**Research Article** 

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# Using DNA metabarcoding to investigate diet and niche partitioning in the native European otter (*Lutra lutra*) and invasive American mink (*Neovison vison*)

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# Abstract

In the UK, the native European otter (*Lutra lutra*) and invasive American mink (*Neovison vison*) have experienced concurrent declines and expansions. Currently, the otter is recovering from persecution and waterway pollution, whereas the mink is in decline due to population control and probable interspecific interaction with the otter. We explored the potential of DNA metabarcoding for investigating diet and niche partitioning between these mustelids. Otter spraints (n = 171) and mink scats (n = 19) collected from three sites (Malham Tarn, River Hull and River Glaven) in northern and eastern England were screened for vertebrates using high-throughput sequencing. Otter diet mainly comprised aquatic fishes (81.0%) and amphibians (12.7%), whereas mink diet predominantly consisted of terrestrial birds (55.9%) and mammals (39.6%). The mink used a lower proportion (20%) of available prey (n = 40 taxa) than the otter and low niche overlap (0.267) was observed between these mustelids. Prey taxon richness of mink scats was lower than otter spraints and beta diversity of prey communities was driven by taxon turnover (i.e. the otter and mink consumed different prey taxa). Considering otter diet only, prey taxon richness was higher in spraints from the River Hull catchment and beta diversity of prey communities was driven by taxon turnover (i.e. the otter and site). Studies using morphological faecal analysis may misidentify the predator as well as prey items. Faecal DNA metabarcoding can resolve these issues and provide more accurate and detailed dietary information. When scaled up across multiple habitat types, DNA metabarcoding should greatly improve future understanding of resource use and niche overlap between the otter and mink.

# **Key Words**

carnivore, faecal DNA, high-throughput sequencing, mustelid, predator-prey interactions, scats, spraints, trophic ecology

# Introduction

Dietary studies play a fundamental role in ecological research through revealing the feeding ecology of key species, the degree of resource overlap between species and reconstructing complex trophic networks (Martínez-Gutiérrez et al. 2015). Morphological faecal analysis is a common method used to infer diet composition, especially in vertebrates. For example, morphological identification of prey item components from faeces has frequently been used to understand feeding ecology and resource overlap in mustelid predators, such as the European otter (*Lutra lutra*) and American mink (*Neovison vison*) (Jędrzejewska et al. 2001; Bonesi et al. 2004; Melero et al. 2008). However, morphological faecal analysis can be time-consuming and accuracy hinges on possessing the neces-

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sary expertise to identify both the predator and its prey (Pompanon et al. 2012; Martínez-Gutiérrez et al. 2015; Traugott et al. 2020). Carnivore scats can be misidentified during field collection, with especially high error rates for sympatric species with morphologically-similar scats and low density carnivores whose scats are sparse (Davison et al. 2002; Akrim et al. 2018). Prey detection from predator faeces may be influenced by differential digestion of soft-bodied and hard-bodied prey, and variable gut transition times for different prey components (e.g. hair, feather, teeth, bones, scales, shell) and prey types (e.g. fish, amphibian, bird, mammal) (Carss and Parkinson 1996; Krawczyk et al. 2016; Nielsen et al. 2018). Digestion can be influenced by species identity, life stage and activity of predators, as well as environmental variables (King et al. 2008; McInnes et al. 2016; Traugott et al. 2020). Smaller prey are less likely to be recovered from faeces, prey components may be fragmented or damaged beyond recognition and prey components from related species can be morphologically similar. These issues individually or combined can prevent species-level identification for various taxa, especially fishes (e.g. closely related cyprinids) and birds (Britton et al. 2006, 2017; Shehzad et al. 2012a; Krawczyk et al. 2016; Berry et al. 2017; Smiroldo et al. 2019; Traugott et al. 2020).

Molecular tools offer a rapid, non-invasive, cost-efficient alternative to morphological faecal analysis for identification of predator and prey. Single or multiple prey species within a taxonomic group can be targeted using species- or group-specific DNA barcodes or prey species across multiple taxonomic groups can be assessed in parallel using generic DNA metabarcodes with high-throughput sequencing, i.e. DNA metabarcoding (Pompanon et al. 2012; McInnes et al. 2016; Traugott et al. 2020). DNA metabarcoding cannot provide information on cannibalism or size, life stage and vital status of prey taxa, and is not immune to retention of prey taxa due to differential digestion and gut transition times. Nonetheless, it perpetuates non-invasiveness and has greater sensitivity towards rare, soft, liquid or highly degraded prey items, for example, jellyfish in faeces of marine predators (Shehzad et al. 2012b; McInnes et al. 2017; Nielsen et al. 2018; Traugott et al. 2020). As such, DNA metabarcoding provides species resolution data at greater spatiotemporal scales for the vast majority of prey items, regardless of prey size, type and integrity or lack of hard components (Oehm et al. 2011; Pompanon et al. 2012; McInnes et al. 2017; Forin-Wiart et al. 2018; Traugott et al. 2020). Since its inception, DNA metabarcoding has been employed to assess the diet of various mammalian predators (Shehzad et al. 2012a, 2012b; De Barba et al. 2014; Berry et al. 2017; Gosselin et al. 2017; Forin-Wiart et al. 2018; Robeson et al. 2018; Schwarz et al. 2018) and recent small-scale studies have shown its potential for European otter (hereafter otter) diet analysis (Buglione et al. 2020; Martínez-Abraín et al. 2020).

Dietary niche characterisation of the otter is important as this is a keystone species and an apex predator of freshwater ecosystems in Europe. In the UK, the otter was common and widespread until the 18th century, after which the population declined sharply due to persecution, bioaccumulation of polychlorinated biphenyls (PCBs) and organochlorine pesticide poisoning, resulting in local extinctions over large tracts of its former range (Britton et al. 2006; McDonald et al. 2007; Harrington et al. 2009; Reid et al. 2013; Smiroldo et al. 2019). However, legal protection, pesticide bans, water quality and habitat improvement, and targeted otter releases since the 1980s allowed the species to recover (Bonesi and Macdonald 2004a; Britton et al. 2006; McDonald et al. 2007; Alderton et al. 2015; Martínez-Abraín et al. 2020). Conversely, the American mink (hereafter mink) was introduced from America to Europe for fur farming in the 1920s and became established in the wild and invasive across Europe following fur farm escapees and intentional releases (Bonesi and Macdonald 2004b; Reynolds et al. 2004; Bonesi and Palazon 2007; Harrington et al. 2009). In the UK, rapid countrywide spread of the mink has been documented since the 1950s (Bonesi and Macdonald 2004b; Reynolds et al. 2004). This mustelid has had acutely devastating effects on native UK biodiversity, including the European water vole (Arvicola amphibius) and ground-nesting seabirds (Bonesi and Macdonald 2004a, 2004b; Reynolds et al. 2004), due to direct predation. The species has also proven economically damaging, with poultry runs, gamebird rearing and fisheries all negatively affected by mink activity (Bonesi and Palazon 2007).

Initially, there was misplaced belief that the mink had contributed to the decline of the otter through competition due to simultaneous changes in distribution and abundance of these two mustelids (McDonald et al. 2007). However, studies on interspecific aggression and intraguild predation have shown that the otter is more likely to be the victor in encounters between these mustelids due to its larger body size, heavier weight and better swimming/ diving skills (Bonesi and Macdonald 2004a; Bonesi et al. 2004; Melero et al. 2008; Harrington et al. 2009). Furthermore, declines in mink site occupancy and density have been linked to otter recovery at fine and broad spatiotemporal scales (Bonesi and Macdonald 2004a; McDonald et al. 2007). The otter has been classed as a specialist or generalist predator, whereas the mink is typically considered to be an opportunist (Jędrzejewska et al. 2001; Bonesi and Macdonald 2004b; Melero et al. 2008; Almeida et al. 2012, 2013; Reid et al. 2013). Evidence indicates that the otter outcompetes the mink for aquatic prey, resulting in the mink seeking out terrestrial prey and undergoing a feeding niche shift where these mustelids are sympatric (Jędrzejewska et al. 2001; Bonesi et al. 2004; Melero et al. 2008; Harrington et al. 2009). Indeed, niche overlap between the otter and mink has been found to be lower in winter than spring, possibly due to restricted resources (Jędrzejewska et al. 2001; Bonesi et al. 2004). Additionally, both species have been found to consume different prey in response to water body type and size (Jędrzejewska et al. 2001). Co-existence of these two species is highly dependent on riparian habitat features and terrestrial prey availability, but dietary and spatial segregation of the otter and mink can eventually occur (Bonesi and Macdonald 2004a, 2004b; Harrington et al. 2009). It is unknown whether this niche partitioning may exacerbate mink predation of native and threatened UK biodiversity.

