RESEARCH

Analysis of Heavy Metal Characteristics and Health Risk Assessment of Dried Fish Marketed in Guangzhou, China

Yifei Bai¹ · Dimei Zhang1 · Kang Wang1 · Fangfei Li¹ · Nachuan Chen1 · Zhifeng Zhou2 · Jufeng Ye³

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Abstract

This study investigated heavy metal contamination in dried fsh sold in Guangzhou, China, and evaluated the resultant noncarcinogenic and carcinogenic health risks. Dried fsh samples were purchased from Baiyun, Tianhe, Panyu, and Yuexiu districts in Guangzhou, where the population is substantial. They were randomly acquired in bustling supermarkets and farmers' markets, targeting the most popular dried fsh in these areas. Sixty samples from fve dried fsh types (*Stolephorus chinensis*, *Thamnaconus modestus*, *Nemipterus-virgatus*, *river fsh*, *Ctenopharyngodon idella*) were analyzed for chromium (Cr), arsenic (As), cadmium (Cd), lead (Pb), and mercury (Hg) content. Quantifcation of the heavy metals were carried out by inductively coupled plasma mass spectrometry (ICP-MS) for Cr, As, Cd, and Pb, and an automatic mercury analyzer for Hg. The median concentration of these heavy metals in dried fsh were 0.358 mg/kg, 2.653 mg/kg, 0.032 mg/kg, 0.083 mg/ kg, and 0.042 mg/kg, respectively. Pollution severity was ranked as *dried Nemipterus-virgatus*>*dried Stolephorus chinensis*>*dried Thamnaconus modestus*>*dried river fsh*>*dried Ctenopharyngodon idella*, with As being the most predominant pollutant. All fsh types showed severe As pollution. Non-carcinogenic risks were identifed in the consumption of *dried Nemipterus-virgatus* and *dried Stolephorus chinensis* for both genders, while potential carcinogenic risks were associated with four of the fsh types. Women faced higher health risks than men from dried fsh consumption. Consequently, we advise consumers to minimize their intake of dried fsh and regulatory agencies conduct regular monitoring of heavy metal levels in commercially available dried fsh to avert potential health risks.

Keyword Dried fish · Heavy metals · Non-carcinogenic risk · Carcinogenic risk

Yifei Bai and Dimei Zhang contributed equally to this work.

 \boxtimes Zhifeng Zhou zfzhoucn@163.com

 \boxtimes Jufeng Ye yjfws@163.com

¹ Department of Preventive Medicine, School of Public Health, Southern Medical University, Guangzhou, China

² Department of Hygiene Inspection and Quarantine Science, Center for Hygiene Testing and Analysis, School of Public Health, Southern Medical University (Guangdong Provincial Key Laboratory of Tropical Disease Research), Guangzhou 510515, Guangdong, China

Experimental Teaching Center of Preventive Medicine, School of Public Health, Southern Medical University (Guangdong Provincial Key Laboratory of Tropical Disease Research), National Preventive Medicine Experimental Teaching Demonstration Center, Guangzhou 510515, Guangdong, China

Introduction

Fish is renowned for its abundance of complete protein, polyunsaturated fatty acids like omega-3, minerals, and various other nutrients, making it a vital component of a wellbalanced diet in modern lifestyles [\[1,](#page-14-0) [2\]](#page-14-1). The consumption of fsh is prevalent, and dried fsh, in particular, in warm tropical and subtropical regions, is widely enjoyed. However, when water pollution has become an urgent concern, with heavy metals emerging as major pollutants, fish are more susceptible to the accumulation of heavy metals as a result of factors such as their habitat and biological characteristics [\[3](#page-14-2)]. The multi-step process of dried fsh production leads to an increase in the concentration of heavy metals per kilogram of fsh weight. Consequently, the concentration of heavy metals is more signifcant in dried fsh than in fresh fish.

Typically, the heavy metals of concern in dried fsh include chromium (Cr), arsenic (As), cadmium (Cd), lead

(Pb), and mercury (Hg). These heavy metals possess the potential to impose substantial risks on human health. The detrimental efects of heavy metals encompass a wide range of conditions, including digestive system diseases, impaired liver and kidney function, reduced reproductive abilities, nervous system disorders, cardiovascular diseases, endocrine abnormalities, cancer, and in severe cases, even fatality [[4–](#page-14-3)[7](#page-14-4)]. Therefore, individuals who habitually con-sume dried fish face a significantly amplified risk [[8\]](#page-14-5).

Given the health risks posed by heavy metals to humans, the safety of consuming dried fsh requires careful consideration, specifcally the evaluation of heavy metal concentrations and associated health risks. Researches in Bangladesh focused on examining heavy metal levels in dried fish and assessing the consequent health risks [[2,](#page-14-1) [9](#page-14-6)]. However, health risk assessments using the same indicators yielded inconsistent fndings. Rakib et al. analyzed 10 widely consumed local dried fsh varieties in triplicate, detecting essential and non-essential metals using EDXRF analysis, including Cr, As, Pb, and so on, and determined that both non-carcinogenic and carcinogenic risks are within established safety thresholds [[2](#page-14-1)]. Diferently, Hoque et al.'s study examined two common types of dried fsh for the same heavy metals, in triplicate, employing graphite furnace atomic absorption spectrometry (GF-AAS). It revealed no non-carcinogenic risk in all samples, while a potential carcinogenic risk exists for all metals [\[9](#page-14-6)]. Additionally, several studies from Pakistan indicated that fresh fish muscles have elevated concentrations of heavy metals such as Cr, Pb, and Cd. This study also implied that the consumption of fsh as a food source could potentially lead to health issues for consumers [[10–](#page-14-7)[12\]](#page-14-8). Studies from China on fresh fsh present inconsistent conclusions [\[13,](#page-14-9) [14](#page-14-10)], yet some suggest that heavy metals in fresh fsh may pose potential health risks [\[15\]](#page-14-11).

These studies above suggested that the consumption of certain commonly eaten fsh species in specifc regions poses health risks due to heavy metal contamination. Notably, dried fsh appeared to present a greater health hazard due to its inherent properties. However, most previous literatures predominantly concentrated on the investigations and studies of live fsh, with limited attention to dried fsh, particularly regarding research conducted in China. Thus, in the context, the objectives of this study are (1) to investigate the heavy metal content and pollution levels of diferent dried fsh varieties in Guangzhou, China, (2) to evaluate the potential health risks, both carcinogenic and non-carcinogenic, posed by heavy metals to the residents of Guangzhou, and (3) to assess the food hygiene quality, provide foundational information for dietary choices, and offer crucial insights for the development of food hygiene standards by relevant authorities.

