Hemisphere. This study
14 provides direct ancient genetic evidence that long-range migration has played an important
15 role in the population history of a large carnivore, and provides an insight into how wolves
16 survived the wave of megafaunal extinctions at the end of the last glaciation. Moreover,
17 because late Pleistocene grey wolves were the likely source from which all modern dogs trace
18 their origins, the demographic history described in this study has fundamental implications for
19 understanding the geographical origin of the dog.

20

21 **KEYWORDS**

22 Wolves, Ancient DNA, Pleistocene, Megafauna, Population Turnover, Population structure,
23 ABC, Coalescent modelling

24

1 **1 INTRODUCTION**

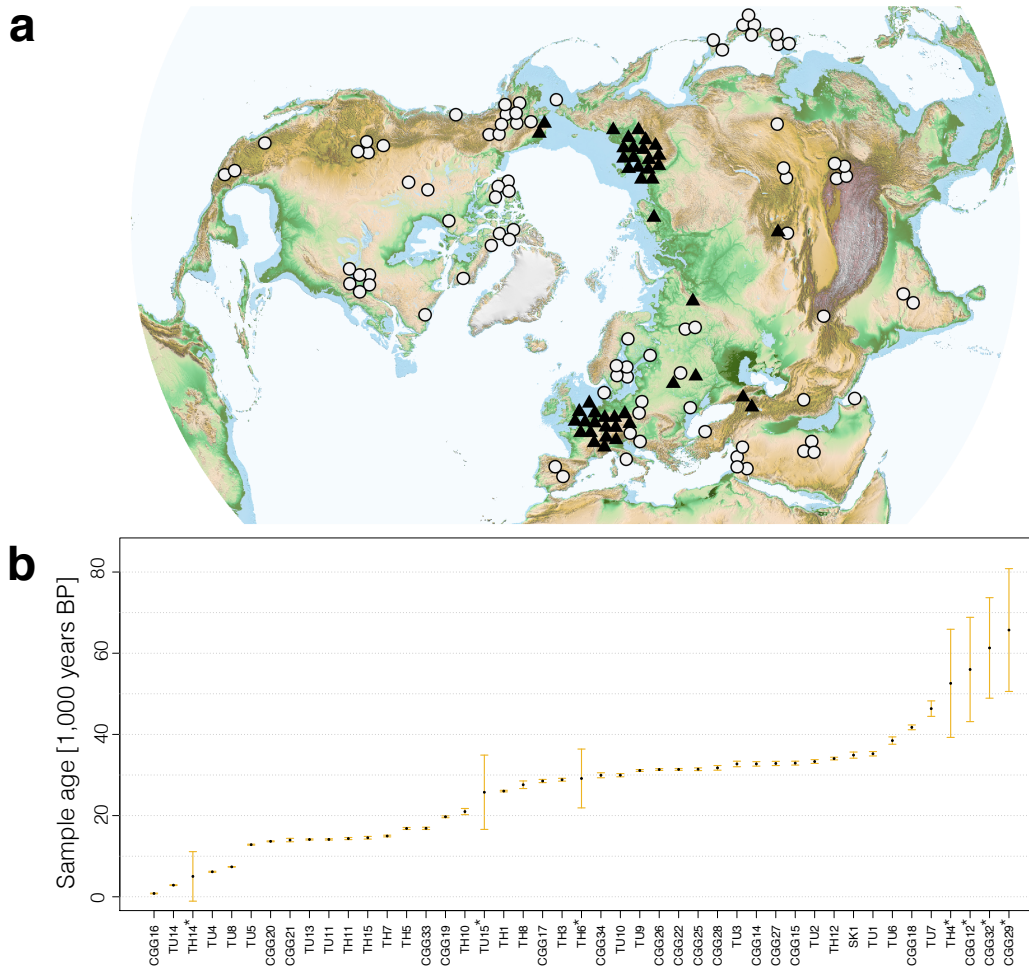
2 The Pleistocene epoch harboured a large diversity of top predators, though most became
3 extinct during, or soon after the Last Glacial Maximum (LGM), approximately 21,000 years
4 ago (Barnosky et al. 2004; Clark et al. 2012). The grey wolf (*Canis lupus*) was one of the few
5 large carnivores that survived and maintained a wide geographical range throughout the
6 period (Puzachenko and Markova 2016), and both the paleontological and archaeological
7 records attest to the continuous presence of grey wolves across the Northern Hemisphere for
8 at least the last 300,000 years (Sotnikova and Rook 2010) (reviewed in Supplementary
9 Information 1). This geographical and temporal continuity across the Northern Hemisphere
10 contrasts with analyses of complete modern genomes which have suggested that all
11 contemporary wolves and dogs descend from a common ancestral population that existed as
12 recently as 20,000 years ago (Freedman et al. 2014; Skoglund et al. 2015; Fan et al. 2016).

13 These analyses point to a bottleneck followed by a rapid radiation from an ancestral
14 population around or just after the LGM. The geographic origin and dynamics of this
15 radiation remain unknown. Resolving these demographic changes is necessary for
16 understanding the ecological circumstances that allowed wolves to survive the late
17 Pleistocene megafaunal extinctions. Furthermore, because dogs were domesticated from late
18 Pleistocene grey wolves (Larson et al. 2012), a detailed insight into wolf demography during
19 this time period would provide an essential context for reconstructing the history of dog
20 domestication.

21 Reconstructing past demographic events solely from modern genomes is challenging since
22 multiple demographic histories can lead to similar genetic patterns in present-day samples
23 (Groucutt et al. 2015). Analyses that incorporate ancient DNA sequences can eliminate some
24 of these alternative histories by quantifying changes in population genetic differences through
25 time. While nuclear markers provide greater power relative to mitochondrial DNA (mtDNA),
26 the latter is more easily retrievable and better preserved in ancient samples due to its higher
27 copy number compared to the nuclear DNA, thus allowing for the generation of datasets with
28 greater geographical and temporal coverage. In particular, analysing samples dated to before,
29 during and after the demographic events of interest greatly increases the power to infer past
30 demographic histories. Furthermore, the nuclear mutation rate in canids is poorly understood,
31 leading to wide date ranges for past demographic events reconstructed from panels of modern
32 whole genomes (e.g. Freedman et al. 2014; Fan et al. 2016). Having directly dated samples
33 from a broad time period allows us to estimate mutation rates with higher accuracy and
34 precision compared to alternative methods (Rambaut 2000; Drummond et al. 2002; Rieux et
35 al. 2014).

1 Demographic processes, such as range expansions and contractions, that involved space as
2 well as time are particularly challenging to reconstruct as they often lead to patterns that are
3 difficult to interpret intuitively (Groucutt et al. 2015). Hypotheses involving spatial processes
4 can be formally tested using population genetic models that explicitly represent the various
5 demographic processes and their effect on genetic variation through time and across space
6 (Eriksson et al. 2012; Eriksson and Manica 2012; Warmuth et al. 2012; Raghavan et al. 2015;
7 Posth et al. 2016). The formal integration of time and space into population genetics
8 frameworks allows for the analysis of sparse datasets, a common challenge when dealing with
9 ancient DNA (Loog et al. 2017).

10 Here, we use a spatially explicit population genetic framework to model a range of different
11 demographic histories of wolves across the Northern Hemisphere that involve combinations
12 of population bottlenecks, turnover and long-range migrations as well as local gene flow. To
13 estimate model parameter and formally test hypotheses of the origin and population dynamics
14 of the expansion of grey wolves during the LGM, we assembled a substantial dataset (Figure
15 1, Table S1), spanning the last 50,000 years and the geographic breadth of the Northern
16 Hemisphere. This dataset consists of 90 modern and 45 ancient wolf whole mitochondrial
17 genomes (38 of which are newly sequenced). In the following, we first present a
18 phylogenetic analysis of our sequences and a calibration of the wolf mitochondrial mutation
19 rates. We then perform formal hypothesis testing using Approximate Bayesian Computation
20 with our spatio-temporally explicit models. We conclude with a discussion of how our
21 findings relate to earlier studies and implications for future research.



