1	Continuous behavioral observation reveals the function of drifting seaweeds for Seriola spp.
2	juveniles
3	
4	Running page head: Behavior of Seriola spp. juveniles
5	
6	Takamasa Hasegawa ^{1,*} , Naoki Takatsuki ^{2,*} , Yuuki Kawabata ^{1,**} , Ryo Kawabe ² , Gregory N.
7	Nishihara ² , Atsushi Ishimatsu ² , Kiyoshi Soyano ² , Kotoe Okamura ^{2,4} , Seishiro Furukawa ^{2,5} ,
8	Misato Yamada ^{3,6} , Masako Shimoda ³ , Tsukasa Kinoshita ³ , Nobuhiro Yamawaki ³ , Yasuhiro
9	Morii ³ , Yoshitaka Sakakura ¹
10	
11	¹ Graduate School of Fisheries and Environmental Sciences, Nagasaki University, Bunkyo,
12	Nagasaki 852-8521, Japan
13	² Institute for East China Sea Research, Organization for Marine Science and Technology, Nagasaki
14	University, Taira-machi, Nagasaki 851-2213, Japan
15	³ Faculty of Fisheries, Nagasaki University, Bunkyo, Nagasaki 852-8521, Japan
16	⁴ Present Address: Japan Fisheries Research and Education Agency, Minato Mirai, Nishi-ku,
17	Yokohama, Kanagawa 220-6115, Japan
18	⁵ Present Address: Department of Ecology and Evolutionary Biology, Graduate School of Life
19	Sciences, Tohoku University, Aramaki Aza Aoba, Aoba-ku, Sendai, Miyagi 980-8578, Japan
20	⁶ Present Address: Nagasaki Branch, Japan Radio Co., Ltd., Asahi-machi, Nagasaki 852-8003, Japan
21	
22	*These authors contributed equally to this work

23 **Corresponding author. E-mail: yuuki-k@nagasaki-u.ac.jp

ABSTRACT: A large number of fish species are associated with drifting seaweeds; however, the 24 ecological significance of such seaweeds for fishes remains unclear. Here, we developed a raft 25 equipped with a seaweed clump, interval still/video cameras, and a GPS satellite buoy. This novel 26 27 monitoring system was used to monitor the schooling and associative behavior with seaweeds by Seriola spp. juveniles for up to a week in the East China Sea. We observed diel behavioral patterns 28 in the fish, which swam around the seaweeds during the day and remained attached to the seaweeds 29 or conspecifics at night. This nighttime behavioral pattern suggests that the fish may utilize drifting 30 seaweeds to maintain schools at night when vision is less effective. Solitary individuals and those in 31 smaller schools tended to remain close to the seaweeds, whereas fish in larger schools were 32 observed swimming actively around the seaweeds. Additionally, some of the solitary fish and small 33 schools escaped into the seaweeds when potential predators appeared. As the school size of the fish 34 increased over time, solitary individuals and small schools may utilize drifting seaweeds as a shelter 35 from predators until the fish can gather to form larger schools. We suggest that drifting seaweeds 36 have multiple ecological functions for Seriola and other seaweed-associated fishes, and the 37 knowledge on the functions will be useful in designing the conservation and management measures 38 of the associated fishes. 39

40

41 KEY WARDS: Fish Aggregating Devices . Floating seaweed . *Seriola quinqueradiata* . Yellowtail .
42 Shelter from predator hypothesis . East China Sea . Time lapse camera . GPS satellite buoy

43 INTRODUCTION

Seaweeds with gas-filled vesicles can float after being detached from their base by strong 44 waves or winds (Yoshida 1963, Kingsford & Choat 1985), and these detached seaweeds are called 45 46 drifting seaweeds. Over 333 fish species (96 families) are associated with floating objects including drifting seaweeds, and the majority (80%) of fish are present during the juvenile stages (Castro et al. 47 2002). Several hypotheses have been proposed for the ecological significance of drifting seaweeds 48 for fishes, such as the 'concentration of food supply' hypothesis, the 'indicator-log' hypothesis, the 49 'meeting-point' hypothesis, and the 'shelter from predator' hypothesis (reviewed by Fréon & 50 Dagorn 2000, Castro et al. 2002). The concentration of food supply hypothesis posits that floating 51 52 structures help feed small fishes, zooplankton, and sessile biota. The indicator-log hypothesis assumes that natural floating objects are often indicators of biologically rich water masses, because 53 most natural floating objects originate in rich areas (e.g. river mouths and mangrove swamps) and 54 remain within these rich water masses, or because they aggregate in rich frontal zones. This 55 hypothesis was first proposed for tunas (Hall 1992), and was extended to larval and juvenile fishes 56 (Castro et al. 2002). The meeting-point hypothesis states that fishes make use of floating structures 57 to increase the encounter rate between isolated individuals or small schools and other schools. The 58 shelter from predator hypothesis posits that fishes use floating structures as a refuge from predators. 59 Although previous studies have reported anecdotal evidence supporting each hypothesis (e.g. Druce 60 & Kingsford 1995, Vandendriessche et al. 2007, Casazza & Ross 2008), the comprehensive 61 assessments of these different hypotheses are still limited. 62

Fish juveniles associated with drifting seaweeds have been mostly studied by traditional methods such as net capture (e.g. Kingsford & Choat 1985, Sakakura & Tsukamoto 1997, Dempster & Kingsford 2004, Uehara et al. 2006, Vandendriessche et al. 2007) and underwater visual observation (e.g. Hanaoka 1986, Ikehara 1984, Casazza & Ross 2008). However, these methods cannot provide the continuous stream of data that is needed to monitor fish and test the hypotheses. Furthermore, the presence of an observer might affect the behavior of fishes during underwater observation (Okamoto et al. 1981, Kudo 1998, Dearden et al. 2010). Hence, video cameras have been used for serial observation of fishes associated with drifting seaweeds (Moser et al. 1998), however the observation time-scale (1.3–2.0 h, a total of 21.5 h) is relatively short. To overcome this methodological problem, we developed a new monitoring system: a raft equipped with a seaweed clump, interval still/video cameras, and a GPS satellite buoy, which can continuously monitor the behaviors of fishes associated with drifting seaweeds for up to a week.

75 Amberjacks (genus Seriola) are one of the important fishery targets around the world (Moran et al. 2007, Sakakura & Tsukamoto 1997), and some species of amberjacks around Japan 76 (mainly, yellowtail S. quinqueradiata and greater amberjack S. dumerili) are associated with 77 drifting seaweeds during their juvenile stages (Senta 1965, Ikehara 2006, Uehara et al. 2006, 78 Yamasaki et al. 2014). Seriola quinqueradiata and S. dumerili sometimes form schools of dozens to 79 hundreds of individuals around the drifting seaweeds (Ikehara 2006). Several studies have 80 examined the ecological significance of drifting seaweeds for these fishes, and tested the hypotheses 81 mentioned previously. The concentration of food supply hypothesis was rejected in S. 82 83 quinqueradiata and S. dumerili juveniles, because they feed on planktonic foods such as copepods rather than the phytal animals (Anraku & Azeta 1965, Yamasaki et al. 2014, Hasegawa et al. 2016). 84 The indicator-log hypothesis was also not supported, because food (zooplankton) abundance was 85 not different between areas with and without drifting seaweeds (Hasegawa et al. 2016). The 86 meeting-point and shelter from predator hypotheses remain to be tested. 87

Our objective was to provide novel insights into the ecological significance of drifting seaweeds for *Seriola* spp. juveniles by observing a time-series of schooling and associative behavior with seaweed clumps in the juveniles using the developed monitoring system. We examined how 1) diel period, 2) time after release, 3) predator occurrence, 4) food availability, 5) sea surface temperature, and 6) drifting trajectory of the system affected the schooling and associative patterns in the juveniles.

94 MATERIALS AND METHODS

95 Study site and experimental protocol

This study was conducted near the Goto Islands (the Goto Sea), which is located in the 96 97 northeastern part of the East China Sea (Fig. 1). This location is a major fishing ground for S. *quinqueradiata* juveniles associated with drifting seaweeds, during the months of May to June 98 (Yamashita & Iwasa 1984, Yamamoto & Tashiro 1986); the collected juveniles are used for 99 100 aquaculture seedlings. No artificial floating objects are deployed for the fishing of S. 101 quinqueradiata juveniles, but fish aggregating devices (FADs) for catching dolphinfish Coryphaena hippurus are deployed in this region (Fujita 1986, Kuwano et al. 1982). A total of 8 cruises at the 102 103 shelf-break region (31°36'N-33°18'N, 129°00'E-130°06'E; Fig. 1) were conducted by the T/V Kakuyo-Maru of Nagasaki University from April to June in 2013 and in 2014. In total, 14 rafts were 104 released and retrieved (See "Monitoring system" for details). The rafts were released in this area 105 because of the large number of drifting seaweeds and associated Seriola spp. juveniles that were 106 present (Hasegawa et al. 2016). Four rafts were released during 11-12 April and four more were 107 108 released on 27 May, and were retrieved during 16-18 April and 3-4 June, respectively, in 2013. Three rafts were released on 12 April and three more were released on 21 May, and were retrieved 109 on 19 April and during 27-29 May, respectively, in 2014. The rafts were retrieved using near 110 111 real-time positional data from the attached GPS buoy and radio wave from the VHF transmitter.

