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Article

# Using Elemental Fingerprint Analysis (EFA) to Reveal the Elemental Composition Correlation Between Different Ecological Habit Fish and Their Habitats

Chengyao Yang <sup>1,2</sup>, Chao Song <sup>1,2,\*</sup>, Wenjie Yu <sup>1,2</sup>, Jilin Xie <sup>1,2</sup>, Hong Tao <sup>1,\*</sup>, Feipeng Li <sup>1</sup>, Feng Zhao <sup>2</sup> and Ping Zhuang <sup>2</sup>

<sup>1</sup> School of Environment and Architecture, University of Shanghai for Science and Technology, Shanghai 200093, China

<sup>2</sup> East China Sea Fisheries Research Institute, Chinese Academy of Fishery Sciences, Shanghai 200090, China

\* Correspondence: songc@ecsf.ac.cn (C.S.); taohong@usst.edu.cn (H.T.)

**Abstract:** Muscle element fingerprint is a comprehensive reflection of the accumulated transformation of elements from different sources in muscles, and has habitat indicator functions such as stability and representativeness. *Leiocassis longirostris* (*Ll*), *Coilia mystus* (*Cm*) and *Collichthys lucidus* (*Cl*) are important fishery species in the Yangtze River Estuary with different ecological habits. In this study, the element fingerprint of three fish species (*Ll*, *Cm*, *Cl*) and two environmental media of water (W) and sediment (S) were analyzed. According to the PERMANOVA, significant differences ( $p<0.05$ ) were observed in the elemental composition between sediment and the fish species. Through principal component analysis (PCA), it was found that the major elements ratios of Ti, V, Al, Fe, Ba, Ni, Mn, Co, Zn, and Cr to Ca in the sediment were significantly higher than those of the other groups ( $p<0.05$ ). Stepwise linear discriminant analysis (LDA) explored that the differential discriminant elements ratios between the water and the fish species were Mo/Ca, Ba/Ca, and K/Ca. LDA of the muscle elemental contents among different fish species showed that Mo, Mn, and Ba were the characteristic discriminant elements of *L. longirostris*, *C. mystus* and *C. lucidus*, respectively, which were closely related to their different ecological habitats. In summary, the elemental compositions in the muscle of the fish species differed significantly with that of the major elements in the sediments, and that with a few discriminant elements in the water, and there are differences in characteristic discriminative elements among fish with different ecological habits. Therefore, when tracing the origin of fish with habitat changes, the same fish species should be selected as the reference for tracing according to the stability of the characteristic elements enriched in each of the fish with different ecological habits. This study has important theoretical guidance and technical support in analyzing the source of elemental composition of fishes and in the traceability discrimination of fishes based on elemental fingerprints, and it has important application value in the selection of reference media for fish species traceability.

**Keywords:** *Leiocassis longirostris*; *Coilia mystus*; *Collichthys lucidus*; element fingerprint analysis (EFA); habitat correlation

**Key Contribution:** The present study demonstrated that the element fingerprint of fish muscle showed the greatest differences with sediments and specific discriminant elemental differences with water. Stable characteristic elements among different ecological types of fish can be used for discrimination and traceability of different fish species. This study has important theoretical guide and technical support for the analysis of the elemental composition of fishes and the traceability of fishes with different ecological habit and it has an important application value for the selection of reference media for the traceability of species with changes in habitat

## 1. Introduction

The Yangtze River Estuary is rich in fishery resources, in which different ecological types of fish are widely distributed [1]. *Leiocassis longirostris* is widely distributed in the Rivers of Liao, Huai, Yangtze, Min and Pearl in China, as well as in the western part of the Korean Peninsula. It mainly feeds on aquatic insects and their larvae, crustaceans, small mollusks and small fishes [1]. As one of the four most famous freshwater fishes in the Yangtze River, *L. longirostris* is very popular with its unique flavor and high nutritional value, and has become an important part of China's freshwater aquaculture industry, and by 2022, its annual production has reached 23,907 tons [2–4]. *Coilia mystus* is a semi-saline water fish, which is widely distributed in the western Pacific Ocean, including China, the Korean Peninsula, and Japan. It feeds on zooplanktons such as brachiopods, copepods, and telopods at the juvenile stage, and small fish, shrimps, and decapods at the adult stage. *C. mystus*, as a famous short-distance migratory fish, usually inhabits shallow sea area, and migrates to the Yangtze River Estuary to spawn during the breeding season [5,6]. *C. mystus* is an important fishery species in the Yangtze River Estuary, with its catch accounting for about 48.6% of the total fish and shrimp catch in the estuary before the fishing ban [7]. *Collichthys lucidus*, a small, near-bottom benthic fish, feeds on benthic organisms and small fish, shrimp, and opossum shrimp. Although the production of *C. lucidus* along the coast of China exceeded 200,000 tons in 2018, the biomass of *C. lucidus* has been rapidly decreasing in recent years with the increase in fishing intensity, and the species is currently overfished in the fisheries of the Yangtze and Minjiang estuaries [8]. Due to the different ecological habits of these the fish species, their habitat water layer, food organism composition and growth characteristics are different, and the results of enrichment and transformation of substances in various environmental media by fish with different ecological habits are also unique.

