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SPECIAL ISSUE ARTICLE

Mammal mitogenomics from invertebrate-derived DNA

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Abstract

The metabarcoding of vertebrate DNA found in invertebrate-derived DNA (iDNA) has proven a powerful tool for monitoring biodiversity. To date, iDNA has primarily been used to detect the presence/absence of particular taxa using metabarcoding, though recent efforts demonstrated the potential utility of these data for estimating relative animal abundance. Here, we test whether iDNA can also be used to reconstruct complete mammalian mitogenomes and therefore bring the field closer to populationlevel analyses. Specifically, we used mitogenomic hybridization capture coupled with high-throughput sequencing to analyze individual (N=7) or pooled (N=5) fly-derived DNA extracts, and individual (N=7) or pooled (N=1) leech-derived DNA extracts, which were known a priori to contain primate DNA. All sources of iDNA showed their ability to generate large amounts of mammalian mitogenomic information and deeper

Environmental DNA

Jan F. Gogarten and Sébastien Calvignac-Spencer contributed equally to this work.

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sequencing of libraries is predicted to allow for even more complete recovery of primate mitogenomes from most samples (90%). Sixty percent of these iDNA extracts allowed for the recovery of (near) complete mammalian mitochondrial genomes (hereafter mitogenomes) that proved useable for phylogenomic analyses. These findings contribute to paving the way for iDNA-based population mitogenomic studies of terrestrial mammals.

KEYWORDS

fly, hybridization capture, iDNA, leech, mitochondrial genome, non-human primates

JEL CLASSIFICATION phylogeny, primates

1 | INTRODUCTION

Persistent and growing threats to biological diversity necessitate the development of tools to document biodiversity in rapidly changing environments (Butchart et al., 2010; Mantyka-Pringle et al., 2015). Molecular advances have enabled the detection of DNA that organisms shed into their environment (i.e., environmental DNA, eDNA; Rondon et al., 2000; Taberlet et al., 2018), expanding the biodiversity monitoring toolkit. Notably, metabarcoding of vertebrate mitochondrial DNA (mtDNA) found in water (Andruszkiewicz et al., 2017; Port et al., 2016), sediments (Holman et al., 2019) and soils (Andersen et al., 2012) has proven effective for characterizing community composition in a diversity of ecosystems. A similar use of air has recently been suggested based on promising initial results in zoos (Clare et al., 2022; Lynggaard, Bertelsen, et al., 2022).

Vertebrate DNA is also actively sampled by invertebrates that come into contact with them or their byproducts. Like eDNA, invertebrate-derived DNA (iDNA) often allows for the detection of vertebrate mtDNA. Leeches (e.g., Drinkwater, Jucker, et al., 2021; Lynggaard, Oceguera-Figueroa, et al., 2022; Schnell et al., 2012, 2015, 2018), carrion flies (e.g., Calvignac-Spencer, Merkel, et al., 2013; Gogarten et al., 2020; Hoffmann et al., 2018; Rodgers et al., 2017), sandflies (Kocher et al., 2017; Massey et al., 2022), mosquitos (e.g., Kocher et al., 2017; Massey et al., 2022), and dung beetles (Drinkwater, Williamson, et al., 2021) have all been successfully used in metabarcoding studies targeting mtDNA.

The metabarcoding of short mitochondrial eDNA/iDNA fragments is useful to determine vertebrate species presence/absence, and may even be used to estimate species abundance when combined with careful experimental design and modeling (Carvalho et al., 2021; Fonseca, 2018; Luo et al., 2022). Yet, short mitochondrial eDNA/iDNA fragments are poorly suited to investigate withinspecies, population-level characteristics, including genetic diversity, population size, or the connectivity between populations (Adams et al., 2019; Sigsgaard et al., 2020). For such purposes, nuclear genomes (or subsamples thereof) would be a desirable target; yet, the retrieval of nuclear DNA from eDNA/iDNA extracts is still a challenging task (Sigsgaard et al., 2020). For example, one iDNA study predicted that microsatellite genotyping would only be possible from <5% of mtDNA-positive flies (Schubert et al., 2015).

While mtDNA, a single linked locus characterized by strict maternal inheritance, has inherent limitations for studying withinspecies, population-level characteristics, sequencing relatively large fragments of its fast-evolving regions or even the entire mitogenome generates valuable information for population genetics. Indeed, both strategies have been successfully employed in eDNA studies. For example, Sigsgaard et al. (2016) amplified and sequenced ca. 450 bp D-loop fragments of whale shark mtDNA using seawater eDNA and showed that estimates of haplotype frequency and abundance matched those derived from direct sampling of individuals partaking in aggregations. Similarly, eDNA from ancient sediments was used to reconstruct full mitogenomes of archaic hominins and other mammals, generating evidence of population turnovers at Denisova cave (Slon et al., 2017; Zavala et al., 2021). Other eDNA sources (e.g., waterholes) have also allowed for the reconstruction of vertebrate mitogenomes (Seeber et al., 2019).

Here, we set out to test whether iDNA is also amenable to mitogenomic analyses. Depending on invertebrate ecology and physiology, iDNA could be sampled in very small quantities (e.g., when collected from dung by carrion flies or dung beetles) and subject to active degradation through digestion processes (though this might be slow, as demonstrated in leeches; Schnell et al., 2012). This could mean that iDNA is too rare and/or degraded for the systematic generation of mitogenomic data for population genetics. To our knowledge attempts at generating mitogenome-wide information from iDNA have thus far been limited to a single study that targeted multiple mtDNA fragments of the Annamite striped rabbit (*Nesolagus timminsi*; Nguyen et al., 2021).

Here, we explore the potential of in-solution hybridization capture (the use of biotinylated nucleic acid baits to selectively enrich target library molecules in solution) as a tool to facilitate the sequencing of vertebrate mitogenomes from iDNA isolated from carrion flies and leeches. These invertebrates arguably represent the best explored iDNA sources, while also representing ecologically and physiologically divergent organisms (Calvignac-Spencer, Leendertz, et al., 2013). Specifically, we employ a bait set that spans

DANABALAN ET AL.

nonhuman primate (NHP) mitochondrial diversity (excluding humans) to enrich libraries constructed from DNA of individual flies and terrestrial leeches (hereafter leeches), as well as from pools of flies or leeches, all of which contained NHP mtDNA.