The water transparency of the Goto Sea during the study season is at least over 8.5 m [2013: April, 12.1 ± 1.2 (mean \pm SD) m, n = 7; May, 16.6 ± 6.3 m, n = 6; June, 19.6 ± 10.4 m, n = 5, 2014: April, 14.6 ± 3.2 m, n = 7; May, 12.6 ± 3.1 m, n = 7] which is longer than the sum of the distance between the seaweed clump and the cameras (approximately 2 m), as well as the previously reported swimming range of *S. quinqueradiata* (main *Seriola* in this region) from the clump (3–5 m) (Ikehara 1984). Therefore, we believe that visibility conditions had at most a trivial effect in this study.

120 Monitoring system

Four square rafts (140 cm \times 140 cm) were made with polyvinyl chloride pipes and floats 121 (Fig. 2), and repeatedly used to obtain the data in different months and years. To directly observe 122 123 associative behaviors of *Seriola* spp. juveniles with drifting seaweeds, each raft was equipped with collected seaweeds (See next paragraph for details), a digital still camera (Optio WG-1, WG-2 or 124 W90 with a focus free wide F3.5 lens, Pentax, Japan) in a waterproof housing (WHPE-WG1, -WG2 125 or -W90, Recsea/Seatool, NTF Co., Ltd., Japan), and a video camera (Gopro Hero2 with a 126 focus-free wide F2.8 lens, Woodman Labs Inc., USA) in a custom-made waterproof housing and 127 equipped with an interval scheduling system and extra-battery (Logical Product Co., Ltd., Japan). 128 129 The vertical and horizontal fields of view of the still camera were 46° and 59°, respectively, and those of the video camera were 62° and 100°, respectively (Fig. S1 in the Supplement). Both 130 cameras were pointed at the center of the seaweed clump (Fig. S1). To take still images at night, a 131 flash was provided for the still cameras. A water temperature logger (HOBO U22-001, Onset Corp., 132 USA) and light logger (HOBO UA-002-64, Onset Corp., USA) were also attached to the raft to 133 monitor the sea surface temperature and to define daytime and nighttime, respectively. A drifting 134 GPS buoy (ZTB-R6-P3, Zeni Lite Buoy Co., Ltd., Tokyo Japan), which sends its position via 135 satellite, and VHF transmitter (F1860, Advanced Telemetry Systems Inc., USA) were tethered to 136 each raft to monitor location and aid in raft retrieval. A sinker (1.5 kg) was suspended below the raft 137 to lower its center of gravity and prevent it from overturning. The recording/sampling intervals for 138 the still camera and GPS buoy was once every 30 min, and it was once every 10 min for the 139 temperature and light loggers. During the daytime (06:00–19:00), the video cameras were scheduled 140 to record 2 min of video once an hour, with a few exceptions. Around the crepuscular period of May 141 2013, 2 min (05:05–05:07, 19:31–19:33) were recorded. During the crepuscular periods of April 142 2014 and May 2014, 5 min recordings were taken during 05:40-05:45 and 19:00-19:15, and 05:05-143 05:10 and 19:25–19:30, respectively. The recordings of still and video cameras were partially 144 synchronized (every hour during the daytime). 145

A clump of *Sargassum horneri* was used as drifting seaweeds because *S. horneri* is the dominant species of drifting seaweeds in the East China Sea (e.g. Komatsu et al. 2008). *Sargassum horneri* was collected from the coastal areas of Amakusa Island, Kumamoto Prefecture and Nagasaki Prefecture, Japan (Fig. 1). A clump of *S. horneri* was standardized by weight (7.2–8.3 kg) and attached to each raft.

151

152 Analysis of still and video images

We categorized *S. quinqueradiata* and *S. dumerili* as *Seriola* spp. and counted the number of individuals in each still and video image, because *S. quinqueradiata* and *S. dumerili* (and possibly yellowtail kingfish *S. aureovittata* and other *Seriola* spp.) were difficult to distinguish from each other from the still or video images. We targeted juveniles of *Seriola* spp. that were associated with drifting seaweeds (at most 20 cm total length, Senta 1965, Fujita & Mori 1982, Hasegawa et al. 2016), and thus obviously large (at least over 40 cm total length) *Seriola* spp. (identified as *S. aureovittata*) was excluded from the analysis.

160 From all still images (recorded both during the day and at night), we counted the total number of Seriola spp. juveniles in each image. To analyze the diel difference in the degree of 161 association with drifting seaweeds, we also categorized the degree into 'attached' in which the fish 162 163 was attached to the seaweed or conspecifics, and 'around' in which the fish was not attached to the seaweed or conspecifics but was in the water column. From the video images, we detected all 164 schools and solitary individuals, and counted the fish numbers in each school. A school was defined 165 as a group of fish (nearest neighbor distance is within approximately 2 body lengths) that swam 166 synchronously (Pitcher 1983). Because the fish often swam in and out of the camera view, the 167 168 maximum number during a 2-min video image was defined as the school size during that period. The school size of a solitary individual was regarded as 1. Since the images during the crepuscular 169 periods were too dark to correctly measure the school size, we only used the video images recorded 170 during the daytime (06:00–19:00 in April and 05:00–19:30 in May–June). A portion of a fish was 171

counted as one individual in both of the still and video images. To analyze the relationship between 172 school size and the degree of association with drifting seaweeds, we categorized the degree into 173 'close proximity' in which the school or solitary fish remained inside or underneath the seaweed 174 175 within the camera view (within approximately 1 m beneath the seaweed) for the whole 2-min recording period, and 'swimming around' in which the fish swam in and out of the camera view 176 during the recording period. The video images during the crepuscular periods (e.g. 05:05-05:07 in 177 April) were only used for qualitative (not quantitative) behavioral observation. The video images 178 with potential predators were also counted, and behaviors of Seriola spp. juveniles in the images 179 were noted. Nighttime was defined as a period when light intensities measured by light loggers 180 were less than their minimum light sensitivity (1 lux): 19:30-05:30 in April and 20:00-04:30 in 181 May–June. 182

183

184 **Drifting trajectory**

To reveal the drifting trajectory of the rafts, the positions of each raft were plotted every half hour using GMT ver. 4.5.9 (www.soest.hawaii.edu/gmt; Wessel & Smith 1998). We applied cosine formula of spherical trigonometry. A distance between the position at time *t*-1, and that at time *t* of a raft (Dt) can be calculated using the following Equation (1):

$$Dt = r \cos^{-1}(\sin y_{(t-1)} \sin y_t + \cos y_{(t-1)} \cos y_t \cos \Delta x),$$
(1)

190 where, *r* is the equatorial radius (6378.137 km), and $y_{(t-1)}$ and y_t are latitudes of the positions at *t*-1 191 and at *t*. Δx is a difference of longitudes of those two sites.

To estimate the tortuosity of the raft trajectory, straightness index (*Si*, Benhamou 2004)
during a given time period was calculated using the following Eq. (2):

194
$$Si = \frac{r \cos^{-1}(\sin y \circ \sin y_n + \cos y \circ \cos y \cos \Delta x \circ n)}{\sum_{t=1}^n Dt},$$
 (2)

where, y_0 is a latitude of the initial position of the raft, and y_n is latitude of the last position recorded during the given time period. Δx_{0n} is difference of longitudes of those two sites *n* is the number of records during the given time period.

198

199 Zooplankton abundance

The main food item of *Seriola* spp. juveniles is planktonic copepoda (Anraku & Azeta 1965, Hasegawa et al. 2016, Senta 1965, Yamasaki et al. 2014). Therefore, to reveal the food availability for *Seriola* spp. juveniles, we investigated the density of planktonic copepoda in the stations where rafts were deployed and retrieved in 2014. We could not obtain zooplankton in 2013 due to limited ship time, and could not obtain zooplankton at the retrieved sites of the raft 2 and 3 in May 2014 because these rafts were recovered after stranding on shore (Fig. 1).

A Norpac net (45 cm diameter, 54GG; mesh = 315 μ m) was vertically towed from 20 m 206 depth during the daytime (06:00–18:00). A flow meter (Rigo, Tokyo) was attached to the opening of 207 the Norpac net to measure the volume of filtered water. Collected samples were immediately fixed 208 in 10% buffered formalin solution. The volume of filtered water collected during the Norpac net 209 tow at each sampling station was calculated using a calibrated flow meter. Because plankton 210 211 densities were high, plankton samples were divided more than 2, and divided samples were used for the measurement of the density of the copepoda. The copepoda was identified according to a 212 guideline (Chihara & Murano 1997), using a stereoscopic microscope. The density of the copepoda 213 D (ind. per m³) was calculated using the following Eq. (3): 214

215
$$D = (NS^{-1})V^{-1}$$
, (3)

where *N* is the total number of copepod in a divided sample, *S* is the fraction of the sample that was divided, and *V* is the total volume of water sampled (m^3).

219 Statistical analyses

We constructed a series of generalized linear models (GLMs) and generalized linear mixed 220 models (GLMMs) to evaluate the effects of different variables on the associative and schooling 221 behaviors in Seriola spp. juveniles; the models and variables are summarized in Table S1 in the 222 Supplement. When an objective variable was discrete, we used a Poisson or negative binomial error 223 distribution with log link function (Zuur et al. 2009); we used a negative binomial distribution 224 rather than a Poisson distribution when a fitted model was overdispersed (i.e. residual deviance/d.f. 225 was over 2). A binomial distribution with logit link function (logistic regression) was used when the 226 objective variable was categorical (Zuur et al. 2009). The diagnostics of above GLM/GLMM 227 analyses were conducted by the overdispersion parameter (residual deviance/d.f.), percentage of 228 deviance explained $[R^2$ for GLM, and marginal and conditional R^2 for GLMM (Nakagawa & 229 Schielzeth 2013)], quantile-quantile plots, and distribution of residuals (see Figs. S2-S10 in the 230 Supplement). All analyses were carried out using R. version 3.1.3 (R Development Core Team 231 2015) with the lme4 package (Bates et al. 2015) for the GLMM. The p-values < 0.05 were 232 233 considered as significant in all analyses.