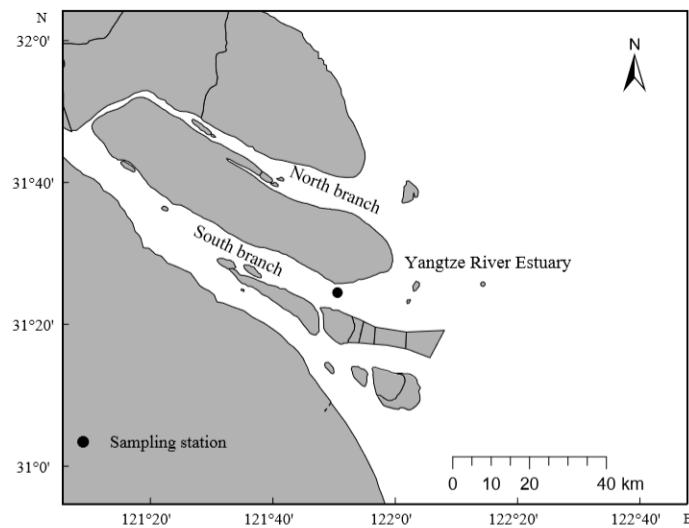
Elemental fingerprint analysis (EFA) is the use of differences in the elemental composition of organisms or species to distinguish different organisms or different sources of the same species. Compared to the methods of individual morphology [9–12], otolithic morphology [13–15], gene sequences [16], fatty acid composition [17,18], and isotope analysis [19,20], EFA used in origin certification showed unique characteristics of low cost, fast detection, stable detection indexes [21], and low sample consumption [22]. EFA has been widely used in biological species identification and geographical traceability [23–26]. In the above geographic traceability research, the traceability is mainly carried out through the elemental composition correlation between species and their environments, and this traceability method has been widely applied to plants, livestock, poultry and other species with relatively fixed sources [25,26]. Due to the species with relatively fixed growth environments, the elemental compositions of their organisms can directly reflect the elemental composition of the place where they originate from, and there is a large correlation of the elemental compositions of the organisms and their environments.

At present, with the requirement of tracing the origin of wild fish and other aquatic products in market supervision, it is necessary to trace the origin of aquatic products appearing in the market. For fish of different ecological types, their living environment and food organism composition have changed during their life history. Given the sustained accumulation of elemental composition within living organisms, fish with different ecological habits have varying degrees of accumulation of elements from their living environment. The elemental composition characteristics of muscles can to some extent reflect the elemental composition of their living environment [21]. However, due to the different distribution of fish species in their life processes, their ecological environment in the Yangtze River Estuary is also constantly changing, the elemental composition correlation between fish and their environment is unknown. Therefore, this study uses muscle element fingerprint analysis to reflect the element composition correlation between different ecological types of fish living in the same water area, and between different fish and their ecological environment, to analyze the reasons for the differences in elemental composition of fish, and identify the relationship between elemental composition of fish and different environmental media, in order to provide guidance for the selection of reference media in the origin tracing research of organisms with variable habitats such as fish.

## 2. Materials and Methods

### 2.1. Sampling Sites, Sample Collection and Processing

In April 2024, samples of three fish species of *L. longirostris* (Ll), *C. mystus* (Cm) and *C. lucidus* (Cl), with different ecological habits, were collected in the waters of the Yangtze River Estuary (Figure 1), with the water (W) and sediment (S) from the corresponding area were collected as a control of environmental media. Fish samples were sampled using gillnets with different mesh sizes (from 3 cm to 21 cm) and the samples were collected after placing for 12 h. After collection, samples were placed in plastic bags and labeled with the coordinates of the sampling sites of E121.823, N31.427. Water and sediment samples were collected using water and sediment collectors, respectively, and water samples were placed in 500 mL plastic sampling bottles and sediments were placed in 50mL centrifuge tube. All samples were frozen at -20°C, and brought back to the laboratory for further processing.



**Figure 1.** Sampling station.

In the laboratory, all fish samples were thawed and measured for basic biological characteristics. The fish samples were measured in centimeters for total length, body length and weighed in grams ( $\pm 0.01$  g) for body weight. The total length, body length and weight of *L. longirostris*, *C. mystus* and *C. lucidus* are  $36.74 \pm 8.62$  cm,  $31.76 \pm 7.59$  cm,  $402.22 \pm 245.67$  g;  $17.26 \pm 2.51$  cm,  $15.53 \pm 2.25$  cm,  $16.09 \pm 9.58$  g;  $18.77 \pm 1.49$  cm,  $15.07 \pm 1.24$  cm,  $57.28 \pm 14.35$  g, respectively. To eliminate interference of handling utensils to experimental samples, ceramic-coated scalpels, plastic scissors, and plastic forceps were used for dissection, and the dissection tools and sample-handling utensils were rinsed six times with Milli-Q water (Millipore Corp., Burlington, MA, USA) prior to sample processing. All fish samples were taken from the dorsal muscles for analysis [22].

After drying, each fish sample was taken ( $0.5 \pm 0.005$  g) and placed in a digestion tube, 10 mL of purified  $\text{HNO}_3$  (MOS Reagent, Sinopharm Chemical Reagent Co., Ltd., Shanghai, China) was added and left to stand for 3 h, followed by the addition of 2 mL of purified  $\text{HClO}_4$  to each tube. Finally, all samples were digested using an electric hot plate at 150 °C, and the fully digested samples were quantitatively transferred to a calibration bottle containing Milli-Q water in a 100 mL calibration bottle [27].

The water samples were pumped through a filtration device to remove their suspended particulate matter before digestion. First, 50 mL of water sample was measured in a calibration flask, 5 mL of purified  $\text{HNO}_3$  was added and digestion was carried out using an electric hot plate maintained at  $95 \pm 5$  °C. On the way, purified  $\text{HNO}_3$  was continued to be added until no brown fumes were produced and evaporation was done to 5 mL. After the above solution cooled down, 3 mL of 30% hydrogen peroxide solution was slowly added and digestion was carried out using an electric hot plate maintained at  $95 \pm 5$  °C, and 30% hydrogen peroxide solution was added until no more

bubbles were produced and evaporated to 5mL, the conical flask was rinsed 3 times with Milli-Q water and fixed in a 50mL calibration bottle [28,29].

