Species in the faeces: DNA metabarcoding as a method to determine the diet of the endangered yellow-eyed penguin

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S1. Known prey from previous yellow-eyed penguin stomach flushing studies

Table S1. Chordate and cephalopod taxa (identified to species or genus) in the diet of yellow-eyed penguins (*Megadyptes antipodes*) resident on the Otago coast, New Zealand, identified via stomach flushing by van Heezik (1990a) and Moore and Wakelin (1997), and by DNA metabarcoding in this study. *indicates previously identified taxa might have occurred at a lower resolution than genus in this study (see *S4*). Taxa classified in the current study were accepted following manual curation to confirm geographical plausibility, as indicated by the curation notes below, after computational filtering. [§]indicates if the geographically plausible congener (i.e. a congener found within the known foraging range of adult yellow-eyed penguins (i.e. waters adjacent Canterbury, Otago, Southland, sub-Antarctic breeding areas), according to Roberts *et al.* 2015) was found in the reference database. Red text indicates geographically implausible taxa, which were excluded from the results.

Prey taxa identified in current and previous yellow-eyed penguin diet studies	Species/genus present in DNA DNA reference reference origin database		Diagnostic accuracy (this study)	Previously detected by stomach flushing	Curation notes	Geographically plausible congeners found within the known foraging range of adult yellow-eyed penguins
Chordata						
Āhuru Auchenoceros punctatus	Present	This study	Species	Y	а	None
Barracouta/manga Thyrsites atun	Present	GenBank	Species	Y	а	None
Barred grubfish Parapercis sp.	Present	GenBank	Genus	N	d	P. colias [§] P. gilliesii
Blue cod/rāwaru Parapercis colias	Present	This study	Species	Y	с	P. gilliesii
Blue grenadier/hoki Macruronus novaezelandiae	Present	GenBank	Not detected	Y	NA	NA
Blue warehou/warehou kahurangi Seriolella brama	Present	GenBank	Species	Y	с	S. punctata [§] S. caerulea [§]
Bream Tylochromis leonensis	Present	GenBank	Species	N	f	Unknown
Common triplefin/kokopara Forsterygion lapillum	Present	GenBank	Species	Y	c	F. capito F. flavonigrum F. gymnotum F. malcolmi F. nigripenne F. varium
Gudgeon/kuraihana Grahamichthys radiata	Absent	NA	NA	Y	NA	NA
Hake/tīkati Merluccius australis	Present	GenBank	Not detected	Y	NA	NA
Hector's lanternfish Lampanyctodes hectoris	Present	GenBank	Not detected	Y	NA	NA
Jackass morwong/tarakihi Nemadactylus macropterus	Present	GenBank	Not detected*	Y	NA	NA
Lamprey/piharau Geotria australis	Absent	NA	NA	Y	NA	NA
Leatherjacket/kokiri Meuschenia scaber	Present	GenBank	Not detected	Y	NA	NA

