Current Biology

African and Asian leopards are highly differentiated at the genomic level

Highlights

- African and Asian leopards are highly differentiated at the genomic level
- Out-of-Africa dispersal involved a relatively small number of individuals
- Leopards in Africa show higher heterozygosity and less structure than those in Asia
- Aligning genomic data with current subspecies boundaries can be challenging

Authors

Johanna L.A. Paijmans, Axel Barlow, Matthew S. Becker, ..., Jong Bhak, Andrea Manica, Michael Hofreiter

Correspondence

paijmans.jla@gmail.com

In brief

Paijmans et al. present genome data from leopards covering their current and historical distribution. They find striking differentiation between Asian and African leopards, with divergent population histories over the last 500,000 years. The results reveal intricacies of leopard population dynamics that are not fully represented in their taxonomy.



Current Biology

Article

African and Asian leopards are highly differentiated at the genomic level

Johanna L.A. Paijmans,^{1,2,3,26,27,*} Axel Barlow,^{1,4,26} Matthew S. Becker,⁵ James A. Cahill,^{6,7} Joerns Fickel,^{1,8} Daniel W.G. Förster,⁸ Katrin Gries,⁹ Stefanie Hartmann,¹ Rasmus Worsøe Havmøller,^{10,11} Kirstin Henneberger,¹ Christian Kern,¹² Andrew C. Kitchener,^{13,14} Eline D. Lorenzen,¹⁰ Frieder Mayer,¹⁵ Stephen J. OBrien,^{16,17}

(Author list continued on next page)

¹Institute for Biochemistry and Biology, University of Potsdam, Karl-Liebknecht-Str. 24-25, 14476 Potsdam, Germany

²Department of Genetics & Genome Biology, University of Leicester, Leicester LE1 7RH, UK

³Department of Zoology, University of Cambridge, Downing Street, Cambridge CB2 3EJ, UK

⁴School of Science and Technology, Nottingham Trent University, Clifton Lane, Nottingham NG11 8NS, UK

⁵Zambian Carnivore Programme, PO Box 80 Mfuwe, Eastern Province, Zambia

⁶Laboratory of Neurogenetics of Language, Rockefeller University, 1230 York Avenue, New York, NY, 10065, USA

⁷Department of Environmental Engineering Sciences, Engineering School of Sustainable Infrastructure and Environment, University of Florida, Gainesville, FL 32611

⁸Leibniz Institute for Zoo and Wildlife Research, Alfred-Kowalke-Str. 17, 10315 Berlin, Germany

⁹Der Grüne Zoo Wuppertal, Hubertusallee 30, 42117 Wuppertal, Germany

¹⁰GLOBE institute, University of Copenhagen, Oester Voldgade 5-7, 1350, Copenhagen K, Denmark

(Affiliations continued on next page)

SUMMARY

Leopards are the only big cats still widely distributed across the continents of Africa and Asia. They occur in a wide range of habitats and are often found in close proximity to humans. But despite their ubiquity, leopard phylogeography and population history have not yet been studied with genomic tools. Here, we present population-genomic data from 26 modern and historical samples encompassing the vast geographical distribution of this species. We find that Asian leopards are broadly monophyletic with respect to African leopards across almost their entire nuclear genomes. This profound genetic pattern persists despite the animals' high potential mobility, and despite evidence of transfer of African alleles into Middle Eastern and Central Asian leopard populations within the last 100,000 years. Our results further suggest that Asian leopards originated from a single out-of-Africa dispersal event 500–600 thousand years ago and are characterized by higher population structuring, stronger isolation by distance, and lower heterozygosity than African leopards. Taxonomic categories do not take into account the variability in depth of divergence among subspecies. The deep divergence between the African subspecies and Asian populations contrasts with the much shallower divergence among putative Asian subspecies. Reconciling genomic variation and taxonomy is likely to be a growing challenge in the genomics era.

INTRODUCTION

Leopards (*Panthera pardus*) are iconic big cats with the largest current distribution of all species within the genus *Panthera*. They are ecological generalists inhabiting semi-desert, savanna, rainforest, and montane habitats and spanning an altitudinal range from sea level to 5,200 m altitude.^{1,2} Historically, leopards ranged throughout sub-Saharan and north Africa and in Asia, from Turkey eastward to southeast Asia and the Russian Far East. Within the past hundred years, populations in many parts of this distribution have suffered declines and are becoming increasingly fragmented.^{2,3} As a result, several leopard subspecies are now considered critically endangered or extinct.^{1,4,5}

A particular focus of genetic studies of leopards has been their subspecies taxonomy.^{1,2,6–9} Although alternative taxonomies are used,² here we follow the most recent taxonomy proposed by Kitchener et al.⁵ This taxonomy recognizes eight extant subspecies, with African leopards assigned to a single subspecies and the remaining seven subspecies defined for different Asian populations. The validity of these subspecies has been investigated by using a range of molecular markers, including allozymes, microsatellites, and mitochondrial sequences.^{1,2} However, the extent to which genetic patterns inferred from these limited marker sets reflect broad patterns of variation across the nuclear genome as a whole remains unknown. This question is of further applied importance, given that subspecies



Johanna von Seth,^{18,19,20} Mikkel-Holder S. Sinding,¹⁰ Göran Spong,²¹ Olga Uphyrkina,²² Bettina Wachter,⁸

Michael V. Westbury,^{1,10} Love Dalén,^{18,19,20} Jong Bhak,^{23,24,25} Andrea Manica,³ and Michael Hofreiter¹

¹¹Research and Collections, Natural History Museum of Denmark, University of Copenhagen, Universitetsparken 15, 2100 Copenhagen OE, Denmark

¹²Tierpark Berlin-Friedrichsfelde, Am Tierpark 125, 10319 Berlin, Germany

¹³Department of Natural Sciences, National Museums Scotland, Chambers Street, Edinburgh EH1 1JF, UK

¹⁴Institute of Geography, School of Geosciences. Drummond Street, University of Edinburgh EH8 9XP, UK

- ¹⁵Museum für Naturkunde, Leibniz–Institut für Evolutions und Biodiversitätsforschung, Invalidenstraße 43, 10115 Berlin, Germany
- ¹⁶Laboratory of Genomics Diversity, Center for Computer Technologies, ITMO University, 49 Kronverkskiy Pr., St. Petersburg, 197101, Russian Federation

¹⁷Guy Harvey Oceanographic Center, Halmos College of Arts and Sciences, Nova Southeastern University, 8000 North Ocean Drive, Ft Lauderdale, Florida 33004 USA

¹⁸Department of Bioinformatics and Genetics, Swedish Museum of Natural History, Stockholm, Sweden

¹⁹Centre for Palaeogenetics, Svante Arrhenius väg 20C, 10691 Stockholm, Sweden

²⁰Department of Zoology, Stockholm University, SE-10691 Stockholm, Sweden

²¹Wildlife, Fish, and Environmental Studies, Swedish University of Agricultural Sciences, 907 83 UMEA, SWEDEN

²²Federal Scientific Center of the East Asia Terrestrial Biodiversity, 159 Stoletiya Street, Vladivostok, 690022, Russia

²³Korean Genomics Center (KOGIC), Ulsan National Institute of Science and Technology (UNIST), Ulsan, 44919, Republic of Korea
²⁴Clinomics, UNIST, Ulsan, 44919, Republic of Korea

²⁵Personal Genomics Institute, Genome Research Foundation, Cheongju, 28160, Republic of Korea

²⁶These authors contributed equally

²⁷Lead Contact

*Correspondence: paijmans.jla@gmail.com

https://doi.org/10.1016/j.cub.2021.03.084

taxonomy currently provides a basis for leopard conservation planning and implementation. Thus, population-genomic investigations are vital to ensure that conservation efforts effectively safeguard genetic as well as taxonomic diversity in leopards.

A second focus of genetic studies of leopards has been their historical biogeography, which has primarily been inferred by analysis of their mitochondrial DNA.^{2,8,10} In addition to Africa and Asia, leopards were also widespread in Europe during the Pleistocene, but went extinct during the Holocene.^{4,11} The study of mitochondrial genome sequences suggested that both Asia and Europe were colonized during a single out-of-Africa dispersal event some time during the Middle Pleistocene (400-700 Ka [thousands of years ago]^{2,10}). In contrast, previous mitochondrial and paleontological studies have proposed multiple migration waves,^{4,8} and it has been suggested that the geographically isolated Javan leopard P. p. melas might represent a relict population from an earlier out-of-Africa migration event.⁸ However, mitochondrial data provide limited power to differentiate among these dispersal hypotheses, or to determine the extent of post-colonization gene flow between continents, due to the idiosyncratic nature of the evolution of single loci in populations.

In this study, we analyze genome data from 26 leopards, sampled across their current African and Asian distribution and representing almost all extant subspecies, in order to investigate the broad-scale genetic structure of leopards at the genomic level. We dissect the biogeographical history of the leopard in unprecedented detail, enabling us to make inferences about the timing and magnitude of the colonization of Asia. We find evidence for a single out-of-Africa dispersal event, resulting in almost complete genome monophyly of Asian leopards; a pattern that is not reflected in current taxonomy, which applies equal rank to the African and all Asian subspecies. Our results should stimulate the debate on the interplay between taxonomy and conservation in the genomics era.

RESULTS

Intercontinental population structure of the leopard

We generated genome data from 23 leopard specimens, ranging from 3x to 40x genome sequence coverage, comprising 5 modern samples (blood or tissue) and 18 samples from archival collections (bone or preserved skin, henceforth referred to as "historical samples") (Figure 1A; Table 1). Together with 3 previously published individuals,¹² our dataset provides genome-level data from 14 African and 12 Asian leopards, representing 7 out of 8 currently recognized extant subspecies (all except *P. p. nimr*).⁵ Mitochondrial genome relationships among the sampled individuals are consistent with those previously recovered, displaying distinct African and Eurasian clades with 69% and 98% bootstrap support, respectively (Figure S1).^{2,8,10}

We also investigated the population structure of leopards by using a principal components analysis (PCA) of 2.8 million filtered variable positions (Figure 1B). This analysis revealed strong differentiation of African and Asian leopards along principal component 1 (PC1), representing almost 20% of the sampled genomic variation. PC2 is considerably smaller (approximately 5% of the variation) and separates leopards within Asia. Among African leopards, the individual from Morocco is also separated along this axis.

We investigated the extent of admixture among the African and Asian population clusters indicated by the PCA by using the program NGSadmix¹⁴ to assign, for each individual, the genomic fractions descending from two hypothesized ancestral populations (K = 2 as the most likely value of K, further supported by the Δ K method;^{15,16} see STAR Methods). Using this method, the genomes of all African and all but two Asian leopards were assigned to their respective population clusters (Figures 1C and S2). The exceptions were individuals from the Palestine region and from Afghanistan, which had estimated admixture fractions of 25% and 10% from the African population, respectively.



Figure 1. Leopard distribution and sample map, global leopard PCA, and admixture

(A) Map depicting all samples included in this study, numbers correspond to Table 1. Approximate species distribution is overlaid for reference (adapted from Miththapala et al.¹ and Uphyrkina et al.²). For this and all further figures, blue and red represent African (n = 14) and Asian (n = 12) samples, respectively. (B) PCA of genetic variation of all leopards based on 2.8 M variable positions. Axis labels include the percentage of variation explained by PC1 and PC2. The inset is a scree plot showing the percentage of variation explained by each PC (PCs displayed in the main figure are shown in black). (C) Admixture test based on genotype likelihood methods, using K = 2. See also Figures S1 and S2.

