# PRIMARY RESEARCH PAPER



# Characterization of pure and admixed brown trout (*Salmo trutta*) populations of high conservation value in the upper Danubian contact zone using ddRADseq genotyping

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Abstract Increasing rates of hybridization and introgression in managed populations of freshwater fish are a major threat to the long-term viability of native species. The conservation challenge begins with identifying native gene pools. For brown trout (*Salmo trutta* Linnaeus, 1758) in the Upper Danube drainage, this task is complicated by the presence of both naturally and anthropogenically induced admixture of highly divergent lineages (Atlantic and Danubian). Herein, a ddRADseq protocol was used to type 377 individuals from 24 populations in the Upper Danube in Austria and Germany, and from reference

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L. A. Lecaudey Aquaculture Department, SINTEF Ocean, Trondheim, Norway populations from adjacent drainages and commercial hatcheries. High genetic differentiation at small geographic scales was found among pure Danubian-lineage populations, especially in the Kalkalpen National Park (Austria). In the Upper Danube drainage of Germany, as well as in the Rhine and Elbe drainages, brown trout populations were predominantly of Atlantic-lineage origin - as were those of all commercial hatcheries. Most populations, however, showed various degrees of admixture between Danubian and Atlantic lineages, hypothesized to be the result of both natural and anthropogenic processes. We highlight the conservation value of pure Danubian-lineage populations, and the challenges promoting conservation of naturally admixed populations, while discouraging continued stocking and admixture via management activities.

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# Introduction

Inland fisheries management in much of continental Europe is largely private, highly fragmented in spatial terms, and characterized by a heavy reliance on stocking programs (Pinter et al., 2019; Arlinghaus et al., 2022). This is especially true for salmonid fishes, such as brown trout (Salmo trutta Linnaeus, 1758), where stocking of hatchery-reared fish or cross-basin transfers has been a common practice aimed at supporting sport fishing or artisanal interests, reaching back at least into the Middle Ages (Diem, 1964; Pechlaner, 1984; Miró & Ventura, 2013; Splendiani et al., 2016). Under such circumstances, advocating the protection of native gene pools has had limited success outside of various nature protection areas, such as national parks, or involving a few conservation-minded managers. Unfortunately, this has led to the widespread use of non-native stocking material (Weiss et al., 2001; Pinter et al., 2019; Kohout et al., 2012; Prunier et al., 2022) and thus raises serious concerns that admixture between native and non-native individuals will threaten the viability of locally adapted populations (Allendorf et al., 2001; Hansen et al., 2009).

In the Upper Danube drainage of Austria and Germany, two major mitochondrial DNA (mtDNA) lineages (Atlantic & Danubian) of brown trout occur across an extensive contact (hybrid) zone (Bernatchez et al., 1992; Riffel et al., 1995; Weiss et al., 2001; Lerceteau-Köhler et al., 2013). Recent analysis estimated that these two mtDNA lineages may share a common ancestor in the Pliocene (Veličković et al., 2023), significantly older than previously thought (Bernatchez, 2001). Nonetheless, both lineages are thought to be native to this area, with the Atlantic lineage arriving via post-glacial colonization from adjacent watersheds (Weiss et al., 2001). While the quaternary glaciations generally had major impacts on population structure, distribution, and the demographic history of freshwater fish species in Europe (Weiss & Ferrand, 2002), these natural patterns are also influenced by human-mediated translocations and subsequent admixture. Lerceteau-Köhler et al. (2013) provided the first extensive genetic analysis of 114 populations of Danubian brown trout in Austria and Germany, including nearby headwater locations in the Rhine and Elbe catchments. The results corroborated earlier findings of Schliewen et al. (2001), demonstrating that the Upper Danube in Germany is predominantly characterized by the Atlantic lineage, with little trace of diagnostic Danubian-lineage alleles. Furthermore, the hybrid zone in the Upper Danube catchment revealed a downstream gradient of an increasing proportion of Danubian ancestry. Pure Danubian-lineage populations of brown trout in the Upper Danube catchment, however, are restricted to isolated, primarily alpine, headwater streams (Baric et al., 2010; Lerceteau-Köhler et al., 2013; Schenekar et al., 2014). This is likely due to natural (i.e., ancient cross-basin colonization of Atlantic-origin brown trout) and human-mediated (i.e., large-scale, continuous stocking efforts) colonization of Atlantic-lineage brown trout into the region, which led to admixture in all but the most isolated systems. Schenekar et al. (2014) showed that hatchery and wild strains of Atlantic-lineage brown trout in the Upper Danube could be distinguished with a high-resolution microsatellite panel (17 loci) or with extensive mtDNA sequencing (>6000 bp). Based on this study and the initial hypothesis of Weiss et al. (2001), it was inferred that admixed populations north of the Alps are predominately of natural origin but the presence of the Atlantic lineage in alpine headwater streams of the Upper Danube in Austria is primarily the result of modern supplementary stocking of Atlantic-lineage individuals. We note, however, that hatcheries in this region are primarily small, with little government oversight over their activities with respect to genetic origin of stocking material. Brood fish are routinely supplemented with wild caught fish, and there is a large amount of exchange of brood fish and offspring among hatchery owners (Pinter et al., 2019) - and stocking activities themselves are often not documented.

