

## Otolith fingerprints as natural tags to identify juvenile fish life in ports

Bouchoucha Marc <sup>1, 4, 5, 6,\*</sup>, Péchéyran C. <sup>2</sup>, Gonzalez Jean-Louis <sup>3</sup>, Lenfant P. <sup>4, 5</sup>, Darnaude A.M. <sup>6</sup>

<sup>1</sup> Lab Environnement Ressources Provence Azur Corse, Centre Ifremer de Méditerranée ZP de Brégallion, CS 20330, 83507, La Seyne-sur-Mer, France

<sup>2</sup> Univ. Pau et des Pays de l'Adour, CNRS, LCABIE-IPREM UMR 5254, 64053, Pau, France

<sup>3</sup> Lab. Biogéochimie des Contaminants Métalliques, Centre Ifremer de Méditerranée ZP de Brégallion, CS 20330, 83507, La Seyne-sur-Mer, France

<sup>4</sup> Univ. Perpignan Via Domitia, CEntre de Formation et de Recherche sur les Environnements Méditerranéens, UMR 5110, 58 Avenue Paul Alduy, F-66860, Perpignan, France

<sup>5</sup> CNRS, CEntre de Formation et de Recherche sur les Environnements Méditerranéens, UMR 5110, 58 Avenue Paul Alduy, F-66860, Perpignan, France

<sup>6</sup> CNRS, UMR MARBEC 9190. CC093, Université de Montpellier, Place Eugène Bataillon, 34095, Montpellier, France

\* Corresponding author : Marc Bouchoucha, email address : [marc.bouchoucha@ifremer.fr](mailto:marc.bouchoucha@ifremer.fr)

### Abstract :

The construction of ports has caused substantial habitat destruction in coastal areas previously used as nursery grounds by many fish species, with consequences to fish stocks. These artificial coastal areas might provide alternative nursery habitats for several species for juvenile fish abundances and growth in ports, although their contribution to adult stocks had never been estimated. The variability of otolith composition in the juveniles of two *Diplodus* species was investigated in three contrasting port areas and two adjacent coastal juvenile habitats of the Bay of Toulon (northwestern Mediterranean) in order to determine the possible use of otolith fingerprints as natural tags for the identification of juvenile fishes in ports. The global accuracy of discrimination between ports and coastal areas was very high (94%) irrespective of species, suggesting that otolith fingerprints can be used with confidence to retrospectively identify past residency in the ports of this bay. However, Ba was systematically the most discriminating element, since its concentrations in otoliths were generally higher outside ports than in inside them, probably due to river runoff. Moreover, otolith signatures varied greatly by species and between sampling sites. Furthermore, although Cu and Pb concentrations in water were at least 2.3–34-fold higher inside ports than outside, this was not consistently reflected in fish otoliths, confirming that spatial differences in otolith concentrations depend on the species and do not directly reflect differences in environmental contamination levels. Therefore, it seems unlikely that otolith microchemistry could provide a universal fingerprint capable of discriminating ports from other coastal areas. Nevertheless, the contribution of ports to adult fish populations can be determined well by establishing a library of otolith fingerprints for all juvenile habitats.

**Keywords :** Coastal areas, Nursery habitats, Fish, LA-ICPMS, Contamination

1      Introduction:

2      Shallow coastal areas are used as nursery habitats by many fish species as they are highly productive  
3      environments (Harmelin-Vivien et al., 1995; Macpherson et al., 1997; Beck et al., 2001). However,  
4      they are increasingly threatened by urbanization (Lotze et al., 2006; Airoldi and Beck, 2007; Halpern  
5      et al., 2008), in particular by port constructions (Rodríguez-Rodríguez et al., 2015). Several recent  
6      studies have suggested that coastal man-made infrastructures, particularly those found inside ports,  
7      might provide suitable alternative nursery habitats for certain fish species (e.g. Pizzolon et al., 2008;  
8      Bouchoucha et al., 2016; Mercader et al., 2017). However, these conclusions were solely based on fish  
9      abundance (Bouchoucha et al., 2016; Mercader et al., 2017) or post-settlement growth and condition  
10     (Bouchoucha et al., 2018) in ports when, in theory, fish nursery grounds are defined according to three  
11     conditions: they support high abundances of juveniles, they sustain faster somatic growth rates and  
12     they also enhance fish survival so their populations contribute more to the final adult stock (Beck et  
13     al., 2001). Therefore, the correct estimation of the nursery role played by ports implies estimating the  
14     relative contribution of port juvenile habitats to adult stocks.

15     Among the tools available for this purpose, otolith microchemistry is increasingly used (Campana et  
16     al., 2000; Elsdon et al., 2008; Dierking et al., 2012; Fortunato et al., 2017). Otoliths are paired  
17     calcified structures located in the inner ear of teleost fishes. They have been widely used in marine  
18     ecology and fishery research to describe population age structure, assess connectivity between fish  
19     stocks and study individual migration patterns (Campana, 1999; Dierking et al., 2012). Otoliths are  
20     particularly well suited for these applications because of three key properties. Firstly, they grow  
21     continuously throughout daily centrifugal accretions of calcium carbonate ( $\text{CaCO}_3$ ) aragonitic crystals  
22     on protein layers (Campana and Neilson, 1985). Secondly, as otoliths are acellular and metabolically  
23     inert, they are neither reworked nor resorbed, even during times of starvation (Campana and Neilson,  
24     1985). Chemical fingerprints are thus retained permanently within the microstructure (Panfili, 2002).  
25     Thirdly, the incorporation of some chemical elements in the otolith is somehow influenced by the  
26     ambient water (Elsdon and Gillanders, 2003; Sturrock et al., 2012). The chemical composition of the  
27     inner region within adult fish otoliths can thus be used as a natural tag to retrospectively assign their  
28     juvenile origin (e.g. Gillanders and Kingsford, 2000; Vasconcelos et al., 2008; Tournois et al., 2017).

29     To achieve this, the habitats must differ sufficiently in their environmental conditions, whether  
30     because of varied anthropogenic influences or due to natural variations (Barnes and Gillanders, 2013;  
31     Sturrock et al., 2015). As the recipients of industrial and domestic wastes, ports are generally subject  
32     to high chemical contaminations (Darbra et al., 2004) and seem particularly suited for studies using

33 elemental fingerprints in otoliths as natural tags. However, the incorporation of elements in otoliths is  
34 more complex than their mere concentration in the ambient water as it is affected by their  
35 bioavailability, the physiological state of individual fish (Sturrock et al., 2015) and the  
36 synergetic/concomitant effects of temperature, salinity and water chemistry (Elsdon and Gillanders,  
37 2004). While some elements (e.g., Sr, Ba) appear to directly reflect ambient water concentrations,  
38 others (e.g. Cu, Zn) are physiologically regulated and less likely to reflect surrounding environmental  
39 conditions (Campana, 1999; Sturrock et al., 2012; Izzo et al., 2018). Moreover, some elements (e.g.  
40 Cu, Pb) can affect fish condition and metabolic rates leading to variations in their incorporation in  
41 otoliths (Geffen et al., 1998; Hamer and Jenkins, 2007).