2 | METHODS AND MATERIALS

2.1 | Samples

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From leeches, we selected individual DNA extracts derived from 7 individuals, as well as 1 pool of DNA containing 10 leeches in the pool (Schnell et al., 2018). From flies, we selected individual DNA extracts derived from 7 individuals as well as 5 pools of 6 individual DNA extracts (Table 1). We were unable to sort leeches or flies morphologically into taxonomic groups, and did not attempt to identify taxa using molecular approaches. Previous studies of the cytochrome oxidase c subunit I (COI) barcode diversity of flies captured for biomonitoring with these baits in Sub-Saharan Africa ecosystems have shown a diversity of species assigned to the families Calliphoridae, Sarcophagidae, and Muscidae (Gogarten et al., 2022; Hoffmann et al., 2017). Similarly, an analysis of COI barcodes of leeches collected for mammal metabarcoding also suggested a diversity of species from many genera and families are often collected (Schnell et al., 2018). All individual extracts and extract pools showed signs of containing NHP DNA in earlier experiments (Table 1; CR personal communication; Gogarten et al., 2020; Hoffmann et al., 2017; Schnell et al., 2018). Mammal mtDNA had also been guantified for individual fly DNA extracts using the quantitative PCR assay described in Schubert et al. (2015): Table 1, which comprised amplifying primers from Taylor (1996) and a human blocking primer from Boessenkool et al. (2012).

2.2 | Hybridization capture

The iDNA extracts were fragmented to 550bp using an S220 Focused-ultrasonicator (Covaris Inc) and Illumina sequencing libraries then prepared using the NebNext Ultra II Kit (New England Bioloabs) and dual indexed using the NEBNext Multiplex Oligos for Illumina (New England Biolabs). Libraries were quantified and equal masses were pooled to generate pools for hybridization capture (to avoid confusion with the extracted pools of flies and leeches discussed throughout the text as pools, we refer to these pools of libraries as "capture pools"). Specifically, we generated capture pools of leeches collected in Madagascar (one pool of two libraries), capture pools of leeches from Vietnam (two pools containing two and four libraries, respectively), and capture pools of flies from mainland Africa (three pools containing two, five, and five libraries, respectively; see Table 1 for details). For libraries with mammal quantification data available, we created capture pools with samples of similar concentrations together (Table 1). Specifically, where the information was available, we used the estimated mammalian mitogenome

to background ratio to place libraries into capture pools within one \log_{10} difference of one another.

In solution hybridization capture was performed on capture pools using RNA baits designed to span primate mitochondrial diversity (excluding humans; Daicel Arbor Biosciences). With this approach, DNA or RNA probes that are biotinylated are mixed to denatured library molecules, which then enables the selection of targeted fragment-probe heteroduplexes with the help of magnetic streptavidin beads (Enk et al., 2014). Nontargeted fragments in the library are removed from the solution through repeated washings, while probe/target library fragment heteroduplexes are retained on the magnetic beads. Afterwards, the targeted fragments can then be eluted from the beads. The bait design consisted of 19,552 80bp RNA baits; 3189 baits to span the selected gorilla, chimpanzee and bonobo mitogenomes, and 16,363 to target the remaining 81 NHP mitogenomes with an 75+% overlap between baits and clustering of baits with an 88+% identity (Table S1).

Capture reactions were set up according to the manufacturer's protocol. Briefly, for each capture pool, prior to capture a $20\,\mu\text{L}$ hybridization mix was prepared using 9μ L of HYB #1, 0.5 μ L of HYB #2, $3.5\,\mu L$ of HYB #3, $0.5\,\mu L$ of HYB #4, $1\,\mu L$ of RNase Block and $5.5\,\mu L$ of the baits, which were diluted with water in a 1:4 ratio. A 5.5 µL blocking mix was then prepared using 2.5μ L of Block #1, 2.5μ L of Block #2, 0.5μ L of Block #3 and we added 7μ L of each capture pool to a prepared blocking mix and incubated it at 95°C for 5 min. The blocking mix targets the Illumina adapters and indices and prevents binding of library molecules to one another. The hybridization mix was then heated to the hybridization temperature of 65°C for 5 min, then 18 µL was added to the blocking-sample mix and thoroughly mixed. The hybridization capture took place at 65°C in a thermocycler for at least 24 h. Capture products were cleaned using Dynabeads MyOne Streptavidin C1 Magnetic beads (Thermofisher). We prepared 800µL of wash buffer 2.2 using 6.4µL of HYB #4, 633.6µL of nuclease free water and 160µL of Wash Buffer 2, which was used for up to four washes of each capture pool. An aliquot of 30µL of beads was prepared with three 200 µL washes of Binding buffer. Following the third wash, beads were resuspended in 70 µL of Binding buffer. Resuspended beads were heated to the hybridization temperature (65°C) for 2min. All 25µL of the capture mix was transferred to the heated beads and incubated for 30 min. Cleaning of the beadsample mix comprised three steps which were repeated for a total of four times; first, the addition of 180µL of Wash Buffer, followed by incubation at 65°C for 10min and finally removal of the supernatant. Following the removal of the supernatant in the final wash, the pellet was resuspended in 30 µL of TET. The cleaned product was then amplified using the KAPA Hot Start Library Amplification Kit to generate at least 200 ng of library that was used for the second round of capture. Concentrations were assessed using the KAPA HiFi Library Quantification Kit; briefly, 1 mL of the amplified libraries was taken and diluted 1:1000 and 1:8000 and guantified with a mix consisting of $12 \mu L$ of KAPA Master Mix, $4 \mu L$ of water and $4 \mu L$ of diluted samples with the following thermocycling conditions: 95°C for 5 min, then 35 cycles of 95° for 30s and 60°C for 45s, ending with a

