ORIGINAL PAPER

Estimates of density of mesopelagic fsh in the Southern Ocean derived from bulk acoustic data collected by ships of opportunity

Pablo C. Escobar‑Flores1,2 [·](http://orcid.org/0000-0002-8032-5176) Richard L. O'Driscoll2 · John C. Montgomery¹ · Yoann Ladroit² · Stefan Jendersie3

Received: 9 April 2019 / Revised: 28 November 2019 / Accepted: 2 December 2019 / Published online: 7 December 2019 © Springer-Verlag GmbH Germany, part of Springer Nature 2019

Abstract

The demand for information on mid-trophic level (MTL) organisms in open-ocean marine ecosystems has led to initiatives to collect acoustic data opportunistically in diferent regions around the world. Although, bulk acoustic data can provide information on the distribution patterns and dynamics of MTL organisms, it is necessary to convert acoustic-derived indices into biologically relevant quantities for parameterising and validating ecosystem and trophic models. A 7-year time series of acoustic data collected by ships of opportunity (SOOP) in the New Zealand sector of the Southern Ocean, information on species' distribution derived from trawl samples collected in research voyages, and target strength (*TS*) estimates obtained using a resonance-scattering model and literature *TS*–length relationships, were used to obtain the frst estimates of density of mesopelagic fsh in this region. Estimates of mesopelagic fsh density decreased from north to south refecting changes in species composition and scattering properties across three latitudinal regions (Northern, Central and Southern). Density estimates ranged from 16.4–40.1 in the north to 4.4–13.4 g m⁻² in the south. Catches revealed that the Northern region was dominated by *Lampanyctodes hectoris* and *Protomyctophum* sp. (Myctophidae) and *Maurolicus australis* (Sternoptychidae); the Central and Southern regions were dominated by the myctophids *Electrona antarctica* and *Protomyctophum* sp. and the Antarctic krill, *Euphausia superba*. Information on species composition was the main source of uncertainty in the density estimates, highlighting the need for more biological sampling. This study demonstrates that it is possible to integrate acoustic data collected opportunistically with auxiliary information from research voyages and literature to provide estimates of mesopelagic fsh biomass in remote areas.

Keywords Mesopelagic fish · Backscatter · Southern ocean · Target strength · Ships of opportunity · Bootstrapping

Electronic supplementary material The online version of this article [\(https://doi.org/10.1007/s00300-019-02611-3\)](https://doi.org/10.1007/s00300-019-02611-3) contains supplementary material, which is available to authorized users.

 \boxtimes Pablo C. Escobar-Flores pablo.escobar@niwa.co.nz

- School of Biological Sciences, University of Auckland, Thomas Building, Building 110, 3a Symonds Street, Auckland Central, Auckland 1010, New Zealand
- ² National Institute of Water and Atmospheric Research, 301 Evans Bay Parade, Hataitai, Wellington 6021, New Zealand
- ³ Antarctic Research Centre, Victoria University of Wellington, Level 5, Cotton Building, Gate 7, Kelburn Parade, Kelburn, Wellington 6012, New Zealand

Introduction

A key component of the open-ocean marine ecosystems is the mid-trophic level (MTL), which plays crucial ecological and biochemical roles: facilitating energy transfer between primary consumers and higher trophic levels; and actively participating in carbon fuxes and oxygen consumption across diferent depths in the water column through diel vertical migration (DVM) (Kloser et al. [2009](#page-17-0); Catul et al. [2011;](#page-16-0) Bianchi et al. [2013;](#page-16-1) Irigoien et al. [2014\)](#page-17-1). In openocean ecosystems, the MTL community is diverse and consists of a range of micronektonic organisms, including fsh, crustaceans, squids and gelatinous zooplankton, although mesopelagic fsh, particularly the families Myctophidae and Gonostomatidae, have been consistently recognised as the most dominant (Gjøsaeter and Kawaguchi [1980](#page-17-2); Brodeur and Yamamura [2005](#page-16-2); Nelson [2006;](#page-18-0) Irigoien et al. [2014](#page-17-1)). While their critical role in the ecosystem have been

emphasised, recent studies have stressed that there are still large uncertainties about the biomass and community composition (Irigoien et al. [2014](#page-17-1); Escobar-Flores et al. [2018a\)](#page-17-3) of the MTL.

Because of the limitations of net sampling (particularly catchability issues due to their small size, swimming ability and soft bodies, e.g. Kaartvedt et al. [2012](#page-17-4)) fsheries acoustics (hereafter acoustics) has become the standard sampling method for studying mesopelagic fsh in open-ocean pelagic marine ecosystems (Gjøsaeter and Kawaguchi [1980;](#page-17-2) Handegard et al. [2013](#page-17-5)). Acoustic-derived measurements provide information for ecological studies, and for parametrising and validating ecosystem and trophic models (Lehodey et al. [2010](#page-17-6), [2015](#page-17-7)). Acoustic data provides horizontally and vertically intensive, continuous, unobtrusive and georeferenced information, and it is capable of covering broad scales while sampling across pelagic habitats in a relatively short time span. Echosounders are commonly found on fshing vessels, which can be used to cost-efectively collect acoustic data opportunistically for scientifc purposes (Kloser et al. [2009](#page-17-0)). This has fuelled initiatives for acoustic data collection and for standardising post-processing or data grooming through international collaboration (e.g. the Integrated Marine Observing System (IMOS), the National Center for Environmental Information, and the Southern Ocean Network of Acoustics), producing a large amount of potentially valuable information for ecological and modelling studies.

Acoustic data collected opportunistically has been used traditionally to study ecological aspects of the MTL in remote areas based on acoustic energy (backscatter) (e.g. Escobar-Flores et al. [2013,](#page-17-8) [2018a](#page-17-3)). However, more biologically meaningful variables such as fsh density from schools or layers can be achieved through the echo-integration technique, which is based on the linearity principle that backscatter is proportional to the density of organisms (Simmonds and MacLennan [2005\)](#page-18-1). This principle can be applied under two assumptions: frst, targets are stochastically distributed in the ensonifed volume with respect to each other; and second, that between successive transmissions individual targets move so new measurements are generated stochastically (Simmonds and MacLennan [2005\)](#page-18-1). Although this principle holds true for targets with alike acoustic properties, in large-scale surveys where fsh community composition is unknown and likely to change spatially or in the presence of multi-species aggregations, it may not apply. Target strength (*TS*) is species-specifc, and even changes between individuals of the same species, particularly for myctophids, which display a variety of swimbladder shapes, and age-related swimbladder content change and atrophy (Marshall [1960](#page-18-2); Davison [2011](#page-17-9)). Though acoustics has been used for estimating the abundance of MTL organisms (e.g. Gjøsaeter and Kawaguchi [1980](#page-17-2); Irigoien et al. [2014](#page-17-1)), resonance scattering by siphonophores and small mesopelagic fsh can obscure

the conversion and interpretation of acoustic energy as density (e.g. Davison et al. [2015a](#page-17-10)).

