

1 **Assessing temporal shifts in trophic diversity in fish assemblages after the Fundão dam**
2 **collapse**

3 Patrícia Santos Fráguas^a, Débora Reis de Carvalho^{b,c}, Frederico Fernandes Ferreira^d, Jorge
4 Abdala Dergam^d, Carlos Frankl Sperber^d e Paulo Santos Pompeu^c

5 ^aPrograma de Pós-Graduação em Ecologia Aplicada, Departamento de Ecologia e
6 Conservação, Instituto de Ciências Naturais, Universidade Federal de Lavras, 37203-202
7 Lavras, Minas Gerais, Brazil. psfraguas@yahoo.com.br Corresponding author ORCID: 0000-
8 0002-1340-3488

9 ^bLancaster Environment Centre, Lancaster University, Lancaster, United Kingdom;
10 deboracarvalhobio@gmail.com ORCID: 0000-0001-8997-2145

11 ^cLaboratório de Ecologia de Peixes, Departamento de Ecologia e Conservação, Instituto de
12 Ciências Naturais, Universidade Federal de Lavras, 37203-202 Lavras, Minas Gerais, Brazil.
13 pompeu@ufla.br ORCID: 0000-0002-7938-1517

14 ^dDepartamento de Biologia, Universidade Federal de Viçosa, 36570-000, Viçosa, Minas
15 Gerais, Brazil. ORCID and email: 0009-0006-0341-3830, frederico.fernandes@ufv.br
16 (Frederico Ferreira); 0000-0003-1395-1377, jdergam@gmail.com (Jorge Dergam); 0000-
17 0002-0334-7216, sperber@ufv.br (Carlos Sperber).

18 **Acknowledgements**

19 The authors thank the Fish Ecology Laboratory at Universidade Federal de Lavras -
20 UFLA for the support on laboratory processing. The authors would like to thank the Central of
21 Analysis and Chemical Prospecting of the Universidade Federal de Lavras, and Financiadores
22 de Estudos e Projetos (Finep), Fundação de Amparo à Pesquisa do estado de Minas Gerais
23 (Fapemig), Conselho Nacional de Desenvolvimento Científico e Tecnológico (CNPq) e
24 Coordenação de Aperfeiçoamento de Pessoal de Nível Superior (Capes) for supplying the

1 equipment and technical support for experiments involving isotope analyzes. This study was
2 financed by a contract between Fundação de Amparo à Pesquisa do estado de Minas Gerais
3 (FAPEMIG) and RENOVA Foundation – grant term nº 4800028061; and was financed in part
4 by the Coordenação de Aperfeiçoamento de Pessoal de Nível Superior (CAPES) - Finance
5 Code: 32004010017P3. PSP was granted a research fellowship (302328/2022–0) by Conselho
6 Nacional de Desenvolvimento Científico e Tecnológico (CNPq).

7 **Abstract**

8 The rupture of the Fundão dam stands as one of the most significant environmental disasters of
9 its kind on a global scale, profoundly affecting the aquatic ecosystem of Doce River Basin. By
10 employing stable isotopes of carbon and nitrogen, we were able to trace matter and energy flow
11 within ecosystems. In this study, we assessed the spatial and temporal variation, between 2020
12 and 2022, in species richness and trophic diversity in areas exposed (along a gradient in the
13 main channel of the river) or unexposed (control sites in tributaries systems) to the mine ore
14 tailings in the Doce River Basin. We tested the hypothesis that tailings reduce species richness;
15 and that trophic stability is negatively affected by mining tailings. To estimate trophic stability
16 for each sampling site, we calculated the Standard Ellipse Area (SEA), and six community-
17 wide metrics based on stable isotopes. The three regions studied presented distinct patterns on
18 trophic diversity. Control sites exhibited stability in trophic metrics over time. Affected regions
19 close to the rupture of the dam exhibited significant fluctuations on all six community-wide
20 metrics analyzed than the affected regions farther from the rupture.-Sites close to the rupture
21 exhibited lower species richness, affecting mainly herbivores and piscivores. Our findings show
22 the potential of using the isotopic approach in monitoring the ecological recovery of impacted
23 ecosystems.

24 **Keywords: Ichthyofauna; Stable Isotopes; Carbon; Nitrogen**

1 **Introduction**

2 The breach of the Fundão Dam in the city of Mariana, Minas Gerais, Brazil, in
3 November 2015, released approximately 66 million cubic meters of iron ore tailings into the
4 watercourses downstream of its location (Governo do Estado de Minas Gerais, 2016). The iron
5 ore tailing tide flowed into the Gualaxo do Norte, Carmo and Doce rivers, contaminating a
6 stretch of over 650 km of the Doce River until its mouth in the city of Linhares on the coast of
7 Espírito Santo (ANA, 2016). It also affected estuarine, marine, and coastal environments
8 (Carmo et al., 2017). This event is considered one of the largest environmental disasters of its
9 nature worldwide (Garcia et al., 2017; Hatje et al., 2017; Yamamoto, Pauly, et al., 2023). In
10 addition to its impact on aquatic environments, the iron ore tailings and associated sediments
11 affected an area of 1,176 ha (Omachi et al., 2018), suppressing most of the riparian vegetation
12 in the vicinity of the breach (Fernandes et al., 2016) and directly impacting 457.6 ha of the
13 Atlantic Forest (Omachi et al., 2018). The riverbed morphology was abruptly altered by the
14 swift movement of these mining residues (Santos et al., 2019), leading to deposits in floodplains
15 as well (Carmo et al., 2017).

16 In the aquatic fauna, the impacts of the Fundão Dam breach were immediate and
17 extensive. The tailings caused massive mortality of fish (Governo do Estado de Minas Gerais,
18 2016), reduced the abundance of native species and increased that of non-native species, as well
19 as altered the composition of fish (Salvador et al., 2022). The tailings further affected the growth
20 of algae and microcrustaceans (Vergilio et al., 2021), microbial communities (Cordeiro et al.,
21 2019), fish larvae (Bonecker et al., 2019), altered the niche of estuarine species (Andrades et
22 al., 2020), reduced the genetic diversity of estuarine and marine fish (Biasi et al., 2023), and
23 induced accumulation and stress responses due to heavy metal exposure in fish (Ferreira et al.,
24 2020; Vergilio et al., 2021; Yamamoto, Onishi, et al., 2023). The disruption of these diverse
25 communities may result in changes in resource availability, impacting the trophic web and

1 energy flow within these systems (de Carvalho et al., 2024). Such changes have been
2 documented in the literature using stable isotopes, albeit for impacts of a different nature, such
3 as domestic and industrial sewage inputs (de Carvalho et al., 2020, 2021), land-use changes
4 (Carvalho et al., 2015, 2017), and gradients of anthropogenic alterations in the environment
5 (Horka et al., 2023; Medina-Contreras et al., 2021; Wang et al., 2021). Stable carbon (^{13}C) and
6 nitrogen (^{15}N) isotopes are valuable tools for elucidating energy flow within trophic webs
7 (Finlay, 2001; Peterson and Fry, 1987). The nitrogen composition of organisms may be used as
8 an indicator of trophic position (Fry, 2006; Post, 2002), as an approximate increase of 2.9‰ in
9 the nitrogen values of consumers at each trophic level is expected (McCutchan et al., 2003). In
10 contrast, the carbon composition exhibits minimal variation across trophic levels, making it a
11 useful indicator of primary energy sources sustaining organisms, given the distinct carbon
12 values of different resources (Fry, 2006; Post, 2002).

13 Isotopic ecology provides precise means to trace major material and energy flows (Fry,
14 2006; Zanden and Rasmussen, 2001). However, rivers are environments prone to significant
15 fluctuations (Palmer and Ruhi, 2019; Poff et al., 1997) which may be caused by natural seasonal
16 or interannual changes unrelated to anthropogenic impacts. Therefore, studies assessing
17 temporal changes putatively caused by a disturbance, such as the breach of the Fundão tailings
18 dam, should seek to identify naturally stable patterns of parameters in these environments.
19 These parameters should only undergo alterations in scenarios of ecological restructuring, for
20 instance, during the recovery phase of a river following a major disturbance.

21 To evaluate trophic diversity changes in communities, metrics proposed by Layman and
22 colleagues (Layman et al., 2007) have been applied, along with the assessment of niches using
23 the standard ellipse areas (Jackson et al., 2011). These tools have been utilized to indicate
24 anthropogenic impacts in watercourses (e.g. de Carvalho et al., 2020). The effects on trophic
25 diversity and niche breadth are unpredictable, as both a decrease (Wang et al., 2021) and an

1 increase (de Carvalho et al., 2020, 2021) have been observed. This variation may be attributed
2 to the magnitude and type of impact to which aquatic environments are exposed.

3 Following the Fundão Dam breach, differences in the trophic niches of fish were
4 observed in both freshwater (Calais et al., 2024; da Silva et al., 2024; de Carvalho et al., 2024)
5 and estuarine environments (Andrades et al., 2021). Conversely, by using a set of reference
6 conditions within the same basin, it was noted that while certain fish species might exhibit
7 fluctuations in their isotopic signatures, parameters associated with community niche, such as
8 the range of carbon and nitrogen values, as well as the distances between species in the isotopic
9 niche, remained stable (Fráguas et al., unpublished results). Therefore, these parameters are
10 potentially informative to indicate historical changes in river conditions (Fráguas et al.,
11 unpublished results).

12 Previous studies indicate that following the collapse of the Fundão dam, significant
13 transformations in the fish fauna occurred, primarily associated with the presence of non-native
14 species (da Silva et al., 2024; Petesse et al., 2023; Salvador et al., 2022), which can be reflected
15 in the food web structure (de Carvalho et al., 2024) and trophic diversity (da Silva et al. 2024).
16 Assessing the impacts on biota is crucial for the development and implementation of effective
17 recovery strategies for degraded areas. Thus, this study aims to assess the temporal variation in
18 species richness and trophic diversity of the fish assemblage following the breach of the Fundão
19 ore tailings dam in the Doce River Basin. Based on two distinct years of sampling, at sites
20 exposed and unexposed (control sites) to the iron ore tailings, we tested the following
21 hypotheses: 1) tailings reduce species richness. We therefore expect that species richness will
22 be higher in the second year of sampling in impacted regions and remain relatively stable
23 between the two years in control sites. Among the impacted regions, since areas closest to the
24 breach were the most affected, they will exhibit lower species richness. 2) trophic stability is
25 affected by mining tailings. If there are indications of recovery of trophic stability in the Doce

1 River, these will be more evident further away from the breach site. Therefore, we predict that
2 trophic diversity metrics will remain stable in control regions; impacted regions will be more
3 unstable close to the rupture and less unstable farther from the breach. Through our results, we
4 expect to evaluate whether there was a discernible pattern in the modification of isotopic
5 structure following tailings impact, and thus assess whether trophic diversity metrics can be
6 applied as a tool for monitoring conditions in the Doce River Basin.