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 2 FIGURE 1. Geographic distribution of modern (<500 years old, circles) and ancient (>500
 3 years old, triangles) samples (a) and temporal distribution of ancient samples (b) used in the
 4 analyses. The geographic locations of the samples have been slightly adjusted for clarity (see
 5 Supplementary Table 1 for exact sample locations). * Samples dated by molecular dating.

6

7 2 RESULTS

8 2.1 Population Structure of Grey Wolf across the Northern Hemisphere

9 Motivated by the population structure observed in whole genome studies of modern wolves
 10 (Fan et al. 2016), we tested the degree of spatial genetic structure among the modern wolf
 11 samples in our dataset, and found a strong pattern of genetic isolation by distance across
 12 Eurasia ($\rho=0.3$, $p<0.0001$; see Figure S8). Ignoring this population structure (i.e. modelling
 13 wolves as a single panmictic population) can lead to artefactual results (Mazet et al. 2015;
 14 Mazet et al. 2016). The use of spatially structured models, in which migration is restricted to
 15 adjacent populations, is a common approach for dealing with such situations (Kimura and
 16 Weiss 1964; Wegmann et al. 2010; Eriksson et al. 2012; Eriksson and Manica 2012).

17 To capture the observed geographic structure in our dataset, we split the Northern

1 Hemisphere in seven regions, roughly similar in area (Figure 3a). The boundaries of these
2 regions are defined by geographic features, including mountain ranges, seas, and deserts (see
3 Materials and Methods), which are likely to reduce gene flow (Geffen et al. 2004; Lucchini et
4 al. 2004) and provide an optimal balance between resolution and power given the distribution
5 of samples available for analyses. To quantify how well this scheme represents population
6 structure in modern wolves, we used an AMOVA to separate genetic variance within and
7 between regions. Our regions capture 24.4% of genetic variation among our modern samples
8 (AMOVA, $p < 0.001$). This is substantially greater than the approximately 10% of variance
9 deriving from simple isolation by distance, and supports the hypothesis that the geographic
10 features (major rivers, deserts and mountain chains) define population structure in
11 contemporary wolves across the Northern Hemisphere and therefore constitute obstacles to
12 gene flow (but where the strength of these obstacles may vary).

13 **2.2 Bayesian Phylogenetic Analysis**

14 All ancient sequences included in the study were subjected to stringent quality criteria with
15 respect to coverage and damage patterns. Out of the 45 ancient samples 38 had well resolved
16 direct radiocarbon dates. We joined these ancient sequences with 90 modern mitogenome
17 sequences and used BEAST (Drummond et al. 2012) to estimate a wolf mitochondrial
18 mutation rate. By applying the inferred mutation rate we were able to molecularly date the
19 remaining seven ancient sequences (Materials and Methods). We cross-validated this
20 approach through a leave-one-out analysis (Materials and Methods) using all the directly
21 dated ancient sequences and found a very close fit ($R^2 = 0.86$) between the radiocarbon and
22 the estimated molecular dates and no systematic biases in our molecularly estimated dates
23 (Figure S9), meriting the inclusion of these sequences and the inferred dates into the spatially
24 explicit analyses.

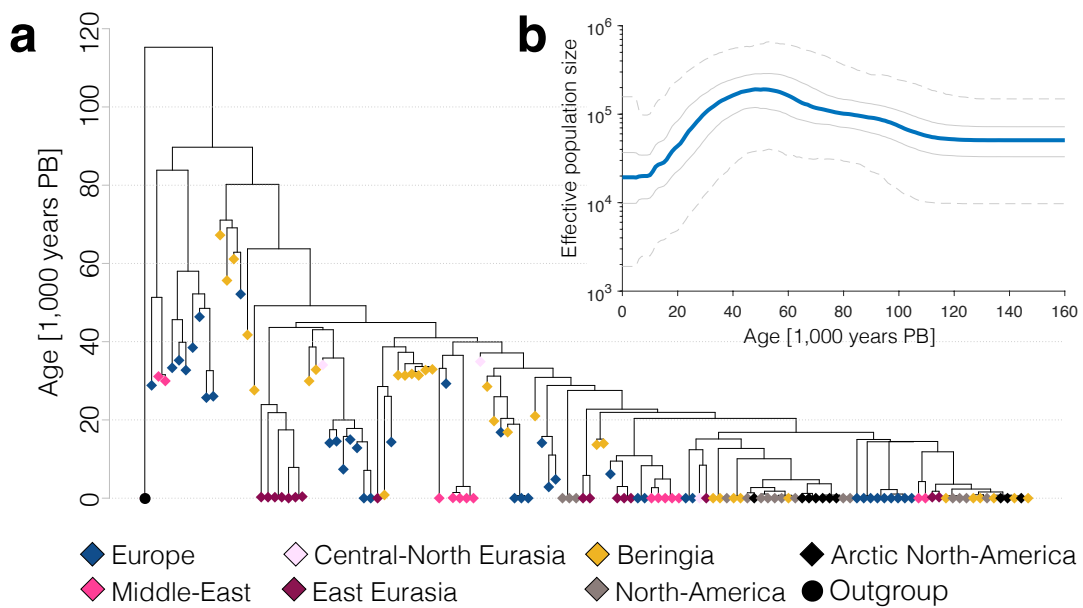
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26 Our Bayesian phylogenetic analysis suggests that the most recent common ancestor (MRCA)
27 of all extant North Eurasian and American wolf mitochondrial sequences dates to ca. 40,000
28 years ago, whereas the MRCA for the combined ancient and modern sequences dates to ca.
29 90,000 years ago (95% HPD interval: 82,000 – 99,000 years ago) (Figure 2a, see Figs. S11
30 and S12 for node support values and credibility intervals). A divergent clade at the root of this
31 tree consists exclusively of ancient samples from Europe and the Middle East that has not
32 contributed to present day mitochondrial diversity in our data (see also Thalmann et al. 2013).

33 The remainder of the tree consists of a monophyletic clade that is made up of ancient and
34 modern samples from across the Northern Hemisphere that shows a pattern of rapid
35 bifurcations of genetic lineages centred on 25,000 years ago. To further quantify this temporal

