1	Behavioural generalism could facilitate co-existence of tropical and
2	temperate fishes under climate change
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5	Ericka O. C. Coni <sup>1</sup> , David J. Booth <sup>2</sup> , Camilo M. Ferreira <sup>1</sup> , Ivan Nagelkerken <sup>1,*</sup>
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7	<sup>1</sup> Southern Seas Ecology Laboratories, School of Biological Sciences and The Environment
8	Institute, DX 650 418, The University of Adelaide, Adelaide, SA 5005, Australia
9	<sup>2</sup> Fish Ecology Lab, Faculty of Science, University of Technology Sydney, Ultimo, NSW 2007,
10	Australia.
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12	*Corresponding author: ivan.nagelkerken@adelaide.edu.au
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14	Running head: Behaviour change facilitates range-extension
15	
16	Abstract
17	1. Coral-reef fishes are shifting their distributions poleward in response to human-mediated
18	ocean warming, yet the consequences for recipient temperate fish communities remain poorly
19	understood. Behavioural modification is often the first response of species to environmental
20	change, but we know little about how this might shape the ongoing colonisation by tropical
21	fishes of temperate-latitude ecosystems under climate change.
22	2. In a global hotspot of ocean warming (southeast Australia), we quantified 14 behavioural
23	traits of invading tropical and local co-occurring temperate fishes at 10 sites across a 730 km
24	latitudinal gradient as a proxy of species behavioural niche space in different climate ranges
25	(subtropical, warm-temperate, cold-temperate).

26	3. We found that tropical fishes (4 species) modified their behavioural niches as well as
27	increased their overall behavioural niche breadth in their novel temperate ranges where
28	temperate species predominate, but maintained a moderate to high niche segregation with
29	native temperate species across latitudinal range position. Temperate species (3 co-occurring
30	species) also modified their niches, but in contrast to tropical species, experienced an
31	increased niche breadth towards subtropical ranges. Alterations to feeding and shoaling
32	behaviours contributed most to niche modifications in tropical and temperate species, while
33	behaviours related to alertness and escape from potential threats contributed least.
34	4. We here show that at warmer and colder range edges where community structures are being
35	reshuffled due to climate change, behavioural generalism and niche modification are potential
36	mechanisms adopted by tropical range extenders and native-temperate fishes to adjust to
37	novel species interactions under climate change.
38	
39	Keywords: ocean warming, tropicalisation, range extensions, tropical vagrant fishes,
40	behavioural niche breadth, niche segregation, temperate ecosystems.
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43	Introduction
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45	Species distributions are governed by long-term dynamics of biological-physical factors
46	(MacArthur 1972; Peterson & Lieberman 2012). More recently, however, increased
47	anthropogenic disturbances have facilitated a progressive and rapid global redistribution of
48	species, intensifying species invasion rates, which is now one of the greatest impacts of
49	climate change (Pecl et al. 2017). Despite the pace of invasion being higher for introduced
50	species than range-extending species, the latter bring with them novel ecological interactions

resulting in impacts on the biodiversity and ecosystem functioning of recipient communities at a similar magnitude as those caused by introduced species (Sorte et al. 2010, Vergés et al. 2014; Vergés et al. 2016). Yet, we still have little understanding of the mechanisms that allow the colonization of range-extending species and their ensuing impacts on local communities (Mack et al. 2000).

56 Life history traits such as propagule pressure (i.e. quantity of arriving individuals 57 depending on the number of releases and dispersing individuals; Lockwood et al. 2005) is a key process determining successful species range shifts (Ben Rais Lasram et al. 2008; 58 Soeparno et al. 2012). However, traits that facilitate dispersal of larval propagules are less 59 60 relevant once species have arrived in their novel environments (Monaco et al. 2020). To 61 establish viable populations, animals need to cope with novel local conditions (Angert et al. 62 2011), with behavioural traits playing a crucial role in how they interact with their novel 63 environment. Broad behavioural ranges or individual-level behavioural variability should, therefore, increase the ability of species to persist under altered biotic and climatic conditions, 64 65 especially during the early stages of invasion (Chapple et al. 2012). Still, the role of behaviour of range-extending species and their interactions with local species are still poorly 66 understood. 67

68 One of the central tenets of species invasion success is that species that are flexible in their resource use and have broad niches are more likely to prosper in novel environments 69 (Warren et al. 2001; Cassey et al. 2004; Sol et al. 2005; Slatyer et al. 2013). Individual 70 behaviours underpin the functional role and the ecological niche space of a species in its 71 72 environment (Bergmüller & Taborsky 2010). This means that species with a broad behavioural repertoire would be favoured in novel ranges over those with a narrow repertoire, 73 as it allows them to exploit resources within a broad spectrum of ecological conditions and 74 avoid conflict with local species (Wright et al. 2010; Feary et al. 2014; Sunday et al. 2015). 75

Thus, range-extending behavioural generalist species (e.g. showing diversification in feeding and shoaling strategies) have a higher likelihood to persevere in non-native communities than range-extending specialist species with a more constrained behavioural repertoire (Donelson et al. 2019).