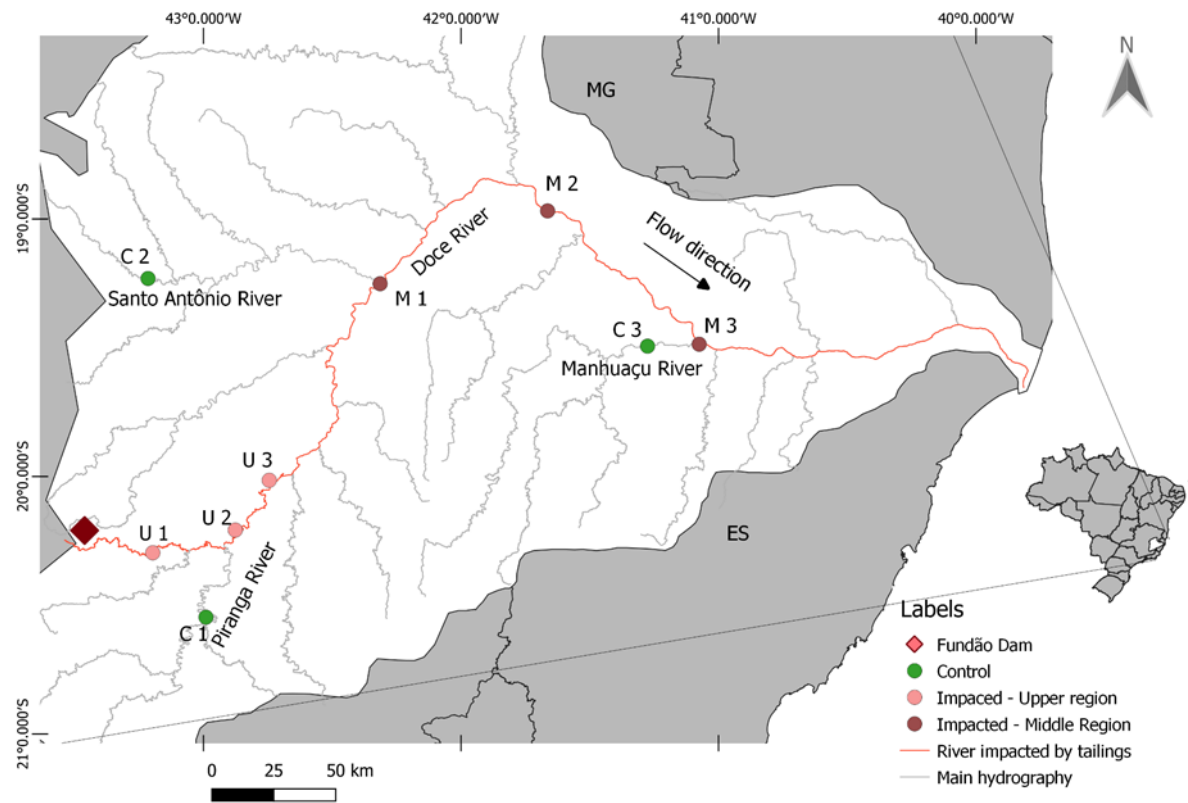
7 **Methodology**

8 Study Area

9 The Doce River Basin encompasses an area of 83,431 km², located entirely within
10 Brazil, spanning the states of Minas Gerais (86%) and Espírito Santo (14%) (ANA, 2016). The
11 main river course is formed by the confluence of the Piranga and Carmo rivers, covering a
12 distance of 888 km until it reaches the estuary at the Atlantic Ocean (ANA, 2005, 2016). The
13 predominant climate in the region is humid tropical (Coelho, 2009). The Doce River basin can
14 be divided into three regional units: Upper, Middle, and Lower Doce River. The Upper Doce
15 River region encompasses the headwaters of the Doce River up to the mouth of the Matipó
16 River. The Middle Doce River segment includes areas downstream from the Matipó River
17 mouth to the border between the states of Minas Gerais and Espírito Santo. The Lower Doce
18 River comprises areas downstream from the Mascarenhas Hydroelectric Plant to the estuary at
19 the Atlantic Ocean (PIRH – Doce, 2010). The rainfall pattern is well-defined, with a dry season
20 from April to September and a rainy season from October to March. The majority of the basin
21 is situated in the Atlantic Forest biome (98%), with the remaining portion in Cerrado areas
22 (ANA, 2016).

23 Our sampling design includes nine sampling sites distributed across areas exposed (six
24 sites) and unexposed (three sites) to the iron ore tailings from the Fundão dam. The six exposed

1 sites are located in the Doce River gradient, flowing from the area close to the dam breach to
2 the river mouth. Three of them are located in the upper course (U1, U2, and U3) and three are
3 in the middle course (M1, M2, and M3). Due to the widespread impact of tailings on the
4 majority of the Doce River, it is not feasible to select control sites within the main river channel.
5 In the absence of isotopic characterization of the fish fauna prior to the dam failure, baseline
6 data for this river are also unavailable. Consequently, the only viable approach to represent pre-
7 dam failure conditions is through sampling in tributaries. To account for the environmental
8 variability across the river basin, tributaries were strategically selected from different regions,
9 specifically the upper and middle sections of the basin. The three unexposed sites are tributaries
10 and were considered as negative control sites represented by the rivers Piranga (C1), Santo
11 Antônio (C2) and Manhuaçu (C3). The first two sites (C1 and C2) are situated in the upper
12 region of the Doce river basin. The Piranga River basin covers an area of 6,606 km², where
13 livestock farming is the predominant activity (IGAM, 2010b). The Santo Antônio River basin
14 spans an area of 10,429 km², with the majority of it within the Atlantic Forest biome and a small
15 portion in the Cerrado biome. This sub-basin is the best preserved among those that comprise
16 the Doce river basin (IGAM, 2010c). The Manhuaçu River (C3) is located in the middle Doce
17 river region. This basin covers an area of 8,826 km², where agro-pastoral activities are prevalent
18 (IGAM, 2010a). Anthropogenic pressures in these three regions are primarily associated with
19 the inefficient treatment of domestic effluents and the inadequate disposal of solid waste (Figure
20 1).



1

2 **Fig. 1** Study area with nine sampling sites distributed along the Doce River Basin in the state
 3 of Minas Gerais, Brazil. C = Control, U= Upper course, M= Middle course.

4 Data Collection

5 To evaluate the temporal variability in fish trophic diversity metrics, the nine sites were
 6 sampled during two dry seasons, in 2020 (July/August), and in 2022 (July/August/September).

7 Fish Collection

8 Fish collection was conducted with complimentary sampling methodologies using gill
 9 nets, trawls, and sieve nets. Gill nets (mesh size 3-16 cm, length 20 m) were continuously
 10 exposed for 14 hours at each sampling site. Trawls (5 m length, mesh size 1 mm) were employed
 11 in shallow and littoral areas. Sieves (diameter 80 cm, mesh size 1 mm) were utilized in
 12 macrophyte beds near the shore. Sieves and trawls were deployed for approximately 2 hours in
 13 each sampling site. In the field, collected fish were measured, weighed, and identified. A sample
 14 of muscle tissue was obtained from each individual in the field and immediately frozen until

1 the laboratory processing to prevent decomposition. At least one individual from each collected
2 species was isotopically analyzed. Stable isotope analyses were conducted for up to five
3 individuals of each species at each sampling site.

4 All collection procedures were authorized by SISBIO – Biodiversity Authorization and
5 Information System – N°. 10327-3, and the Animal Ethics Committee of UFLA (CEUA –
6 UFLA), N°. 034/21.

7 Sample Processing

8 In the laboratory, fish tissue samples were lyophilized for 24 hours, ground into a
9 uniform powder, and stored in Eppendorf tubes. Following sample preparation, the samples
10 were sent for isotopic analysis. In 2020, the samples were analyzed at *Centro de Energia*
11 *Nuclear na Agricultura* (CENA) at the *Universidade de São Paulo* (USP). In 2022, the samples
12 were sent to the *Central de Análises e Prospecção Química* (CAPO) of the *Universidade*
13 *Federal de Lavras* (UFLA). The fish samples were weighed (1000 µg) in tin capsules (5 mm
14 x 8 mm). After weighing, to determine the isotopic composition of Carbon and Nitrogen in the
15 samples, the capsules were introduced via an automatic sampler into the elemental analyzer.

16 Isotopic Analysis

17 To determine the isotopic ratio in 2020, we used a continuous-flow isotope ratio mass
18 spectrometer (CF-IRMS) with a Carlo Elba analyzer coupled to a Delta Plus mass spectrometer
19 (Thermo Scientific). In the second sampling, in 2022, we used a Delta V Plus Isotope Ratio
20 Mass Spectrometer (Thermo Fisher) coupled with a Flash IRMS elemental analyzer interfaced
21 with ConFlo IV. The results were obtained by using Isodat 3.0 and are expressed as relative
22 differences in international reference systems, using the delta (δ) notation, in parts per thousand
23 (‰), and calculated using the following formula: $\delta X = [(R_{\text{sample}}/R_{\text{standard}}) - 1] \times 10^3$,
24 where X is ^{13}C or ^{15}N , and R is the isotopic ratio $^{13}\text{C}/^{12}\text{C}$ or $^{15}\text{N}/^{14}\text{N}$ (Barrie and Prosser, 1996).

1 Statistical Analysis

2 Differences in species richness among the three studied regions and between the
3 collection years for each region were tested using Generalized Linear Models (GLM) with
4 Poisson distribution, overdispersion was checked for the analysis. We ran the models using the
5 MuMIn package (Bartón, 2023). We implemented a hierarchical model classification using the
6 dredge function, and model selection was carried out using the Akaike Information Criterion
7 (AIC). We chose models that had the AIC value of ≤ 2 . We also tested the interaction between
8 years and regions, but since no model had the AIC ≤ 2 , data are not presented here.

9 To assess differences in isotopic niches between impacted and control sites in the two
10 sampling periods, we employed the Standard Ellipse Area (SEA). SEA represents the isotopic
11 niche and illustrates the richness and uniformity of resources consumed by the fish assemblage
12 (Bearhop et al., 2004). The graphical representation of ellipse areas was performed using the
13 SIBER package (Jackson et al., 2011) in the R program. To increase the accuracy of
14 comparisons, a sample size correction was used, noted by the subscript “c”. Using SEA_c, it is
15 possible to compare the niches of populations with different sample sizes (Jackson et al., 2011).
16 The percentage of niche overlap (where 100% represents total overlap), serves as a quantitative
17 metric of diet similarity among species (Hill et al., 2015). Differences in the percentage of niche
18 overlap between 2020 and 2022 were tested using Generalized Linear Models (GLM) with
19 binomial distribution. GLM analyses were conducted in the R software (R Core Team, 2024)
20 using the MuMIn package (Bartón, 2023).