Previous estimates of mesopelagic fish density south and east of New Zealand (NZ) are limited to two studies: netbased estimates for the Sub-Antarctic and Antarctic regions of the South Pacifc Ocean sector of the Southern Ocean (SO) combined, derived from an environmental conditions and fsh density relationships (Gjøsaeter and Kawaguchi [1980](#page-17-2)); and, acoustics and net sampling abundance estimates for the epipelagic zone of four regions southeast and south of NZ (McClatchie and Dunford [2003](#page-18-3)). In this article, we advanced the use of acoustic indices derived from bulk data collected by ships of opportunity (SOOP) (see Escobar-Flores et al. [2018a](#page-17-3), [b\)](#page-17-11), by producing more biologically meaningful estimates of mesopelagic fsh density, which are the frst for the NZ sector of the SO. Density estimates were obtained using: a 7-year time series of acoustic transects collected opportunistically between NZ and the northern area of the Ross Sea (RS); available information on species' composition and biological sampling collected in three research voyages; and target strengths from existing TS-length relationships and from a gas-bladder resonance-scattering model from the literature.

Materials and methods

Acoustic dataset

The acoustic dataset consisted of 28 transects collected by SOOP between NZ and the RS between November and March from 2008 to 2014, which is available through the IMOS portal (<https://portal.aodn.org.au/>). A detailed description of the acoustic data is available (Escobar-Flores et al. [2018a\)](#page-17-3). Data collection took place during the austral summer because this is when the ice surrounding the Antarctic continent retreats, allowing access to the Antarctic toothfsh (*Dissostichus mawsoni*) fshing grounds. Acoustic data was collected almost continuously by three toothfsh fshing vessels (TFV) during their transits to and from toothfsh grounds in the RS, and one research vessel (*RV*), Tangaroa, during research voyages in nearby waters of the Antarctic continent (Fig. [1](#page-2-0)). While all the TFVs (San Aotea II, San Aspiring and Janas) collected 38 kHz single frequency data, the *RV* Tangaroa collected multi-frequency data although only 38 kHz data were used here. Transceiver settings used during data collection were typically 2 ms pulse length and 2000 W power. Calibrations of the echosounders on board the TFV were carried out on a semi-regular basis by the National Institute of Water and Atmospheric Research (NIWA), following procedures as per Demer et al. [\(2015\)](#page-17-12) using a 38.1 mm tungsten carbide sphere. Echosounders on the *RV* Tangaroa were calibrated at least annually.

Fig. 1 Top panel shows the geographical location of acoustic transects which were split into three latitudinal regions between New Zealand (NZ) and the northern area of the Ross Sea (RS): Northern region (yellow, *n*=27), Central region (blue, *n*=28), and Southern region (green, $n=11$). Bottom panel shows the three regions along an acoustic echogram of transect collected by vessel 'San Aotea II'

between 9—16 February 2010 during its transit from the Southern Ocean (SO) (right) to NZ (left). Each pixel represents mean volume backscattering strength (S_v) in decibels (dB) echo-integrated in 1 km long and 10 m depth bins. Minimum echogram threshold: −84 dB for visualisation purposes only

Grooming protocols for processing acoustic were based largely on the IMOS Bio-acoustic Ships of opportunity (BASOOP) sub-facility, using Matlab routines which operates through COM port objects to control Echoview (Echoview Software Pty Ltd [2013](#page-17-13)). Four noise filters were used for reducing the efect of common types of signal degradation when collecting acoustic data on board of SOOP, which have been described: impulsive noise, transient noise, background noise, and signal attenuation (Ryan et al. [2015](#page-18-4)). These flters were applied following (Ryan et al. [2015\)](#page-18-4), with modifcations per Escobar-Flores ([2017\)](#page-17-14). In addition, Echoview's background noise flter (De Robertis and Higginbottom [2007\)](#page-17-15) implementation was also applied. For a complete description of the acoustic data processing, noise handling, and the performance of the grooming flters see Escobar-Flores [\(2017](#page-17-14)). Backscatter (in m^2 m⁻²) was echo-integrated in 1 km horizontal and 10 m vertical (depth) bins, from 10 m from the surface down to 1200 m.

Acoustic transects are here referred to as group of acoustic raw fles collected by a vessel during its transit from NZ to SO or from the SO to NZ, excluding data recorded in toothfsh fshing grounds due to commercial confdentiality (Table [1](#page-3-0) and Fig. [1](#page-2-0)).

Each acoustic transect was split by latitude into three regions: Northern and Central regions were separated using 1500 m depth beyond the shelf break as the cut-off point (see Escobar-Flores et al. [2018a\)](#page-17-3). The Southern region was defned from 67° S to the southernmost limit of the transect, which was variable and determined by the start of the fshing operation (see Fig. [1\)](#page-2-0). Mean backscatter was calculated within the diferent latitudinal regions for each transect by averaging vertically summed backscatter at 1-km long bins.

Biological sampling

Biological information used for converting backscatter to mesopelagic fsh density was collected on three research voyages carried out within the area of study by NIWA in 2008, 2011 and 2015 respectively (voyage codes: TAN0802, TAN1116 and TAN1502). A total of 51 trawls were used to characterise species' composition and were distributed between the three latitudinal regions as follows: Northern region 15 trawls from TAN1116; Central region 4 trawls from TAN0802 and 3 from TAN1502; and Southern region 13 trawls from TAN0802 and 6 from TAN1502 (Fig. [2](#page-3-1)). For detailed information on the sampling stations see Table S4 of the supplementary material in Escobar-Flores et al. ([2018a](#page-17-3)). Sampling gear was a fne mesh mid-water trawl net with a 10 mm cod-end mesh and a headline height of 12–15 m, with a door spread of around 140–160 m. This mid-water gear is similar to the IYGPT (International Young Gadoid Pelagic Trawl), recommended by the Census of Antarctic Marine Life for sampling pelagic fsh layers (www.caml.aq). Two types of tows were carried out: those used for acoustic mark identifcation (referred hereinafter as mark ID); and oblique (OB) tows. Mark ID trawls were carried out at day or night and had variable duration (10–40 min). For mark ID, the net was towed at the depth of the layer of interest at speeds of 3–4 knots. Most OB trawls were carried out at night time to characterise and estimate diversity, from 50 m above the sea-bed to the surface, at an ascent speed of 20 m per minute, and vessel speed of three knots.