The genetic characterization of native stocks of brown trout throughout their natural range has generally gained considerable attention (Ryman et al., 1995; Laikre, 1999; Vera et al., 2018). This is due to both the decline in fish stocks and the need to identify locally adapted populations of brown trout for management programs. Accordingly, the distinction between natural and anthropogenic admixture of Atlantic and Danubian lineages in the Upper Danube River drainage is considered of high conservation importance, as well as the genetic characterization of native local populations. So far, population structure and interpopulation differentiation of brown trout in the Upper Danube drainage has been investigated using either exclusively mtDNA or a low number of microsatellite loci (e.g., Baric et al., 2010; Schenekar et al., 2014). Novel high throughput sequencing techniques such as double-digest restriction site associated DNA sequencing (ddRADseq) provide great possibilities for population genomic studies by drastically expanding the number of loci being analyzed (Peterson et al., 2012). Here, we apply a ddRADseq approach to brown trout populations across Austria including samples representative of the major drainages of Germany, to determine the population genetic structure, as well as signals of admixture in the Upper Danube region. Populations from the Kalkalpen National Park (Upper Austria) play a central role in this analysis, as previous investigations in this area suggested the presence of distinctive pure Danubian-lineage populations of high conservation concern.

# Materials and methods

#### Sampling

In total, fin clips from 479 brown trout stemming from 24 locations (Fig. 1, Table 1) were sampled and stored in 95% EtOH. To serve as a reference for pure native Danubian-lineage brown trout, 56 samples were collected from three populations (GOS, ETR, RAP) known from previous studies to consist predominantly of the Danubian lineage (Lerceteau-Köhler et al., 2013). Similarly, Atlantic-lineage reference populations were sampled from four locations in Germany, totalling 77 individuals across the two main drainages: Rhine (ISN, ROW, SDA) and Elbe (SZB). Additionally, we analyzed 13 populations of the Danubian catchment north of the Alps, including samples from the Kalkalpen National Park (Upper Austria) and the Bavarian Forest National Park (Germany). Commercial stocking material of brown trout in Austria is represented by 72 individuals from four hatcheries.



Fig. 1 Geographic location of the study area. **a** geographic distribution of the two main brown trout lineages in Europe based on mtDNA data from Bernatchez (2001) and SNP data from Hashemzadeh Segherloo et al. (2021). The Ponto-Caspian lineage includes the Danubian brown trout. **b** Sampling

sites in the Danube, Rhine and Elbe drainage systems; population codes correspond to Table 1). Base map taken from: https://en.m.wikipedia.org/wiki/File:Europe\_relief\_laea\_location\_map.jpg. c Sampling locations within the Kalkalpen National Park (national park area in green)

Samples analyzed

20

16

20

14

20

30

21

20

21

19

29

21

08.2015

12.2016

08.2015

12.2016

08.2015

08.2015

Upper

Upper

Upper

Upper

Upper

Upper

Austria

Austria

Austria

Austria

Austria

Austria

Location	Pop. code	Drainage basin	Sub-drain- age	Latitude (N)	Longitude (E)	Country	Province	Sampling date
Danube—No	orth Alpine							
Gossen- köllesee <sup>a</sup>	GOS	Black Sea	N/A	47°13′46.00″N	11°00′50.00″E	Austria	Tyrol	10.2015
Rappenba- ch <sup>a</sup>	RAP	Black Sea	Danube/Isar/ Loisach/ Gaisbach	47°23′20.40″N	10°57′25.70″E	Austria	Tyrol	05.2014
Seebach	SEE	Black Sea	Danube/Ilz/ Große Ohe	48°56′46.90″N	13°24′28.80″E	Germany	Bavaria	07.2016
Brechlbach	BRB	Black Sea	Danube/Inn/ Salzach/ Saalach	47°31′25.61″N	12°45′27.74″E	Austria	Salzburg	07.2016
Grundl- see— Toplitzsee	GDL	Black Sea	Danube/ Traun/ Grundlseer Traun	47°38′12.8″N	13°53′58.1″E	Austria	Styria	12.2017
Hallstätter See	HST	Black Sea	Danube/ Traun	47°34′35.5″N	13°39′46.7″E	Austria	Upper Austria	12.2017