We assessed the potential of DNA metabarcoding for investigating dietary profiles of the native otter and invasive mink, and resource overlap between these mustelids. Otter spraints and mink scats were collected at three study sites across northern and eastern England: Malham Tarn, a calcareous upland lake in North Yorkshire; River Glaven, a lowland chalk stream in North Norfolk; and the River Hull, a chalk stream in East Yorkshire. DNA extracted from faecal matter was analysed for all vertebrate species using high-throughput sequencing. We hypothesised low resource overlap between the otter and mink. The otter was expected to predate a broad range of aquatic and semi-aquatic prey (i.e. fish, amphibians, waterfowl), whereas the mink was anticipated to specialise on semi-aquatic and terrestrial species (i.e. birds, mammals) as documented by studies that used morphological faecal analysis.

# Methods

### Study sites and sample collection

Mammal faeces were collected from 2015 to 2018 in northern and eastern England: River Hull catchment, East Yorkshire (sites along the river and ponds in close proximity to the river); Malham Tarn (lake) and Gordale Beck (stream close to Malham Tarn), West Yorkshire; and River Glaven catchment, Norfolk (sites along the river and ponds in close proximity) (Suppl. material 7: Fig. S1). Sample information, including collection date, coordinates and site, is provided in Suppl. material 6: Table S1. Faeces were ostensibly identified as otter spraints (n = 206), mink scats (n = 9) and red fox (Vulpes vulpes) scat (n = 1). The red fox scat was collected despite being a non-focal mammal predator due to potential predator misidentification using faecal characteristics. Faeces were collected using zip-lock bags or 50 ml falcon tubes (SARSTEDT, Germany, UK) and frozen at -20 °C until DNA extraction. For each site, a basic inventory of fishes was created from available survey data to permit a broad comparison between prey detected in otter spraints by DNA metabarcoding and available prey species (Suppl. material 1: Appendix 1). Fish survey (seine netting, electrofishing) data from 2000 to 2019 were extracted from the publicly available Environment Agency database (data.gov.uk) for the River Hull and River Glaven catchments. For the River Glaven, additional data were available from the surveys of Harwood et al. (2019) and Sayer et al. (2020). Fish community data for Malham Tarn were obtained through environmental DNA (eDNA) metabarcoding verified by fishery owners (Hänfling et al. 2020) and from fish surveys detailed in Eldridge (2016).

### **DNA** extraction

DNA was extracted from faeces using the DNeasy PowerSoil Kit (Qiagen, Hilden, Germany) or the Mu-DNA soil protocol with a tissue protocol wash stage (Sellers et al. 2018). Using a bleach and ultraviolet (UV) sterilised spatula and weigh boat (Merck, Darmstadt, Germany) for each sample,  $\approx 0.25$  g of faecal matter was measured out and added directly to pre-labelled PowerBead tubes for DNeasy PowerSoil extraction or 2 ml tubes (Starlab UK Ltd, UK) containing 0.5 g of 1-1.4 mm diameter sterile garnet beads (Key Abrasives Ltd., UK) for Mu-DNA extraction. Either 60 µl of Solution C1 (DNeasy PowerSoil) or 550 µl Lysis Solution and 200 µl Soil Lysis Additive (Mu-DNA) was added to each tube. Tubes were placed in a Qiagen TissueLyser (30 frequencies/min) for 10 min to homogenise the samples. Remaining steps were performed according to the DNeasy PowerSoil or Mu-DNA protocol. Eluted DNA (100 µl) concentration was quantified on a Qubit 3.0 fluorometer using a Qubit dsDNA HS Assay Kit (Invitrogen, UK). DNA extracts were stored at -20 °C prior to PCR.

### **DNA** metabarcoding

Samples were processed for DNA metabarcoding in two libraries. One library contained the samples from the River Hull catchment, collected between 2015 and 2017, while the other library contained samples from the River Hull, River Glaven and Malham Tarn collected in 2018. DNA metabarcoding followed the procedures established by Harper et al. (2019a) which are described in the Suppl. material 2: Appendix 2. Briefly, double-indexed libraries were constructed with a two-step PCR protocol which first used published primers 12S-V5-F (5'-ACTGGGATTAGATACCCC-3') and 12S-V5-R (5'-TAGAACAGGCTCCTCTAG-3') with modifications (i.e. indexes, heterogeneity spacers, sequencing primers and pre-adapters) to amplify a region of the 12S ribosomal RNA (rRNA) mitochondrial gene (Riaz et al. 2011). These primers have been validated in silico, in vitro and in situ for UK vertebrates (Hänfling et al. 2016; Harper et al. 2019a, 2019b). Exotic cichlid (Maylandia zebra) DNA  $(0.05 \text{ ng/}\mu\text{l})$  was the PCR positive control and sterile molecular grade water (Fisher Scientific UK Ltd, Loughborough, UK) was the PCR negative control. Three PCR replicates were performed for each DNA sample and pooled prior to normalisation.

Normalised sub-libraries were created by pooling PCR products according to band strength and PCR plate, and purified with Mag-BIND RxnPure Plus magnetic beads (Omega Bio-tek Inc, GA, USA) following a double size selection protocol (Bronner et al. 2009). PCR in duplicate bound pre-adapters, indexes and Illumina adapters to the purified sub-libraries, and PCR replicates were pooled for magnetic bead purification. Sub-libraries were quantified on a Qubit 3.0 fluorometer using a Qubit dsDNA HS Assay Kit and pooled proportional to sample size and concentration for magnetic bead purification. An Agilent 2200 TapeStation and High Sensitivity D1000 Screen-Tape (Agilent Technologies, CA, USA) were used to verify fragment size (330 bp) of the final libraries and absence of secondary product. The libraries were quantified using real-time quantitative PCR with the NEBNext Library Quant Kit for Illumina (New England Biolabs Inc., MA, USA) on a StepOnePlus Real-Time PCR system (Life Technologies, CA, USA) and diluted to 4 nM. Each library (one containing 125 faecal samples and eight PCR controls, and one containing 140 faecal samples, 12 PCR controls and 12 external samples) was sequenced at 12 pM with 10% PhiX Control v3 on an Illumina MiSeq using a MiSeq Reagent Kit v3 (600-cycle) (Illumina Inc., CA, USA).

Raw sequence reads were demultiplexed with a custom Python script. Sequences underwent quality trimming, merging, chimera removal, clustering and taxonomic assignment against our custom reference database for UK vertebrates (Harper et al. 2019b) using metaBEAT v0.97.11 (https://github.com/HullUni-bioinformatics/ metaBEAT). Taxonomic assignment used a lowest common ancestor approach, based on the top 10% BLAST matches for any query that matched a reference sequence across > 80% of its length at a minimum identity of 98%. Unassigned sequences were compared against the NCBI nucleotide (nt) database at 98% minimum identity using the same lowest common ancestor approach.

### Data analysis

Analyses were performed in the statistical programming environment R v.3.6.3 (R Core Team, 2020) unless otherwise stated. Data and R scripts have been deposited in the GitHub repository. Dataset refinement is summarised here and fully described in Suppl. material 2: Appendix 2. BLAST results from different databases were combined and spurious assignments were removed. Where applicable, orders, families and genera containing a single UK species were re-assigned to that species, species were re-assigned to domestic subspecies, and misassignments were corrected. The read counts for metaBEAT and manual assignments were merged prior to application of a sequence threshold (i.e. maximum sequence frequency of cichlid DNA in faecal samples) to mitigate against contamination and false positives in the dataset (Suppl. material 8: Fig. S2 and Suppl. material 9: Fig. S3). After applying the false positive threshold (1.123%), taxonomic assignments above species-level were removed with exceptions (Suppl. material 2: Appendix 2). Human (Homo sapiens) and domestic animals (cow [Bos taurus], dog [Canis lupus familiaris] and pig [Sus scrofa domesticus]) were regarded as environmental contaminants and also removed for the purposes of downstream analyses.

Using Microsoft Excel, each faecal sample was assigned to a mammal predator, based on the proportional read counts for each predator species (otter, mink, red fox and European polecat [*Mustela putorius*]) detected (Suppl. material 3: Appendix 3). In cases where DNA from multiple predators was present, the sample was assigned to the predator species which possessed more than 90% of the total predator read counts. If no predator species possessed more than 90% of the total predator read counts in a sample or a sample contained less than 100 reads for all predators, the sample was removed from the dataset. After predator assignment, the total percentage of prey (by vertebrate group) sequences, relative to predator sequences, was evaluated across all samples belonging to each predator in R (otter and mink) or Microsoft Excel (red fox and European polecat; Suppl. material 4: Appendix 4). Using R, all predator reads and samples belonging to red fox (hereafter fox) and European polecat (hereafter polecat) were then removed for downstream analyses.