Trawl catches were sorted and identifed, when possible, to species or genus taxonomic level. From each trawl, biological subsamples of up to 100 individuals per species were

Fig. 2 Trawl locations from research voyages TAN0802 (triangles), TAN1116 (crosses) and TAN1502 (stars) grouped by regions: Northern (yellow), Central (blue) and Southern (green)

measured to the nearest 1 mm, and up to 20 individuals were weighted to the nearest 1 g. This information was used to establish species length–weight relationship and calculate the weight of organisms not weighed at sea [see Table S1 in the Electronic Supplementary Material (ESM) 1]. Species length and weight information were used to estimate target strength [*TS* in decibels (dB) re 1 m⁻¹] and backscatter to weight ratio (BWR in m² kg⁻¹) respectively, for converting acoustic energy to biological density or abundance.

Species' composition from both trawl types was used to characterise each region (i.e. Northern, Central and Southern) for converting backscatter into density estimates. The dominant mesopelagic fsh species by number and occurrence across trawls were used for this characterisation and to estimate density. Species having only an incidental

Table 1 Number of transects collected by ship of opportunity from 2008 until 2014 between New Zealand and the Ross Sea

occurrence in the catches and those poorly represented in the catches were excluded. To convert backscatter into density using the information on species composition drawn from the trawls, we have assumed that this is representative of each region and has remained constant over time.

Literature information of mesopelagic fsh community composition in the area of study was used as additional guidance to inform the characterisation (e.g. McClatchie and Dunford [2003;](#page-18-3) Gauthier et al. [2014\)](#page-17-16).

Target strength–length (*TS***–***L***) relationships**

Target strength (the logarithm form of an individual's backscattering cross-section, σ_{bs}), relates to length by the equation $TS = mLog(L) + b$, where *L* is the standard fish length obtained from the biological sampling size distribution, and *m* and *b* are the species-specific slope and intercept (Simmonds and MacLennan [2005](#page-18-1)). *TS–L* relationships from the literature for species collected in the biological sampling, or the closest taxonomic level, were used for estimating individual acoustic contribution. Organism body shape and size, and (for fsh species) swimbladder presence/absence and composition (see Table S2 in ESM 1), were considered for assigning *TS–L* relationships to species with no published relationships. For each species, two *TS–L* relationships from the literature were used to produce a minimum and maximum *TS*, to account for the variability amongst the available estimates. We used the range between these estimates for uncertainty analysis.

Model‑based target strength

To account for resonance from gas-flled swimbladder of fsh in our density estimates, we used a resonance-scattering model to estimate the *TS* based on Love [\(1978\)](#page-17-17), following a similar implementation as in Kloser et al. ([2002\)](#page-17-18) and Scoulding et al. ([2015\)](#page-18-5). The model relies on the computation of the *TS* of a fish as a function of frequency, environmental parameters and its physical characteristics (swimbladder+tissue). All constants used in this study are given in Table [2](#page-4-0).

Here, we kept frequency f (in Hz), size of the fish L (in m) and depth *d* (in m) as variables. All other parameters in the model were fxed or calculated from one of these variables. The *TS* is defned by

$$
TS = 10\log_{10}\sigma_{\text{bs}}\tag{1}
$$

where $\sigma_{\rm bs}$ is the backscattering cross-section given by

$$
\sigma_{\rm bs} = \frac{\chi^2 a_{\rm esr}^2}{((\omega_0/\omega)^2 - 1)^2 + \delta^2} D(\theta) \tag{2}
$$

where a_{est} is the equivalent spherical radius (a_{est} in m), the coefficient χ represents the enhancement of the

Table 2 Resonance model parameters values for gas-flled swimbladders used in this study

Parameter	Symbol	Value	Units
Dampening factor	δ	0.14	
Percentage of volume of fish occupied by the swimbladder	p_{swh}	0.1	$\%$
Water density	$\rho_{\rm w}$	1.026	$kg L^{-1}$
Real part of fish-flesh rigidity	$\mu_{\rm r}$	1×10^6	\overline{N} m ⁻²
Ratio of air specific heat	Ya	1.4	

backscattering amplitude due to elongation (as defned in Ye [1997](#page-18-6)), ω_0 is the resonant angular frequency (Hz) of the prolate spheroid, δ is the dampening factor, and $D(\theta)$ is a directivity term depending on fish orientation. $D(\theta)$ can be estimated based on the length of the fsh *L* (m) and its angle of orientation *θ* as:

$$
D(\theta) = \text{sinc}\left(\frac{k}{4}\sin\theta\right) \tag{3}
$$

We assumed $\theta = 0$ (broadside incidence), giving a directivity of 1.

 ω_0 can be estimated as

$$
\omega_0^2 = \frac{C_e^2}{a_{\rm \rm{esr}}^2} \frac{3\gamma_{\rm a}P + 4\mu_{\rm r}}{\rho_{\rm w}}
$$
(4)

where C_e is the elongation factor as defined in Love [\(1978](#page-17-17)), γ_a is the ratio of the specific heat for air, μ_r is the real part of the rigidity of fish flesh, and ρ_w is the density of water $(kg L^{-1})$.

We calculated a_{esr} (in m) as in Proud et al. ([2018\)](#page-18-7), using the following approximation

$$
a_{\rm esr} = \left(\frac{3p_{\rm swb}V_{\rm f}}{4\pi}\right)^{\frac{1}{3}}
$$
 (5)

where p_{sub} is the percentage of the total volume of the fish used by the swimbladder using as reference values reported by Yasuma et al. [\(2010\)](#page-18-8), and V_f is the total volume of the fish (L), V_f itself is approximated using the length of the fish L (m) and its aspect ratio α

$$
V_{\rm f} = \frac{1}{3} \left(\frac{\pi L^3}{2\alpha^2} \right) \tag{6}
$$

To incorporate resonance of some species at depth, we defined a vertical distribution range $p(z)$ metres at day and night for each species based on available information in the literature and our biological sampling for each region (Northern, Central and Southern regions) (Table [3\)](#page-5-0). The distribution was defned as a Gaussian-mixed model (see Eq. [7](#page-5-1)), to consider the range of depths that the species occupy at