Materials and Methods

Instruments and Reagents

The concentration of metals (Pb, Cr, As and Cd) was determined using an inductively coupled plasma mass spectrometry (ICP-MS) (Thermo Fisher Technologies, USA). The total mercury concentration was measured using an automatic mercury analyzer (Milestone DMA-80 Direct mercury meter, Milestone, Italy). The efficient breakdown of the sample matrix was achieved through the utilization of the Jupiter-B series multi-fux sealed microwave digester (Xinyi Microwave Chemical Company, Shanghai) and an acid drive meter.

The study employed the following chemicals and reagents: 42% nitric acid (Guangzhou Chemical Reagent Factory, China), 30% hydrogen peroxide (Guangzhou Chemical Reagent Factory, China), ultra-pure water, multielement internal standard solution consisting of Cr-Sc (45), As-Ge (72), Cd-In (115), and Pb-Bi (209), as well as standard storage liquids for Pb, Cr, As, Cd, and Hg (1000 µg/mL). All the mentioned standard solution were acquired from Guobiao (Beijing) Testing & Certifcation Co., Ltd.

Sample Collection and Storage

Sampling Area Description

The sampling locations for this study primarily focused on specific areas with the high population density in Guangzhou, namely Baiyun District, Tianhe District, Panyu District, and Yuexiu District [[16](#page-14-12)]. Fig. [1](#page-2-0) illustrates the exact locations chosen for sampling.

Sample Collection and Storage

The acquisition of commercially available dried fsh was conducted in large and medium-sized supermarkets and large farmers' markets within the designated sampling areas [[17](#page-14-13)] , due to the high volume of transactions. Each area randomly selected a total of 4 to 5 supermarkets and large farmers' markets that met the criteria [[17](#page-14-13)]. The sampling process considered factors like consumption frequency, quantity of each fsh purchased, and the specifc location where consumers made their purchases [[18](#page-14-14)]. Five types of dried fsh were carefully selected for this study due to their high market sales and popularity among residents of Guangzhou: *dried Stolephorus chinensis (pond smelt), dried Nemipterus-virgatus, dried Thamnaconus modestus, dried river fsh, and dried Ctenopharyngodon* **Fig. 1** Sampling points of dried fsh in Guangzhou, China. The orange markings indicate the specifc sampling areas within Guangzhou, namely Baiyun District, Tianhe District, Panyu District, and Yuexiu District

Fig. 2 Samples of Dried Fish Sold in Guangzhou, China. The five figures correspond to the five types of dried fish selected for the study, including *dried river fsh*, *dried Stolephorus chinensis*, *dried Thamnaconus modestus*, *dried Nemipterusvirgatus*, and *dried Ctenopharyngodon idella*

idella (Fig. [2](#page-2-1)). At each site, we collected the five types of dried fsh under study, adhering to the principle of random sampling. A total of 60 samples were acquired, with twelve samples obtained for each type of dried fsh. To ensure representativeness, the muscle parts of large fish were uniformly trimmed using scissors [[19](#page-14-15)]. For smaller fsh that can be consumed whole, they were all cut and ground into powder using a mortar.

Sample Processing and Analysis

Approximately 0.5 g of dried fsh powder was carefully weighed and subsequently transferred into the digestion tank. Following that, 8 mL of a 42% nitric acid solution was added, and the digestion tank was positioned on the acid digestion instrument for the purpose of pre-digestion. The mixture was subsequently heated at 100 ℃ for 20 minutes

and then allowed to cool to room temperature. Following this, 1 mL of 30% hydrogen peroxide solution was added to the digestion tank, and the tube cover was tightly sealed. The sample underwent digestion using a microwave digestion instrument. For the digestion procedure for dried fish samples, they can be heated at 150 ℃ for 10 minutes, followed by heating at 180 ℃ for 8 minutes, utilizing a microwave digester. After completion of the digestion process and the pressure and temperature in the digestion tank reached 0 kPa and room temperature respectively, the digestion tank was positioned on the acid digestion meter, and the acid was digested at 100 ℃ for 0.5 hours. Following that, 1mL of ultra-pure water was added, and the acid was digested at 100 ℃ for 1 hour. After the solution cooled, a fxed volume operation was performed. ICP-MS is extensively utilized in the analysis of metal elements, characterized by high sensitivity, minimal interference, precision, and accuracy [[20](#page-14-16)]. The DMA-80 direct mercury analyzer is widely used for determining total mercury levels in tissue samples. It is rapid, cost-efective, and ofers excellent specifcity and sensitivity [[21\]](#page-14-17). In this study, ICP-MS was employed to analyze the concentration of Pb, Cd, Cr and As elements in the digestion solution of dried fsh powder. Furthermore, the levels of Hg elements in the dried fsh powder were determined using the DMA-80 direct mercury analyzer. The specifc parameters of ICP-MS were set with the fow rates of auxiliary gas, the carrier gas, and cooling gas adjusted to 0.7 L/ min, 0.75 L/min, and 13 L/min, respectively. The DMA-80 direct mercury analyzer was set with specifc determination parameters: drying temperature at 200 ℃ for 90 seconds; decomposition temperature at 750 ℃ for 80 seconds; vaporization temperature at 900 ℃ with a vaporization tube heating time of 12 seconds; rinse time of 60 seconds; and recording time of 30 seconds.

Quality Control and Quality Assurance

Instruments were cleaned prior to use to minimize heavy metal contamination. The sample blank was measured under identical conditions. For each metal, the limits of detection (LOD) and limits of quantifcation (LOQ) were calculated based on three and ten times the standard deviation (SD) of blank measurements, respectively [[22\]](#page-14-18). The LODs (LOQs) obtained for Cr, As, Cd, Pb, and Hg were 0.00450 ng/ ml (0.01500 ng/ml), 0.00054 ng/ml (0.00180 ng/ml), 0.00097 ng/ml (0.00323 ng/ml), 0.00227 ng/ml (0.00757 ng/ ml), and 0.00436 mg/kg (0.01453 mg/kg). Calibration curves were prepared for the elements Cr, As, Cd, and Pb at concentrations of 0, 0.1, 1, 2, 5, 10, 50, 100 and 200 ng/ml, and for the element Hg at concentrations of 0, 0.5, 1, 2.5, 5, 10, 15 and 20 ng. For all metals assessed, the calibration regression line exhibited a correlation coefficient above 0.99. In order to determine the precision of each type of dried fsh,

six consecutive measurements were conducted on individual samples to calculate their precision based on the relative standard deviations (RSDs). The RSDs were below 10%, indicating reliable repeatability. The linear range of Cr, As, Cd, and Pb were all 0.1–200 μg/L, while for Hg, the range was 0–20 ng. A sample was randomly selected and divided into four portions. Two portions were analyzed for parallel background determination, while another two portions were subjected to parallel recovery assays. Recovery analysis was conducted by spiking the samples with Cr at a concentration of 3.5 ng/mL, As at 25 ng/mL, and Cd, Pb, and Hg at 0.5 ng/mL each. The recovery rate from the standard addition method ranged from 90 to 110%, demonstrating satisfactory recovery efficiency.