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Closest NHP relati present in respect	locality		Macaca mulatta	Macaca arctoides	Macaca arctoides	Macaca arctoides	Macaca mulatta	Macaca arctoides			Eulemus fulvus		Lophocebus albigen	Cercocebus agilis		Cercocebus atys	Cercocebus agilis	Cercocebus agilis	Cercocebus agilis	Cercocebus atys	2
Best hit in BLAST	search (% identity)		Macaca mulatta (94.3)	Macaca arctoides (95.9)	Macaca arctoides (97.0)	Macaca arctoides (97.9)	Macaca mulatta (94.3)	Macaca arctoides (95.6–99.2 ^c)			Eulemur fulvus (92.3–99.4 ^c)		Lophocebus aterrimus (94.8-100 ^c)	Cercocebus chrysogaster (94.5–97.8 ^c)		Cercocebus atys (91.8–96.1 ^c)	Cercocebus chrysogaster (95.7)	Cercocebus chrysogaster (94.7)	Cercocebus chrysogaster (95.7)	Cercocebus atys (93.9–96.5 [°])	
Mt genome coverage ≥10× and 95%	agreement (%)		91.3	94.0	96.5	99.3	98.9	17.6			11.4		40.1	48.5	ı	95.2	97.5	94.5	97.3	8.0	
Reads	mapped (%)		56.7	37.2	38.2	66.2	67.9	71.5	ı		7.7		43.0	52.8		68.0	65.1	60.3	59.5	17.4	
Human	reads (%)		1.1	0.9	0.8	2.3	0.5	0.1	·		62.2		0.9	3.0		3.9	1.7	1.6	1.2	8.5	
Primate reads	(%)		86.1	86.1	88.4	90.5	91.9	79.5	ı		91.3		82.9	62.6		79.5	87.0	87.1	79.7	29.1	
Total N	reads		1,709,483	1,885,645	1,458,247	1,315,860	6,590,944	2122	0		886,816		599,132	530,786	0	1,898,379	6,230,515	3,607,011	1,562,749	433,392	
Capture	lood		A	A	A	в	В	A	U		υ		D	۵	D	D	ш	ш	D	ш	
Mammal mt conc. (copies/	hL)		,			ı		·					9	6	1	78	2469	171	324	ı	
DNA conc.	(ng/µL)		8	6.8	7.6	16.1	6.7	10.9	4.2		3.6		5	23	7	190	9	т	102	5.5	
	Location	seches	Bach Ma NP, Vietnam	Bach Ma NP, Vietnam	Bach Ma NP, Vietnam	Bach Ma NP, Vietnam	Bach Ma NP, Vietnam	Bach Ma NP, Vietnam	Ranomafana NP, Madagascar		Andasibe Madagascar	lies	Bili, DRC	Bili, DRC	Taï NP, Côte d'Ivoire	Taï NP, Côte d'Ivoire	Dzanga-Sangha NP, CAF	Dzanga-Sangha NP, CAF	Dzanga-Sangha NP, CAF	Grebo-Krahn NP, Liberia	
	Sample	Individual le	53	177	181	315	393	394 ^a	2_2 ^a	Leech pool	$17_{-}4^{a}$	Individual fl	1184 ^a	1251 ^{a,b}	666 ^a	1340	1458 ^b	1522 ^b	1542 ^b	Fly pools 79ª	

 TABLE 1
 Samples used for hybridization capture and summary of sequencing results.

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Sample	Location	DNA conc. (ng/µL)	Mammal mt conc. (copies/ μL)	Capture pool	Total N reads	Primate reads (%)	Human reads (%)	Reads mapped (%)	Mt genome coverage ≥10× and 95% agreement (%)	Best hit in BLAST search (% identity)	Closest NHP relative present in respective locality
81	Grebo-Krahn NP, Liberia	2.6	1	ш	438,304	75.8	6.3	53.3	67.6	Cercopithecus petaurista (92.5–99.2 ^c)	Cercopithecus petaurista
86 ^a	Grebo-Krahn NP, Liberia	4.1		ш	4156	62.1	5.6	26.6	13.9	Cercopithecus petaurista (95.7 ^d)	Cercopithecus cephus
104	Taï NP, Côte d'Ivoire	4.4	1	ш	1,515,441	76.7	0.3	49.7	86.8	Cercopithecus petaurista (94.3–98.4 ^c)	Cercopithecus petaurista
114	Sobeya, Guinea	4.6		ш	2,033,336	64.6	6.9	50.2	88.3	Papio papio (94.8–98.4 ^c)	Papio papio
bbreviation	s: CAF, Central African Repu	ublic; DRC, Dei	mocratic Repu	blic of Congo	o; NP, Nationa	l Park.					

is currently available thus BLAST results return C. chrysogaster as the closest match to the consensus sequence.

Not included in Figure 1d as we only considered fly- or leech-derived mitogenomes with more than 50% coverage.

petaurista

⁴A single short sequence returned a best hit on C.

highest hit among multiple short

^cLowest and

sedneuces

Cercocebus agilis

complete mitogenome of

No No

Environmental DNA

plified further for a maximum of up to 10 cycles and re-quantified. We then used at least 200 ng of the cleaned and enriched capture product for the second capture reaction. Cleaned and quantified products from the second capture reaction were then pooled in equimolar ratios and sequenced on an Illumina NextSeq using V2 chemistry (2×150 cycles; Illumina). **Bioinformatic and statistical analysis**

dissociation cycle. Samples with less than 200 ng of DNA were am-

2.3

For each sample, the 150bp forward and reverse reads were trimmed using Trimmomatic v.038 (Bolger et al., 2014) to remove the adapters (ILLUMINACLIP:2:30:10:8), low-quality bases at both ends as well as within the reads (LEADING:30 TRAILING:30 SLIDINGWINDOW:4:30) and to keep reads of a minimum length (MINLEN:40). Trimmed reads were then merged using clip&merge v1.7.8 (Peltzer et al., 2016) and all merged, unmerged and unpaired reads were concatenated into a single file per sample.

As a preliminary exploration of the vertebrate reads generated in these experiments, we classified reads using Kraken (Wood & Salzberg, 2014). For this, a custom database of all complete mitochondrial vertebrate sequences was created from GenBank. Trimmed reads were mapped to a human reference sequence to remove human reads using bwa MEM (Li, 2013). Unmapped reads were then competitively mapped to 220 unique NHP mitogenomes (Table S1). Each sample was then remapped to the single best reference, which was selected on the basis of having the most mapped reads in the initial mapping. Bam files were then sorted and duplicate reads removed using the SortSam and MarkDuplicates functions in the Picard package of tools (The Broad Institute; http://broadinstitute.github. io/picard/), with coverage calculated using samtools' depth function (Li et al., 2009). Average insert size was determined with the CollectInsertSizeMetrics function in Picard, using only merged and unmerged reads. To explore the accumulation of unique molecules in libraries at different sequencing depths, we used preseq's lc extrap function, which bootstraps (BSs) the observed duplicate counts histogram (Daley & Smith, 2014). Libraries are amplified during their preparation and after capture, creating the potential for resequencing of the same amplified initial fragment multiple times, and errors introduced during the PCR can thus be sequenced multiple times. As such, when considering the coverage and certainty in calling bases of the target genome, there is considerable interest in acquiring as many unique on-target reads as possible. In essence, such efforts explore when sequencing efforts have exhausted the library's molecular complexity, beyond which resequencing will not generate novel information about the target of interest (Daley & Smith, 2014; Enk et al., 2014).