CellPress

Effect of intercontinental structure and admixture on leopard genomes

To investigate the extent to which population structuring and admixture have shaped broad-scale patterns of genomic variation among African and Asian leopards, we divided their aligned genome sequences (autosomes only) into 2,206 non-overlapping one-megabase windows, calculated the maximum likelihood phylogeny of each, and generated a summarized maximum clade credibility (MCC) tree annotated with clade frequencies indicating the proportion of genome windows that recover each clade in the tree (Figure 2). In >99% of the genome windows, Asian leopards are monophyletic (Figure 2A). In contrast, African leopards are monophyletic for only 36.9% of the genome windows. The percentage of genome windows that support an Asian monophyly reduces when smaller window sizes are used, as expected by incomplete lineage sorting and recombination (99.0%, 95.7%, 89.4%, and 73.8% for 1 Mb, 500 kb, 250 kb, and 100 kb, respectively). However, even for the smallest window size tested (10x smaller, or 100 Kb) almost 74% of windows support the monophyly of Asian leopards, whereas only 14% support African monophyly. At this window size, a notable proportion of trees where Asian leopards are not monophyletic involve a repositioning of either the Palestinian or Afghan leopard, or both, outside an otherwise intact Asian clade (14.8% of total trees). This suggests admixture with Africa indicated by the NGSadmix analysis is

detectable at this smaller window scale, although it does not affect the general pattern of monophyly at the broader 1 Mb scale. Overall, this broad pattern of whole-genome monophyly for Asian leopards is consistent with a single out-of-Africa dispersal event suggested previously by mitochondrial studies, 2,10 although alternative explanations exist (such as a strong post-colonization bottleneck, or allele "surfing" at the expansion front¹⁷). This pattern persists despite gene flow from Africa into Middle Eastern (Palestine region) and Central Asian (Afghanistan) populations.

Current Biology

Dating out-of-Africa dispersal and gene flow

We investigated the timing of leopard dispersal from Africa to Asia by using Pairwise Sequentially Markovian Coalescent (PSMC) analysis of individuals with high sequence coverage (>16x, eight individuals). PSMC estimates population-size changes over time from the distribution of coalescence times of two alleles sampled along sections of the genome. For diverging populations, the point at which their respective PSMC curves bifurcate provides an estimate of the end of panmixia in the ancestral population. PSMC curves for African (Namibia, Tanzania, and Zambia) and Asian (Nepal, China, and Java) individuals start to diverge around 500-600 Ka, suggesting the initial out-of-Africa dispersal occurred around this time (Figure 3A). This date was calculated by using the mutation rate previously used for other big cats¹⁸ and later for the leopard

| able 1. Summarized details of leopard samples included in this study | | | | | | | | | | |
|--|---|--|--|--|--|--|--|--|--|--|
| Nominal subspecies | Nominal subspecies | Coverage | Sample type | Collection | Notes | | | | | |
| P. p. melas | P. p. melas | 17.9 | modern (skin biopsy) | Berlin Tierpark | | | | | | |
| P. p. fusca | P. p. fusca | 40.6 | modern (blood) | Wuppertal Zoo, Germany | | | | | | |
| P. p. pardus | P. p. pardus | 32.0 | modern (spleen) | Leibniz-Institute for Zoo and Wildlife Research, Berlin | Collection year: 2011 | | | | | |
| P. p. delacouri | P. p. delacouri | 6.9 | historical (bone, turbinal) | Museum für Naturkunde Berlin | Collection year: 1962 | | | | | |
| P. p. tulliana ^a | P. p. tulliana ^a | 4.1 | historical (bone, phalange) | Museum für Naturkunde Berlin | | | | | | |
| P. p. tulliana | P. p. tulliana | 9.1 | historical (bone, petrous) | Museum für Naturkunde Berlin | Collection year: 1984 | | | | | |
| P. p. pardus | P. p. pardus | 9.7 | historical (bone) | Natural History Museum of Denmark | Collection year: 1945 | | | | | |
| P. p. pardus | P. p. pardus | 13.0 | historical (bone) | Natural History Museum of Denmark | Collection year: 1960 | | | | | |
| P. p. fusca | P. p. fusca | 11.8 | historical (bone) | Natural History Museum of Denmark | Collection year: 1839 | | | | | |
| P. p. delacouri | P. p. delacouri | 4.3 | historical (bone, petrous) | Museum für Naturkunde Berlin | Collection year: 1908 | | | | | |
| P. p. pardus | P. p. pardus | 6.2 | historical (skin) | National Museums Scotland | Collection year: 1960s | | | | | |
| hiopia P. p. pardus | P. p. pardus | 13.7 | historical (bone, petrous) | Museum für Naturkunde Berlin | | | | | | |
| a) P. p. kotya | P. p. kotya | 11.3 | historical (bone, petrous) | Museum für Naturkunde Berlin | | | | | | |
| sland, <i>P. p. pardus</i> | P. p. pardus | 12.2 | historical (bone, petrous) | Museum für Naturkunde Berlin | | | | | | |
| P. p. orientalis | P. p. orientalis | 13.2 | historical (tooth, cementum) | Swedish Museum of Natural History | | | | | | |
| P. p. pardus | P. p. pardus | 3.6 | historical (bone, petrous) | Museum für Naturkunde Berlin | | | | | | |
| oon <i>P. p. pardus</i> | P. p. pardus | 8.3 | historical (bone, petrous) | Museum für Naturkunde Berlin | Collection year: 1908 | | | | | |
| ea P. p. pardus | P. p. pardus | 6.2 | historical (tooth, cementum) | Swedish Museum of Natural History | Collection year: 1964 | | | | | |
| P. p. pardus | P. p. pardus | 6.9 | historical (tooth, cementum) | Swedish Museum of Natural History | Collection year: 1933 | | | | | |
| frica P. p. pardus | P. p. pardus | 12.1 | historical (tooth, cementum) | Swedish Museum of Natural History | Collection year: 1840 | | | | | |
| P. p. pardus | P. p. pardus | 3.0 | historical (tooth, cementum) | Swedish Museum of Natural History | Collection year: 1911 | | | | | |
| + | niopia a) sland, con a frica | P. p. fuscaP. p. fuscaP. p. delacouriP. p. pardusniopiaP. p. pardusa)P. p. kotyaa)P. p. kotyasland,P. p. pardusP. p. pardusfricaP. p. pardusP. p. pardusp. p. pardusfricaP. p. pardusp. p. pardusfricaP. p. pardus | P. p. fusca 11.8 P. p. delacouri 4.3 P. p. pardus 6.2 niopia P. p. pardus 13.7 a) P. p. kotya 11.3 a) P. p. kotya 11.3 sland, P. p. orientalis 13.2 P. p. pardus 3.6 p. p. pardus 3.6 p. p. pardus 6.2 p. p. pardus 6.3 p. p. pardus 3.0 | P. p. fusca11.8historical (bone)P. p. delacouri4.3historical (bone, petrous)P. p. pardus6.2historical (skin)niopiaP. p. pardus13.7historical (bone, petrous)a)P. p. kotya11.3historical (bone, petrous)a)P. p. kotya11.3historical (bone, petrous)sland,P. p. pardus12.2historical (bone, petrous)sland,P. p. orientalis13.2historical (bone, petrous)P. p. pardus3.6historical (bone, petrous)p. p. pardus6.2historical (bone, petrous)p. p. pardus6.2historical (bone, petrous)p. p. pardus8.3historical (bone, petrous)p. p. pardus6.2historical (bone, petrous)p. p. pardus6.2historical (tooth, cementum)fricaP. p. pardus6.9historical (tooth, cementum)fricaP. p. pardus3.0historical (tooth, cementum) | P. p. fusca11.8historical (bone)Natural History Museum of DenmarkP. p. delacouri4.3historical (bone, petrous)Museum für Naturkunde BerlinP. p. pardus6.2historical (skin)National Museums ScotlandniopiaP. p. pardus13.7historical (bone, petrous)Museum für Naturkunde Berlina)P. p. kotya11.3historical (bone, petrous)Museum für Naturkunde Berlina)P. p. kotya11.3historical (bone, petrous)Museum für Naturkunde Berlina)P. p. orientalis13.2historical (tooth, cementum)Swedish Museum of Natural Historya)P. p. pardus8.3historical (bone, petrous)Museum für Naturkunde Berlina)P. p. pardus8.3historical (bone, petrous)Museum für Naturkunde Berlina)P. p. pardus6.2historical (tooth, cementum)Swedish Museum of Natural Historya)P. p. pardus6.9historical (tooth, cementum)Swedish Museum of Natural HistoryfricaP. p. pardus3.0historical (tooth, cementum)Swedish Museum of Natural History | | | | | |

(Continued on next page)

Cell^Press

CellPress

| lable | I. Conunued | | | | | | |
|-------------------------------|--|--|-----------------------------------|------------------------|--|---|-----------------------|
| Map | Sample ID | Locality | Nominal subspecies | Coverage | Sample type | Collection | Notes |
| 22 | PP28 | "Zoo ORI" (Chinese leopard, Henry Doorly Zoo) | P. p. orientalis ^b | 16.6 | modern | SRA Acc Nr SRR5382750 ("P. p. japonensis") | |
| 23 | Amurleopard_PP01 | Amur A | P. p. orientalis | 34.6 | modern | Kim et al. ¹² | |
| 24 | Amurleopard_PPO5 | Amur B | P. p. orientalis | 34.2 | modern | Kim et al. ¹² | |
| 25 | P8506_116_GS | Tanzania, Selous | P. p. pardus | 20.9 | modern | G. Spong | Collection year: 1998 |
| 26 | P8506_117_GS | Zambia B | P. p. pardus | 22.0 | modern | M.S. Becker | |
| See al ^a See te | so Figure S1 and Table ext for taxonomic assign | S1. nment ^{e1} | | | | | |
| ^D Altho | ugh the SRA classificati | on is P. p. japonensis, we assign | this sample to <i>P. p. orien</i> | <i>talis</i> following | l Kitchener et al. ⁵ for taxonomi | c consistency | |

genome.¹² Although this divergence age might be overestimated if the founding population has not been sampled, it is notably consistent with recent estimates based on mitochondrial DNA (485–710 Ka¹⁰ and 471–825 Ka²).

Current Biology

We estimated the timing of the last gene flow event between Africa and Asia by using an extension of the PSMC method (hPSMC¹⁹), which involves PSMC analysis of a hybrid diploid genome generated from the haploidized genomes of an African and an Asian individual. When no more coalescent events occur between these two genomes, the population size inferred by PSMC will approach infinity, and can thus be used to date the end of gene flow, at least at the level of less than 0.1 migrants per generation.¹⁹ Pairwise analysis of African and Asian highcoverage individuals produced estimates that are consistent with simulated data based on cessation of gene flow between 0-100 Ka (Figure 3B). Although the upper limit of this time range might represent an overestimate, because the Middle Eastern and Central Asian individuals were not included in this analysis because of their low sequence coverage, it indicates that African and Asian leopards have exchanged alleles relatively recently within the context of their 500-600 Ka initial divergence.

Intracontinental population structure of African and Asian leopards

The phylogenetic analysis of the 2,206 non-overlapping onemegabase-genome windows also provides information on population structuring within African and Asian leopards. Among African leopards, phylogenetic analysis (Figure 2B) and PCA (Figure 4A) suggest three major groups: the Moroccan leopard, a group containing two West African leopards (from Gabon and Cameroon), and a group containing the remaining African leopards (including a third West African leopard from Equatorial Guinea). It should be noted that the recovered PCs all have similar loadings (Figure 4A, inset), suggesting that the observed structuring along PC1 does not reflect a substantially stronger structuring than subsequent PCs. NGSadmix analysis of only the African samples (most likely value of K is 2) (Figure S3A) equally does not reveal strong structuring, and any tentative groupings would require further testing and additional African sampling. Within Asian leopards, we also find three major groups, comprising central (Nepal, India, and Sri Lanka), western (Palestine region and Afghanistan), and eastern clusters (Java, China, Amur, Korea, Vietnam, and Thailand), with the latter two groups recovered in >50% of phylogenies (Figure 2B). A PCA of Asian leopards further supports these population clusters, which separate along PCs 1 and 2 (Figure 4B). NGSadmix analysis of the Asian samples reveals similar geographical structuring (most likely value of K is 2) (Figure S3B). Overall levels of structuring are lower for African leopards than for Asian leopards, as evidenced by generally lower frequencies of recovery for clades (mean clade frequency of 0.13 and 0.46 for Africa and Asia, respectively) (Figure 2B), and similar loadings for consecutive PCs (Figure 4A, inset).