Lemon sole/pātiki	Present	GenBank	Not detected	Y	NA	NA
Pelotretis flavilatus	Flesent	Genbalik	Not detected	-	INA	INA
Ling/hokarari Genypterus blacodes	Present	GenBank	Species	Y	g	None
Long-snouted pipefish Stigmatopora macropterygia	Absent	NA	NA	Y	NA	NA
Morid cod Lepidion sp.	Present	GenBank	Genus	N	d	L. microcephalus L. schmidti
Mother-of-Pearl pipefish Vanacampus margaritifer	Present	GenBank	Species	N	f	Unknown
Slender opalfish/kohikohi Hemerocoetes artus	Present	This study	Genus	Y	h	H. monopterygius [§] H. morelandi [§] H. pauciradiatus H. macropthalmus
New Zealand sand diver Tewara cranwellae	Absent	NA	NA	Y	NA	NA
New Zealand banded wrasse Notolabrus fucicola	Present	GenBank	Species	Ν	с	N. celidotus N. cinctus
New Zealand blueback sprat/kupae Sprattus antipodum	Present	GenBank	Species	Y	b	S. muelleri [§]
New Zealand sole/tarore Peltorhamphus novaezeelandiae	Present	GenBank	Not detected	Y	NA	NA
New Zealand sprat/kupae Sprattus muelleri	Present	GenBank	Species	Y	b	S. antipodum [§]
Opalfish/kohikohi Hemerocoetes monopterygius	Present	This study	Genus	Y	h	H. artus [§] H. morelandi [§] H. pauciradiatus H. macropthalmus
Pigfish/purumorua Congiopodus sp.	Present	This study	Genus	Ν	h	C. leucopaecilus [§] C. coriaceus [§]
Rattail Coelorinchus aspercephalus	Present	GenBank	Species	Y	c	C. biclinozonalis C. bollonsi [§] C. fasciatus [§] C. innotabilis [§] C. kaiyomaru [§] C. oliverianus [§] C. parvifasciatus [§] C. trachycarus
Red baitfish Emmelichthys nitidus	Present	GenBank	Species	Ν	а	None
Red cod/hoka Pseudophycis bachus	Present	GenBank	Species	Y	b	P. barbata [§]
Jock Stewart Helicolenus percoides	Present	GenBank	Not detected*	Y	NA	NA
Ribaldo Mora moro	Present	GenBank	Species	N	а	None
Rock fish Sebastes sp.	Present	GenBank	Genus	N	j	Unknown
Rock cod Lotella rhacina	Present	GenBank	Not detected	Y	NA	NA
Salps Thaliacea sp.	Absent	NA	NA	Y	NA	NA
Sandfish Gonorynchus gonorynchus	Present	This study	Not detected	Y	NA	NA
Scarlet wrasse Pseudolabrus miles	Present	GenBank	Species	N	а	None
Scorpionfish/rarai Scorpaena cardinalis	Absent	NA	NA	Y	NA	NA
Seachub Medialuna californiensis	Present	GenBank	Species	N	f	Unknown
		1				

Short-finned eel/tuna	Present	GenBank	Not detected	Y	NA	NA	
Anguilla australis	Present	Genbalik	Not detected	T	NA	NA	
Short-snouted pipefish Lissocampus filum	Absent	NA	NA	Y	NA	NA	
Silver conger	Absent	NA	NA	Y	NA	NA	
Gnathophis habenatus Silver warehou/warehou hiriwa Seriolella punctata	Present	GenBank	Genus	Y	NA	S. brama [§] S. caerulea [§]	
Silverside Argentina elongata	Present	This study	Species	Y	а	None	
Smelt/paraki Retropinna retropinna	Present	GenBank	Not detected	Y	NA	NA	
Southern bastard cod Pseudophycis barbata	Present	GenBank	Species	N	b	P. bachus [§]	
Southern blue whiting Micromesistius australis	Present	GenBank	Species	N	е	None	
Snipefish Macroramphosus scolopax	Present	GenBank	Species	N	а	None	
Spiny gurnard Lepidotrigla sp.	Present	GenBank	Genus	N	d	L. brachyoptera L. robinsi	
Stargazer/pūwhara Kathetostoma giganteum	Present	GenBank	Species	Y	с	K. binigrasella	
Violet cod Antimora rostrata	Present	GenBank	Species	Species N a		None	
Violet warehou Schedophilus velaini	Present	GenBank	Species	N	j	Unknown	
· · · ·		Cephalopo	oda	•	•		
Arrow squid/wheketere Nototodarus sloanii	Present	GenBank	Genus	Y	с	N. gouldi	
Greater hooked squid/ngū Moroteuthopsis ingens	Present	GenBank	Species	Y	а	None	
Knobby argonaut/ pūpū tarakihi Argonauta nodosa	Present	GenBank	Species	N	с	A. argo	
Octopus/wheke Macroctopus maorum	Present	GenBank	Genus	Y	а	None	
Pacific bobtail squid Sepioloidea pacifica	Absent	NA	NA	Y	NA	NA	
Yellow octopus/wheke Enteroctopus sp.	Present	GenBank	Genus	N	а	E. zealandicus	
Arthropoda							
Squillid shrimp Heterosquilla sp.	Absent	NA	NA	Y	NA	NA	
Krill Nyctiphanes australis	Absent	NA	NA	Y	NA	NA	