Risk Assessment Indicators

Pollution Assessment Methods

The Single Factor Pollution index (SPI) is utilized to quantitatively assess the level of pollution for each individual heavy metal. On the other hand, the Nemerow Comprehensive Pollution Index (NCPI) is employed to mitigate the infuence of subjective factors and provide an overall evaluation of the combined pollutants' risk [[23\]](#page-15-0). SPI(P) was calculated using Eq. ([1\)](#page-3-0)

$$
P = C/S \tag{1}
$$

P is the single factor pollution index of heavy metal, C (mg/kg) is the concentration of heavy metal, S (mg/kg) is the standard limit value of heavy metal. According to the National Standards of the Limits of Pollutants in Food of the People`s Republic of China [\[24\]](#page-15-1), the limits of heavy metals Pb, Cr, Cd, As and Hg in dried fsh are 1.0, 2.0, 0.1, 0.1 and 0.5 mg/kg, respectively. According to the Pollution Index (P_i) values, the level of contamination in the food can be categorized as follows: $P_i < 1.0$ indicates that the food is considered clean and safe for consumption. When P_i falls within the range of 1.0 to less than 2.0, it suggests that the food is mildly contaminated and therefore unft for consumption. Similarly, if P_i ranges from 2.0 to less than 3.0, it indicates that the food is moderately contaminated and should not be consumed. Finally, if P_i is equal to or greater than 3.0, the food is classifed as severely contaminated and should not be consumed due to the associated health risks [\[25](#page-15-2)].

NCPI(PN) was calculated using Eq. ([2\)](#page-3-1)

$$
PN = \sqrt{\left(P_{ave}^2 + P_{max}^2/2\right)}\tag{2}
$$

 P_{ave} and P_{max} represent the average and maximum concentrations of heavy metals, respectively. The risk of heavy metal pollution is divided into five categories: Clean

(PN \leq 0.7), Preventive (0.7 < PN \leq 1.0), Light Pollution $(1.0 < PN \le 2.0)$, Moderate Pollution $(2.0 < PN \le 3.0)$, and Heavy Pollution ($PN > 3.0$) [26].

Health Risk Assessment Methods

The Estimated Daily Intake (EDI) of a heavy metal, measured in milligrams per kilogram of body weight per day $(mg/kg·BW^{-1}·day^{-1})$, is calculated using the following variables: C (mg/kg), the concentration of the heavy metal in dried fsh, DI (kg/day), the average intake rate of dried fish by local residents (which is 5.33×10^{-3} kg/day) [[27\]](#page-15-4); and BW, the average weight of the population. In 2015, the average weight of Chinese adult males was recorded as 66.2 kg, while the average weight of Chinese adult females was 57.3 kg [\[28\]](#page-15-5). EDI values for adult males were calculated using Eq. ([3\)](#page-4-0).

$$
EDI = (C \times DI)/BW \tag{3}
$$

The target hazard quotient (THQ) is widely utilized in the evaluation of noncarcinogenic risks associated with heavy metals. THQ \geq 1 indicates that a certain heavy metal poses a non-carcinogenic risk to human health, and $THQ < 1$ indicates that the risk is negligible. Considering the cumulative impact of multiple heavy metals in aquatic products, the total non-carcinogenic risk posed by these metals can be assessed by calculating the aggregate non-carcinogenic risk index (HI) of heavy metals. Similarly, an HI value of ≥ 1 implies a potential risk to human health, while any value below 1 indicates a negligible risk [[15,](#page-14-11) [29\]](#page-15-6). The THQ and HI was estimated using Eq. (4) (4) (4) and Eq. (5) (5) .

Non-carcinogenic health risks:

$$
THQ = (EDI \times EF \times ED) / (RfD \times AT)
$$
\n⁽⁴⁾

$$
HI = \sum_{i=1}^{n} THQ_i
$$
 (5)

The Oral Reference Dose (RfD) represents an estimated daily oral exposure over a chronic period, potentially a lifetime, for the human population that is anticipated to be without significant risk of adverse effects over a lifetime, derived from the No-Observed-Adverse-Efect Level, the Lowest-Observed-Adverse-Efect Level, or a bench-mark dose [[30](#page-15-7)]. The RfD for each element is as follows: Cd=1.0×10⁻³ mg/kg day⁻¹, Cr=3.0×10⁻³ mg/kg day⁻¹. Pb=3.6×10⁻³ mg/kg·day⁻¹, As=3.0×10⁻⁴ mg/kg day⁻¹, and Hg = 3.0×10^{-4} mg/kg day⁻¹ [\[31\]](#page-15-8). EF represents the exposure frequency (365 days/year), ED represents the exposure duration (70.1 years for males and 77.5 years for females), and AT represents the average exposure time (365 days/year multiplied by the duration of exposure) [\[32–](#page-15-9)[34\]](#page-15-10).