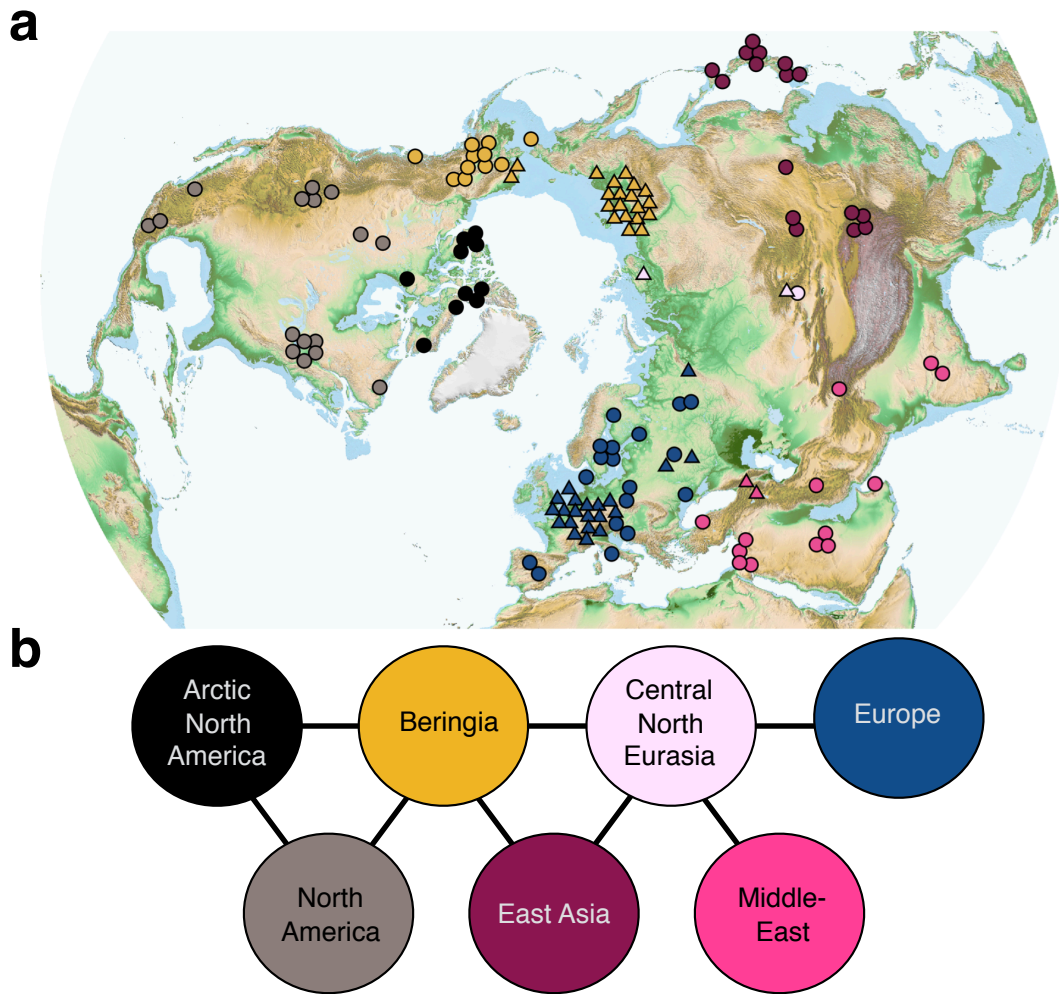
1 pattern, we made use of a Bayesian skyline analysis (Figure 2b) that shows a relatively small
 2 and stable effective genetic population size between ca. 20,000 years ago and the present and
 3 a decrease in effective population size between ca. 40,000 and 20,000 years ago. This pattern
 4 is consistent with the scenario suggested in whole genome studies (e.g. Freedman et al. 2014;
 5 Fan et al. 2016) where wolves had a stable (and likely geographically structured) population
 6 across the Northern Hemisphere up to a time point between 20,000 and 30,000 years ago,
 7 when the population experienced a bottleneck that severely reduced genetic variation
 8 followed by a rapid population expansion.

9 The samples at the root of this clade are predominantly from Beringia, pointing to a possible
 10 expansion out Northeast Eurasia or the Americas. However, given the uneven temporal and
 11 geographic distribution of our samples, and the stochasticity of a single genetic marker
 12 (Nielsen and Beaumont 2009), it is important to explicitly test the extent to which this pattern
 13 can occur by chance under other plausible demographic scenarios.



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FIGURE 2. (a) Tip calibrated BEAST tree of all samples used in the spatial analyses (diamonds), coloured by geographic region. The circle represents an outgroup (modern Indian wolf, not used in the analyses). (b) The effective population size through time from the BEAST analysis (Bayesian skyline plot). Solid blue line represents the median estimate and the grey lines represent the interquartile range (solid lines) and 95% intervals (dashed lines).



1
 2 Figure 3: (a) Sample locations and geographic regions, with boundaries indicated by dashed
 3 lines. The dark blue indicates sea levels shallow enough to be land during the last glacial
 4 maximum (sea depth < 120m). (b) Model network of populations (“demes”), connected by
 5 gene flow, corresponding to the regions in panel a.

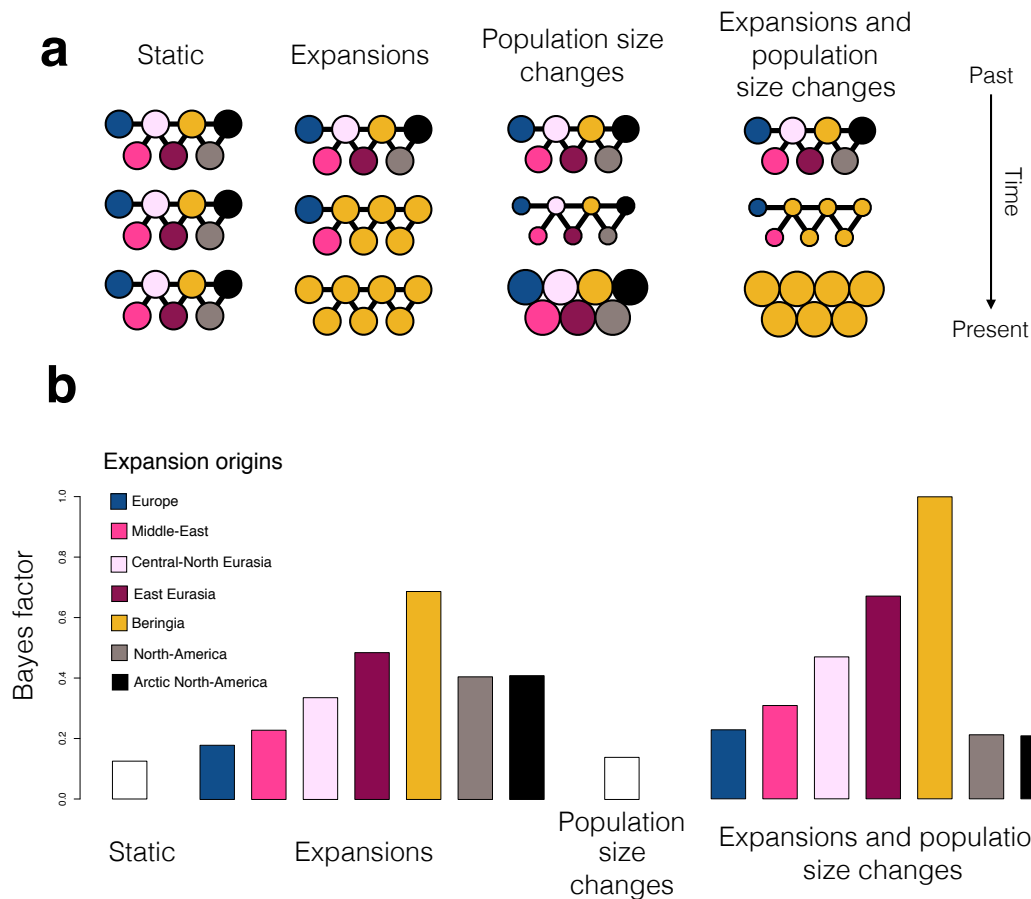
6 2.3 Spatiotemporal Reconstruction of Past Grey Wolf Demography

7 Having established the phylogenetic relationship between our samples and population
 8 structure across the Northern Hemisphere, we tested the ability of different explicit
 9 demographic scenarios to explain the observed phylogenetic pattern, while also taking into
 10 account the geographic location and age of each sample. To this end, we represented each of
 11 the regions in Figure 3a as a population in a network of populations connected by gene flow
 12 (Figure 3b). We used the coalescent population genetic framework to model genetic evolution
 13 in this network, in which each deme constitutes a freely mixing and randomly mating
 14 population. The effective population size of demes, as well as movement of individuals
 15 between demes, are controlled by parameters covering values that represent different
 16 demographic histories.