234

235 Analysis of still images

To reveal patterns in diel association of *Seriola* spp. juveniles, the effect of day or night on 236 the number of individuals in the still images was assessed in each raft using a GLM with a Poisson 237 or negative binomial error distribution and a log link. The number of individuals was regarded as 238 the objective variable, while the diel period and 'days after release' were regarded as categorical 239 explanatory variables. The days after release was included as a categorical variable because the fish 240 numbers substantially fluctuated depending on the days (see Fig. S11 in the Supplement). The 241 significance of the diel period was assessed by removing it from the model and comparing the 242 change in deviance using the Likelihood-Ratio (LR) test. 243

To further assess the behavioral difference between the day and night, we evaluated the effect of diel period on the degree of association ('attached' or 'around') using a GLM with a binomial error distribution and a logit link. The degree of association was regarded as an objective variable, while the diel period was regarded as an explanatory variable. The significance of the diel period was assessed using the likelihood-ratio (LR) test.

To assess the general trend of the change in the fish number over time, we examined the relationship between the days after release and the fish numbers in each raft using a Spearman's rank correlation test. Because there were significant effects of the diel period on the fish numbers in many rafts (see Results), the daytime and nighttime were examined separately.

To investigate the factors affecting the aggregation process of Seriola spp. juveniles, we 253 examined the effects of mean raft speed, tortuosity of the raft trajectory (straightness index), and 254 mean sea surface temperature (SST) on the maximum number of fish detected during the 1- to 255 6-day periods using a GLM with a negative binomial error distribution and a log link. When data 256 recorded during a 1-day period were less than 20 h due to any problems with the devices, we 257 258 removed them from the analysis. We conducted different analysis from the diel period and days after release, because the raft speed, trajectory, and SST are likely to affect the fish colonization 259 process rather than directly affecting the fish numbers. When a significant correlation was found in 260 261 any pairs of the explanatory variables (i.e. raft speed, tortuosity of the raft trajectory, and SST), we removed one variable from the analysis to prevent multi-collinearity (see Table 1). The 262 significances of the explanatory variables were assessed using the LR test. 263

264

265 Analysis of video images

To assess the change of the school size of the *Seriola* spp. juveniles over time, we evaluated the effect of time after release (h) on the school size using a GLMM with a negative binomial error distribution. The school size was regarded as an objective variable, while the time after release was regarded as an explanatory variable. The raft was regarded as a random effect because we probably repeatedly recorded the same schools or individuals. The significance of the time was assessed by removing it from the model and comparing the change in deviance using the LR test. To further understand the change of fish numbers over time in each raft, we examined the effect of time after release on the school size in each raft using a GLM with a Poisson or negative binomial error distribution and a log link. The significance of the time was similarly assessed in each raft using the LR test.

To understand the relationship between the school size and degree of association with drifting seaweeds, we evaluated the effect of school size on the degree of association ('close proximity' or 'swimming around') using a GLMM with a binomial error distribution and a logit link. The degree of association was regarded as an objective variable, while the school size was regarded as an explanatory variable. The raft was regarded as a random effect. The significance of the school size was assessed using the LR test.

282

283 Analysis of zooplankton

To examine the change of prey abundance, the copepoda density between the deployed and retrieved stations were compared using a paired *t*-test.

286 **RESULTS**

287 **Drifting routes of the rafts**

All 14 rafts were successfully retrieved. Drifting periods ranged from 19 h to 7 d 22 h 30 min, with 9 rafts drifting over 5 d (Table 2). Drifting routes, and deployed and retrieved stations of each raft are shown in Fig. 1. The rafts dispersed in April 2013 and in May 2014, while they moved more closely to each other in May 2013 and in April 2014 (Fig. 1).

292

293 Schooling and association patterns of *Seriola* spp. juveniles

During the study periods, *Seriola* spp. juveniles occurred in 10–76 % of still images and in 33–95 % of video images, where on average, 1–58 individuals and 1–22 individuals were recorded in still and video images, respectively (the data on other fish species are available in the supplementary Tables S2 & S3). The fish were observed within 0.5–84.5 h after release in still images, and 1–116 h after release in video images (Tables 2 & 3).

Behavior of the Seriola spp. juveniles differed between day and night; they often swam 299 around the seaweed clump during the day (Figs. 3a & 4; Fig. S12 & Video S1 in the Supplement), 300 and were closely attached to the seaweed clump or other individuals at night (Figs. 3b & 4; Fig. S12 301 in the Supplement). In 11 out of the 12 rafts that were successfully analyzed by GLMs, the 302 proportions of the fish that showed 'attached' at night were significantly larger than those during the 303 day (GLM, $\chi^2 = 1.7-1832.0$, df = 1, p < 0.05, R² = 0.05-0.71; Table 2; Fig. S12 in the Supplement). 304 The behavioral transition from the nighttime attachment pattern to the daytime swimming pattern 305 was recorded for raft 3 in 05:05–05:10 May 2014 (Video S2 in the Supplement). In the nighttime, 306 the fish number increased significantly over time in 9 out of the 13 rafts (69 %), but only in 4 out of 307 14 rafts during the day (29 %, Spearman's rank correlation test, p < 0.05; Table 2). In the 4 rafts in 308 which the fish number did not increase significantly at night, half of them drifted for less than 50 h, 309

indicating that the drifting periods were insufficient to provide enough information to elucidate a trend with statistical significance. In 10 of the rafts (71 %), the fish numbers at night were significantly larger than those during the daytime (Table 2; Fig. 5). The fish number tends to be smaller in the rafts with no significant difference between day and night (maximum; 8–33, mean; 0.8–1.3), compared to the rafts with a significant difference between day and night (maximum; 1– 280, mean; 0.1–94.9).

The increased speed of the raft increased the maximum fish numbers detected during the 1-day and 2 day periods (GLM, $\chi^2 = 6.8-10.0$, df = 1, p < 0.01; Table 1), while the effects during the 3- to 6-day periods were not significant (GLM, $\chi^2 = 0-1.7$, df = 2, p = 0.19-0.95; Table 1). Fish numbers were not significantly affected by the straightness index (GLM, $\chi^2 = 0-1.9$, df = 2, p = 0.17-1.00) nor SST (GLM, $\chi^2 = 0.1-1.0$, df = 2, p = 0.11-0.76; Table 1) during any periods.

The school size increased significantly over time (GLMM, n = 823, χ^2 = 126.4, df = 1, p < 321 0.01, marginal $R^2 = 0.26$, conditional $R^2 = 0.81$; Fig. 6). When each raft was examined separately, 322 the school size increased significantly over time in 8 rafts (57%) (GLM, $\gamma^2 = 0.2-138.6$, df = 1, p < 323 0.05, $R^2 = 0.05-0.65$; Table 3; Fig. S13 in the Supplement). The sample size of the raft (i.e. the total 324 number of schools in Seriola spp. juveniles recorded in each raft) without significant increase tends 325 to be low (n = 7-33), except raft 3 in April 2013 (n = 75) (Table 3; Fig. S13 in the Supplement). We 326 recorded one instance when two schools of *Seriola* spp. juveniles met each other to form a larger 327 school under the seaweed (Video S3 in the Supplement). 328

The degree of association with drifting seaweeds changed in response to the school size. The proportion of the fish that exhibited 'close proximity', in which the school or solitary fish remained close proximity to the seaweed, decreased in response to the increase in school size; whereas the proportion of the fish that exhibited 'swimming around', in which the school or solitary fish swam around the seaweed, increased in response to the increase in school size (GLMM, $\chi^2 =$ 82.8, df = 1, p < 0.01; Fig. 7). This result indicates that the solitary individual and smaller schools tended to remain close to the seaweeds, whereas the larger schools tended to actively swim around the seaweeds.

Among 945 video images, potential predators (i.e. Coryphaena hippurus, S. aureovittata 337 and Belonidae spp.) occurred in 172 (16%), 19 (2%) and 4 (0.4%) images, respectively. Of these 338 339 images, Seriola spp. juveniles were recorded together with C. hippurus in 153 images (89%), with S. *aureovittata* in 7 images (37%) and with Belonidae spp. in no images (0%). Although in many cases 340 Seriola spp. juveniles remained schooling around the seaweeds or did not show observable 341 responses, they escaped into the seaweeds in 5 cases (4 cases with C. hippurus, and 1 case with S. 342 aureovittata). See Video S4 in the Supplement for the example of the escaping behavior. Solitary 343 fish escaped into the seaweed in 4 cases (3 cases with C. hippurus, and 1 case with S. aureovittata), 344 345 whereas a school of 4 individuals escaped into the seaweed in 1 case with C. hippurus.

346

347 Zooplankton abundance

Although the sample size was quite small (n = 4) and thus the statistical test should be considered with care, the density of copepoda (a main food item of *Seriola* spp. juveniles) at the release sites was not significantly different from that at the retrieved sites (paired *t*-test, df = 3, t = -0.61, p = 0.59; Fig. 8). We did not find a positive relationship between the copepoda density and the maximum fish numbers detected by still cameras (Fig. 8).