Carcinogenic risk (CR) can be estimated by the potency and exposure level of the carcinogen, and total carcinogenic risk (TCR) can be used to assess the carcinogenic risk of mixed pollutants [[33\]](#page-15-11). Due to the lack of carcinogenic slope factors for Pb and Hg, this paper will evaluate the carcinogenic risk of As, Cd and Cr to human health. CR and TCR can be calculated based on the following equation [[35\]](#page-15-12):

The CR is calculated by Eq. ([6](#page-4-3)).

$$
CR = EDI \times CSF \tag{6}
$$

The TCR is defined by Eq. (7) (7) .

$$
TCR = \sum_{i=1}^{n} CR_i
$$
 (7)

where CR is a carcinogenic risk, EDI is the average dietary intake $(mg/kg \, day^{-1})$. The Cancer Slope Factor (CSF) is a parameter used in human risk assessment to describe potential carcinogenicity, typically derived from the lower confdence limit of the dose at the data-supported lowest specifed risk level of 95% [\[36](#page-15-13), [37\]](#page-15-14). The CSF of Cr, As and Cd is 0.5, 1.5 and 6.3 (kg·day/mg), respectively [[15\]](#page-14-11). CR and TCR values greater than 1e-04 are considered to be possibly carcinogenic. A risk ranging from 1×10^{-4} to 1×10^{-6} is deemed acceptable, while a risk below 1×10^{-6} is considered negligible [\[38\]](#page-15-15).

Statistical Analysis

In the study, the Shapiro-Wilk test was used to assess the normality of the datasets, while the Levene test was employed to test the homogeneity of variance. The results of the concentration levels of heavy metals revealed that the data did not follow a normal distribution. As a result, descriptive statistics for the content of fve heavy metals use median, and 1st and 3rd quartile values, and the betweengroup comparisons were conducted using the non-parametric Wilcoxon signed rank test, which is appropriate for analyzing data that deviate from normality. The outcomes of health risk assessment indicators such as EDI, THQ, HI, CR, and TCR indicated a normal distribution of the data. Consequently, the mean \pm 1.96 standard deviations were reported. The confdence intervals are represented as mean \pm 1.96 standard deviations. Pearson Correlation analysis was employed to investigate the relationships between the concentrations of heavy metals in dried fsh. This method was chosen because it provides a measure of the linear relationship between variables, which is essential for understanding how the presence of one heavy metal might be associated with the presence of others. To explore the trends among diferent metal elements in dried fsh, Principal Component Analysis (PCA) was conducted, with the ' prcomp' package. This technique helps to reduce the dimensionality of the dataset, highlighting the main components that explain the most variance in metal concentrations. All statistical analyses, including the computation of test statistics and P-values, were conducted using the R programming language. In this study, the significance level for statistical tests was set at α $= 0.05$. P-values less than 0.05 were considered statistically signifcant. All tests were conducted as two-tailed tests to account for the possibility of efects in either direction .

Results

Heavy Metal Analysis

Heavy Metal Levels in Dried Fish

The descriptive data for heavy metal content in dried fsh, including the median, quartile, and exceeding rate, are presented in Table [1.](#page-5-0) The average levels of heavy metals in various species of dried fish are as follows: As $>Cr$ >Pb >Hg >Cd. Specifcally, the values are 2.653 mg/kg, 0.358 mg/kg, 0.083 mg/kg, 0.066 mg/kg, and 0.032 mg/kg. Among the diferent species of dried fsh, *dried Nemipterus-virgatus*

Table 1 Heavy metal content in diferent species of dried fsh

exhibits the highest median levels of As and Hg, with values of 4.459 mg/kg and 0.491 mg/kg, respectively. The highest median concentration of Cr is 0.770 mg/kg in *dried Ctenopharyngodon idella*, whereas the highest median concentrations of Cd and Pb are 0.065 mg/kg and 0.139 mg/kg in *dried river fsh*, respectively. According to the national standard of "Limits of Pollutants in Food" of the People`s Republic of China [\[24\]](#page-15-1), the permissible limits for heavy metals in dried fsh are as follows: Cr (2.0 mg/kg), As (0.1 mg/kg), Cd (0.1 mg/kg), Pb (1.0 mg/kg), and Hg (0.5 mg/ kg). Out of these metals, only the median concentration of As (2.653 mg/kg) exceeds the standard limit, resulting in the highest exceeding rate (88.33%). Furthermore, among diferent species, the median concentrations of As in *dried Thamnaconus modestus* (2.902 mg/kg), *dried Stolephorus chinensis* (4.030 mg/kg) and *dried Nemipterus-virgatus* (4.459 mg/kg) also signifcantly exceed the standard limit. The medians of other heavy metals are below the standard limit, but the 3rd quartile (P_{75}) values for Cd and Hg still exceed the standard. Table [1](#page-5-0) shows that the P_{75} value for Cd in *dried Thamnaconus modestus* (0.105 mg/kg), *dried Stolephorus chinensis* (0.205 mg/kg), and *dried river fsh* (0.144

As, arsenic; Cd, cadmium; Cr, chromium; Hg, mercury; Pb, lead

Data are given as mean, 1st and 3rd quartile values and exceeding rate

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Fish 1	Fish 2	Cr		As		C _d		Pb		Hg	
		W	\boldsymbol{P}	W	\boldsymbol{P}	W	\boldsymbol{P}	W	\boldsymbol{P}	W	\boldsymbol{P}
dried Stolephorus chinensis	dried Thamnaconus modestus	65	0.707	79	0.713 69		0.885 83		0.551	87.5	0.386
	dried Nemipterus-virgatus	47	0.157	61	0.551 95		0.193 86		0.436	15	< 0.001
	dried river fish	52	0.260	110	0.028 82		0.583 58		0.443	54	0.319
	dried Ctenopharyngodon idella	28	0.012	142	< 0.001 132		< 0.001 97		0.156	104	0.068
dried Thamnaconus modestus	dried Stolephorus chinensis	79	0.707	65	0.713 75		0.885 61		0.551	56.5	0.386
	dried Nemipterus-virgatus	57	0.410	41	0.078 103		0.078 82		0.583	12	< 0.001
	dried river fish	61	0.551	98	0.143 74		0.931 54		0.319	48	0.178
	dried Ctenopharyngodon idella	34	0.028	144	<0.001 138		<0.001 92		0.259	101	0.101
dried Nemipterus-virgatus	dried Stolephorus chinensis	97	0.157	83	0.551 49		0.193 58		0.436	129	< 0.001
	dried Thamnaconus modestus	87	0.410	103	0.078 41		0.078 62		0.583	132	< 0.001
	dried river fish	81	0.644	119	0.006 51		0.236 50		0.214	130	< 0.001
	dried Ctenopharyngodon idella	51	0.242	144	< 0.001 132		<0.001 82		0.580	135	< 0.001
dried river fish	dried Stolephorus chinensis	92	0.260	34	0.028 62		0.583 86		0.443	90	0.318
	dried Thamnaconus modestus	83	0.551	46	0.143 70		0.931 90		0.319	96	0.178
	dried Nemipterus-virgatus	64	0.644	25	0.006 93		0.236 94		0.214	14	< 0.001
	dried Ctenopharyngodon idella	46	0.143	138	< 0.001 132		< 0.001 99		0.124	113	0.017
dried Ctenopharyngodon idella	dried Stolephorus chinensis	116	0.012	$\overline{2}$	< 0.001 12		< 0.001 47		0.156	40	0.068
	dried Thamnaconus modestus	110	0.028	$\overline{0}$	<0.001 6		< 0.001 52		0.259	43	0.101
	dried Nemipterus-virgatus	93	0.242	$\overline{0}$	< 0.001 12		<0.001 62		0.580	9	< 0.001
	dried river fish	98	0.143	6	<0.001 12		< 0.001 45		0.124	31	0.017