Species	Northern and Central region				Southern region	
	Day min. depth (m)	Day max. depth (m)	Night min. depth(m)	Night Max. depth(m)	Min. depth (m)	Max. depth (m)
Diaphus sp.	280	600	Ω	200	NA	NA
Electrona carlsbergi	280	1000	$\mathbf{0}$	200	100	400
Electrona antarctica	200	1000	θ	200	100	400
Electrona paucirastra	280	1000	$\mathbf{0}$	200	100	400
Krefftichthys anderssoni	250	1000	θ	250	$\mathbf{0}$	400
Lampanyctodes hectoris	100	400	Ω	200	NA	NA
Maurolicus australis	100	300	$\mathbf{0}$	200	NA	NA
Photichthys argenteus	280	600	Ω	200	NA	NA
Protomyctophum sp.	200	1000	200	1000	200	400
Vincinguerria sp.	280	600	Ω	200	NA	NA
Cyclothone microdon	300	1000	300	1000	200	400

Table 3 Vertical distribution range (defned as a layer) for each species at day and night for the Northern and Central region, and for the day distribution only for the Southern region, used to incorporate resonance in the target strength estimates

NA not applicable (i.e. not present in the region)

day and night (for the Northern and Central region). Based on the vertical distribution of backscatter observed in the Southern region (see Fig. [1](#page-2-0)), we assumed a narrower vertical distribution range for this region, which did not change between day and night. The vertical distribution for a given species was defned as

$$
p(z) = \frac{1}{n} \sum_{i=1}^{n} (\mu_i, \sigma_i^2),
$$
 (7)

where μ_i is the mean depth of the layer *i*, σ_i the standard deviation of the normal distribution for this layer, and *n* the number of the layer used for the species. σ_i was determined as

$$
\sigma_i = \frac{1}{8} (z_{i,\text{max}} - z_{i,\text{min}}),
$$
\n(8)

where $z_{i,\text{min}}$ and $z_{i,\text{max}}$ are the minimum and maximum depth for the layer *i*, respectively. Thus, we obtain the average backscattering cross-section, $\sigma_{\text{bs mean}}$, for each species incorporating possible resonance scattering for the species

$$
\sigma_{\text{bs mean}} = \frac{\int_{z_0}^{z_1} p(z) \sigma_{\text{bs}}(z) dz}{\int_{z_0}^{z_1} p(z) dz}
$$
(9)

Backscatter to weight ratio (*BWR***)**

Backscatter to weight ratio (*BWR*) is the conversion factor to transform acoustic density (backscatter) to biological density of mesopelagic fsh. For a particular trawl *BWR* in square metres per kilogram $(m^2 kg^{-1})$ was obtained as:

$$
BWR = \frac{\frac{\sum_{i}^{N} 10^{(TS_{i}/10)}}{N}}{\frac{\sum_{i}^{N} w_{i}}{N}}
$$
(10)

where *N* is the total number of fish biologically sampled in the trawl, w is the fish individual weight in kilograms (kg) of the *i* sampled fish, and TS_i is the TS in dB obtained for *i* fish length in cm.

Using bootstrapping to produce estimates of mesopelagic fsh density and uncertainty

Estimates of mesopelagic fsh density were obtained from the distributions of backscatter, species composition, and *TS* values derived from two scenarios for each region. In the frst scenario, we used solely literature published *TS–L* relationships, and in the second scenario, we allowed for resonance by including a resonance-scattering model. Confdence intervals were estimated by bootstrapping (Efron and Tibshirani [1993](#page-17-19)), which was considered the most appropriate method for incorporating uncertainty due to the relatively small sample sizes and varying forms of uncertainty. The statistical analyses used for estimating uncertainty (based on bootstrapping) was similar to those used in other acoustic studies (e.g. Rose et al. [2000;](#page-18-9) O'Driscoll [2004](#page-18-10)). Confdence intervals were obtained by resampling values (with replacement) from their respective distributions (see below) 1000 times.

For each region, we assumed that transects were our primary sampling unit and drew with replacement a sample size equal to the number of transects available on it to estimate their mean acoustic backscatter. This was repeated

1000 times to produce the backscatter bootstrap distribution. This distribution was used to draw backscatter values for the biological density estimates.

To incorporate the uncertainty of the species composition and *TS* estimates into the density estimates through the *BWR* bootstrap distribution in each region, a two-step process was followed. First, species composition uncertainty was included by resampling with replacement *n* trawls to produce a sample size equal to the number of trawls in a region (i.e. 25, 7 and 19 in northern, central, and southern regions respectively). Second, we estimated one lower and one upper *BWR* using the *TS* values obtained from the low and high *TS–L* relationships for all the individuals of each species present in the catch for each trawl (frst scenario). Under the second scenario the lower and upper *BWR*s were estimated in a similar fashion, but while there was one *TS* from the low and one high *TS–L* relationships for fish without swimbladder, there was only one modelled *TS* for fsh with gasflled swimbladders. Following this approach, we produced two mean *BWR*s (mean from the lower and upper limit) for each trawl in both *TS* scenarios. A uniform distribution was assumed between the trawl lower and upper *BWR* boundaries (k_{lower} and k_{upper}), and a *k* proportion value (between 0 and 1) was randomly selected, representing the *BWR* value for the *TS*th trawl. The *k* randomly selected *BWR* value at each *n* draw were then averaged (in the linear domain) over the number of trawls in a region, to complete one bootstrap sample. This was repeated 1000 times to generate the *BWR* bootstrap distributions. The bootstrap distributions of *BWR* under each scenario and the backscatter bootstrap distribution were used to estimate densities of mesopelagic fsh and their associated confdence intervals.

To assess the relative contribution of each source of uncertainty in the density estimates (backscatter, species composition and *TS–L* relationship uncertainty, assuming that the modelled *TS* is known without error) in each region, values from the other two sources were fxed at their median values, and 95% confdence intervals determined by bootstrapping only from the variable of interest. For example, in each region *BWR* had two uncertainty components: *TS–L* relationships and species composition. To assess the uncertainty due to species composition, we assumed that the *BWR* of each station was known without error using the median, so trawls had diferent *BWR* that only refected diferences in their species composition. To assess the uncertainty due to *TS–L* relationships, using the lower and the upper *TS–L* relationships we estimated the median of lower and upper *BWR*s from all trawls (thus assuming that species composition is known without error), so that the *BWR* varied randomly following a uniform distribution between the *BWR*medians to refect the uncertainty due to the *TS–L* relationships. We followed this approach for both *TS* scenarios and compared the results obtained.

