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## The critical role of natural history museums in advancing eDNA for biodiversity studies: a case study with Amazonian fishes

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Ichthyological surveys have traditionally been conducted using whole-specimen, capture-based sampling with varied but conventional fishing gear. Recently, environmental DNA (eDNA) metabarcoding has emerged as a complementary, and possible alternative, approach to whole-specimen methodologies. In the tropics, where much of the diversity remains undescribed, vast reaches continue unexplored, and anthropogenic activities are constant threats; there have been few eDNA attempts for ichthyological inventories. We tested the discriminatory power of eDNA using MiFish primers with existing public reference libraries and compared this with capture-based methods in two distinct ecosystems in the megadiverse Amazon basin. In our study, eDNA provided an accurate snapshot of the fishes at higher taxonomic levels and corroborated its effectiveness to detect specialized fish assemblages. Some flaws in fish metabarcoding studies are routine issues addressed in natural history museums. Thus, by expanding their archives and adopting a series of initiatives linking collection-based research, training and outreach, natural history museums can enable the effective use of eDNA to survey Earth's hotspots of biodiversity before taxa go extinct. Our project surveying poorly explored rivers and using DNA vouchered archives to build metabarcoding libraries for Neotropical fishes can serve as a model of this protocol.

Historical ichthyological surveys in freshwater ecosystems globally were conducted with whole-specimen, capture-based sampling using conventional fishing methods such as gill nets, cast nets, hook and line, dipnets, seines, and rotenone—the last a chemical ichthyocide. Although the use of ichthyocides is considered advantageous in the tropics where unknown quantities of diversity remain to be described (e.g.,<sup>1</sup>), collecting fishes with rotenone has been banned as a sampling method in many regions due to its extraordinary power to kill fishes and associated fauna (e.g.,<sup>2</sup>). Capture-based methods other than rotenone are less powerful, especially for collecting small cryptobenthic species, and all capture-based methods may result in low capture rates in hard-to-sample environments, such as rapids, waterfalls, and deep-water reaches. Yet, by undersampling we increase the likelihood of overlooking, and in the sense of the biodiversity crisis globally missing, heretofore unaccounted-for species diversity.

Recently, DNA barcodes from environmental samples (eDNA), a non-invasive and quickly developing methodology that captures genetic material of multiple organisms, has emerged as a complementary, and a possible

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alternative approach, to repeated whole-specimen capture methods. Universal eDNA metabarcoding primers based on short variable DNA regions (typically ribosomal RNA—12S rRNA, e.g.,<sup>3</sup>) were developed to detect multiple species of fishes through next-generation sequencing (NGS) of free DNA molecules that exist in nature (e.g., lost scales, excrement, and mucosal secretions in the water<sup>4–6</sup>).

The Amazon rainforest and basin maintain the most diverse riverine ichthyofauna on Earth, with more than 2700 species classified in 18 orders and 60 families<sup>7,8</sup>. Such numbers are underestimates as many undescribed taxa await discovery and formal description<sup>9</sup>. The evolution of this fauna, one-fifth of the world's freshwater fishes<sup>10</sup>, dates to at least the upper Cretaceous and lower Cenozoic, ~120–150 million years before present (mybp<sup>11</sup>). The Characiphysae—catfishes (Siluriformes), piranhas and allies (Characiformes) and electric fishes (Gymnotiformes)—represent more than 75% of the fishes in Amazonian aquatic ecosystems<sup>7</sup>. That overwhelming fish diversity is also represented by, among other taxa, cichlids (Cichliformes), killifishes (Cyprinodontiformes), river stingrays (Myliobatiformes), pufferfishes (Tetraodontiformes), and silver croakers (Perciformes)<sup>7,12,13</sup>. Over time these fishes have diversified under a wildly varied set of environmental conditions to inhabit myriad aquatic systems<sup>14</sup>. In contrast to the proposed ancient age of those lineages, most species-level diversification is hypothesized to have occurred relatively recently, less than 10 mybp (e.g.,<sup>13,15</sup>).

Accurate and thorough sampling is the critical first step towards a more complete knowledge of biodiversity, a path that also requires the proper identification of collected samples. Specimens of Amazonian fishes have been identified almost exclusively based on morphology, but given that molecular evolutionary rates can far outpace divergence in phenotypes, recent studies that integrate molecular and morphological data have greatly improved our understanding of species diversity, including that of fishes<sup>15,16</sup>. DNA barcoding—which typically uses the mitochondrial COI (Cytochrome Oxidase subunit I) gene to identify candidate species<sup>17</sup>—is now a common molecular method used in taxonomic studies of fishes and has been valuable in revealing cryptic species diversity and in helping to resolve complex taxonomic issues<sup>15,18,19</sup>.

Accordingly, the demand for samples appropriate for DNA barcoding, i.e., properly preserved and vouchered in ichthyological collections by the scientific community, has increased significantly. This demand is correlated directly with efforts to collect DNA-worthy samples during biodiversity surveys along with museum vouchers and has become a common practice among scientists worldwide<sup>20–22</sup>. Concomitant with sampling and curating efforts, new public platforms have been created to help close gaps in shared sample information (e.g., Global Genome Biodiversity Network<sup>23</sup>) and facilitate access to the sequences (e.g., BOLD). In contrast to this trend, historically few efforts to collect a substantial number of tissue samples during ichthyological surveys—possibly because of the lack of infrastructure to maintain such a collection—results in a lack of robust reference libraries for Amazonian fishes (e.g.,<sup>24</sup>). In addition, although GenBank is often a reliable resource<sup>25</sup>, several samples of Amazonian fishes are poorly identified in GenBank, and some lack properly preserved voucher specimens—a problem that extends to other fishes as well (e.g.,<sup>26,27</sup>).

Most metabarcoding inventories of freshwater fishes have been conducted in temperate habitats with well-characterized species diversity<sup>28</sup>. There have been only a few attempts to use eDNA metabarcoding in ichthyological surveys in the Neotropical region<sup>29–32</sup>, an area where understanding species-level diversity is more complex. For example<sup>30</sup>, built 12S eDNA metabarcoding primers based on a reference library for over 130 species known to occur in the rivers and streams of the French Guiana, and the eDNA results were compared with capture-based sampling methodologies. They recovered a similar number of species, with a partial match to species identification, using both capture-based and eDNA approaches. Conversely<sup>32</sup>, used MiFish primers<sup>3</sup> in three localities in the central Amazon and suggested that a new approach would be necessary to evaluate the Neotropical fish fauna using eDNA metabarcoding.

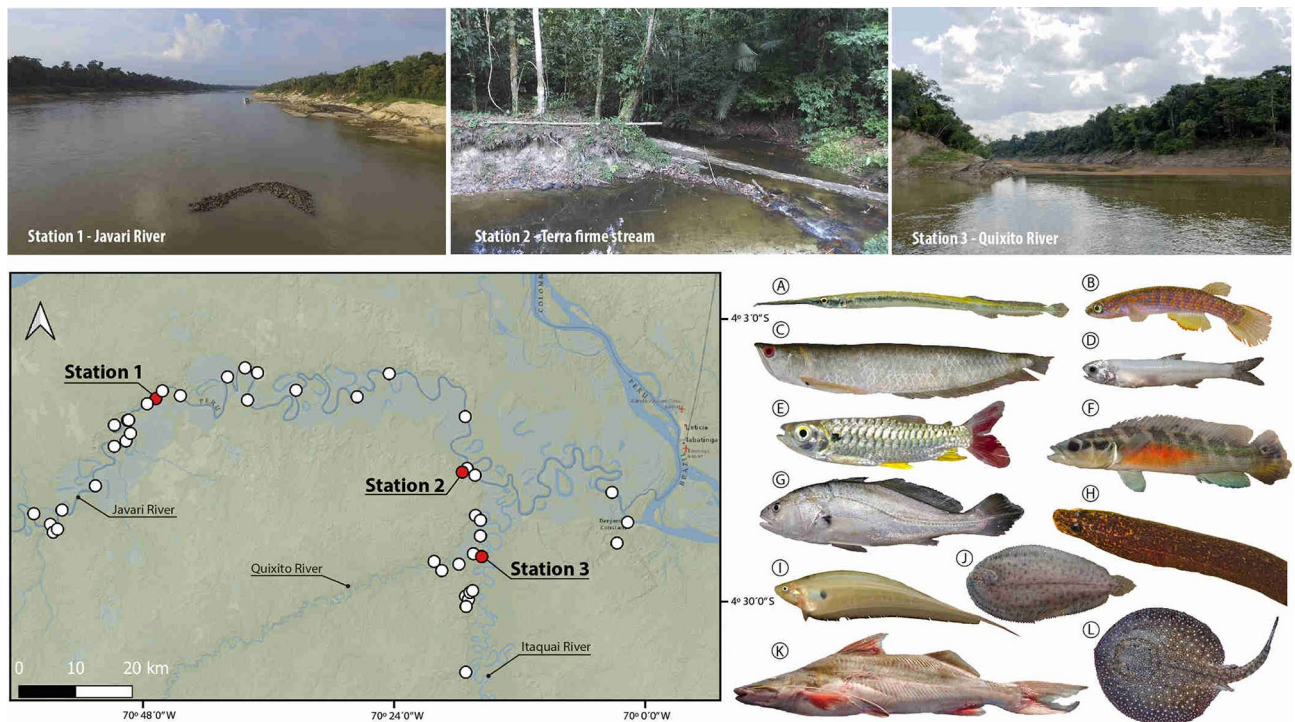
Despite the problems inherent in the development of new methodologies, eDNA technology and associated bioinformatics are evolving at accelerated rates and will soon play a central role in the inventory of fish diversity<sup>6,28,33,34</sup>. Freshwater ecosystems, many of which are poorly explored, are under severe and fast-paced threats due to anthropogenic activities<sup>35</sup>. Thus, the next decade or so will be pivotal to survey these habitats to secure vouchers, DNA, and eDNA samples to build reference libraries and archive the samples as well as to engage society in protection and preservation as these environments reach their tipping point. Natural history museums are the sound common ground where key flaws and gaps in those two inversely proportional trends can be addressed and filled. Here, we tested the discriminatory power of the MiFish primers using the existing public reference libraries by surveying two distinct ecosystems, river and stream, during a scientific expedition to the heretofore largely unexplored Javari River basin in Brazil–Peru–Colombia border. The results of eDNA analysis were compared with the capture-based methodology and are discussed in the context of the critical role of natural history museums in the development of eDNA metabarcoding as a tool for biodiversity studies.

## Results

**Ichthyological survey—capture-based sampling (CBS).** In total, 443 species classified in 236 genera, 49 families, and 15 orders were collected using traditional methods from 46 stations in multiple environments during the Javari River expedition (Table S1). Among these collections are over 60 species that are new to science.

More specifically, in the three stations sampled using traditional and eDNA methodologies (Fig. 1), we collected the following: 145 species belonging to 101 genera, 32 families and nine orders in the main Javari River (station 1); 56 species, 38 genera, 21 families, and six orders in a stream (station 2); and 67 species, 58 genera, 27 families, and seven orders in the Quixito River (station 3; Table S1).