The position of the Moroccan leopard is difficult to resolve; of the phylogenies that did not return African leopards as monophyletic, a relatively large percentage (31%; or 20% of all phylogenies) place this individual either as sister taxon to all leopards (6.5%), or as sister to all Asian leopards (13.7%) (Figure 2A). This frequency is particularly noteworthy, considering

Current Biology

Article





Figure 2. Whole-genome phylogeny

(A) Frequency of topology classes observed in the maximum likelihood (ML) phylogenies, calculated in 1 Mb non-overlapping sliding windows along the reference genome: the left bar displays the percentage of trees that return African leopards as monophyletic in blue, and the percentage of the trees that return the Moroccan individual as sister lineage either to all leopards, or to Asian leopards. The right barplot shows the percentage of trees that return Asian leopards as monophyletic. Light gray portion of the barplot represents all topologies that occurred with a frequency of less than 3%.

(B) All 2,206 ML phylogenies with the MCC tree overlaid with node values indicating the clade frequency. Scale bar represents the number of substitutions per nucleotide site. The three-letter code indicates the subspecies each individual is assigned to on the basis of geographical origin (following Kitchener et al.⁵): Abbreviations are as follows: PAR, *P. p. pardus*; TUL, *P. p. tulliana*; FUS, *P. p. fusca*; KOT, *P. p. kotiya*; DEL, *P. p. delacouri*; ORI, *P. p. orientalis*; MEL, *P. p. melas*.

that no other topology was represented by more than 3%. The morphological distinctiveness of the north African leopard has led to its assignment to a separate subspecies in the past (Barbary leopard, *P. p. panthera*; Schreber, 1777), although all African subspecies were later subsumed into a single subspecies, *P. p. pardus*.¹

We also examined the extent to which relationships among leopard genomes can be predicted by geographical distance (isolation by distance), by using a linear regression analysis of pairwise genomic and geographical (Euclidean) distances. Although both African and Asian leopards show significant isolation by distance (Mantel test R = 0.42, p = 0.02 and R = 0.71, p = 0.001, respectively), the size of this effect is considerably lower for African leopards than Asian leopards (standard major axis [SMA] regression is 0.24 and 0.36 for African and Asian leopards, respectively) (Figure 4C).

Finally, we compared genetic diversity in terms of average genome-wide heterozygosity. We restricted this analysis to individuals with >10x sequencing coverage. Although we did include historical samples in this analysis, we interpret their precise heterozygosity estimates with a degree of caution because these can be affected by properties inherent to historical sequence data (e.g., error rates and low coverage; see Figure S5). Our analyses showed that African leopards are, on average, more than twice as diverse as Asian leopards (Figure 4D), with an estimated mean heterozygosity in any

individual (Figure S4A). The historical sample from Durban (South Africa) had particularly high heterozygosity, outside the range of the other African leopards (Figure 4D). Further analysis of both modern and historical samples from this region would be beneficial to investigate whether this is a property unique to this genome data recovered from a historical specimen or whether this is inherent to the southern African leopard population. We also found a relatively high heterozygosity of the historical sample from Konde, Pemba Island (an island just north of Zanzibar), which would suggest the population that this individual originates from was not a small, isolated population. Given Pemba Island's proximity to the African mainland (Tanzania), it is conceivable that the island population maintained active gene flow with the mainland populations, although an alternative explanation could be that the sample provenance is incorrect, for example having been traded from the mainland. Asian leopards show a mean heterozygote frequency of 0.0010, which was highest in the historical Indian individual (Figure 4D) and lowest in the animal from the Henry Doorly Zoo and in the Amur leopards, which are from a critically endangered, small population^{6,20,21} (Table 1). The zoo animal and the Amur leopards additionally showed sequential windows of reduced heterozygosity, indicative of inbreeding (Figure S4B). We also found that individuals from small Asian populations (e.g., Java and Amur) do have much lower heterozygosity than those from larger populations (e.g., India and Nepal), which is consistent with previous results.





DISCUSSION

African and Asian leopard genomes are highly distinct

Whole-genome monophyly represents the extreme theoretical endpoint of population divergence. This phenomenon is most likely to occur in allopatric populations with small effective population sizes, deep divergence times, and low migration rates. Leopards, in contrast, have a large and continuous distribution, generalist ecology, and high dispersal potential,^{22,23} and yet we find that the Asian leopard clade in the genome phylogeny is broadly monophyletic across almost all of the nuclear genome. Moreover, this phylogenomic pattern persisted despite evidence of transfer of alleles from Africa.

This pattern is even more striking when comparable analyses from other taxa are considered. At the smaller window size of 100 kb, Asian leopards are monophyletic in 74% of windows. At the same window size, previous studies have found brown bears (*Ursus arctos*) to be monophyletic with respect to their sister species, polar bears (*U. maritimus*), across only 66% of their aligned genomes (polar bears, in contrast, show 99% monophyly).²⁴ Within the genus *Panthera*, analysis of the five currently recognized species indicates that as much as 35% of their aligned genome sequences failed to recover their correct evolutionary relationship.²⁵ Also noteworthy is the Middle Pleistocene

Figure 3. Dating out-of-Africa dispersal and gene flow by using PSMC

Current Biology

(A) PSMC of high-coverage leopard genomes (>16x, n = 8). Plotting was performed by using a generation time of 5 years and a substitution rate of 1.1×10^{-9} per site per year. Ten bootstrap replicates were performed for each individual (gray).

(B) F1 hybrid PSMC to detect the end of geneflow between continents, calculated for high-coverage individuals. Simulated hPSMC with population coalescent times (i.e., the end of admixture) between 0 and 300 Ka are displayed in dotted lines, and the 1.5x and 10x pre-divergence population sizes in horizontal dashed lines.

(500-600 Ka) divergence time of African and Asian leopards indicated by the PSMC analyses. Simulation studies show that reaching reciprocal monophyly is expected to take millions of years for species with large effective population sizes (> 100,000) and moderate generation times (>1 year).²⁶ Therefore, the most plausible scenario is that leopards colonized Asia in a single out-of-Africa dispersal event, involving a small and closely related genetic subset of the African source population and resulting in a strong founder effect. Remarkably, the cohesion of the Asian clade as a whole has been retained for more than half a million years despite the transfer of alleles from Africa. Thus, genetic exchange among Asian leopard populations ap-

pears to be sufficient to counteract the tendency for admixed west Asian populations to be subsumed into the African clade.

The primary genetic division of African and Asian leopards is not reflected by their current subspecies taxonomy. Given this result, taxonomic changes could be justified under the criteria of separately evolving metapopulation lineages,²⁷ as well as some other phylogenetic and genealogical species concepts [reviewed in e.g., De Queiroz²⁷]. However, this proposal contrasts strongly with the criteria used for species recognition in current International Union for Conservation of Nature (IUCN) felid taxonomy.⁵ It is also not directly supported by morphological evidence,^{28,29} and the 500-600 Ka divergence time of African and Asian leopards is considerably more recent than found among all other felid species.^{5,30} Evidence for gene flow also argues against separate species recognition under the biological species concept,³¹ although genetic studies suggest interspecies admixture might have occurred frequently during the evolution of the Felidae.^{25,32} It is therefore challenging to convey the broad scale pattern of genetic distinctiveness between African and Asian leopards within their current subspecies taxonomy because of a lack of intermediate taxonomic categories, given that their hierarchical structure of genetic differentiation is not equally distributed across subspecies and populations.





Evolutionary history of African and Asian leopards

Our results consolidate several previous hypotheses on leopard evolution. The previously proposed African origin for leopards^{2,33} is supported by the lack of whole-genome monophyly and higher genetic diversity of African leopards. Of particular interest in this regard is the Moroccan leopard, which we recovered as sister to either the Asian leopards or to all leopards in a disproportionally large number of phylogenies compared with those of other African leopards. Although an East African origin of leopards is suggested by the fossil record, 33,34 our results could suggest that leopards in northwest Africa served as the source population for the colonization of Asia, and potentially even as the origin for all modern leopards. A similar re-interpretation of the geographical origin from east to northwest Africa has also recently been proposed for hominids.^{35,36} However, more indepth analyses with improved sampling across north Africa and the Arabian Peninsula are needed to further test this hypothesis and place these genomic results into a more complete context.

Our results provide no evidence for multiple dispersal waves or relict Asian populations, given the high consistency of pairwise divergence dates estimated across all tested African and Asian leopard pairs (Figure 3C). Furthermore, the consensus genome phylogeny of Asian leopards reflects a series of nested east-to-west clades, suggesting the colonization of southern Asia in a single expansion event (Figure 2B). The initial

Figure 4. PCA per continent, isolation by distance, and heterozygosity

(A and B) PCA of genetic variation of African (A) (blue) and Asian (B) (red) leopards, based on 2.4 M and 1.2 M variable positions after filtering, respectively. Axis labels include the percentage of variation explained by PC1 and PC2. The insets are scree plots showing the percentage of variation explained by each PC (PCs displayed in the main figure are shown in black).

(C) Correlation between the relative genomic distance (calculated by using the identity-by-state [IBS] matrix), and the geographical distance, calculated for all combinations of African (blue) and Asian (red) samples, using random base sampling and removal of singletons to exclude errors. The significance (calculated by using a Mantel test) and strength (calculated by using MSA) are indicated for Africa and Asia. The shaded area indicates the upper and lower 2.5% jackknife confidence intervals.

(D) Average frequency of heterozygous positions in 1 Mb windows for individuals with genome sequence coverage >10x.

See also Figures S3, S4, and S5.

colonization of Asia by leopards around 500–600 Ka also coincides with an important period of faunal exchange between Africa and Asia, after the last long period of higher aridity in Africa.³⁷ This period also included the initial out-of-Africa dispersal of several species,³⁸ as well as increased pulses of human dispersal.³⁹

One unusual aspect of our results are the admixture proportions of the Middle Eastern and Central Asian individuals estimated by using NGSadmix (up to 25% admixed with the African population) which contrasts with the extremely low frequency (14 out of 2,206, or 0.1%) of 1 Mb sections of the genome where either or both of those individuals share more recent ancestry with an African leopard. Although the latter estimate increases substantially at smaller window sizes (3.6%, 8.5%, and 14.8% for 500 kb, 250 kb, and 100 kb, respectively), it still fails to reach the magnitude of admixture suggested by NGSadmix. In this context, it is noteworthy that NGSadmix is a method based on single-nucleotide polymorphisms (SNPs) through genotype likelihood methods.¹⁴ Therefore, the observed signal of admixture with African leopards must occur in relatively small segments of the genome, suggesting that the introgression of these segments took place relatively long ago and has subsequently been broken up by recombination. An alternative admixture scenario that could explain this discrepancy is admixture with a currently unsampled population that contributed SNPs shared with the African population on a genetic background of common ancestry with the Asian populations. A candidate for such a scenario is the Pleistocene European leopard, which was found to be sister to the Asian leopard clade in the mitochondrial phylogeny¹⁰ (Figure S1). It might have possessed SNPs shared with the African population that were lost in the common ancestor of the



Asian populations, but which were secondarily transferred to populations in the west of Asia through admixture. This could potentially also explain the absence of a signal of admixture in the leopards from Eritrea and Ethiopia (Figure 1C), despite their geographical proximity to Asia. Nuclear data from Pleistocene European leopards would be the best way to robustly test this hypothesis.