21 Trophic diversity in the two sampling periods was evaluated using metrics proposed by
22 Layman (2007), which were restructured by the Bayesian method for community comparisons
23 (Jackson et al., 2011). These metrics were then calculated using the SIBER package (Jackson
24 et al., 2011) in R. The first four metrics provide information about the overall community

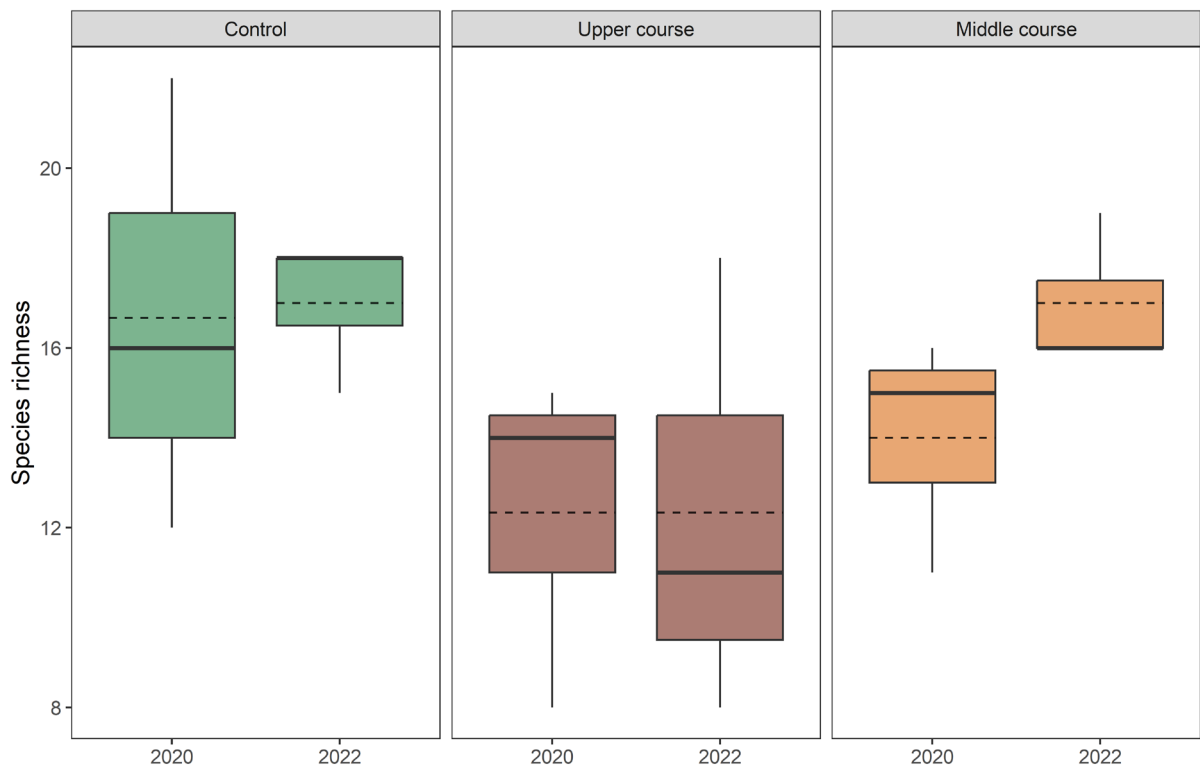
1 spacing in the biplot space ($\delta^{13}\text{C}$ and $\delta^{15}\text{N}$). Carbon range (CR): carbon amplitude used by
2 species reflecting the resources that are assimilated by the fish assemblage – measures the
3 distance between the species that have the most enriched and most depleted $\delta^{13}\text{C}$ values;
4 Nitrogen range (NR): nitrogen amplitude used by species representing the variation in trophic
5 levels – measures the distance between the species that have the most enriched and most
6 depleted $\delta^{15}\text{N}$ values; Total area (TA): is the convex hull area occupied by all the species in
7 isotopic space; Centroid distance (CD): a measure of trophic diversity – it is the average
8 Euclidian distance of each species to the C or N centroid. The last two metrics indicate the
9 relative positions in the niche space and act as proxies for trophic redundancy: Mean nearest
10 neighbor distance (MNND): a measure of trophic redundancy – it is the mean of the Euclidean
11 distances to each species' nearest neighbor in the biplot space; Standard deviation of the nearest
12 neighbor distance (SDNND): represents the distribution of fish community trophic niches and
13 is less influenced by sample size than MNND. We used collections (2020 and 2022) as our
14 temporal scale and sampling regions (control, upper, and middle) as our spatial scale to
15 calculate the trophic diversity metrics. Trophic diversity metrics were calculated for both
16 collections (2020 and 2022). We also present the values of trophic diversity metrics for each
17 region (control, upper, and middle course) in a boxplot graph presenting the subtraction of the
18 values of 2022 by the values of 2020 to assess the variation in metrics over time.

19 To assess changes in the set of metrics as a means of portraying the trophic diversity of
20 the fish assemblage, we performed a Principal Component Analysis (PCA) combining all
21 metrics. To evaluate data dispersion within each group in the PCA, we performed a Permdisp
22 analysis in the PRIMER program (Clarke and Gorley, 2006).

23 **Results**

24 A total of 953 individuals representing 65 species were analyzed. We sampled 496
25 individuals from 50 species in 2020, and 457 individuals from 55 species in 2022. Of these, 40

1 species were present in both samplings, 10 were collected only in 2020, and 15 occurred only
 2 in 2022 (Table 1). Species richness differed among the evaluated regions ($z = -2.03$, $p = 0.04$),
 3 with the upper region having lower species richness. Even though the middle region showed
 4 higher species richness in the second sampling year, there was no variation in richness between
 5 sampling years ($p > 0.05$) (Figure 2).



6

7 **Fig. 2** Species richness in each region of the basin (Control, Upper, and Middle courses) in the
 8 two collection years (2020 and 2022). Line inside the box: median (second quartile), lower and
 9 upper limits of the box: first and third quartiles, whiskers = 1.5 x IQR (Inter Quartile Range),
 10 dashed line = mean.

11

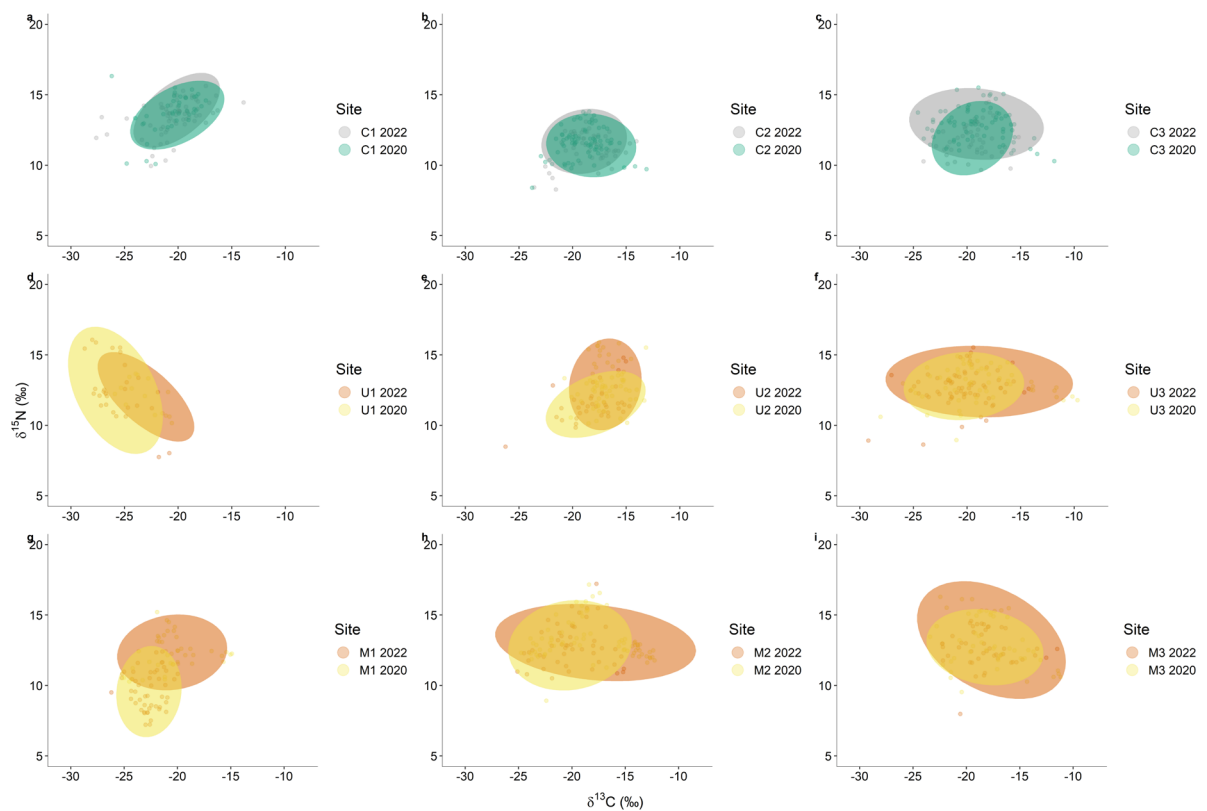
12

Table 1: Number of samples of each species collected at each site in the two collection years. The * indicates non-native species in the Doce River basin. C = Control, U= Upper course, M= Middle course.