In R, the data for otter and mink samples were summarised as the total percentage of prey sequences for each vertebrate group, proportional read counts for each prey taxon in each sample, and the percentage frequency of occurrence (i.e. the percentage of faecal samples that a prey taxon was detected in). The read count data were converted to presence/absence using the DECOSTAND function in the package vegan v2.5-6 (Oksanen et al. 2018). We used the package bipartite v2.15 (Dormann et al. 2009) to construct a semi-quantitative trophic network for each predator and their prey. Network-level metrics were obtained using the NETWORKLEVEL function and species-level metrics for each predator obtained using the SPECIESLEVEL function. Taxon richness (alpha diversity) was obtained using the SPECNUMBER function in the package vegan v2.5-6. Given that the data were not normally distributed (Shapiro-Wilk normality test: W = 0.921, P < 0.001) and the number of samples between predators and sampling locations was unbalanced, Kruskal-Wallis tests followed by Dunn's tests, from the packages stats v3.6.3 and FSA v0.8.30 (Ogle et al. 2020), respectively, were used to compare alpha diversity of prey communities between otter and mink faecal samples and between otter spraints from different sites. Data for the mink and each freshwater habitat were too sparse for examination of geographic variation in mink diet and differences in otter and mink diet with regard to habitat (Suppl. material 10: Fig. S4). We used the package iNEXT v2.0.20 (Hsieh et al. 2016) to perform rarefaction and extrapolation curves to ensure that differences in prey taxon richness were not driven by imbalances in sample size for predators and sampling locations. The INEXT function was run using incidence frequencies for prey taxa with 300 samples, 60 knots, 1000 bootstraps and 95% confidence intervals. The ESTIMATED function was used to perform both sample size-based and coverage-based comparisons between predators and sampling sites (otter only) with 95% confidence intervals and 95% sample coverage (coverage-based comparison only).

Before partitioning beta diversity, we compared prey community dissimilarity inferred from occurrence (i.e. presence/absence) and relative read abundance (RRA; i.e. proportional read counts) data. Using the package vegan v2.5-6, the read count data were converted to presence/absence and proportional read count matrices using the DECOSTAND function. Jaccard and Bray-Curtis dissimilarity indices were computed for the presence/absence and proportional read counts matrices, respectively, using the VEGDIST function and beta diversity was visualised using Non-metric Multidimensional Scaling (NMDS) with the METAMDS function. Two outlier samples containing one or two taxa were removed to improve visualisation of variation in otter and mink diet (LIB02-TL01 [mink] and LIB02-TL07 [otter]) and site variation in otter diet (LIB02-TL07 and LIB04-TL57), but patterns produced by occurrence and RRA data were comparable (Suppl. material 11: Fig. S5). Given that our stringent false positive sequence threshold should have removed any minor prey items, secondary predation and contaminants, we used occurrence data with Jaccard dissimilarity for beta diversity partitioning to mitigate potential taxon recovery bias (Deagle et al. 2018).

We employed the package betapart v1.5.1 (Baselga and Orme 2012) to estimate total beta diversity, partitioned by turnover (i.e. community dissimilarity due to taxon replacement) and nestedness-resultant (i.e. community dissimilarity due to taxon subsets), with the BETA.MULTI (multiple-site dissimilarities) and BETA. PAIR (pairwise dissimilarity matrices) functions. For each component of beta diversity, we compared community heterogeneity in faecal samples grouped by predator (otter or mink) or site of otter spraint collection (Malham Tarn, River Glaven, River Hull) by calculating homogeneity of multivariate dispersions (MVDISP) using the BETADISPER function from the package vegan v2.5-6. Variation in MVDISP between otter and mink samples or between otter spraints from different sites was statistically tested using ANOVA. Differences in prey communities for each component of beta diversity were visualised using NMDS with the METAMDS function and tested statistically using permutational multivariate analysis of variance (PERMANOVA) with the function ADONIS in the package vegan v2.5-6. Pre-defined cut-off values were used for effect size, where PERMANOVA results were interpreted as moderate and strong effects if  $R^2 >$ 0.09 and  $R^2 > 0.25$ , respectively. These values are broadly equivalent to correlation coefficients of r = 0.3 and 0.5 which represent moderate and strong effects accordingly (Nakagawa and Cuthill 2007). All figures were produced using the package ggplot2 v3.3.1 (Wickham 2009), except Figure 4 which was produced in Microsoft Power-Point. Legends for Figures 1–3 were adjusted using Inkscape (http://www.inkscape.org/).

### Data accessibility

Raw sequence reads have been archived on the NCBI Sequence Read Archive Study: SRP270831;

BioProject: PRJNA644190; BioSamples: SAMN15452877-SAMN15453005 [Library 1] and SAMN15455442-SAMN15455596 [Library 2]; SRA accessions: SRR12168859-SRR12168984 [Library 1] and SRR12176017-SRR12176170 [Library 2]). Jupyter notebooks, R scripts and corresponding data have been deposited in a dedicated GitHub repository, which has been permanently archived (https://doi.org/10.5281/zenodo.4282231).

# Results

# **Data filtering**

The libraries generated a total of 22,286,976 and 40,074,340 raw sequence reads, respectively, which were reduced to 9,487,780 and 14,362,257 reads by trimming, merging and length filter application. After removal of chimeras and redundancy via clustering, 9,340,695 and 14,153,929 reads remained (average read count of 72,408 and 86,304 per sample including controls), of which 9,244,260 (98.97%) and 13,909,558 (98.27%) were assigned a taxonomic rank. Contamination from different sources was observed in the PCR controls (Suppl. material 8: Fig. S2) as well as cichlid DNA in the faecal samples. No cichlid DNA remained in the faecal samples after application of the false positive sequence threshold and taxonomic assignments were narrowed (Suppl. material 9: Fig. S3). Before threshold application, we detected 127 taxa from 216 faecal samples, including six amphibian taxa, 43 fish taxa, 36 bird taxa and 41 mammal taxa. However, 61 taxa (including two amphibian taxa, 20 fish taxa, 17 bird taxa and 21 mammal taxa) were consistently detected below our threshold and were therefore removed from the dataset. The final dataset after threshold application and refinement of taxonomic assignments contained 46 taxa (38 assigned to species-level): three amphibians, 19 fishes, 13 birds and 11 mammals.

#### **Predator assignment**

Thirteen faecal samples contained less than 100 reads for any mammal predator and were removed from the dataset. In most of the remaining samples, DNA from a single predator comprised 100% of the total predator read counts (otter: n = 169; mink: n = 17; fox: n = 5; polecat: n = 1). Four samples with read counts for multiple predator species were assigned to a predator species based on a majority rule, i.e. the predator species possessed > 90% of the total predator read counts (otter: n = 2; mink: n = 2). Seven samples were discarded because a confident predator assignment could not be made, i.e. no predator possessed > 90% of the total predator read counts. Consequently, the refined dataset contained 171 otter, 19 mink, five fox and one polecat faecal sample(s). For 90.82% of samples that were retained (n = 196), predator assignment was in agreement with visual identification of faeces. Predator assignment in 18 samples (9.18%) changed based on DNA metabarcoding. Fox and polecat diet is reported in Suppl. material 5: Appendix 5.

# Otter and mink diet

Otter DNA and mink DNA encompassed 31.1% and 48.0%, respectively, of reads obtained from faecal samples belonging to these mustelids (Fig. 1). Using the prey reads, otter diet was mainly composed of fishes (81.0%) and amphibians (12.7%), whereas mink diet predominantly consisted of birds (55.9%) and mammals (39.6%) (Fig. 1).

The bipartite trophic network for the otter and mink contained 40 prey species (Fig. 2), of which eight were predated by both mustelids: bream (*Abramis brama*), European bullhead (*Cottus gobio*), three-spined stickleback (*Gasterosteus aculeatus*), ducks (*Anas spp.*), Eurasian coot (*Fulica atra*), common moorhen (*Gallinula chloropus*), starling (*Sturnus vulgaris*) and water vole (*Arvicola amphibius*) (Figs 2, 3). Notably, occurrence of mink predation on bream (5.26%), duck species (10.53%), Eurasian coot (15.79%), common moorhen (5.26%), starling (15.79%) and water vole (15.79%) was more frequent than occurrence of otter predation on these species



Figure 1. Pie charts showing the proportion of total reads retained in the refined dataset that belonged to the otter and mink with respect to their vertebrate prey and the proportion of prey reads that belonged to different vertebrate groups.



**Figure 2.** A bipartite trophic network showing the prey of the otter and mink. The black blocks on the right column represent the predators and the coloured blocks in the left column represent the prey taxa. Detected predation events are indicated by lines that connect a predator with a prey taxon and the number of events is proportional to the thickness of the line. Prey taxa are coloured according to vertebrate group and different shades of blue indicate fish size category.