*eDNA data analyses and assessment of taxonomic resolution of public reference database (Molecular-based Sampling—MBS).* A total of 1,903,160 reads was assigned to the 11 libraries (station 1 = 5 libraries; station 2 = 5



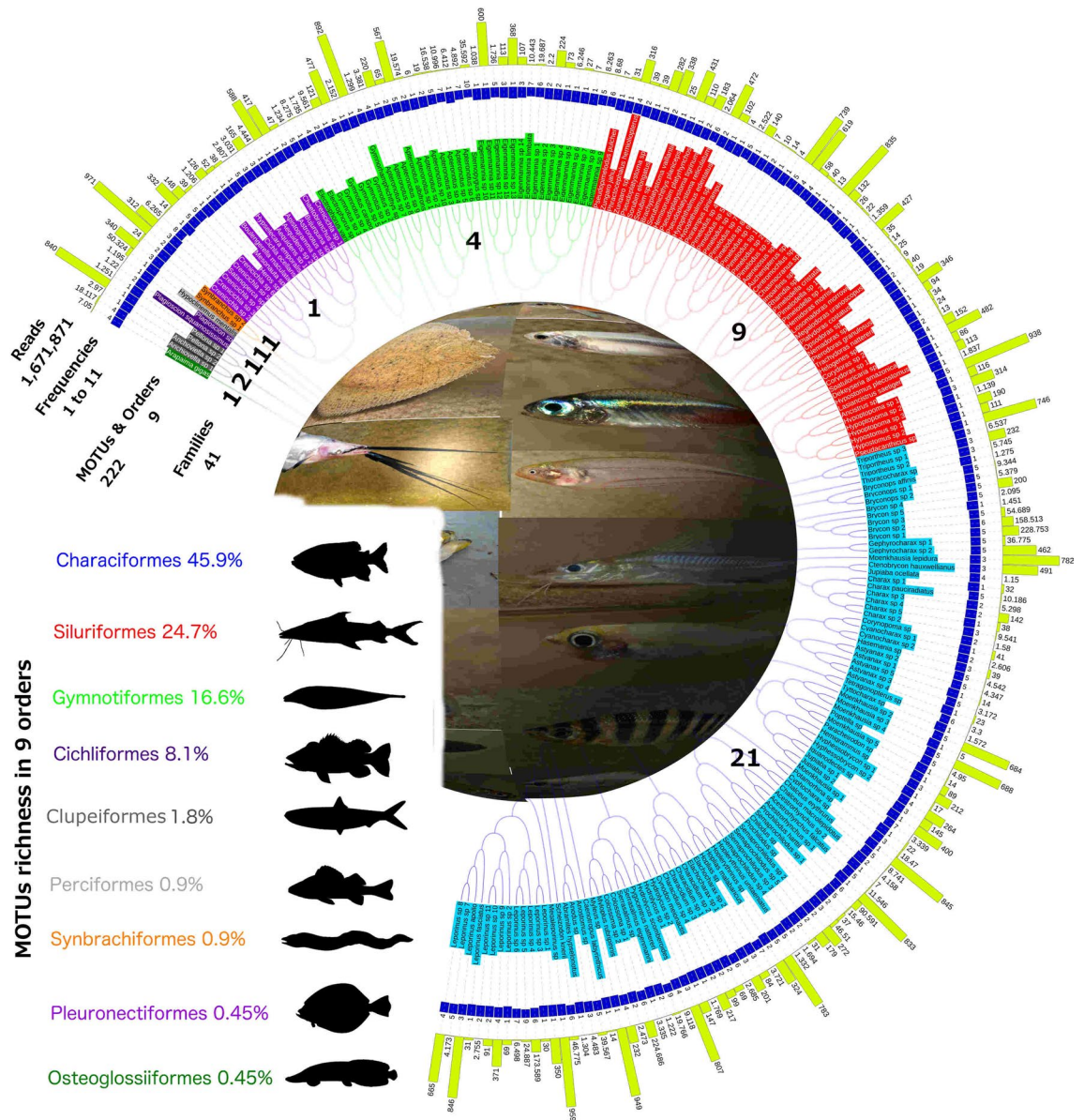
**Figure 1.** Map of Javari River basin showing 46 sampling stations (white and red dots). Red dots represent stations in two distinct ecosystems (River: stations 1—Javari, 3—Quixito; Stream: station 2—*Terra firme* stream) sampled by capture and molecular based methodologies. In the map one dot can represent more than one station. Illustration of 12 orders detected by capture-based sampling (CBS) and molecular based sampling (MBS) in the three stations: (A) Beloniformes—*Potamorhaphis guianensis*, INPA-ICT 055254, station 2(CBS); (B) Cyprinodontiformes—*Laimosemion* sp., INPA-ICT 056039, station 2(CBS); (C) Osteoglossiformes—*Osteoglossum bicirrhosum*, INPA-ICT 056354; (D) Clupeiformes—*Anchoviella jamesi*, INPA-ICT 055391, stations 1&3(CBS); (E) Characiformes—*Chalceus erythrus*, INPA-ICT 055360, stations 1(CBS, MBS), 2(MBS); (F) Cichliformes—*Crenicichla reticulata*, INPA-ICT 055413, station 1(CBS); (G) Perciformes—*Plagioscion squamosissimus*, INPA-ICT 055328, stations 1(CBS, MBS), 3(CBS); (H) Synbranchiformes—*Synbranchus* sp., INPA-ICT 055815, station 2(MBS); (I) Gymnotiformes—*Eigenmannia limbata*, INPA-ICT 055420, stations 1 & 3(CBS, MBS), 2(MBS); (J) Pleuronectiformes—*Apionichthys nattereri*, INPA-ICT 055487, stations 1(CBS, MBS), 3(MBS); (K) Siluriformes—*Brachyplatystoma vaillantii*, INPA-ICT 056703, station 1(MBS); (L) Myliobatiformes—*Potmotrygon scobina*, INPA-ICT 055553. The map was created in QGIS 3.10.2-A Coruna with images available at ESRI National Geographic (<https://www.esri.com/news/arcuser/0312/national-geographic-basemap.html>), using the plugin QuickMapServices 0.19.11.1.

libraries; station 3 = 1 library), and the number of raw reads for each library ranged from 135,818 to 213,952 with an average of 173,015 reads (Table S2). The final reference database with 1,671,871 fish reads (99.7% of the denoised reads) yielded 222 species assigned to 104 genera, 41 families, and 9 orders of fishes (Fig. 2 and Tables S3, S4).

Matching sequence identity of >98.5% for 58 species (26%) of 222 species detected by eDNA was found in the reference library database (Table 1). For the most species-rich orders detected by eDNA, Siluriformes were represented by 36.3% of the species; Characiformes 27.1%; Cichliformes 11.7%; and Gymnotiformes 10.8%. From these, six species (10.3%) were identified as “sp.” in reference libraries. Only 17 species (7.6%) were also identified in the CBS (Table 1).

**Species composition among eDNA samples: distinguishing between river versus stream-dwelling communities.** Six eDNA samples were collected in the river (stations 1 and 3) and five in the stream (station 2), and a clear split is seen between these two fish communities (Fig. 3). The number of species detected per sample ranged from 33 to 87 (for details see Supp information) with an abrupt differentiation between species composition in the stream (samples 1–5) and river samples (samples 6–11), as detected by the Pearson correlation coefficients (Fig. 3A). That is, stream and river-dwelling communities are distinct on the species composition Habitat axis. Pearson coefficients are varying from 0.5 to 1.0 in stream versus 0.0 to –0.5 in river. Thus, species composition is more similar within each community, except for a clear distinction between the river assemblages at Javari (samples 6–10) and Quixito Rivers (sample 11).

To assess whether the differences in species composition between stream and river communities observed in the Pearson correlation coefficients were significant, we calculated Jaccard’s dissimilarities indices through a NMDS analysis. The original position of the 222 detected species in river, stream, and in both habitats were



**Figure 2.** Illustrative cladogram with reads and frequencies for each of 222 molecular operational taxonomic units (MOTUs) and reference sequences included in nine orders and 41 families detected by 11 eDNA samples in the Javari River basin. Color highlighting MOTUs names corresponds to each of the nine orders. In the left side, species richness, key color, and general bauplan silhouettes for each order. At the center, spherical view of species diversity detected by eDNA.

represented in a three-dimensional NMDS space (Fig. 3B). The Stress = 0.0524 of the NMDS plot indicated that its first three axes provided an appropriate three-dimensional representation of the habitats according to their species composition<sup>36</sup>, and NMDS significantly distinguished between the river and stream communities (ANOSIM  $R = 0.4327$ ;  $p < 0.0001$ ; Fig. 3B).

Based on the species frequency detected per order we determined the composition of the stream and river habitats (Fig. 3B,C). Of note is the difference in the species composition between the five samples from Javari River (Samples 1 to 5) and the single sample (Sample 6) collected in the Quixito River (Fig. 3A,D). The inter-relationships between habitat and species diversity and composition per order are represented in the chord diagram in Fig. 3E.

**Comparing capture-based sampling (CBS) and Molecular-based sampling (MBS)—eDNA metabarcoding species richness.** *Javari River (station 1).* CBS captured a total of 145 species, 101 genera, 32 families and nine orders in the main Javari River. Conversely, MBS found 107 species, 28 genera, 20 families, and seven orders (Fig. 4A,B; Tables S5, S6). Thirteen species were detected by both CBS and MBS (Table 1). The rarefaction sampling curve illustrating the accumulation of unique species with the number of individuals collected by CBS does not reach an asymptote (Fig. 4C), indicating that several species remain to be detected. This

Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Osteoglossiformes	Arapaimidae	<i>Arapaima gigas</i>	7050	4			ACCGCGTTTATACGAGAG GCTCAAGTTAATACTATC GGCGTAAAGTGTGATTAT AGGACCAATACTAAAGC CAAAGGCCTCAAAACTG TTATACGCCATTGAGAC TTGTAGGCTCCAAAACGA AAGTAGCTTTAAACTTT AACCTAGAATTCACGACA GCTAGGAA
Clupeiformes	Engraulidae	<i>Anchoviella</i> sp. 1	18,117	4	INPA-ICT 055766	S1	ACCGCGTTTATACGAGAG ACCCTAGTTGATTAAAGC GGCGTAAAGAGTGGTTAT GGAATATTCTTTAAAG CAGAAAACCTCTCAAACT GTTATACGCACCCAGAGG TCTGAATCCCTCACACGA AAGTGACTTTATTTATGC CTACCAGAACCCACGAAA GCTGGGAC
Characiformes	Crenuchidae	<i>Characidium</i> sp. 1	69	2			ACCGCGTTTATACGAGAG ACCCTAGTTGACATCTGC GGCGTAAAGAGTGGTTAG AAATATAACATAAACTA AAGCCAAAGATTTTCCAA GCCGTCGTACGCACCAGC AAGACACGAAGCCCAAAC ACGAAAGTAGCTTTATTA TTAAACCGACCCACGAA AGCTAAGAA
Characiformes	Erythrinidae	<i>Hoplerythrinus unitaeniatus</i>	1332	5			ACCGCGTTTATACGAGAG ACCCTAGTTGATAACTAC GGCGTAAAGAGTGGTTAA GAATAAACTTAATAAAG CCAAAGACCCCAAGCC GTCACACGCACATGCGGG CACGAAGTTCACACACGA AAGTAGCTTTAATTAAC GACGCCACGAAAGCTAAG AA
Characiformes	Erythrinidae	<i>Hoplias malabaricus</i>	324	2	INPA-ICT 055204	S2	ACCGCGTTTATACGAGAG ACCCTAGTTGATAAATAC GGCGTAAAGAGTGGTTAG AGGACTCCCATATAAAG CCAAAGACCTCCAGGCC GTCACACGCATACGAGGG CACGAAGTTCACACACGA AAGTAGCTTTAAATTACC CGACGCCACGAAAGCTAA GAA
Characiformes	Cynodontidae	<i>Cynodon meionactis</i>	1769	1			ACCGCGTTTAAACGAGAG ACCCTAGTTGATCATCAC GGCGTAAAGAGTGGTTAG GGGATTATCATAAATAAA GCCAAAGACTCCCAAGC TGTCGCACGCATTCGGGA GGCGCGAAGCCACACAC GAAAGTAGCTTTAACTAT TGACCCTGATGCCACGAA AGCTAAGAA
Characiformes	Cynodontidae	<i>Hydrolycus scomberoides</i>	9118	4			ACCGCGTTTATACGAGAG ACCCTAGTTGACCATCAC GGCGTAAAGCGTGGTTAA AGGACCCCTATAAATAAA GCCAAAGACTCCCAAGC TGTCGCACGCACCCGGA GGCACGAAGCCACACAC GAAAGTAGCTTTAACTAC AAACCTCGATGCCACGAA AGCTAAGAA
Characiformes	Serrasalminidae	<i>Serrasalmus eigenmanni</i>	1222	2			ACCGCGTTTATACGAGAG ACTCCAGTTGATAGTAC GGCGTAAAGAGTGGTTTG GGGCCCGCCAAAATAAA GCCAAAGACTCCCAAGC CGTCAAACGCACCCGGA GGCACGAAGTCTTAACGC GAAAGCAACTTTACCTTC CCCACGCCACGAAAGCT AAGAA