353

354 **DISCUSSION**

In the still image analysis, the numbers of fish at night were higher than those during the day in 71% of the rafts (Table 2). The fish numbers at night tended to increase over time (increase: 69%, decrease: 8%, no significant trend: 23%) but the trend was less obvious during the day (increase: 29%, decrease: 14%, no significant trend: 57%). These diel differences are likely to be attributed to the difference in the diel behavioral pattern, since the still and video images showed that the fish attached closely to the seaweed or other individuals at night and that many fish swam in and out of the camera view during the daytime (Figs. 3 & 4; Videos S1 & S2 in the Supplement). Furthermore, *S. quinqueradiata* juveniles actively swim around the seaweeds (ranging 3–5 m) in the daytime (05:00–19:00), and cease swimming and stay inside and/or around the seaweeds in the nighttime (21:00–03:00) (Ikehara 1984). Thus, it is highly likely that the fish numbers around the raft increased over time, and the diel behavior is the cause of the observed difference in fish numbers between day and night.

367 The nighttime behavioral pattern (i.e. close attachment to the seaweeds or conspecifics) of Seriola spp. juveniles can be related to the maintenance of schools. Sakakura & Tsukamoto (1997) 368 speculated that S. quinqueradiata juveniles are associated with drifting seaweeds to maintain their 369 370 schools at night when the visual acuity is limited. In addition, another carangid Pseudocaranx *dentex* maintains an association with floating objects by mechanosensory cues at night, although 371 they use vision during the day (Masuda & Tsukamoto 2000). Although chemical and auditory cues 372 were also suggested as potential cues to locate floating objects (Dempster & Kingsford 2003, 373 Dempster & Kingsford 2004), the sensing ranges for these cues are generally larger than visual and 374 375 mechanosensory cues during both day and night. Therefore, the nighttime dense aggregation of Seriola spp. juveniles at seaweeds may be due to the use of mechanosensory signals by the fish 376 when vision is less effective. 377

378 Our results provide circumstantial evidence supporting the shelter from predator hypothesis in Seriola spp. juveniles, since we observed that solitary individuals and a small school 379 escaped into the seaweed clump when potential predators appeared (Video S4 in the Supplement). 380 Fréon & Dagorn (2000) disagreed with the shelter from predator hypothesis for fishes swimming 381 around the floating structures, because sometimes they are too numerous to take shelter under small 382 objects and/or they are too far from the objects to be in the "blind zone" of predators. However, it is 383 important to note that the color (yellow-brown) of the Seriola spp. juveniles matches with the color 384 of the seaweeds (Uchida 1963, Senta 1965), and the background-matching coloration is an 385 anti-predator adaptation in general (e.g. Stuart-Fox et al. 2008, Wang & Schaefer 2012, Morgans & 386

Ord 2013). Furthermore, *S. quinqueradiata* juveniles escape into the drifting seaweeds when threats such as boats approach them (Hanaoka 1986). Drifting seaweeds have highly complex thallus morphology that can be used for sheltering, like driftwoods and manmade FADs with complex structures (Hunter & Mitchell 1966, Gooding & Magnuson 1967). Therefore, the juveniles that hide into the drifting seaweeds may have better survival rates when predators are nearby. Considering these facts, drifting seaweeds likely function as shelters from predators for *Seriola* spp. juveniles, especially for the isolated individuals or small schools.

We observed that solitary individuals and small schools tended to remain close to the 394 drifting seaweeds, whereas the large schools tended to actively swim around the seaweeds (Fig. 7). 395 396 This may reflect the adaptive significance of association with drifting seaweeds and schooling in Seriola spp. juveniles. Juvenile fishes generally must balance the demands of feeding and safety 397 from predators. For example, fish normally prefer to utilize high density areas of prev, but when 398 predation risk becomes higher, they prefer to utilize safer but lower density areas of prey (Milinski 399 & Heller 1978, Werner et al. 1983). Schooling decreases per capita predation risk of animals 400 401 through several mechanisms such as dilution, predator confusion, and improved vigilance for predators (Pitcher & Parish 1993). Thus, Seriola spp. juveniles may stay close to the seaweed 402 shelter when the school size is small and per capita predation risk is high. Then, when the school 403 404 size becomes larger and the per capita predation risk becomes lower, they may explore wider areas around the seaweeds in search for high density areas of zooplankton prey. This hypothesis is also 405 supported by the fact that solitary individuals and a small school hid in drifting seaweeds but the 406 large schools kept schooling around the seaweeds regardless of the appearance of potential 407 predators. Further experiments are required to verify the adaptive significance of schooling in 408 409 Seriola spp. juveniles observed in this study.

410 Our results show that the school size of *Seriola* spp. juveniles associated with drifting 411 seaweeds increased over time (Fig. 6; Tables 2 & 3). One possible explanation for this pattern is that 412 the fish in solitude or in smaller schools might have utilized drifting objects as a meeting-point to

form larger schools. Our observation of an instance when two schools met each other to form a 413 larger school (Video S3 in the Supplement) is consistent with this explanation. However, we should 414 also note that this study lacks the record of the instance of dissociation from the seaweeds, 415 416 information of which is also essential for testing the meeting-point hypothesis (Fréon & Dagorn 2000, Soria et al. 2009). Another possibility is that the increase of the school size is a by-product of 417 the fish gathering at drifting seaweeds for alternative purposes, such as nighttime school 418 419 maintenance and shelter from predators as mentioned previously, and thus the increase simply reflected the colonization process of the fish because no fish were associated with the rafts at the 420 time of release. This explanation also includes the possibility that larger schools already formed 421 422 around the natural drifting seaweeds, FADs, and/or food-rich areas have recruited to our rafts for some purposes. There were natural drifting seaweeds and manmade FADs (for *C. hippurus* fishing) 423 around the study area (Fujita 1986, Kuwano et al. 1982). In addition, although we did not find any 424 relationship between the fish numbers and zooplankton abundance (Fig. 8), the possibility that there 425 were zooplankton hotspots between the release and retrieval sites cannot be excluded. Nonetheless, 426 427 schooling should provide some benefit as well, because the fish exhibited more than just aggregation at seaweeds; they showed clear schooling behavior in which the fish swam 428 synchronously (See Videos S1, S2 & S3 in the Supplement). Further research measuring 429 430 dissociation process of the fish from the seaweeds, fish behaviors after the colonization period, and distributions of other floating objects and zooplankton abundance is needed to clarify the reason for 431 the increase of school size over time. 432

Our study also provides insight into the factors affecting the colonization process of *Seriola* spp. juveniles; the increased raft speed enhanced the colonization of *Seriola* spp. juveniles during the 1- and 2-day period (but not during the 3- to 6-day periods; Table 1). The increased raft speed might have increased the encounter rate between the raft and *Seriola* spp. juveniles, and consequently the juveniles could rapidly colonize to the rafts. Because our monitoring periods were up to a week, further long-term study is needed to clarify other factors affecting the colonization 439 process of *Seriola* spp. juveniles.

Although our monitoring system was useful for continuously monitoring the schooling and 440 associative behaviors of fishes with the same drifting seaweeds, there are some limitations. First, as 441 442 described above, the camera view is limited and thus the fish numbers (specifically, in still images) can be variable when the fish swim around the system. Second, the fish numbers (specifically, in 443 still images) can be underestimated when the fish completely hide into the seaweeds such as those 444 at night. In contrast, we observed an opposing phenomenon: the fish numbers at night were larger 445 than those during the day, and thus the effect of this bias was relatively small compared to that of 446 the diel behavioral difference. Third, due to the darkness, video images can only be obtained in the 447 daytime. However, these three limitations can be overcome by modifying our system with 448 omni-directional, infrared video cameras. Fourth, since tracking the same individual or school over 449 time is not possible, we cannot detect all instances when the fish actually meet with other 450 conspecifics at the drifting objects (but see Video S3 for the instance of meeting), and the instances 451 when the individuals or schools leave the drifting objects. This limitation cannot be overcome by 452 modifying our system itself, and thus incorporation of other methods are required. Specifically, 453 combining our system with acoustic telemetry can provide stronger evidence of the meeting-point 454 function because our system can record the increase or decrease of the school size but cannot record 455 456 the timing of the meeting among individuals or schools and the timing of dissociation from the drifting objects, and acoustic telemetry can do vice versa (Soria et al. 2009). Combining our system 457 with an echo-sounder buoy can also be useful because the echo-sounder buoy provides rough 458 estimates of aggregated biomass over larger scales (Lopez et al. 2014, Moreno et al. 2016) and our 459 system can allow species identification and behavioral categorization. 460

461

462 CONCLUSION

The ecological significance of drifting seaweeds for fish juveniles has been reported as a hiding place and feeding habitat in many waters (e.g. Ida et al. 1967, Kingsford 1992, Shaffer et al.