42 In this context, the specific aim of this study was to investigate differences in otolith composition  
43 among fish juveniles captured after several months of residency in varied habitats located inside and  
44 outside ports. Using two *Diplodus* species with different recruitment periods and five contrasting sites  
45 (three inside ports and two outside them, in adjacent juvenile habitats) located in the Bay of Toulon  
46 (Northwestern Mediterranean), we tested whether otolith elemental fingerprints could be used with  
47 confidence to retrospectively identify previous fish residency in ports. This would allow the reliable  
48 assessment of the contribution of ports to adult fish populations and thus better evaluation of the  
49 potential consequences of port infrastructures for fish stock dynamics. The hypothesis tested here was  
50 that the otoliths of fish captured inside ports would contain consistently higher concentrations of port  
51 related trace elements (such as Pb, Cu, Zn, etc.) than those of fish from the other coastal areas.

## 52 Materials and Methods

### 53 Model species

54 Two *Diplodus* species, *D. sargus sargus* (Linnaeus, 1758), hereafter *D. sargus*, and *D. vulgaris*  
55 (Geoffroy Saint-Hilaire, 1817) were chosen for this study. Both are very common in the  
56 Mediterranean (Coll et al., 2004; Morales-Nin et al., 2005; Lloret et al., 2008) and their juveniles are  
57 found in high abundances inside ports (Clynick, 2006; Bouchoucha et al., 2016). However there is  
58 temporal segregation between settlement periods of the two species (García-Rubies and Macpherson,  
59 1995; Harmelin-Vivien et al., 1995; Vigliola et al., 1998; Cheminee et al., 2011; Ventura et al., 2014;  
60 Bouchoucha et al., 2016): *D. sargus* generally settles in one pulse, in May-June, and usually leaves its  
61 nursery grounds in September while *D. vulgaris* generally settles in two pulses, in November-  
62 December and in January-February, the first pulse being predominant, and leaves its nursery grounds  
63 in June-July. However, in the both species, spatial variability in settlement period may occur (Vigliola  
64 et al., 1998). Moreover, migrations between nursery areas is very limited for both species  
65 (Macpherson et al., 1997). Therefore, investigating variations in otolith chemical composition in these  
66 two species should allow reaching conclusions regarding the temporal stability of the otolith elemental  
67 fingerprints if any.

68 Study area, fish sampling and environmental data

69 This study was carried out in the Bay of Toulon (Northwestern Mediterranean, Fig. 1) which is  
70 divided into the Large Bay ( $42.2 \text{ km}^2$ ) and the Small Bay ( $9.8 \text{ km}^2$ ), separated by a breakwater (1,200  
71 m) built in the nineteenth century (Fig.1). The Small Bay harbors one of France's largest industrial  
72 ports, the biggest naval port of the Mediterranean, and several marinas. Both the historic and present  
73 activities pursued in this part of the bay result in the heavy multi-contamination of its sedimentary  
74 compartment (Tessier et al., 2011; Pougnet et al., 2014; Dang et al., 2015) and water column (Jean et  
75 al., 2012; Dang et al., 2015). For example, sediment concentrations of Pb and Cu within the naval port  
76 of Toulon are among the highest ever measured in a marine area (Tessier et al., 2011). Conversely, the  
77 Large Bay is only slightly impacted by human activities and offers shallow rocky areas whose  
78 characteristics correspond to suitable nursery areas for many juvenile fishes (Harmelin-Vivien et al.,  
79 1995; Cheminee et al., 2011). Contamination levels in this part of the bay are low (Tessier et al.,  
80 2011). Therefore, the Bay of Toulon is particularly suited for investigating differences in fish otolith  
81 composition between juvenile habitats located within and outside ports.

82 In this work, five contrasting sampling sites were selected in the Bay of Toulon: three representative  
83 of the different types of port present in the Bay of Toulon and two representative of the other types of  
84 coastal habitats available for the juveniles of local rocky fishes. The first sampling site (STM) was  
85 located in the Saint-Mandrier marina. This marina, representative of the marinas found in the Small  
86 Bay of Toulon, harbors 800 boats and pleasure craft and its average depth varies between 2.5 and 4 m.  
87 The second site (TLN) was located about 500 m from the port of Toulon, which is the biggest naval  
88 port in the Mediterranean (30 warships and nuclear attack submarines) and a major ferry terminal  
89 (around 1,000 rotations and 1.2 million passengers a year). The area around the TLN sampling site is  
90 one of the most contaminated of the Bay of Toulon (Tessier et al., 2011; Wafo et al., 2016). The third  
91 site (IFR) was positioned further in the Small Bay (fig. 1), within a port harboring a part of the French  
92 oceanographic fleet. The fourth sampling site (DLE) was located on the seaward side of the  
93 breakwater that separates the Small from the Large Bay (Fig. 1), in an area considered as slightly  
94 impacted by port pollution (Tessier et al., 2011; Wafo et al., 2016). As the seaward sides of peripheral  
95 breakwaters are generally considered favorable juvenile fish habitats (Ruitton et al., 2000; Guidetti,  
96 2004; Clynick, 2006; Pizzolon et al., 2008; Dufour et al., 2009; Pastor et al., 2013), the DLE site was  
97 considered in this study as representative of the non-polluted artificial juvenile habitats available for  
98 rocky fishes within the Bay of Toulon. Physical habitat characteristics (substrate, depth, etc.) are  
99 equivalent in the STM, TLN, IFR and DLE sampling sites. The last sampling site (MAG) was located  
100 in a natural cove (Anse Magaud) whose characteristics match those of the successful benthic  
101 settlement of *Diplodus* species, i.e. shallow water habitats (between 0 and 2 m) protected from  
102 prevailing winds and characterized by gentle slopes covered with sand, pebbles and boulders

103 (Harmelin-Vivien et al., 1995; Cheminee et al., 2011). Therefore, this site is considered as  
 104 representative of the natural rocky fish nursery habitats available in the Bay of Toulon.

105 Sampling took place in September 2014 for *D. sargus* and late June / early July 2015 for *D. vulgaris*,  
 106 i.e. during the month preceding the departure of the juveniles of each species from nursery their areas  
 107 to join adult populations. Between 9 and 14 juveniles per species were sampled from each site using  
 108 hand-nets. Juveniles were discriminated following the size and morphometric criteria given by  
 109 Vigliola and Harmelin-Vivien (2001).