1 Using this framework we considered a wide range of different explicit demographic scenarios
2 (illustrated in Figure 3a, see Materials and Methods for details of implementation within the
3 coalescent framework). The first scenario consisted of a constant population size and uniform
4 movement between neighbouring demes. This allowed us to test the null hypothesis that drift
5 within a structured population alone can explain all the patterns observed in the mitochondrial
6 tree. We then considered two additional demographic processes that could explain the
7 observed patterns: 1) a temporal sequence of two population size changes that affected all
8 demes simultaneously (thus allowing for a bottleneck); and 2) an expansion out of one of the
9 seven demes. In the expansion scenarios, the deme of origin had a continuous population
10 through time and while in the remaining demes the indigenous populations was sequentially
11 replaced by the expanding population. Scenario 2 was repeated for all seven possible
12 expansion origins, thus allowing us to test continuity as well as replacement hypotheses
13 within each of the seven demes. We considered each demographic event in isolation as well
14 as their combined effect (resulting in a total of 16 scenarios) and used Approximate Bayesian
15 Computation (ABC) to calculate the likelihood of each scenario and estimate parameter
16 values (see Materials and Methods for details).

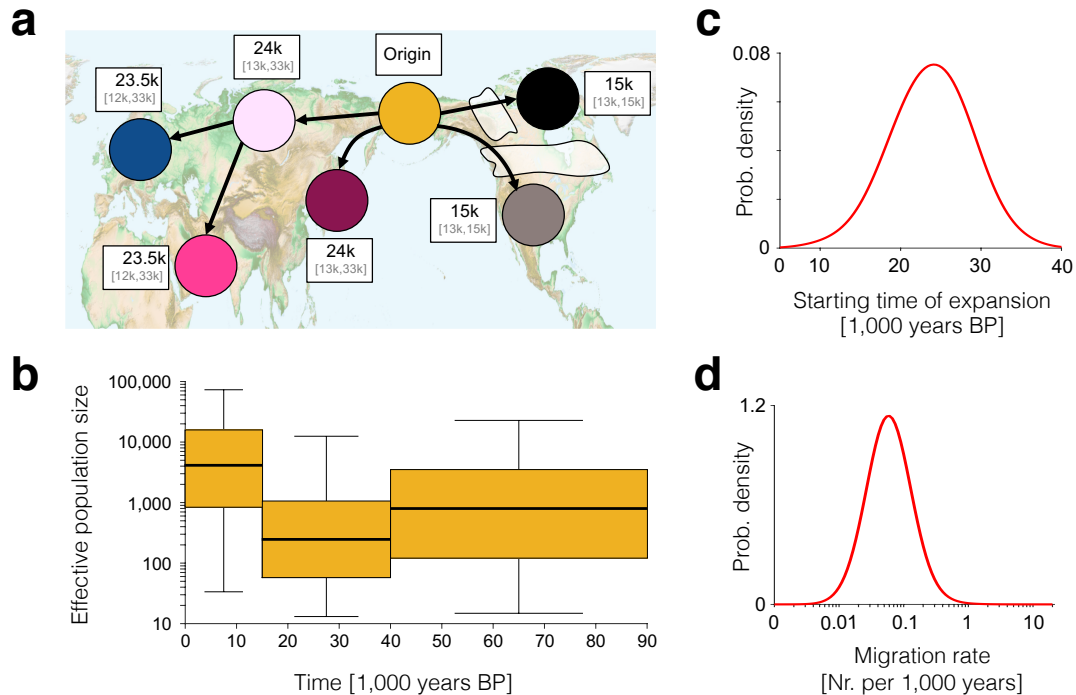
17 Both the null scenario and the scenario of only population size change in all demes were
18 strongly rejected (Bayes Factor (BF) ≤ 0.1 , Figure 4b and Table S6), illustrating the power of
19 combining a large dataset of ancient samples with statistical modelling. Scenarios that
20 combined an expansion and replacement with a change in population size (bottleneck) were
21 better supported than the corresponding scenarios (i.e. with the same expansion origin) with
22 constant population size (Figure 4b).

23 The best-supported scenario (Figure 5) was characterized by the combination of a rapid
24 expansion of wolves out of the Beringian deme approximately 25,000 years ago (95% CI:
25 33,000-14,000 years ago) with a population bottleneck between 15,000 and 40,000 years ago,
26 and limited gene flow between neighbouring demes (see Table S7 and Figure S13 for
27 posterior distributions of all model parameters). We also found relatively strong support for a
28 scenario that describes a wolf expansion out of the East Eurasian deme (BF 0.7) with nearly
29 identical parameters to the best-supported scenario (Table S8 & Figure S14). This can be
30 explained by geographic proximity of East Eurasian and Beringian demes and the genetic
31 similarity of wolves from these areas.



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3 FIGURE 4. Spatially and temporally explicit analysis. (a) Illustration of the different
 4 scenarios, with circles representing one deme each for the seven different geographic regions
 5 (see panel b for colour legend and text for full description of the scenarios). Solid lines
 6 represent population connectivity. The *static* scenario (far left) shows stable populations
 7 through time. The *expansion* scenarios (middle left) shows how one deme (here yellow)
 8 expands and sequentially replaces the populations in all other demes (from top to bottom).
 9 The *population size change scenario* (middle right) illustrates how population size in the
 10 demes can change through time (large or small population size shown as large or small
 11 circles, respectively). We also show a combined scenario (far right) of both expansion and
 12 population size change. (b) Likelihood of each demographic scenario relative to the most
 13 likely scenario, shown as Bayes factors, estimated using Approximate Bayesian Computation
 14 analyses (see text for details). For expansion scenarios (including the combined expansion
 15 and population size changes), we colour code each bar according to the origin of the
 16 expansion (see colour legend).



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2 FIGURE 5. The inferred scenario of wolf demography from the Bayesian analysis using our
 3 spatially and temporally explicit model (see Figure 4 and the main text). (a) Geographic
 4 representation of the expansion scenario (out of Beringia) with median and 95% CI for the
 5 date of the population replacement in each deme given in white boxes next to each deme. (b)
 6 Effective population size (thick line, boxes and whiskers show the median, interquartile range
 7 and 95% CI, respectively, for each time period). (c) Posterior distribution of migration rate
 8 and (d) starting time of expansion.

9

10 3 DISCUSSION

11 *Geographic origin of the ancestral wolf population*

12 Recent whole-genome studies (Freedman et al. 2014; Skoglund et al. 2015; Fan et al. 2016)
 13 found that modern grey wolves (*Canis lupus*) across Eurasia are descended from a single
 14 source population. The results of our analyses combining both ancient and modern grey wolf
 15 samples (Figure 1) with a spatially and temporally explicit modelling framework (Figure 4),
 16 suggest that this process began approximately 25,000 (95% CI:33,000-14,000) years ago
 17 when a population of wolves from Beringia (or a Northeast Asian region in close geographic
 18 proximity) expanded outwards and replaced indigenous Pleistocene wolf populations across
 19 Eurasia (Figure 5). This scenario also provides a mechanism explaining the star-like like
 20 topology of modern wolves observed in the whole genome studies (Freedman et al. 2014;
 21 Skoglund et al. 2015; Fan et al. 2016): the expansion was split up by geographic barriers that
 22 restricted subsequent gene flow between different branches of the expanding population

1 which in turn led to the divergence between different sub-populations observed in
2 contemporary Grey wolves.

3 In the Americas, the Beringian expansion was delayed due to the presence of ice sheets
4 extending from Greenland to the northern Pacific Ocean (Figure 5) (Raghavan et al. 2015). A
5 study by Koblmüller et al. (2016) suggested that wolf populations that were extant south of
6 these ice sheets were replaced by Eurasian wolves crossing the Beringian land bridge. Our
7 data and analyses support the replacement of North American wolves (following the retreat of
8 the ice sheets around 16,000 years ago), and our more extensive ancient DNA sampling,
9 combined with spatially explicit modelling, has allowed us to narrow down the geographic
10 origin of this expansion to an area between the Lena River in Russia and the Mackenzie River
11 in Canada also known as Beringia (Hopkins et al. 1982). However, due to lack of Pleistocene
12 wolf samples that pre-date the retreat of the ice sheets in the area, we are currently not able to
13 resolve the detailed history of North American wolves. For example, we cannot reject an
14 alternative scenario where contemporary North American wolves are descendants of a
15 Pleistocene wolf population that was genetically highly similar to the Beringian population
16 but existed south of the ice sheets.