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Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Characiformes	Hemiodontidae	<i>Anodus</i> sp.	4483	3			ACCGCGTTTATACGAGAG ACCCTAGTTGATAGCCGC GGCGTAAAGAGTGGTTAG GGATACCCCAAAATAAA GCCAAAGACCTCCCAAGC TGTTACACGCATCTCGGA GGCACGAAGCCCCTACTAC GAAAGTGACTTTAATCTC TTCCCGACGCCACGAAAG CTAAGAA
Characiformes	Anostomidae	<i>Abramites hypselonotus</i>	1304	1			ACCGCGTTTATACGAGAG ACCCTAGTTGATAGCTAC GGCGTAAAGGGTGGTTG AGATAAATACAAATAAA GCTAAAGACCTTCTAAGC TGTTACAAGCACTCCGAA GACACGAAACCCCAACAC GAAAGTAGCTTTACTACA CTTGACGCCACGAAAGCT AAGAA
Characiformes	Anostomidae	<i>Leporinus apollo</i>	846	3			ACCGCGTTTATACGAGAG ACCCTAATTGATAGCTCA CGCGTAAAGGGTGGTTT GGGAAACCTCAAATAAA AGCTAAAGACCTTCTAAG CCGTACACGCATACCGA AGCACGAGACCTAGCA CGAAAGTAGCTTTACTAT TACCCCTGACGCCACGAA AACTAAGAA
Characiformes	Anostomidae	<i>Leporinus fasciatus</i>	31	1			ACCGCGTTTATACGAGAG ACCCTAATTGATAGCAC GGCGTAAAGAGTGGTTG GGAAAGCCCAAAAATAAA GCTAAAGACCTTCTAAGC CGTACACGCACGCCGAA GGCACGAAGCCCTGACAC GAAAGTAGCTTTACTATT ACCCCGACGCCACGAA GCTAAGAA
Characiformes	Anostomidae	<i>Schizodon knerii</i>	46,775	6			ACCGCGTTTATACGAGAG ACCCTAATTGATAGGCAC GGCGTAAAGAGTGGTTAG GGGTAGACTATAAATAAA GCTAAAGACCTTCTAAGC TGTCATACGCACACCGAA GGCATGAAGTCCTAATAC GAAAGTAGCTTTACTATT ATCCTTGACGCCACGAA GCTAAGAA
Characiformes	Chilodontidae	<i>Caenotropus labyrinthicus</i>	14	1	INPA-ICT 055404	S2	ACCGCGTTTATACGAGAG ACCCTAGTTGATATGTAC GGCGTAAAGAGTGGTTG GGACACCTTAATAAATAA AGCCAAAGACCTCCCAA GCTGTTGTACGCACTCCG GAGGCACGAAGCCCTAAT ACGAAAGTAGCTTTATTG AGCCCGACGCCACGAAAG CTAAGAA
Characiformes	Curimatidae	<i>Potamorhina</i> sp.	18,470	3			ACCGCGTTTATACGAGAG ACCCTAGTTAATATATAC GGCGTAAAGAGTGGTTG GGGTAAATACTTAATAAA GCCGAAGATCCCCCAAGC CGTCACACGCACCTCCGGA GACACGAAGCCCCAGCAC GAAAGTAGCTTTACAAAG ACCCCGACGCCACGAA GCTAAGAA
Characiformes	Prochilodontidae	<i>Prochilodus harttii</i>	90,591	6			ACCGCGTTTATACGAGAG ACCCTAGTTGATATATAC GGCGTAAAGAGTGGTTG GAATAACCAAGTAATATA GCCAAAGACCTCCCAAGC CGTCACACGCACCCCGGA GGCACGAAGCCCAACAC GAAAGTAGCTTTATTAAC TTACCGACGCCACGAAAG CTAAGAA

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Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Characiformes	Prochilodontidae	<i>Semaprochilodus</i> sp. 1	15,460	5			ACCGCGTTTATACGAGAG ACCCTAGTTGATATACAC GGCGTAAAGAGTGGTTTG GGACAAACCAAATAATAG AGCCAAAGACCTCCCAAG CCGTACACGCACCCCGG AGGCACGAAGCCCAAGCA CGAAAGTAGCTTTATTAC ACCCCGACGCCACGAAA GCTAAGAA
Characiformes	Acestrorhynchidae	<i>Acestrorhynchus falcatus</i>	11,546	5	INPA-ICT 055991	S2	ACCGCGTTTACACGAGAG ACTCAAGTTAATAGACTA CGGCGTAAAGCGTGGTTA GGGGCCCTTAATAACTAA AGCCAAAGATCTTCTATG TCGTGCGCAGCAACGCGA AGAAACGAAGCCCAACA CGAAAGTAGCTTTATTTC CCCTGACCCACGAAAGC TAAGAT
Characiformes	Chalceidae	<i>Chalceus erythrurus</i>	8741	5	INPA-ICT 055360	S1, S2	ACCGCGTTTATACGAGAG ACCCTAGTTGATAGCTAC GGCGTAAAGAGTGGTCTA GGACCCACAGCAAATTA AGCCAAAGACCTCCCAAG CTGTGCGCAGCACC CGGA GGCAGGAAGCCCAACAC GAAGTAGCTTTATCACA TCTCTAACCCACGAAA GCTAAGAA
Characiformes	Chalceidae	<i>Chalceus macrolepidotus</i>	4158	2			ACCGCGTTTATACGAGAG ACCCTAGTTGATAGACTA GGCGTAAAGAGTGGTCTA GGACCCACAACAAATAA AGCCAAAGACCTCCCAAG CTGTGCGCAGCACC CGG AGGCACGAAGCCCAACA CGAAAGTAGCTTTATTAC ATTCTCTAACCCACGA AAGCTAAGAA
Characiformes	Characidae	<i>Charax pauciradiatus</i>	10,186	5			ACCGCGTTTATACGAGAG ACCCAAATTAATAGCTAC GGCGTAAAGAGTGGTTTG GGGTAATAATAAAGC CGAATACTCTCCTGGCCG TCGCACGCATTTGAGAG CATGAAGCCCTATAACGA AAGTAGCTTTACCAATAT TTTCTGACCCACGAAA GCTAAGAA
Characiformes	Characidae	<i>Charax</i> sp. 1	32	1			ACCGCGTTTATACGAGAG ACCCTAATTAATAGCTAC GGCGTAAAGAGTGGTTTA GGGTAATAATAAAGC CCGAAGATTCTCATGGCC GTTGTACGCATTCTGAGA ATATGAAGCCCAACAGC AAAGTAGCTTTACCAGTA ATTCTGACCCACGAA AGCTAAGAA
Characiformes	Characidae	<i>Ctenobrycon hauxwellianus</i>	491	3			ACCGCGTTTATACGAGAG ACCCTAGTTGATAAACAC GGCGTAAAGAGTGGTTAG GATAAAAAGAAAAATAAAG TCAAATGCCCTCTAGGCC GTTACACGCATTCTGAGA ACATGAAGCCCCACTACG AAAGTAACTTTACTATTT CCGACCCACGAAAGCTA AGAA
Characiformes	Characidae	<i>Jupiaba ocellata</i>	1150	4			ACCGCGTTTATACGAGAG ACCCTAGTTGATAAATAC GGCGTAAAGAGTGGTTAT GGGAAAAACAATAAAGT CAAACAACCTCTTAGCTG TTATACGCATTATGAGAG TATGAAGCCCTCACGA AAGTAACTTTAATATCTC CTGACCCACGAAAGCTA AGAA

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Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Characiformes	Characidae	<i>Moenkhausia lepidura</i>	782	3			ACCGCGTTTATACGAGAG ACCCTAGTTGATAGCTAC GGCGTAAAGCGTGGTTAG GAGAACAAATATAAATAA GTCAAACAATCTCTCGGC CGTTATACGTTATCTGAG AATATGAAGTCTACCAC GAAAGTAACTTTAATTTT TCTGACCCACGAAAAC GAGGA
Characiformes	Serrasalmidae	<i>Myloplus rubripinnis</i>	232	4			ACCGCGTTTATACGAGAG ACCCTAGTTGACAGCTAC GGCGTAAAGAGTGGTTTG GGCACCCATAAAAATA AAGCCAAAGACCTTCCAA GCTGTCAAAGCACTCCG GAGGCACGAAACCCCAAC ACGAAAGTAGCTTACCT TCACCCGACGCCAGAA AGCTAAGAA
Characiformes	Serrasalmidae	<i>Pygocentrus nattereri</i>	19,766	9	INPA-ICT 055811	S1, S2	ACCGCGTTTATACGAGAG ACTCCAGTTGATAGCTAC GGCGTAAAGAGTGGTTTG GGGCCACCCAAAATAA AGCCAAAGACCTCCCAAG CCGTCAAAGCACCCTCGG AGGCACGAAGTCTAACG CGAAAGCACTTTACCTC CCCCGACGCCACGAAAG TAAGAA
Characiformes	Iguanodectidae	<i>Bryconops affinis</i>	9344	5			ACCGCGTTTATACGAGAG ACCCTAATGATAGACTA CGGCGTAAAGAGTGGTTT AGAACAATAAATAAATAA GCCAAAGATCCTCTGGC CGTCGACGCACTTCGAG GATACGAAGCCCACTAC GAAAGTAGCTTTACTATT AACTTTTCTGACCCACG AAAGCTAAGAA
Characiformes	Triporthidae	<i>Triporthes</i> sp. 1	232	3			ACCGCGTTTATACGAGAG ACCCAAGTTGATAAATAC GGCGTAAAGAGTGGTTAA GGATAATAAAGAAATAA GCCAAAGGCTTCCAAGC TGTACACGCACCTCTAA GGTACGAAGCCCAACAC GAAAGTAGCTTTACCACC TGCTGACCCACGAAAG CTAAGAA
Siluriformes	Loricariidae	<i>Dekeyseria amazonica</i>	86	1	INPA-ICT 055419	S1	ACCGCGTTTATACGAAAG ACCCAGTTTATATACAC GGCGTAAAGGGTGGTTAG GGGACAAAATAAATAAAG CCAAAGACCTCTAAGCC GTCATACGCTCAGGAAG TACTAAGCCCAACACGA AGGTAGCTTTACTAAACA TACCCGACTCCAGAAAG CTGAGAA
Siluriformes	Loricariidae	<i>Hypostomus plecostomus</i>	113	1			ACCGCGTTTATACGAAAG ACCCTAGTTTATAGGTAC GGCGTAAAGGGTGGTTAG GGGACAAAATAAATAAAG CCAAAGACCTCTAAGCC GTCATACGCTCAGGAGG CAGGAAGCCCAACACGA AAGTAGCTTACCAACA TGCCCGACTCCAGAAAG CTGGGAA
Siluriformes	Loricariidae	<i>Lasiancistrus saetiger</i>	1837	1			ACCGCGTTTATACGAAAG ACCCTAATTTATAGACAC GGCGTAAAGGGTGGTTAG GGGACAAAATAAATAAAG CCAAAGACCTCTAAGCC GTCATACGCTCAGGAGG CAGGAAGCCCAACACGA AAGTAGCTTTACCAACA TGCCCGACTCCAGAAAG CTAGGAA