110 Trace element concentrations in the water column were assessed at each sampling site using the  
 111 diffusive gradient in thin film (DGT) device which allows gathering integrative values of the most  
 112 labile dissolved concentrations of metal species in water (Davison and Zhang, 1994). By accumulating  
 113 ionic forms and weakly dissociable complexes (hereafter named the DGT-labile fraction) on a Chelex  
 114 100 resin, proportionally to their water concentration and exposure time, "Standard" DGTs  
 115 "concentrate" the most highly "labile" dissolved cations, as defined operationally (hydrated ions,  
 116 mineral complexes, and "weak" or "rapidly dissociable" organic complexes). This DGT- labile fraction  
 117 is generally considered more representative of potentially bioavailable fraction than the total metal  
 118 concentration (Zhang and Davison, 2001; Odzak et al., 2002; Twiss and Moffett, 2002). In our study,  
 119 three DGTs were immersed at 1.5m depth for 15 days each month, from January to July 2015, at each  
 120 of the five sampling sites. Three DGTs were selected as controls and not immersed in the seawater.  
 121 During this period, temperature and salinity data were also recorded monthly at each site using a CTD  
 122 probe (YSI Pro30).

### 123 Otolith analyses

124 Fish juveniles were transported on ice to the laboratory, measured (Total length TL, in mm), weighed  
 125 (total mass, in mg) and stored at -20°C until otolith extraction. In accordance with Campana et al.  
 126 (2000), all the materials used for otolith extraction and handling were decontaminated in 4% ultrapure  
 127 nitric acid baths, triple rinsed with ultrapure water (18.2 MΩ) and dried on a Class 100 clean bench.  
 128 *Diplodus* sagital otoliths were extracted using plastic forceps under binocular lens, rinsed with  
 129 ultrapure water and cleaned of adhering tissues. They were then sonicated for 5 min in ultrapure water,  
 130 triple rinsed again and dried on the same laminar clean bench.

131 Right otoliths from all fish were embedded separately in epoxy resin (Araldite 2020, Escil) and cut in  
 132 the transverse plane using a saw with a diamond coated blade (Buehler IsoMet 1000 precision saw).  
 133 Individual otolith sections were then polished using 1200, 2400 and 4000 silicate papers to expose the  
 134 core (average thickness ≈ 300 µm). A final sonication was carried out for surface decontamination  
 135 before storage in dust-free conditions until analysis.

136 In addition to <sup>43</sup>Ca, otolith elemental compositions of nine elements (<sup>24</sup>Mg, <sup>51</sup>V, <sup>55</sup>Mn, <sup>63</sup>Cu, <sup>66</sup>Zn, <sup>88</sup>Sr,  
 137 <sup>118</sup>Sn, <sup>138</sup>Ba and <sup>208</sup>Pb ) were assessed using a 257 nm high repetition rate femtosecond (fs) Laser

138 Ablation system (Lambda 3, Nexeya, France) coupled with a High Resolution Inductively Coupled  
139 Plasma Mass Spectrometer (HR-ICPMS) fitted with a jet interface (Element XR, Thermo Bremen)  
140 (fsLA-HRICPMS). The laser in this system delivers 360 fs pulses at a wave-length s of 257 nm and  
141 can be operated at high repetition rates (up to 100 kHz). By combining the high repetition rate (500  
142 Hz) of the laser with a fast back and forth movement ( $1 \text{ mm.s}^{-1}$ ) of its beam (diameter 20  $\mu\text{m}$ , energy  
143  $45 \mu\text{J.pulse}^{-1}$ ), an elongated virtual beam shape (width 150  $\mu\text{m}$ ) was simulated at a speed of  $5 \mu\text{m.s}^{-1}$ .  
144 For each otolith analyzed, a linear raster of 150  $\mu\text{m}$  length consisting of approx. 30 sequential  
145 measures, was taken along the longest radius, starting at 200  $\mu\text{m}$  after the settlement mark (Fig. 2).  
146 This portion of the otolith corresponds approximately to the third month of fish juvenile life. This was  
147 estimated through a microstructural analysis and a daily increment counts performed on the left otolith  
148 of each fish (Vigliola, 1997). For each otolith, the laser was used to preclean the otolith surface of  
149 interest prior to ablation. To do this, the laser was operated at a lower repetition rate (100 Hz) and a  
150 faster stage movement ( $400 \mu\text{m.s}^{-1}$  instead of  $5 \mu\text{m.s}^{-1}$ ) in order to prevent excessive in-depth removal  
151 (resulting ablation depth = 2-5  $\mu\text{m}$ ).

152 The ablation cell was flushed with Helium ( $700 \text{ ml.min}^{-1}$ ) to carry the particles to the ICPMS, and  
153 argon ( $300 \text{ ml.min}^{-1}$ ) was mixed with the helium stream using a Y-piece to adjust the optimal particle  
154 atomization conditions in the plasma. The plasma was also fed with nitrogen ( $10 \text{ ml.min}^{-1}$ ) to enhance  
155 signal sensitivity.

156 As light elements are prone to interference from polyatomic and double charged isotopes, the mass  
157 spectrometer was used in medium resolution mode ( $R = 4000$ ) to optimize interference removal during  
158 analysis. Calcium was used as an internal standard for each ablation to correct for instrumental error  
159 (in terms of ablation yield and detection). The quantification of elements in the otoliths was achieved  
160 by external calibration using three NIST glass standards (610, 612 and 614). Two otolith Certified  
161 Reference Materials (NIES22 and FEBS 1 were also pelletized and used to control the quality of the  
162 analysis of selected elements in the fish otoliths. The average limits of detection (LOD) over a three  
163 month-session based on the threefold standard deviation of blank gas were 2.0, 0.8, 0.8, 4.2, 13.2, 1.6,  
164 8.1, 0.3 and 0.6  $\mu\text{g.g}^{-1}$  in the otoliths for  $^{24}\text{Mg}$ ,  $^{51}\text{V}$ ,  $^{55}\text{Mn}$ ,  $^{63}\text{Cu}$ ,  $^{66}\text{Zn}$ ,  $^{88}\text{Sr}$ ,  $^{118}\text{Sn}$ ,  $^{138}\text{Ba}$  and  $^{208}\text{Pb}$ ,  
165 respectively.

166 Water analyses

167 Following the deployment of the DGTs, the Chelex resin of the probes was peeled off in the laboratory  
168 and trace elements were extracted in 1.8 ml of 1 M ultrapure nitric acid (24 – 48 h). Concentrations in  
169 the acid extracts were analyzed for four trace elements (Pb, Mn, Zn and Cu) using ICP-MS to  
170 determine the mass of metal (M) accumulated in the Chelex 100 resin. These elements were chosen  
171 because they can be measured using DGT and are representative of port and human activities in the  
172 Bay of Toulon (Tessier et al., 2011).