The dried and sieved sediment ( $0.5\pm0.005$  g) was weighed and placed in a digestion tube, moistened with a small amount of Milli-Q water, and 2 mL of purified  $\text{HNO}_3$  and 6 mL of concentrated hydrochloric acid were added sequentially to mix the sample and the digestion solution well. Finally, all samples were digested using an electric hot plate at 150 °C, and the solution in the digestion tube was transferred to a 100 mL calibration bottle containing Milli-Q water [28].

## 2.2. Elemental Analysis

The concentration of potassium (K), sodium (Na) and calcium (Ca) in the pre-digested samples were determined by ICP-OES (Agilent, 720ES). ICP-MS (Agilent, 7700) was used to determine the concentration of mercury (Hg), lead (Pb), chromium (Cr), cadmium (Cd), copper (Cu), zinc (Zn), nickel (Ni), arsenic (As), magnesium (Mg), iron (Fe), aluminum (Al), manganese (Mn), molybdenum (Mo), istrontium (Sr), barium (Ba), titanium (Ti), vanadium (V), and cobalt (Co) [22,30–32]. The calibration standard solutions consist of different certified reference materials, including mixed element material of Cd, Pb, Cr, Cu, Zn, Ni, As, Mg, Fe, Al, Mn, Sr, Ba, Ti and V (GSB 04-1767-2004), and the single element materials of Hg (GSB 04-1729-2004), Na (GSB 04-1738-2004), K (GSB 04-1733-2004), Ca (GSB 04-1720-2004) and Mo (GSB 04-1737-2004) from the National Nonferrous Metals and Electronic Materials Analysis and Testing Center, National Standard (Beijing) Inspection and Certification Co., Ltd., China [22]. All these analyses were repeated three times.

## 2.3. Data Analysis

In order to compare the elemental composition between biological samples and environmental media, the raw data on the content of the 20 elements were divided by the content of Ca to obtain the data on the ratios of the 20 elements to Ca, which were expressed on this basis. The elemental ratios of the different groups of samples were analyzed by one-way analysis of variance (ANOVA) to test the differences between the groups at a significance level of  $\alpha = 0.05$ . PERMANOVA analysis was then used to compare the correspondence between the three fish groups and the two environmental media. Then, using multivariate analysis, a total of five groups were analyzed sequentially by hierarchical cluster analysis (HCA), principal component analysis (PCA), and stepwise linear discriminant analysis (LDA), to progressively determine the differences in the components between different groups and to screen for the characteristic elements that caused the differences. Statistical analysis was performed using the software IBM SPSS Statistics 25.0.

## 3. Results

### 3.1. Elemental Composition of Fish and Environmental Media

A one-way analysis of variance (ANOVA) was performed on 20 elemental ratios in five groups of samples, including three fish species, *L. longirostris*, *C. mystus* and *C. lucidus*, as well as two environmental media, water and sediment, to compare the differences in the elemental compositions of these five groups (Table 1). It was found that, except for Na/Ca, Mg/Ca, and Sr/Ca, the remaining 17 elemental ratios were significantly different among these five groups ( $p<0.05$ ). There were significant differences for the ratios of Co/Ca, V/Ca, Ni/Ca, Ti/Ca, Ba/Ca, Cr/Ca, Mn/Ca, Al/Ca, Fe/Ca and Zn/Ca between sediment and any of the three fish groups ( $p<0.05$ ). Significant differences were found for the ratios of Mo/Ca, Cd/Ca, Hg/Ca, Cu/Ca, As/Ca, and K/Ca between water and *L. longirostris*, that of Ba/Ca and As/Ca between water and *C. mystus*, and that of Pb/Ca and K/Ca between water and *C. lucidus* ( $p<0.05$ ). Among these three fish groups, Mo/Ca, Cd/Ca, Hg/Ca, Cu/Ca and K/Ca were significantly higher in *L. longirostris* than in the other two species, K/Ca was significantly lower in *C. mystus* than in the other two species, and As/Ca was significantly lower in *C. lucidus* than in the other two fish species ( $p<0.05$ ). It can be seen that the elemental composition of sediment showed the greatest difference with the three fish groups, and the elemental composition

of water showed a smaller difference with the three fish groups, and there was also some difference among the three fish groups.

**Table 1.** The 20 element ratios of *L. longirostris* (Ll), *C. mystus* (Cm), *C. lucidus* (Cl), water (W) and sediment (S) from the Yangtze River Estuary (mean $\pm$ SD).