Continued



Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Siluriformes	Doradidae	<i>Hemiodoras morrissi</i>	14	1	INPA-ICT 055422	S1	ACCGCGGTTATACGAAAG ACCCTAGTTGATAGATCA CGGCGTAAAGGGTGGTTA AGGAGAACAATAAATAAG CTAAAGATCCTCTAAGCT GTCATACGCTTCCGAAG ACATGAGATCCAACCACG AAAGTAGCTTTAAACTGT CCTGACGCCACGAAAGCC AAGAA
Siluriformes	Auchenipteridae	<i>Liosomadoras morrowi</i>	25	1			ACCGCGGTTATACGAAAG ACCCAAGTTGATTAATTA CGGCGTAAAGGGTGGTTA AGGTAAATTTGAAAATAA GGCTAAAGACTCTCCAGG CTGTCATACGCTCTCCGA GATAACGAGACCCTCACA CGAAAGTATCCTTAAAT TTAAACCCTGACGCCACG AAAGCCAAGAA
Siluriformes	Doradidae	<i>Megalodoras uranoscopus</i>	9	1	INPA-ICT 055491	S1	ACCGCGGTTATACGAAAG ACCCTAGTTGATAGACTA CGGCGTAAAGGGTGGTTA AGGATTACAAAATAAAG CTAAAGATCCTCTAGGCT GTCATACGCTTCCGAGG AGATGAAACCCAGCCACG AAAGTAGCTTTAAACCC TCCTGACACCACGAAAGC CAAGAA
Siluriformes	Doradidae	<i>Platydoras costatus</i>	40	2			ACCGCGGTTATACGAAAG ACCCTAGTTGATAGACTA CGGCGTAAAGGGTGGTTA AGGAATACAAAATAAAG CTAAAGATCCTCTAGGCT GTCATACGCTTCCGAGG AGATGAAGCCCCACCACG AAAGTAGCTTTAAGCATC TCCTGACACCACGAAAGC CAAGAA
Siluriformes	Doradidae	<i>Pterodoras granulosus</i>	94	1	INPA-ICT 055463	S1	ACCGCGGTTATACGAAAG ACCCTAGTTGATAGCCCA CGGCGTAAAGGGTGGTTA AGGGCCACAAAATAAAA GCTAAAGATCCTCTAGGC TGTACATACGCTCTCCGAG GATATGAGACCCACCAC GAAAGTAGCTTTAAGCAT CTCTGAAACCACGAAAG CCAAGAA
Siluriformes	Doradidae	<i>Trachydoras nattereri</i>	34	1	INPA-ICT 055660	S3	ACCGCGGTTATACGAAAG ACCCTAGTTGATGGATCA CGGCGTAAAGGGTGGTTA AGGAGAACAATAAATAAG CTAAAATCCTCTAAGCT GTCATACGCTTCTGAAG ACATGAGACCCCAACCACG AAAGTAGCTTTAAACTTT CCTGACACCACGAAAGCC AAAGA
Siluriformes	Pimelodidae	<i>Hypophthalmus edentatus</i>	472	2			ACCGCGGTTATACGAAAG ACCCTAGTTGATAGCCAC GGCGTAAAGGGTGGTTAA GGTATCCTACAATAAAG CTAAAGAGCCTTAAGCC TGCGCAGCATTCCGAGA GCCGAAACCCAAACACG AAAGTAGCTTTAAAACA ACACACCTGACTCCACGA AAGCTAAGAA
Siluriformes	Heptapteridae	<i>Pimelodella cristata</i>	1359	7			ACCGCGGTTATACGAAAG ACCCTAGTTGATAGGCAC GGCGTAAAGGGTGGTTAG GGATATATCAAAAATAAA GTTAAAGAGCCTTAAGC TGTGACGCGATCCCGAG AGCTGAGACCCAAACAC GAAAGTAACTTTAAAATA CTTACCTGACCCACGA AAGCTAAGAA

Continued

Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Siluriformes	Pimelodidae	<i>Pseudoplatystoma reticulatum</i>	2064	6			ACCGCGTTTATACGAAAG ACCCTAGTTGATAGCCAC GGCGTAAAGGGTGGTTAA GGTAACTAATAATAAAG CTAAAGAGCCTCTAAGCC GTCCGACGCATTCCGAGA GCTCGAAGCCCAACACG AAAGTAGCTTTAAAATAA AGCACACCTGACCCACG AAAGCTAAGAA
Siluriformes	Pimelodidae	<i>Pinirampus pinirampu</i>	4	1	INPA-ICT 055316	S1	ACCTCGGTTTATACGAAAG ACCCTAGTTGATGGCCAC GGCGTAAAGGGTGGTTAA GGTAACTAATAATAAAG CTAAATAGCCTCTAAGCC GTCCGACGCCTGAGA ACTAGAACTCAAAAACG AAAGTAGCTTTAAAACAA CCCCACCTGACCCACGA AAGCTAAGAA
Siluriformes	Pimelodidae	<i>Pseudoplatystoma tigrinum</i>	183	2	INPA-ICT 055379	S1	ACCGCGGTTTATACGAAAG ACCCTAGTTGATAGCCAC GGCGTAAAGGGTGGTTAA GGTAACTAATAATAAAG CTAAAGAGCCTCTAAGCC GTCCGACGCATTCCGAGA GCTCGAAGCCCAACACG AAAGTAGCTTTAAAACAA AACACACCTGACCCACG AAAGCTAAGAA
Siluriformes	Pimelodidae	<i>Hemisorubim platyrhynchos</i>	110	1			ACCGCGGTTTATACGAAAG ACCCTAGTTGATAGCCAC GGCGTAAAGGGTGGTTAA GGTATAATAATAATAAAG CCAAAGAGCCTCTAAGTC GTCGTACACATTCCGAGT GCTCGAAGCCCAATACG AAGGTTGCTTTAACATAA CATACACCTGACCCACG AAAGCTAAGAA
Siluriformes	Pimelodidae	<i>Brachyplatystoma vaillantii</i>	25	1			ACCGCGGTTTATACGAAAG ACCCAGTTGATAGCCAC GGCGTAAAGGGTGGTTAA GGTAAATAATAATAAAG CTAAAGAGCCTCTAAGTC GTCCGACGCATTCCGGGA GCTCGAAGCCAGACACG AAAGTAGCTTTAAAATAA AATACACCTGACTCCACG AAAGCTAAGAA
Siluriformes	Pimelodidae	<i>Sorubimichthys planiceps</i>	431	1			ACCGCGGTTTATACGAAAG ACCCTAGTTGATAGCCAC GGCGTAAAGGGTGGTTAA GGTAGACAACAAATAAAG CTAAAGAACCTCTAAGCT GTCCGACGCATTCCGAGA ACTCGAAGCCCAACACG AAAGTAGCTTTAAAACAA AAACACCTGAACCCACGA AAGCTAAGAA
Siluriformes	Pimelodidae	<i>Sorubim elongatus</i>	282	1			ACCGCGGTTTATACGAAAG ACCCTAGTTGATAGCTGC GGCGTAAAGGGTGGTTAA GGTATAATAATAATAAAG CTAAAGAACCTCCAAGCC GTCGTACGCATTATGAGA GCTCGAAACCCAAGCACG AAAGTAGCTTTAAAAAAT CACACCTGACCCACGAA AGCTAAGAA
Siluriformes	Pimelodidae	<i>Phractocephalus hemiliopterus</i>	316	4			ACCGCGGTTTATACGAAAG ACCCTAGTTGATAGCTAC GGCGTAAAGGGTGGCTAA GGCAGACAACAAATAAAG CCAAAGAGCCTCTAAGCC GTCCGACGCCTCCGAGG CCTCGAAATCCAACACG AAAGTAGCTTTAAAACAA AACACACCTGACCCACG AAAGCTAAGAA

Continued

Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Siluriformes	Pimelodidae	<i>Zungaro jahu</i>	31	1			ACCGCGTTTATACGAAAAG ACCCTAGTTGATAGCCAC GGCGTAAAGGGTGGTTAA GGTAAATAATAATAAAG CTAAAGGGCTCTAAGCC GTCCGACGCATTCCGAGA GCTCGAAACCCAAGCAG AAAGTAGCTTTAAAATAA AACACACCTGACCCACG AAAGCTAAGAA
Gymnotiformes	Gymnotidae	<i>Electrophorus varii</i>	1234	5			ACCGCGTTTATACGAGAG ACTCCAGTTGACAGAAGT CGGCATAAAGAGTGGTTA TAATACACCCAAATAAAG CCAAAATCTCTAGAGCC GTCATACGCTTTCCAGAG ACATGAAGCCCTAACACG AAAGTAGCTTTATGACAT TGAACCCACGAAAGCTAA GAA
Gymnotiformes	Gymnotidae	<i>Gymnotus carapo</i>	121	1			ACCGCGTTTATACGAGAG ACCCTAGTTGATAATTAC GGCGTAAAGAGTGGTTAA GGAACACTACACAATTAAG CCAAACACTTCCCGGCT GTTATACGCTCCCGGAAA TAACGAAACCCAAACGCG AAAGCAGCTTTATATTAT AAGCTGACCCACGAAA GCTAAGAT
Gymnotiformes	Sternopygidae	<i>Eigenmannia limbata</i>	10,443	7	INPA-ICT 055420	S1, S2, S3	ACCGCGTTTATACGAGAG GCCCTAGTTGATAGCCAC GGCGCAAAGAGTGGTTAA GGAGCCCACTAAATAAA GTGGAACACTTCCTAGGC CGTTATACGCTTTCTAGA AGCACGAAACCCAATTAC ACGAAAGCAACTTTATAC TAAATAACCTGACCCAC GAAAGCTAAGAA
Gymnotiformes	Apteronotidae	<i>Apteronotus albifrons</i>	567	5			ACCGCGTTTATACGAAAAG ACCCAAGTTGATAGTCAC GGCGTAAAGAGTGGTTAA GGGAACTAATAATAAAG CCAAACACTTCCAGGCC GTTGCACGTTTTCTGGAA ACACGAAAGCCCAATCAG AAAGTAGCTTTACATAAA CCACTGACCCACGAAA GCTAAGAA
Characiformes	Ctenoluciidae	<i>Boulengerella maculata</i>	126	1	INPA-ICT 055263	S1	ACCGCGTTTAGACGAGTA GGCCCAAGTTGATAGATT ACGCGTAAAGAGTGGTT AAGGATTTTCTCCAAATT AAAGCCAAAGGCCTTCAT CGTGTTATAAGCAGATC CGAAGATCCGAAGCCAT AACGAAAGTAGCTTTATT ACCACCTGACCCACGAA AGCTAAGGA
Cichliformes	Cichlidae	<i>Cichla ocellaris</i>	52	1			ACCGCGTTTATACGAGAG GCCCAAGTTGACAGACAC CGGCGTAAAGAGTGGCTA GGGAAAAATTAFACTAA AGCCGAACACCTTCAGAA CTGTACATCGTTCCCGAA GATAAGAAAGCCACCAC GAAAGTGACTTTATATTA CCGACCCACGAAAGCT GTGAA
Cichliformes	Cichlidae	<i>Hypselecara temporalis</i>	38	1			ACCGCGTTTATACGAGAG GCCCAAGTTGACAGGTTT CGGCGTAAAGAGTGGTTA AGGAAAAATTAFACTAA AAGCCGAACCCCTCAGA ACTGTTATACGTTTCCGA AGGAATGAAGCCCTACCA CGAAAGTGGCTTTACCCT ACCCGACTCCACGAAAGC TGCGAAA

Continued

Order	Family	Species	Read abundance	Frequency	CBS	Station	Representative sequence
Pleuronectiformes	Achiridae	<i>Hypoclinemus mentalis</i>	50,324	1	INPA-ICT 055269	S1	GCCGCGTTTACACGAGAG GTCCAAGTTGATAAACAA CGGCGTAAAGGGTGTTA GGAATAAAATAAACTAA AGCCGAACGGTTCACAAA GTCATCCTCAAGCTAACG AGAACATGAAGCCCAACC ACGAAAGTGGCTTTACAT AATTCTGAATCCACAAA GCTAAGAA
Perciformes	Sciaenidae	<i>Plagioscion squamosissimus</i>	1220	2	INPA-ICT 055328	S1	ACCGCGTTTATACGAGAG GCCCAAGTTGATACTCCA CGGCGTAAAGAGTGTTA AAAAAAGACCTATTACTA AAGCCGAACGCCTTCAAA GCTGTTATACGCATCCGA AGGTGAGAAAGCCACCCA CGAAAGTGGCTTTACAAC CTTGACCCACGAAAGCT ACGAC

**Table 1.** List of 58 species identified with sequence similarities > 98.5% using the public reference libraries for 12S rRNA in the Javari River basin. S Station, S1 Javari River, S2 Terra firme stream, S3 Quixito River. Voucher numbers for species detected with capture-based sampling are provided.

is also corroborated by the Chao II species richness bias-corrected estimator for MBS, which predicted 216 species (95% confidence interval: 163–318).