17 Thus, despite a continuous fossil record through the late Pleistocene, wolves experienced a
18 complex demographic history involving population bottlenecks and replacements (Figure 5).
19 Our analysis suggests that long-range migration played an important role in the survival of
20 wolves through the wave of megafaunal extinctions at the end of the last glaciation. These
21 results will enable future studies to examine specific local climatic and ecological factors that
22 enabled the Beringian wolf population to survive and expand across the Northern
23 Hemisphere. Furthermore, as the reconstructions in this study are based solely on a maternally
24 inherited genetic marker, our model was thus only able to address a set of simplified
25 demographic scenarios (continuity everywhere, or continuity in one location followed by a
26 replacement expansion from it). Once whole-genome data becomes available, it will likely be
27 possible to detect contributions from potential refugia at the local scale.

28 *Implications for the evolution of grey wolf morphology*

29 Morphological analyses of wolf specimens have noted differences between Late-Pleistocene
30 and Holocene wolves: late Pleistocene specimens have been described as cranio-dentally
31 more robust than the present-day grey wolves, as well as having specialized adaptations for
32 carcass and bone processing (Kuzmina and Sablin 1993; Leonard et al. 2007; Baryshnikov et
33 al. 2009) associated with megafaunal hunting and scavenging (Fox-Dobbs et al. 2008;
34 Germonpré et al. 2017). Early Holocene archaeological record has only yielded a single
35 sample with the Pleistocene wolf morphotype (in Alaska) (Leonard et al. 2007), suggesting

1 that this robust ecomorph had largely disappeared from the Northern Hemisphere by the
2 Pleistocene-Holocene transition. This change in wolf morphology coincides with a shift in
3 wolf isotope composition (Bocherens 2015), and the disappearance of megafaunal herbivores
4 and other large predators such as cave hyenas and cave lions, suggesting a possible change in
5 the ecological niche of wolves.

6 To date, it has been unclear whether the morphological change was the result of population
7 replacement (genetic turnover), a plastic response to a dietary shift, or both. Our results
8 suggest that the Pleistocene-Holocene transition was accompanied by a genetic turnover in
9 most of the Northern Hemisphere wolf populations as most indigenous wolf populations
10 experienced a large-scale replacement resulting in the loss of all native Pleistocene genetic
11 lineages (Figure 5). Similar population dynamics of discontinuity and replacement by
12 conspecifics have been observed in several other large Pleistocene mammals in Europe
13 including cave bears, woolly mammoths (Stuart et al. 2004; Palkopoulou et al. 2013), giant
14 deer (Stuart et al. 2004) and even humans (Fu et al. 2016; Posth et al. 2016).

15 The geographic exception to this pattern of widespread replacement is Beringia, where we
16 infer demographic continuity between late Pleistocene and Holocene wolf populations (Figure
17 5). This finding is at odds with a previous suggestion of genetic turnover in Beringia (Leonard
18 et al. 2007), probably as the result of differences in both the amount of data available and the
19 analytical methodology used. Leonard et al. (2007) used a short (427 bases long) segment of
20 the mitochondrial control region and employed a descriptive phylogeographic approach,
21 whereas our conclusions are based on an expanded dataset both in terms of sequence length,
22 sample number, and geographic and temporal range (Figure 1) and formal hypothesis testing
23 within a Bayesian framework (Figs. 4 and 5).

24 As a consequence, the morphological and dietary shift observed in Beringian wolves between
25 the late Pleistocene and Holocene (Leonard et al. 2007) cannot be explained by a population
26 turnover, but instead requires an alternative explanation such as adaptation or plastic
27 responses to the substantial environmental and ecological changes that took place during this
28 period. Indeed, grey wolves are a highly adaptable species. Studies of modern grey wolves
29 have found that differences in habitat - specifically precipitation, temperature, vegetation, and
30 prey specialization, can strongly affect their cranio-dental morphology (Geffen et al. 2004;
31 Pilot et al. 2006; O'Keefe et al. 2013; Flower and Schreve 2014; Leonard 2015).

32 The specific causal factors for the replacement of indigenous Eurasian wolves during the
33 LGM by their Beringian conspecifics (and American wolves following the disappearance of
34 the Cordilleran and Laurentide ice sheets) are beyond the scope of this study. However, one
35 possible explanation may be related to the relatively stable climate of Beringia compared to

1 the substantial climatic fluctuations that impacted the rest of Eurasia and Northern America
2 during the late Pleistocene (Clark et al. 2012). These fluctuations have been associated with
3 dramatic changes in food webs, leading to the loss of most of the large Pleistocene predators
4 in the region (Lister and Stuart 2008; Hofreiter and Stewart 2009; Lorenzen et al. 2011;
5 Bocherens 2015). In addition, the hunting of large Pleistocene predators by Upper
6 Palaeolithic people (e.g. Münzel and Conard 2004; Germonpré and Hämäläinen 2007; Cueto
7 et al. 2016) may have also negatively impacted large carnivore populations (Fan et al. 2016).
8 An interdisciplinary approach involving morphological, isotopic as well as genetic data is
9 necessary to better understand the relationship between wolf population dynamics and dietary
10 adaptations in the late Pleistocene and early Holocene period.

11 *Implications for the study of wolf domestication*

12 Lastly, the complex demographic history of Eurasian grey wolves reported here (Figure 5)
13 also has significant implications for identifying the geographic origin(s) of wolf
14 domestication and the subsequent spread of dogs. For example, the limited understanding of
15 the underlying wolf population structure may explain why previous studies have produced
16 conflicting geographic and temporal scenarios. Numerous previous studies have focused on
17 the patterns of genetic variation in modern domestic dogs, but have failed to consider
18 potential genetic variation present in late Pleistocene wolf population, thereby implicitly
19 assuming a homogeneous wolf population source. As a result, both the domestication and the
20 subsequent human-mediated movements of dogs were the only processes considered to have
21 affected the observed genetic patterns in dog populations. However, both domestication from
22 and admixture with a structured wolf population will have consequences for patterns of
23 genetic variation within dogs. In light of the complex demographic history of wolves (and the
24 resulting population genetic structure) reconstructed by our analysis, several of the
25 geographic patterns of haplotype distribution observed in previous studies, including
26 differences in levels of diversity found within local dog populations (Wang et al. 2016), and
27 the deep phylogenetic split between Eastern and Western Eurasian dogs (Frantz et al. 2016),
28 could have resulted from known admixture between domestic dogs and grey wolves (Verardi
29 et al. 2006; Godinho et al. 2011; Freedman et al. 2014; Fan et al. 2016). Future analyses
30 should therefore explicitly include the demographic history of wolves and demonstrate that
31 the patterns of variation observed within dogs fall outside expectations that take admixture
32 with geographically structured wolf populations into account.

33

34 **4 MATERIALS AND METHODS**

35 **4.1 Data preparation**

1 We sequenced whole mitochondrial genomes of 40 ancient wolf samples. Sample
2 information, including geographic locations, estimated ages and archaeological context
3 information for the ancient samples, is provided in the Table S1 and Supplementary
4 Information (SI) 1.2. Of the 40 ancient samples, 24 were directly radiocarbon dated for this
5 study and calibrated using the IntCal13 calibration curve (see Table S1 for radiocarbon dates,
6 calibrated age ranges and AMS laboratory reference numbers). DNA extraction, sequencing
7 and quality filtering, and mapping protocols used are described in SI 2.

8 We included 16 previously published ancient mitochondrial wolf genomes (Table S1 and SI
9 2). In order to achieve a uniform dataset, we re-processed the raw reads from previously
10 published samples using the same bioinformatics pipeline as for the newly generated
11 sequences.