Non-native species often reconfigure local community structures following their 80 invasion (Mooney & Cleland 2001; Strayer et al. 2006; David et al. 2017). Such 81 82 modifications of native communities can be irreversible, especially when invaders become well established (Harborne & Mumby 2011; Nagelkerken & Connell 2015). Despite invasive 83 84 species generally being stronger competitors than native species (Parker et al. 2013), they are 85 more likely to establish when they do not share the same niches as local species (Shea & Chesson 2002; Thuiller et al. 2010; van Kleunen et al. 2010). For example, range-extending 86 87 species that are morphologically similar to native species might have lower success rates in 88 their establishment, owing to greater interspecific competition with native species (Azzuro et al. 2014; Smith et al. 2016). Hence, the degree to which tropical species overlap in their 89 90 behavioural niches with temperate species can provide strong insights into the degree of 91 competition with local species and their likelihood to increase their population sizes in temperate ecosystems under climate change. 92

The impact of range-extending species depends on the response of native species to the incursion of these novel 'intruders' (Berthon 2015). In some cases, natives will fail to adjust, resulting in local or global extinction (Case & Bolger 1991; Fritts & Rodda 1998).

96 Alternatively, natives may possess traits (pre-adaptation) that may diminish the impacts of

97 invaders, allowing their coexistence (Vermeij 1982; Strauss at al. 2006). Ecological insights

98 into the dynamic of invasion are typically studied by comparing traits between invaders and

native species (Belmaker et al. 2009; Edelist et al. 2013; Elleouet et al. 2014). Such

100 comparisons allow an understanding of how invasions might alter local communities and

101 whether the structure and fundamental niche of the recipient community influences invasion 102 success (Parker et al. 2006; Lockwood et al. 2013; Ricciardi et al. 2013). Understanding the similarity in behavioural niche of invasive-tropical and native-temperate species is key to 103 104 understand how native species are responding to tropical invasions due to climate change. Here we test the hypothesis that behavioural modification, generalism, and segregation of 105 106 range-extending tropical reef fish might facilitate their establishment in temperate marine 107 environments. We study two potential underlying mechanisms: 1) their behavioural niche space modification (i.e. behavioural repertoire), and 2) their degree of behavioural overlap 108 with native temperate species. We assessed this for 4 tropical and 3 temperate fish species in 109 110 situ over a 730-km latitudinal and temperature gradient, spanning climate ranges from subtropical and warmer-temperate to colder-temperate environments where tropical and 111 112 temperate species increasingly coexist due to ocean warming. We used a novel multivariate 113 ellipse-based metric within a Bayesian framework, to unravel behavioural modifications and overlap in behavioural niche space of co-occurring tropical and temperate fishes by 114 115 evaluating: 1) changes in the breadth of their behavioural niches (e.g. expansion vs 116 contraction), 2) shifts in the composition of their behavioural niches (alteration in the 117 predominant behaviours expressed), and 3) differences in their degree of behavioural niche 118 overlap (Fig. 1). This approach enhances our understanding of the likelihood of tropicalisation success as a function of species behavioural niche modifications, and their potential effects on 119 temperate species and ecosystems under climate change. 120



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Figure 1. Conceptual diagram of possible mechanisms of behavioural niche plasticity under climate change. a) behavioural niche shift across range position (subtropical, warm-temperate, coldtemperate) based on the positioning in niche space (individual ellipses), b) behavioural niche contraction (decreased behavioural repertoire) vs expansion (increased behavioural repertoire), indicating the extent to which a species is specialised or generalised in their behavioural niche, and c) behavioural niche overlap measured as the percentage of behavioural niche space shared between two species.

129

# 130131 Methodology

132

# 133 Study area

134 Ten sites at five locations were selected over a latitudinal gradient along the SE Australian

135 coastline (Fig. 2) and sampled during the summers of 2017 and 2018 when recruitment of

136 tropical fishes peaks. Southeast Australia is a hotspot of range-shifting tropical species

137 mediated by ocean warming (Ridgway 2007; Hobday & Pecl 2014), thus this is a natural

138 climate change laboratory for a unique investigation of the performance of sympatric novel

- 139 tropical and native temperate species under ongoing climate change in the wild. Two sites at
- 140 South West Rocks (30°52'34"S, 153°4'2"E and 30°53'0"S, 153°2'17"E) and two sites at Port
- 141 Stephens (32°42'56"S, 152°10'58"E and 32°44'55"S, 152°10'19"E) are located at subtropical