1995, Vandendriessche et al. 2007). Our results, together with a previous study (Hasegawa et al. 465 2016), indicate that the ecological significance of the seaweeds for Seriola spp. juveniles would 466 include the habitat for school maintenance at night, hiding place for predator avoidance, and 467 468 possibly the meeting-point for school formation, but not the habitat for feeding. The abundance, distribution, and species composition of seaweed forests and drifting seaweeds have been 469 dramatically changing due to global warming (Komatsu et al. 2014, Yamasaki et al. 2014, Wernberg 470 471 et al. 2011), which may in turn affect the populations of *Seriola* and other fishes associated with drifting seaweeds. In these cases, knowledge on the significance of drifting seaweeds for fishes as 472 obtained in this study, will be useful in designing conservation and management measures of fishes 473 474 associated with drifting seaweeds. For example, the installation of artificial drifting objects with complex structures could provide suitable habitats that facilitate the school maintenance and 475 predator avoidance of *Seriola* spp. juveniles, as shown in this study for the drifting seaweeds. 476 However, we also should be cautious about the implementation because fish associated with the 477 artificial drifting objects may obtain less food items, as shown in other fishes associated with 478 479 manmade FADs (Marsac et al. 2000, Hallier & Gaertner 2008).

480

Acknowledgements. We express our gratitude to S. Somarakis and three anonymous reviewers for 481 their constructive comments. We thank S. Fujita and the crews of the T/V Kakuyo-Maru of 482 Nagasaki University for their help during the research cruises. We also thank the crews of the T/V 483 Nagasaki-Maru of Nagasaki University for their help in the preliminary studies. We are grateful to 484 N. Takagi of Nagasaki Prefectural Institute of Fisheries for providing the data of water transparency 485 in the Goto Sea. This research was supported by Grants-in-Aid for Scientific Research, JSPS, Japan 486 to Y.K. (23880023), Y.S. (16H05794) & R.K. (16H05795), Kurita Water and Environment 487 Foundation to Y.K. (23082), Sasakawa Scientific Research Grant to N.T. (25-737 and 26-730), 488 Strategic Japanese-Chinese Cooperative Program on "Climate Change" (2012–2014), Sustainable 489 Aquatic Food and Environment Project in the East China Sea, MEXT, Japan, and Research 490

491 Initiative for Adaptation to Future Climate Change, Nagasaki University.

492 **LITERATURE CITED**

- Anraku M, Azeta M (1965) The feeding habits of larval and juveniles of yellowtail, *Seriola quinqueradiata* Temminck et Schlegel, associated with floating seaweeds. Bull Seikai Reg
 Fish Res Lab 33:13–45 (in Japanese with English abstract)
- Bates D, Maechler M, Bolker B, Walker S (2015) Fitting linear mixed-effects models using lme4. J
 Stat Softw 67:1–48
- Benhamou S (2004) How to reliably estimate the tortuosity of an animal's path: straightness,
 sinuosity, or fractal dimension? J Theor Biol 229:209–220
- Casazza TL, Ross SW (2008) Fishes associated with pelagic *Sargassum* and open water lacking
 Sargassum in the Gulf Stream off North Carolina. Fish Bull 106:348–363
- Castro JJ, Santiago JA, Santana-Ortega AT (2002) A general theory on fish aggregation to floating
 objects: An alternative to the meeting point hypothesis. Rev Fish Biol Fish 11:255–277
- 504 Chihara M, Murano M (1997) An illustrated guide to marine plankton in Japan. Tokai Univ Press,
 505 Tokyo (in Japanese)
- 506 Dearden P, Theberge M, Yasué M (2010) Using underwater cameras to assess the effects of 507 snorkeler and SCUBA diver presence on coral reef fish abundance, family richness, and 508 species composition. Environ Monit Assess 163:531–538
- Dempster T, Kingsford MJ (2003) Homing of pelagic fish to fish aggregation devices (FADs): The
 role of sensory cues. Mar Ecol Prog Ser 258:213–222
- 511 Dempster T, Kingsford MJ (2004) Drifting objects as habitat for pelagic juvenile fish off New
 512 South Wales, Australia. Mar Freshwater Res 55:675–687
- 513 Druce BE, Kingsford MJ (1995) An experimental investigation on the fishes associated with 514 drifting objects in coastal waters of temperate Australia. Bull Mar Sci 57:378–392
- 515 Fréon P, Dagorn L (2000) Review of fish associative behaviour: toward a generalisation of the
 516 meeting point hypothesis. Rev Fish Biol Fish10:183–207
- 517 Fujita S (1986) The purse seine fishery for the dolphinfish and the immature fish of the amberjack,

Seriola aureovittata. Aquacult Sci 34:9–14 (in Japanese)

- Fujita S, Mori I (1982) Basic investigation for the conservation of yellowtail *Seriola quinqueradiata*juveniles in the wild. Document of Japan Sea-Farming Association 22: p53–80 (in
 Japanese)
- Gooding RM, Magnuson JJ (1967) Ecological significance of a drifting object to pelagic fishes. Pac
 Sci 21:486–497
- Hall M (1992). The association of tunas with floating objects and dolphins in the eastern Pacific ocean: VII. some hypotheses on the mechanisms govering the association of tunas with floating objects and dolphins. In: Background document for the international workshop on the ecology and fisheries for tunas associated with floating objects. Proc of the international workshop on the ecology and fisheries for tunas associated with floating objects. p1–6
- Hallier JP, Gaertner D (2008) Drifting fish aggregation devices could act as an ecological trap for
 tropical tuna species. Mar Ecol Prog Ser 353:255–264
- Hanaoka F (1986) Yo-Chigyo ni totteno Nagaremo no Kouyou (Utility of drifting seaweeds for
 juvenile fishes). Kaiyo Monthly 18:719–724 (in Japanese)
- Hasegawa T, Manda A, Takatsuki N, Kawabata Y, Nishihara GN, Fujita S, Kawabe R, Yamada M,
 Kinoshita T, Yamawaki N, Morii Y, Sakakura Y (2016) Feeding habit of juvenile fishes
 associated with drifting seaweeds in the East China Sea with reference to oceanographic
 parameters. Aquacult Sci 64:157–171
- Hunter JR, Mitchell CT (1966) Association of fishes with flotsam in the offshore waters of central
 America. Fish Bull 66:13–29
- Ida H, Hiyama Y, Kusaka T (1967) Study on fishes gathering around floating seaweed-II. Behavior
 and feeding habit. Nippon Suisan Gakkaishi 33:930–936
- 542 Ikehara K (1984) Ecology of mojyako. In: Japan Sea National Fisheries Research Institute (ed)
 543 Study on the production ability and oceanic environments (2). Jap Sea Nat Fish Res Ins,

- 544 Niigata, pp 221–232 (in Japanese)
- Ikehara K (2006) Species of fish accompanied with drifting seaweeds in the water surrounding
 Japan in each deploymental stage and its quantity, also the substances of use. Kaiyo
 monthly 38:761–772 (in Japanese)
- Kingsford MJ (1992) Drift algae and small fish in coastal waters of northeastern New Zealand. Mar
 Ecol Prog Ser 80:41–55
- 550 Kingsford MJ, Choat JH (1985) The fauna associated with drift algae captured with a 551 plankton-mesh purse seine net. Limnol Oceanogr 30:618–630
- Komatsu T, Matsunaga D, Mikami A, Sagawa T, Boisnier E, Tatsukawa K, Aoki M, Ajisaka T,
 Uwai S, Tanaka K, Ishida K, Tanoue H, Sugimoto T (2008) Abundance of drifting
 seaweeds in eastern East China Sea. J Appl Phycol 20:801–809
- Komatsu T, Mizuno S, Natheer A, Kantachumpoo A, Tanaka K, Morimoto A, Hsiao ST, Rothäusler
 EA, Shishidou H, Aoki M, Ajisaka T (2014) Unusual distribution of floating seaweeds in
 the East China Sea in the early spring of 2012. J Appl Phycol 26:1169–1179
- Kudo T (1998) Pelagic fish assemblage observed by diving around the payao in Sagami bay, the
 waters central Japan. Bull Kanagawa Pref Fish Res Ins 3: 1–18 (in Japanese with English
 abstract)
- Kuwano Y, Mori I, Fujita S (1982) Distribution of "Shiira Zuke" fishing ground in the Tsushima
 Warm Current system. Bull Nagasaki Prefect Inst Fish 8:35–39 (in Japanse)

Lopez J, Moreno G, Sancristobal I, Murua J (2014) Evolution and current state of the technology of

- s64 echo-sounder buoys used by Spanish tropical tuna purse seiners in the Atlantic, Indian and
- 565 Pacific Oceans. Fish Res 155:127–137
- Masuda R, Tsukamoto K (2000) Onset of association behavior in striped jack, *Pseudocaranx dentex*,
 in relation to floating objects. Fish Bull 98:864–869
- 568 Milinski M, Heller R (1978) Influence of a predator on the optimal foraging behaviour of 569 sticklebacks (*Gasterosteus aculeatus* L.). Nature 275:642–644