(2.92%, 5.85%, 1.75%, 4.09%, 0.59% and 0.59%, respectively) (Fig. 3). Network-level metrics indicated some degree of specialisation (specialisation index H2' = 0.628), with few prey interactions for each predator (generality = 14.333) and a low proportion of possible interactions realised in the network (weighted connectance = 0.184), leading to few shared prey species between otter and mink (niche overlap = 0.267).

Species-level metrics for each predator provide further evidence for predator specialisation within the network. Both predators' diets were relatively specialised (Paired Differences Index: otter = 0.893, mink = 0.812), but mink diet showed greater divergence from random selections of prey species (d': otter = 0.526, mink = 0.671), with a lower proportion of available resources utilised (proportional similarity: otter = 0.962, mink = 0.209; unused resource range: otter = 0.128, mink = 0.692). However, resources within each predators' diet were used relatively evenly, with neither species relying predominantly on a few key resources (species specificity index: otter = 0.287, mink = 0.267). Shannon diversity of predator-prey interactions was higher for the otter than the mink (partner diversity: otter = 2.672, mink = 2.449), suggesting that mink diet was less diverse. Only 13 prey species were detected in mink scats compared with 35 prey species in otter spraints (Figs 2, 3).

Prey species unique to the mink were brown hare (Lepus europaeus), Microtus spp., water shrew (Neomys fodiens), European rabbit and brown rat (Rattus norvegicus), but many fishes and amphibians were unique to the otter (Figs 2, 3 and Suppl. material 12: Fig. S6). Otter predation events largely involved common frog (Rana temporaria) and small, abundant fishes, such as European bullhead, stone loach (Barbatula barbatula), three-spined stickleback and ninespine stickleback (Pungitius pungitius), with predation on medium (e.g. crucian carp [Carassius carassius], roach [Rutilus rutilus], Percidae spp.) and large (e.g. European eel [Anguilla anguilla], Northern pike [Esox lucius]) fishes occurring less frequently (Fig. 3 and Suppl. material 12: Fig. S6). At each site, all fishes detected by DNA metabarcoding of otter spraints had also been recorded during recent surveys (conducted between 2000 and 2019) that used conventional fish monitoring tools or eDNA metabarcoding (Fig. 4). However, some fishes detected during previous surveys of the River Glaven (n =9), River Hull (n = 8) and Malham Tarn (n = 1) were not found with faecal DNA metabarcoding (Fig. 4).

Two otter and two mink samples did not contain any prey taxa and were removed from the dataset for alpha and beta diversity analyses. Predator influenced alpha diversity of faecal samples ( $\chi^2_1 = 22.786$ , p < 0.001), with taxon richness of mink scats significantly lower (Z = -4.773, p < 0.001) than that of otter spraints (Fig. 5a). Rarefaction and extrapolation curves indicated that lower prey taxon richness of mink scats was not due to disparities in sample size between predators. Prey taxon richness began to



Figure 3. Barplot showing the occurrence percentage of prey taxa in mink and otter samples collected from different sites. Bars are coloured according to vertebrate group and different shades of blue indicate fish size category. Numbers above bars represent the number of samples where prey taxa were detected.



Figure 4. Venn diagrams showing fish species belonging to different size categories that were detected by DNA metabarcoding of otter spraints (blue circles) or fish surveys (white circles) at A Malham Tarn, B River Glaven, and C River Hull.

plateau at 21 taxa with 95 or more mink scats. In contrast, prey taxon richness did not plateau even with 300 otter spraints, at which 42 taxa would be detected (Fig. 5bi). Over 1100 otter spraints would be required for prey taxon richness to begin to plateau at 51 taxa. With our present sample size, we achieved 98.1% and 76.9% sample coverage for the otter and mink, respectively (Fig. 5bii). To achieve 95% sample coverage for the mink, we would



**Figure 5.** Summaries of alpha and beta diversity comparisons made between otter (purple points/ellipses) and mink (green points/ ellipses) faecal samples: **A** boxplot showing the number of prey taxa detected in mink and otter samples, **B** rarefaction/extrapolation (R/E) curves produced for otter spraints and mink scats using iNEXT (Hsieh et al. 2016) and **C** Non-metric Multidimensional Scaling (NMDS) plots of prey communities from otter and mink faecal samples for each beta diversity component. Letters denote significance, where different letters indicate a statistically significant difference in taxon richness. Boxes show 25<sup>th</sup>, 50<sup>th</sup> and 75<sup>th</sup> percentiles and whiskers show 5<sup>th</sup> and 95<sup>th</sup> percentiles.

Table 1. Summary	v of analyses st	atistically comp	paring homog	eneity of m	ultivariate	dispersions	between prey	com	munities	in otte	r
and mink faecal sam	mples (ANOVA	A), and variation	in prey com	nunity com	position of	otter and min	nk faecal samp	oles (l	PERMAN	JOVA)	).

	Homogeneity of multivariate dispersions (ANOVA)				Community similarity (PERMANOVA)				
	Mean distance to	df	F	Р	df	F	$R^2$	Р	
	$centroid \pm SE$								
Turnover		1	7.316	0.008	1	5.587	0.030	0.001	
Otter	$0.516\pm0.031$								
Mink	$0.636 \pm 0.003$								
Nestedness-resultant		1	0.018	0.895	1	-3.097	-0.017	0.915	
Otter	$0.107 \pm 0.014$								
Mink	$0.103 \pm 0.006$								
Total beta diversity		1	6.401	0.012	1	4.274	0.023	0.001	
Otter	$0.574 \pm 0.014$								
Mink	$0.651 \pm 0.001$								

need an additional 37 mink scats (54 total). Despite the disparities in sample size, it is unlikely that the mink would consume more prey taxa than the otter (Fig. 5biii).

Beta diversity of both otter and mink faecal samples was largely driven by turnover (otter: 99.51%; mink: 98.90%) as opposed to nestedness-resultant (otter: 0.49%; mink: 1.10%). MVDISP was different between predators for turnover and total beta diversity, where mink scats had significantly higher dispersion than otter spraints, but not nestedness-resultant (Table 1). Predator had a weak positive influence on the turnover (Fig. 5ci) and total beta diversity (Fig. 5ciii) of prey communities, but not nestedness-resultant (Fig. 5cii; Table 1). Therefore, prey items consumed by the otter were fundamentally different taxa to prey items consumed by the mink, resulting in dissimilar prey community composition.

# Geographic variation in otter diet

Of 171 otter spraints, 25 came from Malham Tarn, 36 came from the River Glaven and 110 came from the River Hull. Two samples (one each from Malham Tarn

and the River Glaven) were removed from the dataset for alpha and beta diversity analyses as they did not contain any prey taxa. Site influenced alpha diversity of otter spraints ( $\chi^2_2 = 21.876$ , p < 0.001), where otter spraints from Malham Tarn (Z = -3.029, adjusted p[Benjamini-Hochberg] = 0.004) and the River Glaven (Z = -4.116, adjusted p [Benjamini-Hochberg] < 0.001) exhibited lower taxon richness than spraints from the River Hull. Taxon richness in otter spraints from Malham Tarn and the River Glaven did not significantly differ (Z = 0.439, adjusted p [Benjamini-Hochberg] = 0.661) (Fig. 6a).

Rarefaction and extrapolation curves indicated that lower prey taxon richness of Malham Tarn and River Glaven otter spraints was not due to disparities in sample size between sites. Prey taxon richness began to plateau at 10 and 16 taxa with 53 and 54 otter spraints from Malham Tarn and the River Glaven, respectively. In contrast, prey taxon richness did not plateau for the River Hull, even with 300 otter spraints, at which 34 taxa would be detected (Fig. 6bi). Over 1100 otter spraints from the River Hull would be required for prey taxon richness to begin to plateau at 44 taxa. With our present sample size, we achieved 95.2%, 95.5%, and 98.4% sample coverage for Malham Tarn, the River Glaven and the River Hull, respectively (Fig. 6bii). Therefore, we achieved at least 95% sample coverage for all sites. Despite the disparities in sample size, it is unlikely that the otter would consume more prey taxa at Malham Tarn or the River Glaven than the River Hull (Fig. 6biii).

Beta diversity of otter samples from all sites was largely driven by turnover (Malham Tarn: 86.91%; River Glaven: 98.41%; River Hull: 99.24%) as opposed to nestedness-resultant (Malham Tarn: 13.09%; River Glaven: 1.59%; River Hull: 0.76%). MVDISP was different between sites for turnover, nestedness-resultant and total beta diversity, where samples from the River Glaven and River Hull had greater dispersion than samples from Malham Tarn (Table 2). Site had a moderate positive influence on turnover (Fig. 6ci) and weak positive influence on turnover (Fig. 6cii) of prey communities, but not nestedness-resultant (Fig. 6cii; Table 2). Therefore, prey taxa consumed by otters at a given site were replaced by different prey taxa at other sites.