All data are shown as W values and P-values. Statistical analysis was performed using the non-parametric Wilcoxon signed rank test. P-val $ues < 0.05$ were considered statistically significant

mg/kg) is higher than the standard limit. Additionally, the P75 value for Hg in *dried Nemipterus-virgatus* (1.008 mg/kg) and the P75 value for Cr in *dried Ctenopharyngodon idella* (2.485 mg/kg) also exceed the standard limit **(**Table [1](#page-5-0)**)**. These fndings are noteworthy and indicate potential risks. Furthermore, there are signifcant variations in the heavy metal content among diferent species of dried fsh. The results suggest that the concentration levels of As, Cd, and Hg vary signifcantly across diferent species of dried fsh **(**Table [2](#page-6-0)**)**.

PCA Analysis and Correlation Analysis

PCA was conducted on the heavy metal content of 60 dried fish samples. To assess the suitability of PCA analysis, a Kaiser-Meyer-Olkin (KMO) test and Bartlett test were performed. The results indicate that the Bartlett signifcance value was less than 0.01, confrming the validity of the PCA analysis. The frst three PCA components accounted for 84.95% of the total variance. PC1 exhibited the highest loadings for Cr and Pb, explaining 32.34% of the overall variance. PC2 displayed the maximum loadings for As, explaining 30.30% of the total variance. (Fig. [3\)](#page-6-1) Based on the correlation analysis of the fve heavy metals, positive correlations were observed between Pb-Cr (*r*=0.56), Cd-As (*r*=0.49),

and Hg-As (*r*=0.35). Additionally, in diferent species of dried fsh, a positive correlation between As-Cr (*r*=0.89) and Pb-As (*r*=0.73) was found in dried Nemipterus-virgatus.

Fig. 3 Biplot for heavy metal content measured in 60 dried fsh samples. This plot is a visual representation of the frst two components (PC1 and PC2). The x-axis represents the PC1 explaining 32.34% of the total variance, and the y-axis represents the PC2 explaining 30.30% of the total variance. The colors of the elements represent the element's contribution to the respective component. As, arsenic; Cd, cadmium; Cr, chromium; Hg, mercury; Pb, lead; PCA, Principal Component Analysis. Statistical analysis was performed using PCA

Furthermore, a positive correlation between Hg and Cd was observed in dried Thamnaconus modestus $(r=0.61)$. (Fig. [4](#page-7-0))

Pollution Level Evaluation

The SPI and NCPI can evaluate the pollution degree of individual heavy metals and the overall pollution degree of heavy metals. The results of these assessments are presented

in Table [3](#page-7-1). The SPI values for Cr (0.444) , Cd (0.711) , Pb (0.251) , and Hg (0.397) in the five dried fish samples are all less than 1, indicating that these elements do not pose a pollution risk to the dried fsh. However, the SPI value for As (28.973) is greater than 3, suggesting severe pollution by As in each of the dried fsh samples. The order of heavy metal pollution degree is $As > Cd > Cr > Hg > Pb$. Due to the signifcant pollution by As, its contribution to

Fig. 4 Relation between 5 heavy metals including Cr, As, Cd, Pb and Hg. The distribution of heavy metals in diferent dried fsh shown in the diagonal squares. The heavy metal content against the other heavy metal in diferent dried fsh below the central diagonal proportion plots. The correlation between each heavy metals is shown on the

opposite side of the diagonal. The correlation coefficients between each pair of heavy metals are shown above the diagonal. $*P < 0.05$, ** P<0.01, *** P<0.001. Statistical analysis was performed using Pearson correlation

NCPI, Nemerow Comprehensive Pollution Index; SPI, Single Factor Pollution index

the NCPI is substantial, resulting in an NCPI value (20.944) also exceeding 3. The comprehensive level of heavy metal pollution is classifed as severe pollution. Additionally, when considering the NCPI values of dried fsh, the order is as follows: *dried Nemipterus-virgatus* (32.197) > *dried Stolephorus chinensis* (29.080) > *dried Thamnaconus modestus* (20.231) > *dried river fsh* (9.061)> *dried Ctenopharyngodon idella* (4.809).

Health Risk Assessment

Non‑carcinogenic Risk Assessment

According to the Joint FAO/WHO Expert Committee on Food Additives (JECFA) [[39\]](#page-15-16) and the European Food Safety Authority (EFSA) [[40\]](#page-15-17), the Provisional Tolerable Daily Intake (PTDI) values for Cr, As, Cd, Pb, and Hg are 0.3, 0.003, 8e-04, 0.0015, and 1.4e-04 mg/kg BW⁻¹ day⁻¹, respectively. On the other hand, the EDI values for Cr, As, Cd, Pb, and Hg in adult males were 7.15e-05, 2.33e-04, 5.72e-06, 2.02e-05, and 1.60e-05 mg/kg BW⁻¹ day⁻¹, while the EDI values for Cr, As, Cd, Pb, and Hg in adult females were 8.26e-05, 2.70e-04, 6.61e-06, 2.34e-05, and 1.85e-05 mg/kg BW^{-1} day⁻¹ (Table [4](#page-9-0)). It is evident that the EDI values for both males and females are significantly lower than corresponding PTDI at the average exposure level.