Results

Acoustic backscatter

A summary of mean backscatter by region is given in Table [4.](#page-6-0) Mean backscatter in the Northern and Central regions were more than one order of magnitude higher than backscatter in the Southern region. Histograms of the transect backscatter in each region are shown in Fig. [3.](#page-7-0)

Catch composition

As determined from the trawl catches the species diversity in the Northern region was dominated by fsh, crustaceans and squids (61, 13 and 8 species, respectively). The overall diversity in the trawls from the Central and Southern regions not only decreased but was also dominated by the same three groups (Central region: 28 fsh, 6 crustacean, and 9 squid species; Southern region: 23 fish, 4 crustacean, and 9 squid species). In this study, we only focussed on fish and crustaceans for density estimates (see "[Discussion](#page-5-2)" section).

Detailed information on the catch and species composition by region available in Tables S4–S7 of the Supplementary Material in Escobar-Flores et al. ([2018a\)](#page-17-3). Excluding large non-mesopelagic fsh species believed to have been caught only incidentally in the mid-water trawls (e.g. hoki, *Macruronus novaezelandiae*) as well as salps and jellyfsh, the trawl catches of the Northern region were dominated by number by two myctophid species, *Lampanyctodes hectoris* and *Protomyctophum* sp. (19 and 3 trawls each)*,* and the stomiiform *Maurolicus australis* (2 trawls). In the Central region, the myctophids *Electrona antarctica* and *Protomyctophum* sp. were the dominant species in 5 and 1 trawls each, and the Antarctic krill, *Euphausia superba,* dominated the remaining trawl. The trawl catches in Southern region were dominated by *E. superba* and *E. antarctica* (5 trawls each), followed by the Antarctic silverfsh *Pleuragramma antarctica* (in three trawls)*,* and the myctophid *Electrona carlsbergi* (in four trawls).

Averaged across trawls, the most commonly caught fsh species by number or weight are shown in Table [5.](#page-8-0) By

Table 4 Transect sections per region including region mean acoustic backscatter (s_a) and standard deviation (SD), and mean number of bins per transect section

Region	No. of tran- sect sections in region	Mean number Mean s_a of ~1 km bins $(m^2 m^{-2})$		SD
Northern 27		746	2.16×10^{-5}	2.27×10^{-5}
Central	28	1476	1.25×10^{-5}	1.17×10^{-5}
Southern 11		695	8.48×10^{-7}	3.36×10^{-7}

Fig. 3 Distribution of transects mean acoustic backscatter $(s_a$ in $m^2 m^{-2}$) per region

number and weight, the myctophids *L. hectoris* dominated the fsh fauna in the Northern region and *E. antarctica* in the Central region. Although, the notothenioid *P. antarctica* had the highest average contribution by weight in the Southern region, it was surpassed by number by *E. superba* and the crystal krill *Euphausia crystallorophias*, however, the latter was only present in three trawls. Although the myctophid *E. antarctica* was only the third most important species by number, and relative to other species had a lower weight contribution across trawls when present, it was the fsh species most commonly caught (11 trawls) in the Southern region. Salps and jellyfsh were also part of the catches (1 species caught in the Northern region and three in the Central and Southern), but these were not either identifed to down to the level of species or considered for density.

Backscatter to weight ratio

The number of species sampled biologically (length or length and weight) varied between regions. Dominant species in each of the regions were used for biological density estimates. From the total number of species sampled in the Northern region, 14 out of 28 were included for *TS* estimates (and *BWR*), while in the Central and Southern regions 15 out of 28 and 18 out of 35 species were used, respectively.

TS–L relationships used for *TS* and *BWR* estimates in both scenarios are shown in Table [6.](#page-10-0) Where species-specifc *TS–L* relationships were not available from the literature, relationships were based on species that were considered the best approximation to the species collected in the catches based on swimbladder (presence/absence), taxonomy and morphology (size and shape). Studies on *P. antarctica* have shown that the *TS–L* slope changes substantially across size classes, leading to two diferent relationships with fsh size (Azzali et al. [2010](#page-16-3); O'Driscoll et al. [2011](#page-18-11)). This length split criterion for applying a *TS–L* relationship was used for all notothenioids. Lower and upper limits were based on the published range of *TS–L* relationships (Table [6\)](#page-10-0).

Distribution of the *BWR* values per region used in both *TS* scenarios for density estimates are shown in Fig. [4](#page-11-0). The range of the *BWR* values generated from both scenarios refect the diferences between the lower or upper *TS–L* relationship, since the average weight used for estimating both *BWR* for a trawl was the same. Under both scenarios the distribution of *BWR* are relatively similar, with some higher values standing out from the distribution drawn from the lower *TS* limit. There was a latitudinal trend in average *BWR*, with a decrease from north to south (Fig. [4\)](#page-11-0).

Resonance scattering of mesopelagic fsh

We considered a species to be contributing to backscatter at 38 kHz through resonance scattering, if the predicted resonance peak of a fish with a gas-filled swimbladder at a certain size was within ± 0.5 kHz from 38 kHz. The model predicted resonance for seven species of mesopelagic fsh (Fig. [5](#page-12-0)). In the Northern region, resonance was predicted for individuals of the genera *Diaphus* and *Protomyctophum* as well as *E. carlsbergi*, *L. hectoris* and *M. australis*, for minimum and maximum fsh sizes of 19 and 58 mm, equivalent spherical radius (a_{est}) of 0.34 and 1.03 mm and resonance peak at depths 99 and 1000 m depth for *M. australis* and *E. carlsbergi*, respectively. In the Central region, four species were predicted to be resonant at 38 kHz, *E. carlsbergi*, *E. antarctica*, *Cyclothone microdon* and *Protomyctophum* sp. While relatively small individuals of *E. antarctica* (22 mm,

Table 5 Species used for density estimates in each region

Table 5 (continued)

Only species that contributed on average by more than 2% to the total catch by number or weight across research trawls, and were present in at least two trawls were included (occurrence)

a Infuenced by two trawls with 11 and 13 individuals of *N. ionah* over a total catch of 21 and 111 individuals, respectively. When these trawls were removed contribution dropped to $< 0.2\%$. This species was not included in density estimates

 a_{esr} 0.39) were predicted to have a resonance peak at 136 m, the peak of larger individuals (58 mm, a_{esr} 1.03 mm) was predicted at the maximum vertical range (1000 m). Individuals of *C. microdon* of sizes 45 to 78 mm were resonant with resonance peaks over a broad vertical range (303–929 m) because of the small predicted a_{est} sizes (0.57 to 0.99 mm) in comparison to other species. As in the Central region, *E. antarctica* and *C. microdon*. were predicted to resonate in the Southern region, for fsh sizes of 31 mm for *E. antarctica* $(a_{\text{est}}=0.55 \text{ mm})$ and between 45 to 52 for *C. microdon* (a_{est}) from 0.57 to 0.66 mm) at depths between 303 and 400 m. These results show that resonance scattering occurs in all regions as a combination of changes in species' composition and fish sizes, with the potential for shaping spatial patterns of backscatter.