**Figure 6.** Summaries of alpha and beta diversity comparisons made between otter samples collected from Malham Tarn (grey points/ellipses), River Glaven (yellow points/ellipses) and River Hull (blue points/ellipses): A boxplot showing the number of prey taxa detected in samples from each site, **B** rarefaction/extrapolation (R/E) curves produced for otter spraints from Malham Tarn, the River Glaven and the River Hull using iNEXT (Hsieh et al. 2016) and **C** Non-metric Multidimensional Scaling (NMDS) plots of prey communities in samples from each site for each beta diversity component. Letters denote significance, where different letters indicate a statistically significant difference in taxon richness. Boxes show 25<sup>th</sup>, 50<sup>th</sup> and 75<sup>th</sup> percentiles and whiskers show 5<sup>th</sup> and 95<sup>th</sup> percentiles.

**Table 2.** Summary of analyses statistically comparing homogeneity of multivariate dispersions between prey communities in otter samples from different sites (ANOVA), and variation in prey community composition of otter samples from different sites (PER-MANOVA).

	Homogeneity of multivariate dispersions (ANOVA)				Community similarity (PERMANOVA)				
	Mean distance to	df	F	Р	df	F	$R^2$	Р	
	centroid ± SE								
Turnover		2	22.620	< 0.001	2	10.668	0.115	0.001	
Malham Tarn	$0.220 \pm 0.042$								
River Glaven	$0.516 \pm 0.031$								
River Hull	$0.491\pm0.035$								
Nestedness-resultant		2	11.263	< 0.001	2	-13.730	-0.201	1.000	
Malham Tarn	$0.234\pm0.028$								
River Glaven	$0.079 \pm 0.012$								
River Hull	$0.117 \pm 0.015$								
Total beta diversity		2	23.358	< 0.001	2	7.819	0.087	0.001	
Malham Tarn	$0.343\pm0.052$								
River Glaven	$0.564 \pm 0.018$								
River Hull	$0.560\pm0.015$								

# Discussion

We have demonstrated that DNA metabarcoding of otter and mink faeces using vertebrate-specific primers is suitable for dietary assessment and could be applied to other vertebrate carnivores. We identified a wide range of fish, amphibians, birds and mammals, all of which were plausible prey items of the otter and mink due to previous species records from each study site. Incorporation of this molecular tool into future dietary assessments for the native otter and invasive mink will enhance our understanding of niche separation between these mustelids.

### **Predator assignment**

In our study, nearly 10% of scats were misidentified visually and corrected based on predator reads from DNA metabarcoding. Thirteen mink, four fox and one polecat sample(s) were misidentified as otter spraints. Although collector experience likely influenced this error rate, collectors had received training and most had substantial experience of scat collection for otter diet studies. Similarly, Harrington et al. (2010) found that 75 scats identified as mink by experienced field surveyors actually belonged to pine marten (Martes martes), fox, otter, polecat or stoat (Mustela erminea) using DNA barcoding. Scat misidentification can lead to inclusion of prey species consumed by non-focal predators and omission of prey species consumed by the focal predator(s) in dietary assessments, which could have detrimental implications for species conservation and/or management (Martínez-Gutiérrez et al. 2015; Akrim et al. 2018). Therefore, DNA barcoding (Davison et al. 2002; Harrington et al. 2010; Shehzad et al. 2012a, 2012b; Akrim et al. 2018) or DNA metabarcoding (Berry et al. 2017; Forin-Wiart et al. 2018) should be used to identify scats where possible.

The presence of predator DNA is double-edged and can also complicate DNA metabarcoding. Scats from mammalian carnivores can include intact DNA from hairs ingested during grooming (Carss and Parkinson 1996; Shehzad et al. 2012a; Reid et al. 2013) and from intestinal mucosa cells of the defecating predator (Oehm et al. 2011). This can lead to faecal samples being swamped by predator DNA and masking of degraded prey DNA, resulting in reduced detection probability (Shehzad et al. 2012b; Piñol et al. 2015; Robeson et al. 2018; Forin-Wiart et al. 2018; Traugott et al. 2020). This issue can sometimes be alleviated by adding consumer-specific blocking primers (Shehzad et al. 2012a, 2012b; De Barba et al. 2014; Robeson et al. 2018), but potential drawbacks include co-blocking of closely related prey taxa, an increased number of sequencing artefacts, and alteration of compositional dietary profiles (Shehzad et al. 2012b; Piñol et al. 2014, 2015; McInnes et al. 2016; Robeson et al. 2018). In our study, otter and mink DNA was present in faecal samples at moderate frequencies (31% and 48% of reads, respectively), but did not swamp prey DNA pools acquired for these predators. Higher frequencies of predator DNA were observed in the few fox and polecat samples, but samples still contained a sufficient number of prey reads for reliable identification. Balanced prey and predator DNA in faecal samples is a prerequisite for high detection probability of prey species as well as reliable predator identification, and raises the possibility of using faecal DNA for genotyping individual predators (Bayerl et al. 2017).

# Otter diet

Our finding that otter diet mainly consisted of fish (81.1%), followed by amphibians (12.7%), birds (5.9%) and mammals (0.5%) is consistent with the results of morphological analyses that visually identified prey remains in spraints or stomachs (Jędrzejewska et al. 2001; Clavero et al. 2003; Britton et al. 2006; Reid et al. 2013; Krawczyk et al. 2016; Lanszki et al. 2016). For example, in comparable habitats of the Pannonian biogeographical region, Lanszki et al. (2016) found similar relative occurrence frequencies of fish (82.9%), amphibians (5.1%), reptiles (0.6%), birds (6.7%), mammals (1.0%), crayfish (1.4%) and other invertebrates (2.3%) in otter spraints from rivers, and fish (81.6%), amphibians (7.7%), reptiles (0.8%), birds (2.6%), mammals (1.3%), crayfish (0.4%) and other invertebrates (5.8%) in otter spraints from ponds using morphological analysis. Overall, our results indicate that there was a significant difference in prey community composition of otter spraints at species-level across sites, suggesting that otter diet is highly situational and determined by local variation in prey availability. This is consistent with the wide variety of dietary profiles for the otter reported by previous morphological studies (Ruiz-Olmo et al. 2001; Britton et al. 2006, 2017; Remonti et al. 2010; Reid et al. 2013; Krawczyk et al. 2016; Lanszki et al. 2016). Our results are also in agreement with faecal DNA metabarcoding studies of otter diet. Both Buglione et al. (2020) and Martínez-Abraín et al. (2020) found fish were the primary food resource for otters, followed by amphibians. Specifically, Cyprinidae, Gobidae, Salmonidae and Percidae were the predominant prey taxa.

Otter diet and fish assemblages in the River Glaven catchment have been extensively studied (Zambrano et al. 2006; Sayer et al. 2011; Almeida et al. 2012, 2013; Champkin et al. 2017). Non-fish species found using morphological spraint analysis included common frog, common toad, grass snake (Natrix natrix), common moorhen, Eurasian coot, little grebe (Tachybaptus ruficollis), mallard (Anas platyrhynchos) and water vole (Almeida et al. 2012, 2013). We found that DNA metabarcoding detected all of these species from at least one study site, except for the grass snake and little grebe. Several fishes were previously detected by morphological spraint analysis or fish surveys but not by DNA metabarcoding, including stone loach, gudgeon (Gobio gobio), ninespine stickleback, ruffe (Gymnocephalus cernua), Lampetra spp., European flounder (Platichthys flesus), rudd (Scardinius erythrophthalmus), common bream, goldfish (Carassius auratus) and common carp (Cyprinus carpio). The common carp and ruffe were initially detected by DNA metabarcoding in agreement with previous morphological studies (Zambrano et al. 2006; Sayer et al. 2011; Almeida et al. 2012; Sayer et al. 2020), but removed by our false positive sequence threshold. Other fishes, while not detected in the River Glaven spraints, were nonetheless detected in spraints from the River Hull or Malham Tarn. The common bream may not have been detected by DNA metabarcoding, as this species was last recorded in 1999 by fish surveys at low abundance in one lake (Zambrano et al. 2006). Nondetections of common species in the River Glaven, such as the stone loach and brook lamprey (Lampetra planeri), may be due to technical bias that can occur throughout the DNA metabarcoding workflow (see Considerations for molecular scatology).