*Stream (station 2).* CBS caught 56 species, 38 genera, 21 families, and 6 orders. In contrast, in the stream, MBS detected 126 species, 22 genera, 17 families and 4 orders (Fig. 4D,E; Tables S7, S8). Six species were detected by both methodologies (Table 1). The rarefaction curve for CBS extrapolates to slightly over 60 species the diversity in the stream (Fig. 4F). Conversely, MBS Chao II bias-corrected estimator calculated 145 species in the stream (95% confidence interval: 134–172).

## Discussion

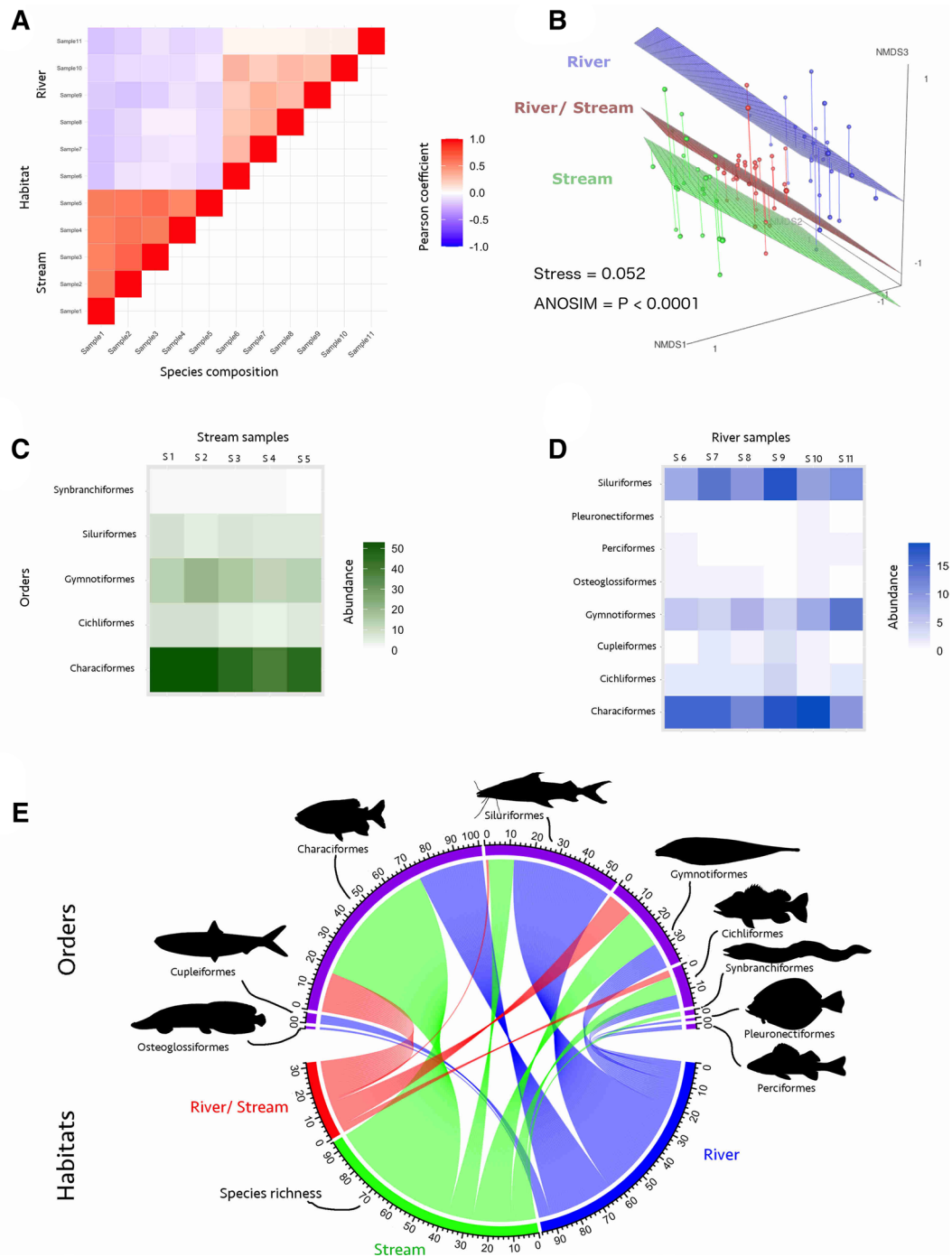
**Can eDNA provide an accurate snapshot of the Amazonian megadiverse freshwater ichthyofauna considering current public reference libraries for 12s rRNA?** The Javari River basin contains a considerable fraction of Amazonian fish diversity, ca. 15% of species, 37% of genera, 60% of families, and 83% of orders. It is, therefore, an excellent testing ground for eDNA metabarcoding effectiveness for the Amazonian fish fauna. Based on the current public reference libraries, i.e., GenBank and MiFish DB, MBS provided an accurate snapshot of the Amazonian megadiverse freshwater ichthyofauna at the Javari River basin when we consider higher taxonomic levels, i.e., order.

The detection of 222 species in 11 samples from three stations confirms that eDNA is highly sensitive. However, the low number (28%) of matching sequences with identity of > 98.5% in the public reference libraries suggests severe gaps in the library for Amazonian fishes. It corroborates a recent global gap analysis of reference databases<sup>24</sup>, which revealed that 13% of the over 33,000 known teleostean fish species are sequenced for 12S, representing 38% of genera, 80% of families and 98.5% of orders. For freshwater fishes, among all continents, South America and Africa had by far the lowest coverage. Not surprisingly, we found the lowest eDNA identification match at the species level.

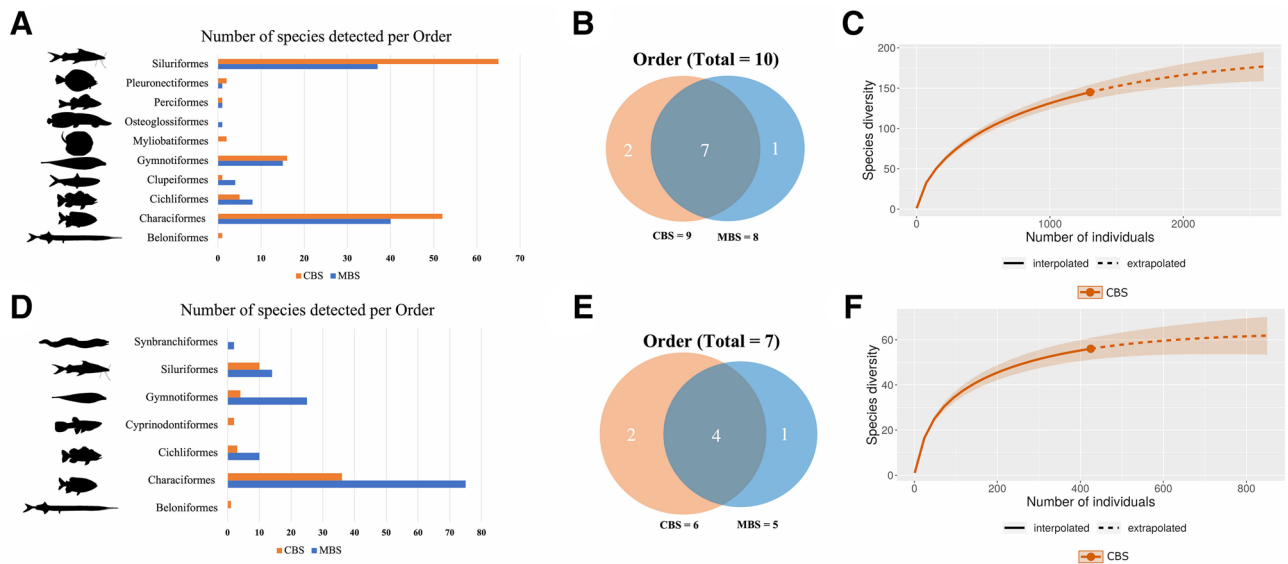
Conversely, studies that built reference libraries for highly diverse fish communities considerably improved the match ratio to species identification between capture-based and eDNA approaches<sup>30</sup>, for example, identified 65% of 203 species of Guianese fishes. Likewise<sup>37</sup>, detected and correctly assigned all 67 species with 12S previously designed primers and reference library in the São Francisco River, Brazil. In contrast<sup>32</sup>, assigned only 4 of 84 MOTUs to species, demonstrating problems of taxonomic resolution in the target gene and general threshold used for species assignment.

The DNA barcoding and eDNA metabarcoding both rely on short, variable, standardized DNA regions, which can be amplified by PCR, sequenced, and analyzed to identify taxa. The eDNA approach for vertebrates does not efficiently employ the COI gene because interspecific genetic variation prevents the use of universal primers<sup>38</sup> and can result in non-specific amplifications<sup>39</sup>; but see<sup>40</sup>. Instead, rRNA genes used in DNA metabarcoding, such as 12S rRNA (e.g.,<sup>3</sup>), have the acceptable resolution at the species level and an elevated copy number per cell due to the number of mitochondria per cell. Similarly, rRNA genes are preferable over single-copy nuclear DNA, which is less likely to be detected in the environment. Yet, the low substitution rate of rRNA genes will compromise the identification of rapidly evolved and complex fish assemblages such as those in the Neotropical region. Thus, it is likely that, in the near future, DNA barcoding and eDNA metabarcoding methods will converge to use large portions of the mitochondrial genome. Regardless of the fragment or the threshold used to delimit species (e.g.,<sup>32</sup>), it is essential that studies involving eDNA for assessing fish diversity move towards building robust mitochondrial DNA reference libraries based on vouchered specimens.