570	Moreno G, Dagorn L, Capello M, Lopez J, Filmalter J, Forget F, Sancristobal I, Holland K (2016)
571	Fish aggregating devices (FADs) as scientific platforms. Fish Res 178:122-129
572	Morgans CL, Ord TJ (2013) Natural selection in novel environments: predation selects for
573	background matching in the body colour of a land fish. Anim Behav 86:1241-1249
574	Moran D, Smith CK, Gara B, Poortenaar CW (2007) Reproductive behaviour and early
575	development in yellowtail kingfish (Seriola lalandi Valenciennes 1833). Aquaculture
576	262:95–104
577	Moser ML, Auster PJ, Bichy JB (1998) Effects of mat morphology on large Sargassum-associated
578	fishes: observations from a remotely operated vehicle (ROV) and free-floating video
579	camcorders. Environ Biol Fishes 51:391–398
580	Nakagawa S, Schielzeth H (2013) A general and simple method for obtaining R2 from generalized
581	linear mixed-effects models. Methods in Ecology and Evolution 4:133-142
582	Okamoto M, Sato O, Kuroki T, Murai T (1981) The effect of divers on the behavior of fishes.
583	Nippon Suisan Gakkaishi 47:1567–1573 (in Japanese with English abstract)
584	Pitcher TJ (1983) Heuristic definitions of fish shoaling behaviour. Anim Behav 31:611-613
585	Pitcher TJ, Parrish JK (1993) Function of shoaling behaviour in teleosts. In: Pitcher TJ (ed)
586	Behaviour of teleost fish. Chapman & Hall, London
587	R Development Core Team (2015) R: A language and environment for statistical computing, R
588	Foundation for Statistical Computing, Vienna, Austria, http://www.R-project.org/
589	Sakakura Y, Tsukamoto K (1997) Age composition in the schools of juvenile yellowtail Seriola
590	quinqueradiata associated with drifting seaweeds in the East China Sea. Fish Sci 63:37-41
591	Senta T (1965) Importance of drifting seaweeds in the ecology of fishes. Jap Fish Res Cons Assoc,
592	Tokyo (in Japanese)
593	Shaffer JA, Doty DC, Buckley RM, West JE (1995) Crustacean community composition and

594 trophic use of the drift vegetation habitat by juvenile splitnose rockfish *Sebastes diploproa*.
 595 Mar Ecol Prog Ser 123:13–21

596	Soria M, Dagorn L, Potin G, Fréon P (2009) First field-based experiment supporting the meeting
597	point hypothesis for schooling in pelagic fish. Anim Behav 78:1441–1446
598	Stuart-Fox D, Moussalli A, Whiting MJ (2008) Predator-specific camouflage in chameleons. Biol
599	Lett 4:326–329
600	Uchida K (1963) Morphology, biology and phylesis of juvenile fish. Jap Soc Syst Zool Circula
601	30:14–16 (in Japanese)
602	Uehara S, Taggart CT, Mitani T, Suthers IM (2006) The abundance of juvenile yellowtail (Seriola
603	quinqueradiata) near the Kuroshio: the roles of drifting seaweed and regional hydrography.
604	Fish Oceanogr 15:351–362
605	Vandendriessche S, Messiaen M, O'Flynn S, Vincx M, Degraer S (2007) Hiding and feeding in
606	floating seaweed: Floating seaweed clumps as possible refuges or feeding grounds for
607	fishes. Estuar Coast Shelf Sci 71:691–703

- Wang Z, Schaefer HM (2012) Resting orientation enhances prey survival on strongly structured
 background. Ecol Res 27:107–113
- Wessel P, Smith WHF (1998) New, improved version of generic mapping tools released. Eos Trans
 AGU 79:579
- Wernberg T, Russell BD, Thomsen MS, Gurgel CFD, Bradshaw CJA, Poloczanska ES, Connell SD
 (2011) Seaweed communities in retreat from ocean warming. Curr Biol 21:1828–1832
- Werner EE, Gilliam JF, Hall DJ, Mittelbach GG (1983) An experimental test of the effects of
 predation risk on habitat use in fish. Ecology 64:1540–1548
- 616 Yamamoto K, Tashiro M (1986) Fishery of "Mojako" in Nagasaki prefecture. Kaiyo Monthly
 617 18:709–711 (in Japanese)
- Yamasaki M, Aono M, Ogawa N, Tanaka K, Imoto Z, Nakamura Y (2014) Drifting algae and fish:
 Implications of tropical *Sargassum* invasion due to ocean warming in western Japan.
 Estuar Coast Shelf Sci 147:32–41
- 621 Yamashita K, Iwasa S (1984) Distribution of the fishing area of "Mojako", juvenile stage of

- 622 yellowtail, in the coastal region of Nagasaki prefecture. Bull Nagasaki Pref Inst Fish
 623 10:19–25 (in Japanese)
- Yoshida T (1963) Studies on the distribution and drift of the floating seaweeds. Bull Tohoku Reg
 Fish Res Lab 23:141–186 (in Japanese with English abstract)
- 626 Zuur A, Ieno EN, Walker N, Saveliev AA, Smith GM (2009) Mixed effects models and extensions
- 627 in ecology with R. Springer, New York, USA



Fig. 1. (a) Map of the study site showing the position of the Goto Sea, and drifting routes of the rafts in (b) April 2013, (c) May 2013, (d) April 2014 and (e) May 2014. Open and filled stars

indicate deployed and retrieved locations of monitoring systems, respectively. Bold solid line, thin solid line, bold break line and thin break line represent the drifting routes of the raft 1, raft 2, raft 3 and raft 4, respectively. The filled inverse triangle in (a) April 2013 shows the location where the GPS buy was broken. The subsequent thin break line is a straight line between the locations where the GPS buy was broken and where the system was retrieved. Thin solid contours with numbers indicate the bathymetry in meters, extracted from the Japan Oceanographic Data Center (http://www.jodc.go.jp)



- Fig. 2. Monitoring system used in our study. A raft was equipped with (a) still and video cameras,
- (b) a VHF transmitter with float, (c) a drifting GPS buoy, (d) a light logger, (e) a water temperature
- 642 logger, and (f) a clump of *Sargassum horneri*



- Fig. 3. *Seriola* spp. Typical still pictures (a) during the daytime (09:00 in 27 May 2014, raft 1) and
- (b) during the nighttime (04:00 in 26 May 2014, raft 1)



Fig. 4. *Seriola* spp. Typical diel difference of the degree of association with drifting seaweeds (raft 4
in May 2013; categorized into either 'attached' or 'around'). See Fig. S12 in the Supplement for the
data of the other rafts



Fig. 5. *Seriola* spp. Typical change of fish numbers in the still images over time (raft 4 in April
2013). Black horizontal bars indicate nighttime (19:30–05:30). See Fig. S11 in the Supplement for
the data of the other rafts



654

655 Fig. 6. Seriola spp. The effect of the drifting period (h) on the school size around the rafts,

- 656 measured from the video images. The red solid line indicates the estimate from the generalized
- 657 linear mixed model (GLMM). See Fig. S13 for the data of each raft



Fig. 7 *Seriola* spp. The effect of school size on the degree of association with drifting seaweeds (categorized into either 'close proximity' or 'swimming around'). Unfilled circles represent the proportion of fish schools that exhibit 'swimming around' in every 5-individual-school size class. The solid line indicates estimate from the generalized linear mixed model (GLMM). Numbers in parentheses indicate numbers of fish schools examined. Dashed lines represent the school size (13.8 ind.) in which 50 % of schools showed 'swimming around', estimated from the GLMM.

⁶⁶⁵ *The number includes all fish schools exceeding 60 individuals



Fig. 8. Copepoda density of rafts released and retrieved stations, obtained in 2014. ND represents
no data due to the stranding of the rafts. Numbers in parentheses are maximum fish numbers in the
still images during the drifting periods (shown in Table 2)

Day	Sample size	Factors ^a									
		Speed	Straightness index	Sea surface temperature							
1	13	++	0.85	NA ^b	0.39						
2	13	++	NA^b	0.32	0.56						
3	10	0.30	1.00	0.55	NA ^c						
4	9	0.25	0.24	0.42	NA ^c						
5	9	0.19	0.28	0.76	NA ^c						
6	7	0.95	0.17	0.11	NA ^c						

Table 1. Seriola spp. Summary of the effect of factors on the maximum fish number

^a; analyzed by the generalized linear model (GLM). + and -; p < 0.05, ++ and --; p < 0.01. Numbers in the column represent p-values

^b; removed factor from analysis because there was a correlation with speed

^c; could not be calculated because no significant effects were found in any variable

Year	Month	Raft No.	Drifting periods	Maximum fish n	umbers in each raft	First Seriola spp. occurrence
			(h)	(mea	$n \pm SD$)	(hours after release)
				Day	Night	_
2013	April	1	121.5	8 (0.8 ± 1.8)	9 (0.9±1.7)	11.5
		2	118.5	$51 (0.7 \pm 4.6)$	$33(3.9 \pm 7.3)$	11.0
		3	145.5	$7(0.8 \pm 1.4)$	$6(0.2 \pm 0.8)$	5.0
		4	142.0	18 (1.4 ± 3.5)	131 (35.3 ± 36.2)	3.5
Year M 2013 A 2013 A 2014 A Summar.	May	1	19.0	8 (0.9 ± 2.0)	6 (2.9 ± 1.9)	5.0
		2	190.5	$47~(0.5 \pm 3.2)$	$31(2.9 \pm 4.3)$	5.5
		3	186.0	$48(1.5 \pm 4.8)$	25 (6.3 ± 5.9)	2.0
		4	166.5	$11(1.3 \pm 2.0)$	$7(1.2 \pm 1.3)$	1.5
2014	April	1	150.0	$2(0.1 \pm 0.3)$	$1 (0.1 \pm 0.3)$	84.5
		2	51.5	$12(4.7 \pm 3.9)$	$13 (4.6 \pm 4.7)$	1.5
		3	169.5	$20(3.3 \pm 5.1)$	$21 (4.8 \pm 5.8)$	12.0
	May	1	161.5	69 (5.1 ± 11.5)	52 (14.0 ± 13.6)	0.5
		2	43.5	$33~(0.8 \pm 4.6)$	$6(1.1 \pm 1.5)$	7.5
		3	45.0	$165 (10.5 \pm 27.0)$	$280~(94.9\pm74.0)$	3.0
Sum	mary		19.0–190.5	2-165 (0.1-10.5)	1-280 (0.1-94.9)	0.5-84.5