47°44'50.64"N 14°26'25.08"E Austria

47°46'36.67"N 14°27'17.19"E Austria

47°44'59.28"N 14°26'09.24"E Austria

47°44'00.70"N 14°30'25.30"E Austria

14°24'02.52"E Austria

14°24'07.50"E Austria

47°45'29.52"N

47°44′59.00″N

T oordinates, C

Sitzenbach<sup>b</sup>

Jörglgra-

Stöffla-

Saigerin-

bach<sup>b</sup>

Krumme

Schafgra-

Steyrling<sup>b</sup>

benbach<sup>b</sup>

lmgraben<sup>b</sup>

benbach<sup>b</sup>

SIB

JGB

STG

SAB

KSL

SGB

Black Sea

Black Sea

Black Sea

Black Sea

Black Sea

Black Sea Danube/

Danube/

Enns/Rei-

chramingbach/ Großer Bach

Enns/Rei-

chramingbach/ Großer Bach/ Sitzenbach

Danube/

Danube/

Enns/Rei-

chramingbach/ Großer Bach/ Schwarzer Bach Danube/

Enns/Steyr

Danube/

Enns/

Steyr/ Krumme Steyrling

Enns/Rei-

chramingbach/ Großer Bach/ Sitzenbach

Table 1 (continued)

Location	Pop. code	Drainage basin	Sub-drain- age	Latitude (N)	Longitude (E)	Country	Province	Sampling date	Samples analyzed
Rumpel- mayrbach <sup>b</sup>	RMB	Black Sea	Danube/ Enns/ Steyr/ Krumme Steyrling	47°44′55.32″N	14°22′58.80″E	Austria	Upper Austria	08.2015	21
Niklbach <sup>b</sup>	NIB	Black Sea	Danube/ Enns/ Steyr/Pal- tenbach	47°47′58.06″N	14°17′09.67″E	Austria	Upper Austria	08.2015	21
Lohnbach	LOH	Black Sea	Danube/ Kamp/ Großer Kamp/ Kleiner Kamp	48°28'41.20"N	15°01′33.00″E	Austria	Lower Austria	05.2013	18
Danube-Sou	uth Alpine								
Etrachbach <sup>a</sup>	ETR	Black Sea	Danube/ Mur/Ran- tenbach	47°13′56.20″N	13°58′18.10″E	Austria	Styria	11.2012	20
Rhine									
Isenach	ISN	North Sea	Rhine	49°27′54.00″N	08°00′58.00″E	Germany	Rhine- land- Palati- nate	2014	19
Rotes Was- ser	ROW	North Sea	Rhine/Lahn/ Ohm	50°56′02.00″N	08°50′01.20″E	Germany	Hesse	2014	19
Schondra	SDA	North Sea	Rhine/Main/ Fränkische Saale	50°08′21.20″N	09°43′02.00″E	Germany	Bavaria	2014	19
Elbe									
Schwarz- bach	SZB	North Sea	Elbe/Vltava/ Řasnice	48°51′53.90″N	13°42′34.60″E	Germany	Bavaria	06.2016	20
Hatchery pop	oulations								
Hatchery 1	AND	N/A	N/A	47° 8′5.25″N	15°25′31.21″E	Austria	Styria	04.2016	20
Hatchery 2	HTL	N/A	N/A	48°16′5.62″N	13° 5′53.61″E	Austria	Upper Austria	05.2016	20
Hatchery 3	THA	N/A	N/A	47°17′48.7″N	11°29′06.9″E	Austria	Tyrol	12.2017	16
Hatchery 4	WES	N/A	N/A	46°43′1.26″N	13°18′10.84″E	Austria	Carinthia	N/A	15

<sup>a</sup>Pure native Danubian-lineage populations according to Lerceteau-Köhler et al. (2013)

<sup>b</sup>Populations originating from Kalkalpen National Park

# DNA extraction and ddRADseq libraries

Genomic DNA was extracted from fin clips using a standard Ammonium Acetate protocol (Sambrook et al., 1989). DNA integrity was assessed on a 1% Agarose gel.