Our analyses also reveal substantially different population processes operating within African and Asian leopards. Asian leopards are characterized by high levels of structuring, strong isolation by distance, and overall low heterozygosity, in contrast to African leopards where these patterns are diametrically opposed. The prominent population structure of Asian leopards could also be a relic of the initial dispersal into Asia, given that population expansions can produce population structuring at neutral loci,¹⁷ although such patterns can be erased over time if levels of gene flow are high. Given the dispersal capacity of leopards and the time that has passed since their colonization of Eurasia, factors in addition to their initial population expansion might therefore also have contributed to the observed phylogeographical pattern. In particular, the much stronger structuring in Asia than in Africa might reflect differences in recent habitat loss and fragmentation, which have been much more severe in Asia (83%–87% habitat reduction) than in Africa (48%–67%).³ However, although relatively small, our dataset includes samples ranging from almost 200 years old to freshly collected, which all conform to the general pattern in divergence and heterozygosity we see between Africa and Asia, suggesting that these genetic patterns were present before the most recent encroachments by humans and could thus be considered an intrinsic feature of these populations.

Conclusion

It could be expected that in well-studied groups, such as mammals, taxonomic consensus has been achieved. However, in contrast to this expectation, recent genomic studies have revealed unexpectedly strong population separations and ancient divergences that have led to the proposal of a number of new mammalian species, including red pandas,⁴⁰ golden jackals,⁴ and orangutans.⁴² Our analysis of Asian and African leopards revealed a striking pattern of almost complete genomic monophyly of Asian leopards, contrasting with a relatively recent divergence date of approximately 600 Ka and evidence for limited gene flow between the two continental groups. Thus, genome analysis might reveal subgroups that fulfill the criteria of species under some species concepts, but lack supportive evidence from other aspects of their biology. In microbiology, debate on the interplay between genomics and taxonomy is well underway.^{43,44} Given the continuing reduction in genome-sequencing costs, it seems likely that the field of vertebrate biology will face similar challenges in the near future.

STAR*METHODS

Detailed methods are provided in the online version of this paper and include the following:

- KEY RESOURCES TABLE
- RESOURCE AVAILABILITY



- Lead contact
- Materials availability
- O Data and code availability
- EXPERIMENTAL MODEL AND SUBJECT DETAILS
- METHOD DETAILS
 - Lab procedures
 - Sequence processing
- QUANTIFICATION AND STATISTICAL ANALYSIS
 - O Population structure & admixture
 - Genome-wide phylogeny
 - PSMC & hPSMC
 - Isolation-by-distance and heterozygosity
 - Mitogenome phylogeny

SUPPLEMENTAL INFORMATION

Supplemental information can be found online at https://doi.org/10.1016/j. cub.2021.03.084.

ACKNOWLEDGMENTS

This work was supported by the European Research Council (starting grant GeneFlow #310763 to M.H.). We also acknowledge sequencing support from the Swedish National Genomics Infrastructure (NGI) at the Science for Life Laboratory, which is supported by the Swedish Research Council and the Knut and Alice Wallenberg Foundation, and Uppsala Multidisciplinary Center for Advanced Computational Science (UPPMAX) for access to computational infrastructure. L.D. and J.v.S. were funded by Formas (2015-676). We further acknowledge Clinomics (Republic of Korea) for sequencing funds. We further would like to thank Andreas Wilting for sample contacts and manuscript feedback, André Stadler for sample contribution, Pepijn Kamminga and the Naturalis Biodiversity Center for sample contribution, and Sonja Heinrich for field dissection.

AUTHOR CONTRIBUTIONS

Conceptualization, M.H., A.M., and J.B.; methodology, J.L.A.P.; software, J.L.A.P. and S.H.; formal analysis, J.L.A.P.; investigation, J.L.A.P., R.W.H., K.H., J.v.S., M.-H.S.S., G.S., and L.D.; resources, M.S.B., J.F., D.W.G.F., K.G., R.W.H., C.K., A.C.K., E.L., F.M., G.S., B.W., and LD; discussion, J.F., D.W.G.F., R.W.H., A.C.K., E.L., M.V.W., S.J.O., O.U., J.B., and A.M.; writing – original draft, J.L.A.P. and A.B.; writing – review and editing, all authors have read, edited, and approved the manuscript; visualization, J.L.A.P.; supervision, M.H.; project administration, J.L.A.P.; funding acquisition, M.H., J.F., L.D., and J.B.

DECLARATION OF INTERESTS

The authors declare no competing interests.

Received: September 10, 2020 Revised: February 5, 2021 Accepted: March 24, 2021 Published: April 12, 2021

REFERENCES

- Miththapala, S., Seidensticker, J., and O'Brien, S.J. (1996). Phylogeographic Subspecies Recognition in Leopards (*Panthera pardus*): Molecular Genetic Variation. Conserv. Biol. 10, 1115–1132.
- Uphyrkina, O., Johnson, W.E., Quigley, H., Miquelle, D., Marker, L., Bush, M., and O'Brien, S.J. (2001). Phylogenetics, genome diversity and origin of modern leopard, *Panthera pardus*. Mol. Ecol. 10, 2617–2633.
- Jacobson, A.P., Gerngross, P., Lemeris, J.R., Jr., Schoonover, R.F., Anco, C., Breitenmoser-Würsten, C., Durant, S.M., Farhadinia, M.S., Henschel,

Current Biology

Article

P., Kamler, J.F., et al. (2016). Leopard (*Panthera pardus*) status, distribution, and the research efforts across its range. PeerJ 4, e1974.

- Diedrich, C.G. (2013). Late Pleistocene leopards across Europe northernmost European German population, highest elevated records in the Swiss Alps, complete skeletons in the Bosnia Herzegowina Dinarids and comparison to the Ice Age cave art. Quat. Sci. Rev. 76, 167–193.
- Kitchener, A.C., Breitenmoser-Würsten, C., Eizirik, E., Gentry, A., Werdelin, L., Wilting, A., Yamaguchi, N., Abramov, A.V., Christiansen, P., Driscoll, C., et al. (2017). A revised taxonomy of the Felidae : The final report of the Cat Classification Task Force of the IUCN Cat Specialist Group, Available at. http://repository.si.edu/xmlui/handle/10088/32616.
- Uphyrkina, O., Miquelle, D., Quigley, H., Driscoll, C., and O'Brien, S.J. (2002). Conservation genetics of the Far Eastern leopard (*Panthera pardus orientalis*). J. Hered. *93*, 303–311.
- Dou, H., Feng, L., Xiao, W., and Wang, T. (2016). The complete mitochondrial genome of the North Chinese Leopard (*Panthera pardus japonensis*). Mitochondrial DNA A. DNA Mapp. Seq. Anal. 27, 1167–1168.
- Wilting, A., Patel, R., Pfestorf, H., Kern, C., Sultan, K., Ario, A., Peñaloza, F., Kramer-Schadt, S., Radchuk, V., Foerster, D.W., et al. (2016). Evolutionary history and conservation significance of the Javan leopard *Panthera pardus melas*. J. Zool. (Lond.) 299, 239–250.
- Ebrahimi, A., Farashi, A., and Rashki, A. (2017). Habitat suitability of Persian leopard *Panthera pardus saxicolor* in Iran in future. Environ. Earth Sci. 76, 697.
- Paijmans, J.L.A., Barlow, A., Förster, D.W., Henneberger, K., Meyer, M., Nickel, B., Nagel, D., Worsøe Havmøller, R., Baryshnikov, G.F., Joger, U., et al. (2018). Historical biogeography of the leopard (*Panthera pardus*) and its extinct Eurasian populations. BMC Evol. Biol. 18, 156.
- Sommer, R.S., and Benecke, N. (2006). Late Pleistocene and Holocene development of the felid fauna (Felidae) of Europe: a review. J. Zool. 269, 7–19.
- Kim, S., Cho, Y.S., Kim, H.-M., Chung, O., Kim, H., Jho, S., Seomun, H., Kim, J., Bang, W.Y., Kim, C., et al. (2016). Comparison of carnivore, omnivore, and herbivore mammalian genomes with a new leopard assembly. Genome Biol. *17*, 211.
- Stamatakis, A. (2014). RAxML version 8: a tool for phylogenetic analysis and post-analysis of large phylogenies. Bioinformatics 30, 1312–1313.
- Skotte, L., Korneliussen, T.S., and Albrechtsen, A. (2013). Estimating individual admixture proportions from next generation sequencing data. Genetics 195, 693–702.
- Kopelman, N.M., Mayzel, J., Jakobsson, M., Rosenberg, N.A., and Mayrose, I. (2015). Clumpak: a program for identifying clustering modes and packaging population structure inferences across K. Mol. Ecol. Resour. 15, 1179–1191.
- Evanno, G., Regnaut, S., and Goudet, J. (2005). Detecting the number of clusters of individuals using the software STRUCTURE: a simulation study. Mol. Ecol. 14, 2611–2620.
- Excoffier, L., and Ray, N. (2008). Surfing during population expansions promotes genetic revolutions and structuration. Trends Ecol. Evol. 23, 347–351.
- Cho, Y.S., Hu, L., Hou, H., Lee, H., Xu, J., Kwon, S., Oh, S., Kim, H.-M., Jho, S., Kim, S., et al. (2013). The tiger genome and comparative analysis with lion and snow leopard genomes. Nat. Commun. *4*, 2433.
- Cahill, J.A., Soares, A.E.R., Green, R.E., and Shapiro, B. (2016). Inferring species divergence times using pairwise sequential Markovian coalescent modelling and low-coverage genomic data. Philos. Trans. R. Soc. Lond. B Biol. Sci. 371, 20150138.
- 20. Sugimoto, T., Aramilev, V.V., Kerley, L.L., Nagata, J., Miquelle, D.G., and McCullough, D.R. (2014). Noninvasive genetic analyses for estimating population size and genetic diversity of the remaining Far Eastern leopard (*Panthera pardus orientalis*) population. Conserv. Genet. 15, 521–532.
- Jackson, P., and Nowell, K. (2016). Panthera pardus ssp. orientalis (IUCN Red List of Threatened Species), Available at. https://www.iucnredlist.org/ en.