This study aimed to evaluate the non-carcinogenic health risks associated with heavy metal exposure from dried fsh using the THQ and HI calculations in Fig. [5A](#page-10-0)-B and Table [4](#page-9-0). Based on the fndings presented, the noncarcinogenic risks associated with diferent species of dried fsh can be ordered as follows: *dried Nemipterusvirgatus*>*dried Stolephorus chinensis*>*dried Thamnaconus modestus*>*dried river fsh*>*dried Ctenopharyngodon idella*. The average THQ values of As for *dried Stolephorus chinensis* and *dried Nemipterus-virgatus* were found to be higher than 1 for both males (1.05, 1.32) and females (1.21, 1.52), indicating potential health risks. However, the average THQ values for other heavy metals in diferent species of dried fsh were lower than 1, suggesting a lower risk of non-carcinogenic health efects. In both male and female groups, the 95% upper limit of THQ of As for *dried Thamnaconus modestus* (1.06, 1.23) exceeded 1. Additionally, the 95% upper limit of THQ of As for *dried river fsh* in women (1.07) surpassed 1 as well. Moreover, based on the HI values, the HI values for *dried Nemipterus-virgatus* were higher than 1 in both male (1.52) and female (1.75) groups $(P < 0.05)$, suggesting the potential occurrence of non-carcinogenic health risks. In both gender groups, the average HI for *dried Stolephorus chinensis* (male: 1.09, female: 1.26) exceeded 1. Additionally, in women, the average HI for *dried Thamnaconus modestus* (1.05) also exceeded 1. On the other hand, the mean HI for other dried fsh samples was less than 1. However, it is important to note that the 95% upper limit of the HI for *dried Thamnaconus modestus* in men (1.11) and *dried river fsh* in male (1.01) and female (1.16) also exceeded 1. This implies that individuals at the upper end of the exposure range may face potentially higher health risks.

Carcinogenic Risk Assessment

It is evident that the CR associated with the ingestion of As in *dried Stolephorus chinensis* (male: 4.72e-04, female: 5.54e-04), *Thamnaconus modestus* (male: 3.86e-04, female: 4.46e-04), *Nemipterus-virgatus* (male: 5.93e-04, female: 6.85e-04), and *river fsh* (male: 2.76e-04, female: 3.19e-04)all exceed 1e-04, indicating a potential risk of carcinogenesis, showed in Table [5](#page-11-0) and Fig. [5C](#page-10-0)-D. However, the CR value for As in *dried Ctenopharyngodon idella* (male: 2.31e-05, female: 2.67e-05) falls in the range of 1e-06 to 1e-04, demonstrating that the carcinogenic risk associated with As exposure in *dried Ctenopharyngodon idella* was within acceptable limits. Additionally, the CR value of Cd in *dried Ctenopharyngodon idella* (male: 0, female: 0) was found to be less than 1e-06, indicating that the associated carcinogenic risk is negligible, while the CR value of Cr and Cd in other dried fsh samples ranged between 1e-06 and 1e-04, signifying that the carcinogenic risk posed by these metals is deemed acceptable. However, in both males and females, the 95th percentile upper limit (P95) for the CR value of Cd in *dried Stolephorus chinensis* (male: 1.24e-04, female: 1.44e-04) also exceeded 1.00e-04. When considering the TCR of heavy metals, the order of carcinogenic risk was observed to be *dried Nemipterus-virgatus* (male: 6.48e-04, female: 7.49e-04) > *dried Stolephorus chinensis* (male: 5.55e-04, female: 6.42e-04) > *dried Thamnaconus modestus* (male: 4.50e-04, female: 5.20e-04) > *dried river fsh* (male: 3.59e-04, female: 4.15e-04) > *dried Ctenopharyngodon idella* (male: 9.57e-05, female: 1.11e-04). The ingestion of heavy metals in *dried Stolephorus chinensis*, *dried Thamnaconus modestus*, *dried Nemipterus-virgatus* and *dried river fsh* may be carcinogenic for men and women. Additionally, apart from the types of dried fsh that may be carcinogenic for men, heavy metal ingestion in *dried Ctenopharyngodon idella* may also be carcinogenic for women. However, it is worth noting that the P_{95} for TCR values, when ingested by men, also exceeds 1e-04. The analysis of the cancer risk associated with heavy metal ingestion in dried fish reveals that both men and women face a risk of carcinogenic. Notably, the risk of carcinogenesis in women is higher compared to men.

Table 4 EDI, THQ, and HI values for heavy metals in diferent dried fsh by gender and metal types and the overall totals

EDI, Estimated Daily Intake; HI, aggregate non-carcinogenic risk index; THQ, target hazard quotient

All data are represented as mean (95% confidence intervals) and were calculated using mean ± 1.96 standard deviations

Fig. 5 Forest plot demonstrates the non-carcinogenic health risks associated with heavy metal exposure from dried fsh using the THQ and HI calculations in Fig. [5](#page-10-0)A-B. The CR and the TCR values were showed in Fig. [5C](#page-10-0)-D. The average and 95% confdence interval of THQ (A) and CR (C) between dried fish and heavy metals is shown compared with the standard (dashed line). The heatmaps are colored

Discussion

Given the limited research had been conducted specifcally on the health risks related to the consumption of heavy metals in dried fsh in China, this study seeks to address this research gap by examining the extent of heavy metal contamination in dried fsh samples and evaluating the potential health risks posed to consumers. In this study, we measured five heavy metals (Cr, As, Cd, Pb, Hg) in common dried fish in Guangzhou, China. All types of the dried fsh exceeded safety limits, with As showing the highest exceedance rate. The SPI indicated severe As contamination, particularly in *dried Nemipterus-virgatus*. The NCPI ranked as follows: *dried Nemipterus-virgatus* > *dried Stolephorus chinensis*>*dried Thamnaconus modestus*>*dried river fsh*>*dried Ctenopharyngodon idella*. The heavy metal pollution degree was $As > Cd > Cr > Hg > Pb$. The EDI values were well below the PTDI limits. The ranking of non-carcinogenic

according to (B) the HI (HI < 1, teal; HI \geq 1, orange), and (D) the TCR (TCR < 1e-04, teal; TCR ≥ 1e-04, orange). Confidence intervals are calculated as mean ± 1.96 standard deviations. CR, carcinogenic risk; HI, aggregate non-carcinogenic risk index; TCR, total carcinogenic risk; THQ, target hazard quotient

and carcinogenic health risks caused by various dried fsh corresponds to their degree of contamination. As posed a potential non-carcinogenic risk for certain fsh species, and carcinogenic risk was noted for As in specifc dried fsh, particularly afecting males and females diferently. Women may be at greater risk due to variations in body weight and life expectancy. However, other heavy metals showed minimal health risks.