173 For each trace element, the average labile concentrations in water (CDGT) were calculated using the  
 174 following equation (Zhang et al., 1995):

175  $CDGT = (M \cdot \Delta g) / (Dm \cdot t \cdot A)$

176 where M is the mass of the trace element accumulated in the resin,  $\Delta g$  is the diffusive layer thickness,  
 177 Dm is the diffusion coefficient of the trace element provided by DGT Research  
 178 ([www.dgtresearch.com](http://www.dgtresearch.com)), t is the immersion of the DGT probe, and A is the exposure area.

179 Statistical analyses

180 Otolith concentrations for all elements were transformed to their ratio to Calcium (element:Ca ratio)  
 181 and checked for normality and homoscedasticity prior to statistical analyses. Since none of the  
 182 assumptions were satisfied, even after transformation, Mann-Whitney tests and Kruskall-Wallis tests  
 183 followed by Steel-Dwass-Chritchlow-Fligner post-hoc tests were used. For each species spatial  
 184 variation in elemental ratios were analyzed according to habitat type (inside or outside a port) and the  
 185 sampling site, respectively. Spatial variation in the elemental composition of water was also tested  
 186 using Kruskall-Wallis tests followed by Steel-Dwass-Chritchlow-Fligner post-hoc tests.

187 In accordance with Mercier et al. (2011), accuracy in habitat type and sampling site identification  
 188 using otolith elemental fingerprints were investigated for each species using the Random Forest (RF)  
 189 algorithm (Breiman, 2001). RF is a machine-learning classification method which requires no a priori  
 190 assumptions regarding data distribution and can extract signals from complex datasets. Therefore it is  
 191 very effective for discriminating local coastal habitats based on otolith elemental fingerprints (e.g.  
 192 Mercier et al., 2012; Regnier et al., 2017; Tournois et al., 2017) even in the presence of skewness  
 193 (Mercier et al., 2011; Jones et al., 2017). Details of the method are provided in Mercier et al. (2011)  
 194 and Tournois et al. (2013). For each of the individual measures performed on the otoliths, the RF  
 195 predicts habitat origin by running it through 5000 trees of a classifier (built from known signatures  
 196 from all habitats) and then using “majority rules” to reach a consensus between all the trees (Tournois  
 197 et al., 2017). In our case, to identify the list of elements needed to reach maximum accuracy in habitat  
 198 discrimination, a portion of the dataset (75%) was randomly selected to build the RF classifier and the  
 199 remaining portion (25%) was used to calculate the global classification accuracy and the percentage of  
 200 correct re-assignments for each location (cross validation procedure). This cross-validation procedure  
 201 was applied to all the possible combinations of two to nine of the nine elements measured in the  
 202 otoliths (Ca was used as an internal standard).

203 Once the optimal RF classifier had been identified, values for True Skill Statistics per habitat (TSS,  
 204 Allouche et al., 2006) were calculated to evaluate the successful discrimination for each location.  
 205 Contrary to habitat accuracy, TSS accounts for true negative prediction, namely for fish whose  
 206 absence from a given site was correctly predicted. TSS ranges from -1 to 1, where 1 indicates 100%  
 207 correct prediction of presence or absence in a given habitat (Tournois et al., 2017). Finally, the

208 contribution of each element to the global success of discrimination was evaluated using the mean  
 209 decrease in the Gini index (Archer and Kimes, 2008): the higher it is, the more discriminative the  
 210 element (Tournois et al., 2013). All data processing and statistical analyses were performed using the  
 211 R software (R Core Team, 2014) and PRIMER 6 software with the PERMANOVA add-on (Clarke  
 212 and Warwick, 2001).

## 213 Results

214 Water concentrations in Cu and Pb differed significantly ( $p < 0.0001$ ) according to the sampling sites  
 215 (Table 1), with consistently lower values at MAG and higher ones in ports. However, water  
 216 concentrations in Cu were maximal at STM ( $2\,971 \pm 997 \text{ ng.l}^{-1}$ ), while for Pb, the highest values were  
 217 recorded at TLN ( $328 \pm 107 \text{ ng.l}^{-1}$ ). No significant differences ( $p \geq 0.06$ ) in Mn and Zn concentrations  
 218 in water were observed among the sites (Table 1).

219 Spatial differences in otolith elemental concentrations were not consistent for all elements and  
 220 between species (Fig.3). Ba, Mn and Sr values were always significantly higher ( $p < 0.001$ ) outside  
 221 ports while for Mg and Sn otolith concentrations were consistently higher inside them ( $p < 0.018$ ). For  
 222 Cu, the values in ports were significantly higher for *D. sargus* ( $p < 0.001$ ) but lower for *D. vulgaris* ( $p$   
 223  $< 0.0001$ ). For Pb, no significant variation ( $p > 0.063$ ) was observed between the two habitat types  
 224 (inside or outside ports), irrespective of species. Finally, for Zn, variations were not significant  
 225 between habitat types for *D. sargus* ( $p = 1$ ) whereas, for *D. vulgaris* the values were higher outside  
 226 ports ( $p < 0.001$ ). This pattern was inversed for V.

227 For both species, discrimination accuracy using RF was always maximal when including eight  
 228 elements out of nine, V and Sr apparently contributing more noise than signal to the discrimination for  
 229 *D. sargus* and *D. vulgaris*, respectively (Fig. 4).

230 The global discrimination accuracy between ports and adjacent juvenile habitats reached 94% with  
 231 TSS  $> 0.87$  irrespective of species (Fig. 4, Table 2). However, the list of elements included in the RF  
 232 classifier differed between the two species, the three most useful elements being Ba, Mn and Sn for *D.*  
 233 *sargus* and Ba, Zn and Mn for *D. vulgaris* (Fig. 4).

234 When considering the five sampling sites separately, using the optimal RF classifier for each species  
 235 allowed reaching high overall accuracy for both *D. sargus* (90%) and *D. vulgaris* (89%). Yet again,  
 236 the most useful elements differed between species, the three most discriminating elements being Ba,  
 237 Sn and Mn for *D. sargus* and Ba, Sn and Cu for *D. vulgaris* (Fig. 4). For both species,  
 238 misclassification errors mostly concerned the STM sampling site (TSS  $< 0.84$ ) which was to some  
 239 extent confused with the MAG, DLE and IFR sites due to similar values for Mn, Sr, Cu, Mg, Sn and  
 240 Zn (Table 2, Fig. 3).