- 22. Seidensticker, J., and Lumpkin, S. (1991). Great Cats (Emmaus, Pa.: New York: Rodale Pr).
- Fattebert, J., Dickerson, T., Balme, G., Slotow, R., and Hunter, L. (2013). Long-Distance Natal Dispersal in Leopard Reveals Potential for a Three-Country Metapopulation. S. Afr. J. Wildl. Res 43, 61–67.
- 24. Barlow, A., Cahill, J.A., Hartmann, S., Theunert, C., Xenikoudakis, G., Fortes, G.G., Paijmans, J.L.A., Rabeder, G., Frischauf, C., Grandald'Anglade, A., et al. (2018). Partial genomic survival of cave bears in living brown bears. Nat. Ecol. Evol. 2, 1563–1570.
- 25. Figueiró, H.V., Li, G., Trindade, F.J., Assis, J., Pais, F., Fernandes, G., Santos, S.H.D., Hughes, G.M., Komissarov, A., Antunes, A., et al. (2017). Genome-wide signatures of complex introgression and adaptive evolution in the big cats. Sci. Adv. 3, e1700299.
- Hudson, R.R., and Coyne, J.A. (2002). Mathematical consequences of the genealogical species concept. Evolution 56, 1557–1565.
- De Queiroz, K. (2007). Species concepts and species delimitation. Syst. Biol. 56, 879–886.
- 28. Pocock, R.I. (1930). The Panthers and Ounces of Asia. J. Bombay Nat. Hist. Soc. 34, 64–82.
- Meijaard, E. (2004). Biogeographic History of the Javan Leopard Panthera pardus Based on a Craniometric Analysis. J. Mammal. 85, 302–310.
- Johnson, W.E., Eizirik, E., Pecon-Slattery, J., Murphy, W.J., Antunes, A., Teeling, E., and O'Brien, S.J. (2006). The late Miocene radiation of modern Felidae: a genetic assessment. Science *311*, 73–77.
- O'Brien, S.J., and Mayr, E. (1991). Bureaucratic mischief: recognizing endangered species and subspecies. Science 251, 1187–1188.
- Li, G., Davis, B.W., Eizirik, E., and Murphy, W.J. (2016). Phylogenomic evidence for ancient hybridization in the genomes of living cats (Felidae). Genome Res. 26, 1–11.
- Werdelin, L., Yamaguchi, N., Johnson, W.E., and O'Brien, S.J. (2010). Phylogeny and evolution of cats (Felidae). In Biology and conservation of wild felids (Oxford), pp. 59–82.
- Turner, A., and Antón, M. (1997). The Big Cats and Their Fossil Relatives: An Illustrated Guide to Their Evolution and Natural History (Columbia University Press).
- 35. Richter, D., Grün, R., Joannes-Boyau, R., Steele, T.E., Amani, F., Rué, M., Fernandes, P., Raynal, J.-P., Geraads, D., Ben-Ncer, A., et al. (2017). The age of the hominin fossils from Jebel Irhoud, Morocco, and the origins of the Middle Stone Age. Nature 546, 293–296.
- 36. Hublin, J.-J., Ben-Ncer, A., Bailey, S.E., Freidline, S.E., Neubauer, S., Skinner, M.M., Bergmann, I., Le Cabec, A., Benazzi, S., Harvati, K., and Gunz, P. (2017). New fossils from Jebel Irhoud, Morocco and the pan-African origin of *Homo sapiens*. Nature 546, 289–292.
- deMenocal, P.B. (2004). African climate change and faunal evolution during the Pliocene–Pleistocene. Earth Planet. Sci. Lett. 220, 3–24.
- 38. Martínez-Navarro, B. (2010). Early Pleistocene Faunas of Eurasia and Hominin Dispersals. In Out of Africa I: The First Hominin Colonization of Eurasia Vertebrate Paleobiology and Paleoanthropology, J.G. Fleagle, J.J. Shea, F.E. Grine, A.L. Baden, and R.E. Leakey, eds. (Dordrecht: Springer Netherlands), pp. 207–224.
- Abbate, E., and Sagri, M. (2012). Early to Middle Pleistocene Homo dispersals from Africa to Eurasia: Geological, climatic and environmental constraints. Quat. Int. 267, 3–19.
- 40. Hu, Y., Wu, Q., Ma, S., Ma, T., Shan, L., Wang, X., Nie, Y., Ning, Z., Yan, L., Xiu, Y., and Wei, F. (2017). Comparative genomics reveals convergent evolution between the bamboo-eating giant and red pandas. Proc. Natl. Acad. Sci. USA *114*, 1081–1086.
- Koepfli, K.-P., Pollinger, J., Godinho, R., Robinson, J., Lea, A., Hendricks, S., Schweizer, R.M., Thalmann, O., Silva, P., Fan, Z., et al. (2015). Genome-wide Evidence Reveals that African and Eurasian Golden Jackals Are Distinct Species. Curr. Biol. 25, 2158–2165.
- Nater, A., Mattle-Greminger, M.P., Nurcahyo, A., Nowak, M.G., de Manuel, M., Desai, T., Groves, C., Pybus, M., Sonay, T.B., Roos, C.,



et al. (2017). Morphometric, Behavioral, and Genomic Evidence for a New Orangutan Species. Curr. Biol. 27, 3487–3498.e10.

- Hugenholtz, P., Skarshewski, A., and Parks, D.H. (2016). Genome-Based Microbial Taxonomy Coming of Age. Cold Spring Harb. Perspect. Biol. 8, a018085.
- 44. Mahato, N.K., Gupta, V., Singh, P., Kumari, R., Verma, H., Tripathi, C., Rani, P., Sharma, A., Singhvi, N., Sood, U., et al. (2017). Microbial taxonomy in the era of OMICS: application of DNA sequences, computational tools and techniques. Antonie van Leeuwenhoek *110*, 1357–1371.
- Meyer, M., and Kircher, M. (2010). Illumina sequencing library preparation for highly multiplexed target capture and sequencing. Cold Spring Harb. Protoc. 2010, t5448. https://doi.org/10.1101/pdb.prot5448.
- 46. Gansauge, M.-T., and Meyer, M. (2013). Single-stranded DNA library preparation for the sequencing of ancient or damaged DNA. Nat. Protoc. 8, 737–748.
- Jiang, H., Lei, R., Ding, S.-W., and Zhu, S. (2014). Skewer: a fast and accurate adapter trimmer for next-generation sequencing paired-end reads. BMC Bioinformatics 15, 182.
- Magoč, T., and Salzberg, S.L. (2011). FLASH: fast length adjustment of short reads to improve genome assemblies. Bioinformatics 27, 2957– 2963.
- Li, H., and Durbin, R. (2009). Fast and accurate short read alignment with Burrows-Wheeler transform. Bioinformatics 25, 1754–1760.
- Li, H., Handsaker, B., Wysoker, A., Fennell, T., Ruan, J., Homer, N., Marth, G., Abecasis, G., and Durbin, R.; 1000 Genome Project Data Processing Subgroup (2009). The Sequence Alignment/Map format and SAMtools. Bioinformatics 25, 2078–2079.
- Jónsson, H., Ginolhac, A., Schubert, M., Johnson, P.L.F., and Orlando, L. (2013). mapDamage2.0: fast approximate Bayesian estimates of ancient DNA damage parameters. Bioinformatics 29, 1682–1684.
- Korneliussen, T.S., Albrechtsen, A., and Nielsen, R. (2014). ANGSD: Analysis of Next Generation Sequencing Data. BMC Bioinformatics 15, 356.
- R Core Team (2013). R: A language and environment for statistical computing, Available at. http://www.R-project.org/.
- Oksanen, J., Kindt, R., Legendre, P., O'Hara, B., Stevens, M.H.H., Oksanen, M.J., and Suggests, M. (2007). The vegan package. Community ecology package 10, 719.
- Li, H., and Durbin, R. (2011). Inference of human population history from individual whole-genome sequences. Nature 475, 493–496.
- Legendre, P. (2018). Imodel2 package | R Documentation, Available at. https://www.rdocumentation.org/packages/Imodel2/versions/1.7-3.
- 57. Suchard, M.A., Lemey, P., Baele, G., Ayres, D.L., Drummond, A.J., and Rambaut, A. (2018). Bayesian phylogenetic and phylodynamic data integration using BEAST 1.10. Virus Evol. 4, vey016.
- Miller, M.A., Pfeiffer, W., and Schwartz, T. (2011). The CIPRES Science Gateway: A Community Resource for Phylogenetic Analyses. In Proceedings of the 2011 TeraGrid Conference: Extreme Digital Discovery TG '11 (New York, NY, USA: ACM), pp. 41:1–41:8, Available at: http://doi.acm.org/10.1145/2016741.2016785.
- Damgaard, P.B., Margaryan, A., Schroeder, H., Orlando, L., Willerslev, E., and Allentoft, M.E. (2015). Improving access to endogenous DNA in ancient bones and teeth. Sci. Rep. 5, 11184.

- 60. Pinhasi, R., Fernandes, D., Sirak, K., Novak, M., Connell, S., Alpaslan-Roodenberg, S., Gerritsen, F., Moiseyev, V., Gromov, A., Raczky, P., et al. (2015). Optimal Ancient DNA Yields from the Inner Ear Part of the Human Petrous Bone. PLoS ONE *10*, e0129102.
- Kumerloeve, H. (1972). Zum Stand des Vorkommens von Panthera pardus tulliana Valenciennes 1856 in Kleinasien. Mit Hinweisen auf Syrien und andere Nachbargebiete. Zool. Gart. 4–22.
- Dabney, J., Knapp, M., Glocke, I., Gansauge, M.-T., Weihmann, A., Nickel, B., Valdiosera, C., García, N., Pääbo, S., Arsuaga, J.-L., and Meyer, M. (2013). Complete mitochondrial genome sequence of a Middle Pleistocene cave bear reconstructed from ultrashort DNA fragments. Proc. Natl. Acad. Sci. USA *110*, 15758–15763.
- 63. Henneberger, K., Barlow, A., and Paijmans, J.L.A. (2019). Double-Stranded Library Preparation for Ancient and Other Degraded Samples. In Ancient DNA, B. Shapiro, A. Barlow, P.D. Heintzman, M. Hofreiter, J.L.A. Paijmans, and A.E.R. Soares, eds. (New York, NY: Springer New York), pp. 65–73.
- 64. Dabney, J., and Meyer, M. (2012). Length and GC-biases during sequencing library amplification: a comparison of various polymerasebuffer systems with ancient and modern DNA sequencing libraries. Biotechniques 52, 87–94.
- 65. Pontius, J.U., Mullikin, J.C., Smith, D.R., Lindblad-Toh, K., Gnerre, S., Clamp, M., Chang, J., Stephens, R., Neelam, B., Volfovsky, N., et al.; Agencourt Sequencing Team; NISC Comparative Sequencing Program (2007). Initial sequence and comparative analysis of the cat genome. Genome Res. 17, 1675–1689.
- 66. Sheng, G.-L., Basler, N., Ji, X.-P., Paijmans, J.L.A., Alberti, F., Preick, M., Hartmann, S., Westbury, M.V., Yuan, J.-X., Jablonski, N.G., et al. (2019). Paleogenome Reveals Genetic Contribution of Extinct Giant Panda to Extant Populations. Curr. Biol. 29, 1695–1700.e6.
- Günther, T., and Nettelblad, C. (2018). The presence and impact of reference bias on population genomic studies of prehistoric human populations. bioRxiv, 487983.
- Barlow, A., Hartmann, S., Gonzalez, J., Hofreiter, M., and Paijmans, J.L.A. (2020). Consensify: A Method for Generating Pseudohaploid Genome Sequences from Palaeogenomic Datasets with Reduced Error Rates. Genes (Basel) 11, 50.
- **69.** Prado-Martinez, J., Sudmant, P.H., Kidd, J.M., Li, H., Kelley, J.L., Lorente-Galdos, B., Veeramah, K.R., Woerner, A.E., O'Connor, T.D., Santpere, G., et al. (2013). Great ape genetic diversity and population history. Nature 499, 471–475.
- **70.** Hudson, R.R. (2002). Generating samples under a Wright-Fisher neutral model of genetic variation. Bioinformatics *18*, 337–338.
- Hassanin, A., and Veron, G. (2016). The complete mitochondrial genome of the Spotted Linsang, *Prionodon pardicolor*, the first representative from the family Prionodontidae (Mammalia, Carnivora). Mitochondrial DNA A. DNA Mapp. Seq. Anal. 27, 912–913.
- Larkin, M.A., Blackshields, G., Brown, N.P., Chenna, R., McGettigan, P.A., McWilliam, H., Valentin, F., Wallace, I.M., Wilm, A., Lopez, R., et al. (2007). Clustal W and Clustal X version 2.0. Bioinformatics 23, 2947–2948.