range position and represented reefs with abiotic-biotic features (e.g. mean summer 142 143 temperature  $\sim 25$  °C and kelp-free reefs) closest to that of the native ranges of tropical fish. Despite the lack of evidence of significant breeding populations, tropical reef fishes have been 144 145 present at these subtropical locations for a long time, and during the study their abundances were higher at the subtropical than at the temperate range positions (Fig. S1), especially for 146 147 juveniles (Fig. S2). The studied temperate fishes naturally occur at these subtropical locations 148 (i.e. their natural trailing edges). These tropical and temperate fishes have coexisted for longer 149 periods of time at these subtropical reefs (during all seasons). However, there is no evidence of how long they have been coexisting at warm-temperate and cold-temperate locations where 150 151 until now they only coexist during the summer.. Three sites at two locations were selected at the cold-temperate range position (mean summer temperature ~ 21 °C) with unfamiliar 152 environmental features (i.e. sites with abiotic-biotic features dissimilar to those of the native 153 154 ranges of tropical fish) for tropical fishes: Narooma (one site, 36°12'54"S, 150°7'51"E) and Merimbula (two sites, 36°53'40"S, 149°55'25"E and 36°44'13"S, 149°58'58"E). This 155 156 southernmost cold location is representative of a fully temperate rocky reef ecosystem, and harbors much higher densities of temperate fishes and much lower densities of tropical fishes 157 than the subtropical location (Monaco et al. 2021) (Fig. S1). Finally, three sites at one location 158 159 were selected at Sydney, which is considered here as the warm-temperate range position: 160 Shelly Beach (33°48'1.13"S, 151°17'31.23"E), Little Manly (33°48'23"S, 151°17'8"E) and Narrabeen (33°42'7"S, 151°18'21"E). The warm-temperate range position represented a 161 transition zone with intermediate temperatures (seawater ~23 °C during summer) and habitats 162 163 (kelp as well as increasing tropical coral presence, Booth & Sear 2018) compared to the subtropical and cold-temperate locations. This location is a hotspot of tropicalisation, which 164 has seen increasing rates of tropical fish invasions over the last two decades (Fowler et al. 165 2018). The sites were chosen based on an 18-yr study of ongoing tropical fish settlement on 166

shallow rocky reefs along the coast of SE Australia (Booth et al. 2007; Booth et al. 2018).
From the perspective of tropical fishes, the cold-temperate locations are considered as their
extreme leading edges (coolest area of a species' range) where they are invading, while for
the co-occurring temperate species the subtropical latitudinal locations are considered as their
trailing warm-water edges.

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174 Map showing the 5 sampling locations (black circles) with their respective absolute latitudes. 'Subtropical': South West Rocks and Port Stephens. 'Warm-temperate': Sydney. 175 176 'Cold-temperate': Narooma and Merimbula. The coloured circles indicate the spatiallyvalidated records (i.e. records that have highly accurate coordinates entries) of historical 177 178 (limited by a date range before the tropical fish surveys started, from 1780 to 2003) and current (last five years, from 2016 to 2021) distribution of the studied fishes along the coast of 179 180 SE Australia based on the number of occurrences. Species distributional ranges were adapted 181 from the Atlas of Living Australia (https://spatial.ala.org.au/#). 182

183

184 Study species

185 Only the most commonly observed tropical coral reef fish species had their behaviours 186 quantified to allow for sufficient replication within each latitudinal range position, while the temperate native species were chosen based on their known shoaling interactions with the 187 188 respective tropical fishes (see Smith et al. 2018). The tropical fishes used in this study are called vagrant species because they have not established breeding populations at any of our 189 190 study sites yet, and co-occur with local species at temperate latitudes only on a seasonal-basis 191 (warm seasons – January to May; Feary et al. 2014). Their abundances drop quickly as water 192 temperature decreases through the season resulting in a heavy overwinter mortality (Booth et al. 2011), but the expectations are that their abundances will continue to increase with the 193 194 intensification of ocean warming and strengthening of poleward ocean currents (Figueira & Booth 2010; Booth et al. 2018). A total of 7 species (4 tropical vagrants and 3 temperate 195 196 native species) were investigated. The four tropical fish species selected and the number of 197 replicates (i.e. individual fishes sampled for behaviours per latitudinal range position) were: two water-column omnivorous feeders (1) sergeant major, Abudefduf vaigiensis (subtropical = 198 199 22, warm-temperate = 22, cold-temperate = 20) and (2) scissor tail, Abudefduf sexfaciatus 200 (subtropical = 8, warm-temperate = 6, cold-temperate = 7), and two grazing benthic 201 herbivores (3) dusky surgeonfish, Acanthurus nigrofuscus (subtropical = 19, warm-temperate = 17) and (4) convict surgeonfish, Acanthurus triostegus (subtropical = 19, warm-temperate = 202 203 18). As the number of tropical fish recruits varies annually, the two surgeonfishes could not 204 be found in sufficient numbers  $(n \ge 5)$  at the high latitude sites during the sampling years 205 (2017-2018). Thus, they were not included in the analysis for this location. The three 206 temperate native species selected and their number of replicates were one pelagic omnivore (1) mado, *Atypichthys strigatus* (subtropical = 6, warm-temperate = 10, cold-temperate = 8) 207 and one benthic omnivore (2) stripey, *Microcanthus strigatus* (subtropical = 21, warm-208 temperate = 17, cold-temperate = 17), and one territorial benthic herbivore (3) white-ear 209

damselfish, *Parma microlepis* (subtropical = 9, warm-temperate = 20, cold-temperate = 20)
(Fig. S3).