Index	Ll	Cm	Cl	W	S	p
Co/C <sub>a</sub>	39.87 $\pm$ 17.77 <sup>a</sup>	19.20 $\pm$ 17.88 <sup>a</sup>	15.42 $\pm$ 5.04 <sup>a</sup>	2.58 $\pm$ 0.27 <sup>a</sup>	450.56 $\pm$ 55.74 <sup>b</sup>	0.000
Mo/C <sub>a</sub>	154.72 $\pm$ 26.25 <sup>a</sup>	15.32 $\pm$ 3.37 <sup>b</sup>	21.42 $\pm$ 4.09 <sup>b</sup>	36.08 $\pm$ 13.07 <sup>b</sup>	20.26 $\pm$ 11.09 <sup>b</sup>	0.000
Cd/C <sub>a</sub>	82.69 $\pm$ 62.16 <sup>a</sup>	13.51 $\pm$ 2.06 <sup>b</sup>	30.63 $\pm$ 18.88 <sup>b</sup>	0.40 $\pm$ 0.34 <sup>b</sup>	8.71 $\pm$ 3.31 <sup>b</sup>	0.014
V/Ca	102.78 $\pm$ 43.51 <sup>a</sup>	28.19 $\pm$ 16.87 <sup>a</sup>	32.51 $\pm$ 11.31 <sup>a</sup>	53.35 $\pm$ 4.81 <sup>a</sup>	2919.24 $\pm$ 469.70 <sup>b</sup>	0.000
Hg/C <sub>a</sub>	427.73 $\pm$ 126.48 <sup>a</sup>	36.69 $\pm$ 9.28 <sup>b</sup>	85.38 $\pm$ 60.37 <sup>b</sup>	2.38 $\pm$ 0.53 <sup>b</sup>	4.56 $\pm$ 1.88 <sup>b</sup>	0.000
Ni/Ca	91.85 $\pm$ 65.88 <sup>a</sup>	62.52 $\pm$ 45.59 <sup>a</sup>	81.31 $\pm$ 34.02 <sup>a</sup>	15.24 $\pm$ 5.08 <sup>a</sup>	1062.14 $\pm$ 172.80 <sup>b</sup>	0.000
Ti/Ca	258.89 $\pm$ 73.39 <sup>a</sup>	68.93 $\pm$ 32.77 <sup>a</sup>	182.06 $\pm$ 111.84 <sup>a</sup>	12.16 $\pm$ 3.44 <sup>a</sup>	98680.53 $\pm$ 13444.56 <sup>b</sup>	0.000
Ba/Ca	595.17 $\pm$ 345.59 <sup>ab</sup>	173.90 $\pm$ 42.51 <sup>a</sup>	815.70 $\pm$ 109.12 <sup>ab</sup>	1142.99 $\pm$ 133.72 <sup>b</sup>	16224.68 $\pm$ 679.57 <sup>c</sup>	0.000
Cr/Ca	1139.59 $\pm$ 444.29 <sup>a</sup>	259.24 $\pm$ 86.63 <sup>a</sup>	519.21 $\pm$ 93.59 <sup>a</sup>	67.62 $\pm$ 35.26 <sup>a</sup>	2574.02 $\pm$ 1020.62 <sup>b</sup>	0.000
Pb/Ca	397.72 $\pm$ 146.71 <sup>ab</sup>	203.10 $\pm$ 79.26 <sup>a</sup>	837.16 $\pm$ 643.09 <sup>b</sup>	3.26 $\pm$ 1.32 <sup>a</sup>	841.98 $\pm$ 119.68 <sup>b</sup>	0.005
Cu/C <sub>a</sub>	2199.02 $\pm$ 1382.98 <sup>a</sup>	340.53 $\pm$ 44.45 <sup>b</sup>	638.50 $\pm$ 218.53 <sup>b</sup>	41.73 $\pm$ 10.55 <sup>b</sup>	607.43 $\pm$ 315.00 <sup>b</sup>	0.006
Mn/C <sub>a</sub>	1364.04 $\pm$ 533.93 <sup>a</sup>	595.63 $\pm$ 137.72 <sup>a</sup>	574.15 $\pm$ 140.28 <sup>a</sup>	12.84 $\pm$ 2.58 <sup>a</sup>	24745.02 $\pm$ 6239.79 <sup>b</sup>	0.000
Al/Ca	3501.45 $\pm$ 1007.42 <sup>a</sup>	1753.43 $\pm$ 931.91 <sup>a</sup>	3685.53 $\pm$ 3102.81 <sup>a</sup>	27.49 $\pm$ 26.67 <sup>a</sup>	1909440.87 $\pm$ 13747 <sup>0.41 b</sup>	0.000
As/Ca	5.47 $\pm$ 2.16 <sup>a</sup>	3.83 $\pm$ 1.83 <sup>a</sup>	1.06 $\pm$ 0.32 <sup>b</sup>	0.04 $\pm$ 0.01 <sup>b</sup>	0.37 $\pm$ 0.06 <sup>b</sup>	0.000
Sr/Ca	2.54 $\pm$ 0.37 <sup>a</sup>	3.61 $\pm$ 1.18 <sup>a</sup>	3.59 $\pm$ 0.29 <sup>a</sup>	9.32 $\pm$ 5.83 <sup>a</sup>	6.75 $\pm$ 0.55 <sup>a</sup>	0.053
Fe/Ca	45.62 $\pm$ 31.47 <sup>a</sup>	7.65 $\pm$ 2.92 <sup>a</sup>	16.75 $\pm$ 10.29 <sup>a</sup>	0.14 $\pm$ 0.14 <sup>a</sup>	989.69 $\pm$ 125.44 <sup>b</sup>	0.000
Zn/C <sub>a</sub>	36.67 $\pm$ 13.27 <sup>a</sup>	8.37 $\pm$ 2.51 <sup>a</sup>	10.36 $\pm$ 2.86 <sup>a</sup>	0.04 $\pm$ 0.03 <sup>a</sup>	137.09 $\pm$ 34.86 <sup>b</sup>	0.000
K/Ca	23.07 $\pm$ 5.98 <sup>a</sup>	3.18 $\pm$ 1.16 <sup>b</sup>	9.41 $\pm$ 2.39 <sup>c</sup>	0.36 $\pm$ 0.40 <sup>b</sup>	0.52 $\pm$ 0.01 <sup>b</sup>	0.000
Na/C <sub>a</sub>	3.84 $\pm$ 1.98 <sup>a</sup>	0.54 $\pm$ 0.23 <sup>a</sup>	1.30 $\pm$ 0.40 <sup>a</sup>	4.32 $\pm$ 7.67 <sup>a</sup>	0.41 $\pm$ 0.05 <sup>a</sup>	0.546
Mg/C <sub>a</sub>	1.55 $\pm$ 0.39 <sup>a</sup>	0.26 $\pm$ 0.09 <sup>b</sup>	0.65 $\pm$ 0.15 <sup>ab</sup>	0.69 $\pm$ 0.90 <sup>ab</sup>	0.46 $\pm$ 0.03 <sup>ab</sup>	0.052

Note: The unit for K, Na, and Mg to Ca is mg/mg, the unit for As, Sr, Fe, and Zn to Ca is  $\mu$ g/mg, and the unit for the remaining elements to Ca is ng/mg. In the same line, different letters (a, b, c) after standard deviation denote significant differences between groups ( $p<0.05$ ).