Table 2. *Seriola* spp. Summary of the statistical analyses on the still images in each raft (continued on next page)

Table Veer	2. (cont	tinued)) Somul	<u></u>	Correlation	hatwaan	Dial difference in	D ²	Compl	0.0170	Dial difference in	D ²
real	wonth	No.	Sampi	e size	fish numl days after	pers and release ^a	fish numbers ^d	K	Sampi	ie size	proportion of fish that showed 'attached' ^d	К
		-	Day	Night	Day	Night			Day	Night		
2013	April	1	139	105	0.36	0.05	0.22 ^e	0.29	30	39	Night > day**	0.15
		2	133	105	0.88	++	Night > day** ^f	0.34	17	53	NA^h	
		3	158	122	0.47	++	Day > night** ^f	0.22	54	13	0.19	0.05
		4	159	126		++	Night > day** ^f	0.54	43	120	Night > day**	0.71
	May	1	21	18	0.86	NA ^b	Night > day* ^f	0.17	5	15	Night > day**	0.44
		2	238	144	+	++	Night > day** ^f	0.50	28	116	Night > day**	0.21
		3	203	126	0.91	++	Night > day** ^f	0.21	41	120	Night > day**	0.43
		4	208	126		0.99	0.30 ^e	0.22	102	80	Night > day**	0.62
2014	April	1	175	126	++	++	Night > day* ^e	0.27	8	6	NA^h	
		2	62	42	++	++	Night > day** ^f	0.62	45	26	Night > day**	0.56
		3	193	147	++	++	Night > day** ^f	0.67	112	119	Night > day**	0.46
	May	1	198	126	0.06	++	Night > day** ^f	0.35	75	106	Night > day**	0.65
		2	52	36	0.25	0.08	0.48^{f}	NA ^g	4	21	Night > day**	0.62
		3	55	36	0.42		Night > day** ^f	0.29	34	35	Night > day**	0.18
Su	mmary		21-238	18-147	28.6% ^c	69.2% ^c	71.4% ^c	0.17-0.67	4–112	6-120	91.7% ^c	0.05-0.71

^a; analyzed by the Spearman's rank correlation test (+ and -; p < 0.05, ++ and --; p < 0.01). Plus and minus represent significant positive and negative

678 correlations, respectively. Numbers in the column represent p-values

^b; could not analysis due to small sample size

676

^c; percentage of the rafts which have increasing trends or increasing trends at night

^d; analyzed by the generalized linear model (GLM). *; p < 0.05, **; p < 0.01. Numbers in the column represent p-values

- 682 ^e; with a poisson distribution
- 683 ^f; with a negative binomial distribution
- ^g; could not be calculated because no significant effects were found in any variable
- ⁶⁸⁵^h; could not be analyzed because the algorithm did not converge

Year	Month	Raft	Drifting periods	First Seriola spp. occurrence	Sample size	Effect of time (h) after	R ²
		No.	(h)	(hours after release)		release on the school size ^a	
2013	April	1	121.5	41	33	0.17 ^b	NA ^e
		2	118.5	16	33	$++^{b}$	0.35
		3	145.5	2	75	0.29 ^b	NA ^e
		4	142.0	3	93	$++^{b}$	0.20
	May	1	19.0	2	7	0.06 ^c	NA ^e
		2	190.5	6	106	$++^{b}$	0.06
		3	186.0	1	72	$++^{b}$	0.05
		4	166.5	1	116	$++^{b}$	0.05
2014	April	1	150.0	116	21	0.31 ^c	NA ^e
		2	51.5	2	28	$++^{c}$	0.51
		3	169.5	16	84	$++^{b}$	0.65
	May	1	161.5	1	119	++ ^b	0.43
		2	43.5	2	8	0.70^{b}	NA ^e
		3	45.0	1	33	0.11 ^b	NA ^e
Sur	nmary		19.0–190.5	1–116	7–119	57.1% ^d	0.05-
							0.65

Table 3. Seriola spp. Summary of the statistical analyses on the video images in each raft

 a ; analyzed by the generalized linear model (GLM) (+ and -; p < 0.05, ++ and --; p < 0.01). Plus and minus represent significant increase and decrease,

688 respectively. Numbers in the column represent p-values

⁶⁸⁹^b; with a negative binomial distribution

^c; with a poisson distribution

^d; percentage of the rafts which have increasing trends

^e; could not be calculated because no significant effects were found in any variable

693 ELECTRONIC SUPPLEMENTS



- Fig. S1. Fields of views of still and video cameras in the monitoring system. (a) Horizontal views and (b) vertical views. Red and blue lines represent
- edges of the fields of views of still and video cameras, respectively. Video and still cameras were located at 35 cm and 43 cm below the raft



698 Fig. S2. Normal qantile-quantile plots for generalized linear models to evaluate the general trend of the change in the fish number over time. NA means

699 the plot could not be calculated because no significant effects were found in any variable. Please note that normal quantile-quantile plots help us detect

- if the residuals are normally distributed (if the residual is normally distributed, the plot follows straight line), and our models assume poisson or 700
- negative binomial distributions. Therefore, it is natural that the models do not follow straight lines 701



50

0 0 0

o

o

Fig. S3. Distribution of residuals of generalized linear models to evaluate the general trend of the change in the fish number over time. NA means that the plot could not be calculated because no significant effects were found in any variable. Please note that the residuals vs predicted plots can help us examine whether the residuals are unbiased and/or homoscedastic, and poisson and negative binomial distributions (used in the models) are naturally

706 heteroscedastic



Fig. S4. Normal quantile-quantile plots for generalized linear models to assess the behavioral difference between the day and night. NA means that the

plot could not be calculated because no significant effects were found in any variable. Please note that normal quantile-quantile plots help us detect if

- the residuals are normally distributed (if the residual is normally distributed, the plot follows straight line), and our models assume binomial
- 711 distributions. Therefore, it is natural that the models do not follow straight lines



Fig. S5. Distribution of residuals of generalized linear models to assess the behavioral difference between the day and night. NA denotes that the plot

could not be calculated because no significant effects were found in any variable. Please note that the residuals vs predicted plots can help us examine

vhether the residuals are unbiased and/or homoscedastic, and binomial distributions (used in the models) are naturally heteroscedastic



717

Fig. S6. Normal quantile-quantile plots (above) and distribution of residuals (below) for generalized 718 linear models to investigate the factors affecting the aggregation process of Seriola spp. juveniles. 719 Day 3 to 6 were omitted, because the plots could not be calculated due to no significant effects in 720 any variable. Please note that normal quantile-quantile plots help us detect if the residuals are 721 722 normally distributed (if the residual is normally distributed, the plot follows straight line), and our 723 models assume negative binomial distributions. Therefore, it is natural that the models do not follow straight lines. Please also note that the residuals vs predicted plots can help us examine 724 whether the residuals are unbiased and/or homoscedastic, and negative binomial distributions are 725 naturally heteroscedastic 726



Fig. S7. Distribution of residuals for generalized linear mixed model to evaluate the effect of time after release (h) on the school size. Please note that the residuals vs predicted plots can help us examine whether the residuals are unbiased and/or homoscedastic, and the negative binomial

731 distribution (used in the model) is naturally heteroscedastic



732

Fig. S8. Normal quantile-quantile plots for generalized linear models to understand the change of school size over time in each raft. Raft 1 and Raft 3 in April and Raft 1 in May 2013, and Raft 1 in April and Raft 2 and Raft 3 in May 2014 were omitted, since the plots could not be calculated due to no significant effects in any variable. Please note that normal quantile-quantile plots help us detect if the residuals are normally distributed (if the residual is normally distributed, the plot follows straight line), and our models assume poisson or negative binomial distributions. Therefore, it is natural that the models do not follow straight lines



Fig. S9. Distribution of residuals of generalized linear models to understand the change of school size over time in each raft. Raft 1 and Raft 3 in April and Raft 1 in May 2013, and Raft 1 in April and Raft 2 and Raft 3 in May 2014 were omitted, since they could not be calculated due to no significant effects in any variable. Please note that the residuals vs predicted plots can help us examine whether the residuals are unbiased and/or homoscedastic, and poisson or negative binomial distributions (used in the models) are naturally heteroscedastic



Fig. S10. Distribution of residuals for generalized linear mixed model to evaluate the effect of
school size on the degree of association. Please note that the residuals vs predicted plots can help us
examine whether the residuals are unbiased and/or homoscedastic, and the binomial distribution

751 (used in the model) is naturally heteroscedastic





Fig. S11. *Seriola* spp. The change of the fish number (still images) in each raft over time. The black
horizontal bars at the bottom of each graph indicate nighttime (April; 19:30–05:30, May; 20:00–
04:30). Shaded areas indicate no available data (ND)



Fig. S12. *Seriola* spp. The diel difference of the degree of association with drifting seaweeds in each raft in 2013 and 2014 (categorized into either 'attached' or 'around'). (a) is the daytime and (b) is the nighttime for each raft



Fig. S13. Seriola spp. The change of the school size in each raft over time. Solid lines indicate estimates from the generalized linear model (GLM)