Estimates of biological density

Estimates of density obtained under both *TS* scenarios were reasonably similar and were within the same order of magnitude, however, they showed diferent spatial patterns (see Table [7\)](#page-13-0). When *TS* were estimated using the

resonance-scattering mode (i.e. including resonance), mean mesopelagic fsh density was highest in the Northern region and decreased south, which is consistent with the observed latitudinal patterns of backscatter between NZ and the northern area of the RS (see Table [4\)](#page-6-0). Though the spatial pattern was the same, the diferences between regions in terms of fsh density were only subtle compared to the diferences in backscatter (see Table [7\)](#page-13-0). These results contrast with those obtained when using *TS* from the literature *TS–L* relationships not including resonance, where the highest densities of mesopelagic fish were found in the Central region. Under both scenarios, the lowest densities were in the Southern region (see Table [7](#page-13-0)).

The bootstrap distributions of backscatter, *BWR* and biological density, with 95% CI, are illustrated in Fig. [6.](#page-14-0) Biological density, backscatter and *BWR*, were all signifcantly higher in the Central region than in the Southern region. Backscatter and *BWR* were also signifcantly higher in the Northern than in the Southern region, but the diference in derived density estimates was not statistically significant between these regions (Fig. [6\)](#page-14-0).

c Stochastic distorted-wave born approximation model (Demer and Conti [2005](#page-17-20)) revised by Calise and Skaret ([2011\)](#page-16-4) parameterised using default vertical distribution orientation *N*(11,4)

⁶ Stochastic distorted-wave born approximation model (Demer and Conti 2005) revised by Calise and Skaret (2011) parameterised using default vertical distribution orientation N(11,4)

Fig. 4 Distribution of backscatter to weight ratio (*BWR* in m² kg⁻¹) lower and upper limit for each region in both target strength scenarios (black dotted line including resonance, blue solid line not including resonance). Note the diferent scales used in the *x*-axes of the graphs

The estimates of density were more precise in the resonance scenario in the Northern and Central regions (see Table [8\)](#page-14-1), because *BWR* obtained from modelled *TS* values were considered to be known without error. However, in the Southern region more precise estimates were obtained under the non-resonance scenario because the occurrence of fish without swimbladders was higher and because we restricted the depth range in scattering model to the top 400 m, which constrained resonance. In absence of resonance, the model produced lower *TS* values for fish with swimbladder with standard lengths < 10 cm compared to *TS* values obtained from *TS–L* relationships, explaining the lower density estimates for the Southern region under the resonance scenario (see example of *TS* for genus *Electrona* under both scenarios in the Southern region in Fig. [7\)](#page-14-2).

Decomposing uncertainty

The main source of uncertainty in density estimates for all three regions was the species composition (see Table [8](#page-14-1)). The highest levels of uncertainty were found in the Central region, refecting the low sampling in this area (7 trawls), and in the Northern region, which can be attributed to the higher species diversity in this area. Acoustic backscatter and *TS* were the second and third source of uncertainty in the estimates of density in all regions. The low uncertainty associated with *TS* is because the parameters used in the resonance-scattering model to estimate the *TS* parameters of fsh with gas-flled swimbladders were defned as constants without error.

Fig. 5 Relationship between target strengths (*TS*) and fish size for the species considered as resonant at 38 kHz in each region (Northern, Central and Southern). *TS* were predicted using a resonance-scattering model based on (Love [1978](#page-17-17)) and the vertical distribution ranges for species presented in Table [3.](#page-5-0) Symbols show the predicted *TS* for the resonating fsh of each species: Northern region: *DIA Diaphus* sp. (blue crosses), *MMU Maurolicus australis* (dark-red circles), *LHE*

Lampanyctodes hectoris (green diamonds), *ELC Electrona carlsbergi* (yellow asterisks), *PRO Protomyctophum* sp. (orange squares). Central region: *ELC Electrona carlsbergi* (blue cross), *PRO Protomyctophum* sp. (green diamonds), *ELN Electrona antarctica* (yellow asterisks), *YTM Cyclothone microdon* (dark-red circles). Southern region: *ELN E. antarctica* (blue cross), *YTM C. microdon* (yellow asterisks)

Discussion

A time series of bulk acoustic backscatter collected by SOOP, was combined with information on species' composition, and *TS* to produce the frst estimates of density of mesopelagic fsh in the NZ sector of the SO. Density estimates varied between three latitudinal regions, and although they matched the observed trends in acoustic backscatter, the diferences of mesopelagic fsh densities between regions were more subtle. This was due to changes in species' composition between regions, fsh size, and resonance scattering. While estimated densities were plausible and comparable to previous studies (see below), there was substantial uncertainty due mainly to limited biological data on species' composition. The diferences in density between our two TS scenarios highlight the need for considering resonance scattering in the estimates of mesopelagic fish density. This requires more information on fsh swimbladder morphology and ontogenic changes, if we aim to achieve reliable estimates of abundance.

Our estimates suggest that the density of mesopelagic fsh for waters south and southeast of NZ may be higher than previously thought. For the southwest South Pacifc Ocean Gjøsaeter and Kawaguchi [\(1980\)](#page-17-2) provided an estimate of **Table 7** Comparison of mesopelagic fsh density estimates from our study using the backscatter to weight ratio values generated with the target strengths (*TS*) from the resonance-scattering model (resonance scenario) for fsh with gas-flled swimbladders and *TS*-length relationships available in the literature for fsh with atrophied or without swimbladder

Density estimates in brackets for the Northern, Central and Southern regions were obtained under the non-resonance scenario for comparison ^aUsing 25–75% quartiles of the *BWR* and an area of 222.3 million km^2 (Irigoien et al. [2014](#page-17-1))

4.5 g m^{-2} (see Table [7](#page-13-0)), which is at the lower end of the range of our estimates. Our estimates from the Northern region were comparable to those of McClatchie and Dunford [\(2003](#page-18-3)) from east and southeast of NZ, and those reported by Kloser et al. [\(2009\)](#page-17-0) from acoustics across the Tasman Sea between Australia and NZ (see Table [7](#page-13-0)). Few studies from the region have reported higher density values, but Filin et al. ([1990\)](#page-17-26) estimated maximum mesopelagic fsh densities between 70 and 100 g m^{-2} and over, in areas of the Atlantic sector of the SO based on acoustics.