12 We subjected the aligned ancient sequences to strict quality criteria in terms of damage
13 patterns and missing data (Figs. S3 – S5). First, we excluded all whole mitochondrial
14 sequences that had more than 1/3 of the whole mitochondrial genome missing (excluding the
15 mitochondrial control region – see below) at minimum three-fold coverage. Secondly, we
16 excluded all ancient whole mitochondrial sequences that contained more than 0.1% of
17 singletons showing signs of deamination damage typical for ancient DNA (C to T or A to G
18 singletons). After quality filtering, we were left with 32 newly sequenced and 13 published
19 ancient whole mitochondrial sequences (Table S1).

20 We also excluded sequences from archaeological specimens that postdate the end of
21 Pleistocene and that have been identified as dogs (Table S1), since any significant population
22 structure resulting from a lack of gene flow between dogs and wolves could violate the
23 assumption of a single, randomly mating canid population. Some of the Pleistocene
24 specimens used in the demographic analyses (TH5, TH12, TH14) have been argued to show
25 features commonly found in modern dogs and have therefore been suggested to represent
26 Paleolithic dogs (e.g. Sablin and Khlopachev 2002; Germonpré et al. 2009; Germonpré et al.
27 2012; Druzhkova et al. 2013; Germonpré et al. 2015). Here, we disregard such status calls
28 because of the controversy that surrounds them (Crockford and Kuzmin 2012; Morey 2014;
29 Drake et al. 2015; Perri 2016), and because early dogs would have been genetically similar to
30 the local wolf populations from which they derived. This reasoning is supported by the close
31 proximity of these samples to other wolf specimens confidently described as wolves in the
32 phylogenetic tree (see Figure S10).

33 Finally, we sequenced 6 samples from modern wolves and added 66 modern published wolf
34 sequences from NCBI, two sequences from Freedman et al. (2014), 13 sequences from

1 Sinding et al. (2018), and three sequences from Gopalakrishnan et al. (2018) (Table S1). Data
2 from Sinding et al. (2018) and Gopalakrishnan et al. (2018) was newly assembled following
3 the same bioinformatics protocols as were used for newly sequenced modern wolf samples
4 (see S2 in the SI). This resulted in a final dataset of 135 complete wolf mitochondrial genome
5 sequences, of which 45 were ancient and 90 were modern. We used ClustalW alignment tool
6 (version 2.1) (Larkin et al. 2007) to generate a joint alignment of all genomes. In order to
7 avoid the potentially confounding effect of recurrent mutations in the mitochondrial control
8 region (Excoffier and Yang 1999) in pairwise difference calculations, we removed this region
9 from all subsequent analyses. This resulted in an alignment of sequences 15,466 bp in length,
10 of which 1301 sites (8.4%) were variable. The aligned dataset is located in Supplementary
11 File S1.

12 **4.2 Phylogenetic analysis**

13 We calculated the number of pairwise differences between all samples (Figure S6) and
14 generated a neighbour-joining tree based on pairwise differences (Figure S7). This tree shows
15 a clade consisting of samples exclusively from the Tibetan region and the Indian sub-
16 continent that are deeply diverged from all ancient and other modern wolf samples (see also
17 Sharma et al. 2004; Aggarwal et al. 2007). A recent study of whole genome data showed a
18 complex history of South Eurasian wolves (Fan et al. 2016) that is beyond the scope of our
19 study. While their neighbour-joining phylogeny grouped South Eurasian wolves with East
20 and North East Asian wolves (Figure 3 in (Fan et al. 2016), they cluster outside of all other
21 grey wolves in a Principal Component Analysis (Figure 4 in (Fan et al. 2016), and also show
22 a separate demographic history within a PSMC analysis (Figure 5 in (Fan et al. 2016).
23 Because our study did not possess sufficient samples from the Himalayas and the Indian
24 subcontinent to unravel their complex demography, we excluded samples from these regions
25 and focused on the history of North Eurasian and North American wolves, for which we have
26 good coverage through time and space.

27 We used PartitionFinder (Lanfear et al. 2012) and BEAST (v.1.8.0) (Drummond et al. 2012)
28 to build a tip calibrated wolf mitochondrial tree (with a strict global clock, see SI 3.2 for full
29 details) from modern and directly dated ancient samples, and to estimate mutation rates for
30 four different partitions of the wolf mitochondrial genome (see Tables S3 and S4 for results).

31 We used BEAST to molecularly date seven sequences from samples that were not directly
32 radiocarbon dated (TH4, TH6, TH14, TU15) or that had been dated to a period beyond the
33 limit of reliable radiocarbon dating (>48,000 years ago) (CGG12, CGG29, CGG32). We
34 estimated the ages of the samples by performing a BEAST run where the mutation rate was
35 fixed to the mean estimates from the previous BEAST analysis and all other parameter

1 settings were set as described in the SI 3.2. We cross-validated this approach through a leave-
2 one-out analysis where we sequentially removed a directly dated sample and estimated its
3 date as described above. We find a close fit ($R^2=0.86$) between radiocarbon and molecular
4 dates (Figure S9). We combined the seven undated samples with the 110 ancient and modern
5 samples from the previous run and used a uniform prior ranging from 0 to 100,000 years to
6 estimate the ages of the seven undated samples (see Table S5 for results).

7 Finally, in order to estimate the mitochondrial divergence time between the South Eurasian
8 (Tibetan and Indian) and the rest of our wolf samples, we performed an additional BEAST
9 run in which we included all modern and ancient grey wolves ($N = 129$) as well as five
10 Tibetan and one Indian wolf, and used parameters identical to the ones described above. The
11 age of the ancient samples was set as the mean of the calibrated radiocarbon date distribution
12 (for radiocarbon dated samples) or as the mean of the age distribution from the BEAST
13 analyses (for molecularly dated samples).

14 **4.3 Isolation by distance analysis**

15 We performed isolation by distance (IBD) analyses to see the extent to which wolf
16 mitochondrial genetic variation shows population structure. To this end, we regressed the
17 pairwise geographic distances between 84 modern wolf samples (Table S1) against their
18 pairwise genetic (mitochondrial) distances. The geographic distance between all sample pairs
19 was calculated in kilometres as the great circle distance from geographic coordinates, using
20 the Haversine Formula (Sinnott 1984) to account for the curvature of the Earth as follows:

$$21 \quad G_{ij} = 2r \arcsin \left(\sqrt{\sin^2((\varphi_j - \varphi_i)/2)^2 + \cos(\varphi_i) \cos(\varphi_j) \sin^2((\lambda_i - \lambda_j)/2)^2} \right) [1]$$

22 Where G is the distance in kilometres between individuals i and j ; φ_i and φ_j are the latitude
23 coordinates of individuals i and j , respectively; λ_i and λ_j are the longitude coordinates of
24 individuals i and j , respectively; and r is the radius of the earth in kilometres. The pairwise
25 genetic distances were calculated as the proportion of sites that differ between each pair of
26 sequences (excluding the missing bases), using *dist.dna* function in the R package APE
27 (Paradis et al. 2004).

28 **4.4 Geographical deme definitions**

29 We represented the wolf geographic range as seven demes, defined by major geographic
30 barriers through time.

- 31 1. The *European* deme is bordered by open water from the North and the West (the
32 Arctic and the Atlantic oceans, respectively); the Ural Mountains from the East; and

1 the Mediterranean, the Black and the Caspian Sea and the Caucasus mountains from
2 the South.

3 2. The *Middle-Eastern* deme consists of the Arabian Peninsula, Anatolia and
4 Mesopotamia and is bordered by the Black Sea, the Caspian Sea and the Aral Sea in
5 the North; the Indian Ocean in the South; the Tien Shen mountain range, the Tibetan
6 Plateau and the Himalayas from the East; and the Mediterranean Sea in the West.