### 3.2. Association Analysis Between Fish and Environmental Media

In order to further explore the difference between the three fish groups (*L. longirostris*, *C. mystus* and *C. lucidus*) and the two environmental media (water and sediment), their elemental compositions were subjected to PERMANOVA analysis, which showed that there was a significant difference between sediment and the three fish groups ( $p<0.05$ ), whereas the difference between the water and the three fish groups was not significant ( $p>0.05$ ) (Table 2).

**Table 2.** PERMANOVA comparison for elemental fingerprints between three fish groups and two environmental media.

Groups	t	p
<i>L. longirostris</i> vs sediment	5.110	0.042
<i>C. mystus</i> vs sediment	4.216	0.035
<i>C. lucidus</i> vs sediment	3.933	0.023
<i>L. longirostris</i> vs water	3.061	0.058
<i>C. mystus</i> vs water	2.333	0.156
<i>C. lucidus</i> vs water	2.831	0.063

The first two axes of the PCO analysis explained 86.2% of elemental fingerprints variation in the data set (PCO axis 1: 52.9%, PCO axis 2: 33.3%) (Figure S1). The results show that sediment and water groups can be clearly distinguished from fish, Al/Ca has the longest radius and is biased towards the sediment group, Ba/Ca has a longer radius and its pointing is distributed between sediment and water groups and is biased towards the water group, and Cr/Ca has a longer radius and its pointing is distributed between sediment and fish groups and is biased towards fish groups, which can be tentatively concluded that Al/Ca, Ba/Ca and Cr/Ca are the characteristic elements of sediment, water and fish, respectively. It is due to the fact that Al/Ca has the largest ratio in sediment, which is significantly higher than the other groups; Ba/Ca was higher in sediment and water, and that is higher in water than in fish groups; and Cr/Ca is higher in sediment and fish, and that is higher in the fish groups than in water (Table 1). In order to present a more intuitive relationship among these five groups, HCA was used, and the results showed that the sediment was divided into one group alone, while the water and fish were clustered into another group, in which the distribution of the water samples was relatively centralized, and there was a cross-over in the distribution among the different fish individuals (Figure S2). Combining the PCO and clustering diagrams (Figure S1, Figure S2), it can be seen that the overall elemental composition and specific elemental ratios of the sediment group differed significantly from those of the other groups, while the overall elemental composition of the water group was similar to that of the fish groups, but there was a difference in specific elemental ratios therein from that of the fish group, whereas there was a smaller difference in the overall elemental composition among these three fish groups.

### 3.3. Major Element Composition in Fish and Environmental Media

In order to quantitatively screen the major elemental compositions that caused the differences among these five groups. PCA was used to analyze the 20 element ratios and three principal components (1 to 3) were obtained with a cumulative contribution of 91.212%, of which 53.387% was contributed by PC1 and 26.653% and 11.172% by PC 2 and PC3, respectively (Table 3).

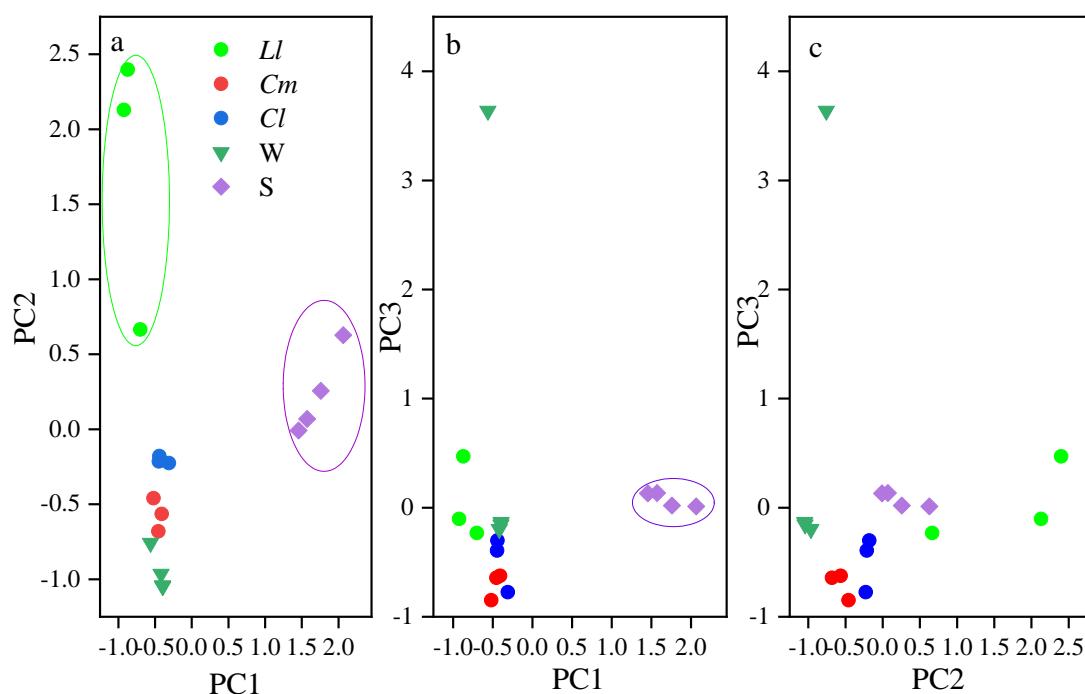
**Table 3.** Principal component matrix and contribution of 20 element rates in the muscles of three fish species and two environmental media.