Image type	Objective	Response	Explanatory			Model	Error distribution	Link
		variable	variables			(random effect)		function
Still	Patterns in diel	Number of	Diel period	Days after		GLM	Poisson / Negative	Log
	association	individuals		release			binomial	
	Diel behavioral	Degree of	Diel period			GLM	Binomial	Logit
	difference	association						
	Factors affecting the	Maximum	Raft speed	Straightness	Sea surface	GLM	Negative binomial	Log
	aggregation process	fish number		index	temperature			
Video	Change of school size	School size	Hours after			GLMM	Negative binomial	Log
	over time		release			(raft)		
	Change of school size	School size	Hours after			GLM	Poisson / Negative	Log
	over time in each raft		release				binomial	
	Effect of school size on	Degree of	School size			GLMM	Binomial	Logit
	degree of association	association				(raft)		

	765	Table S1.	Summary	of the	models	and	variables	for ea	ch analysis	
--	-----	-----------	---------	--------	--------	-----	-----------	--------	-------------	--

page)																
Year								20)13							
Month				A	April							Ν	ſay			
Raft No.	Ra	aft1	Ra	aft2	Ra	aft3	Ra	aft4	Rat	ft1	Ra	ft2	Ra	ft3	R	aft4
Sample size	2	44	2	38	2	80	2	85	39	9	38	32	32	29	3	34
Category	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean						
Seriola spp.	28	2.96	29	7.23	24	2.19	57	28.58	51	3.55	38	3.72	49	6.81	54	2.35
Naucrates ductor	0		0		0		0		0		0		0		0	
Oplegnathus punctatus	0		0		0		0		0		0		16	1.00	0	
Girellidae/Kyphosidae	0		0		0		5	1.00	8	1.00	17	1.20	6	1.00	16	1.55
Petroscirtes breviceps	0		0	1.00	0		16	1.85	0		0		0		0	
Psenes cyanophrys	0		1	1.00	16	1.20	0	1.00	8	1.00	11	1.77	20	2.87	21	1.99
Hyperoglyphe japonica	0		0		0		0		8	1.00	9	4.34	26	8.64	4	1.50
Abudefduf vaigiensis	0		0		0		0	1.00	0		7	1.72	6	1.15	15	1.14
Sebastes thompsoni	10	1.48	0		0		0		0		0		0		0	
Tetraodontiformes	0		0		0		0		5	1.00	30	1.06	2	1.20	42	4.01
Coryphaena hippurus	0		0		0		0		0		2	1.33	4	1.42	5	1.31
Lobotes surinamensis	0		0		0		0		0		6	1.00	0		0	
Belonidae	0		0		0		0		0		0		0		0	
Exocoetidae	0		0		0		0		0		0		0		0	
<i>Mola</i> spp.	0		0		0		0		0		0		0		0	
Decapodiformes	6	1.20	0		0		1	1.00	0		0		5	1.06	1	1.00
Others	5	2.33	3	2.86	6	1.18	12	1.21	38	1.27	34	2.19	18	3.97	36	1.81

Table S2. Occurrence frequency F (%) and mean observed number of fishes and cephalopoda in still images during our study period (continued on next page)

770	Table S2.	(continued)
-----	-----------	-------------

Year						20	14							
Month			Ap	oril					Ν	lay				
Raft No.	Ra	ıft1	Ra	ft2	Ra	.ft3	Ra	ft1	Ra	ift2	Ra	ıft3		
Sample size	301		104		34	340		324		8	91		Summary	
Category	F (%)	Mean	F (%)	Mean										
<i>Seriola</i> spp.	10	1.03	68	6.82	68	5.84	56	16.6	28	3.16	76	57.90	44	11.03
Naucrates ductor	0		0		0		0		5	1.00	0		0	1.00
Oplegnathus punctatus	0		0		14	1.00	6	1.00	0		0		4	1.00
Girellidae/Kyphosidae	0		0		0		0		0		0		5	1.27
Petroscirtes breviceps	0		0		0		0		0		0		1	1.83
Psenes cyanophrys	0		0		1	1.00	0		0		3	2.33	7	2.01
Hyperoglyphe japonica	0		0		0		0		0		0		4	6.68
Abudefduf vaigiensis	0		0		0		0		0		0		3	1.29
Sebastes thompsoni	9	1.44	0		0		5	2.00	0		0		2	1.58
Tetraodontiformes	0		0		0		2	1.00	0		0		8	2.62
Coryphaena hippurus	0		0		1	1.00	1	1.50	1	1.00	2	1.00	1	1.31
Lobotes surinamensis	0		0		0		0		0		0		1	1.00
Belonidae	0		0		0		0		0		0		0	
Exocoetidae	0		0		0		1	1.00	0		0		0	1.00
<i>Mola</i> spp.	0		0		0		0	1.00	0		0		0	1.00
Decapodiformes	0		0		0		0		0		0		1	1.11
Others	53	2.89	51	1.00	43	1.85	48	3.70	89	6.14	37	1.47	30	2.70

Year								20)13							
Month				April							May					
Raft No.	Raft1		Raft2		Raft3		Raft4		Raft1		Raft2		Raft3		Raft4	
Sample size	67		64		80		76		9		109		95		97	
Category	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean
Seriola spp.	46	5.10	50	8.31	84	3.90	76	16.59	78	5.29	70	8.82	61	11.71	95	4.65
Naucrates ductor	0		0		0		0		0		0		0		0	
Oplegnathus punctatus	0		0		0		0		0		0		78	1.00	0	
Girellidae/Kyphosidae	0		0		0		20	1.00	0		74	1.89	16	1.20	91	2.05
Petroscirtes breviceps	0		2	1.00	0		57	1.95	0		0		0		0	
Psenes cyanophrys	0		0		68	1.87	0		11	1.00	28	2.13	38	3.50	54	3.62
Hyperoglyphe japonica	0		0		0		0		11	1.00	20	7.05	60	9.39	19	2.22
Abudefduf vaigiensis	0		0		0		16	1.00	11	6.00	39	2.17	39	1.76	80	1.72
Sebastes thompsoni	33	1.41	0		0		4	1.00	0		0		0		0	
Tetraodontiformes	0		0		0		0		0		74	1.49	36	2.38	65	3.41
Coryphaena hippurus	0		0		0		1	1.00	22	1.50	29	1.91	23	1.59	39	2.11
Lobotes surinamensis	0		0		0		0		11	1.00	19	1.00	0		0	
Belonidae	0		0		0		0		0		0		0		0	
Exocoetidae	0		0		0		0		0		0		0		0	
<i>Mola</i> spp.	0		0		0		0		0		0		1	1.00	0	
Decapodiformes	15	1.90	2	1.00	0		3	1.00	0		0		7	1.00	1	2.00
Others	1	1.00	30	1.05	1	1.00	38	1.38	100	1.11	94	4.97	29	2.79	15	1.13

Table S3. Occurrence frequency F (%) and mean observed number of fishes and cephalopoda in video images during our study period (continued on
 next page)

775	Table S3.	(continued)
-----	-----------	-------------

Year							2014							
Month			Aj	oril		May								
Raft No.	Raft1		Raft2		Raft3		Raft1		Raft2		Raft3			
Sample size	84		30		93		92		24		25		Summary	
Category	F (%)	Mean	F (%)	Mean	F (%)	Mean	F (%)	Mean						
<i>Seriola</i> spp.	39	1.27	93	6.18	84	8.33	88	22.10	33	5.63	84	10.95	71	9.54
Naucrates ductor	0		0		0		0		8	1.00	0		0	1.00
Oplegnathus punctatus	0		0		59	1.00	77	1.00	0		0		21	1.00
Girellidae/Kyphosidae	0		0		0		0		0		0		21	1.84
Petroscirtes breviceps	0		0		0		0		0		0		5	1.93
Psenes cyanophrys	0		0		0		0		0		12	2.33	19	2.77
Hyperoglyphe japonica	0		0		0		0		0		0		10	7.46
Abudefduf vaigiensis	0		0		0		0		0		0		18	1.81
Sebastes thompsoni	87	1.77	0		0		29	3.04	0		0		13	1.96
Tetraodontiformes	0		0		0		26	1.25	0		0		21	2.21
Coryphaena hippurus	6	1.60	3	1.00	28	1.19	33	2.60	4	1.00	8	1.00	17	1.88
Lobotes surinamensis	0		0		0		0		0		0		2	1.00
Belonidae	0		0		4	1.00	0		0		0		0	1.00
Exocoetidae	0		0		0		1	1.00	0		0		0	1.00
<i>Mola</i> spp.	0		0		0		1	1.00	0		0		0	1.00
Decapodiformes	0		0		0		0		8	1.00	0		3	1.32
Others	98	5.71	80	1.00	52	1.54	70	5.48	96	8.30	88	2.32	50	3.93

777	Video S1. Seriola spp. Typical video image during the daytime (a part of the file recorded during
778	12:00-12:02 in 26 May 2014, raft 1)

780	Video S2. Seriola spp. The behavioral transition from the nighttime dense aggregation pattern to the
781	daytime swimming pattern (a part of the file recorded during 05:05–05:10 in 23 May 2014, raft 3)
782	

783 Video S3. *Seriola* spp. Two schools met each other to form a larger school (a part of the file
784 recorded during 10:00–10:02 in 13 April 2013, raft 4)

785

Video S4. *Seriola* spp. One fish (around the center of the frame) escaped into the seaweed when *Coryphaena hippurus* appeared (a part of the file recorded during 08:00–08:02 in 22 May 2014, raft
3)