7 3. The *Central North Eurasian* deme consist of the Siberian Plateau and is bordered by
8 the Arctic Ocean from the North; the Ural Mountains from the West; the Lena River
9 and mountain ranges of North Eastern Siberia (Chersky and Verkhoyansk ranges)
10 from the East; and the Tien Shen mountain range, the Tibetan Plateau and the Gobi
11 Desert from South-East.

12 4. The *East Eurasian deme* is bordered by the Tien Shen mountain range, the Tibetan
13 Plateau and Gobi desert from the West; the Pacific Ocean from the East; and the Lena
14 river and the mountain ranges of North Eastern Siberia (Chersky and Verkhoyansk
15 ranges) from the North.

16 5. The *Beringia* deme spans the Bering Strait, which was a land bridge during large
17 parts of the Late Pleistocene and the Early Holocene. It is bordered to the West by the
18 Lena River and mountain ranges of North Eastern Siberia (Chersky and Verkhoyansk
19 ranges), and to the South and East by the extent of the Cordillerian and Laurentide ice
20 sheets during the Last Glacial Maximum.

21 6. The *Arctic North America* deme consists of an area of the North American continent
22 east of the Rocky Mountains and west of Greenland, that was covered by ice during
23 the last Glaciation and is at present known as the Canadian Arctic Archipelago.

24 7. The *North America* deme consists of an area in the Northern American sub-continent
25 up to and including the area that was covered by the Cordillerian and Laurentide ice
26 sheets during the last glaciation (Raghavan et al., 2015).

27

28 **4.5 Amova analyses**

29 To quantify the extent our geographic demes capture genetic variation in the data we
30 performed an AMOVA analyses (Excoffier et al. 1992) We calculated the pairwise genetic
31 distance between all modern wolf (n = 84, Table S1) sample pairs as described above (Section
32 4.3, Isolation by distance analysis) and partitioned the samples, based on their geographic
33 locations, into 7 populations corresponding the geographical demes, described in Section 4.4,
34 Geographical deme definitions. We used these demes as the level of analyses and performed 1
35 million permutations using the *amova* function in the *R* package *pegas* (v 0.10). We found

1 strong support for our geographical demes ($p < 10^{-6}$) with 24.4% of the variance within the
2 dataset explained by the chosen demes.

3

4 **4.6 Demographic scenarios**

5 We tested a total of 16 demographic scenario combinations, from four different kinds of
6 demographic scenarios (illustrated in Figure 4a in the main text):

7 1) Static model (the null hypothesis) – neighbouring demes exchange migrants, no
8 demographic changes.

9 2) Bottleneck scenarios – demes exchange migrants as in the static model but
10 populations have different size in different time periods. We consider three time
11 periods: 0-15,000 years ago, 15,000-40,000 years ago, and >40,000 years ago.

12 3) Expansion scenarios - demes exchange migrants like in the static model but a single
13 deme (which itself has a continuous population through time) experiences an
14 expansion starting between 5,000 and 40,000 years ago (at a minimum rate of 1,000
15 years per deme, so the whole world could be colonized within 3,000 years or faster).
16 The deme of origin has a continuous population through time while native
17 populations in all other demes experience replacement – allowing us to formally test
18 both the continuity and replacement hypotheses in each of the demes.

19 4) Combinations of scenarios 2 & 3.

20 **4.7 Population genetic coalescent framework**

21 We implemented coalescent population genetic models for the different demographic
22 scenarios to sample gene genealogies.

23 In the static scenario, we simulated local coalescent processes (Kingman 1982) within each
24 deme (scaled to rate $1/K$ per pair of lineages, where K is the mean time to most recent
25 common ancestor in a deme and is thus proportional to the effective population size). In
26 addition, we moved lineages between demes according to a Poisson process with rate m per
27 lineage. To match the geographic and temporal distribution of the data, we represented each
28 sample with a lineage from the corresponding deme and date.

29 The bottleneck scenario was implemented as the static one but with piecewise constant values
30 for K as a function of time. We considered three time periods, each with its own value of K
31 (K_1 , K_2 and K_3), motivated by the archaeological and genetic evidence of wolf population
32 changes described in the main text. The first time period was from present to early Holocene,
33 0-15,000 years ago. The second time period extended from early Holocene to late Pleistocene
34 and covered the last glacial maximum, 15,000-40,000 years ago. Finally, the third time period
35 covered the late Pleistocene and beyond, i.e. 40,000 years ago and older.

1 The population expansion scenarios were based on the static model but with an added
2 population expansion model with founder effects and replacement of local populations (we
3 refer to populations not yet replaced by the expansion as "indigenous"). Starting at time T , the
4 population expanded from the initial deme and replaced its neighbouring populations. The
5 population at the deme of origin was represented as a continuous population through time.
6 After the start of the expansion, the expansion proceeded in fixed steps of ΔT (in time). At
7 each step, colonized populations replaced neighbouring indigenous populations (if an
8 indigenous deme bordered to more than one colonized deme, these demes contributed equally
9 to the colonization of the indigenous deme). In the coalescent framework (that simulates gene
10 genealogies backwards in time) the colonization events corresponds to forced migrations from
11 the indigenous deme to the source deme. If there were more than one source deme, the source
12 of each lineage was chosen randomly with equal probability. Finally, founder effects during
13 the colonization of an indigenous deme were implemented as a local, instantaneous
14 population bottleneck in the deme (after the expansion), with a severity scaled to give a fixed
15 probability x of a coalescent event for each pair of lineages in the deme during the bottleneck
16 (Eriksson and Mehlig 2004). ($x=1$ correspond to a complete loss of genetic diversity in the
17 bottleneck, and $x=0$ corresponds to no reduction in genetic diversity.)

18 Finally, the combined scenario of population expansion and bottlenecks was implemented by
19 making the population size parameter K in the population expansion model time dependent as
20 in the population bottleneck model.

21 **4.8 Approximate Bayesian Computation analysis**

22 We used Approximate Bayesian Computation (ABC) analysis (Beaumont et al. 2002) with
23 ABCtoolbox (Wegmann et al. 2010) to formally test the fit of our different demographic
24 models. This approach allows formal hypothesis testing using likelihood ratios in the cases
25 where the demographic scenarios are too complex for a direct calculation of the likelihoods
26 given the models. We used the most likely tree from BEAST (see SI 3.2 for details) as data,
27 and simulated trees using the coalescent simulations described above.

28 To match the assumption of random mixing within each deme in the population genetic
29 model, we removed closely related sequences if they came from the same geographic location
30 and time period, by randomly retaining one of the closely related sequences to be included in
31 the analysis (Table S1, column "Samples_used_in_Simulation_Analysis").

32 To robustly measure differences between simulated and observed trees we use the matrix of
33 time to most recent common ancestor (TMRCA) for all pairs of samples. This matrix also

1 captures other allele frequency based quantities frequently used as summary statistics with
2 ABC, such as F_{ST} , as they can be calculated from the components of this matrix.

3 In principle the full matrix could be used, but in practice it is necessary to use a small number
4 of summary statistics for ABC to work properly (Wegmann et al. 2010). To this end, we
5 computed the mean TMRCA between pairs of sequences either within or between 1) Europe,
6 2) Middle East, 3) North East Eurasia, Beringia and East Eurasia combined; and 4) Arctic and
7 Continental North America combined. This strategy is based on geographic proximity and
8 genetic similarity in the dataset. We note that this is not the same as modelling the combined
9 demes as a single panmictic deme; structure between the demes is still modelled explicitly,
10 but the summary statistics are averaged over multiple demes.

11 An initial round of fitting the model showed that all scenarios underestimate the deme
12 TMRCA for the Middle East, while the rest of the summary statistics were well captured by
13 the best fitting demographic scenarios. This could be explained by a scenario where the
14 Middle East was less affected by the reduction in population size during the last glacial
15 maximum. However, we currently lack sufficient number of samples from this area to
16 explicitly test a more complex scenario such as this hypothesis. To avoid outliers biasing the
17 likelihood calculations in ABC (Wegmann et al. 2010) we removed this summary statistic,
18 resulting in nine summary statistics in total.