Species	2020									2022									
	C1	C2	C3	U1	U2	U3	M1	M2	M3	C1	C2	C3	U1	U2	U3	M1	M2	M3	
<i>Astyanax lacustris</i>	3	4	10	2	19	8	6	13	7	-	4	2	5	3	4	8	5	5	5
<i>Astyanax</i> sp.										-	6		1						
<i>Astyanax taeniatus</i>										-			6						
<i>Australoheros facetus</i>				1						-									
<i>Brycon dulcis</i>						1				-									
<i>Brycon opalinus</i>		6								-									
<i>Characidium</i> cf. <i>krenak</i>										-		1							
<i>Characidium timbuiense</i>		3								-									
<i>Cichla kelberi</i> *			3							-									3
<i>Cichla monoculus</i> *			1							-									
<i>Clarias gariepinus</i> *			1			1				-					1	1			1
<i>Coptodon rendalli</i> *			1		5	5		11		-				5					
<i>Crenicichla lacustris</i>			2							-		1	1						
<i>Crenicichla lepidota</i> *									6	-									2
<i>Cyphocharax gilbert</i>						1				-			2						
<i>Delturus carinotus</i>	1	3	4							-	5	2							
<i>Deuterodon</i> cf. <i>intermedius</i>			7				5			-									
<i>Euryochus thysanos</i>										-		5							
<i>Geophagus brasiliensis</i>	6	11	10	1	2	6		8		-	7	5	5	5	1			4	1
<i>Gymnotus</i> aff. <i>carapo</i>										-									1
<i>Gymnotus sylvius</i>	3		3			1			2	-									1
<i>Harttia loricaformes</i>										-			1						
<i>Hasemania</i> cf. <i>nana</i>				1						-					5				
<i>Henochilus wheatlandii</i>		5								-		2							
<i>Hisonotus</i> sp.										-			3				1	1	

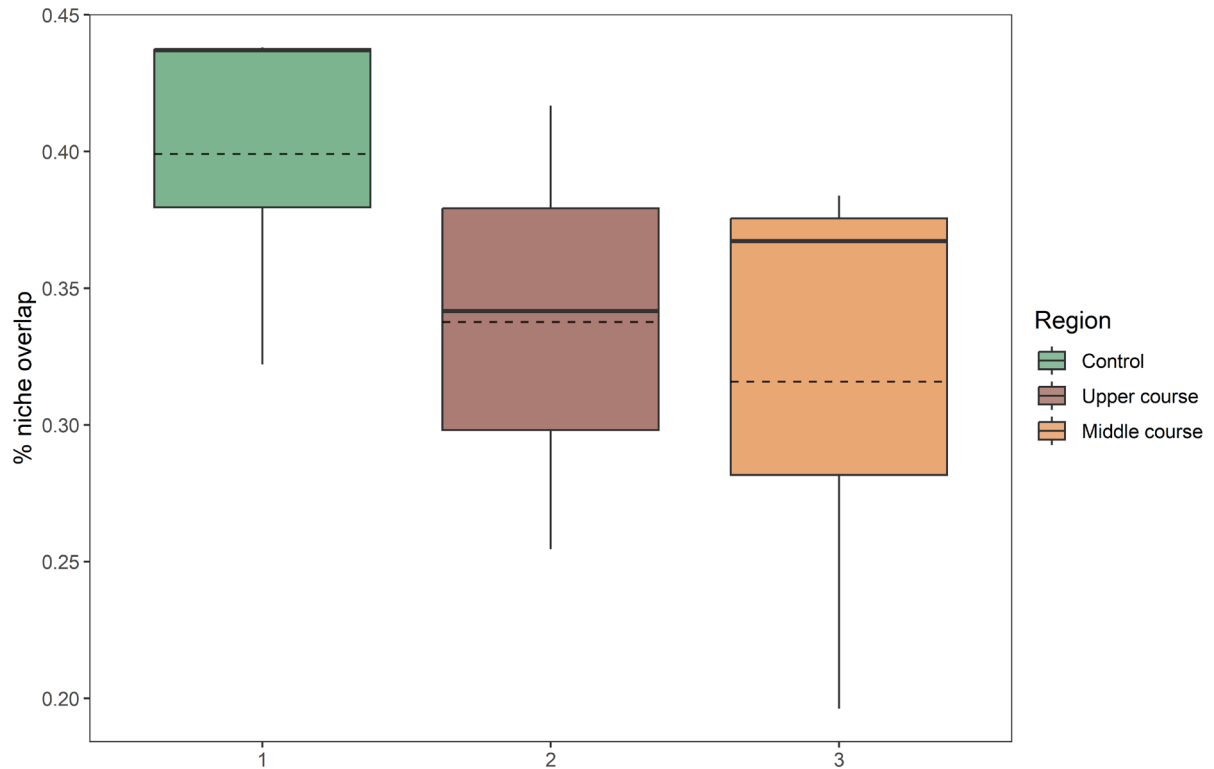
<i>Salminus brasiliensis</i> *				1	1	-				2			
<i>Serrapinnus heterodon</i>			2			-		1		5	6	1	
<i>Synbranchus marmoratus</i>						2						1	
<i>Trachelyopterus striatulus</i>		2				1							4
<i>Trichomycterus alternatus</i>	6					-	5		6			2	
<i>Trichomycterus astromycterus</i>				1		-				6			
<i>Trichomycterus</i> cf. <i>immaculatus</i>						-				5	1		
<i>Trichomycterus</i> cf. <i>ipatinga</i>						-				5			
<i>Trichomycterus</i> sp.			1	3		-			2				
<i>Trichomycterus tantalus</i>						-	1	1					

1 When comparing the isotopic niche of each sampling site between the two years, it was
 2 observed that the control sites, especially C1 and C2, exhibited little variation. In contrast,
 3 several impacted sites, both in the upper (U1 and U2) and middle courses (M1), showed
 4 divergent niches between years. However, the differences in niche overlap were not significant
 5 among the three evaluated regions (AICc = 10.3 delta = 0.00 weight 1) (Figures 3, 4 and Online
 6 resource).



7

8 **Fig. 3** Ellipse Area (Standard Ellipse Area - SEA - calculated using a 95% confidence interval)
 9 representing the niches of fish assemblages at each sampling site in Doce river basin. Light
 10 green ellipses represent assemblages from control sites in 2020 and dark green in 2022. Orange
 11 ellipses represent assemblages from impacted sites in 2020, and red ellipses represent those in
 12 2022.



1

2 **Fig. 4** Boxplot depicting the percentage of niche overlap between 2020 and 2022 for the three
 3 analyzed regions. No differences were observed among regions and years. Lines within the box:
 4 full line = median (second quartile) and dashed line = mean; lower and upper limits of the box:
 5 first and third quartiles, whiskers = 1.5 x IQR (Inter Quartile Range).

6

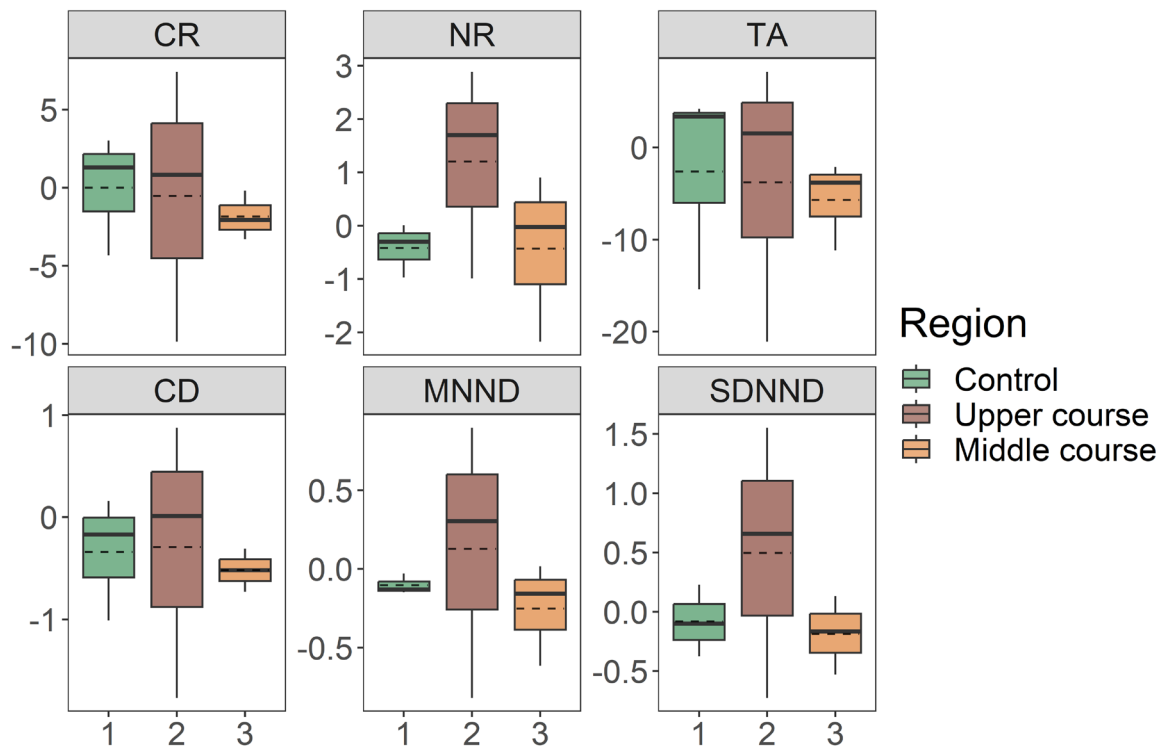
7 The trophic diversity metrics were calculated for both collection years (Table 2). By
 8 subtracting the values of the metrics obtained in 2022 from those recorded in 2020, it was
 9 possible to assess the variation of each metric over time (Figure 5). For most evaluated metrics,
 10 the variation of values between the years in the control region was very close to zero, indicating
 11 stability throughout the study assessed period. Meanwhile, the greatest variation in trophic
 diversity metrics was observed in the upper region (Figure 5).

12 **Table 2:** Layman's metrics for the years 2020 and 2022. CR = Carbon range, NR = Nitrogen
 13 range, TA = Total area, CD = Centroid distance mean, MNND = Mean nearest neighbor
 14 distance, SDNND = Standard deviation of the nearest neighbor distance.

	C1	C2	C3	U1	U2	U3	M1	M2	M3	Year
CR	6.05	5.16	9.72	3.94	3.54	17.23	8.13	10.64	9.15	2020
	9.08	6.46	5.39	4.78	10.97	7.35	4.84	8.57	8.97	2022
NR	4.91	3.96	4.26	3.00	3.75	4.04	3.84	4.52	5.74	2020
	3.94	3.67	4.27	5.88	5.45	3.05	4.74	4.49	3.56	2022
TA	14.60	11.69	27.00	8.27	8.02	33.94	15.05	26.83	29.94	2020

	C1	C2	C3	U1	U2	U3	M1	M2	M3	Year
CD	17.95	15.85	11.62	9.79	16.22	12.86	12.93	23.01	18.77	2022
	2.06	1.62	2.63	1.75	1.48	3.57	1.74	2.91	2.86	2020
MNND	1.90	1.77	1.62	1.77	2.36	1.80	1.43	2.18	2.34	2022
	0.82	0.66	0.79	0.93	0.54	1.39	1.27	0.91	1.22	2020
SDNND	0.67	0.63	0.66	1.24	1.44	0.57	0.65	0.92	1.07	2022
	0.54	0.61	0.47	0.55	0.28	1.01	1.06	0.43	0.61	2020
	0.76	0.23	0.37	1.21	1.83	0.28	0.54	0.56	0.44	2022

1



2

3 **Fig. 5** Boxplot of the subtraction of Layman's metrics values between the years 2022 and 2020
4 for the fish assemblage sampled in Doce river basin. CR = Carbon range, NR = Nitrogen range,
5 TA = Total area, CD = Centroid distance, MNND = Mean nearest neighbor distance, SDNND
6 = Standard deviation of the nearest neighbor distance. Line inside the box: median (second
7 quartile), lower and upper limits of the box: first and third quartiles, whiskers = 1.5 x IQR (Inter
8 Quartile Range), dashed line = mean.