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## 213 Data collection and study design

Behaviours of each fish were quantified from underwater video recordings. First, visual 214 215 surveys were performed to locate recruits and juveniles of tropical fishes at the selected sites. 216 Then, underwater cameras (GoPro's) attached to dive weights were placed on the reef 217 substratum at a distance of  $\sim 50$  cm from the temperate and tropical fishes found during the surveys, regardless if the fish were solitary or in a school. This distance was based on a trade-218 219 off between being able to film recruits of tropical fishes with a relatively small body size (< 5 cm) on temperate reefs versus maintaining some distance to avoiding disturbing them with the 220 221 presence of a camera. Usually recruits and early-stage individuals of these species are site-222 attached, allowing suitable recordings of their behaviours in situ. At each site, cameras were deployed over several consecutive days (maximum of 10 cameras deployed on a single day) 223 224 in different areas to avoid filming the same individuals. Some of the video recordings had to 225 be discarded due to the low image quality and when the focal fishes were out of the camera view. Based on Nanniga et al. (2017), after placing the cameras, the first 3 min of recording 226 227 was considered as acclimation time to the recorder before behaviours were quantified for a total of 10 min. per recording. We did not observe any clear disturbance of the fish by the 228 229 presence of the camera such as rapid swimming towards or away from the camera. To evaluate whether species behaviour differed over a range of climatic and biotic conditions, 230 231 recordings were conducted over a latitudinal temperature gradient ranging from native to nonnative habitats for both tropical and temperate fish assemblages (see under Study area above). 232 The data collection was performed under animal ethics approval S-2015-222A and S-2017-233 002 (University of Adelaide) and ETH17-1117 (University Technology of Sydney). 234

#### 236 Fish behaviour

237 Fourteen behavioural variables within seven behavioural traits were quantified for each 238 individual fish from the video footage (Table S1): (1) water column position (proportion of time spent on the bottom vs. midwater), (2) boldness (estimated by the proportion of time 239 240 away from shelter vs. near to shelter), (3) alertness (number of times that an individual 241 showed a rapid increase in their swimming speed, often when larger temperate fishes approached), (4) feeding (proportion of time spent feeding, and bite rate on the substratum vs 242 water column), (5) shoaling interactions (proportion of time solitary, or shoaling with 243 244 conspecifics, heterospecific tropical species, heterospecific temperate species, and mixed-245 species groups), (6) agonistic behaviour (number of times chasing or escaping from other 246 individuals), and (7) activity levels (proportion of time that the individual was moving). 247 All observations were consecutively quantified from the videos using the software VLC media player (version 2.1.3) and for each focal individual all 14 behaviours were analysed. To 248 249 avoid pseudo-replication only one individual of each species was analysed in each video recording when they were shoaling with conspecifics. Due to the variable time that 250 251 individuals spent in front of the camera, each individual was analysed for a max. of 2 min. so 252 as to standardise the data collection and effort. Observation times of a few minutes per individual have been found to suffice for a representative estimate of an individual's 253 254 behaviour (McClanahan et al. 1999; Biro et al. 2010; Francini-Filho et al. 2010). Behaviours 255 were analysed using two different approaches, either through the number of times that the behaviour occurred during the period of observation – point behaviour (e.g. bite rates) or in 256 each 10-sec interval ongoing observation — state behaviour (e.g. shoaling), which were then 257 transformed to proportion of time (%) spent performing the behaviours (see Table S1 for 258 more details). 259

#### 260 Statistical analyses

261 To assess the multidimensional behavioural niche space (i.e. behavioural repertoire) of species across a latitudinal gradient the SIBER R-package was used. Because of the high 262 263 multivariate space of our data set (14 behaviours) and because SIBER only works with two axes, we first performed a Redundancy Analysis (RDA) on the 14 behaviours to reduce the 264 multidimensional data set to bidimensional coordinates (i.e. along two axes, Table S2). This 265 266 allowed us to establish the relative position in the behavioural space for each individual per species (these values are based on the relative importance of behavioural traits in the initial 267 dataset; Villéger et al. 2008, Laliberte & Legendre 2010). As long as we do not calculate p-268 269 values or confidence intervals using RDA, we do not need to satisfy the data normality 270 assumption. RDA was only performed as a dimension reduction technique and to reveal the 271 most important behavioural traits driving latitudinal range position differences in behavioural 272 niche space. As behavioural observations were measured on different scales (e.g. count and percentage data), we first standardised the data using the Hellinger method (Legendre & 273 274 Gallagher 2001) which was also used as a transformation approach to avoid zero inflation in the RDA (Paliy et al. 2016) to calculate a distance matrix that was used as the basis for the 275 276 RDA. RDA outputs are similar to those obtained from Principal Component Analysis 277 (Legendre & Legendre 1998). However, RDA is a constrained ordination that assesses how much variation in the response variables (behaviours) can be explained by variation in the 278 279 explanatory variables (species and latitudes) (Paliy et al. 2016). The first two RDA axes 280 together accounted for 68% of the observed variation in behavioural data for the tropical and temperate species. The order of the behaviours that showed the best representation of the two 281 282 principal RDA axes are listed in (Table S2).