A consensus sequence for each sample was generated using Geneious Prime (Biomatters Limited) with a threshold of 95% identity among ≥10 unique read coverage for a base to be called. For a first preliminary species identification, we ran a BLAST search of the consensus sequences against the NCBI nonredundant database and



FIGURE 1 Mitogenome coverage generated from libraries from (a) individual flies, (b) pools of flies, or (c) individual or pools of leeches. The dashed lines indicate the moving 10bp average across the genome. The fly or leech images next to the plots indicate a unique color/ shape combination and whether individual extracts or pools were used. (d) A maximum likelihood phylogeny inferred from an alignment of 91 primate mitogenomes genomes from GenBank and the high-quality mitogenomes generated from flies, leeches, or pools of flies. The phylogeny presented is pruned to aid in interpretation, but the full tree including additional information about the nodes and branch lengths is available in the Data S1. A minimum 10× coverage was required to call a base for these mitogenomes with a threshold of 95% identity for a base to be called. Nodes that appeared in >95% of bootstrap replicates shown as solid lines. The scale shows nucleotide substitutions per site.

recorded the best hit species name and sequence identity (Altschul et al., 1990). For a better, phylogeny-informed species assignment, we downloaded mitochondrial genomes of Cercopithecinae from GenBank (for GenBank accession numbers see Data S1). The dataset was filtered to contain at least one representative of all available species, subspecies and lineages of Cercopithecinae in GenBank, but sequences with less than 80% sequence coverage were excluded (the selected sequence set was independent from the set of reference sequences used for capture bait design). All fly-derived mitogenomes with more than 50% coverage were included. The resulting 91 sequences from GenBank and 12 newly generated mitogenomes were aligned with MAFFT v7.307 (Katoh & Standley, 2013). We identified conserved blocks using Gblocks (Talavera & Castresana, 2007) as implemented in SeaView v5 (Gouy et al., 2021), reducing the alignment to 15,040 positions. A maximum-likelihood tree was reconstructed in IQ-TREE 1.5.3 (Nguyen et al., 2014) using the bestfit substitution model (TIM3+I+G4) as automatically calculated in IQ-TREE using the option-m TEST (similar to jModelTest) and the Bayesian information criterion. Node support was obtained via 10,000 ultrafast BS replicates (Hoang et al., 2018).

To explore the utility of iDNA to describe within-species variation, we calculated the pairwise divergence between the highquality iDNA mitogenomes included in the phylogenetic analysis described above. We did this with Geneious Prime and considered only unambiguous differences between pairs of sequences. This analysis compared the three individual leech-derived *Macaca arctoides* mitogenomes from Bach Ma NP, Vietnam, the two leech-derived *Macaca mulatta* mitogenomes from Bach Ma NP, as well as the three fly-derived *Cercocebus agilis* mitogenomes from Dzanga-Sangha NP, CAF and the *C. agilis* mitogenome from Bili, DRC.

Previously, mammal mtDNA estimates were generated for 1154 individual flies captured in a diversity of Sub-Saharan African ecosystems (Gogarten et al., 2020; Hoffmann et al., 2017). Here, we compared these concentrations to the concentrations of individual flies from which we were successfully able to generate usable mitogenome coverage, to estimate the proportion of flies amenable for mitogenomic analyses.

Figures were created in R v4.1.2 (R Core Team, 2021), using the ggplot2 (Wickham, 2016) and ggtree2 packages (Yu et al., 2017).

3 | RESULTS

All but two of the samples generated reads that could be subsequently analyzed (Table 1). We generated a total of 32,700,196 paired end reads ($\bar{x}_{per sample} = 1,721,063$ paired reads, range = 0-6,685,581). Average read lengths ranged from 40 bp to 151 bp ($\bar{x}_{per sample} = 95.5$). The Kraken analysis revealed that the majority of the reads originated

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Environmental DNA

DANABALAN ET AL.

from primates (\bar{x} = 77.8% of total reads, range = 29.1%-91.9% of total reads; Table 1). The Kraken analysis also suggested that typically, only a small number of the total reads sequenced were of human origin (\bar{x} = 6.0% of total reads, range = 0.1%-62.1% of reads), with only a single sample (the leech pool) having more than 10% of reads assigned as human (Table 1). All but one of the individual leeches generated significant amounts of NHP reads and the single pooled leech sample contained the least NHP and the most human reads (Table 1). Similarly, it appeared that individual flies generated relatively more NHP reads than pools of flies (Table 1).

Mapping of non-human reads from each sample to the best candidate primate mitogenome, revealed that it was possible to recover partial mitogenomes from 18 of the 20 samples tested (Table 1; Figure 1a–c). The proportion of reads mapping to the best primate mitogenome seemed to be higher for individual flies and leeches than for pools of flies or leeches (Table 1). Insert size only slightly varied by source, with fly pools having the largest insert sizes (X^- =273 bp), followed by individual flies (X^- =253 bp), and leeches generating the smallest insert sizes (X^- =235 bp; Figure 2d). As DNA was fragmented prior to library construction, these insert sizes are underestimates of the condition of vertebrate DNA originally found in these flies and leeches and represent a lower bound for the fragment sizes of the DNA in the samples themselves.

Among individual fly samples, the proportion of reads mapping to the best primate mitogenome was at its lowest for samples with extremely low mtDNA copy numbers. While sample sizes are small, we were able to generate considerable genomic data from individual flies that had more than six mitochondrial copies/ μ L. Comparing this rough threshold to estimates of mitochondrial copy numbers in our collection of individual flies from various ecosystems in Sub Saharan Africa revealed that 24.1% of flies (278/1154) in these ecosystems are suitable for mitogenomic analysis (Figure 3).

Of the 18 samples with detectable mapping to the primate mitogenome, it was possible to recover nearly complete genomes from a majority of samples ($\overline{x} = 71.8\%$ of primate mitogenome covered at ≥10×, range = 8.9%-100.0% of primate mitogenome covered at $\geq 10 \times$; Table 1). The completeness of genomes recovered was higher for individual flies and leeches than from pools of flies and leeches and was again at its lowest for the three individual flies with very low mtDNA concentration (Table 1). Samples that generated lower completeness also tended to exhibit more uneven coverage (Figure 1a-c). The accumulation of unique molecules in libraries generated from all types of samples (except for those two samples that did not generate any reads) suggests that further sequencing of these libraries would continue to improve mitogenome completeness (Figure 2a-c). BLAST search using the 18 consensus sequences returned best hits consistent with initial metabarcoding results, local species composition, and mitogenome availability in public databases (Table 1). Finally, the 12 non-chimeric mtDNA consensus sequences covering more than 50% of the mitogenome clustered with sequences from species present in the ecosystem where the invertebrates were collected (or the closest species from which a mitogenome was available; Figure 1d).

iDNA detected mitogenomic variation within NHP species. Two of the three individual leech-derived *M. arctoides* mitogenomes were identical (Individual leech 177 and 181), while one (Individual leech 315) differed from these two genomes at three sites. The two leech-derived *M. mulatta* mitogenomes from Bach Ma NP, Vietnam (Individual leech 53 and 393) differed from one another at 12 sites. The three fly-derived *C. agilis* mitogenomes from Dzanga-Sangha NP, CAF were nearly identical, with two of the *C. agilis* mitogenomes different from the others at a single position each (Individual fly 1542 and 1458). The *C. agilis* mitogenome from Bili, DRC differed from the other mitogenomes assigned to the same species at 219 sites.