9

The first two axes of the PCA explained 84.78% of the variation (58.91% on axis 1 and

10

25.87% on axis 2) in Layman's metrics. Overall, trophic diversity represented by Layman's

11

metrics was more similar among control sites. The middle course sites were closer to the control

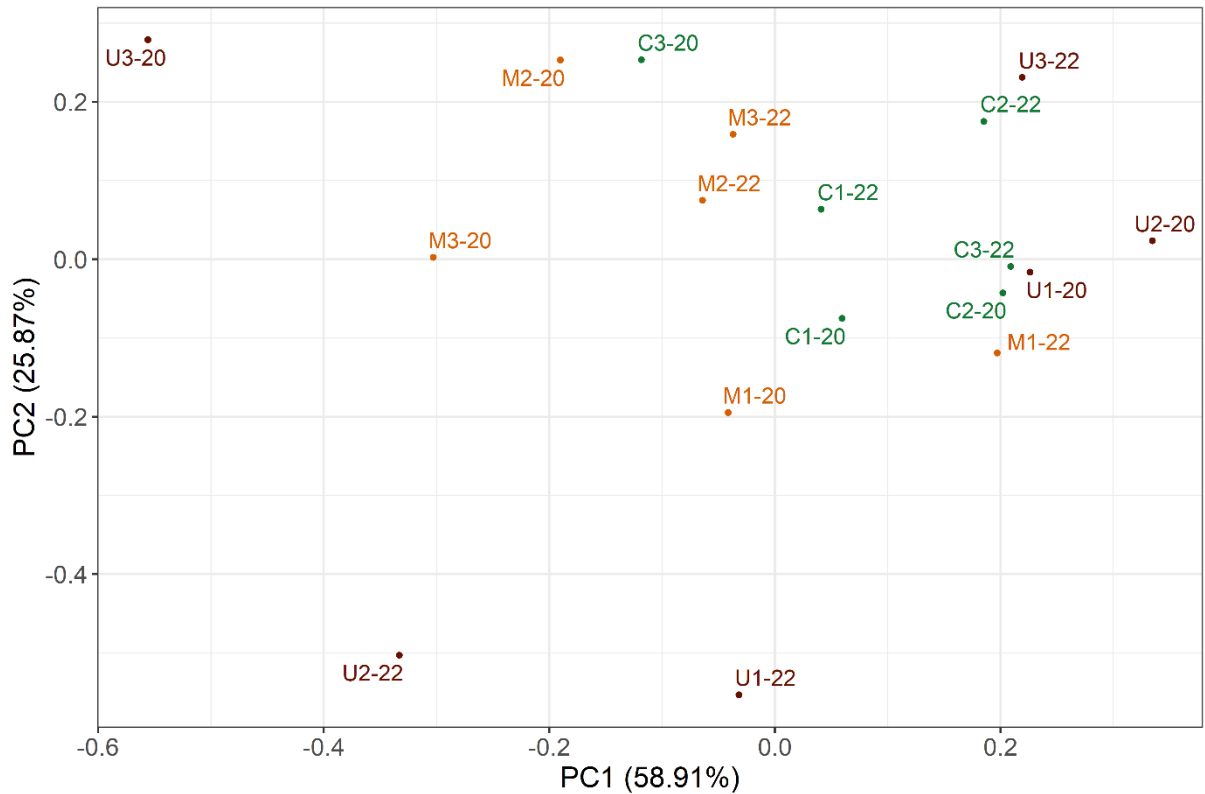
12

sites in terms of metrics compared to the upper course sites. The most affected sites, in the

13

upper course, were more distinct from each other in terms of trophic diversity metrics (Figure

- 1 6). Region ($p = 0.001$) played a more significant role in shaping the trophic diversity of the fish
 2 assemblage (Table 3).



3

- 4 **Fig. 6** Principal Component Analysis (PCA) of Layman's metrics between the collection years
 5 2020 and 2022 for the fish assemblage sampled in Doce river basin. Control sites (C1, C2, C3);
 6 Upper Course (U1, U2, U3) and Middle Course (M1, M2, M3). Sampling year 2020 was
 7 represented by the number 20, while 2022 was represented by the number 22.

- 8 **Table 3:** Comparison of data dispersion related to Layman's metrics between years, regions,
 9 and their interaction (PERMDISP).

Variables	F	P
Region	12.11	0.001
Year	0.922	0.434
Region + Year	4.52	0.126

10 Discussion

- 11 Our results provide insight into the spatial variation in both species richness and trophic
 12 diversity in a basin significantly impacted by anthropogenic activities, such as the Rio Doce
 13 basin. Regarding trophic diversity metrics, our hypothesis was fully confirmed, as our findings
 14 highlight distinct patterns across the three regions studied. The control sites remained stable

1 across both years, whereas the upper course region was highly unstable, with great variation on
2 trophic diversity metrics. The overall trophic diversity of the middle course region was similar
3 to that observed in the control sites. Species richness also exhibited spatial variation. The
4 control sites showed a higher average of species richness in both samplings, while sites closest
5 to the tailings dam rupture exhibited lower species richness. Regarding temporal variation, our
6 hypothesis was partially confirmed, as species richness did not increase in the second year of
7 sampling in impacted regions. No significant differences in the temporal niche overlap were
8 observed among the three regions.

9 Analyzing the trophic diversity metrics of the community reveals distinct trends in the
10 three regions. The control sites, even if geographically distant, exhibit a similar pattern. In
11 contrast, impacted sites, despite being geographically close, are much more unstable over the
12 two years, showing significant variations in trophic diversity metrics. This suggests that even
13 seven years after the dam rupture, the impacts on the trophic structure of the fish assembly are
14 still considerable. Regions closer to the rupture show greater instability in their trophic
15 structure. A study of *Knodus moenkhausii*'s diet in the Doce River Basin also found that the
16 species' diet was also most distinct in the most impacted areas compared to other sites (Paiva et
17 al., 2024). Regions that were farther from the rupture, although also undergoing changes, tend
18 to exhibit smaller variations than those observed in sites closer to the impact. Recent surveys
19 indicate that most non-native species present in the basin before the dam rupture are still found
20 in the Doce River channel, in addition to other non-native species that began to occur in the
21 area after the Fundão dam rupture (Petesse et al., 2023). The growing number of non-native
22 species highlights their capacity for establishment even under adverse conditions. One of the
23 factors associated with invasion success is trophic plasticity (Tonella et al., 2018), in which
24 species can adjust their diet to the availability of feeding resources in the new environment,
25 which may be reflected in the niche space occupied by the fish community. Studies conducted

1 five years after the Fundão dam collapse indicate that non-native fish species occupy broader
2 isotopic niches than native species, often assimilating a range of carbon not exploited by other
3 species (da Silva et al. 2024). Adding this type of impact to the basin, these highly unstable
4 areas may favor non-native species over native species in the region, justified by the greater
5 niche breadth of non-native species. This, in turn, may further increase the pressure on the
6 region's native biota.

7 The impacted region, particularly the upper course of the Doce River, exhibited
8 substantial variation in all metrics' breadth. Regarding the variation in trophic redundancy
9 (MNND), substantial fluctuations in carbon and nitrogen amplitudes may reflect variations in
10 available resources at these sites, consequently reducing trophic redundancy in these regions.
11 Pollution-affected sites in the neighboring basin, the Velhas River Basin, showed elevated
12 MNND values (indicative of decreased trophic redundancy) (de Carvalho et al., 2020). In
13 contrast, Andrades et al. (2020) observed an opposite pattern in the estuarine regions of the
14 Doce River. However, their study was conducted less than a year after the impact, which may
15 explain the abrupt decline in resource availability, affecting all trophic diversity metrics.

16 The nitrogen range in the upper course exhibited considerable variations, indicating high
17 instability in the trophic structure of these communities, suggesting variations in trophic levels,
18 or enrichment of basal resources, which would be reflected in fish ^{15}N values (Carvalho et al.,
19 2020). An increase in nitrogen range was observed for estuarine communities in the Doce River
20 following the dam rupture (Andrades et al., 2020). The authors hypothesize that nitrogen-
21 enriched waters due to the use of ester-amines in the treatment to separate hematite from
22 impurities stored in the dam may be responsible for this increase (Andrades et al., 2020; Santos
23 et al., 2019). It is important to note that in the study conducted in estuarine areas, the nitrogen
24 increase was found by comparing communities before and after the arrival of tailings mud. In
25 our study, we assessed two different periods, both with the presence of tailings. Other

1 hypotheses could also be proposed. This variation found in our study, if related to the presence
2 of top predator species, could be associated with a potential recovery process of this part of the
3 basin. The piscivorous species *Oligosarcus argenteus* and *Hoplias intermedius* were recorded
4 in 2020. In 2022, in addition to the previously mentioned species, *Hoplias malabaricus* and
5 *Oligosarcus acutirostris* were also recorded in the upper part of the basin. Moreover, it is not
6 uncommon to observe an increase in nitrogen in regions under the influence of pollutants,
7 consequently showing changes in the isotopic characteristics of their communities (Carvalho et
8 al., 2020; de Carvalho et al., 2021). A wide nitrogen range was also observed in the isotopic
9 niche of fishes in the lower Doce river basin (de Carvalho et al., 2024), that can be related to
10 the presence of pollutants. The impact of tailings on the abundance and diversity of planktonic
11 and zooplanktonic communities (Bonecker et al., 2022) may have, for example, led to the
12 consumption of non-basal organisms in the food web, resulting in an increase in nitrogen range.
13 For these reasons, the mechanism behind this increase deserves investigation.

14 Differences in species richness along a river are expected, typically exhibiting an
15 increase in richness along a longitudinal gradient from the source to the mouth (Bistoni and
16 Hued, 2002; Oberdorff et al., 1993, 2011). Therefore, the observed differences in richness in
17 the upper and middle course regions and their relation to the dam rupture should be interpreted
18 with caution. Based on several species lists published after the Fundão dam rupture, the richness
19 found in the upper and in the middle courses of the Doce River stretch were estimated as 31,
20 and 66 species respectively (Petesse et al., 2023). In our study, a consistent pattern was observed
21 over both years of sampling: lower species richness in the upper region, 33 species, and higher
22 richness in the middle region with 37 species. The observed difference in the middle section of
23 the basin is likely attributed to the greater number of sampling sites included in the published
24 species lists. It is important to note that control sites showed higher species richness, 44 species,
25 than other regions regardless of the section (upper or middle) in which they were collected.

1 Tributaries unaffected by the rupture may have served as refuges and, following the
2 disturbance, played a role in the recolonization of species in the main channel of the Doce River
3 (Salvador et al., 2022), which underscores the importance of connected, undammed tributaries
4 in river basins.