The two axes that were extracted from the RDA analysis were then used to create
standard ellipse areas (SEA) representing relative behavioural niche breadths in a bivariate

space, where the standard ellipse area represents the bivariate standard deviation. We 285 286 generated Bayesian credible intervals of the standard ellipse area for each species at each 287 latitude position (subtropical, warm-temperate, and cold-temperate), which is analogous to a 288 bootstrapping procedure. In this analysis, the probability that two niche areas differed from each other is determined using Bayesian inference based on the 10,000 posterior draws (i.e. 289 290 the probability that the niche area of group 1 is greater than group 2 is the proportion of group 291 1 standard ellipses that are greater than group 2 standard ellipses, based on the 10,000 292 replicates). Species with larger ellipse areas therefore exhibit a higher variability among individuals in behavioural trait space, and can therefore be considered as a behaviourally 293 294 more generalistic species (Fig. 1). In contrast, species with smaller ellipse areas express only 295 a restricted range of behavioural traits, tending towards behavioural specialisation. Although 296 the unbalanced number of replicates among species and range positions, and the low number 297 of replicates for some species, this did not affect the interpretation of our results. These issues are dealt with by application of a small sample size correction using metrics based on 298 299 standard ellipses (SEA) which were corrected to minimize bias caused by small sample sizes 300 (SEAc). Additionally, Bayesian estimation of standard ellipses (SEA<sub>b</sub>) allows for an unbiased 301 estimate of relative niche area even for small sample sizes, in contrast to metrics such as 302 convex hulls, which are sensitive to small sample size (see details in Jackson et al. 2011, 303 2012).

The SEA<sub>c</sub> was used to compute the overlap between species of tropical and temperate fish populations within each latitude position and the overlap of each individual species across latitudes. The overlap is expressed as a proportion of the sum of the non-overlapping areas of the ellipses, which is calculated as the proportion of the overlapping area between the two species divided by the sum of the ellipses areas of the species minus the proportion of the overlap as shown in the formula bellow:

310 Ovelap proportion = 
$$\frac{Overlap_{sp1 vs sp2}}{(SEA_{sp2} + SEA_{sp1} - Overlap_{sp1 vs sp2})}$$

311	We consider a significant species overlap to have a proportion of >60%, the same
312	criteria as used in the Schoener diet overlap index (Schoener 1968; Guzzo et al. 2013). We
313	then used a Bayesian approach (SEA <sub>b</sub> ) as described in Jackson et al. (2011) to obtain
314	confidence intervals for behavioural niche space. These confidence intervals allow for
315	statistical comparisons of the sizes of behavioural niche areas among species within
316	latitudes. All analyses were performed using the Stable Isotope Bayesian Ellipses in R
317	(SIBER) package (Jackson et al. 2011).
318	To understand whether social interactions would explain the extension or contraction of
319	the species behavioural niche space, agonistic interactions and shoaling composition were
320	compared between tropical and temperate species among the latitudinal positions using
321	permutational ANOVAs. Agonistic interactions were measured as the number of chases per
322	minute, and shoaling behaviour was measured as the proportion of time. Whether these
323	behaviours occurred between individuals of the same species (conspecifics), or with
324	heterospecific tropical species, heterospecific temperate species, or the mixture of all these
325	species (only for shoaling) was also considered as a factor in the analyses.
326	
327	
328	Results

# 330 Behavioural niche shifts across latitudinal range positions

Both tropical and temperate species reshuffled their behavioural niche as a function of range

position (Fig. 3, Fig. 1a). In general, behavioural niche space (based on standard ellipse areas)

- of individual species showed low to moderate overlap among range positions (19–60%
- 334 overlap, Table 1). Only 5 out of 17 species-range position comparisons showed relatively

- high overlap (62–70%, Table 1) in behavioural niche space. Feeding, shoaling interactions,
- and to a lesser extent activity levels appear to be the most important behavioural traits driving
- 337 latitudinal range position differences in behavioural niche space within individual tropical and
- 338 temperate species (Fig. S4).



339



- 344 observed fish (sample) per species. See Table 1 for overlap in niche space.
- 345

Table 1. Behaviour similarity among range positions based on the overlap (%) of the standard ellipses area (SEAc) of each species per latitude position. Bold numbers indicate the latitudes that showed a negligible behavioural shift (behaviour similarity between latitudes > 60%) following the criterion used by Schoener 1968 and Guzzo et al. 2013.

			Overlap
Affinity	Species	Latitude	(%)
		subtropical vs. warm-temperate	42
	Abudefduf sexfasciatus	subtropical vs. cold-temperate	68
		warm-temperate vs. cold-temperate	68
Tranical		subtropical vs. warm-temperate	70
i ropicai	Abudefduf vaigiensis	subtropical vs. cold-temperate	45
		warm-temperate vs. cold-temperate	46
	Acanthurus nigrofuscus	subtropical vs. warm-temperate	50
	Acanthurus triostegus	subtropical vs. warm-temperate	59
		subtropical vs. warm-temperate	30
	Atypichthys strigatus	subtropical vs. cold-temperate	37
		warm-temperate vs. cold-temperate	61
		subtropical vs. warm-temperate	56
Temperate	Parma microlepis	subtropical vs. cold-temperate	39
		warm-temperate vs. cold-temperate	62
		subtropical vs. warm-temperate	41
	Microcanthus strigatus	subtropical vs. cold-temperate	37
		warm-temperate vs. cold-temperate	19

350

## 351 Behavioural niche expansion across latitudinal range positions

352 The behavioural niche breadth (behavioural repertoire) of tropical vagrant fishes showed an

353 expansion with increasing latitudinal position (i.e. from warm to colder waters), except for a

deviation of *A. sexfasciatus* at the cold-temperate latitude (Fig. 4, Fig. 1b, Table S3).