4 | DISCUSSION

Our results demonstrate that hybridization capture allows for the reconstruction of mammalian mitogenomes from leeches and flies, which are then useable for phylogenomic analyses. This joins a growing body of evidence suggesting that iDNA not only has the potential to serve as a biomonitoring tool to assess the presence/ absence of species, but also to document a variety of population genomic characteristics (Keven et al., 2019; Nguyen et al., 2021; Schubert et al., 2015).

We found that many of our primate positive iDNA samples generated mitogenomic information useful for phylogenomic analyses. Perhaps unsurprisingly, mammalian mtDNA concentrations in flies were related to the performance of hybridization capture, with the fly extract with the lowest concentration being the only individual fly sample that failed to generate mitogenomic data. Given the seeming importance of mitogenome concentrations on our ability to reconstruct mitogenomes, the poorer performance of pooling extracts of flies and leeches that we observed might simply reflect the dilution of the positive extract(s) in these pools (Mata et al., 2019). Despite this limitation, iDNA analyses often work with pools of flies or leeches that are extracted together to reduce time and costs of extractions and for metabarcoding approaches, this appears to not reduce sensitivity greatly. Here, we set out to test whether an hybridization capture based approach also worked with these pools of insects. Our results demonstrated that it is possible to generate mitogenomic data from these pools. Furthermore, using target concentration information to optimize pooling schemes of libraries generated from pools prior to hybridization capture, so that samples with more similar concentrations of mammalian mtDNA are captured together, might improve success rates. Our preseq analysis also suggests that further sequencing of poorly performing samples would generally continue to improve mitogenome recovery (clearly the case for six of the eight poorly performing samples). Further sequencing is complicated by the fact that capture was performed on pooled libraries, so a resequencing effort would likely benefit from a new capture experiment on those samples needing further sequencing. Importantly, our results suggest that a sizeable fraction of individual flies positive for mammalian species in a diversity of sub-Saharan African ecosystems are amenable for such mitogenomic



FIGURE 2 The accumulation of unique molecules in libraries generated from (a) individual flies, (b) pooled flies, and (c) individual and pooled leaches. The accumulation of unique molecules is shown in relation to the number of on target reads from the experiment, including duplicates. The shaded regions show 95% confidence intervals for each curve which is computed by bootstrapping the observe counts histogram using the program preseq. (d) Violin plots and overlaid box plots showing the insert size for each of the samples that are shown in Figure 1d, using the corresponding color code. As DNA was fragmented as part of the library preparation procedure, these insert size distributions represent a lower bound for the fragment size distribution of the samples prior to fragmentation.

analyses, showcasing the feasibility of large-scale mitogenomic studies based on iDNA.

We found variation between mitogenomes assigned to the same species and detected within an ecosystem, and also identified considerable divergence between distant populations from what has historically been considered a single species, C. agilis. These findings demonstrate the potential of iDNA to contribute data to explore within-species, population-level characteristics, in particular genetic diversity and has clear potential to be applied to estimating population sizes and the connectivity between populations (Adams et al., 2019; Sigsgaard et al., 2020).

The promising performance of iDNA for mitogenomic analyses observed here may be due in part to the large average fragment sizes observed, despite having included a fragmentation step in our library preparation protocol. The expectation that iDNA is highly fragmented represents a largely untested hypothesis that has driven many studies to target short fragments of mtDNA (<150 bp). For example, a study of 216 leech samples found that 144 of them were amenable to the amplification and sequencing of mtDNA 16S rRNA and cytochrome b (cytb) fragments of 461 to 486 bp lengths (Morishima et al., 2020). In carrion flies, a study comparing

the detection of shorter (130bp) and longer mammal mtDNA fragments (300bp) did not reveal dramatic difference in the detection rates (25% for short fragment vs. 40% for the long fragment; Calvignac-Spencer, Merkel, et al., 2013). In contrast, a study with tsetse flies found that the blood meal could be identified in 35% of samples when targeting long fragments of the cytb (450bp) and COI genes (330bp or 660bp); by using a shorter fragment (150bp of the 16S rRNA), they were able to recover the blood meal in 68 of the 89 (76%) samples that could not be identified with the longer PCR systems, which suggests more fragmented iDNA in tsetse flies (Bitome-Essono et al., 2017). A more thorough examination of the fragmentation of iDNA in different invertebrates and environments will help guide the selection of PCR target lengths and library preparation methods to maximize detection rates and mitogenomic reconstructions. A major benefit of targeting mammal mtDNA with hybridization capture is that it performs well with even highly fragmented samples; if library building costs decrease, this may in some cases represent a cost-effective and sensitive screening tool.

A potential limiting factor for using iDNA for population-level inferences is that samples can contain the mtDNA not just of multiple species, but also from multiple individuals of a single species

1011





FIGURE 3 Histogram of the mammalian mitogenome concentrations from 1154 individual flies captured in a diversity of Sub-Saharan African ecosystems. The dashed line indicates our rough estimate for a threshold above which we were able to consistently generate useful mammalian mitochondrial genomic information using hybridization capture. To enable plotting on a log scale with zero values, we added one to each copy number estimate.

(Sigsgaard et al., 2020). The magnitude of the problem is uncertain and will likely depend on the invertebrate sampler. The impact of this problem may be mitigated by: (i) favoring the analysis of individual invertebrates, in that it typically isolates one or at most a few mitogenomes, (ii) focusing mitogenomic efforts on metabarcoded specimens that do not show preliminary evidence for multiple variants' being present, and, possibly, (iii) applying long-read sequencing to resolve mixed mitochondrial haplotypes exhibiting even low divergence (Sigsgaard et al., 2020), if raw read accuracy continues improving (Wang et al., 2021). Ultimately, the risk of inadvertent assembly of chimeric mitogenomes can likely be kept at quite low levels, given the nonrecombinant nature of mtDNA and the availability of many chimerism and recombination detection tools.

1012

500

400

300

200

100

n

Count [N]

The cost of metabarcoding invertebrates for vertebrate biodiversity monitoring have declined to the point where they could effectively be routinely used to complement traditional survey techniques (e.g., a recent estimate of the price per fly pool was €31.93: Gogarten et al., 2020). Pools containing the DNA of animals of interest could then be targeted using the methods presented here to generate mitogenomes for an additional cost of ~100-150€/pool for library preparation and hybridization capture. The cost of sequencing the capture products will then depend on the depth of coverage needed and the sequencing platform used, but the high proportion of reads on target typically observed here, suggest the costs to generate mitogenomes will be on the order of ~100-200€/pool (e.g., a MiSeq V2 chemistry 2×150 costs 1035€ and generates 7.5 million paired-end reads, with library diversity typically plateaued after ~1 million reads on targeted). We conclude that, although more detailed exploration will help optimize these tools, mitogenomic studies are probably already within the reach of iDNA users.