We investigated the content of heavy metals in dried fish. These results align with a prior survey on coastal fish in China, where As was identified as the most heavily polluted trace element [[41](#page-15-18)]. Studies from China have indicated that Cr, Pb, and As are among the heavy metals with signifcant contamination in fresh fsh [\[14,](#page-14-10) [15](#page-14-11)]. While these fndings slightly difer from our results, it is important to note that the level of contamination for each heavy metal can vary greatly by region and year [[14](#page-14-10)]. For instance, in our study, As, Cd, and Cr were found at higher **Table 5** CR and TCR values for heavy metals in different dried fish by gender and metal types and the overall totals

CR, carcinogenic risk; TCR, total carcinogenic risk

All data are represented as mean (95% confidence intervals) and were calculated using mean ± 1.96 standard deviations

concentrations in fresh fsh from the Pearl River Basin, which may not be consistent in other areas [[14\]](#page-14-10). Research from other countries, such as Bangladesh and India, has reported diferent results, with Pb, Hg, and Cr being the heavy metals of significant concern in dried fish [[2,](#page-14-1) [9,](#page-14-6) [42](#page-15-19)]. The observed discrepancies may arise from variations in regional water pollution levels, as well as variances in abiotic factors including water pH, temperature, and biological factors such as fsh species, feeding habits, and reproductive cycles. Out of the fve fsh species considered in this study, only *Ctenopharyngodon idella* primarily feeds on vegetation and occupies a lower trophic level. Interestingly, this ecological characteristic leading to the lowest pollution level suggests the potential infuence of biological enrichment on heavy metal contamination [[43](#page-15-20)]. Thus, as humans occupy the highest trophic level, they exhibit increased vulnerability to the impacts of heavy metal exposure. Guangdong Province, characterized by a high degree of industrialization and severe water pollution [[44](#page-15-21)], displays elevated levels of heavy metal content, requiring increased attention. The production process of dried fsh entails multiple steps, leading to a higher concentration of heavy metals per kilogram. Furthermore, dried fsh available in the market may come into contact with atmospheric sediments, which often contain trace metals. These particles eventually settle on the surface of dried fsh [[45](#page-15-22)].

Similar to the PCA analysis conducted in this study, a study conducted in India on the consumption of dried fsh also focused on the same fve elements, along with the inclusion of nickel (Ni) [\[42](#page-15-19)]. The results demonstrated that PC1 was signifcantly infuenced by Cr, As, and Pb, with Pb showing a negative load, which is in agreement with the fndings of the present study. However, PC2 primarily exhibited positive loads for Cr, Ni, and Cd, which contradicts the results obtained in this study. This variation is likely attributed to regional disparities in water pollution. Furthermore, the study fndings indicate a correlation between multiple heavy metal elements, which may be attributed to local geological conditions and pollution sources. This correlation is consistent with the fndings of Arisekar et al., who conducted Pearson correlation analysis on heavy metals in dried fsh and revealed a signifcant positive correlation between As-Cd and As-Hg [\[42](#page-15-19)].

The heavy metal elements of concern in this study are detrimental to human health, with their carcinogenicity warranting attention. Additionally, they adversely affect multiple organs and systems, including the nervous system and kidneys [\[46](#page-15-23)[–49](#page-15-24)]. Consequently, our study focused on the potential health risks associated with heavy metal intake through dried fish consumption. Given the variations in average body weight and lifespan between adult men and women, the lifetime intake of heavy metals from dried fsh may vary, resulting in diferent health risks. Therefore, this study examined the disparity in heavy metal intake from dried fsh between adult males and females, as well as evaluating the associated health risks separately. The EDI values are compared against the corresponding PTDI as a method of assessment. The EDI value calculated in this study was found to be considerably lower than the PTDI value established by the JECFA and the EFSA. However, it is important to note that these results are specifc to the fsh analyzed in this study and do not take into account other sources of heavy metal intake [\[50\]](#page-15-25). Other studies have demonstrated that humans are exposed to signifcant amounts of heavy metals through various food sources, including rice, vegetables, and fruits [\[51\]](#page-15-26). Considering these additional sources, the ingestion of heavy metals by humans may pose a greater health risk. Several Chinese studies have analyzed fsh from Hong Kong, coastal provinces, major river basins, and other provinces in China, focusing on heavy metals such as Hg, As, Cd, Cr, Pb $[13–15, 52]$ $[13–15, 52]$ $[13–15, 52]$ $[13–15, 52]$. The EDI of these metals from fish consumption generally falls below the limits. Studies from India and Bangladesh have examined dried fsh, with a similar focus on heavy metals. Studies from Bangladesh indicate that EDI for these metals from dried fsh is below the limits [\[2,](#page-14-1) [9](#page-14-6)], while some Indian studies suggest that EDI for Pb, Cd, Hg may exceed limits [[42](#page-15-19), [53](#page-16-0)]. Overall, the majority of these fndings are consistent with our results, indicating that EDI values were below PTDI limits, although Chinese studies lack analysis of dried fsh.

The extent of heavy metal contamination corresponded to the non-carcinogenic and carcinogenic risk levels observed in diferent types of dried fsh. In this study, the pollution level of heavy metals in dried fsh was assessed using the SPI and NCPI. SPI was used to assess the pollution degree of individual heavy metals, while NCPI was used to evaluate the overall pollution degree of heavy metals. The results indicated that among the fve elements, As posed the largest non-carcinogenic and carcinogenic risks. The other elements also exhibited levels that exceeded the standard, but their associated non-carcinogenic and carcinogenic risks were deemed acceptable. With regards to the total non-carcinogenic and carcinogenic risks, nearly all dried fsh, except for *dried Ctenopharyngodon idella*, presented health risks. Both non-carcinogenic and carcinogenic risks were higher in women than in men. These fndings emphasize the need for heightened awareness among women regarding the potential health risks associated with heavy metal intake. Furthermore, it was observed that although the average health risks posed by certain heavy metal elements and specifc types of dried fsh might be deemed negligible, individuals at the upper limit of the exposure range $(P_{95}$ upper limit) still faced potential health risks that demand attention. Several studies about China report varying results on fresh fish, with research from coastal provinces, and major river basins suggesting negligible health risks from heavy metals including Hg, As, Cd, Cr, Pb [[13](#page-14-9), [14](#page-14-10)]. However, high exposure to Cr and As may pose a higher carcinogenic risk compared to other aquatic products [\[15\]](#page-14-11). A Hong Kong study indicates that health risks from heavy metal intake in processed shark fins warrant attention $[52]$. Dried fish, due to its processing, typically have higher heavy metal content, potentially leading to increased non-carcinogenic and carcinogenic health risks. Other countries research on heavy metals in dried fsh, particularly from India and Bangladesh, also shows mixed fndings. A study in Chennai, India, found no non-carcinogenic risk from heavy metal pollution in dried fish, but a potential carcinogenic risk due to Cd and Pb [\[53](#page-16-0)]. Conversely, another study concluded no non-carcinogenic or carcinogenic risks from dried fsh [[42\]](#page-15-19). Two studies from Bangladesh, one examining essential and non-essential metals including Cr, As, Pb, found risks within established safety thresholds [[2\]](#page-14-1), while another detected similar heavy metals in dried fsh, including Hg, As, Cd, Cr, Pb, and suggested potential carcinogenic risks for all metals [[9\]](#page-14-6). These discrepancies may arise from regional diferences in environmental factors afecting heavy metal content in both fresh and dried fsh, as well as variations in consumption patterns, particularly between diferent countries.