In addition to the two aforementioned factors, other specific issues such as low sampling effort in the stream (i.e., restricted to a 50-m stretch), difficulty to sample cryptobiotic habits, hidden species diversity, and lack of



**Figure 3.** Ichthyofauna segregation into river and stream at Javari Basin as detected by 11 samples of eDNA in the three stations: stream (station 2): samples 1 to 6; Javari river (station 1): Samples 6 to 10; and Quixito River (station 3): sample 11. **(A)** Heatmap based on the Pearson correlation coefficients between species composition and habitat. Note the difference in the species composition along the river, i.e., Javari versus Quixito rivers **(B)** Non-metric multidimensional scaling (NMDS) based on Jaccard's dissimilarities coefficients discriminating habitat (streams vs. rivers). The Stress of the NMDS plot 0.052 indicates that its first three axes provided an appropriate three dimensional representation of the habitats according to their species composition. Each dot represents a species and the relative distance between two points represents the dissimilarity. The ANOSIM  $p < 0.0001$  suggests that NMDS significantly distinguished between the river and stream communities; **(C)** Heatmap for species abundance for each of the five orders detected in the stream; **(D)** Heatmap showing species abundance for each of the eight orders detected in the Javari river and Quixito River. Note the alteration in species abundance between samples 5 and 10 (Javari) and 11 (Quixito). In samples 5 and 10 Characiformes and Siluriformes are more abundant. Conversely, Gymnotiformes and Siluriformes are more species rich in the sample 6. **(E)** Chord diagram showing the directional relationship between habitat and species richness distributed into the nine detected orders.



**Figure 4.** Comparison between Capture-Based Sampling (CBS) in blue and Molecular-Based Sampling (MBS) in red in two sampled localities. Javari River: (A) Histogram comparing the number of species per order detected by CBS and MBS; (B) Venn diagram of the number of orders detected by CBS and MBS; (C) Rarefaction species accumulation curve for CBS with 95% confidence interval and extrapolation for twice the number of individuals sampled. Terra firme stream: (D) Histogram comparing the number of species per order detected by CBS and MBS; (E) Venn diagram of the number of orders detected by CBS and MBS; (F) Rarefaction species accumulation curve for CBS with 95% confidence interval and extrapolation for twice the number of individuals sampled.

an appropriate threshold for taxonomic assignments<sup>32</sup> in Amazonian fishes could have contributed to the low overlap between CBS and MBS in our study. Examples of these problems are discussed in the section below.

**eDNA species detection across heterogeneous aquatic environments.** Amazonian aquatic environments are characterized by specialized fish communities segregated across a variety of habitats, such as streams, rivers, and their microhabitats<sup>14,41</sup>. In streams, diverse microhabitats are home to leaf-dwelling, sand-dwelling, and pool-dwelling fish communities<sup>42–44</sup>. Similarly, rivers have specialized fish groups living in high-energy or deep water (> 5 m) environments. It is critical that fishes inhabiting all aquatic environments are sampled in biodiversity inventories. Perhaps unsurprisingly, it is incredibly difficult to sample and therefore assess some microhabitats by CBS. For example, some species are buried deep in the roots of plants in the riparian zone (e.g.,<sup>45</sup>), leaf litter, or in the sand of streams that are extremely difficult to collect with traditional sampling gear. These life history strategies naturally obscure the number of fish species living in these areas due to microhabitat partitioning and undescribed diversity. We corroborate the potential effectiveness of MBS to detect specialized fish assemblages across heterogeneous aquatic environments. More intensive sampling efforts might be required to detect low-occurrence taxa as well as to appropriately sample microhabitats, e.g., filtering a higher amount of water or collecting water from temporary pools and the river bottom.

**River.** In the Javari River (station 1), seven orders were detected by CBS and MBS (Characiformes, Cichliformes, Clupeiformes, Gymnotiformes, Perciformes, Pleuronectiformes, Siluriformes). In addition, CBS detected Beloniformes and Myliobatiformes; and MBS found Osteoglossiformes. The absence of Beloniformes and Myliobatiformes in the MBS could be due to the poor reference library for comparisons. In contrast, Osteoglossiformes (*Arapaima gigas*) is well known to occur in the region and specimens were found in the local market. Thus, the absence of *Arapaima* in the CBS was circumstantial.

The difference in species composition between the two methodologies that was detected possibly is due to sampling bias in MBS. Water samples for MBS were only collected at the river surface, detecting mostly free DNA of fish assemblages occurring at midwater and near the surface, where species-diverse Characiformes are the dominant assemblage. Despite that, as aforementioned, MBS was also able to take a snapshot of the benthic fish fauna by detecting many catfish species typically restricted to river channels (e.g.,<sup>46,47</sup>). For example, MBS detected river-dwelling fishes living near the surface, as well as some deep-water (> 5 m depth) inhabitants e.g., *Brachyplatystoma* spp.—goliath catfishes; Pleuronectiformes—flatfishes; and a large number of unidentified species of electric fishes (sequences identities within the range of 80–98.5%) belonging to the families Apterontidae (10 species) and Sternopygidae (15 species)—common, but often underestimated components of rivers (e.g.,<sup>48–50</sup>).

In addition, the sole sample collected in the mouth of the Quixito River (station 3) was substantially different from the five samples collected in the Javari River reflecting the different milieu where the samples were collected. The Javari samples were dominated by Characiformes whereas Gymnotiformes dominated in the Quixito River sample. In the Javari River, samples were collected in fast-flowing water along the edge between a shallow peat

bog and the main channel. The Quixito River sample was collected at the mouth of the river, characterized by small slow-flowing channel.

**Stream.** Typically, Characiformes, Siluriformes, Gymnotiformes, Cichliformes, Cyprinodontiformes, Beloniformes, and Synbranchiformes are the dominant orders in Amazonian streams (e.g.,<sup>51</sup>). At station 2, both approaches detected species belonging to Characiformes, Siluriformes, Gymnotiformes, and Cichliformes. In addition, CBS found Beloniformes and Cyprinodontiformes whereas MBS detected Synbranchiformes for a total of seven orders. The absence of Beloniformes in the MBS may be due to the poor reference library for comparisons, and the absence of Synbranchiformes in the CBS here could be due to the difficulty in collecting cryptobiotic species. We were able to detect at a fine-scale specialized species assemblage restricted to microhabitats. For example, we captured members of the leaf-dwelling (e.g., *Apistogramma* spp.—dwarf cichlids) and sand-dwelling (e.g., *Gymnorhamphichthys* spp.—sand knifefishes) fish communities. It remains to be determined whether eDNA failed to detect fishes that are residents in the temporary pools (e.g., killifishes—Rivulidae) because of the limitation of its radius of action, or due to the poor reference library for Neotropical fishes.

Species diversity in Amazonian *Terra firme* streams ranges from ca. 30–170 species<sup>52</sup> with Characiformes and Siluriformes being the most species-rich orders (e.g.,<sup>53</sup>). Quantification of fish richness in these streams depends upon the sampling methodology employed and its substrate composition (for reviews see<sup>54–56</sup>). For example, in litter banks-rich streams, Gymnotiformes species diversity can surpass Siluriformes (e.g.,<sup>57</sup>). In station 2, according to CBS, Characiformes and Siluriformes were the dominant orders. In contrast, Characiformes followed by Gymnotiformes were the more species-diverse groups. The extremely high number of species detected by MBS in the sampled stream, more than twice that of CBS, primarily in the two dominant orders, Characiformes and Gymnotiformes, is likely related to five different issues. First, MBS was collected near the confluence between the river and stream, which may have resulted in occasional, wandering river fishes. Second, the CBS was conducted with a standardized sampling effort in a restrict (50-m) stretch of the stream (e.g.,<sup>55</sup>), not including its headwaters and areas near its mouth. Third, Characiformes undoubtedly contain hidden species diversity. This is corroborated by the historical difficulty in identification of small tetra species, wherein one named species may represent several undescribed species, such as in *Astyanax* (e.g.,<sup>58,59</sup>). Fourth, diversity is also underestimated for the Gymnotiformes (e.g.,<sup>60</sup>), for which difficulties in capturing species with cryptobiotic habits possibly play a critical role in the underestimation of their diversity by CBS methods (sub-estimative may reach three times the local species richness and up to 10 times the specimens abundance; JZ, unpublished data). Fifth, overestimation may be due to intraspecific variety caused by amplicon sequence variants (ASVs). Any thresholds for taxonomic assignments (e.g., 98.5% as used here) are arbitrary and should reflect both over- and underestimation of species diversity, considering that there are several morphologically cryptic species with large molecular divergence and morphologically distinct species with small genetic divergence. The dereplicated reads were denoised by removing all putatively chimeric and erroneous detections to keep only true sequences, yet overestimations in the number of species may still be the result of ASVs (e.g.,<sup>32</sup>). For example, our recognition of the nine species of *Leporinus* (*Leporinus apollo*, *Leporinus* sp. 2–10; Table S3) could be a consequence of ASVs overestimation. In contrast, only six species of *Leporinus* were detected by MBS across all 46 localities throughout the Javari River basin (Fig. 1; Table S1).

These examples indicate that further studies are needed to find appropriate thresholds for taxonomic assignments in Amazonian fishes.

**The role of natural history museums in the advance of eDNA studies.** The biodiversity crisis is one of the grand challenges of the twenty-first century<sup>61,62</sup> with the next two decades critical for the conservation of freshwater environments. Freshwater ecosystems worldwide hold ca. 30% of vertebrate diversity, including ca. 50% of all fish species diversity, and are one of the most vulnerable environments on Earth<sup>35,62–65</sup>.

Combining specimens, DNA sampling and taxonomic identification is required to obtain a comprehensive assessment of biodiversity. Yet, DNA samples are available for fewer than 10% of the specimens deposited in most fish repositories. Since most fish specimens deposited in museums and other repositories were collected before the development of PCR, a vast majority were fixed in formalin, a standard method of fixation for over a century. Despite the advances in the techniques of DNA extraction from formalin-fixed materials, the success of these techniques is still limited, especially for specimens stored for long periods in unbuffered solutions<sup>66–68</sup>. Thus, well-identified voucher DNA tissue samples are critical for the identification of unknown DNA in environmental samples. These DNA tissues may be stored as dried, frozen, or alcohol-fixed samples or as cryopreserved living samples that have broad potential applications (e.g.,<sup>69</sup>). However, scientific collections in regions holding most of the fish diversity, such as the Neotropics, often lack the ideal infrastructure to hold long-term genetic resources (e.g. ultrafreezers, liquid nitrogen storage, cryo-facilities). Nevertheless, GGBN has targeted and sometimes funded Neotropical institutions to build biorepository capacity and to make their collections globally discoverable.

These limitations are particularly worrisome given the stark reality of anthropogenic destruction, climate change and the great extent of predicted unknown diversity that remains to be described in the Amazon rainforest<sup>70,71</sup>. These factors make this area and Earth's other hotspots of biodiversity priority targets for complete species inventories in the next decade before suffering irreversible damage (e.g.,<sup>72</sup>). Another advantage of eDNA is the long-term biodiversity monitoring in preserved areas/conservation units (e.g.,<sup>73</sup>). The use of eDNA is a highly valuable and cost-effective way to monitor biodiversity, especially in areas with low anthropogenic threats<sup>74</sup>. This would allow a better prioritization of scarce resources for research and/or conservation actions.