Curation notes for Table S1

- **a.** Geographically plausible species selected by the naïve-Bayes classifier and monotypic in their genus in New Zealand's exclusive economic zone (EEZ). *Listed by species.*
- **b.** All geographically plausible species and congeners found in New Zealand's EEZ were selected by the naïve-Bayes classifier. *Listed by species.*
- **c.** Geographically plausible species selected by the naïve-Bayes classifier, but not all geographically plausible New Zealand congeners found within the known foraging range of adult yellow-eyed penguins were accounted for in the reference database. *Listed by species.*
- **d.** Geographically implausible species selected by the naïve-Bayes classifier and not all geographically plausible New Zealand congeners found within the known foraging range of adult yellow-eyed penguins were accounted for in the reference database. *Listed by genus.*
- e. Geographically implausible species selected by the naïve-Bayes classifier, but the genus is geographically plausible, and contains only one species in New Zealand's EEZ. *Listed by species.*
- f. Geographically implausible species selected by the naïve-Bayes classifier with no known New Zealand congeners. *Removed from results. Listed by species, in red.*
- **g.** Geographically plausible genus selected by the naïve-Bayes classifier, and the genus contains only one species in New Zealand's EEZ. *Listed by species.*
- **h.** Geographically plausible genus manually classified from validated reference material. *Listed by genus.*
- i. Geographically plausible genus selected by the naïve-Bayes classifier but grouped separately from one or more geographically plausible New Zealand congeners identified by the classifier. *Listed by genus.*
- **j.** Geographically plausible genus selected by the naïve-Bayes classifier, but recent change to or questionable taxonomy. *Listed by genus.*

S2. Occurrence and within-sample filtering of taxa

As we had used a conservative filtering approach to limit false positives and to include only those samples with >2000 reads, we opted not to impose a third filter as an arbitrary within-sample read threshold for individual taxa. Any taxa that were left after the complete filtering process were considered as being present if they were represented by at least one read. This decision was made to ensure comparability to previous stomach flushing studies, wherein a single left or right otolith might have indicated the presence of a species in yellow-eyed penguin diet, provided the otolith was not eroded (van Heezik 1990, Moore and Wakelin 1997). We note that DNA metabarcoding has a similar temporal window to stomach flushing (1-4d; Deagle *et al.* 2010), therefore we expected that some taxa will have less reads than others within a sample, due to prey size, digestion efficiency, and differential digestion. In addition, we presented diet information at the highest taxonomic rank possible, therefore imposing a within-sample filter based on a percentage of the number of reads within each sample would result in a significant reduction in %FOO because of the larger number of taxa differentiated, compared to studies where a lower taxonomic rank, and thus fewer taxonomic groups were determined (e.g. identification to Class, Cavallo *et al.* 2018).

To give an indication of the sensitivity of our data to within-sample filtering, we present a range of filter options to arbitrarily limit %FOO. In Table S2, we indicate the differences in %FOO of the top ten ray-finned fishes, using a variety of within-sample filters: (a) excluding observations <10 reads per taxon within each sample was applied; (b) excluding observations using a threshold of <0.1% of all reads per sample, and; (c) excluding observations using a threshold of <1.0% of all reads per sample.

Table S2. Frequency of occurrence (%FOO) of the top ten ray-finned fish taxa detected in the diet of yellow-eyed penguins using DNA metabarcoding in this study. Subsequent within-sample filtering (excluding <10 reads per taxon within each sample, or excluding a taxon from a sample if the number of reads <0.1% - <1.0% of the sample's total) was not applied to the Results to ensure comparability with previous stomach flushing studies.