5 Although impacted sites occupied variable isotopic niche spaces between years, no
6 differences in niche overlap were observed. This lack of variation may be due to the aggregation
7 of sampling sites within regions, as these differences become more evident when analyzed
8 separately, particularly for sites U1 and M1. Following the impact of the rupture, changes in
9 the availability of food resources may have influenced the isotopic niche of species. This
10 alteration was observed in the estuarine regions of the Doce River, where six fish species
11 exhibited a reduction in their isotopic niche due to the decrease in available food resources
12 following the arrival of tailings (Andrades et al., 2020). A decline in the diversity of planktonic
13 communities (Ferreira et al., 2020), estuarine benthic macrofauna (Gomes et al., 2017), and
14 marine macrofauna (Nascimento et al., 2022) has already been reported in areas affected by the
15 rupture. Additionally, changes in the richness and composition of zooplankton communities
16 have been observed (Santos et al., 2022). These organisms play a crucial role in transferring
17 energy to higher trophic levels and serve as important prey for fish (Covich et al., 1999). The
18 shift in the abundance, quality, and availability of basal resources may have been reflected in
19 the alteration of isotopic niches in impacted areas. This pattern was observed for *Knodus*
20 *moenkhausii* studied in the Doce River Basin, where the species consumed more nutritious prey
21 (invertebrates) at control sites compared to impacted sites (Paiva et al., 2024). The increase in
22 the isotopic niche area along the river gradient is also expected according to the River
23 Continuum Concept (Vannote et al., 1980). This pattern was similarly observed in the Rio Doce
24 by Carvalho et al. (2024), underscoring the simplification of the trophic structure and niche
25 breadth at the sites closest to the tailings dam rupture. The substantial variation in isotopic niche

1 compositions across the basin likely reflects the interaction of multiple environmental stressors
2 within the Doce basin (de Carvalho et al., 2024). Other anthropogenic alterations, such as
3 increased nutrient loading in water bodies, also modify species' isotopic niches by altering the
4 availability and quality of food resources (Horka et al., 2023). As observed in streams impacted
5 by a coal mine spill (Medinski et al., 2023), species in the most affected areas exhibited broader
6 isotopic niches. This is likely due to an expansion in the consumption of less nutritious items
7 to compensate for the loss of more nutritious resources that became unavailable following the
8 disturbance (Medinski et al., 2023).

9 In Brazil, less than four years after the Fundão dam rupture, another failure in a mining
10 tailing dam in Brumadinho, caused severe impacts to the Paraopeba river (Vergilio et al., 2020).
11 In the Neotropical region, impacts such as crude oil spills and tailing dams failure have
12 profound and long-lasting consequences for aquatic ecosystems (Azevedo-Santos et al., 2021).
13 Globally, the frequency of dam failures has been increasing (Islam and Murakami, 2021; Otieno
14 and Shukla, 2023). A recent study estimates that in the last century the rate of tailing dam failure
15 has been approximately 3.45 failures per year (Islam and Murakami, 2021). At least 5300 km
16 of river channels and 4950km² of floodplain areas have been impacted by tailing dam failures
17 (Macklin et al., 2023). Over the past 15 years some of the major tailing dams rupture worldwide
18 took place in Magadan (Russia - 2009); Kolontár (Hungary – 2010); Benguet (Philippines –
19 2012); Alberta (Canada – 2013); British Columbia (Canada – 2014); Cananea (Mexico – 2014);
20 Vedanta (India- 2017); Tieli (China – 2020). All of these events resulted in extensive social and
21 environmental impacts (Islam and Murakami, 2021; Lumbroso et al., 2019). In the restoration
22 of environments degraded by mining waste, monitoring trophic diversity metrics over time
23 offers valuable insights into community dynamics. The assessment of these metrics can be an
24 important tool in accessing the effectiveness of restoration programs for these environments.

25 **Conclusion**

1 In this study, we highlight important patterns occurring in the upper and middle regions
2 of the basin, considering that most studies related to the impact have so far been carried out in
3 the estuarine region of the Doce River. The assessment of different regions in the Doce River
4 basin highlighted the stability of control areas, with the stability of trophic diversity metrics
5 serving as a good parameter for indicating better environmental quality. In the affected regions,
6 the significant fluctuations observed indicate that the river is undergoing a transformation
7 process, and regions further from the rupture (middle course) appear to be approaching the
8 trophic diversity observed in control sites. The results presented here illustrate an application
9 of the stable isotope technique, demonstrating its effectiveness in identifying trophic structure
10 patterns and their alterations in response to disturbances caused by dam failures. Such an
11 approach proved particularly interesting since expected responses, such as the eventual increase
12 of species richness in impacted regions during the second year, were not detected. Assessing
13 the extent of damage to aquatic biota is a crucial first step in the recovery process.
14 Consequently, this technique proves to be a valuable tool for monitoring and restoring aquatic
15 environments affected by mining waste.

16 **Declarations**

17 All authors have read, understood, and have complied as applicable with the statement on
18 "Ethical responsibilities of Authors" as found in the Instructions for Authors.

19 **Conflicts of interest**

20 The authors have no relevant financial or non-financial interests to disclose.

21 **Funding**

22 This study was financed by a contract between Fundação de Amparo à Pesquisa do estado de
23 Minas Gerais (FAPEMIG) and RENOVA Foundation – grant term nº 4800028061; and was

1 financed in part by the Coordenação de Aperfeiçoamento de Pessoal de Nível Superior
2 (CAPES) - Finance Code: 32004010017P3.

3 Ethics approval

4 All collection procedures are authorized by SISBIO – Biodiversity Authorization and
5 Information System – N°. 10327-3, and the Animal Ethics Committee of UFLA (CEUA –
6 UFLA), N°. 034/21.

7 Potential reviewers:

8 Júlio Guazzelli Gonzalez

9 Universidade Federal Rural de Pernambuco

10 julio.gonzalez@ufrpe.br

11

12 Alexandra Baeta

13 University of Coimbra

14 asbaeta@ci.uc.pt

15

16 Erival Gonçalves Prata

17 Universidade Federal do Pará

18 erival.gprata@gmail.com

19

20 Mojmír Vašek

21 Biology Centre CAS

22 mojmir.vasek@hbu.cas.cz

23 **References**

24 ANA. (2005). *Diagnóstico Consolidado da Bacia*. [http://www.cbhdoce.org.br/documentos-](http://www.cbhdoce.org.br/documentos-sobre-a-bacia/diagnostico-consolidado-da-bacia-do-rio-doce)
25 [sobre-a-bacia/diagnostico-consolidado-da-bacia-do-rio-doce](http://www.cbhdoce.org.br/documentos-sobre-a-bacia/diagnostico-consolidado-da-bacia-do-rio-doce)

26 ANA. (2016). Encarte Especial sobre a Bacia do Rio Doce Rompimento da Barragem em

- 1 Mariana/MG. In *Conjuntura dos Recursos Hídricos no Brasil - Informe 2015* (Vol. 1).
- 2 Andrades, R., Guabiroba, H. C., Hora, M. S. C., Martins, R. F., Rodrigues, V. L. A., Vilar, C.
3 C., Giarrizzo, T., and Joyeux, J. C. (2020). Early evidences of niche shifts in estuarine
4 fishes following one of the world's largest mining dam disasters. *Marine Pollution*
5 *Bulletin*, 154(March), 111073. <https://doi.org/10.1016/j.marpolbul.2020.111073>
- 6 Andrades, R., Martins, R. F., Guabiroba, H. C., Rodrigues, V. L. A., Szablak, F. T., Bastos,
7 K. V., Bastos, P. G. P., Lima, L. R. S., Vilar, C. C., and Joyeux, J.-C. C. (2021). Effects
8 of seasonal contaminant remobilization on the community trophic dynamics in a
9 Brazilian tropical estuary. *Science of the Total Environment*, 801, 149670.
10 <https://doi.org/10.1016/j.scitotenv.2021.149670>
- 11 Azevedo-Santos, V. M., Arcifa, M. S., Brito, M. F. G., Agostinho, A. A., Hughes, R. M.,
12 Vitule, J. R. S., Simberloff, D., Olden, J. D., and Pelicice, F. M. (2021). Negative
13 impacts of mining on Neotropical freshwater fishes. *Neotropical Ichthyology*, 19(3).
14 <https://doi.org/10.1590/1982-0224-2021-0001>
- 15 Barrie, A., and Prosser, S. (1996). Automated analysis of light-element stable isotopes by
16 isotope ratio mass spectrometry. In *Mass spectrometry of soils*.
- 17 Bartón, K. (2023). *MuMIn - Multi Model Inference* (1.47.5).
- 18 Bearhop, S., Adams, C. E., Waldron, S., Fuller, R. A., and Macleod, H. (2004). Determining
19 trophic niche width: a novel approach using stable isotope analysis. *Journal of Animal*
20 *Ecology*, 73(5), 1007–1012. <https://doi.org/10.1111/j.0021-8790.2004.00861.x>
- 21 Biasi, J. B. de, Dias, R. M., Santos, V. C., Mantellato, A. M. B., Farro, A. P. C., Hostim-
22 Silva, M., Hackradt, C. W., and Félix-Hackradt, F. C. (2023). The effect of a mining dam
23 failure on the genetic diversity and population resilience of marine fishes along the

- 1 eastern Brazilian coast. *Regional Studies in Marine Science*, 68, 103239.
2 <https://doi.org/10.1016/j.rsma.2023.103239>
- 3 Bistoni, M. A., and Hued, A. C. (2002). Patterns of fish species richness in rivers of the
4 central region of Argentina. *Brazilian Journal of Biology*, 62(4 B), 753–764.
5 <https://doi.org/10.1590/S1519-69842002000500004>
- 6 Bonecker, A. C. T., Castro, M. S. d., Costa, P. G., Bianchini, A., and Bonecker, S. L. C.
7 (2019). Larval fish assemblages of the coastal area affected by the tailings of the
8 collapsed dam in southeast Brazil. *Regional Studies in Marine Science*, 32, 100848.
9 <https://doi.org/10.1016/j.rsma.2019.100848>
- 10 Bonecker, A. C. T., Menezes, B. S., Dias Junior, C., Silva, C. A. da, Ancona, C. M., Dias, C.
11 de O., Longhini, C. M., Costa, E. S., Sá, F., Lázaro, G. C. S., Mill, G. N., Rocha, G. M.,
12 Lemos, K. do N., da Conceição, L. R., Demoner, L. E., Fernandes, L. F. L., Castro, M. S.
13 de, Alves, M. M., Laino, P. de S., ... Bonecker, S. L. C. (2022). An integrated study of
14 the plankton community after four years of Fundão dam disaster. *Science of the Total*
15 *Environment*, 806. <https://doi.org/10.1016/j.scitotenv.2021.150613>
- 16 Carmo, F. F. do, Kamino, L. H. Y., Junior, R. T., Campos, I. C. de, Carmo, F. F. do F. F. do,
17 Silvino, G., Castro, K. J. da S. X. de, Mauro, M. L., Rodrigues, N. U. A., Miranda, M. P.
18 de S., and Pinto, C. E. F. (2017). Fundão tailings dam failures: the environment tragedy
19 of the largest technological disaster of Brazilian mining in global context. *Perspectives in*
20 *Ecology and Conservation*, 15(3), 145–151. <https://doi.org/10.1016/j.pecon.2017.06.002>
- 21 Calais, L., Débora, P., Carvalho, R. De, Fernandes, F., Dergam, J. A., Zacharias, M., Carlos,
22 M., Sperber, F., and Santos, P. (2024). Trophic ecology of a small characid reflects the
23 degradation of a basin after the rupture of an ore tailings dam. *Aquatic Ecology*,
24 0123456789. <https://doi.org/10.1007/s10452-024-10167-6>