## 241 Discussion

242 As expected from similar studies on other coastal habitats in the Mediterranean (e.g. Di Franco et al.,  
243 2011; Fortunato et al., 2017) and elsewhere (e.g. Hamer et al., 2005; Correia et al., 2011), our study  
244 showed differences in otolith elemental composition between the five sites sampled. This is not  
245 particularly surprising as the sampling sites in this work are highly contrasted in terms of contaminant  
246 concentrations (Fig. 3), which are known to influence fish otolith composition (Campana, 1999;  
247 Sturrock et al., 2012).

248 In our study area, otolith signatures inside ports differed markedly from those outside them (especially  
249 for Ba and Mn), which should allow accurate the identification of port origin in local adult *D. sargus*  
250 and *D. vulgaris*. For both species, the global classification accuracy obtained between habitat types  
251 (inside ports vs. outside) was even higher (94%) than those found in other coastal systems (Gillanders,  
252 2005; Vasconcelos et al., 2008; Tanner et al., 2011; Tournois et al., 2013). However, considering all  
253 five sampling sites separately also led to very high global classification accuracies ( $\geq 89\%$ ) and correct  
254 re-assignment rates for all of them ( $\geq 76\%$ ). Therefore, although port habitats could be confidently  
255 identified here for both species, the variability of elemental fingerprints was high among port sites and  
256 among adjacent juvenile habitats. This variability has already been pointed out in natural coastal areas  
257 and is largely exploited in studies of the dispersal/connectivity of fully marine fishes (Di Franco et al.,  
258 2011).

259 However, this work also showed that otolith elemental concentrations in ports do not consistently  
260 reflect their high concentrations in the environment. The relationship between environmental exposure  
261 and otolith final concentrations was even inverted for some trace elements. For example, in *D. sargus*,  
262 otoliths from MAG were 1.4-fold more contaminated in Cu than those from STM (Fig. 4) whereas Cu  
263 concentration was found to be 34-fold higher in the water of MAG (Fig. 3). Similarly, in *D. vulgaris*,  
264 otolith concentrations in Pb were significantly higher in DLE than in TLN (1.3-fold,  $p = 0.017$ )  
265 whereas this element was 2.6-fold more concentrated in the water at TLN than at DLE (Fig. 3, Fig. 4).  
266 Therefore, although the three ports studied were more contaminated than adjacent juvenile habitats, in  
267 particular for Pb and Cu (Fig. 3), we failed to find at least one trace element for which otolith  
268 concentrations would be consistently higher in ports. Up to now few studies have focused on the link  
269 between the accumulation of elements in fish otoliths and their bioavailable concentrations in the  
270 aquatic environment (e.g. Geffen et al., 1998; Ranaldi and Gagnon, 2009; Daverat et al., 2012), yet  
271 those that have done so generally suggested that for many trace elements stored in fish otoliths, in  
272 particular Cu and Pb (Friedrich and Halden, 2010, 2011; Søndergaard et al., 2015), otolith  
273 concentrations largely reflect concentrations in water. This led some authors to conclude that trace  
274 element analyses in otoliths could be considered a valuable method for assessing time-resolved trace  
275 element exposure due to anthropogenic pollution (Søndergaard et al., 2015; Selleslagh et al., 2016).  
276 Several hypotheses can be proposed to explain the inconsistency between our results and these  
277 conclusions. Firstly, due to differences in metabolism and otolith formation, trace element

278 accumulation in otoliths differs among species (Geffen et al., 1998; Hamer and Jenkins, 2007;  
279 Vasconcelos et al., 2007). Therefore, it is possible that otolith trace element incorporation is lower in  
280 *D. sargus* and *D. vulgaris* juveniles than in the sand goby *Pomatoschistus minutus* (Geffen et al.,  
281 1998), black bream *Acanthopagrus butcheri* (Ranaldi and Gagnon, 2008), flounder *Platichthus flesus*  
282 (Selleslagh et al., 2016) and common sculpin *Myoxocephalus scorpius* (Søndergaard et al., 2015),  
283 which were all suggested to be adequate for monitoring pollution from point sources. This hypothesis  
284 is supported by the fact that lower otolith accumulation rates have already been pointed out for certain  
285 trace elements in *Diplodus vulgaris*, when compared to other species like sole and flounder  
286 (Vasconcelos et al., 2007). Secondly, the accumulation of trace elements in fish otoliths not only  
287 depends on several factors, including their concentration in the environment and their bioavailability,  
288 but also on the physiological state of the fish (affecting the exchange rate between the external and  
289 internal environments), and on the mechanisms they use for detoxifying different metals or controlling  
290 their growth rate (affecting the rate of accumulation of otolith material). Although juvenile growth for  
291 both species is equivalent inside and outside the ports of this area (Bouchoucha et al., 2018), the  
292 consequences of juvenile life in ports on their individual physiological state still remain unclear. The  
293 influence of anthropogenic stressors on fish metabolism may explain differences in otolith trace  
294 element incorporation between the two types of habitat. However, further research is needed to  
295 investigate the respective influences of element concentrations in water and spatial variations in fish  
296 metabolism on their accumulation in the otoliths of juvenile *Diplodus*. Nonetheless, we have to reject  
297 our initial hypothesis: the otoliths of the juvenile *Diplodus* captured inside ports, even at the most  
298 polluted sites, did not contain higher concentrations of port-related trace elements (such as Pb, Cu, Zn,  
299 etc.) than those from the juveniles captured in less polluted coastal areas. Therefore, otolith  
300 concentrations in these elements cannot be used to retrospectively identify the past residency of adult  
301 fish in ports, at least for the two species studied.

302 For both species, Ba was the most discriminating element among our sampling sites and between the  
303 two types of habitat, as its concentration in the otoliths, with one exception, was consistently higher  
304 outside ports than inside them (Fig. 4). This result is surprising as Ba is routinely used to distinguish  
305 residence in brackish habitats (reviewed by Elsdon et al., 2008), as its incorporation in otoliths falls  
306 when salinity increases (Bath et al., 2000; Elsdon and Gillanders, 2004). Nonetheless, the three port  
307 sites investigated here had lower salinities than the two others (Table 1). However, Ba concentrations  
308 in otoliths can be modulated by endogenous factors (e.g. fish condition - Izzo et al., 2015), and  
309 generally reflect ambient environmental concentrations (Campana, 1999; Elsdon et al., 2008). The  
310 DLE and MAG sites are located in the Large Bay of Toulon, close to the two outlets of the Eygoutier  
311 river (Fig. 1). As Ba is closely bound to fluvial sediments (Coffey et al., 1997), ambient Ba  
312 concentrations may be higher in DLE and MAG than in the three other sampling sites, explaining  
313 differences in juvenile fish otolith compositions. Therefore, it is likely that the pattern observed here

314 with regard to otolith Ba concentrations is particular to the Bay of Toulon and cannot be extrapolated  
 315 to other ports and coastal areas.