AUTHOR CONTRIBUTIONS

Conception of the study: Renita Danabalan, M. Thomas P. Gilbert, Christian Roos, Camila Mazzoni, Jan F. Gogarten, Sébastien Calvignac-Spencer. Acquisition, analysis and interpretation of the data: Renita Danabalan, Kevin Merkel, Ida Bærholm Schnell, Mimi Arandjelovic, Christophe Boesch, Gregory Brazzola, Paula Dieguez, Jef Dupain, Magloire Kambale-Vyalengerera, Hjalmar S. Kühl, Constanze Hoffmann, Juan Lapuente, Van Ngoc Thinh, Fee Zimmermann. Writing of the initial draft of the manuscript: Renita Danabalan, Christian Roos, Jan F. Gogarten, Sébastien Calvignac-Spencer.

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CONFLICT OF INTEREST STATEMENT

The authors declare no conflict of interest.

DATA AVAILABILITY STATEMENT

All sequence data have been uploaded to Zenodo with the following DOI: https://doi.org/10.5281/zenodo.7018975.

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REFERENCES

- Adams, C. I., Knapp, M., Gemmell, N. J., Jeunen, G.-J., Bunce, M., Lamare, M. D., & Taylor, H. R. (2019). Beyond biodiversity: Can environmental DNA (eDNA) cut it as a population genetics tool? *Genes*, 10(3), 192.
- Altschul, S. F., Gish, W., Miller, W., Myers, E. W., & Lipman, D. J. (1990). Basic local alignment search tool. *Journal of molecular biology*, 215(3), 403–410.
- Andersen, K., Bird, K. L., Rasmussen, M., Haile, J., Breuning-Madsen, H., Kjaer, K. H., Orlando, L., Gilbert, M. T., & Willerslev, E. (2012). Metabarcoding of 'dirt'DNA from soil reflects vertebrate biodiversity. *Molecular Ecology*, 21(8), 1966–1979.
- Andruszkiewicz, E. A., Starks, H. A., Chavez, F. P., Sassoubre, L. M., Block, B. A., & Boehm, A. B. (2017). Biomonitoring of marine vertebrates in Monterey Bay using eDNA metabarcoding. *PLoS One*, 12(4), e0176343.
- Bitome-Essono, P.-Y., Ollomo, B., Arnathau, C., Durand, P., Mokoudoum, N. D., Yacka-Mouele, L., Okouga, A. P., Boundenga, L., Mve-Ondo, B., Obame-Nkoghe, J., Mbehang-Nguema, P., Njiokou, F., Makanga, B., Wattier, R., Ayala, D., Ayala, F. J., Renaud, F., Rougeron, V., Bretagnolle, F., ... Paupy, C. (2017). Tracking zoonotic pathogens using blood-sucking flies as 'flying syringes'. *eLife*, *6*, e22069. https://doi.org/10.7554/eLife.22069
- Boessenkool, S., Epp, L. S., Haile, J., Bellemain, E., Edwards, M., Coissac, E., Willerslev, E., & Brochmann, C. (2012). Blocking human contaminant DNA during PCR allows amplification of rare mammal

species from sedimentary ancient DNA. *Molecular Ecology*, 21(8), 1806–1815.

Bolger, A. M., Lohse, M., & Usadel, B. (2014). Trimmomatic: A flexible trimmer for Illumina sequence data. *Bioinformatics*, 30(15), 2114-2120.

nvironmental DNA

- Butchart, S. H. M., Walpole, M., Collen, B., van Strien, A., Scharlemann, J.
 P. W., Almond, R. E. A., Baillie, J. E., Bomhard, B., Brown, C., Bruno,
 J., Carpenter, K. E., Carr, G. M., Chanson, J., Chenery, A. M., Csirke,
 J., Davidson, N. C., Dentener, F., Foster, M., Galli, A., ... Watson, R.
 (2010). Global biodiversity: Indicators of recent declines. *Science*,
 328(5982), 1164–1168. https://doi.org/10.1126/science.1187512
- Calvignac-Spencer, S., Leendertz, F. H., Gilbert, M. T. P., & Schubert, G. (2013). An invertebrate stomach's view on vertebrate ecology: Certain invertebrates could be used as "vertebrate samplers" and deliver DNA-based information on many aspects of vertebrate ecology. *BioEssays*, 35(11), 1004–1013.
- Calvignac-Spencer, S., Merkel, K., Kutzner, N., Kühl, H., Boesch, C., Kappeler, P. M., Metzger, S., Schubert, G., & Leendertz, F. H. (2013). Carrion flyderived DNA as a tool for comprehensive and cost-effective assessment of mammalian biodiversity. *Molecular Ecology*, *22*(4), 915–924.
- Carvalho, C. S., De Oliveira, M. E., Rodriguez-Castro, K. G., Saranholi, B. H., & Galetti, P. M., Jr. (2021). Efficiency of eDNA and iDNA in assessing vertebrate diversity and its abundance. *Molecular Ecology Resources*, 22(4), 1262–1273.
- Clare, E. L., Economou, C. K., Bennett, F. J., Dyer, C. E., Adams, K., McRobie, B., Drinkwater, R., & Littlefair, J. E. (2022). Measuring biodiversity from DNA in the air. *Current Biology*, *32*, 693–700.
- Daley, T., & Smith, A. D. (2014). Modeling genome coverage in single-cell sequencing. *Bioinformatics*, 30(22), 3159–3165.
- Drinkwater, R., Jucker, T., Potter, J. H. T., Swinfield, T., Coomes, D. A., Slade, E. M., Gilbert, M. T. P., Lewis, O. T., Bernard, H., Struebig, M. J., Clare, E. L., & Rossiter, S. J. (2021). Leech blood-meal invertebrate-derived DNA reveals differences in Bornean mammal diversity across habitats. *Molecular Ecology*, 30(13), 3299–3312. https://doi.org/10.1111/mec.15724
- Drinkwater, R., Williamson, J., Clare, E. L., Chung, A. Y., Rossiter, S. J., & Slade, E. (2021). Dung beetles as samplers of mammals in Malaysian Borneo–A test of high throughput metabarcoding of iDNA. *PeerJ*, *9*, e11897.
- Enk, J. M., Devault, A. M., Kuch, M., Murgha, Y. E., Rouillard, J.-M., & Poinar, H. N. (2014). Ancient whole genome enrichment using baits built from modern DNA. *Molecular Biology and Evolution*, 31(5), 1292–1294. https://doi.org/10.1093/molbev/msu074
- Fonseca, V. G. (2018). Pitfalls in relative abundance estimation using eDNA metabarcoding. *Molecular Ecology Resources*, 18(5), 923–926. https://doi.org/10.1111/1755-0998.12902
- Gogarten, J. F., Hoffmann, C., Arandjelovic, M., Sachse, A., Merkel, K., Dieguez, P., Agbor, A., Angedakin, S., Brazzola, G., Jones, S., Langergraber, K. E., Lee, K. C., Marrocoli, S., Murai, M., Sommer, V., Kühl, H. S., Leendertz, F. H., & Calvignac-Spencer, S. (2020). Fly-derived DNA and camera traps are complementary tools for assessing mammalian biodiversity. *Environmental DNA*, 2(1), 63–76. https://doi.org/10.1002/edn3.46
- Gogarten, J. F., Jahan, M., Calvignac-Spencer, S., Chapman, C. A., Goldberg, T. L., Leendertz, F. H., & Rothman, J. M. (2022). The cost of living in larger primate groups includes higher fly densities. *EcoHealth*, 19(2), 290–298. https://doi.org/10.1007/s10393-022-01597-5
- Gouy, M., Tannier, E., Comte, N., & Parsons, D. P. (2021). Seaview version 5: A multiplatform software for multiple sequence alignment, molecular phylogenetic analyses, and tree reconciliation. *Methods in Molecular Biology (Clifton, N.J.)*, 2231, 241–260.
- Hoang, D. T., Chernomor, O., Von Haeseler, A., Minh, B. Q., & Vinh, L. S. (2018). UFBoot2: Improving the ultrafast bootstrap approximation. *Molecular Biology and Evolution*, 35(2), 518–522.