- 1 Carvalho, D. R., Castro, D., Callisto, M., Moreira, M. Z., and Pompeu, P. S. (2015). Isotopic
2 variation in five species of stream fishes under the influence of different land uses.
3 *Journal of Fish Biology*, 87(3), 559–578. <https://doi.org/10.1111/jfb.12734>
- 4 Carvalho, D. R. de, Bernardo Mascarenhas Alves, C., Flecker, A. S., Sparks, J. P., Zacharias
5 Moreira, M., and Santos Pompeu, P. (2020). Using $\delta^{15}\text{N}$ of periphyton and fish to
6 evaluate spatial and seasonal variation of anthropogenic nitrogen inputs in a polluted
7 Brazilian river basin. *Ecological Indicators*, 115(March), 106372.
8 <https://doi.org/10.1016/j.ecolind.2020.106372>
- 9 Carvalho, D. R. de, de Castro, D. M. P., Callisto, M., Moreira, M. Z., and Pompeu, P. S.
10 (2017). The trophic structure of fish communities from streams in the Brazilian Cerrado
11 under different land uses: an approach using stable isotopes. *Hydrobiologia*, 795(1),
12 199–217. <https://doi.org/10.1007/s10750-017-3130-6>
- 13 Clarke, K. R., and Gorley, R. N. (2006). *PrimerV6UserManual*.
- 14 Coelho, A. L. N. (2009). Bacia hidrográfica do Rio Doce(MG/ES):uma análise
15 socioambiental integrada. *Revista Geografares*, 7, 131–146.
16 <https://doi.org/10.7147/geo7.156>
- 17 Cordeiro, M. C., Garcia, G. D., Rocha, A. M., Tschoeke, D. A., Campeão, M. E., Appolinario,
18 L. R., Soares, A. C., Leomil, L., Froes, A., Bahiense, L., Rezende, C. E., de Almeida, M.
19 G., Rangel, T. P., De Oliveira, B. C. V., de Almeida, D. Q. R., Thompson, M. C.,
20 Thompson, C. C., and Thompson, F. L. (2019). Insights on the freshwater microbiomes
21 metabolic changes associated with the world’s largest mining disaster. *Science of the*
22 *Total Environment*, 654, 1209–1217. <https://doi.org/10.1016/j.scitotenv.2018.11.112>
- 23 Covich, A. P., Palmer, M. A., and Crowl, T. A. (1999). The Role of Benthic Invertebrate
24 Species in Freshwater Ecosystems. *BioScience*, 49(2), 119.

- 1 <https://doi.org/10.2307/1313537>
- 2 da Silva, D. A. R., de Carvalho, D. R., Ferreira, F. F., Dergam, J. A., Moreira, M. Z., and
3 Pompeu, P. S. (2024). Non-native fishes occupy broader isotopic niche than native fishes
4 in an impaired river system. *Hydrobiologia*, 0123456789.
5 <https://doi.org/10.1007/s10750-024-05766-1>
- 6 de Carvalho, D. R., Alves, C. B. M., Moreira, M. Z., and Pompeu, P. S. (2020). Trophic
7 diversity and carbon sources supporting fish communities along a pollution gradient in a
8 tropical river. *Science of the Total Environment*, 738, 139878.
9 <https://doi.org/10.1016/j.scitotenv.2020.139878>
- 10 de Carvalho, D. R., Ferreira, F. F., Dergam, J. A., Moreira, M. Z., and Pompeu, P. S. (2024).
11 Food web structure of fish communities of Doce River, 5 years after the Fundão dam
12 failure. *Environmental Monitoring and Assessment*, 196(3), 300.
13 <https://doi.org/10.1007/s10661-024-12395-7>
- 14 de Carvalho, D. R., Sparks, J. P., Flecker, A. S., Alves, C. B. M., Moreira, M. Z., and
15 Pompeu, P. S. (2021). Nitrogen pollution promotes changes in the niche space of fish
16 communities. *Oecologia*, 197(2), 485–500. <https://doi.org/10.1007/s00442-021-05029-z>
- 17 Fernandes, G. W., Goulart, F. F., Ranieri, B. D., Coelho, M. S., Dales, K., Boesche, N.,
18 Bustamante, M., Carvalho, F. A., Carvalho, D. C., Dirzo, R., Fernandes, S., Galetti, P.
19 M., Millan, V. E. G., Mielke, C., Ramirez, J. L., Neves, A., Rogass, C., Ribeiro, S. P.,
20 Scariot, A., and Soares-Filho, B. (2016). Deep into the mud: ecological and socio-
21 economic impacts of the dam breach in Mariana, Brazil. *Natureza e Conservacao*, 14(2),
22 35–45. <https://doi.org/10.1016/j.ncon.2016.10.003>
- 23 Ferreira, F. F., de Freitas, M. B. D., Szinwelski, N., Vicente, N., Medeiros, L. C. C., Schaefer,
24 C. E. G. R., Dergam, J. A., and Sperber, C. F. (2020). Impacts of the Samarco Tailing

- 1 Dam Collapse on Metals and Arsenic Concentration in Freshwater Fish Muscle from
2 Doce River, Southeastern Brazil. *Integrated Environmental Assessment and*
3 *Management*, 16(5), 622–630. <https://doi.org/10.1002/ieam.4289>
- 4 Finlay, J. C. (2001). Stable-carbon-isotope ratios of river biota: Implications for energy flow
5 in lotic food webs. *Ecology*, 82(4), 1052–1064. <https://doi.org/10.1890/0012->
6 [9658\(2001\)082\[1052:SCIROR\]2.0.CO;2](https://doi.org/10.1890/0012-9658(2001)082[1052:SCIROR]2.0.CO;2)
- 7 Fry, B. (2006). Stable isotope ecology. In *Springer*. <https://doi.org/10.1016/B978-0-12->
8 [409548-9.10915-7](https://doi.org/10.1016/B978-0-12-409548-9.10915-7)
- 9 Garcia, L. C., Ribeiro, D. B., De Oliveira Roque, F., Ochoa-Quintero, J. M., Laurance, W. F.,
10 Couto Garcia, L., Ribeiro, D. B., De Oliveira Roque, F., Manuel Ochoa-Quintero, J., and
11 Laurance, W. F. (2017). Brazil's worst mining disaster: Corporations must be compelled
12 to pay the actual environmental costs: Corporations. *Ecological Applications*, 27(1), 5–9.
13 <https://doi.org/10.1002/eap.1461>
- 14 Gomes, L. E. de O., Correa, L. B., Sá, F., Neto, R. R., and Bernardino, A. F. (2017). The
15 impacts of the Samarco mine tailing spill on the Rio Doce estuary, Eastern Brazil.
16 *Marine Pollution Bulletin*, 120(1–2), 28–36.
17 <https://doi.org/10.1016/j.marpolbul.2017.04.056>
- 18 Governo do Estado de Minas Gerais. (2016). *Relatório: Avaliação dos efeitos e*
19 *desdobramentos do rompimento da Barragem de Fundão em Mariana - MG* (Issue
20 Grupo da Força-Tarefa).
- 21 Hatje, V., Pedreira, R. M. A. A., de Rezende, C. E., Schettini, C. A. F., de Souza, G. C.,
22 Marin, D. C., and Hackspacher, P. C. (2017). The environmental impacts of one of the
23 largest tailing dam failures worldwide. *Scientific Reports*, 7(1), 10706.
24 <https://doi.org/10.1038/s41598-017-11143-x>

- 1 Hill, J. M., Jones, R. W., Hill, M. P., and Weyl, O. L. F. (2015). Comparisons of isotopic
2 niche widths of some invasive and indigenous fauna in a South African river. *Freshwater*
3 *Biology*, 60(5), 893–902. <https://doi.org/10.1111/fwb.12542>
- 4 Horka, P., Musilova, Z., Holubova, K., Jandova, K., Kukla, J., Rutkayova, J., and Jones, J. I.
5 (2023). Anthropogenic nutrient loading affects both individual species and the trophic
6 structure of river fish communities. *Frontiers in Ecology and Evolution*, 10(January).
7 <https://doi.org/10.3389/fevo.2022.1076451>
- 8 IGAM. (2010a). *Plano de ação de recursos hídricos da unidade de planejamento e gestão dos*
9 *recursos hídricos Manhuaçu.*
- 10 IGAM. (2010b). *Plano de ação de recursos hídricos da unidade de planejamento e gestão*
11 *dos recursos hídricos Piranga.*
- 12 IGAM. (2010c). *Plano de ação de recursos hídricos da unidade de planejamento e gestão dos*
13 *recursos hídricos Santo Antônio.*
- 14 Islam, K., and Murakami, S. (2021). Global-scale impact analysis of mine tailings dam
15 failures: 1915–2020. *Global Environmental Change*, 70(August), 102361.
16 <https://doi.org/10.1016/j.gloenvcha.2021.102361>
- 17 Jackson, A. L., Inger, R., Parnell, A. C., and Bearhop, S. (2011). Comparing isotopic niche
18 widths among and within communities: SIBER - Stable Isotope Bayesian Ellipses in R.
19 *Journal of Animal Ecology*, 80(3), 595–602. <https://doi.org/10.1111/j.1365->
20 [2656.2011.01806.x](https://doi.org/10.1111/j.1365-2656.2011.01806.x)
- 21 Layman, C. A., Arrington, D. A., Montaña, C. G., and Post, D. M. (2007). Can stable isotope
22 ratios provide for community-wide measures of trophic structure? *Ecology*, 88(1), 42–48.
23 <https://doi.org/10.1890/0012-9658>