The range expansion of the otter into Malham Tarn occurred recently in 2009 and only two individuals have established themselves at the site thus far. Non-fish species found using morphological spraint analysis included common frog, common toad, mallard, tufted duck (*Aythya fuligula*), gull (Laridae spp.), pheasant (*Phasianus colchicus*) and rook (*Corvus frugilegus*) (Alderton et al. 2015). Using DNA metabarcoding, we detected common frog, Anas spp. and Laridae spp. in Malham Tarn spraints, and common toad and Aythya spp. in River Hull spraints. Fishes detected using morphological spraint analysis or fish surveys included European bullhead, brown trout (Salmo trutta), stone loach, perch and three-spined stickleback. Only brown trout was not detected by DNA metabarcoding at this study site. Large brown trout tend to be open-water feeders in Malham Tarn, whereas juvenile trout reside in the inflow and outflow streams (Eldridge 2016). Absence of brown trout in spraints may reflect a low preference for feeding in open water areas due to the high energy expenditure required to hunt in these habitats in this relatively large lake (Lanszki et al. 2001). In contrast, the European bullhead and stone loach are associated with shoreline cobble-boulder habitats at Malham Tarn, as are small perch (Eldridge 2016). Therefore, habitat associations may explain detection and nondetection of fishes in otter spraints (Lanszki et al. 2001; Alderton et al. 2015).

To our knowledge, no information on otter diet in the River Hull catchment has been published, although research is ongoing (Hänfling et al. unpublished data). Otter diet was most diverse at this site compared to the River Glaven and Malham Tarn, reflecting the higher fish diversity present in this river system. Previous fish surveys of the River Hull using electrofishing or eDNA metabarcoding recorded the same species identified by DNA metabarcoding of otter spraints, except common dace (*Leuciscus leuciscus*), common barbel (*Barbus barbus*), common carp, European chub (*Squalius cephalus*) and tench (*Tinca tinca*). Common carp, common barbel and European chub were all detected in otter spraints prior to false positive threshold application, but common dace and tench went undetected.

Notwithstanding nondetections at each site, DNA metabarcoding identified species at higher taxonomic resolution than morphological analysis can provide or which morphological identification may miss entirely. Sequences were assigned to common frog and common toad with DNA metabarcoding, whereas amphibian remains are rarely identified to species-level with morphological spraint analysis (Smiroldo et al. 2019). Bird and small mammal remains are typically unidentifiable or, at least, challenging to identify, with morphological analysis (Britton et al. 2006; Alderton et al. 2015), yet DNA metabarcoding recorded water vole, common waterfowl (Anas spp., Aythya spp., Eurasian coot, common moorhen), waders (Tringa spp.), gulls (Laridae spp.) and cormorant (Phalacrocorax carbo), as well as a number of terrestrial birds, including starling, red-legged partridge (Alectoris rufa), stock dove (Columba oenas), Eurasian jay (Garrulus glandarius) and pheasant. Species-level identification based on morphology is often achievable for smaller fishes (e.g. stickleback species, European bullhead) as otters consume the entire fish resulting in presence of bones in spraints. However, otters only consume selected pieces of flesh and internal organs from larger fishes (e.g. cyprinids, salmonids) and frequently abandon the remainder as an unfinished meal (Almeida et al. 2013). Low occurrence of hard prey components from larger fish in otter spraints may prevent morphological identification, especially of closely-related cyprinids (e.g. common carp, goldfish, crucian carp and their hybrids) which have similar scales. This does not pose an issue for DNA metabarcoding, so detection may be improved with molecular scatology.

Despite the regional differences in otter diet, some common dietary patterns emerged. The otter has been reported to selectively predate slow-moving and smaller prey (Chanin 1981; Martínez-Abraín et al. 2019, 2020), with diet reflecting both species and size composition of fish communities occupying their territory. Consistent with previous morphological studies of the River Glaven and Malham Tarn (Almeida et al. 2012; Alderton et al. 2015), we found that otters primarily consumed slow-moving, small species, with less frequent predation on larger species. The European bullhead was the most commonly consumed species at all three study sites. This small benthic species tends to utilise camouflage over escape movements and it is clear that this strategy may not be effective for avoiding capture by the otter. Additionally, it is possible that the otter has developed unique capture behaviour with regards to the European bullhead. Malham Tarn observational work indicated that otters exhibited vigorous rolling and thrashing behaviours in shallow rocky water, presumably to reveal European bullhead presence when hidden amongst cobble-boulder structures (Alderton et al. 2015). Other small, littoral and benthic species with similar characteristics, such as three-spined stickleback, ninespine stickleback and stone loach, were also amongst the most frequently consumed species. Capture of these species might require very little energy expenditure by the otter, even relative to their size, whereas larger, faster fish provide more energy, but require more energy to catch and a longer handling time (Remonti et al. 2010; Martínez-Abraín et al. 2019). Therefore, smaller fishes that can be consumed whole are often preferred, although habitat conditions and fish abundance also play a role (Ruiz-Olmo et al. 2001; Britton et al. 2006, 2017; Remonti et al. 2010; Krawczyk et al. 2016; Lanszki et al. 2016; Martínez-Abraín et al. 2019). European bullhead and stickleback species are common at all three of our study sites (Sayer et al. 2011, 2020; Almeida et al. 2012, 2013; Alderton et al. 2015; Champkin et al. 2017; Harwood et al. 2019; Hänfling et al. unpublished data), thus their frequent occurrence in spraints may simply reflect their high abundance in the environment.

Some medium-sized species were also consumed frequently where they were common, such as the European perch in the River Hull catchment and Malham Tarn, and the crucian carp in the River Glaven catchment, a frequent species in farmland ponds (Sayer et al. 2011, 2020). Conversely, other medium-sized or large species which are abundant at our study sites, such as brown trout, common dace, roach and European eel, seemed to be under-represented in spraints. The fish size categories used here are based on average adult sizes and therefore may not fully explain under-representation of these species. Most of these species (apart from the European eel) are fast-swimming, open water species, even as juveniles. As such, their capture might require more energy than that of benthic and littoral species. Molecular data cannot reveal the size of individual fish consumed, but morphological spraint analysis has repeatedly shown that small-sized individuals are preferred. For example, a study in southwest England showed that European eels of 180 to 270 mm and cyprinids and salmonids of 40 to 130 mm were preferred over larger specimens (up to 440 mm) (Britton et al. 2006). Yet, otters preferred fish weighing between 500-1000 g in a fish pond and streams in the Lake Balaton catchment in Hungary (Lanszki et al. 2001). More detailed quantitative data on fish abundance in the environment are required to distinguish prey selection from density-dependent predation. Indeed, small and benthic species are often under-reported in conventional fish surveys, but recent eDNA metabarcoding studies have shown that these species might be much more abundant than previously thought (Hänfling et al. 2016; Li et al. 2019; Griffiths et al. 2020).

Amphibians are an important secondary food resource for otters, comprising up to 43% (average 12%) of otter diet in a meta-analysis of 64 morphological studies conducted across Europe (Smiroldo et al. 2019). Seasonal peaks in otter predation of amphibians tend to coincide with amphibian reproduction in spring and reduced fish availability in winter (Sidorovich 2000; Lanszki et al. 2001; Britton et al. 2006; Prigioni et al. 2006; Reid et al. 2013; Almeida et al. 2013; Alderton et al. 2015; Smiroldo et al. 2019). In our study, occurrence frequency of amphibians in otter diet was on par with previous estimates, particularly the common frog and common toad (Jędrzejewska et al. 2001; Clavero et al. 2003; Smiroldo et al. 2019). This was likely due to a high abundance of anurans in ponds next to the River Glaven, River Hull and Malham Tarn. We also found evidence of predation on the great crested newt (Triturus cristatus), but detections were negated by our stringent false positive threshold. We did not find any reptiles, but otter predation of the grass snake in the River Glaven catchment has been recorded by morphological spraint analysis (Almeida et al. 2012). Our study re-affirmed that birds and mammals are of tertiary importance to the otter and these predation events are probably opportunistic (Chanin 1981; Lanszki et al. 2001; Jędrzejewska et al. 2001; Clavero et al. 2003; Prigioni et al. 2006; Krawczyk et al. 2016).