316 Finally, the trace elements responsible for the discrimination among the five sampling sites differed  
 317 according to species, which might suggest that otolith fingerprints should be determined for each  
 318 species independently and cannot be extrapolated from one species to another. The differences in  
 319 otolith environmental records between our two species may be due to endogenous processes like  
 320 physiological regulation (Sturrock et al., 2015) as well as to exogenous ones. Indeed, in the  
 321 Northwestern Mediterranean, *D. vulgaris* generally hatches in two pulses, in October-November and  
 322 in December-January, whereas *D. sargus* generally hatches only in May-June (Vigliola et al., 1998).  
 323 Since we analyzed otolith portions corresponding approximately to the third month of life for both  
 324 species, the environmental signals recorded by the two species do not overlap: for *D. vulgaris*, the  
 325 otolith fingerprints correspond to winter/spring conditions while for *D. sargus*, they correspond to  
 326 summer ones. Temporal variability in the elemental fingerprints must therefore be evaluated before  
 327 concluding on the differences in environmental recording capacities among species.

328 In conclusion, our results showed that otolith microchemistry cannot provide a unique and reliable  
 329 fingerprint discriminating all ports from other coastal areas. Nevertheless, we showed that, as with  
 330 natural habitats, otolith microchemistry can provide an effective natural tag for determining the  
 331 contribution of each port individually, at least in the two species studied. Therefore, in order to assess  
 332 the contribution of ports to adult fish populations, a library of otolith fingerprints from all juvenile  
 333 habitats should be established, by species and probably by cohort, and matched against fingerprints  
 334 from adult otoliths (Thorold et al., 2001).

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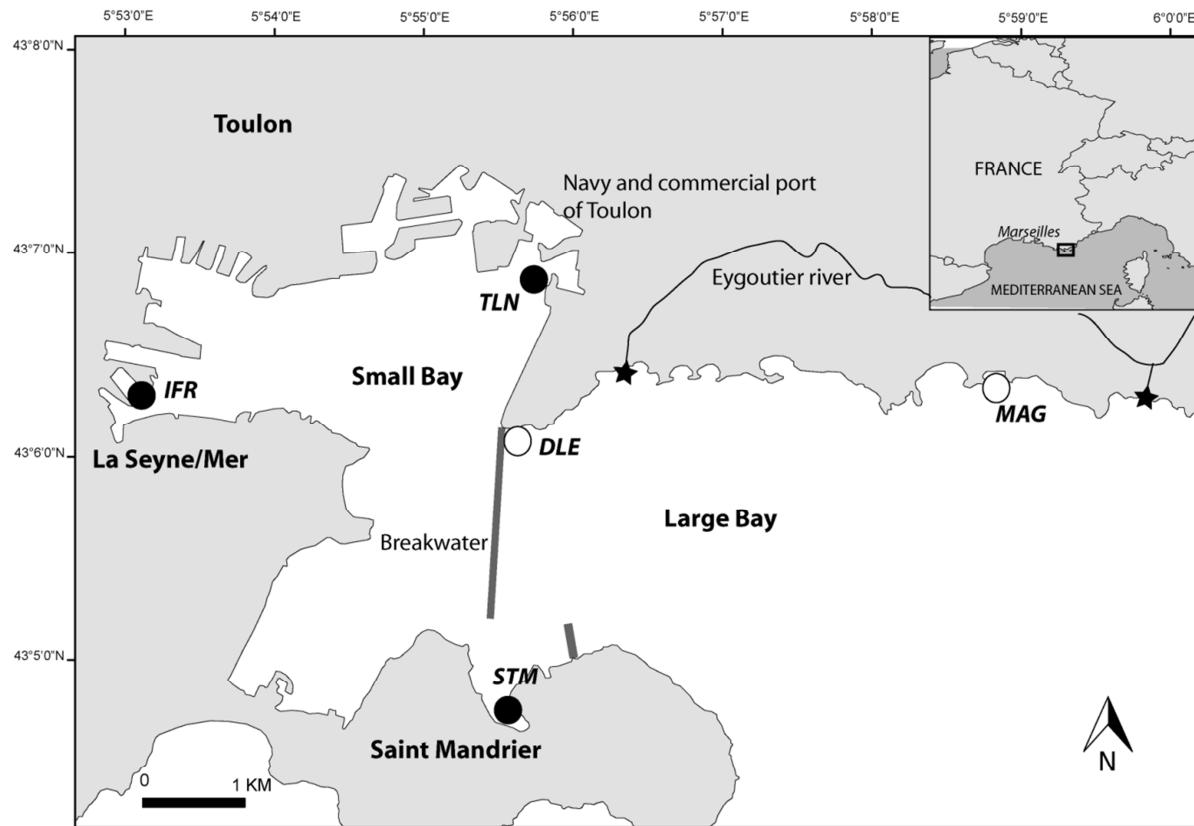
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577     Figure 1: Map of the Bay of Toulon (Northwestern Mediterranean) showing the location of the five  
578     sites sampled for this study. The sites located inside ports are represented by black circles while  
579     those located outside them are represented by white circles.

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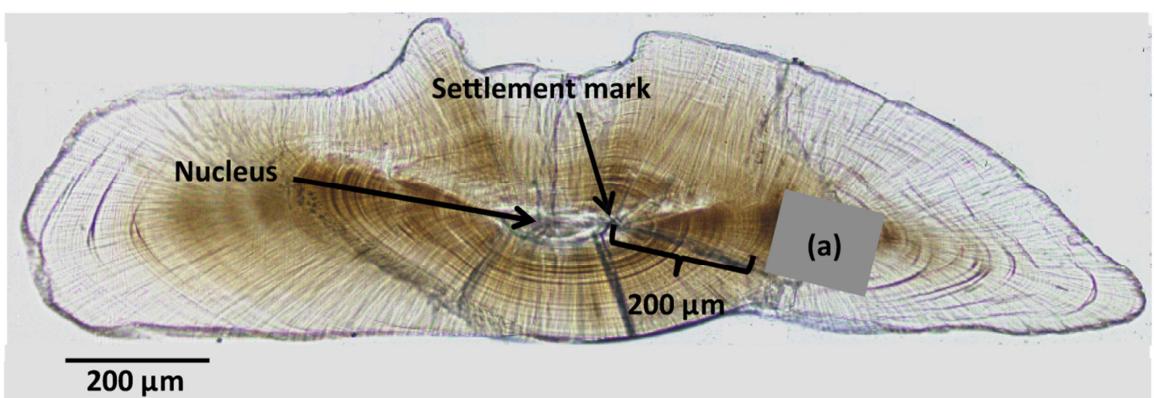
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591 Figure 2: Cross section though a sagittal otolith of juvenile *D. sargus*. The 150 x 150 $\mu\text{m}$  ablation area,  
 592 represented by the grey square (a), is positioned 200 $\mu\text{m}$  after the settlement mark.