The 95% CI density that we estimated for the Southern region encompasses acoustic density estimates in the Polar Frontal Zone (PFZ) north of South Georgia (e.g. Kozlov et al. [1990](#page-17-27)), trawl estimates in the Weddell Sea (Lancraft et al. [1989](#page-17-28)), in the northwest of South Georgia in the northern Scotia Sea (Collins et al. [2008\)](#page-16-6), and in the region between the seasonal ice-edge to the PFZ in the Scotia Sea (Collins et al. [2012](#page-17-29)) (see Table [7](#page-13-0)). Estimates of fsh biomass reported by Donnelly et al. [\(2004\)](#page-17-30) for the eastern RS (0.7 g m^{-2}) using three types of sampling gear were below the lower end of our 95% CI, however, their trawls were restricted to latitudes greater than 68° S.

Including resonance scattering and including it in the mesopelagic fsh density estimates led to lower densities of mesopelagic fsh in some areas (Central regions, around 40%), which is in agreement with some recent studies (e.g. Davison et al. [2015b](#page-17-31); Proud et al. [2018](#page-18-7)).

Although our estimates of mesopelagic fsh concurred with other regional studies in the SO, both our levels of backscatter in the pelagic zone (10 and 1200 m) and estimates of mesopelagic fsh density in all three regions, were much lower than those provided by Irigoien et al. [\(2014](#page-17-1)) for mesopelagic fsh biomass in temperate waters between 40° N and 40° S (see Table [7\)](#page-13-0).

The main source of uncertainty in our density estimates was related to the species composition information provided by the biological sampling. This is unsurprising due to limited number and spatial coverage of available trawls for the NZ sector of the SO. The density estimates presented here also assumed that the catchability of the trawls was the same for all species, which is unlikely given the diversity of swimming capabilities, sizes, shapes and body compositions found in the MTL community. We acknowledge that by not including catchability, the accomplished species characterisation and results could have substantial bias (Heino et al. [2011;](#page-17-32) Gauthier et al. [2014;](#page-17-16) Davison et al. [2015b](#page-17-31)). However, by including biological information collected with two diferent sampling strategies (oblique and target tows) and

Fig. 6 Distribution of **a** acoustic backscatter $(s_a$ in m m^{-2}), **b** backscatter to weight ratio (m² kg^{-1}) and **c** density (g m⁻²), based on transects backscatter, biological characterisation from three research voyages and *TS* values obtained from the resonance-scattering model,

Table 8 Summary table with the 95% confdence intervals produced from bootstrapping when decomposing the three sources of uncertainty considered in the estimates of density of mesopelagic fsh under the resonance scenario

Source of uncertainty	Region		
	Northern	Central	Southern
Acoustic backscatter	$26 - 34.3$	$37.8 - 45.1$	$5.7 - 8.8$
Species composition	$22.2 - 42.7$	$24.7 - 90$	$4.4 - 14.4$
Target strength	$18.1 - 25.4$	$14.9 - 17.7$	$5.2 - 5.9$

The 2.5th and 97.5th intervals of density estimates (in g m^{-2}) are shown when each of the sources of uncertainty was estimated independently in each region

some non-fsh organisms (e.g. krill) in the species composition characterisation, some of the uncertainty around catchability was at least partially incorporated in the bootstrapped CIs presented. We also gave the same weighting to all trawls

generated for each region by bootstrapping. Estimates of density include three sources of uncertainty: s_a ; species composition; and *TS–L* (combined in m^2 kg⁻¹ backscatter to density conversion factor). Note the diferent scales used in the *x*-axes of the graphs

Fig. 7 Target strength (*TS*) obtained for individuals of the genus *Electrona* (*n*=430) collected in the Southern region using the lengths from the biological sampling, the lower and upper *TS–L* relationships (see Table [6](#page-10-0)) and the resonance-scattering model in absence of resonance

regardless the size of their catches, which could bias the length information used to estimate *TS*, however, we believe that this bias is relatively small compared to other sources of uncertainty included in the analyses. To reduce the uncertainty around species composition we need to increase the sampling effort and spatial coverage, use trawl nets of different mesh size and complement various sampling gears (e.g. net plus optics).

Although we incorporated resonance scattering in our density estimates, bias in sampling towards species of larger sizes, might have contributed to underrepresenting the abundance of the small fsh responsible for resonant scattering. Conversely, in our resonance-scattering model we used a relatively small fxed percentage of volume of fsh occupied by the swimbladder (0.1%). Although this value is within the range of direct measurements from mesopelagic fsh swimbladder morphology (0.01–2.3%, Yasuma et al. [2010](#page-18-8)), we did not consider sensitivity to this or the other swimbladder model parameters. Potential resonance scattering of mesopelagic fsh needs to be studied further in the SO, with emphasis on comprehensive biological and acoustical sampling, modelling of the scattering properties of mesopelagic fish, and on the ground-truthing of *TS* predictions from resonance-scattering models. Sensitivity analyses of modelling studies have identifed that morphometric parameters such as the swimbladder volume and aspect ratio of the fish body are the main factors driving uncertainty in abundance estimates of mesopelagic fsh (Proud et al. [2018](#page-18-7)), so speciesspecifc measurements of these parameters are required. The lack of information on acoustic properties of mesopelagic fish is a common case, with only a few communities characterised acoustically, e.g. southern California current system (Davison et al. [2015b](#page-17-31)) and temperate zones of the Northwest Pacifc (Yasuma et al. [2006](#page-18-17), [2010](#page-18-8); Sawada et al. [2011\)](#page-18-18).

To date there is no *TS–L* relationship for any species in the region (McClatchie and Dunford [2003](#page-18-3)). Modelling has been commonly used to establish linear relationships between *TS–L* (e.g. Yasuma et al. [2003](#page-18-15); Davison [2011](#page-17-9)), but resonance and ontogenic changes of the swimbladder may hinder their use for gas-bladdered species across a wide size and depth range (Davison [2011;](#page-17-9) Davison et al. [2015b](#page-17-31); Scoulding et al. [2015](#page-18-5)). For example, Dornan et al. [\(2019\)](#page-17-34) reported an apparent loss of gas in swimbladders of *E. antarctica* for sizes > 5.1 cm length for fish collected in the Scotia Sea.

Acoustic backscatter showed a large-scale latitudinal pattern, with a statistically signifcant decrease from north to south in the NZ sector of the SO (Escobar-Flores et al. [2018a](#page-17-3)). Mean backscatter levels in the Northern region were more than 50% higher than in the Central region, and the levels of both these regions were more than one order of magnitude higher than in the Southern region (see Table [4](#page-6-0)). Density estimates did not show the same latitudinal degree of change; estimated levels of density were higher in the Northern and lower in the Southern region, but the magnitude of the decrease was much less than that observed for backscatter.