Variable	Principal Component		
	1	2	3
Co/Ca	0.967	0.208	0.030
Mo/Ca	-0.421	0.826	0.115
Cd/Ca	-0.352	0.810	-0.099
V/Ca	0.981	0.172	0.046
Hg/Ca	-0.454	0.863	-0.010
Ni/Ca	0.972	0.209	0.016
Ti/Ca	0.985	0.151	0.038
Ba/Ca	0.974	0.121	0.059
Cr/Ca	0.803	0.499	0.016
Pb/Ca	0.532	0.324	-0.226

Cu/Ca	-0.180	0.911	-0.002
Mn/Ca	0.968	0.199	0.026
Al/Ca	0.980	0.139	0.040
As/Ca	-0.483	0.639	-0.237
Sr/Ca	0.210	-0.376	0.887
Fe/Ca	0.978	0.188	0.038
Zn/Ca	0.915	0.378	0.018
K/Ca	-0.506	0.839	-0.073
Na/Ca	-0.310	0.138	0.924
Mg/Ca	-0.359	0.633	0.668
Characteristic Value	10.677	5.331	2.234
Contribution Rate/%	53.387	26.653	11.172
Cumulative Contribution/%	53.387	80.040	91.212

As shown in Table 3, the most contributing element ratios in PC1 were Ti/Ca, V/Ca, Al/Ca, Fe/Ca, Ba/Ca, Ni/Ca, Mn/Ca, Co/Ca, Zn/Ca, and Cr/Ca; the most contributing element ratios in PC2 were Cu/Ca, Hg/Ca, K/Ca, Mo/Ca, and Cd/Ca; the most contributing element ratios in PC3 were Na/Ca and Sr/Ca. Combined with the results of ANOVA (Table 1), it can be seen that the 10 major contributing element ratios in PC1 were all significantly higher in the sediment than in the other groups, the ratios of the five major contributing element ratios in PC2 were significantly higher in the *L. longirostris* than in the sediment, and the two major contributing element ratios in PC3 were not significantly different among these five groups.

In the scatter diagram composed of PC1 and PC2 (Figure 2a), because the major element ratios in PC1 can distinguish the sediment from the other groups, and the major element ratios in PC2 can distinguish the *L. longirostris* from the sediment, the distance between the sediment and the *L. longirostris* is furthest in the scatter diagram composed of PC1 and PC2, and a clear distinction can be made between these two groups and the other three groups. In the scatter diagram composed of PC1 and PC3 (Figure 2b), the main elements in PC3 show no difference among the different groups, the scatter plot of PC1 and PC3 clearly shows that the sediment group is situated far from the other groups, allowing for a clear distinction. In the scatter diagram composed of PC2 and PC3 (Figure 2c), which shows that the distance between different groups is close, it is impossible to distinguish different groups effectively. Through PCA, the characteristic elements between different fish groups and different environmental media groups were analyzed, and it was found that only the characteristic elements in the sediment group could be clearly distinguished from the other groups, while the distinction between the water group and the fish groups was not obvious, which indicated that the composition of the major elements between the water group and the fish groups was similar.



**Figure 2.** Scatter diagram of PC1 and PC2 (a), and PC1 and PC3 (b), and PC2 and PC3 (c) of 20 element ratios in the muscles of three fish groups and two environmental media.

### 3.4. Discrimination Between Fish Groups and Water Group

In order to better screen the differential elemental compositions between water and three fish groups, 20 elemental ratios of these four groups were analyzed by LDA, and three differential elemental ratios, Mo/Ca, Ba/C and K/Ca, were screened out (Table 4). Combined with the results of ANOVA (Table 1) for the three screened element ratios among these four groups, it was found that the Mo/Ca differed significantly between the water and *L. longirostris*, the Ba/Ca differed significantly between the water and *C. mystus*, and the K/Ca differed significantly between the water and the two fish groups of *L. longirostris* and *C. lucidus*, which showed that the three differential discriminant elements were specific differential elements between the water group and the different fish groups, respectively.

**Table 4.** Classification function coefficient of 20 element ratios in the water and three fish groups.

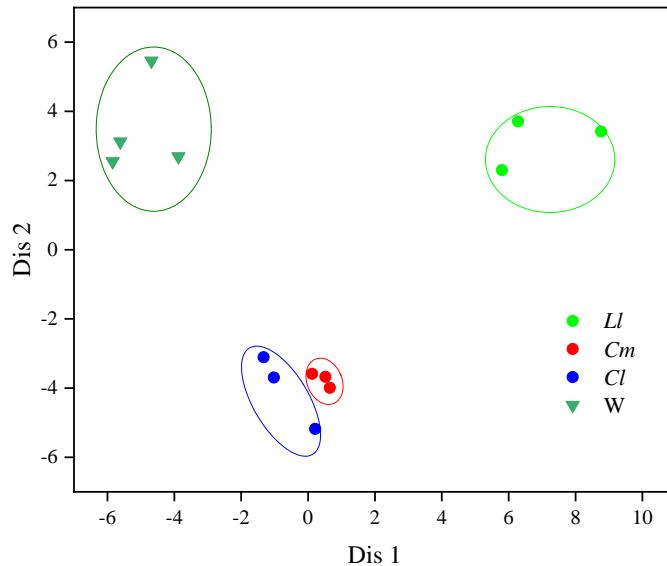
Discriminative Elements	<i>Ll</i>	<i>Cm</i>	<i>Cl</i>	<i>W</i>
Mo/Ca	0.871	0.056	-0.104	0.716
Ba/Ca	0.001	0.003	0.019	0.061
K/Ca	-0.951	-0.004	0.661	-4.981
Constant	-58.110	-2.096	-11.265	-48.633

In order to verify the effect of the screened three discriminative element ratios on the traceability discrimination between the water and the three fish groups, through LDA, the results showed that the overall discrimination success rate between the water and the three fish groups was 100.00%, and the results of the interactive validation were consistent with the results of the stepwise discrimination (Table 5).