STAR***METHODS**

KEY RESOURCES TABLE

| REAGENT or RESOURCE | SOURCE | IDENTIFIER |
|---|-----------------------------------|--|
| Chemicals, Peptides, and Recombinant Proteins | | |
| Guanidine hydrochloride | Roth | Cat#0037.1 |
| Guanidinium thiocyanate | Roth | Cat#0017.1 |
| HMW MagAttract kit | QIAGEN | Cat#67563 |
| ChromiumTM Genome Reagent Kit v1 | 10x Genomics | Cat#CG00022 |
| ChromiumTM Genome Library, Gel Bead & Multiplex Kit | 10x Genomics | Cat#PN-120229 |
| ChromiumTM Genome Chip Kit | 10x Genomics | Cat#PN-120216 |
| Symphony Tissue Extraction kit | QIAGEN | Cat#931236 |
| QIAGEN MinElute kit | QIAGEN | Cat#28004 |
| PipppinPrep Cassette 1.5% agarose, w/ EtBr, external marker, 250 bp -1.5 kb | Sage Science | Cat#CSD1510 |
| Critical Commercial Assays | | |
| D1000 Screen Tape (Tapestation2200) | Agilent | Cat#5067-5582 |
| dsDNA HS Assay Kit (Qubit 2.0) | Thermofisher | Cat#Q32851 |
| Deposited Data | | |
| Unprocessed sequence data, fastq format | This study | ENA: PRJEB43565 |
| Oligonucleotides | | |
| IS7 amplification primer: ACACTCTTTC CCTACACGAC | Meyer and Kircher ⁴⁵ | Sigma Aldrich |
| IS8 amplification primer: GTGACTGGAGT TCAGACGTGT | Meyer and Kircher ⁴⁵ | Sigma Aldrich |
| IS1_adaptor.P5: A*C*A*C*TCTTTCCC TACACGACGCTCTTC CG*A*T*C*T (* indicates a PTO bond) | Meyer and Kircher ⁴⁵ | Sigma Aldrich |
| IS2_adaptor.P7: G*T*G*A*CTGGAGTTCAGACGTGTG CTCTTCCG*A*T*C*T | Meyer and Kircher ⁴⁵ | Sigma Aldrich |
| IS3_adaptor.P5+P7: A*G*A*T*CGGAA*G*A*G*C | Meyer and Kircher ⁴⁵ | Sigma Aldrich |
| P5 indexing primer: AATGATACGGCGACC ACCGAGATCTACACnnnnnnnACACTCTT TCCCTACACGACGCTCTT | Gansauge et al. ⁴⁶ | Sigma Aldrich |
| P7 indexing primer: CAAGCAGAAGACGGC ATACGAGATnnnnnnnGTGACTGGAGTTCA GACGTGT | Gansauge et al. ⁴⁶ | Sigma Aldrich |
| Software and Algorithms | | |
| skewer v0.2.2 | Jiang et al.47 | https://github.com/relipmoc/skewer |
| Flash v1.2.11 38 | Magoč and Salzberg ⁴⁸ | https://ccb.jhu.edu/software/FLASH/ |
| FASTX-Toolkit v0.0.14 | N/A | http://hannonlab.cshl.edu/fastx_toolkit/ |
| BWA v0.7.8 39 | Li and Durbin ⁴⁹ | http://bio-bwa.sourceforge.net/ |
| Samtools v1.3.1 | Li et al. ⁵⁰ | https://sourceforge.net/projects/samtools/ |
| MapDamage v2.0.7 41 | Jónsson et al. ⁵¹ | https://ginolhac.github.io/mapDamage/ |
| ANGSD v0.914 42 | Korneliussen et al. ⁵² | http://www.popgen.dk/angsd |
| RAxML v8.2.12 and v8.2.4 | Stamatakis ¹³ | https://github.com/stamatak/standard-RAxML |
| R version v3.5.2 44 | R Core Team ⁵³ | https://www.r-project.org/ |
| 'vegan' package v2.5-6 (57) | Oksanen et al. ⁵⁴ | https://cran.r-project.org/web/packages/vegan/ index.html |

(Continued on next page)

CellPress

Current Biology Article

| Continued | | |
|---|-------------------------------|--|
| REAGENT or RESOURCE | SOURCE | IDENTIFIER |
| 'Imodel2' R package ⁵⁵ | Legendre ⁵⁶ | https://rdrr.io/cran/Imodel2/man/Imodel2.html |
| Geographic Distance Matrix Generator | N/A | http://biodiversityinformatics.amnh.org/ open_source/gdmg/download.php) |
| MarkReadsByStartEnd.jar | N/A | https://github.com/dariober/Java-cafe/tree/ master/MarkDupsByStartEnd |
| CLUMPAK server | Kopelman et al. ¹⁵ | http://clumpak.tau.ac.il/help.html |
| Geneious v7.0 | N/A | https://www.geneious.com/ |
| NGSadmix | Skotte et al. ¹⁴ | http://www.popgen.dk/software/index.php/ NgsAdmix |
| TreeAnnotator v1.8.2 | Suchard et al.57 | https://beast.community/treeannotator |
| PSMC v0.6.5-r67 | Li and Durbin ⁵⁵ | https://github.com/lh3/psmc |
| hPSMC | Cahill et al. ¹⁹ | https://github.com/jacahill/hPSMC |
| CIPRES Science Gateway | Miller et al. ⁵⁸ | https://www.phylo.org/portal2/login!input.action |
| Other | | |
| Proteinase K | Promega | Cat#V3021 |
| T4 Polynucleotide Kinase (10U/µL) | Thermo Fisher | Cat#EK0032T4 |
| T4 DNA Polymerase (5U/μLl) | Thermo Fisher | Cat#EP0062 |
| T4 DNA Ligase (5U/μLl) | Thermo Fisher | Cat#EL0011 |
| Bst DNA Polymerase, Large Fragment (8 U/μL) | NEB | Cat#M0275S |
| AccuPrime Pfx DNA Polymerase | Thermo Fisher | Cat#12344-024 |
| Herculase II Fusion DNA Polymerase | Thermo Fisher | Cat#600679 |
| SYBR ® Green PCR Master Mix | Thermo Fisher | Cat#4309155 |
| Zymo-Spin V column (Zymo Research) | Zymo | Cat#C1016-50 |
| Covaris S220 microTUBE AFA Fiber Snap-Cap (PN 520045) | Covaris | Cat#PN 520045 |
| PEG-4000 (50% (w/v)) | Thermo Fisher | Cat#EP0061 |
| T4 DNA Ligase Buffer (10x) | Thermo Fisher | Cat#B69 |
| Tango Buffer (10x) | Thermo Fisher | Cat#BY5 |
| ATP (100 mM) | Thermo Fisher | Cat#R0441T4 |
| BSA | Thermo Fisher | Cat#B14 |
| beta-mercaptoethanol | Roth | Cat#4227.3 |
| ThermoPol Reaction Buffer | NEB | Cat#B9004S |

RESOURCE AVAILABILITY

Lead contact

Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact, Johanna L.A. Paijmans (paijmans.jla@gmail.com).

Materials availability

This study did not generate new unique reagents.

Data and code availability

The accession number for the raw, unprocessed raw sequence data (fastq format) reported in this paper is ENA: PRJEB43565.

EXPERIMENTAL MODEL AND SUBJECT DETAILS

Historical samples were collected from collections at the Natural History Museum Berlin, Natural History Museum of Denmark (University of Copenhagen), Swedish Museum of Natural History and the National Museums Scotland. Where possible, the petrous bone or tooth cementum were sampled as these have been shown to be more likely to yield high endogenous DNA.^{59,60} Alternative sampling involved other bones (turbinals or phalanges) or preserved skin. Two zoo animals, "Shinta" from Berlin Tierpark and "Bhagya" from Wuppertal Zoo, both in Germany, were sampled during routine veterinary interventions, either from a skin biopsy or blood.



Bhagya was an individual wild-born in Nepal. Shinta was a captive-born Javan leopard (*P. p. melas*) from a wild-born father and wildborn grandparents on the mother's side, documented in the International studbook for the Javan leopard (WAZA). Three additional samples were collected from carcasses or taken when collaring during the course of field research. All appropriate permits from the respective authorities were in place, and samples were transported with appropriate CITES permits (details available upon request).

Published sequences for two wild Amur leopards¹² were downloaded from ftp://biodisk.org/Distribute/Leopard/Rawdata/ Amurleopard_resequencing1/ and ftp://biodisk.org/Distribute/Leopard/Rawdata/Amurleopard_resequencing2/. Sequence data from a Chinese leopard *P. p. japonensis* (here assigned to *P. p. orientalis*) from the Henry Doorly Zoo, Nebraska (no further provenance information available) was downloaded from the SRA (Acc Nr SRR5382750) using the SRA toolkit v2.8.1 (https://trace.ncbi. nlm.nih.gov/Traces/sra/sra.cgi?view=software).

Samples were assigned to subspecies based on their geographical origin. Due to the overlapping subspecies distributions in the region, assignment of the Palestinian sample ('MFN_MAM_056095') to either *P. p. tullania* or *P. p. nimr* is not straightforward. The original publication of this specimen reports the length of the specimen (skin) to be 2.6 m, which is large – especially for a female.⁶¹ Therefore, we assign this sample to *P. p. tullania*, rather than the smaller-bodied *P. p. nimr*. The Chinese leopard ('PP28') from the SRA is assigned here to *P. p. orientalis* rather than *P. p. japonensis*, following⁵ for taxonomic consistency in this manuscript, and is thus indicated as 'Zoo ORI' in Figures and Tables.

METHOD DETAILS

Lab procedures

For historical samples, all pre-PCR steps were performed in dedicated cleanroom facilities. Extraction was performed following a protocol optimized for the retrieval of short DNA fragments.⁶² This procedure in brief: tissue lysis for bone or tooth samples (25-50 mg powdered) was performed in a 1 mL reaction mix containing 0.45 M EDTA and 0.25 mg/mL Proteinase K, and for skin samples in a 1 mL reaction mix containing 5 M guanidinium thiocyanate, 25 mM NaCl, 50 mM Tris-HCl, 20 mM EDTA, 1% Tween-20, 1% beta-mercaptoethanol, incubated overnight at 37°C with rotation. For both tissue types, centrifugation was performed to pellet remaining tissue, and the supernatant combined with a volume of 13 mL of binding buffer (5 M guanidine hydrochloride, 40% isopropanol, 0.05% Tween-20, and 90 mM sodium acetate). Purification was performed using a Zymo-Spin V Column reservoir combined with a QIAGEN MinElute column. Two wash steps were performed using PE Buffer (QIAGEN), followed by a drying spin for 1 min at 13,000 rpm. DNA was eluted twice, each using 12.5 μ L TET buffer (10 mM Tris-HCl, 1 mM EDTA, 0.05% Tween-20), using a 10 min incubation time.

Illumina sequencing libraries were constructed following a double-stranded library preparation protocol for the historical samples.^{10,45,63} The procedure in brief: blunt-end repair of the extracted DNA was performed in 35 µL reactions containing 1x Buffer Tango, 100 μM each dNTP, 1 mM ATP, 0.5 U/μLI T4 Polynucleotide Kinase, 0.1 U/μL T4 Polymerase and 25 μLI template DNA. The reaction was incubated at 25°C for 20 min, followed by an inactivation phase at 72°C for 20 min. Double-stranded adaptors were then ligated in a 60 µL reaction containing 1x T4 DNA Ligase Buffer, 5% (w/v) PEG-4000, 0.125 U/µL T4 DNA Ligase, and 0.5 µM double-stranded adaptor mix. To reduce the potential of adaptor dimers, the 35 µL template (blunt-end adaptor mixture) was mixed with the double-stranded adaptor mix prior to adding the ligase mastermix. The reaction was incubated at 22°C for 30 min. The resulting product was then purified using the QIAGEN MinElute kit using 2x 10 µL elution volume. Adaptor fill-in was performed in a 40 µL reaction containing 1x Thermopol buffer, 250 µM each dNTP, 0.3 U/µL Bst Polymerase Large Fragment and 20 µL template. The reaction was incubated at 37°C for 20 min, followed by an inactivation phase at 80°C for 20 min. To determine the appropriate number of indexing PCR cycles, a quantitative PCR was performed in 10 µL reactions containing 1x SYBR Green gPCR master mix, 0.2 μM each of IS7 and IS8 amplification primers, and 1 μL of a 1:20 dilution of the unamplified library. Temperature profile for the qPCR was as follows: initial denaturation at 94°C for 10 min, followed by 40 cycles (denaturation phase at 94°C for 15 s, annealing phase at 60°C for 30 s and extension phase at 72°C for 60 s). The point of inflection on the qPCR curve was used as the optimal number of cycles for the indexing PCR, corrected for different reaction volumes and template amount in the indexing PCR. Indexing PCR was performed in 80 µL reactions containing 1x AccuPrime Pfx reaction mix, 0.75 µM each of P5 and P7 indexing primers, and 0.1 U/µL AccuPrime Pfx Polymerase. Indexing primers with a 8 bp unique adaptor sequence nested within the P5 and P7 Illumina adaptors were used for each sample (adapted from Gansauge and Meyer⁷²). Temperature profile for the indexing PCR was as follows: initial denaturation at 94°C for 2 min, followed by the selected number of cycles (denaturation phase at 95°C for 15 s, annealing phase at 60°C for 30 s and extension phase at 68°C for 60 s) followed by a final extension phase at 68°C for 3 min. Resulting libraries were purified using the QIAGEN MinElute kit, and quantified on a TapeStation 2200 instrument (Agilent) with D1000 screen tape and reagents, and a Qubit 2.0 instrument (Fisher) with the dsDNA HS Assay kit.