ILEY-Environmental DNA

- Hoffmann, C., Merkel, K., Sachse, A., Rodríguez, P., Leendertz, F. H., & Calvignac-Spencer, S. (2018). Blow flies as urban wildlife sensors. *Molecular Ecology Resources*, 18(3), 502–510.
- Hoffmann, C., Zimmermann, F., Biek, R., Kuehl, H., Nowak, K., Mundry, R., Agbor, A., Angedakin, S., Arandjelovic, M., Blankenburg, A., Brazolla, G., Corogenes, K., Couacy-Hymann, E., Deschner, T., Dieguez, P., Dierks, K., Düx, A., Dupke, S., Eshuis, H., ... Leendertz, F. H. (2017). Persistent anthrax as a major driver of wildlife mortality in a tropical rainforest. *Nature*, *548*(7665), 82–86.
- Holman, L. E., de Bruyn, M., Creer, S., Carvalho, G., Robidart, J., & Rius, M. (2019). Detection of introduced and resident marine species using environmental DNA metabarcoding of sediment and water. *Scientific Reports*, 9(1), 11559. https://doi.org/10.1038/s41598-019-47899-7
- Katoh, K., & Standley, D. M. (2013). MAFFT multiple sequence alignment software version 7: Improvements in performance and usability. *Molecular Biology and Evolution*, 30(4), 772–780.
- Keven, J. B., Walker, E. D., & Venta, P. J. (2019). A microsatellite multiplex assay for profiling pig DNA in mosquito bloodmeals. *Journal of Medical Entomology*, 56(4), 907–914.
- Kocher, A., de Thoisy, B., Catzeflis, F., Valière, S., Bañuls, A.-L., & Murienne, J. (2017). iDNA screening: Disease vectors as vertebrate samplers. *Molecular Ecology*, 26(22), 6478–6486. https://doi. org/10.1111/mec.14362
- Li, H. (2013). Aligning sequence reads, clone sequences and assembly contigs with BWA-MEM. arXiv preprint arXiv:1303.3997.
- Li, H., Handsaker, B., Wysoker, A., Fennell, T., Ruan, J., Homer, N., Marth, G., Abecasis, G., & Durbin, R. (2009). The sequence alignment/map format and SAMtools. *Bioinformatics*, 25(16), 2078–2079.
- Luo, M., Ji, Y., Warton, D., & Yu, D. W. (2022). Extracting abundance information from DNA-based data. *Molecular Ecology Resources*, 23, 174–189. https://doi.org/10.1111/1755-0998.13703
- Lynggaard, C., Bertelsen, M. F., Jensen, C. V., Johnson, M. S., Frøslev, T. G., Olsen, M. T., & Bohmann, K. (2022). Airborne environmental DNA for terrestrial vertebrate community monitoring. *Current Biology*, 32, 701–707.e5.
- Lynggaard, C., Oceguera-Figueroa, A., Kvist, S., Gilbert, M. T. P., & Bohmann, K. (2022). The potential of aquatic bloodfeeding and nonbloodfeeding leeches as a tool for iDNA characterisation. *Molecular Ecology Resources*, 22(2), 539–553. https://doi. org/10.1111/1755-0998.13486
- Mantyka-Pringle, C. S., Visconti, P., Di Marco, M., Martin, T. G., Rondinini, C., & Rhodes, J. R. (2015). Climate change modifies risk of global biodiversity loss due to land-cover change. *Biological Conservation*, 187, 103–111.
- Massey, A. L., Bronzoni, R. V. M., da Silva, D. J. F., Allen, J. M., de Lázari, P. R., Dos Santos-Filho, M., Canale, G. R., Bernardo, C. S. S., Peres, C. A., & Levi, T. (2022). Invertebrates for vertebrate biodiversity monitoring: Comparisons using three insect taxa as iDNA samplers. *Molecular Ecology Resources*, 22(3), 962–977. https://doi. org/10.1111/1755-0998.13525
- Mata, V. A., Rebelo, H., Amorim, F., McCracken, G. F., Jarman, S., & Beja, P. (2019). How much is enough? Effects of technical and biological replication on metabarcoding dietary analysis. *Molecular Ecology*, 28(2), 165–175. https://doi.org/10.1111/mec.14779
- Morishima, K., Nakano, T., & Aizawa, M. (2020). Sika deer presence affects the host-Parasite interface of a Japanese land leech. *Ecology and Evolution*, 10(12), 6030–6038. https://doi.org/10.1002/ece3.6344
- Nguyen, L.-T., Schmidt, H. A., von Haeseler, A., & Minh, B. Q. (2014). IQ-TREE: A fast and effective stochastic algorithm for estimating maximum-likelihood phylogenies. *Molecular Biology and Evolution*, 32(1), 268–274. https://doi.org/10.1093/molbev/msu300
- Nguyen, T. V., Tilker, A., Nguyen, A., Hörig, L., Axtner, J., Schmidt, A., Le, M., Nguyen, A. H. Q., Rawson, B. M., Wilting, A., & Fickel, J. (2021). Using terrestrial leeches to assess the genetic diversity of

an elusive species: The Annamite striped rabbit Nesolagus timminsi. Environmental DNA, 3(4), 780–791.