Based on the aforementioned results, it is imperative for both producers and consumers to increase their awareness of the health risks associated with heavy metals in dried fsh. We propose that consumers minimize their consumption of

dried fsh [[9](#page-14-6)], especially for high-risk groups such as children and pregnant women [[2](#page-14-1)], or alternatively, rinse dried fish thoroughly before consumption, focusing specifically on the fish scales $[45]$ $[45]$. Moreover, methods such as Microwave cooking can be employed to process dried fsh before intake, thereby reducing the bioaccessibility of heavy metals and mitigating health risks [[54\]](#page-16-1). Additionally, one can opt for dried fsh with lower levels of heavy metal contamination and reduced health risks, such as *dried Ctenopharyngodon Idella.* Simultaneously, it is highly recommended that local regulatory agencies consistently monitor the production and storage conditions of commercial processors, as well as the heavy metal content in dried fsh. Additionally, these agencies should implement appropriate control and technical measures to reduce industrial heavy metal discharge and limit the direct release of pollutants into water sources. Public health authorities should promptly assess and communicate the health risks of heavy metals in dried fsh and recommend consumption levels, while also educating consumers on the importance of minimizing their intake of dried fsh.

This research evaluated the health hazards linked to heavy metal intake through the consumption of dried fsh. The study utilized a total of 60 samples from the five most consumed dried fsh varieties in the four most populous districts of Guangzhou city. The diversity and quantity of samples enhanced the credibility and generalizability of the results. Additionally, advanced analytical techniques, including ICP-MS and the DMA-80 direct mercury analyzer, were employed to detect various heavy metal concentrations, further enhancing the rigor and reliability of the study. The fndings of this study contribute to a deeper comprehension of the health risks linked to consuming heavy metals in dried fish, thereby offering valuable insights for establishing regulatory measures to ensure food safety. Nevertheless, it is important to acknowledge the limitations of this study. Firstly, there is a lack of data regarding the daily intake of the fve types of dried fsh consumed by residents in Guangzhou. The daily intake of dried fsh considered in this study is an average estimation derived from the daily consumption of dried squid and dried octopus in China. In China, the intake of fsh and shrimp, particularly fsh, constitutes a signifcant proportion of aquatic product consumption [\[55,](#page-16-2) [56\]](#page-16-3). Consequently, we surmise that based on this dietary habit the daily intake of dried fsh may exceed that of dried squid and dried octopus in China. This implies that the actual health risks from consuming dried fsh might be higher, necessitating attention. Additionally, it is important to note that the detection of heavy metal levels in dried fsh and risk assessment, as conducted in this study, does not precisely depict the absorption and metabolism of these heavy metals in the human body. Not all ingested heavy metals are absorbed; the bioaccessibility of heavy metals such as Pb, As, Cd, and Cr is also related to the intake of various nutrients [\[57](#page-16-4)]. Essentially, the biological availability of heavy metals within the human body was not explored, nor were individual diferences considered. For instance, age diferences, aside from the gender diferences we focused on, can also afect intake through dietary habits. More importantly, diferent age groups exhibit varying sensitivities to heavy metals. For example, children are typically at a higher risk of health hazards, which deserves attention [\[58](#page-16-5)]. Furthermore, the uncertainties and variabilities inherent in quantitative risk assessment methods should be taken into consideration [[59](#page-16-6)]. Assessing non-carcinogenic and carcinogenic health risks using RfD and CSF seldom considers uncertainties in interspecies extrapolation and human variability, nor does it account for more nuanced dose–response relationships [[60,](#page-16-7) [61\]](#page-16-8). This implies that future improvements in risk assessment methods could be considered, such as employing probabilistic approaches to address these limitations [\[61](#page-16-8)].

Conclusion

In this study, fve heavy metal elements such as Cr, As, Cd, Pb and Hg in five common types of dried fish sold in Guangzhou, China, were measured. The results showed that all the fve elements exceeded the limit, but As exceeding rate is highest. The SPI showed that As was seriously polluted among the fve kinds of dried fsh, and the *dried Nemipterusvirgatus* was the most seriously polluted. The NCPI showed that all the fve kinds of dried fsh were seriously polluted by heavy metals. The comprehensive pollution degree of dried fsh was *dried Nemipterus-virgatus* > *dried Stolephorus chinensis* > *dried Thamnaconus modestus* > *dried river fsh* > *dried Ctenopharyngodon idella*, and the heavy metal pollution degree was As>Cd>Cr>Hg>Pb. The EDI values for various heavy metals in this study are signifcantly below PTDI limits. The ranking of non-carcinogenic and carcinogenic risks associated with the consumption of various dried fsh corresponds to the order of the comprehensive pollution degree. The non-carcinogenic risk of As in *dried Nemipterus-virgatus*, *dried Stolephorus chinensis* and *dried Thamnaconus modestus* in female intake and *dried Nemipterusvirgatus*, *dried Stolephorus chinensis* in male intake may occur. As in male and female intake of *dried Stolephorus chinensis*, *dried Thamnaconus modestus*, *dried Nemipterusvirgatus* and *dried river fsh* may cause carcinogenic risk. However, other heavy metals have shown minimal health risks in terms of non-carcinogenic and carcinogenic efects. It should be noted that due to disparities in average weight and life expectancy, women face higher non-carcinogenic and carcinogenic risks compared to men. Attention should be given to reducing the intake of dried fsh and enhancing regulatory supervision.

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Data Availability No datasets were generated or analysed during the current study.

Declarations

Competing Interests The authors declare no competing interests.

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