In the face of these challenges, natural history museums should play a primary role in the development of eDNA as a tool of biodiversity inventories as well as to track changes in biodiversity hotspots by: (1) prioritizing

expeditions to jointly secure DNA samples, vouchers, and eDNA in Earth's hotspots of biodiversity; (2) adapting their biorepositories to archive eDNA samples, which as a consequence, would provide samples not only for analysis with current but heretofore unseen technologies; (3) creating reference libraries for the mitochondrial genome; (4) backing up DNA samples with species-level accuracy on the identification of vouchered specimens; (5) expanding and improving their tissue biobanks. It is crucial that these modifications for eDNA storage also occur in museums throughout the tropics, but especially in Neotropical and Afrotropical countries, which host most of the freshwater fish diversity yet lack the resources to build and maintain these tissue collections in perpetuity<sup>75–77</sup>. These efforts would maximize the information extracted from eDNA metabarcoding and DNA samples, facilitate the design of sets of universal primers for broader biodiversity inventories, monitor hotspots of biodiversity, and support taxon-specific surveys; (6) improving public platforms to close gaps in sampling information and making possible access to DNA sequences; (7) training students and researchers to use CBS, MBS, morphology and molecular-based taxonomy to survey and identify biodiversity. By combining eDNA with tissues associated with museum-curated voucher specimens, we can continue to fill gaps currently missing in our knowledge of biodiversity, thus, making eDNA a more reliable tool for biodiversity inventories. The high frequency of our lowest taxonomic identifications ending with “sp.,” species undetermined, when assessing species diversity using a new technology highlights the need for highly trained taxonomic specialists. Finally, (8) using eDNA research as a gateway to inspire and engage society in natural history and the race against time to survey and protect Earth's hotspots of biodiversity through education and citizen science programs. Considering the simplicity of implementing MBS in certain aquatic environments, such as rivers (see “Methods” section), scientific communities at natural history museums can launch regional/ global outreach and human resource training initiatives involving citizen scientists, K-12 students, and professional scientists. Likewise, it would create niches for large-scale natural history museums to work with regional-scale scientific institutions worldwide, such as in the training of human resources (e.g., technicians to curate genetic resources) and promoting horizontal transfer of technology in South America and Africa (e.g., eDNA methodology). In sum, activities involving eDNA have the potential to fulfill the priorities of natural history museums in the twenty-first century: research, collections, training, and outreach.

One successful initiative is the DNA barcoding and metabarcoding libraries for Amazonian fishes supported by Smithsonian's Global Genome Initiative (GGI), DNA Barcode Alliance, and São Paulo Research Foundation (FAPESP). The current project is the first of many scientific expeditions planned over the next three years to survey fishes in poorly explored areas of the Amazon basin supported by these three initiatives. DNA and eDNA samples and vouchers are being used to develop a robust, well-documented, mitochondrial DNA reference database. This eDNA database is validated by morphological (phenotypic) vouchers. Additional eDNA samples have been collected and deposited in the Smithsonian Institution's National Museum of Natural History Biorepository. We aim to make available an online platform of DNA sequences of all orders and families, most of the genera, and a significant number of species of Amazonian fishes. Likewise, GGI is also supporting an initiative for African freshwater fishes. These actions together with the ongoing development of eDNA technology and bioinformatics will enable the use of eDNA metabarcoding in fish inventories and the more effective monitoring of hotspots of biodiversity worldwide.

## Methods

**Study area.** The Javari River encompass an area of 109.202 km<sup>2</sup> with a 1180 km of a main white water river channel (sensu Sioli, 1967; i.e., pH-neutral low-transparency, alluvial sediment-laden tributary of the Amazon River forming the border between Brazil, Peru and Colombia for ca. 800 km). The first formal records for the Javari River basin were obtained during the Thayer Expedition to Brazil, in 1865. Most of region remained largely unexplored until our survey conducted along the Javari River basin during the low water season in July–August of 2017.

**Specimens sampling and identification.** All samples were collected according with Brazilian regulations under Jansen Zuanon permanent permit (SISBIO # 10199-3). Capture-based specimens were sampled at 46 localities along the Javari River basin (Fig. 1) during the low water season in July–August, 2017, using gill nets, cast nets, hand nets, and trawl nets in rivers, rapids, beaches, streams, and lakes (Table S1). All fish specimens collected were identified to species level and deposited at the Instituto Nacional de Pesquisas da Amazônia (INPA) under the numbers INPA-ICT 055148 to INPA-ICT 057159, in Brazil.

**Water sampling sites and on-site filtration.** Along with the Capture-based specimens, eleven water samples were collected from water surface at three stations to represent the Javari fish fauna: Station 1, Fig. 1; JAV2017081606 (5 samples)—Javari River, below Limoeiro (– 4.176, – 70.779); Station 2, Fig. 1; JAV2017082108 (5 samples)—*Terra firme* clearwater stream (locally called “igarapés”), i.e., acid, highly-transparent, shallow (depth < 2 m), and non-flooding stream at Palmari community (– 4.293, – 70.291); and Station 3, QUI2017082906 (1 Sample)—Quixito River (– 4.428, – 70.260). We used low-tech bucket-sampling to collect freshwater using a 10L polypropylene bucket fastened to a 5 m rope (nylon rope, 6 mm in diameter) to collect 5L of water. Before the water sampling, we wore disposable gloves on both hands and assembled two sets of on-site filtration kits consisting of a Sterivex filter cartridge (pore size 0.45 µm; Merck Millipore, MA, USA) and a 50 mL disposable syringe. Then we thoroughly decontaminated the bucket with a foam-style 10% bleach solution and brought the equipment to the sampling point. We fastened one end of the 5 m rope to the bucket and collected surface freshwater by tossing and retrieving it. We repeated collection of fresh water three times to minimize sampling biases at each station.



We performed on-site filtration using a filtration kit described above (filter cartridge + syringe) to obtain duplicate samples. With each collection of fresh water, we removed the filter cartridge from the syringe, drew approximately 50 ml freshwater into the syringe by pulling the plunger, reattached the filter cartridge to the syringe, and pushed the plunger to filter the water. We repeated this step twice in each toss of the bucket sampling so that the final filtration volume reached 100 ml. When the filter was clogged before reaching 100-ml filtration, we recorded the total volume of water filtered (70–100 ml from three stations).

After on-site filtration, we sealed an outlet port of the filter cartridge with Parafilm (Bemis NA, Wisconsin, USA), added 2 ml of RNAlater (Thermo Fisher Scientific, DE, USA) into the cartridge from an inlet port of the cartridge using a disposable capillary pipette (Kinglate, USA) to prevent eDNA degradation, and then sealed the inlet port either with Parafilm or a cap for preservation. Filtered cartridges filled with RNAlater were kept in  $-20^{\circ}\text{C}$  freezers until shipment to MM's lab at Natural History Museum and Institute, Chiba, Japan. Samples shipped under export for biological material permit at room temperature using an overseas courier service.

**DNA extraction.** All DNA experiments were conducted in MM's lab and all experimental protocols were approved by the Natural History Museum and Institute. We sterilized the workspace and all equipment before DNA extraction. We used filtered pipette tips and conducted all eDNA-extractions and manipulations in a dedicated room that is physically separated from pre- and post-PCR rooms to safeguard against cross-contamination from PCR products.

We extracted eDNA from the filter cartridges using a DNeasy Blood & Tissue kit (Qiagen, Hilden, Germany) following the methods developed and visualized by<sup>78</sup> with slight modifications.

We connected an inlet port of each filter cartridge with a 2.0-ml collection tube and tightly sealed the connection between the cartridge and collection tube with Parafilm. We inserted the combined unit into a 15-ml conical tube and centrifuged the capped conical tube at  $6000\times g$  for 1 min to remove freshwater and RNAlater. After centrifugation we discarded the collection tube and used an aspirator (QIAvac 24 Plus, Qiagen, Hilden, Germany) to completely remove liquid remaining in the cartridge.

We subjected the filter cartridge to lysis using proteinase K. Before the lysis, we mixed PBS (220  $\mu\text{l}$ ), proteinase K (20  $\mu\text{l}$ ) and buffer AL (200  $\mu\text{l}$ ), and gently pipetted the mixed solution into the cartridge from an inlet port of the filter cartridge. We again sealed the inlet port and then placed the cartridge in a  $56^{\circ}\text{C}$  preheated incubator for 20 min while stirring the cartridge using a rotator (Mini Rotator ACR-100, AS ONE, Tokyo, Japan) with a rate of 10 rpm. After the incubation, we removed the film from the inlet port and connected the port with a 2-ml tube (DNA LowBind tube, SARSTEDT, Tokyo, Japan) for DNA collection. We placed the combined unit in a 50-ml conical tube and centrifuged the capped tube at  $6000\times g$  for 1 min to collect the DNA extract.

We purified the collected DNA extract (ca. 900  $\mu\text{l}$ ) using the DNeasy Blood and Tissue kit following the manufacturer's protocol with a final elution volume of 200  $\mu\text{l}$ . We completed DNA extraction in one round and used one more premix for the extraction blank (EB) to monitor contamination. All DNA extracts were frozen at  $-20^{\circ}\text{C}$  until paired-end library preparation.

DNA aliquots for all 11 samples were deposited at the Museu de Zoologia da Universidade de São Paulo (MZUSP) under the accession numbers MZUSP 125856 to 125866.

**Paired-end library preparation and sequencing.** We sterilized the workspace and equipment in the pre-PCR area before library preparation. We used filtered pipette tips and performed pre- and post-PCR manipulations in two different, dedicated rooms to safeguard against cross contamination.

We employed a two-step PCR for paired-end library preparation on the MiSeq platform (Illumina, CA, USA) and generally followed the methods developed by<sup>3</sup>. For the first-round PCR (1st PCR), we used a mixture of the following four primers: MiFish-U-forward (5'-ACA CTC TTT CCC TAC ACG ACG CTC TTC CGA TCT NNN NNN GTC GGT AAA ACT CGT GCC AGC-3'), MiFish-U-reverse (5'-GTG ACT GGA GTT CAG ACG TGT GCT CTT CCG ATC TNN NNN NCA TAG TGG GGT ATC TAA TCC CAG TTT G-3'), MiFish-E-forward-v2 (5'-ACA CTC TTT CCC TAC ACG ACG CTC TTC CGA TCT NNN NNN RGT TGG TAA ATC TCG TGC CAG C-3') and MiFish-E-reverse-v2 (5'-GTG ACT GGA GTT CAG ACG TGT GCT CTT CCG ATC TNN NNN NGC ATA GTG GGG TAT CTA ATC CTA GTT TG-3'). These primer pairs amplify a hypervariable region of the mitochondrial 12S rRNA gene (ca. 172 bp; hereafter called "MiFish sequence") and append primer-binding sites (5' ends of the sequences before six Ns) for sequencing at both ends of the amplicon. We used the six random bases (Ns) in the middle of those primer to enhance cluster separation on the flow cells during initial base call calibrations on the MiSeq platform.

We carried out the 1st PCR with 35 cycles in a 12- $\mu\text{l}$  reaction volume containing 6.0- $\mu\text{l}$   $2\times$  KAPA HiFi Hot-Start ReadyMix (KAPA Biosystems, MA, USA), 2.8  $\mu\text{l}$  of a mixture of the four MiFish primers in an equal volume (U/E forward and reverse primers; 5  $\mu\text{M}$ ), 1.2- $\mu\text{l}$  sterile distilled  $\text{H}_2\text{O}$  and 2.0- $\mu\text{l}$  eDNA template (a mixture of the duplicated eDNA extracts in an equal volume). To minimize PCR dropouts during the 1st PCR, we performed 8 replications for the same eDNA template using a strip of 8 tubes (0.2 ml). The thermal cycle profile after an initial 3 min denaturation at  $95^{\circ}\text{C}$  was as follows: denaturation at  $98^{\circ}\text{C}$  for 20 s, annealing at  $65^{\circ}\text{C}$  for 15 s and extension at  $72^{\circ}\text{C}$  for 15 s with the final extension at the same temperature for 5 min. We also made a 1st PCR blank (1B) during this process in addition to EB. Note that we did not perform 8 replications and used a single tube for each of the two blanks (EB, 1B) to minimize cost of the experiments.