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Figure 3: Mean otolith element:Ca ratios ( $\pm$  SE) measured for Ba, Mn, Sr, Cu, Pb, V, Mg, Sn and Zn in the juveniles of *D. sargus* and *D. vulgaris* from the two habitat types (In, inside ports , Out, outside ports) and the five sampling sites (M, MAG ; D, DLE ; S, STM ; T, TLN ; I, IFR). For each species, letters indicate significant differences ( $p < 0.05$ ) between habitat types or sampling sites (see M&M for details).

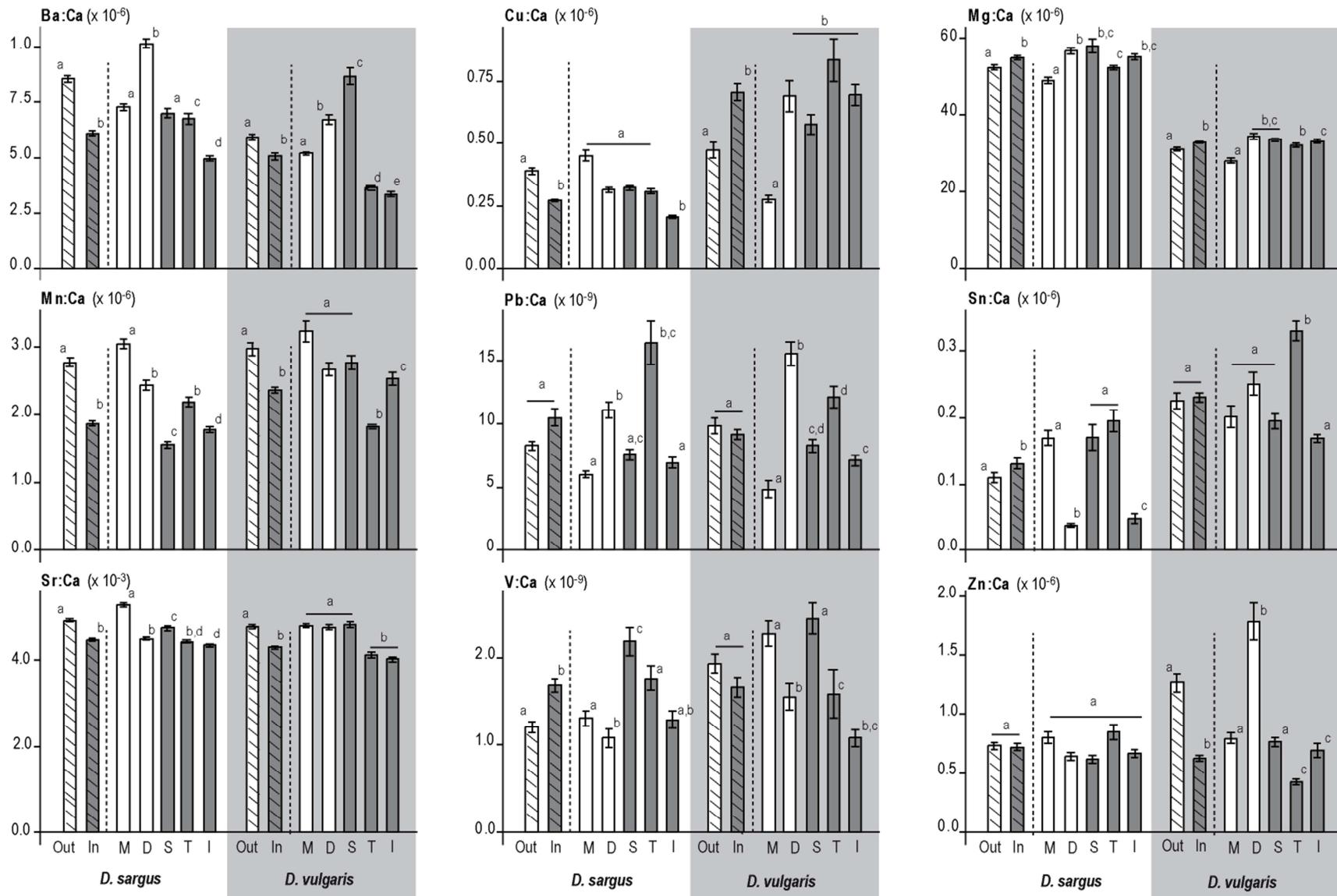


Figure 4: Effect of elemental combination size and composition on the discrimination accuracy obtained using the RF method: (a) between the two habitat types for *D. sargus*, (b) among the five sampling sites for *D. sargus*, (c) between the two habitat types for *D. vulgaris* and (d) among the five sampling sites for *D. vulgaris* (d). The grey area on the graph represents the range between the minimal and maximal accuracies reached for each combination size while the corresponding average accuracy ( $\pm SD$ ) is represented by the black square. The table gives the list of elements that achieved maximal discrimination with the corresponding mean decreases in the Gini index (see text for details).