Test sequencing to assess the endogenous content for each sample was performed on the Illumina NextSeq 500 platform. Deep sequencing for selected samples was performed on the HiSeq X at SciLifeLab Stockholm, using a 100bp paired-end strategy.

For most modern samples, DNA was extracted using the HMW MagAttract kit from QIAGEN. DNA was then sheared on a Covaris S220 to an estimated size of 500bp using a Covaris S220 microTUBE (130 μ L volume). Double-stranded library preparation was performed following the same protocol as for the historical samples described above, but with a higher concentration of adaptor mix (2.5 μ M) during adaptor ligation, and a different amplification polymerase (Herculase II polymerase) for the indexing PCR.⁶⁴ Indexing PCR was performed in 80 μ I reactions containing 1x Herculase Buffer, 0.75 μ M each of P5 and P7 indexing primers, 0.1 mg/mL BSA, 0.25 mM each dNTP, and 0.05 U/ μ L Herculase II Fusion DNA polymerase. Temperature profile for the indexing PCR was as follows:



initial denaturation at 94°C for 2 min, followed by the selected number of cycles (denaturation phase at 94°C for 30 s, annealing phase at 60°C for 45 s and extension phase at 72°C for 45 s) followed by a final extension phase at 72°C for 3 min. Size selection of the resulting libraries was then performed on the PippinPrep, selecting for fragments between 400-900 bp using the PippinPrep Cassette 1.5% w/EtBr. For the Javan leopard the libraries were prepared on the 10X Genomics Chromium Controller instrument, using the 'Chromium Genome Reagent Kit v1' in conjunction with the 'Chromium Genome Library, Gel Bead & Multiplex Kit' and the 'Chromium Genome Chip Kit' (https://www.10xgenomics.com/resources/user-guides/ - Manual Part Number: CG00022 Rev C). Samples P8506_116_GS (Tanzania) and P8506_117_GS (Zambia B) were extracted on a QIAGEN robot with the 'Symphony Tissue Extraction kit'. Library preparation and sequencing on the HiSeq 2000 was performed at the National Genomics Infrastructure (NGI).

Sequence processing

Raw sequences were trimmed using Skewer v0.2.2,⁴⁷ with default parameters and a minimum length of 30bp, and merged using Flash v1.2.11,⁴⁸ with a maximum allowed overlap of 150 bp (-M) to account for the short fragment length of historical samples. For the Javan leopard a further 22 bp were trimmed off the start of the reads to remove Chromium 10x adaptor sequences using FASTX-toolkit v0.0.14 (http://hannonlab.cshl.edu/fastx_toolkit/) prior to merging. Trimmed and merged reads were aligned to the domestic cat (*Felis catus*) reference genome (v6.2; RefSeq: GCF_000181335.1),⁶⁵ in order to avoid any potential biases that can arise if there has been uneven admixture between target and reference species, which has been shown to be particularly problematic for ancient or historical datasets.^{66,67} The Burrows-Wheeler Aligner 'mem' algorithm (BWA mem) v0.7.8 and samtools v1.3.1^{49,50} were used for mapping. Supplementary alignments and unmapped reads were removed, using the -F256 and -F4 flag, respectively. Reads with low mapping quality (< Q30) were removed using samtools. Duplicate reads were removed using samtools rmdup. Detailed sequence data recovery statistics for each sample are included in Table S1. For recovery of mitochondrial genomes, reads were mapped to a leopard mitogenome sequence available from GenBank (GenBank: KP202265),³² using the same tools and parameters as described above, except for duplication removal: to avoid over-collapsing of duplicates for high-coverage mitogenomes, duplications were marked and removed taking both mapping coordinates into consideration (MarkDupsByStartEnd.jar: https:// github.com/dariober/Java-cafe/tree/MarkDupsByStartEnd).

QUANTIFICATION AND STATISTICAL ANALYSIS

Population structure & admixture

Population-genomic analyses were performed using the ANGSD tool v0.914,⁵² considering only autosomal chromosomes. First, we assessed the coverage, quality and error estimations using -doErrorEst and -doCounts in ANGSD, using the highest coverage sample as an 'error free' individual ('Bhagya', a zoo leopard wild-born in Nepal, ~40x coverage). For all ANGSD analyses, we applied a maximum global depth filter of the 95th percentile of the global coverage to remove areas with exceptionally high coverage (e.g., duplicate regions). Data with a base quality (-MinQ) and mapping quality (-minMapQ) less than 30 were removed. Due to the high levels of deamination in some of the historical samples (checked using mapDamage v2.0.7⁵¹ using default parameter settings and statistical estimation disabled), transversions were removed in any analyses that included the historical samples (-rmTrans 1). Positions with missing data in at least one individual were also removed. Where possible, singletons were removed by only taking variants into account that occurred in at least two individuals (i.e., minimum SNP frequencies of 2/number of individuals).

To recover population structure, Principal Component Analyses (PCA) were performed from the genotype-likelihood data (major/ minor allele) using single-base sampling, using the previously described ANGSD filters. Eigenvalues were calculated from the resulting covariance matrix in R v3.5.2.⁵³ Admixture proportions were calculated using NGSadmix¹⁴ assuming two ancestral populations as prior (K = 2). This assumption was further tested using a range of values for K, from 2 to 5, and selecting the most likely value based on 10 replicates of each using the Clumpak server¹⁵ and the Δ K method of Evanno et al.¹⁶ (Figure S2). K values above K = 5 were also investigated but not considered further as they produced private groups for individual samples. NGSadmix was also performed for Asian and African samples separately (Figure S3), and the most likely value of K was estimated following the method above, which also yielded K = 2 as most likely value for both sets of samples.

Genome-wide phylogeny

Pseudohaploid consensus sequences were generated for each individual in ANGSD, taking a consensus-base sampling approach (-doFasta 3) and restricting the analysis to the autosomes only. Maximum likelihood trees for each 1 Mb non-overlapping sliding window along the reference genome were then calculated, specifying the domestic cat (*F. catus*) as outgroup. Windows where any individual had > 50% missing data were removed. Sequence data were then converted to a binary format to exclude transition sites and RAxML v8.2.10¹³ was used to calculate the phylogeny using a BINGAMMA substitution model. A maximum clade-credibility tree was generated using TreeAnnotater v1.8.2 as included in the BEAST package v1.8.2.⁵⁷ It should be noted that branch lengths in the resulting trees can be affected by methodological aspects, such as differences in lab protocols, although the topology has been shown to be robust against such artifacts.⁶⁸ Recovery and counting of topology classes was performed using custom Perl scripts. We tested the effect of window size by repeating the analysis also for smaller window sizes (500Kb, 250Kb and 100Kb) for the largest chromosome (~240Mb).



PSMC & hPSMC

For the Pairwise Sequential Markovian Coalescent (PSMC) only high-coverage samples could be considered, resulting in a total of eight individuals for this analysis (three African and five Asian). Heterozygous positions were recovered using samtools, filtering data for low mapping (< 30) or base quality (< 30). Minimum and maximum depths were set at respectively half and double the average coverage of each sample. Only data for the autosomes were considered. PSMC v0.6.5-r67⁵⁵ was used following the same strategy as used previously for the leopard genome,¹² with a mutation rate of 1.1×10^{-9} substitutions/site/year¹⁸ and a generation time of 5 years. For the remaining PSMC parameters, we also used parameter values as for the leopard genome,¹² which followed those used for great apes:⁶⁹ maximum numbers of iterations (-N) 25, maximum 2N₀ coalescent time (-t) 15, initial theta/rho ratio (-r) 5, and parameter pattern (-p) 4+25*2+4+6. Results were plotted in R. Ten bootstrap replicates were performed for each individual, using random re-sampling with replacement.⁵⁵

For hPSMC,¹⁹ a F1 hybrid psmc-fasta sequence was generated for each possible combination of African and Asian individuals. The pre-divergence population size was estimated by taking the lowest recovered population size from the hPSMC output, i.e., approximately 60,000. For estimating the time of the end of gene flow, simulated hPSMC data were generated using ms,⁷⁰ with the time of population divergence ranging from 0 to 300 Ka in 50 Ka intervals. PSMC was then calculated using the parameters as described above. The point at which the simulated data plot overlaps the real data within the range of 1.5–10x population size can be taken as indicative that admixture with > 0.1 individuals per generation was still occurring.¹⁹

Isolation-by-distance and heterozygosity

We tested the correlation between geographical distance and genomic distance within African and Asian leopards. As exact GPS coordinates were not available for these samples, locations were estimated based on the geographical information for each sample, and the distance was measured in kilometres using the Geographic Distance Matrix Generator (http://biodiversityinformatics.amnh. org/open_source/gdmg/download.php). The genomic distance within each group was calculated using random base sampling and singleton removal as described above (section 'Population structure and admixture'). A Mantel test from the 'vegan' package v2.5-6⁵⁴ in R was performed to estimate whether there is a significant relationship between pairwise genomic and Euclidean distances. A Standard Major Axis (SMA) regression analysis from the 'Imodel2' R package⁵⁶ was then used to recover the slope (i.e., the strength of the relationship). The significance of the slope was calculated by performing jackknife replicates, following a leave-one-individual-out strategy, resulting in 14 replicates for the African leopards and 12 for the Asian leopards, and recovering the 2.5 and 97.5 percentiles (Figure 4C).

Heterozygosity was calculated for medium- and high-coverage (> 10x) leopards, to avoid biases from the increased error rates of the low-coverage historical samples, leaving 15 leopards for analyses (8 Asian and 7 African). We confirmed the presence of such biases by subsampling five of our historical samples to 10x, 5x and 2x (Figure S5). Allele frequencies were calculated for each individual in ANGSD, applying mapping and base-quality filters as described above, and using 0.5 and 2x the average sequence coverage as minimum and maximum depth filters. realSFS was then used to calculate the frequency of heterozygous positions in 1 Mb non-overlapping windows.

Mitogenome phylogeny

Mitogenome consensus sequences were generated from the mapped data using Geneious v7.0 (www.geneious.com), using a minimum sequence depth of 3x and a strict 90% majority rule for base calling. The resulting consensus sequences for each sample were combined with 24 additional leopard mitogenome sequences available from GenBank at the time of analysis,^{10,32} as well as other Felidae species, using the spotted linsang (*Prionodon pardicolor*, GenBank: NC_024569)⁷¹ as outgroup, resulting in an alignment of 83 sequences. This alignment contained 24 previously published leopard mitogenomes (Accession numbers GenBank: MH588611 – MH588632, NC_010641, KJ866876), as well as 35 additional felid mitogenomes (Accession numbers GenBank: AY463959, FCU20753, HM589214, JF357967, JF357968, JF357969, JF357970, JF357973, JF357974, KC834784, KF297576, KF776494, KF892541, KF907306, KJ508412, KJ508413, KP202267, NC_005212, NC_008450, NC_010638, NC_010642, NC_014456, NC_014770, NC_016189, NC_016470, NC_018053, NC_022842, NC_024569, NC_028299, NC_028300, NC_028303, NC_028305, NC_028306, NC_028312, NC_028316). The sequences were aligned using ClustalW with default parameters,⁷² as implemented in Geneious. The control region, as well as any columns in the alignment that contained missing data, were removed, resulting in a final alignment of 10,192 bp. A maximum-likelihood tree was calculated, using RAXML-HPC v8.2.4¹³ on the CIPRES black box version, with default substitution model GTRCAT, using rapid bootstrapping and search for the best-scoring ML tree, selecting the spotted linsang as outgroup (*P. p. pardicolor*), on the CIPRES Science Gateway⁵⁸ (Figure S1).