- 1 Lumbroso, D., McElroy, C., Goff, C., Collell, M. R., Petkovsek, G., and Wetton, M. (2019).
2 The potential to reduce the risks posed by tailings dams using satellite-based
3 information. *International Journal of Disaster Risk Reduction*, 38(June), 101209.
4 <https://doi.org/10.1016/j.ijdr.2019.101209>
- 5 Macklin, M. G., Thomas, C. J., Mudbhatkal, A., Brewer, P. A., Hudson-Edwards, K. A.,
6 Lewin, J., Scussolini, P., Eilander, D., Lechner, A., Owen, J., Bird, G., Kemp, D., and
7 Mangalaa, K. R. (2023). Impacts of metal mining on river systems: a global assessment.
8 *Science*, 381(6664), 1345–1350. <https://doi.org/10.1126/science.adg6704>
- 9 McCutchan, J. H., Lewis, W. M., Kendall, C., and McGrath, C. C. (2003). Variation in
10 trophic shift for stable isotope ratios of carbon, nitrogen, and sulfur. *Oikos*, 102(2), 378–
11 390. <https://doi.org/10.1034/j.1600-0706.2003.12098.x>
- 12 Medina-Contreras, D., Cantera-Kintz, J., and Sánchez, A. (2021). Trophic structure of fish
13 communities in mangrove systems subject to different levels of anthropogenic
14 intervention, Tropical Eastern Pacific, Colombia. *Environmental Science and Pollution*
15 *Research*, 61608–61622. <https://doi.org/10.1007/s11356-021-16814-x>
- 16 Medinski, N. A., Maitland, B. M., Jardine, T. D., Drake, D. A. R., and Poesch, M. S. (2023).
17 A catastrophic coal mine spill in the Athabasca River watershed induces isotopic niche
18 shifts in stream biota including an endangered rainbow trout ecotype (*Can. J. Fish.*
19 *Aquat. Sci.* 79(8): 1321–1334. <https://doi.org/10.1139/cjfas-2021-0112>). *Canadian*
20 *Journal of Fisheries and Aquatic Sciences*, 80(11), 1844–1846.
21 <https://doi.org/10.1139/cjfas-2023-0196>
- 22 Nascimento, R. L., Alves, P. R., Di Domenico, M., Braga, A. A., de Paiva, P. C., D’Azeredo
23 Orlando, M. T., Sant’Ana Cavichini, A., Longhini, C. M., Martins, C. C., Neto, R. R.,
24 Grilo, C. F., Oliveira, K. S. S., da Silva Quaresma, V., Costa, E. S., Cagnin, R. C., da

- 1 Silva, C. A., Sá, F., and de Lourdes Longo, L. (2022). The Fundão dam failure: Iron ore
2 tailing impact on marine benthic macrofauna. *Science of the Total Environment*,
3 838(May). <https://doi.org/10.1016/j.scitotenv.2022.156205>
- 4 Oberdorff, T., Guilbert, E., and Lucchetta, J. C. (1993). Patterns of fish species richness in the
5 Seine River basin, France. *Hydrobiologia*, 259(3), 157–167.
6 <https://doi.org/10.1007/BF00006595>
- 7 Oberdorff, T., Tedesco, P. A., Hugueny, B., Leprieur, F., Beauchard, O., Brosse, S., and Dürr,
8 H. H. (2011). Global and regional patterns in riverine fish species richness: A review.
9 *International Journal of Ecology*, 2011. <https://doi.org/10.1155/2011/967631>
- 10 Omachi, C. Y., Siani, S. M. O., Chagas, F. M., Mascagni, M. L., Cordeiro, M., Garcia, G. D.,
11 Thompson, C. C., Siegle, E., and Thompson, F. L. (2018). Atlantic Forest loss caused by
12 the world's largest tailing dam collapse (Fundão Dam, Mariana, Brazil). *Remote Sensing*
13 *Applications: Society and Environment*, 12, 30–34.
14 <https://doi.org/10.1016/j.rsase.2018.08.003>
- 15 Otieno, F., and Shukla, S. K. (2023). An insight into failure of iron ore mine tailings dams.
16 *International Journal of Mining, Reclamation and Environment*, 37(2), 127–147.
17 <https://doi.org/10.1080/17480930.2022.2159295>
- 18 Palmer, M., and Ruhi, A. (2019). Linkages between flow regime, biota, and ecosystem
19 processes: Implications for river restoration. *Science*, 365(6459).
20 <https://doi.org/10.1126/science.aaw2087>
- 21 Peterson, B. J., and Fry, B. (1987). Stable isotopes in ecosystem studies. *Annual Review of*
22 *Ecology and Systematics*. Vol. 18, 293–320.
23 <https://doi.org/10.1146/annurev.es.18.110187.001453>

- 1 Petesse, M. L., Pomaro, S. B., and de Castro Campanha, P. M. G. (2023). Are fish
2 assemblages recovering after the huge disaster of mining tailing dam collapse in Mariana
3 (Brazil-MG)? *Environmental Monitoring and Assessment*, 195(11), 1263.
4 <https://doi.org/10.1007/s10661-023-11883-6>
- 5 PIRH - Doce. (2010). *Plano Integrado de Recursos Hídricos da Bacia Hidrográfica do Rio*
6 *Doce e Planos de Ações para as Unidades de Planejamento e Gestão de Recursos*
7 *Hídricos no Âmbito da Bacia do Rio Doce: Vol. I.*
- 8 Poff, N. L., Allan, J. D., Bain, M. B., Karr, J. R., Prestengard, K. L., Richey, B. D., Sparks, R.
9 E., and Stromberg, J. C. (1997). The Natural Flow Regime. *BioScience*, 47(11), 769–784.
10 <https://doi.org/01/1997>; 47 The Natural Flow Regime A paradigm for river conservation
11 and restoration. Available from:
12 [https://www.researchgate.net/publication/247932778_The_Natural_Flow_Regime_A_pa](https://www.researchgate.net/publication/247932778_The_Natural_Flow_Regime_A_paradigm_for_river_conservation_and_restoration)
13 [radigm_for_river_conservation_and_restoration](https://www.researchgate.net/publication/247932778_The_Natural_Flow_Regime_A_paradigm_for_river_conservation_and_restoration) [accessed Mar 19, 2015].
- 14 Post, D. M. (2002). Using Stable Isotopes to Estimate Trophic Position: Models, Methods,
15 and Assumptions. *Ecology*, 83(3), 703. <https://doi.org/10.2307/3071875>
- 16 R Core Team. (2024). *R: A language and environment for statistical computing*. R
17 Foundation for Statistical Computing. <http://www.r-project.org/>
- 18 Salvador, G. N., Montag, L. F. A., Hughes, R. M., Almeida, S. M., Prudente, B. S., Pessali, T.
19 C., Barroso, T. A., Cianciaruso, M. V., Ligeiro, R., Juen, L., and Carlucci, M. B. (2022).
20 Influences of multiple anthropogenic disturbances coupled with a tailings dam rupture on
21 spatiotemporal variation in fish assemblages of a tropical river. *Freshwater Biology*,
22 67(10), 1708–1724. <https://doi.org/10.1111/fwb.13967>
- 23 Santos, G. de S., Silva, E. E. C., Barroso, G. F., Pasa, V. M. D., and Eskinazi-Sant’Anna, E.
24 M. (2022). Do metals differentiate zooplankton communities in shallow and deep lakes

- 1 affected by mining tailings? The case of the Fundão dam failure (Brazil). *Science of the*
2 *Total Environment*, 806. <https://doi.org/10.1016/j.scitotenv.2021.150493>
- 3 Santos, O. S. H., Avellar, F. C., Alves, M., Trindade, R. C., Menezes, M. B., Ferreira, M. C.,
4 França, G. S., Cordeiro, J., Sobreira, F. G., Yoshida, I. M., Moura, P. M., Baptista, M.
5 B., and Scotti, M. R. (2019). Understanding the Environmental Impact of a Mine Dam
6 Rupture in Brazil: Prospects for Remediation. *Journal of Environmental Quality*, 48(2),
7 439–449. <https://doi.org/10.2134/jeq2018.04.0168>
- 8 Tonella, L. H., Fugli, R., Vitorino, O. B., Suzuki, H. I., Gomes, L. C., and Agostinho, A. A.
9 (2018). Importance of feeding strategies on the long-term success of fish invasions.
10 *Hydrobiologia*, 817(1), 239–252. <https://doi.org/10.1007/s10750-017-3404-z>
- 11 Vannote, R. L., Minshall, G., Minshall, W. G., Cummins, K. W., Sedell, J. R., and Cushing,
12 C. E. (1980). The River Continuum Concept. *Canadian Journal of Fisheries and Aquatic*
13 *Sciences*, 37(1), 130–137. <http://www.nrcresearchpress.com/doi/abs/10.1139/f80-017>
- 14 Vergilio, C. dos S., Lacerda, D., Souza, T. da S., Oliveira, B. C. V. de, Fioresi, V. S., de
15 Souza, V. V., da Rocha Rodrigues, G., de Araujo Moreira Barbosa, M. K., Sartori, E.,
16 Rangel, T. P., de Almeida, D. Q. R., de Almeida, M. G., Thompson, F., and de Rezende,
17 C. E. (2021). Immediate and long-term impacts of one of the worst mining tailing dam
18 failure worldwide (Bento Rodrigues, Minas Gerais, Brazil). *Science of the Total*
19 *Environment*, 756, 143697. <https://doi.org/10.1016/j.scitotenv.2020.143697>
- 20 Vergilio, C. dos S., Lacerda, D., Oliveira, B. C. V. de, Sartori, E., Campos, G. M., Pereira, A.
21 L. de S., Aguiar, D. B. de, Souza, T. da S., Almeida, M. G. de, Thompson, F., and
22 Rezende, C. E. de. (2020). Metal concentrations and biological effects from one of the
23 largest mining disasters in the world (Brumadinho, Minas Gerais, Brazil). *Scientific*
24 *Reports*, 10(1), 1–12. <https://doi.org/10.1038/s41598-020-62700-w>

- 1 Wang, S., Luo, B. K., Qin, Y. J., Zhao, J. G., Wang, T. T., Stewart, S. D., Yang, Y., Chen, Z.
2 B., and Qiu, H. X. (2021). Fish isotopic niches associated with environmental indicators
3 and human disturbance along a disturbed large subtropical river in China. *Science of the*
4 *Total Environment*, 750, 141667. <https://doi.org/10.1016/j.scitotenv.2020.141667>
- 5 Yamamoto, F. Y., Onishi, K., Ralha, T. R., Silva, L. F. O., Deda, B., Pessali, T. Y. C., Souza,
6 C., Oliveira Ribeiro, C. A., and Abessa, D. M. S. (2023). Earlier biomarkers in fish
7 evidencing stress responses to metal and organic pollution along the Doce River Basin.
8 *Environmental Pollution*, 329(March), 121720.
9 <https://doi.org/10.1016/j.envpol.2023.121720>
- 10 Yamamoto, F. Y., Pauly, G. F. E., Nascimento, L. S., Fernandes, G. M., Santos, M. P.,
11 Figueira, R. C. L., Cavalcante, R. M., Grassi, M. T., and Abessa, D. M. S. (2023).
12 Explaining the persistence of hazardous chemicals in the Doce River (Brazil) by multiple
13 sources of contamination and a major environmental disaster. *Journal of Hazardous*
14 *Materials Advances*, 9(November 2022), 100250.
15 <https://doi.org/10.1016/j.hazadv.2023.100250>
- 16 Zanden, M. J. Vander, and Rasmussen, J. B. (2001). Variation in $\delta^{15}\text{N}$ and $\delta^{13}\text{C}$ trophic
17 fractionation: Implications for aquatic food web studies. *Limnology and Oceanography*,
18 46(8), 2061–2066. <https://doi.org/10.4319/lo.2001.46.8.2061>
- 19