**Table 5.** Results of the discriminant verification analysis for water and the three fish groups using the three discriminant element ratios.

Method	Groups	Prediction Category				Discriminant Accuracy	Comprehensive Discrimination rate (%)
		Ll	Cm	Cl	W		
Stepwise Discrimination	<i>Ll</i>	0	3	0	0	100.0	100.0
	<i>Cm</i>	0	0	3	0	100.0	
	<i>Cl</i>	3	0	0	0	100.0	
	<i>W</i>	0	0	0	4	100.0	
Cross Verification	<i>Ll</i>	0	3	0	0	100.0	100.0
	<i>Cm</i>	0	0	3	0	100.0	
	<i>Cl</i>	3	0	0	0	100.0	
	<i>W</i>	0	0	0	4	100.0	

Fitting the scatter plot (Figure 3) of the discrimination results of the three discriminatory element ratios of the water and three fish groups, the results showed that the water group can be clearly distinguished from the fish groups. It showed that although the overall element composition of environmental medium of water is similar to that of fish, there are still a few specific difference elements between these two groups, which can completely distinguish water group from fish groups, indicating that different elements in the environment have different enrichment effects in water and fish, so it is not appropriate to choose water samples as a reference when tracing the origin of fish. In addition, it can be seen that although the water group can be distinguished from fish groups by using the screened specific discriminant element ratios, the distinction between *C. mystus* and *C. lucidus* is not obvious, and the distance between them is relatively close (Figure 3), which may be related to the fact that these two species have similar ecological habits and sizes [1].



**Figure 3.** Scatter plot of scores based on the first two canonical discriminant functions for water and three fish groups.

### 3.5. Traceability Discrimination among Three Different Fish Species

The differences in elemental composition among different fish are related to their ecological habits and the enrichment and transformation of different elements in the fish. In order to further

explore the reasons for the differences in elemental composition among different fish species, the elemental contents of these three fish species were utilized to more directly respond to the results of the accumulation of different elements in the fish. Through LDA of the elemental contents in the muscles of these three fish species (Table S1), five discriminant elements of Mo, Ba, Mn, Sr and Mg, were screened out (Table 6). According to the discriminant element coefficients (Table 6), combined with the ANOVA results of the elements among the three fish groups (Table S1), it can be seen that the main elements that caused the differences among the three fish groups were Mo, Ba, and Mn (Table 6), among which the content of Mo in *L. longirostris* was significantly higher than that in the other two groups, Ba in *C. lucidus* was significantly higher than that of the other groups, and Mn in *C. mystus* was significantly higher than that of the other groups, so it can be seen that Mo, Ba and Mn were the characteristic discriminatory elements in *L. longirostris*, *C. lucidus* and *C. mystus*, respectively.

**Table 6.** Classification function coefficient of 20 element contents in the muscle of three fish species.

Discriminative Elements	<i>Ll</i>	<i>Cm</i>	<i>Cl</i>
Mo	-19792.114	-32523.073	-28981.547
Ba	-1110.222	-1754.700	-1511.046
Mn	687.021	1084.610	931.647
Sr	57.663	92.876	83.095
Mg	5.240	8.344	7.370
Constant	-1973.485	-4875.909	-3803.379

In order to verify the effect of the three characteristic discriminative elements on the traceability discrimination of different fish groups, through LDA, the results showed that the overall discrimination success rate among the three fish groups was 100.00%, and the results of the cross-validation were consistent with the results of the stepwise discrimination (Table S2). The results of the discriminant analysis of the three fish groups were plotted to obtain the discriminant scatter plot (Figure S3), which showed that the three fish species could be effectively distinguished by using the three screened characteristic discriminant elements. It shows that although the overall element composition of the three fish species is similar, a few selected characteristic discriminant elements can still be used to identify and trace different fish species. It can be seen that discriminant analysis can be used to identify fish species by screening characteristic difference discriminant elements from the muscle of fish with different ecological habits, and even can effectively distinguish small fish with similar ecological types and sizes such as *C. mystus* and *C. lucidus*. Therefore, it is feasible and effective to distinguish and trace the origin of fish according to the characteristic elements accumulated by different fish themselves (Table S2, Figure S3).

#### 4. Discussion

Elemental fingerprint refers to the use of the flame of a specific color emitted by inorganic elements during combustion. When analyzing the sample to be tested, because of the different contents of inorganic elements, the results similar to fingerprints with their own unique characteristics can be presented by the instrument [33,34]. Due to the stability and traceability of EFA, it has been widely used in the source tracking of samples, identification of biological species and their association with environmental media. In previous studies, the narrow-geographic origins of Keemun black tea were successfully distinguished from three places using comprehensive elemental fingerprinting and chemometrics [35], and the geographical origin of meat and animal rearing system were assigned using isotopic and elemental fingerprints [36]. As for shellfish products traceability, a common method is to collect their shells for geographic traceability, because their shells are metabolically inert, retain a record of chemical elements adulterated during growth and are not degraded after harvesting [37]. For example, the new evidence of fraudulent mislabeling and illegal harvesting of *Ruditapes philippinarum* were found through elemental fingerprints of their shells and chemometric analyses, according to the high content of Mn and P elements in traceable groundwater

[38]. In conclusion, EFA has been widely used to trace the origin of species, but in the past, it was mainly used to trace the origin of species with relatively stable origin, and the elemental fingerprints of species could be directly compared with those in their environmental media, but there were few studies on the origin of organisms with variable distribution.