Ray-finned fish taxa	Common name	%FOO (this study)	%FOO excluding <10 reads	%FOO excluding <0.1% reads	%FOO excluding <1.0% reads
Parapercis colias	Blue cod/rāwaru	100.0	98.4	97.9	93.3
Hemerocoetes sp.	Opalfish/kohikohi	98.4	96.4	95.9	80.3
Argentina elongata	Silverside	90.7	83.9	82.9	57.5
Congiopodus sp.	Pigfish/purumorua	76.2	71.5	67.4	40.4
Seriolella brama	Blue warehou/warehou kahurangi	62.2	54.9	54.9	29.5
Emmelichthys nitidus	Red baitfish	62.2	56.0	52.8	21.2
Pseudophycis bachus	Red cod/hoka	61.1	56.0	53.9	30.1
Sprattus antipodum	Blueback sprat/kupae	47.7	45.6	42.0	21.2
Auchenoceros punctatus	Āhuru	21.2	17.1	17.1	7.8
Sprattus muelleri	New Zealand sprat/kupae	18.1	16.6	15.0	5.7

S3. Sequence analysis according to sample type and age class

Chordates

Following PCR using chordate primers, 218 processed samples had visible amplicons (n_{visamp} , Table S3), indicating that amplified DNA was present in 69.6% of all samples collected. Computational filtering to optimise species richness based on alpha rarefaction curves and exclusion of spurious species resulted in 193 processed samples that contained >2000 target ray-finned fish DNA sequences ($n_{>A2000}$), representing 61.7% of all samples collected and 88.5% of processed samples that contained target prey DNA sequences following PCR (Table S4.1). We detected a difference in the proportions of samples that were retained ($\chi^2 = 2.94$, df = 3, $\alpha = 0.05$, p = 0.4), with just 71.1% of fresh samples from adults being retained after computational filtering.

Cephalopods

Following PCR using cephalopod primers, 106 samples containing visible amplicons remained after computational filtering ($n_{>72000}$), indicating that amplified DNA was present in 33.9% of all samples collected. As cephalopods were filtered differently, based on the *a priori* understanding of the smaller contribution cephalopods make to yellow-eyed penguin diet compared to ray-finned fishes (van Heezik 1990a; Moore and Wakelin 1997), the number of processed samples that contained cephalopod DNA sequences after computational filtering was reduced to 48/106, representing 15.3% of all samples collected (Table S3). We detected no difference in the proportions of samples containing cephalopod DNA that were retained (χ^2 = 33.2, df = 3, α = 0.05, p < 0.01). The proportion of processed samples that were retained after computational filtering were lowest for fresh samples compared to latrines.

Table S3. Yellow-eyed penguin faecal samples collected ($n_{collected}$) from the Otago coast during the 2016/17 season, relative to age class and sample quality (n = 313). Computational filtering ($n_{>A2000}$ for ray-finned fishes, and $n_{>T2000}$ for cephalopods) was based on alpha rarefaction curves pooled across processed faecal samples that contained visible amplicons following PCR (n_{visamp}). Species and genus-level assignment was conducted on computationally filtered samples ($n_{>A2000}$ and $n_{>T2000}$) and presented in the Results.

Primer	Sample quality	Age class	n _{collected}	n _{visamp}	n _{>A2000}	%filtered
Chordates	Fresh	Adult	62	38	27	71.1 %
		Chick	24	13	13	100 %
	Latrine	Adult	158	103	101	98.1 %
		Chick	69	64	52	81.3 %
Total - Chordates			313	218	193	88.5 %
Primer	Sample quality	Age class	n _{collected}	n _{visamp}	n _{>T2000}	%filtered
Primer Cephalopods	•	Age class Adult	n _{collected}	n _{visamp} 22	п _{>т2000} 7	%filtered 31.8 %
	quality	<u> </u>				
	quality	Adult	62	22		31.8 %
	quality Fresh	Adult Chick	62 24	22 7	7 1	31.8 % 14.3 %