The ddRADseq libraries were constructed following Peterson et al. (2012). In short, each library consisted of 48 individuals. SphI and ApoI restriction enzymes (New England Biolabs) were used to digest 500 ng of genomic DNA from each individual, for 3 h at 37 °C. The adapters (unique P1 and common P2 from Peterson et al., 2012) were ligated to the DNA fragments at 23 °C for 30 min. Thereafter, the ligated products were cleaned using 1.8X volume Ampure beads (Beckman Coulter) and pooled in equimolar proportions. The pooled samples were size-selected using a Blue Pippin (Sage Science) set to 300 bp (tight range) and amplified with a Phusion High-Fidelity PCR Kit (New England Biolabs) using PCR1 and PCR2 primers from Peterson et al. (2012). Final libraries were quantified by qPCR using the NEB-Next Library Quant Kit for Illumina (New England Biolabs). Sequencing was performed by the NGS Facility at Vienna Biocenter Core Facilities (VBCF, Austria) using an Illumina HiSeq 2500 to produce 100 bp single-end reads. Illumina reads were deposited at NCBI's Sequence Read Archive under accession numbers SAMN38751275–SAMN38751651 (Supplementary Material S1).

# Raw data processing and reference genome mapping

Each HiSeq run produced on average 100 million reads, with an average of 2.1 million reads per individual (range: 27,000-9.1 million). Raw reads were demultiplexed and quality-filtered using process\_radtags in Stacks v.2.55 (Catchen et al., 2011, 2013) and subsequently quality checked with MultiQC v.1.11 (Ewels et al., 2016). The 5 bp cut site was removed using Trimmomatic v.0.39 (Bolger et al., 2014), and quality filtered reads of each individual were mapped to the genome of Salmo salar Linnaeus, 1758 (GCA\_000233375.4; Lien et al., 2016) using Bowtie 2 v.2.2.9 (Langmead & Salzberg, 2012). Approximately 92% of the quality filtered reads from each individual were successfully mapped to the S. salar genome. At the time of this analysis, the S. salar genome was the only well-annotated Salmo genome available and has been used in a number of studies with brown trout (e.g., Hashemzadeh Segherloo et al., 2021), despite the fact that a S. trutta genome has recently become available (GCF\_901001165.1, Hansen et al., 2021). The output SAM files from Bowtie 2 analysis were sorted with samtools (Danecek et al., 2021) and used to build a catalogue of loci using the gstacks module implemented in Stacks (Catchen et al., 2011, 2013) under a minimum mapping quality (-minmapq parameter) of 20. At this step, 42–53% of the reads were discarded due to a low mapping quality (Supplementary Material S2), which includes reads mapping multiple times and thus filtering out potential paralogs. Loci were exported using the populations program in Stacks to produce output files for downstream population genomic analyses (Catchen et al., 2011, 2013). We only retained loci present in all populations (-p parameter) and in at least 75% of the individuals in each population (-*r* parameter); we also discarded loci with minor allele frequencies (MAF) under 0.05 (-min-maf parameter), which can be the result of sequencing errors rather than representing true polymorphisms. In order to only analyze putatively unlinked SNPs in downstream analysis, we kept only one random SNP per locus (-write-randomsnp parameter), resulting in a dataset of 2,540 SNPs. Overall, a total of 377 (78.5%) individuals across 24 populations yielded a sufficient coverage (>5x) to be used in downstream analysis. Five LOH samples were kept despite a lower mean coverage (between 4.1–4.9x), in order to retain a minimum number of 10 individuals per population. The output file was visualized with matrix condenser (de Medeiros and Farrell, 2018; de Medeiros, 2019) in R v.4.1.2 (R Core Team, 2021) to evaluate effects of missing data by including/excluding samples with low coverage. The percentage of missing data ranged from 0.0 to 26.5% (mean 2.8%), with only one individual above 20%(Supplementary Material S2).

## Detecting and retaining neutral SNPs

Certain population genetic analyses are characterized by an underlying assumption of SNP neutrality and violation of this assumption can induce significant bias in the results (Foll & Gaggiotti, 2008). Therefore, BayeScan v.2.1 (Foll & Gaggiotti, 2008) was used to detect SNPs under selection, with a posterior probability > 0.95 for outlier SNPs and prior odds set to 1, making the neutral model as likely as the model with natural selection. Such low prior odds lead to a high number of false-positives in terms of signals of selection, but it ensures that any SNP even remotely under selection is detected and removed from the dataset, thus retaining only neutral SNPs. A total of 331 SNPs were putatively under selection, leaving 2,209 neutral SNPs for downstream analyses.