Inconsistencies between backscatter and estimates of mesopelagic fsh density were driven by the diferences in the species composition and the acoustic properties of the species in each region. Information on species composition in our study was drawn from research voyages undertaken in diferent years, but the characterisation of the mesopelagic fish communities in the three regions was in agreement with previous regional studies, and also captured described changes in species composition with latitude in the SO (McGinnis [1982;](#page-18-19) McClatchie and Dunford [2003](#page-18-3)). Although the number of trawls used for abundance estimates in this study was small, there was a marked contrast in composition and species dominance between latitudinal regions: the northern region was dominated by *L. hectoris*; and the central and southern region were dominated by *E. antarctica* and *P. antarctica*, respectively*.* In addition, each region had at least one 'endemic' species which was not present elsewhere (e.g. *L. hectoris* only present in the Northern region and *P. antarctica* only present in the Southern region).

The species composition in the Northern region resembled that of an earlier study by Robertson et al. ([1978\)](#page-18-20), with myctophids (*L*. *hectoris*, *Symbolophorus boops*, *Gymnoscopelus* spp*.*, *Lampanyctus* spp. and *Protomyctophum* sp.) and the sternoptychid *M. australis* the most abundant fish species. *L. hectoris* and *M. australis* have been described consistently as the most common and dominant over the Chatham Rise and Bounty Trough (east of NZ) (Robertson et al. [1978](#page-18-20); McClatchie and Dunford [2003;](#page-18-3) Gauthier et al. [2014](#page-17-16)). These two species have gas-flled swimbladders (Marshall [1960](#page-18-2)), which makes them strong scatterers. This is because gas-flled swimbladders can account for around 90–95% of the acoustic response of a fish (Foote [1980](#page-17-35); Davison [2011](#page-17-9)). In addition, many of these Northern swimbladder species can produce resonance scattering at 38 kHz. Consequently, *BWR* values in this region were high, leading to lower estimates of density since these species show a high contribution in terms of backscatter for relatively low weight.

The Central and Southern regions had lower BWR levels due to the higher occurrence of species without swimbladder (e.g. *P. antarctica*), species whose swimbladder regress with age (e.g. genus *Gymnoscopelus*) (Dornan et al. [2019\)](#page-17-34), and euphausiids (e.g. *E. superba*). Many of the strong scattering species found in the Northern region are absent further south. Only one species of the genus *Electrona*, collected in the Northern region was found in the southern two regions. A wide latitudinal distribution range has previously been reported for *E. carlsbergi* (McGinnis [1982;](#page-18-19) Hulley [1990](#page-17-36)). Likewise, the incidence of species capable of resonating at 38 kHz in the Central and Southern regions was restricted to four and two species, respectively.

Although the species composition information collected in our trawls agreed with the extensive literature (e.g. Gjøsaeter and Kawaguchi [1980;](#page-17-2) Brodeur and Yamamura [2005\)](#page-16-2) in suggesting that myctophids dominate the mesopelagic fsh community, we acknowledge that backscatter could contain nektonic and planktonic organisms with different acoustic properties that were not considered as part of this analysis. Some trawls were dominated by tunicates or gelatinous zooplankton (e.g. salps and jellyfsh). These groups can also scatter sound at 38 kHz (e.g. Wiebe et al. [2010](#page-18-21)) and so contribute to observed backscatter, although their overall contribution at 38 kHz frequency was assumed to be low (but see Brierley et al. [2001\)](#page-16-8). Another potential bias can be caused by the presence of gas-bearing gelatinous organisms (e.g. siphonophores), which are capable of resonating at 38 kHz at depth (e.g. Kloser et al. [2016](#page-17-37)). These organisms are poorly sampled by nets because their fragile bodies fragment (Davison et al. [2015b](#page-17-31)). Species of calycophoran siphonophores (suborder Calycophorae, Order Siphonophora) which are characterised by loss of the gas-flled pneumatophore (organ to which resonance is attributed to), have been caught in some mid-water trawls in 2011 (research voyage TAN1116, siphonophores present in 6 trawls, with maximum contribution 0.8% in numbers), and in more recent research voyages (NIWA, unpublished data). Although never dominant in number or weight, squids were also often caught (see Escobar-Flores et al. [2018a\)](#page-17-3). Squid are widely distributed in the epi-, meso- and bathypelagic zones of the SO, where the most abundant and broadly distributed species are *Galiteuthis glacialis* and some belonging to the family Bachioteuthidae (Collins and Rodhouse [2006](#page-16-9)). Squid are weak individual targets at 38 kHz, but may be detected if they form aggregations or dense layers (Goss et al. [2001](#page-17-38)).

Acoustic backscatter collected opportunistically can be used to study the distribution of MTL organisms in remote areas. However, to convert backscatter to density usually requires dedicated sampling to provide biological information to characterise species communities. Acoustic backscatter may not correlate with patterns of density of mesopelagic fsh, and this needs to be taken into account when developing MTL predictive models that use acoustic data for parametrisation and validation. To advance our estimates, we need to carry out more *TS* experiments, if possible establish *TS–L* relationships for the dominant non-resonant species, obtain more accurate parameters for modelling *TS* of mesopelagic fish and improve our knowledge on mesopelagic fish swimbladder morphology and ontogenic changes. Though resonance can bias estimates of abundance of mesopelagic fsh and hinder the linear conversion of acoustic backscatter col-lected at 38 kHz into densities of fish (Davison et al. [2015a](#page-17-10);

Kloser et al. [2016;](#page-17-37) Proud et al. [2018\)](#page-18-7), it does not afect all regions equally (it is species and size dependant), therefore, we need studies to shift from global to regional scales, to reach accurate global estimates of mesopelagic fish biomass.

Acknowledgements Funding for this study was provided by the Advanced Human Capital Programme, National Commission of Scientifc and Technological Research (CONICYT, CHILE), through a Becas-Chile Doctorate scholarship, the National Institute of Water and Atmospheric Research (NIWA—New Zealand), through a NIWA Science Award Grant, and the New Zealand Ministry of Business, Innovation, and Employment (MBIE) through the Endeavour Fund Programme *Ross-RAMP.* Thanks to NIWA for providing the data and the facilities for undertaking this research, and to Dr Martin Cox for providing krill target strength estimates.

Compliance with ethical standards

Conflict of interest The authors declare that they have no confict of interest.

Ethical approval All fish used in this research were collected by a midwater research trawl under special permit for the New Zealand Ministry for Primary Industries. Special permits were granted under Section 97 of the Fisheries Act 1996 to authorize taking aquatic life for the purpose of investigative research. No fsh were CITES listed.

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