Temperate native fishes showed the opposite pattern, with an increase in niche space towards subtropical latitudes (i.e. from cold to warmer waters). In general, tropical species exhibited a wider behavioural niche breadth than temperate species, although *A. strigatus* had the largest niche area of all species  $(0.90\%^2)$  at the subtropical latitude (Table S3). The species that had

the smallest behaviour niche space in all range positions was the territorial damselfish *P*.

- 360 *microlepis* (smallest area  $0.09 \ \text{m}^2$  at cold-temperate latitude), indicating their narrow
- 361 behavioural repertoire.
- 362



Figure 4. Results of Bayesian estimation of the size of the standard ellipses areas (SEAb) based on 14 behaviours (i.e. behavioural niche space) of tropical and temperate species at each range position (S = subtropical, WT = warm-temperate, CT = cold-temperate). Shown are Bayesian estimates (• = mode) with 50%, 75% and 95% credible intervals (shaded boxes), and maximum likelihood estimates of the means (x). Different letters above the bars indicate significant differences (increase or decrease) in behavioural niche breadth among latitudes for each species (see Table S3 for statistical results).

#### 372 Behavioural niche overlap between tropical and temperate species

Behavioural niche space of tropical and temperate species exhibited a low to moderate 373 374 overlap independent of latitudinal range position, ranging from 0% to 53% at the subtropical 375 latitude, 0% to 61% at the warm-temperate latitude, and 1% to 59% at the cold-temperate latitude (Fig. 5, Fig. 1c, Table 2). Moderate niche overlap between tropical and temperate 376 species was driven at all three latitudinal range positions by planktonic feeders that form 377 378 social groups, viz. the tropical Abudefduf vaigiensis and Abudefduf sexfasciatus with the temperate Atypichthys strigatus, whilst significant niche overlap (61%) between tropical and 379 temperate species was only found for one species pair (Abudefduf vaigiensis vs Atypichthys 380 strigatus at middle latitude) out of all 30 species-pair combinations across range positions. 381

382 Moderate and significant overlap in behavioural niche space between these tropical and

- temperate zooplanktivores was driven by feeding and shoaling behaviours at all three range
- 384 positions, but especially in the warm-temperate range (Fig. S5).



Figure 5. Standard ellipse areas (SEAc) showing the degree of overlap in behavioural niche space among and within tropical species (solid circles) and temperate species (dashed circles) across a latitudinal gradient. SEAc were calculated from the two axes extracted from a multivariate analysis (RDA) based on 14 species behaviours per latitude. The data points represent each observed fish (sample) per species. The ellipses are based on a 40% confidence interval. See Table 2 for degree of niche overlap.

Table 2. Behavioural similarity between species at different range positions (a: subtropical, b:
warm-temperate, c: cold-temperate) based on the overlap of the standard ellipses area (SEAc).
Bold numbers (\*) indicate the pairs of species that showed a high overlap (overlap >60%)
following the criterion used by Schoener (1968) and Guzzo et al. (2013).

 a)

3	9	8	
		-	

Subtropical	Pairs of species		Overlap (%)
Affinity			• • •
•	Abudefduf sexfasciatus	Abudefduf vaigiensis	60*
	Abudefduf sexfasciatus	Acanthurus nigrofuscus	18
Turninglass Turningl	Abudefduf sexfasciatus	Acanthurus triostegus	8
i ropical vs. i ropical	Abudefduf vaigiensis	Acanthurus nigrofuscus	14
	Abudefduf vaigiensis	Acanthurus triostegus	10
	Acanthurus nigrofuscus	Acanthurus triostegus	70*
	Abudefduf sexfasciatus	Atypichthys strigatus	53
	Abudefduf sexfasciatus	Parma microlepis	15
	Abudefduf sexfasciatus	Microcanthus strigatus	42
	Abudefduf vaigiensis	Atypichthys strigatus	43
	Abudefduf vaigiensis	Parma microlepis	2
Tuenical va Tama avata	Abudefduf vaigiensis	Microcanthus strigatus	31
l ropical vs. l'emperate	Acanthurus nigrofuscus	Atypichthys strigatus	9
	Acanthurus nigrofuscus	Parma microlepis	12
	Acanthurus nigrofuscus	Microcanthus strigatus	41
	Acanthurus triostegus	Atypichthys strigatus	0
	Acanthurus triostegus	Parma microlepis	5
	Acanthurus triostegus	Microcanthus strigatus	25
	Atypichthys strigatus	Parma microlepis	6
Temperate vs. Temperate	Atypichthys strigatus	<i>Microcanthus strigatus</i>	24
-	Parma microlenis	Microcanthus strigatus	24

# 

**b**)

Warm-temperate	Pairs of species		Overlap (%)
Affinity			
	Abudefduf sexfasciatus	Abudefduf vaigiensis	37
	Abudefduf sexfasciatus	Acanthurus nigrofuscus	0
Turnical va Turnical	Abudefduf sexfasciatus	Acanthurus triostegus	0
I ropical vs. I ropical	Abudefduf vaigiensis	Acanthurus nigrofuscus	0
	Abudefduf vaigiensis	Acanthurus triostegus	12
	Acanthurus nigrofuscus	Acanthurus triostegus	56
	Abudefduf sexfasciatus	Atypichthys strigatus	37
	Abudefduf sexfasciatus	Parma microlepis	0
Tropical vs. Temperate	Abudefduf sexfasciatus	Microcanthus strigatus	30
	Abudefduf vaigiensis	Atypichthys strigatus	61*
	Abudefduf vaigiensis	Parma microlepis	0