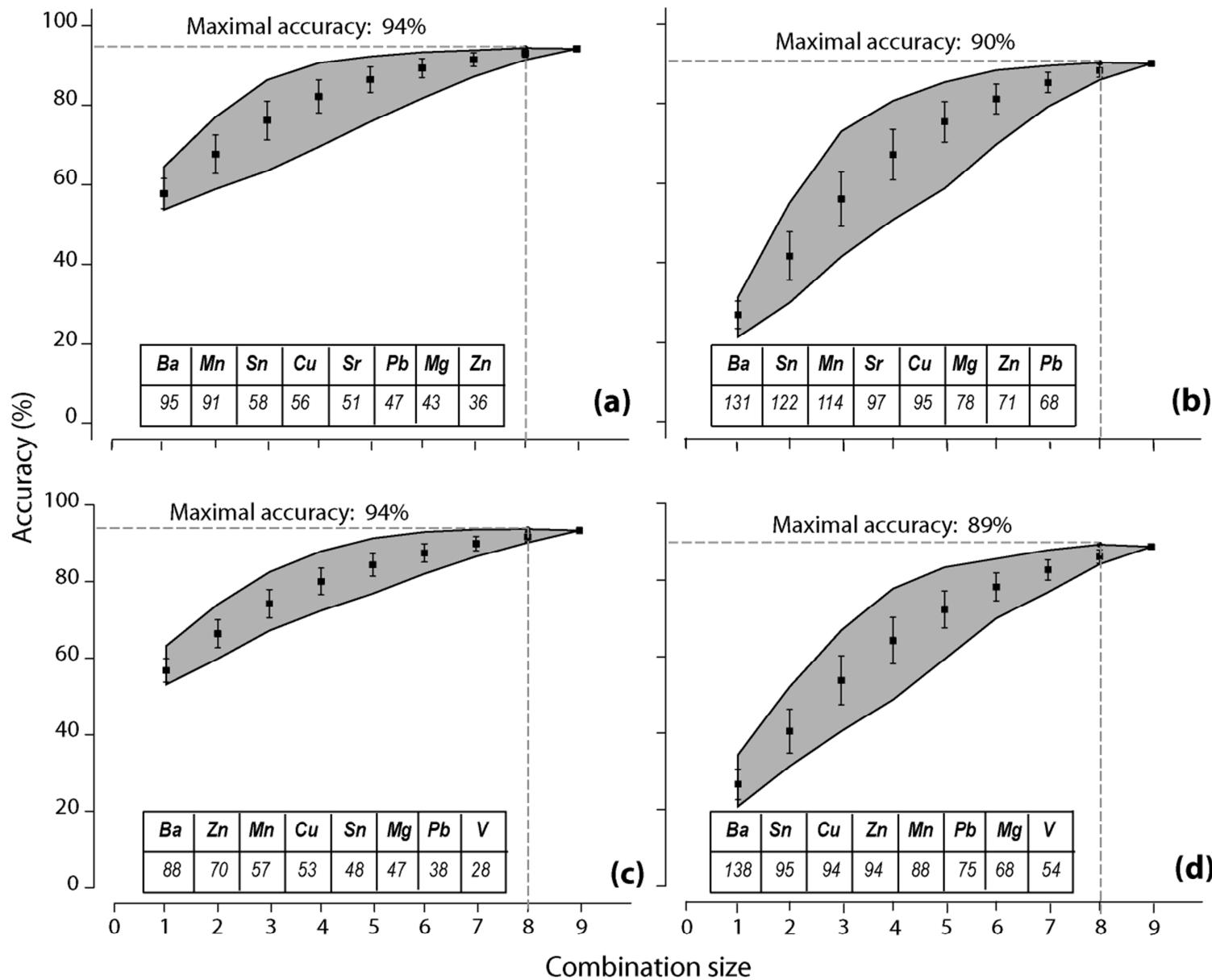


Table 1: Concentrations in trace elements in the water column for the five sampling sites measured with DGT. Letters indicate significant differences ( $p<0.05$ ) between sites if any

site	Temp. (°C)		Salinity (psu)		Cu (ng.l <sup>-1</sup> )		Mn (μg.l <sup>-1</sup> )		Pb (ng.l <sup>-1</sup> )		Zn (μg.l <sup>-1</sup> )	
	Mean ± sd	Min-Max	Mean ± sd	Min-Max	Mean ± sd	Min-Max	Mean ± sd	Min-Max	Mean ± sd	Min-Max	Mean ± sd	Min-Max
TLN	17.5 ± 4.3	12.8 – 24.8	37.1 ± 1.0	35.1 – 38.8	1268 ± 572 <sup>(a,b)</sup>	842 - 2203	0.83 ± 0.49 <sup>(a)</sup>	0.43 - 1.62	328 ± 107 <sup>(a)</sup>	206 - 540	3.05 ± 1.67 <sup>(a)</sup>	1.52 - 6.03
IFR	17.6 ± 4.8	12.0 – 25.7	37.2 ± 1.9	32.2 – 38.7	879 ± 261 <sup>(b)</sup>	589 - 1205	1.28 ± 0.59 <sup>(a)</sup>	0.76 - 2.22	203 ± 85 <sup>(a,b)</sup>	132 - 337	3.44 ± 1.42 <sup>(a)</sup>	1.72 - 5.36
STM	17.7 ± 4.9	12.0 – 25.4	37.8 ± 1.3	34.4 - 39.5	2972 ± 997 <sup>(a)</sup>	1593 - 4375	0.67 ± 0.20 <sup>(a)</sup>	0.48 - 0.90	222 ± 47 <sup>(a)</sup>	153 - 261	3.27 ± 0.78 <sup>(a)</sup>	2.32 - 4.30
DLE	17.1 ± 3.9	12.6 – 23.6	38.0 ± 0.8	35.8 – 39.0	257 ± 166 <sup>(c)</sup>	142 - 498	1.52 ± 1.18 <sup>(a)</sup>	0.57 - 3.12	86 ± 44 <sup>(b,c)</sup>	52 - 145	1.47 ± 1.26 <sup>(a)</sup>	0.50 - 3.17
MAG	17.4 ± 4.1	13.2 – 25.5	38.0 ± 0.5	37.2 – 39.1	87 ± 38 <sup>(c)</sup>	39 - 145	0.50 ± 0.16 <sup>(a)</sup>	0.40 - 0.78	47 ± 10 <sup>(c)</sup>	36 - 61	1.31 ± 0.96 <sup>(a)</sup>	0.26 - 2.79

Table 2: Classification accuracy and True Skill Statistics (TSS) per habitat type or per sampling site reached for *D. sargus* and *D. vulgaris* with RF using the optimal elemental combination.

	<b>Inside ports</b>	TLN	IFR	STM	<b>Outside ports</b>	DLE	MAG
<i>a) D. sargus</i>							
<b>Inside ports</b>	<b>95.3</b>				<b>6.7</b>		
TLN		88.1	2.6	4.4		0.6	0.8
IFR		6.7	88.7	6.3		1.1	0.9
STM		1.1	2.4	76.1		0.8	0.7
<b>Outside Ports</b>	<b>4.7</b>				<b>93.3</b>		
DLE		1.4	3.2	6.1		97.2	0.3
MAG		2.7	3	7.2		0.3	97.3
TSS	<b>0.89</b>	0.86	0.85	0.75	<b>0.89</b>	0.95	0.94
<i>b) D. vulgaris</i>							
<b>Inside ports</b>	<b>95.3</b>				<b>8.6</b>		
TLN		91.7	5.7	0.5		1.0	1.3
IFR		4.3	88.8	3.0		1.5	1.4
STM		0.4	1.7	85.9		4.6	1.4
<b>Outside ports</b>	<b>4.7</b>				<b>91.4</b>		
DLE		1.7	2.1	4.3		86.3	2.8
MAG		1.8	1.8	6.4		6.5	93.1
TSS	<b>0.87</b>	0.90	0.86	0.84	<b>0.87</b>	0.84	0.89