### Mink diet

Published diet assessments for the mink are modest in comparison to the otter. In our study, mink diet was dominated by birds (55.9%) and mammals (39.6%) with only a small component of fish (4.5%). A morphological study in the Biebrza Wetlands of Poland also observed that more mammals (43.7%), fish (32.9%) and birds (21.5%) than amphibians (1.9%) and invertebrates (0.1%) were consumed by the mink in a harsh winter, yet the importance

of mammals (68.8%), amphibians (27.2%), birds (1.2%), fish (2.7%) and invertebrates (0.1%) shifted in a mild winter (Skierczyński and Wiśniewska 2010). These results and our own somewhat contrast with other estimates obtained using morphological analyses. Across the Palaearctic region, the mink on average consumed mostly fish (31.9%) and small mammals (25.4%), supplemented by birds (16.2%), amphibians (11.9%), crustaceans (11.0%) and other invertebrates (2.9%) (Jedrzejewska et al. 2001), but consumption varies with location. For example, in woodland streams and rivers of Poland, mink diet was dominated by fish (spring-summer: 40%; autumn-winter: 10%), amphibians (spring-summer: 32%; autumn-winter: 51%) and mammals (spring-summer: 21%; autumn-winter: 36%) (Jędrzejewska et al. 2001). In the Lovat River of Belarus, mink diet was composed of amphibians (ranging from 14-72%, mean 37%) and small mammals (4-80%, mean 27%), supplemented by fish and crayfish (Sidorovich 2000). Despite these overall differences in mink diet, individual prey items found in morphological studies were also identified here, including three-spined stickleback, duck species, Eurasian coot, common moorhen, starling, bank vole, water shrew, brown rat and European rabbit (Chanin 1981; Jędrzejewska et al. 2001; Bonesi et al. 2004; Bonesi and Macdonald 2004b; Melero et al. 2008; Harrington et al. 2009). Importantly, we also identified the water vole in mink scats which is an endangered species in the UK (Mathews and Harrower 2020).

The molecular assay used here does not target invertebrates, but previous morphological studies have shown that these taxa, especially crayfish, can constitute a substantial proportion of otter (average 11.2%) and mink (average 13.9%) diet depending on the biogeographical region studied (Jędrzejewska et al. 2001; Lanszki et al. 2016). For example, the native white-clawed crayfish (Austropotamobius pallipes) and invasive signal crayfish (Pacifastacus leniusculus) occurred at a frequency of 8.7-25% in otter spraints from the River Glaven catchment (Almeida et al. 2012). The otter and mink may consume more arthropods and molluscs, which are of low energetic value, when fish composition and abundance changes (Clavero et al. 2003; Bonesi et al. 2004). Typical prey species include Gammarus pulex, Asellus aquaticus, Dytiscus spp., white-clawed crayfish, signal crayfish and the invasive red swamp crayfish (Procambarus clarkii) (Carss and Parkinson 1996; Lanszki et al. 2001; Jędrzejewska et al. 2001; Britton et al. 2006; Melero et al. 2008; Almeida et al. 2012, 2013; Reid et al. 2013; Alderton et al. 2015; Martínez-Abraín et al. 2020), but smaller invertebrates could be instances of secondary predation. Future diet assessments for the otter and mink using DNA metabarcoding should also target invertebrates and investigate their role in niche partitioning between these mustelids.

#### Niche partitioning between the otter and mink

Our network analysis indicated that the otter used more available resources than the mink and mink diet was less diverse. This is consistent with many other morphological studies which conclude that the otter is a generalist (Prigioni et al. 2006; Remonti et al. 2010) or an opportunist, whose diet varies with prey availability and latitude (Clavero et al. 2003; Almeida et al. 2012, 2013; Reid et al. 2013; Alderton et al. 2015), although it has also been called a specialist with respect to its diet being limited to aquatic prey, such as fish and amphibians (Sidorovich 2000; Bonesi et al. 2004; Bonesi and Macdonald 2004b; Melero et al. 2008; Skierczyński and Wiśniewska 2010; Krawczyk et al. 2016). Conversely, the mink has been observed to utilise both aquatic and terrestrial resources (Sidorovich 2000; Jędrzejewska et al. 2001; Bonesi et al. 2004; Bonesi and Macdonald 2004b; McDonald et al. 2007; Brzeziński et al. 2008; Melero et al. 2008; Skierczyński and Wiśniewska 2010). Results from previous morphological studies (Harrington et al. 2009) and presented here suggest that the mink specialises on terrestrial prey when co-existing with the otter.

With the caveat of a small sample size, we found low niche overlap (0.267) between the otter and mink in our study, which may be indicative of interspecific competition. Mink have been found to consume less fish and more birds and mammals in areas where otters were present, while the otter predominantly consumed fish and amphibians (Chanin 1981; Jędrzejewska et al. 2001; Bonesi et al. 2004; Melero et al. 2008; Harrington et al. 2009). High niche overlap between the mink and otter was found in Poland (Jędrzejewska et al. 2001) and Belarus (Sidorovich 2000), whereas low niche overlap was observed in northeast Spain (Melero et al. 2008) using morphological analysis. Niche overlap may vary by geographic region and with predator density, prey composition, season and environmental conditions (e.g. habitat, weather). In Belarus, higher niche overlap was identified in spring and autumn than summer or winter due to greater availability and consumption of amphibians by both the otter and mink (Sidorovich 2000). In Poland, higher niche overlap was found in spring-summer than autumn-winter (Jedrzejewska et al. 2001), in harsh winter conditions as opposed to mild winter conditions, and in a wetland complex compared to a river catchment (Skierczyński and Wiśniewska 2010). In the UK, Bonesi et al. (2004) found niche overlap between the otter and mink decreased following an increase in otter density and establishment of a resident population, and niche overlap was lower in winter than spring possibly due to resource restrictions. The majority of faecal samples in our study were collected in spring 2015 and autumn 2018 and our results suggest that niche partitioning between the otter and mink may occur year-round.

Importantly, our study was of small geographic extent and analysed few mink scats relative to otter spraints. Across the UK, the native otter is recovering and the subject of ongoing conservation efforts, whereas the invasive mink has declined due to eradication programmes, ongoing control measures and interspecific aggression from the otter. Therefore, otter spraints are much more abundant and easily sampled than mink scats. Upscaled investigations of otter and mink faeces, collected from different freshwater habitats across all seasons, are needed to improve understanding of resource use and niche overlap in these mustelids. Despite these limitations, our findings, combined with those of previous morphological studies, indicate that niche partitioning, through dietary and spatial segregation, between the otter and mink is probable in areas where these mustelids are sympatric and there is an abundance of aquatic and terrestrial resources (Chanin 1981; Bonesi et al. 2004; Bonesi and Macdonald 2004b; Brzeziński et al. 2008; Melero et al. 2008; Harrington et al. 2009). Evidently, the otter and mink can co-exist, thus natural biological control of the invasive mink by the native otter will be insufficient on its own to reduce populations of the former. Continued deployment of artificial control methods will be required to eradicate the mink, but biological control can aid these efforts and promote conservation of species impacted by mink activity (Bonesi and Macdonald 2004a, 2004b; Melero et al. 2008; Harrington et al. 2009).

## Considerations for faecal DNA metabarcoding

Bias stemming from choices made throughout the DNA metabarcoding workflow can produce false positive and false negative detections. Scats collected in the field may originate from relatively few individuals and samples may not be independent (Carss and Parkinson 1996). In the context of our study, male otters have relatively large home ranges (up to 40 km along the length of a river) and return to the same feeding sites (Kruuk 2006). Many of the otter spraints collected from the River Hull catchment may originate from the same territorial male (known from photographs taken by wildlife enthusiasts and trail cameras along the River Hull) that has been present for the last 10 years. Therefore, future DNA metabarcoding studies should include genotyping (Bayerl et al. 2017) and sex-specific markers (Schwarz et al. 2018) to obtain information on identity and sex of predators. This will avoid pseudoreplication (Carss and Parkinson 1996) and provide insights into individual and intersexual variation in diet (Schwarz et al. 2018). Concerning otters, this will also provide information on the communicatory role of sprainting (Kean et al. 2015).

After deposition, scats may be exposed to abiotic and biotic factors that can influence their integrity as well as prey DNA degradation, including temperature (i.e. heat and dehydration), rainfall, UV exposure, coprophagous insects, microbial activity and decomposition (Carss and Parkinson 1996; Davison et al. 2002; King et al. 2008; Harrington et al. 2010; Oehm et al. 2011; McInnes et al. 2016). Scats may remain in the environment for days or weeks before collection, thus scat freshness is key (Davison et al. 2002; King et al. 2014; McInnes et al. 2016). Scats should ideally be collected when an animal is observed defecating, but proxies for freshness include moisture, odour, colour and consistency (King et al. 2008; McInnes et al. 2016). Scats deposited

on vegetation and soil were also found to have lower prey diversity than those deposited on rock or plastic, which may be related to inhibitory compounds present and microbial activity in soil or non-target DNA, for example, plants, fungi (Oehm et al. 2011; McInnes et al. 2016). In our study, 13 faecal samples (12 otter and one mink according to field identification) failed to produce enough reads for predator assignment and dietary analyses, and another four (two otter, two mink) did not contain any prey taxa. This may be related to freshness or substrate or these samples may have been deposited by individuals that were fasting due to territorial defence, prey availability, dispersal, pregnancy, rearing young or limited mobility (McInnes et al. 2016). Future investigations should assess the influence of scat freshness, substrate and fasting in the otter and mink on prey detection.