	Abudefduf vaigiensis	Microcanthus strigatus	47
	Acanthurus nigrofuscus	Atypichthys strigatus	5
	Acanthurus nigrofuscus	Parma microlepis	26
	Acanthurus nigrofuscus	Microcanthus strigatus	18
	Acanthurus triostegus	Atypichthys strigatus	6
	Acanthurus triostegus	Parma microlepis	20
	Acanthurus triostegus	Microcanthus strigatus	20
	Atypichthys strigatus	Parma microlepis	0
Temperate vs. Temperate	Atypichthys strigatus	Microcanthus strigatus	49
	Parma microlenis	Microcanthus strigatus	12

402 c)

Cold-temperate	Pairs of species		Overlap (%)
Affinity			
Tropical vs. Tropical	Abudefduf sexfasciatus	Abudefduf vaigiensis	59
	Abudefduf sexfasciatus	Atypichthys strigatus	59
	Abudefduf sexfasciatus	Parma microlepis	2
Tuonical va Tomorousta	Abudefduf sexfasciatus	Microcanthus strigatus	9
i ropical vs. i emperate	Abudefduf vaigiensis	Atypichthys strigatus	43
	Abudefduf vaigiensis	Parma microlepis	1
	Abudefduf vaigiensis	Microcanthus strigatus	7
	Atypichthys strigatus	Parma microlepis	0
Temperate vs. Temperate	Atypichthys strigatus	Microcanthus strigatus	0
	Parma microlepis	Microcanthus strigatus	20

403

404

## 405 Aggressive behaviours among species

406 Although not statistically significant, aggressive behaviours of most tropical and temperate

407 species towards other individuals was always highest against their own species, and very low

408 towards heterospecific tropical or heterospecific temperate species, independent of latitudinal

409 range position. A. nigrofuscus showed to be the most aggressive species with individuals of its

- 410 own species and other tropical and temperate species. Parma microlepis was the only
- 411 temperate species that showed aggression towards other species (Fig. S6, Table S4).

412

## 413 Shoaling preferences across range positions

Some of the tropical and temperate fishes showed changes in shoaling preference as a
function of range position (Fig. S7, Table S5). Two tropical fishes showed a decrease in their
shoaling with their own species (*A. triostegus*) and other tropical species (*A. nigrofuscus*) with
increasing latitudinal ranges. One tropical species (*A. vaigiensis*) increased their shoaling time
with temperate fishes with increasing latitudinal range, whilst one temperate species (*M. strigatus*) showed an increase in shoaling with other tropical species with increasing
latitudinal range.

421

422

## 423 Discussion

424

425 We here show that behavioural niche shifts and expansions are potential mechanisms adopted 426 by sympatric tropical vagrant and native-temperate fishes to adjust to changing community 427 structures under climate change. Whilst tropical fishes showed changes in their behavioural 428 repertoire at cold-temperate latitudes, temperate species exhibited a behavioural niche shift 429 and expansion at subtropical latitudes. As such, temperate species show niche expansion at their trailing warm-water edges where tropical species have higher abundances and where 430 they have been coexisting for a longer period of time, whilst tropical species show niche 431 expansion at their leading edges where they are invading novel temperate ecosystems. 432 433 Behavioural niche expansion reflects increased generalism, which might be beneficial under environmental change (Whitney & Gabler 2008) and increased competition (Svanback & 434 435 Bolnick 2007; Huss et al. 2008). Generalists are more flexible in resource use than specialists, facilitating species adaptation and coexistence (Clavel et al. 2011; Slatyer et al. 2013; Ducatez 436 437 et al. 2015). As such, tropical and temperate fishes that are behavioural generalists are more 438 likely to colonise non-native temperate areas and resist tropicalisation, respectively.

Behavioural niche segregation facilitates the colonisation of temperate reefs by tropical 439 440 fishes, and allows their coexistence with native species. Such segregation can also provide 441 advantages to temperate fishes under invasion of tropical species. Overall, tropical fishes 442 showed only a low to moderate degree of behavioural niche overlap with temperate native species, independent of range position. However, where their behaviours overlap, temperate 443 444 fishes might negatively interfere with the foraging activities of tropical fishes (Coni et al. 445 2021). It has been postulated that species that highly overlap in any of their n-dimensional niche space (e.g. climatic, diet) with other species are more susceptible to competition 446 (Hutchinson 1957). When resources are sparse, and species share niches, extinction may 447 448 eventually occur if they do not shift their niches (Human & Gordon 1996). Conversely, high 449 resource availability may allow coexistence regardless of significant niche overlap (Sale 450 1974; Connell 1980). This niche differentiation may have allowed the historical coexistence 451 of tropical and temperate species at subtropical latitudes, and this together with flexibility in their behavioural niche repertoire might contribute their future coexistence at temperate 452 453 latitudes. Additionally, aggressive behaviour was almost absent among tropical and temperate 454 species, with the highest rates of aggressiveness observed towards individuals of the same species. When the competitive ability between species is small, species can coexist despite 455 456 occupying relatively similar niches (Mayfield & Levine 2010). Our findings therefore suggest that the behavioural segregation and the low incidence of inter-species aggression could 457 458 facilitate the increasing coexistence of tropical and temperate fishes in temperate ecosystems. 459 Feeding behaviour (foraging position) was one of the most important behaviours 460 responsible for behavioural niche alteration and segregation across range positions for both tropical and temperate species. A possible explanation is the difference in prey availability 461 462 across these latitudes. Optimal foraging theory predicts that individuals modify their behaviour to maximise their physiological integrity (fitness) as prey availability changes 463