S4. Removal of low-resolution taxa detected using DNA metabarcoding of yellow-eyed penguin faeces

Table S4. Raw sample occurrence (n_r) , frequency of occurrence (%FOO_r), total counts of DNA sequence reads (I_r) , and relative read abundance (%RRA_r) of lower resolution (class/order/family) taxa detected in yellow-eyed penguin faeces using DNA metabarcoding, prior to removal of these lower resolution taxa from the analyses (after computational filtering). The highest taxonomic rank identified is given in bold font.

								Geographically
Phylum	Class	Order	Family	n _r	%FOOr	l _r	%RRA _r	plausible congeners
Chordates								
Chordata	Actinopterygii	Centrarchiformes	Cheilodactylidae (Moki and Tarakihi)	91	47.2	42838	1.30	Nemadactylus macropterus
Chordata	Actinopterygii	NA	Emmelichthyidae (Bonnetmouths)	1	0.5	215	<0.01	Emmelichthys nitidus Plagiogeneion rubiginosum
Chordata	Actinopterygii	Perciformes	Sebastidae (Sea perches)	10	0.5	2080	<0.01	Helicolenus percoides
Chordata	Actinopterygii	Scombriformes	Centrolophidae (Warehou)	21	0.5	1900	<0.01	Seriolella brama S. caerulea S. punctata
Chordata	Actinopterygii	Perciformes (Perch-like fishes)	-	1	10.9	193	0.05	-
Chordata	Actinopterygii	-	-	1	5.2	378	0.11	-
Total: All ra	y finned fish identi	fied below genus-leve	l (discarded)	108	56.0	47604	1.49	
Total: All ra	y finned fish identi	fied above genus-leve	l (used in Results)	193	100	2736711	98.51	

								Geographically			
Phylum	Class	Order	Family	n _r	%FOOr	l _r	%RRA _r	plausible congeners			
Cephalopod	Cephalopods										
Mollusca	Cephalopoda	Teuthida	Octopoteuthidae	3	2.8	93	2.46	Taningia danae			
			(Squid)					Octopoteuthis			
								megaptera			
Mollusca	Cephalopoda	Teuthida	-	1	0.9	187	0.98	-			
		(Squid)									
Total: All ce	Total: All cephalopods identified below genus-level (discarded)			4	3.8	280	3.44				
Total: All ce	Total: All cephalopods identified above genus-level (used in Results)				48.1	10514	96.56				

S5. Non-target taxa amplified using 16S Cephalopod primers

Table S5. Non-target taxa amplified using 16S Cephalopod primers, after clustering. No computational filtering hasbeen applied. 64.8% of the non-target sequences that were amplified are attributed to ray-finned fishes, and23.7% were unassigned. Asterisks indicate potential field or laboratory contamination.

Phylum	Class	Total number of reads
(Unassigned)	-	248842
Annelida	Clitellata	97
Annelida	Polychaeta	24
Arthropoda	-	22617
Arthropoda	Arachnida	22
Arthropoda	Collembola	9
Arthropoda	Hexanauplia	10
Arthropoda	Insecta	21082
Arthropoda	Malacostraca	32
Chordata	-	2206
Chordata	Actinopterygii	679727
Chordata	Amphibia*	766
Chordata	Aves*	18503
Chordata	Mammalia*	51642
Cnidaria	Scyphozoa	82
Echinodermata	-	10
Echinodermata	Holothuroidea	34
Mollusca	Gastropoda	17
Nemertea	Enopla	5
Nemertea	Pilidiophora	93
Total non-target taxa DNA sequence reads		1049227

S6. DNA sequence alignment of the yellow-eyed penguin blocking primer and the 16S_SHORT_Chord primers



Figure S1. DNA sequence alignment of the yellow-eyed penguin *Megadyptes antipodes* blocking primer used in this study against yellow-eyed penguin 16S sequence (Accession No: DQ137158), the 16S_SHORT_Chord_F and R primers, and the little penguin *Eudyptula minor* blocking primer used by Deagle *et al.* (2010).