Back in the laboratory, DNA extraction may influence prey detection probabilities, including sample coverage, the protocol used (e.g. commercial vs. modular, designed for faeces vs. other substrates) and its efficiency (King et al. 2008; Harrington et al. 2010; Oehm et al. 2011). As prey DNA can be non-uniform in predator faecal samples, it may be necessary to subsample or homogenise faeces for DNA extraction (Gosselin et al. 2016) to prevent failed samples. Mustelid scats also contain a number of volatile organic compounds that can be problematic for DNA extraction and PCR (Sellers et al. 2018; Traugott et al. 2020). Both the Qiagen DNeasy PowerSoil Kit and Mu-DNA soil protocols used here were demonstrated to produce high purity DNA yields from otter spraints suitable for PCR amplification (Sellers et al. 2018). However, we cannot rule out the possibility of DNA degradation or co-extraction of humic substances, phenolic compounds and proteins in the 13 failed samples. The quality and quantity of prey DNA may be further enhanced by performing extraction replicates for each sample and passing the lysate for each through one spin column or sequencing each independently (King et al. 2008). Extraction, PCR and sequencing replication also allow occupancy modelling to identify potential false positives arising from secondary predation or contamination and to estimate species detection probabilities (Ficetola et al. 2015).

Secondary predation has been documented in morphological studies of otter spraints and stomachs, where smaller fish consumed by directly predated larger fish inflate prey diversity and bolster the relative importance of small fish as a resource (Carss and Parkinson 1996; Britton et al. 2006), but may be more pronounced in DNA metabarcoding studies due to the greater sensitivity of PCR amplification (Sheppard et al. 2005; King et al. 2008; Pompanon et al. 2012). Secondary predation is challenging to identify in predators that feed on resources at multiple trophic levels and can affect the inferences made from dietary assessments (Sheppard et al. 2005; Traugott et al. 2020). High sensitivity of DNA metabarcoding also facilitates amplification of contaminants present at minimal concentrations, originating from the environment (e.g. water swallowed with prey, substrate collected with faeces) or the laboratory (King et al. 2008; Pompanon et al. 2012; De Barba et al. 2014; Nielsen et al. 2018; Traugott et al. 2020). Despite physical separation of pre-PCR and post-PCR processes and common preventative measures for contamination (cleaning workspaces and equipment with 10% bleach solution, filter tips, UV irradiation of plastics and reagents) (King et al. 2008; Pompanon et al. 2012; Traugott et al. 2020), we observed faecal samples were contaminated with our positive control DNA. Error during PCR and sequencing, such as primer mismatch (Piñol et al. 2018) and "tag jumps" (Schnell et al. 2015), can give rise to false positives, cross-contamination between samples or laboratory contamination (Pompanon et al. 2012). We employed a stringent false positive sequence threshold, which removed false positives from secondary predation or contamination, but also removed potential prey species for the otter and mink that have been reported in previous morphological and metabarcoding studies, for example, great crested newt (Smiroldo et al. 2019), goldfish (Martínez-Abraín et al. 2020), common carp (Britton et al. 2006; Almeida et al. 2012) and common barbel (Ruiz-Olmo et al. 2001; Britton et al. 2017). This highlights the importance of minimising contamination for lower sequence thresholds and enhanced detection of prey taxa occurring at lower frequencies.

# Conclusions

We have demonstrated the potential of faecal DNA metabarcoding for investigation of diet and niche separation in mustelids, as well as predator identification. Despite associated biological and technical challenges, DNA metabarcoding can enhance dietary insights and trophic networks to enable more effective conservation and management of predators and the resources on which they depend. Upscaled, year-round studies on the native otter and invasive mink that screen an equal number of faecal samples for each predator across broader spatial scales, including different freshwater habitats and environmental gradients (e.g. water quality, land-use), will further advance our understanding of resource use and niche overlap in these mustelids. Combining faecal DNA metabarcoding with eDNA metabarcoding of the associated fish fauna will provide further opportunities for more detailed study of prey selection and dietary preferences.

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### Supplementary material 1 Appendix 1: Fish inventory

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Species occurrence

Explanation note: Microsoft Excel spreadsheet detailing the basic inventory of fishes created from available survey data to permit a broad comparison between prey detected in otter spraints by DNA metabarcoding and available prey species. The full website for the Environment Agency database used is: https://data.gov.uk/dataset/f49b8e4b-8673-498e-bead-98e6847831c6/freshwater-fish-counts-for-all-species-all-areas-and-all-years.

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### Supplementary material 2 Appendix 2: Methods

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Supplementary Methods

Explanation note: Details of DNA metabarcoding workflow and dataset refinement.

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#### Supplementary material 3 Appendix 3: Predator assignment

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Sequence read counts

Explanation note: Microsoft Excel spreadsheet used to identify the mammal predator for each faecal sample based on the proportional predator read counts. Mammal predator read counts in each sample were summed, and the proportional read counts for each predator species were calculated from the total predator read counts.

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### Supplementary material 4

## Appendix 4: Samples from non-focal mammal predators

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Sequence read counts

Explanation note: Microsoft Excel spreadsheet used to analyse red fox (*Vulpes vulpes*) and European polecat (*Mustela putorius*) samples. The total percentage of prey (by vertebrate group) sequences relative to predator sequences was evaluated across all samples belonging to each predator.

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### Supplementary material 5

### Appendix 5: Non-focal mammal diet

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Supplementary results

Explanation note: Results of faecal DNA metabarcoding for red fox (*Vulpes vulpes*) and European polecat (*Mustela putorius*). Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licens-es/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited. Link: https://doi.org/10.3897/mbmg.4.56087.suppl5

### Supplementary material 6 Table S1

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Table

Explanation note: Sample information, including collection date, coordinates, and site, made available as an excel spreadsheet.

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### Supplementary material 7

### Figure S1

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Figure

Explanation note: Maps showing sampling locations across the UK and at each study site: **A** UK, **B** Malham Tarn, West Yorkshire, **C** River Hull catchment, East Yorkshire, and **D** River Glaven catchment, Norfolk. Mammal predator for each sample based on spraint morphology upon collection is represented by different shapes. 'Inadequate' samples refer to samples that had

<100 reads for any mammal predator. 'Multiple' samples refer to samples that contained reads belonging to multiple mammal predators.

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# Supplementary material 8

# Figure S2

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Figure

Explanation note: Heatmap showing the frequency of contamination in PCR negative controls (molecular grade water) and PCR positive controls (*Maylandia zebra*). Assignments that were not detected in a PCR control are represented by white tiles with no border.

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## **Supplementary material 9**

## Figure S3

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

# Data type: Figure

Explanation note: Heatmaps showing proportional read counts for taxa found in faecal samples before and after false positive sequence threshold application. Taxa that were removed by the false positive threshold are highlighted with an asterisk. The PCR positive control (*Maylandia zebra*) was not found in any faecal samples after threshold application. Taxa that were not detected in a sample are represented by white tiles with no border. Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited. Link: https://doi.org/10.3897/mbmg.4.56087.suppl9

#### Supplementary material 10 Figure S4

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Figure

Explanation note: Boxplot of prey taxon richness for each predator according to site and waterbody where faecal samples were collected. Boxes show 25th, 50th, and 75th percentiles, and whiskers show 5th and 95th percentiles.

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# Supplementary material 11

# Figure S5

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Figure

Explanation note: Plots summarising three-dimensional Non-metric Multidimensional Scaling (NMDS) of prey communities from otter and mink faecal samples based on: A occurrence data (Jaccard dissimilarity), and **B** relative read abundance data (Bray-Curtis dissimilarity). Data were analysed including all faecal samples (i) and excluding extreme outliers (ii). Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited. Link: https://doi.org/10.3897/mbmg.4.56087.supp111

#### Supplementary material 12 Figure S6

Authors: Lynsey R. Harper, Hayley V. Watson, Robert Donnelly, Richard Hampshire, Carl D. Sayer, Thomas Breithaupt, Bernd Hänfling

Data type: Figure

Explanation note: Heatmap showing proportional read counts for prey taxa detected in otter and mink faeces. Tile borders are coloured according to vertebrate group. Taxa that were not detected in a faecal sample are represented by white tiles with no border. Copyright notice: This dataset is made available under the Open Database License (http://opendatacommons.org/licenses/odbl/1.0/). The Open Database License (ODbL) is a license agreement intended to allow users to freely share, modify, and use this Dataset while maintaining this same freedom for others, provided that the original source and author(s) are credited.

Link: https://doi.org/10.3897/mbmg.4.56087.suppl12