After completion of the 1st PCR, we pooled an equal volume of the PCR products from the 8 replications in a single 1.5-ml tube and purified the pooled products using a GeneRead Size Selection kit (Qiagen, Hilden, Germany) following the manufacturer's protocol for the GeneRead DNA Library Prep I Kit. This protocol repeats the column purification twice to completely remove adapter dimers and monomers. Subsequently we quantified the purified target products (ca. 172 bp) using TapeStation 2200 (Agilent Technologies, Tokyo, Japan), diluted

it to 0.1 ng/μl using Milli Q water and used the diluted products as templates for the second-round PCR (2nd PCR). For the two blanks (EB, 1B), we purified the 1st PCR products in the same manner, but did not quantify the purified PCR products, diluted them with an average dilution ratio for the positive samples, and used the diluted products as templates for the 2nd PCR.

For the 2nd PCR, we used the following two primers to append dual-index sequences (8 nucleotides indicated by Xs) and flowcell-binding sites for the MiSeq platform (5' ends of the sequences before eight Xs): 2nd-PCR-forward (5'-AAT GAT ACG GCG ACC ACC GAG ATC TAC ACX XXX XXX XAC ACT CTT TCC CTA CAC GAC GCT CTT CCG ATC T-3'); and 2nd-PCR-reverse (5'-CAA GCA GAA GAC GGC ATA CGA GAT XXX XXX XXG TGA CTG GAG TTC AGA CGT GTG CTC TTC CGA TCT-3').

We carried out the 2nd PCR with 10 cycles of a 15-μl reaction volume containing 7.5-μl 2 × KAPA HiFi HotStart ReadyMix, 0.9-μl each primer (5 μM), 3.9-μl sterile distilled H<sub>2</sub>O and 1.9-μl template (0.1 ng/μl with the exceptions of the three blanks). The thermal cycle profile after an initial 3 min denaturation at 95 °C was as follows: denaturation at 98 °C for 20 s, annealing and extension combined at 72 °C (shuttle PCR) for 15 s with the final extension at the same temperature for 5 min. We also made a 2nd PCR blank (2B) during this process in addition to EB and 1B.

To monitor for contamination during the DNA extraction, 1st and 2nd PCRs of the 11 samples, we made a total of 3 blanks (EB, 1B, 2B) and subjected them to the above library preparation procedure.

We pooled each individual library in an equal volume into a 1.5-ml tube. Then we electrophoresed the pooled dual-indexed libraries using a 2% E-Gel Size Select agarose gel (Invitrogen, CA, USA) and excised the target amplicons (*ca.* 370 bp) by retrieving them from the recovery wells using a micropipette. The concentration of the size-selected libraries was measured using a Qubit dsDNA HS assay kit and a Qubit fluorometer (Life Technologies, CA, USA), diluted them at 12.0 pM with HT1 buffer (Illumina, CA, USA) and sequenced on the MiSeq platform using a MiSeq v2 Reagent Kit for 2 × 150 bp PE (Illumina, CA, USA) following the manufacturer's protocol. We subjected the pooled dual-indexed libraries a MiSeq run with a PhiX Control library (v3) spike-in (expected at 5%).

**Data preprocessing and taxonomic assignment.** We performed data preprocessing and analysis of MiSeq raw reads using USEARCH v10.0.240<sup>79</sup> according to the following steps: (1) Forward (R1) and reverse (R2) reads were merged by aligning the two reads using the *fastq\_mergepairs* command. During this process, low-quality tail reads with a cut-off threshold set at a quality (Phred) score of 2, too short reads (< 100 bp) after tail trimming and those paired reads with too many differences (> 5 positions) in the aligned region (*ca.* 65 bp) were discarded; (2) primer sequences were removed from those merged reads using the *fastx\_truncate* command; (3) those reads without the primer sequences underwent quality filtering using the *fastq\_filter* command to remove low quality reads with an expected error rate of > 1% and too short reads of < 120 bp; (4) the preprocessed reads were dereplicated using the *fastx\_uniques* command and all singletons, doubletons, and tripletons were removed from the subsequent analysis following the recommendation by the author of the program<sup>79</sup>; (5) the dereplicated reads were denoised using the *unoise3* command to generate amplicon sequence variants (ASVs) that remove all putatively chimeric and erroneous sequences<sup>80</sup>; (6) finally ASVs were subjected to taxonomic assignments to species names (Molecular Operational Taxonomic Units; MOTUs) using the *usearch\_global* command with a sequence similarity of > 98.5% with the reference sequences and a query coverage of ≥ 90% (two nucleotide differences allowed). Those ASVs with the sequence similarity of 80–98.5% were tentatively assigned “U98.5” labels before the corresponding species name with the highest identities (e.g., U98.5\_*Synbranchus marmoratus*), and they were subjected to clustering at the level of 0.985 using *cluster\_smallmem* command. Nonetheless, using these criteria, any ASVs/MOTUs assigned to species based on < 98.5% sequence similarity represent independent species regardless of species' names. For convenience of biological comparisons and discussion, we call those MOTUs “species”.

An incomplete reference database necessitates this clustering step that enables detection of multiple MOTUs under an identical species name. We annotated such multiple MOTUs with “gotu1, 2, 3...” and tabulated all the outputs (MOTUs plus U98.5\_MOTUs) with read abundances. We excluded those ASVs with sequence identities of < 80% (saved as “no\_hit”) from the above taxonomic assignments and downstream analyses, because all of them were found to be non-fish organisms. For a reference database, we used MiFish DB ver. 36 for taxa assignment, which contained 7973 species distributed across 464 families and 2675 genera. In addition, we downloaded all the fish whole mitochondrial genome and 12S rRNA gene sequences from GenBank as of 15 December 2020.

We refined the above automatic taxonomic assignments with reference to a family-level phylogeny based on MiFish sequences from both MOTUs and the reference database. For each family, we assembled representative sequences (most abundant reads) from MOTUs (including U98.5) and added all reference sequences from that family and an outgroup (a sequence from a closely-related family) in FASTA format. We subjected the FASTA file to multiple alignment using MAFFT<sup>81</sup> with a default set of parameters. We constructed a neighbor-joining (NJ) tree with the aligned sequences in MEGA<sup>782</sup> using pairwise deletion of gaps and the Kimura two-parameter distances<sup>83</sup> with the among-site rate variations modeled with gamma distributions (shape parameter = 1). We assessed statistical support for internal branches of the NJ tree using the bootstrap resampling technique (100 resamplings). In addition, aligned sequences were submitted to Bayesian Inference (BI) analyses run for 10 million generations sampling every 1000 generations to determine posterior probability for each MOTU and reference sequences. Models were obtained on JModeltest<sup>84</sup>. BI analyses were run in the Mr. Bayes v3.2.7<sup>85</sup>. Some of the BI analyses were conducted on the CIPRES science gateway v3.3<sup>86</sup>. Trees were analyzed and rendered in iTOL v5.7<sup>87</sup>.

The MiSeq paired-end sequencing (2 × 150 bp) of the 11 libraries, together with an additional 88 libraries (total = 99), yielded a total of 5,274,381 reads, with an average of 96.5% base calls, with Phred quality scores

of  $\geq 30.0$  (Q30; error rate = 0.1% or base call accuracy = 99.9%). This run was highly successful considering the manufacturer's guidelines (Illumina Publication no. 770-2011-001 as of 27 May 2014) are  $> 80\%$  bases  $\geq Q30$  at  $2 \times 150$  bp.

Of the 5,274,381 reads, a total of 1,903,160 reads were assigned to the 11 libraries, and the number of raw reads for each library ranged from 135,818 to 213,952 with an average of 173,015 reads (Table S8). After merging the two overlapping paired-end FASTq files (1,826,828 reads [96.0%]), the primer-trimmed sequences were subjected to quality filtering to remove low-quality reads (1,802,098 reads [94.7%]). The remaining reads were dereplicated for subsequent analysis, and single- to tripletons were removed from the unique sequences as recommended by the author of the program<sup>79</sup>. Then, reads were denoised to remove putatively erroneous and chimeric sequences, and the remaining 1,677,402 reads (88.1% of the raw reads) were subjected to taxon assignments. Of these, 1,671,871 reads (99.7% of the denoised reads) were putatively considered as sequences for fishes, and BLAST searches indicated that non-fish sequences (5531 reads [0.3%]) mostly consisted of mammals (i.e., cows, pigs, and humans) and a few unknown sequences. The three negative controls (i.e., EB, 1B, and 2B) were subjected to the same analysis pipeline and yielded only 103 denoised reads in total (only 0.006% of the total raw reads), which were not taken into consideration in the subsequent analyses as their subtraction from the corresponding species did not affect the presence/absence data matrix of sequences assignable to fishes. Contamination from non-Amazonian fishes at Miya's lab was detected and removed (Table S9).

**Statistical analyses.** All statistical analyses were conducted in R v.4.0.2<sup>88</sup>.

**Community structure—molecular-based sampling (MBS).** Evaluation of species richness for eDNA included all 11 samples from the river and stream localities. Specifically for river: five samples from station 1 (JAV2017081606) and one sample from station 3 (QUI 2017082906); stream: five samples from station 2 (JAV2017082108). Species richness between CBS and MBS was performed by comparing fish assemblages captured and detected in stations 1 and 2 only. Although a single sample is not appropriate for drawing conclusions about the assemblage composition of a site, in the case of station 3, the single sample shows a trend that is biologically consistent with the community patterns of fishes found along the Amazon basin, e.g., 47, 48. Therefore, we used the single sample from the Quixito River to compare the fish community composition in the three localities.

Species abundance per order was evaluated by heatmaps produced in *ggplot2*<sup>89</sup>. Composition per Similarity among all 11 samples, three stations, versus stream and river assemblages were calculated using the Pearson correlation coefficient. Then, we calculated Jaccard's dissimilarities, and the coefficient values were ordinated using non-metric multidimensional scaling (NMDS) to visualize how replicated eDNA data discriminate sites and habitat (streams vs. rivers) patterns and to determine the sampling effort needed to identify community changes among sites in the VEGAN package version 2.4-4<sup>90</sup>. A 3D graph was produced in CAR<sup>91</sup> and GLR version 0.103.5<sup>92</sup> packages. Differences in species compositions between sites and habitat types were statistically tested by permutational analysis of similarities (ANOSIM). It allowed for test of the statistical significance of similarity between groups comparing to the within groups similarity using the rank of similarity values<sup>36</sup>. A chord diagram showing the inter-relationship between species composition and habitat (river versus stream) was produced using the Circlize package<sup>93</sup>. Fish silhouettes were produced in Fishsualize v. 0.2.1<sup>94</sup> with the addition of a species of Gymnotiformes.

**Species richness.** Water samples station 1 and station 2: the number of detected taxa between CBS and MBS were represented by Venn diagrams. Rarefaction species accumulation curve for capture-based sampling were calculated for stations 1 and 2<sup>95</sup> using iNEXT package in R<sup>96</sup> for Hill number with order  $q=0$  (species richness) with 1000 bootstraps. The dissimilarity species composition among samples in stations 1 and 2 were assessed by calculating pairwise Jaccard's distances with the function *vegdist*. Bias-corrected estimators Chao II<sup>97</sup> was applied to calculate species richness detected by MBS, as suggested by<sup>98</sup>. It was calculated in SpadeR package in R<sup>99</sup>. Species accumulation curves for molecular-based sampling were built using the function *specaccum* in VEGAN package v2.5.4<sup>90</sup>. Graphs were plotted using *ggplot2*.

## Data availability

Raw data will be made public on the DRYAD repository upon acceptance.

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## Author contributions

The study was conceived by C.D.S. and designed by C.D.S. and MM. Environmental samples were collected by C.D.S., D.A.B., J.Z., G.T.V. M.M. and T.S. performed laboratory analyses. Bioinformatic and statistical analyses were performed by C.D.S. and M.M. The manuscript was written by C.D.S. with input from all the authors. C.D.S. coordinated the study.

## Competing interests

The authors declare no competing interests.

## Additional information

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