Current Biology, Volume 31

Supplemental Information

African and Asian leopards are highly

differentiated at the genomic level

Johanna L.A. Paijmans, Axel Barlow, Matthew S. Becker, James A. Cahill, Joerns Fickel, Daniel W.G. Förster, Katrin Gries, Stefanie Hartmann, Rasmus Worsøe Havmøller, Kirstin Henneberger, Christian Kern, Andrew C. Kitchener, Eline D. Lorenzen, Frieder Mayer, Stephen J. OBrien, Johanna von Seth, Mikkel-Holder S. Sinding, Göran Spong, Olga Uphyrkina, Bettina Wachter, Michael V. Westbury, Love Dalén, Jong Bhak, Andrea Manica, and Michael Hofreiter



Figure S1: Mitogenome phylogeny. Related to Figure 1 and STAR Methods. Maximum likelihood (RaxML) phylogeny of both the new and previously published mitochondrial genomes, with outgroup taxa removed for visualisation. Branch labels indicate bootstrap support. Bootstrap values less than 70 were removed for clarity. The mitogenomes from samples for which whole genomes were generated in this study are indicated with an asterisk (*) and bold font.



Figure S2: NGSadmix for higher values of K. Related to Figure 1 and STAR Methods.

NGSadmix analysis of admixture including all leopards, using genotype likelihoods, for K values 2-5. K=2 (upper left panel) is also displayed as Fig. 1C, and included here again for comparative purposes. Higher K values were not included, as discrete single individual clusters started to appear. Optimal value of K was found to be K=2 (see STAR Methods).



Figure S3: NGSadmix for Asian and African leopards separately. Related to Figure 4.

NSGadmix analysis of admixture including only African (A) and only Asian (B) samples, using genotype likelihoods, for K values 2-5. Higher K values were not included, as discrete single individual clusters started to appear. Optimal value of K was found to be K=2 (see STAR Methods).



Figure S4: Genome heterozygosity in 1Mb sliding windows. Related to Figure 4. Genome heterozygosity calculated in 1 Mb sliding windows for all African (A, N=7) and Asian (B, N=8) individuals with sequence coverage over 10x.





| NAME | ГОСАЦТТУ | SUBSPECIES | PROCESSED_READS | READS_WITH_ADAPTERS | READS_DISCARDED | READS_WRITTEN | TOTAL_PAIRS | COMB_PAIRS | UNCOM_PAIRS | READS_MAPPED | RMDUP_READS_MAPPED | DUPLICATION | mapped_BP | depth_samtools | read_depth_GATK |
|------------------|---|--------------------|-----------------|---------------------|-----------------|---------------|-------------|-------------|-------------|--------------|--------------------|-------------|----------------|----------------|-----------------|
| Shinta_10x | Java (Berlin Tierpark) | P. p. melas | 268,851,030 | 3,824,787 | 1,184,878 | 267,644,413 | 267,644,413 | 19,874,203 | 247,770,210 | 385,215,352 | 353,236,455 | 8.30 | 40,113,514,950 | 17.68 | 17.11 |
| Bhagya | Nepal | P. p. fusca | 416,890,983 | 17,005,913 | 24,777 | 416,814,671 | 416,814,671 | 83,943,859 | 332,870,812 | 625,034,920 | 558,242,287 | 10.69 | 94,811,698,320 | 41.72 | 40.56 |
| L033-L066a | Namibia | P. p. pardus | 427,813,526 | 69,069,862 | 55,288 | 427,473,832 | 427,473,832 | 216,856,918 | 210,616,914 | 391,023,244 | 329,032,491 | 15.85 | 74,757,084,321 | 32.90 | 31.98 |
| 50746-NB | Vietnam | P. p. delacouri | 453,124,522 | 429,633,614 | 2,712,012 | 449,078,126 | 449,078,126 | 437,833,678 | 11,244,448 | 338,994,995 | 214,323,935 | 36.78 | 16,100,898,644 | 7.43 | 6.89 |
| 56095-B | Palestine region | P. p. tulliana | 423,587,395 | 397,743,819 | 6,239,580 | 415,468,148 | 415,468,148 | 400,925,894 | 14,542,254 | 190,411,063 | 146,498,708 | 23.06 | 9,583,013,796 | 5.61 | 4.10 |
| 83486-P | Afghanistan | P. p. tulliana* | 415,362,944 | 372,946,050 | 628,591 | 414,154,774 | 414,154,774 | 401,282,445 | 12,872,329 | 296,291,299 | 228,835,727 | 22.77 | 21,188,110,812 | 9.79 | 9.06 |
| ZMUC3490 | Kenya | P. p. pardus | 398,615,960 | 461,031,155 | 3,985,398 | 530,734,009 | 530,734,009 | 513,574,942 | 17,159,067 | 395,822,541 | 306,128,671 | 22.66 | 22,661,386,652 | 10.24 | 9.69 |
| ZMUC4446 | Zambia A | P. p. pardus | 386,935,317 | 304,502,032 | 923,611 | 488,460,940 | 488,460,940 | 433,986,121 | 54,474,819 | 364,760,873 | 273,690,915 | 24.97 | 30,431,188,300 | 13.50 | 13.02 |
| ZMUC29 | India | P. p. fusca | 431,353,451 | 497,073,021 | 3,425,980 | 596,182,134 | 596,182,134 | 571,976,778 | 24,205,356 | 425,216,279 | 353,465,809 | 16.87 | 27,628,100,739 | 12.41 | 11.82 |
| 13705-Pet | Siam (=Thailand) | P. p. delacouri | 284,408,870 | 264,822,797 | 7,216,170 | 273,489,961 | 273,489,961 | 268,950,659 | 4,539,302 | 161,288,434 | 144,918,557 | 10.15 | 10,153,593,183 | 4.91 | 4.34 |
| NMS.Z.2004.205 | Malawi | P. p. pardus | 424,822,274 | 371,007,884 | 22,240,158 | 394,016,892 | 394,016,892 | 377,017,314 | 16,999,578 | 259,497,041 | 196,751,241 | 24.18 | 14,417,333,914 | 6.63 | 6.17 |
| MfN40560 | Addis Ababa, Ethiopia | P. p. pardus | 381,325,086 | 290,251,505 | 336,453 | 380,479,008 | 380,479,008 | 364,907,889 | 15,571,119 | 314,510,964 | 272,573,044 | 13.33 | 31,948,920,389 | 14.22 | 13.66 |
| MfN47501-2 | Ceylon (=Sri Lanka) | P. p. kotya | 433,464,706 | 363,480,786 | 2,400,108 | 408,423,488 | 408,423,488 | 397,396,467 | 11,027,021 | 330,577,006 | 285,350,729 | 13.68 | 26,341,118,980 | 11.76 | 11.27 |
| MfN56356-2 | Konde, Pemba Island, Tanzania | P. p. pardus | 441,169,756 | 361,649,022 | 1,392,255 | 421,138,856 | 421,138,856 | 408,877,730 | 12,261,126 | 346,851,710 | 280,310,857 | 19.18 | 28,491,388,792 | 12.69 | 12.19 |
| SMNH605501 | Korea | P. p. orientalis | 372,588,022 | 277,373,213 | 57,183 | 371,738,272 | 371,738,272 | 358,650,519 | 13,087,753 | 301,639,857 | 250,481,894 | 16.96 | 30,768,887,164 | 13.77 | 13.16 |
| MfN56389 | Akoafim, Gabon | P. p. pardus | 159,476,201 | 112,845,057 | 743,373 | 150,163,587 | 150,163,587 | 140,698,133 | 9,465,454 | 101,668,337 | 81,263,980 | 20.07 | 8,324,298,195 | 4.28 | 3.56 |
| MfN56545 | Bafreng, Cameroon | P. p. pardus | 398,324,887 | 285,085,616 | 1,039,379 | 393,172,497 | 393,172,497 | 373,506,300 | 19,666,197 | 303,093,883 | 185,723,155 | 38.72 | 19,420,202,725 | 8.75 | 8.31 |
| SMNH581240 | Equatorial Guinea | P. p. pardus | 293,278,906 | 223,662,800 | 916,592 | 278,952,484 | 278,952,484 | 268,792,239 | 10,160,245 | 192,372,570 | 138,042,969 | 28.24 | 14,567,365,072 | 6.59 | 6.23 |
| SMNH581311 | Durban, South Africa | P. p. pardus | 427,531,065 | 340,851,759 | 463,186 | 420,702,133 | 420,702,133 | 411,214,845 | 9,487,288 | 311,652,170 | 249,586,243 | 19.92 | 28,259,370,014 | 12.64 | 12.09 |
| SMNH582373 | Могоссо | P. p. pardus | 443,295,703 | 323,407,780 | 397,110 | 438,696,223 | 438,696,223 | 420,764,887 | 17,931,336 | 164,803,593 | 135,951,769 | 17.51 | 16,178,695,192 | 7.31 | 6.92 |
| SMNH595313 | Eritrea | P. p. pardus | 110,113,409 | 87,608,429 | 34,081 | 109,330,753 | 109,330,753 | 105,422,364 | 3,908,389 | 84,765,611 | 63,036,674 | 25.63 | 7,007,051,521 | 3.58 | 3.00 |
| PP28 | "Zoo ORI" (Chinese leopard, Henry Doorly Zoo) | P. p. orientalis** | 205,153,391 | 63,226 | 68 | 205,153,317 | 205,153,317 | 11,055,879 | 194,097,438 | 362,892,062 | 302,446,204 | 16.66 | 38,689,926,941 | 17.05 | 16.55 |
| Amurleopard_PPO1 | Amur A | P. p. orientalis | 463,914,011 | 212,038 | 1,344 | 463,795,055 | 463,795,055 | 6,481,317 | 457,313,738 | 845,502,626 | 820,475,054 | 2.96 | 80,767,696,721 | 35.55 | 34.55 |
| Amurleopard_PPO5 | Amur B | P. p. orientalis | 457,450,100 | 144,274 | 1,319 | 457,367,927 | 457,367,927 | 6,428,005 | 450,939,922 | 834,685,433 | 809,979,832 | 2.96 | 79,832,613,639 | 35.13 | 34.15 |
| P8506_116_GS | Tanzania | P. p. pardus | 232,858,068 | 2,909,047 | 24,647 | 232,600,523 | 232,600,523 | 51,936,417 | 180,664,106 | 333,468,694 | 282,124,309 | 15.40 | 48,882,498,074 | 21.49 | 20.91 |
| P8506_117_GS | Zambia B | P. p. pardus | 245,154,688 | 4,889,420 | 23,035 | 244,573,346 | 244,573,346 | 62,118,991 | 182,454,355 | 339,684,000 | 289,665,692 | 14.73 | 51,496,468,748 | 22.63 | 22.02 |
| | | | | | | | | | | | | | | | |

* = See text for taxonomic assignment^{S1}

** = Although the SRA classification is P. p. japonensis, we assign this sample to P. p. orientalis followings2 for taxonomic consistency

 Table S1: Sequence results per sample. Related to Table 1.

Supplementary references

- S1. Kumerloeve, H. (1972). Zum Stand des Vorkommens von Panthera pardus tulliana Valenciennes 1856 in Kleinasien. Mit Hinweisen auf Syrien und andere Nachbargebiete. Zoologische Gart, 4–22.
- S2. Kitchener A.C., Breitenmoser-Würsten C., Eizirik E., Gentry A., Werdelin L., Wilting A., A revised taxonomy of the Felidae : The final report of the Cat Classification Task Force of the IUCN Cat Specialist Group 2017. Available at: http://repository.si.edu/xmlui/handle/10088/32616.