The fish samples in this study were collected from the same waters of the Yangtze River Estuary, but their ecological habits were different, among which *L. longirostris* is a freshwater fish, mainly distributed in the main stream of the Yangtze River and its tributaries, and is found in both freshwater and brackish water of the Yangtze River Estuary; *C. mystus* is an estuarine close-migratory fish living in shallow coastal waters or offshore; and *C. lucidus* is a benthic small-sized fish living offshore [1]. In this study, PERMANOVA and HCA of the three fish species and two environmental media initially revealed that the greatest differences in elemental composition between sediment and fish samples were found. PCA further revealed that the major elemental compositions of the sediments were all significantly different from the other groups, while the major elemental compositions of the water were similar to those of the fish samples. This is due to the fact that the location of the sediments is relatively fixed, and their element accumulation has certain regional limitations, while the distribution areas of the water and fish are variable, and their element enrichment has regional differences. Through LDA, it can be seen that although the main elements of the water and fish are similar, they can be completely distinguished through the discrimination, which indicates that the water and fish have different accumulating effects on different elements, and each has different characteristic discriminatory elements. The above analysis showed that the elemental fingerprint of fishes differed most from those of sediments, and there were specific elemental differences between water, and there was no direct correspondence between the elemental fingerprint of fishes and those of environmental media such as sediments and water. Therefore, when tracing the origin of swimming fish, the sediment and water in the corresponding waters should not be selected as reference media for geographical tracing.

For fish with different ecological habits, *L. longirostris* lives in the bottom layer of rivers, is a carnivorous fish, and mainly feeds on crustaceans in the Yangtze River Estuary [1], and the characteristic discriminating element in its muscle is Mo. This is due to the fact that the main source of input of Mo from estuaries and seawater is the river, and *L. longirostris* is mainly distributed in the estuarine biased freshwater areas [39,40]. Another reason is due to the high content of suspended particulate matter in the Yangtze River Estuary, which absorbs heavy metal elements such as Mo and deposits them to the estuarine substrate, thus affecting the accumulation of Mo in the benthic fish of *L. longirostris* [39–41]. *C. mystus* mostly lives in shallow coastal waters or offshore and the characteristic discriminant element in its muscle is Mn, as Mn ions dissolve in the surface layer of the Yangtze River Estuary and are more likely to be accumulated by *C. mystus*, which is distributed in the middle and upper layers of the water [42,43]. *C. lucidus* is an offshore benthic small fish that feeds mainly on benthic organisms and the characteristic discriminant element in its muscle is Ba, as Ba ions combine with sulfate ions in the offshore and are deposited to the bottom of the river, and thus are more likely to be accumulated by the benthic fishes of *C. lucidus* [44,45]. The above analysis shows that due to the specificity of the ecological habits of different fish, the accumulation of different elements by muscles has their own characteristics and stability, and different fish can be effectively differentiated through discriminant analysis and effectively traced back to the same fish species (Table S2, Figure S2), so the same fish species in the corresponding waters should be selected as the reference for the traceability of the origin of the fish.

EFA is often used to determine the correlation between the elemental composition of the species and its habitat for origin tracing [46]. It is mainly applied to plants such as tea, medicinal herbs, crops, fruits, etc. [25,35], and farmed livestock and poultry such as cows, goats, pigs, chickens, etc. [26,34,36], and benthic shrimps, crabs, mussels and other aquatic species with relatively fixed habitat [37,38]. In this study, we analyzed the correlation between the elemental composition of three fish species and two environmental media, and explored the correlation between the elemental composition of fish and their environmental media. The present study shows that the elemental composition of fishes has the greatest difference with the sediments, and has specific elemental differences with the water.

Therefore, we should not choose the sediments and the water as the references for identifying and tracing the origin of the fish species whose distribution areas change in the course of their life histories, and we should choose the fishes themselves as the references for traceability, based on the specificity and stability of the enrichment of the different elements in fishes with different ecological habitats.

## 5. Conclusion

In this study, we analyzed the elemental compositions of three fish species with different ecological habits in relation to two environmental media, and investigated the differences in elemental fingerprints between fish species and their correlation with that of the sediment and the water of the sampling area. The results showed that there were differences in the major elemental compositions of the fish species in relation to sediment and differences in specific discriminant elements in relation to the water, while there were characteristic elemental differences among different fish species due to their different ecological habits. When tracing the origin of fish with changing habitats, environmental media with poor correlation should not be selected as reference, but the same fish species should be selected as reference according to the specificity and stability of element composition among fish with different ecological habits. The present study provides important theoretical guidance and technical support in distinguishing the differences of elemental composition, and origin tracing of different ecological types of fish, and has important application value in the selection of reference media for species traceability.

**Supplementary Materials:** The following supporting information can be downloaded at the website of this paper posted on Preprints.org. Table S1: The 20 element contents of *L. longirostris* (Ll), *C. mystus* (Cm), *C. lucidus* (Cl), from the Yangtze River Estuary (mg/kg, mean $\pm$ SD); Table S2: Results of the discriminant verification analysis for three fish groups of *L. longirostris* (Ll), *C. mystus* (Cm) and *C. lucidus* (Cl) using three characteristic discriminative elements contents in their muscles. Figure S1: PCO analysis of elemental fingerprints between three fish groups (*L. longirostris*, *C. mystus* and *C. lucidus*) and two environmental media (sediment and water). Radius longer and pointing to a group indicates that the element is closer to and contributes more to the group; Figure S2: Clustering dendrogram for 20 elements ratios of *L. longirostris* (Ll1, Ll2, Ll3), *C. mystus* (Cm1, Cm2, Cm3), *C. lucidus* (Cl1, Cl2, Cl3), water (W1, W2, W3, W4) and sediment (S1, S2, S3, S4); Figure S3: Scatter plot of scores based on the first two canonical discriminant functions for three fish groups of *L. longirostris* (Ll), *C. mystus* (Cm) and *C. lucidus* (Cl) using three characteristic discriminative elements contents in their muscles.

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