19 For each of the 16 scenarios we performed 1 billion simulations with randomly chosen
20 parameter combinations, chosen from the following parameter intervals for the different
21 scenarios:

- 22 • The static scenario: m in $[0.001,20]$ and K in $[0.01,100]$.
- 23 • The bottleneck scenarios: m in $[0.001,20]$ and K_1, K_2, K_3 in $[0.01,100]$.
- 24 • The expansion scenarios: m in $[0.001,20]$, K in $[0.01,100]$, x in $[0,1]$, T in $[5,40]$ and
25 ΔT in $[0.001,1]$. For expansion out of the North American scenario and the expansion
26 out of the Arctic North American scenario, the glaciation and during the LGM in
27 North American and sea level rise during the de-glaciation mean that T must be in the
28 range $[9,16]$
- 29 • The combined bottleneck and expansion scenarios: m in $[0.001,20]$, K_1, K_2, K_3 in
30 $[0.01,100]$, x in $[0,1]$, T in $[5,40]$ and ΔT in $[0.001,1]$.

31 The parameter m is measured in units of 1/1,000 years, and T , ΔT , K , K_1 , K_2 and K_3 are
32 measured in units of 1,000 years. The parameters x , T and ΔT were sampled according to a
33 uniform distribution over the interval, while all other parameters were sampled from a
34 uniform distribution of their log-transformed values. To identify good parameter

1 combinations for ABC, we first calculated the Euclidian square distances between predicted
2 and observed statistics and restricted analysis to parameter combinations within the lowest
3 tenth distance percentile. We then ran the ABCtoolbox (Wegmann et al. 2010) on the
4 accepted parameter combinations to estimate posterior distributions of the model parameters,
5 and to calculate the likelihood of each scenario as described in the ABCtoolbox manual.

6 See Table S6 for ABC likelihoods and Bayes factors for all demographic scenarios tested. See
7 Tables S7 and S8 for posterior probability estimates and Figs. S13 and S14 for posterior
8 density distributions for estimated parameters (ΔT , T , $\log_{10} K_1$, $\log_{10} K_2$, $\log_{10} K_3$, $\log_{10} m$, x) in
9 the two most likely models (An expansion out of Beringia with a population size change and
10 an expansion out of East Eurasia with a population size change).

11 **4.9. Map plots**

12 The background map used in Figure 1, panel a and Figure 3 panel a, showing climatic regions
13 on land masses, was generated by downloading the file color_etopo1_ice_low.jpg from
14 ETOPO1 (Amante and Eakins 2016) , a one arc-minute global relief model of Earth's surface
15 that integrates land topography and ocean bathymetry, and masking out regions where sea
16 depths are greater than 120m.

17 **ACKNOWLEDGEMENTS**

18 The authors are grateful to Daniel Klingberg Johansson & Kristian Murphy Gregersen from
19 the Natural History Museum of Denmark; Gabriella Hürlimann from the Zurich Zoo; Jane
20 Hopper from the Howlett's & the Port Lympne Wild Animal Parks; Cyrintha Barwise-Joubert
21 & Paul Vercammen from the Breeding Centre for Endangered Arabian Wildlife; Link Olson
22 from the University of Alaska Museum of the North; Joseph Cook & Mariel Campbell from
23 the Museum of Southwestern Biology; Lindsey Carmichael & David Coltman from the
24 University of Alberta; North American Fur Auctions; Department of Environment Nunavut
25 and Environment and Natural Resources Northwest Territories for DNA samples from the
26 modern wolves. The authors are also grateful to the staff at the Danish National High-
27 Throughput Sequencing Centre for technical assistance in the data generation; the Qimmeq
28 project, funded by The Velux Foundations and Aage og Johanne Louis-Hansens Fond, for
29 providing financial support for sequencing ancient Siberian wolf samples; the Rock
30 Foundation (New York, USA) for supporting radiocarbon dating of ancient samples from the
31 Yana site; to Stephan Nylander from the Swedish Museum of Natural History for advice on
32 phylogenetic analyses and Terry Brown from the University of Manchester for comments on
33 this manuscript. L.L., K.D. & G.L. were supported by Natural Environment Research
34 Council, UK (grant numbers NE/K005243/1, NE/K003259/1); LL. was also supported by the
35 European Research Council grant (339941-ADAPT); A.M. & A.E. were supported by the

1 European Research Council Consolidator grant (grant number 647787-LocalAdaptation); L.F.
2 & G.L. were supported by the European Research Council grant (ERC-2013-StG 337574-
3 UNDEAD); T.G was supported by European Research Council Consolidator grant (681396-
4 Extinction Genomics) & Lundbeck Foundation grant (R52-5062); O.T. was supported by the
5 National Science Center, Poland (2015/19/P/NZ7/03971) with funding from EU's Horizon
6 2020 program under the Marie Skłodowska-Curie grant agreement (665778) and Synthesys
7 Project (BETAF 3062); V.P., E.P. & P.N. were supported by the Russian Science Foundation
8 grant (N16-18-10265 RNF); A.P. was supported by the Max Planck Society; M.L-G. was
9 supported by Czech Science Foundation grant (GAČR15-06446S).

10 **AUTHOR CONTRIBUTIONS**

11 L.L., O.T., M.T.P.G., J.K., G.L., A.E. and A.M. designed the research; O.T., M-H.S.S.,
12 V.J.S., K.E.W., M.S.V., I.K.C.L., N.W. and G.S. performed ancient DNA laboratory work
13 with input from J.K., M.T.P.G., H.S., K-H.H., R.S.M. and K-H.H.; M-H.S.S. performed
14 modern DNA laboratory work with input from M.T.P.G; O.T., J.A.S.C. and L.L. performed
15 bioinformatic analyses; L.L., A.E. and A.M. designed the population genetic analyses; L.L.
16 performed phylogenetic analyses; A.E. implemented the spatial analyses framework; L.L. and
17 A.E. performed spatial analyses; M.G., J.B., V.V.P., E.Y.P., P.A.N., S.E.F., J.E-L., A.W.K.,
18 B.G., H.N., H-P.U. and M.L-G. provided samples; V.V.P., M.G., M. L-G., H.B., H.N.,
19 A.W.K., E.Y.P. and P.A.N. provided context for archaeological samples; A.P., M.G., H.B.
20 and K.D. helped setting the results of genetic analyses into an archaeological context; A.M.,
21 M.T.P.G., A.J.H., G.L., J.K., E.W. and K.D. secured funding for the project; L.L., O.T. and
22 A.E. wrote the initial draft of the manuscript with input from A.M.; L.L., O.T. and A.E wrote
23 the manuscript and the supplementary information with input from A.P., M.G., H.B., M-
24 H.S.S., M.T.P.G., K.E.W., A.M., G.L and K.D.; V.J.S., L.F., A.W.K., K-H.H., A.J.H.,
25 R.S.M., H.S., G.S., V.V.P., E.Y.P., P.A.N. and J.E-L. provided comments to the manuscript
26 and/or to the supplementary information.

27 **DATA ACCESSIBILITY STATEMENT**

28

29 The newly assembled mitochondrial genomes are available from GenBank (accession
30 numbers MK936995-MK937053 (ancient) and MN071185-MN071206 (modern)). The raw
31 sequencing reads used for generating novel ancient mitochondrial genomes can be retrieved
32 from the European Nucleotide Archive under the study number: PRJEB32023.” The code for
33 population genetic simulations of all tested scenarios and scripts for preliminary and output
34 analyses are available on GitHub repository <https://github.com/LiisaLoog/pleistocene-wolves>.

35

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