- Peltzer, A., Jäger, G., Herbig, A., Seitz, A., Kniep, C., Krause, J., & Nieselt, K. (2016). EAGER: Efficient ancient genome reconstruction. *Genome Biology*, 17(1), 1–14.
- Port, J. A., O'Donnell, J. L., Romero-Maraccini, O. C., Leary, P. R., Litvin, S. Y., Nickols, K. J., Yamahara, K. M., & Kelly, R. P. (2016). Assessing vertebrate biodiversity in a kelp forest ecosystem using environmental DNA. *Molecular Ecology*, 25(2), 527–541.
- R Core Team. (2021). R: A language and environment for statistical computing. R foundation for statistical computing. Available from: https:// www.R-project.org/
- Rodgers, T. W., Xu, C. C., Giacalone, J., Kapheim, K. M., Saltonstall, K., Vargas, M., Somervuo, P., McMillan, W. O., & Jansen, P. A. (2017). Carrion fly-derived DNA metabarcoding is an effective tool for mammal surveys: Evidence from a known tropical mammal community. *Molecular Ecology Resources*, 17(6), e133–e145.
- Rondon, M. R., August, P. R., Bettermann, A. D., Brady, S. F., Grossman, T. H., Liles, M. R., Loiacono, K. A., Lynch, B. A., MacNeil, I. A., Minor, C., Tiong, C. L., Gilman, M., Osburne, M. S., Clardy, J., Handelsman, J., & Goodman, R. M. (2000). Cloning the soil metagenome: A strategy for accessing the genetic and functional diversity of uncultured microorganisms. *Applied and Environmental Microbiology*, *66*(6), 2541–2547. https://doi.org/10.1128/aem.66.6.2541-2547.2000
- Schnell, I. B., Bohmann, K., Schultze, S. E., Richter, S. R., Murray, D. C., Sinding, M.-H. S., Bass, D., Cadle, J. E., Campbell, M. J., Dolch, R., Edwards, D. P., Gray, T. N. E., Hansen, T., Hoa, A. N. Q., Noer, C. L., Heise-Pavlov, S., Pedersen, A. F. S., Ramamonjisoa, J. C., Siddall, M. E., ... Gilbert, M. T. P. (2018). Debugging diversity – A pan-continental exploration of the potential of terrestrial blood-feeding leeches as a vertebrate monitoring tool. *Molecular Ecology Resources*, 18(6), 1282–1298. https://doi.org/10.1111/1755-0998.12912
- Schnell, I. B., Sollmann, R., Calvignac-Spencer, S., Siddall, M. E., Douglas, W. Y., Wilting, A., & Gilbert, M. T. P. (2015). iDNA from terrestrial haematophagous leeches as a wildlife surveying and monitoring tool-Prospects, pitfalls and avenues to be developed. *Frontiers in Zoology*, 12(1), 1–14.
- Schnell, I. B., Thomsen, P. F., Wilkinson, N., Rasmussen, M., Jensen, L. R. D., Willerslev, E., Bertelsen, M. F., & Gilbert, M. T. P. (2012). Screening mammal biodiversity using DNA from leeches. *Current Biology*, 22(8), R262–R263. https://doi.org/10.1016/j.cub.2012.02.058
- Schubert, G., Stockhausen, M., Hoffmann, C., Merkel, K., Vigilant, L., Leendertz, F. H., & Calvignac-Spencer, S. (2015). Targeted detection of mammalian species using carrion fly-derived DNA. *Molecular Ecology Resources*, 15(2), 285–294.
- Seeber, P. A., McEwen, G. K., Löber, U., Förster, D. W., East, M. L., Melzheimer, J., & Greenwood, A. D. (2019). Terrestrial mammal surveillance using hybridization capture of environmental DNA from African waterholes. *Molecular Ecology Resources*, 19(6), 1486–1496.
- Sigsgaard, E. E., Jensen, M. R., Winkelmann, I. E., Møller, P. R., Hansen, M. M., & Thomsen, P. F. (2020). Population-level inferences from environmental DNA–Current status and future perspectives. *Evolutionary Applications*, 13(2), 245–262. https://doi.org/10.1111/ eva.12882
- Sigsgaard, E. E., Nielsen, I. B., Bach, S. S., Lorenzen, E. D., Robinson, D. P., Knudsen, S. W., Pedersen, M. W., Jaidah, M. A., Orlando, L., Willerslev, E., Møller, P. R., & Thomsen, P. F. (2016). Population characteristics of a large whale shark aggregation inferred from seawater environmental DNA. *Nature Ecology & Evolution*, 1(1), 1–5.
- Slon, V., Hopfe, C., Weiß, C. L., Mafessoni, F., de la Rasilla, M., Lalueza-Fox, C., Rosas, A., Soressi, M., Knul, M. V., Miller, R., Stewart, J. R., Derevianko, A. P., Jacobs, Z., Li, B., Roberts, R. G., Shunkov, M. V., de Lumley, H., Perrenoud, C., Gušić, I., ... Meyer, M. (2017). Neandertal and Denisovan DNA from Pleistocene sediments. *Science*, 356(6338), 605–608. https://doi.org/10.1126/scien ce.aam9695

- Taberlet, P., Bonin, A., Zinger, L., & Coissac, E. (2018). Environmental DNA: For biodiversity research and monitoring. Oxford University Press.
- Talavera, G., & Castresana, J. (2007). Improvement of phylogenies after removing divergent and ambiguously aligned blocks from protein sequence alignments. Systematic Biology, 56(4), 564–577.
- Taylor, P. G. (1996). Reproducibility of ancient DNA sequences from extinct Pleistocene fauna. *Molecular Biology and Evolution*, 13(1), 283–285.
- Wang, Y., Zhao, Y., Bollas, A., Wang, Y., & Au, K. F. (2021). Nanopore sequencing technology, bioinformatics and applications. *Nature Biotechnology*, 39(11), 1348–1365. https://doi.org/10.1038/s4158 7-021-01108-x
- Wickham, H. (2016). ggplot2: Elegant graphics for data analysis. Springer-Verlag.
- Wood, D. E., & Salzberg, S. L. (2014). Kraken: Ultrafast metagenomic sequence classification using exact alignments. *Genome Biology*, 15(3), 1–12.
- Yu, G., Smith, D. K., Zhu, H., Guan, Y., & Lam, T. T. Y. (2017). ggtree: An R package for visualization and annotation of phylogenetic trees with their covariates and other associated data. *Methods in Ecology and Evolution*, 8(1), 28–36.
- Zavala, E. I., Jacobs, Z., Vernot, B., Shunkov, M. V., Kozlikin, M. B., Derevianko, A. P., Essel, E., de Fillipo, C., Nagel, S., Richter, J., Romagné, F., Schmidt, A., Li, B., O'Gorman, K., Slon, V., Kelso, J., Pääbo, S., Roberts, R. G., & Meyer, M. (2021). Pleistocene sediment

DNA reveals hominin and faunal turnovers at Denisova cave. *Nature*, 595(7867), 399-403. https://doi.org/10.1038/s41586-021-03675-0

SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

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