	1	10	20	30	40	50	60	70	80	90	100	110	120	127
1. 16S SHORT Chord F		GACCCT												
DETECTED: Pseudophycis bachus EU848440	CGAGAA	GACCCTGT	GGAGCTTTAGA		AATTGCACCT	CATGTCA	CCCCCACAA		AAUCCAG	AATTACACA	TTCAATGTC	TTTGGTTGGGG	GCGACCGCG	GGG
3. DETECTED: Seriolella brama HQ592210			GGAGCTTTAGA											
DETECTED: Sprattus antipodum AP011608	CGAGAA	GACCCTAT	GGAGCTTTAGA		AT	ACGAAAAGC	GGGCCCGAC	TCAAAGGACC	CTCAAACAAC	TAATGTTGG	CACAAACGTC	TTCGGTTGGGG	GCGACCGCG	GGAG
NON-DETECTED: Helicolenus percoides MN147854			GGAGCTTTAGA											
NON-DETECTED: Macruronus novaezelandiae FJ215156			GGAGCTTTAAA						ATTAACACTA					
7. NON-DETECTED: Nemadactylus macropterus EU848457 8. 16S SHORT Chord R	CGAGAA	GACCCTAT	GGAGCTTTAGA	GCCAGAA		CATGT	ACCCCAAG	AAAAGGG	-CTAAACCAA	TGAGACCTA	TCCAATGTC			

Figure S2. DNA sequence alignment of the 16S_SHORT_Chord_F and 16S_SHORT_Chord_R primers with 16S sequence (including Accessions Numbers) for three ray-finned fish species that were detected in this study (red cod *Pseudophycis bachus*, blue warehou *Seriolella brama*, and New Zealand blueback sprat *Sprattus antipodum*). Three species previously identified in yellow-eyed penguin diet that were not detected in this study (Jock Stewart *Helicolenus percoides*, hoki *Macruronus novaezelandiae*, and tarakihi *Nemadactylus macropterus*) are also presented, to indicate primer sequence similarity with detected species.

S7. Alpha rarefaction curves used to filter samples

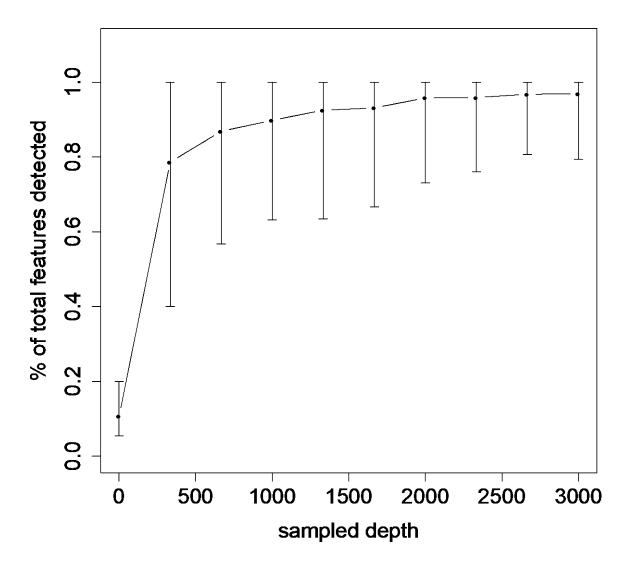


Figure S3. Alpha rarefaction curve for ray-finned fish DNA sequences amplified in yellow-eyed penguin faeces based on re-sampling 184 samples with more than 3000 reads once at 10 different sampling depths. The y-axis represents the mean percentage of the total features (i.e. independent types of sequences) within each sample detected at each sequence count depth (x-axis). The error bars delimit the 95% confidence intervals.