464 (Stephens & Krebs 1986; Sih & Christesen 2001). A study using stable isotopes performed at
465 the same sites and on the same species showed that prey types consumed by tropical and
466 temperate species differed regionally (from warmer to cooler latitudes) (Miranda et al. 2018;
467 Kingsbury et al. 2019), which can explain the changes in their foraging behaviour as observed
468 in the present study.

469 Shoaling composition was also responsible for behavioural niche alteration and 470 segregation across range positions for both affinities. Although some tropical species may exhibit maladaptive behaviours in temperate environments, with resulting fitness loss (e.g. 471 decreasing foraging efficiency due to high abundance of larger temperate fishes and 472 473 unfamiliarity with novel conditions) (Coni et al. 2021), the tropical vagrant and temperate species also showed some favourable behavioural traits. On temperate reefs, the studied 474 tropical vagrant fishes shoal with local species, suggesting that they are flexible in employing 475 476 social interactions with unknown species (see Figures S7, S8). This novel mixed-species shoaling can increase survivorship of tropical vagrants in temperate ecosystems (Smith et al. 477 478 2018; Pajimans et al. 2019). Shoaling behaviour with native fishes provides a source of 479 information about the new environment (e.g. recognition of unfamiliar prey and predators) (Hoare & Krause 2003), a strategy that is advantageous to range-extending tropical social 480 species, especially during their initial stages of range-extension. Although alterations to 481 shoaling preferences along the studied climate range might also have contributed to the 482 changes in species behavioural niche space, this is only one of many factors altering the 483 behavioural niches. The overall latitudinal effect was more important than the few changes in 484 485 shoaling preference, because all studied species changed their behavioural niche as a function of range position. 486

487 The importance of behavioural niche space has been largely overlooked in climate
488 change studies. Studies of ecological niche breadth and niche overlap have mainly been based

489 on diets, e.g. stomach contents or stable isotope analyses (Newsome et al. 2007; Kingsbury et 490 al. 2019). Only recently, other proxies such as morphology and foraging behaviour have been used to measure ecological niche space, which can be related to habitat use, feeding and 491 492 locomotion (Azzuro et al. 2014; Brandl & Bellwood 2014; Smith et al. 2016). However, studies using these realised niche metrics mainly focus on feeding ecology and habitat use, 493 494 ignoring the fact that species show complex adaptive behaviours that reflect an important 495 ecological niche as well (Gouraguine et al. 2019). Furthermore, instead of relying on a single behaviour, as is common in climate change studies (Beck et al. 2016), we use an established 496 approach from stable isotope studies to calculate niche breadth in a multivariate space as a 497 498 proxy of behavioural modification. This novel approach shows that specific behaviours contribute more to the observed differences in niche breadth across species and range 499 500 positions, emphasising the importance of using multiple behaviours to test species responses 501 to altered environments or climate change. Although suggestions about the underlying mechanisms should be interpreted with some caution due to the lack of manipulative 502 503 experimental approaches, or behavioural comparison between range-extending and non-504 range-extending species, we show that modification of behavioural repertoires can be a 505 potential mechanism that could allow coexistence with temperate species and successful 506 establishment by tropical vagrants invading temperate ecosystems under climate change. 507

508

#### 509 Conclusions

510 We reveal that behavioural niche modification and behavioural generalism may be critical 511 mechanisms that allow tropical fish species that extend their ranges to cold-temperate 512 latitudes under climate change to reduce competition with local temperate species and cope 513 with novel temperate climate and biotic conditions. Additionally, maintenance of behavioural

514	niche segregation among tropical and temperate fish species combined with flexible shoaling
515	behaviour and the low incidence of inter-species aggression, may further mediate successful
516	invasion of tropical fishes into temperate environments under climate change, whilst allowing
517	generalist temperate fish species to persist.
518	
519	
520	Ethics. All experiments were performed under animal ethics approval numbers S-2015-222A
521	and S-2017-002 (University of Adelaide) and ETH17-1117 (University of Technology
522	Sydney) and followed the University's animal ethics guidelines.
523	
524	Authors' contributions. E.O.C.C, I.N., and D.J.B. conceived and designed the study,
525	E.O.C.C. and C.M.F. collected the data, E.O.C.C. analysed the data. E.O.C.C, I.N., and D.J.B
526	wrote the article.
527	
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535	Data accessibility All data will be made available in a Mandeley Data repository
530 537	Data accessionity. All data will be made available in a Mendeley Data repository.
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