## Population genomic analyses

Arlequin v.3.5.2.2 (Excoffier & Lischer, 2010) was used to estimate  $F_{ST}$  values and corresponding *p*-values of each population, as well as to evaluate the deviation from Hardy Weinberg Equilibrium (HWE) for each population by computing the inbreeding coefficients ( $F_{\rm IS}$  values), expected heterozygosity ( $H_{\rm E}$ ) and observed heterozygosity ( $H_{\rm O}$ ) with an allowed missing level of 0.1.

#### Clustering analyses

To help evaluate the population structure of brown trout in the Upper Danube drainage and visualize inter-cluster differentiation with no prior assumptions related to genetic models, a Principal Components Analyses (PCA) was carried out on SNP genotypes. The analysis was performed using the R packages adegenet v.2.1.8 (Jombart, 2008; Jombart & Ahmed, 2011) and factoextra v.1.0.7 (Kassambara & Mundt, 2020) in R v.4.1.2.

The population structure and shared ancestry were also investigated using the program ADMIXTURE v.1.3.0 (Alexander et al., 2009), which estimates individual ancestry from multilocus SNP datasets using maximum likelihood in a parametric model. Varying numbers of assumed population clusters (K) were tested ranging from 1 to 24, each with 10 independent runs. The results of all replicates for each K were summarized using the program CLUMPAK (Kopelman et al., 2015) in StructureSelector (Li & Liu, 2018). A separate ADMIXTURE analysis was run for Atlantic reference-, hatchery- and admixed Danubian populations (based on 2,291 neutral SNPs). The optimal number of clusters was evaluated based on the cross-validation error.

## Phylogenetic structure

A maximum likelihood (ML) approach implemented in IQtree v.2.1.4 (Minh et al., 2020) was used to roughly depict the genetic relationships among brown trout in the Upper Danube and adjacent drainages. The best-fit nucleotide substitution model (TVM+F+R8) was identified using ModelFinder (Kalyaanamoorthy et al., 2017) implemented in IQtree with three independent runs and based on the Bayesian Information Criterion (BIC). A concatenated alignment of all ddRADseq loci was used to infer a ML tree with 1,000 ultrafast bootstrap replicates and applying the *-bnni* flag to reduce the impact of overestimating branch support with ultrafast bootstraps (Hoang et al., 2018).

## Results

#### Genetic differentiation

Expected heterozygosity ( $H_E$ ) ranged from 0.146 (RMB, ETR) to 0.364 (BRB) and was generally lower than observed heterozygosity ( $H_O$ ) with the exception of populations AND, LOH, and ETR (Table 2). Most  $F_{IS}$  values (inbreeding coefficient) were negative, indicating heterozygosity excess in the populations. This is expected with genomic markers and very small population sizes, which most of our wild samples from headwater streams represent. Based on the  $F_{IS}$  values, 10 of 24 populations showed a significant deviation from Hardy–Weinberg equilibrium

**Table 2** Summary statistics of genetic diversity of the populations in this study: number of sequenced samples per population (*N*), mean observed ( $H_{\rm O}$ ) and expected heterozygosity ( $H_{\rm E}$ ), inbreeding coefficient ( $F_{\rm IS}$ ) as well as proportion of randomizations that gave a higher  $F_{\rm IS}$  value than the observed one

Рор	Ν	H <sub>O</sub>	$H_{\rm E}$	F <sub>IS</sub>	P (Rand
					$F_{\rm IS} > = {\rm Obs}$ $F_{\rm re}$ )
					I IS)
SDA	16	0.241	0.236	- 0.059	0.8964
ISN	17	0.295	0.293	- 0.026	0.6989
ROW	16	0.345	0.318	- 0.141	0.9892
SZB	19	0.346	0.338	- 0.046	0.8250
SEE	13	0.297	0.282	- 0.092	0.9472
AND	15	0.272	0.272	- 0.060	0.8700
HTL	17	0.288	0.274	-0.087	0.9648
THA	12	0.369	0.344	- 0.103	0.9003
BRB	12	0.383	0.364	-0.088	0.9032
HST	24	0.342	0.326	-0.081	0.9531
GDL	17	0.342	0.323	-0.077	0.9218
LOH	10	0.347	0.348	-0.028	0.6119
WES	15	0.408	0.353	- 0.198	0.9941
SIB	16	0.379	0.335	- 0.192	0.9932
JGB	14	0.393	0.350	- 0.172	0.9746
SAB	11	0.241	0.224	- 0.124	0.9834
STG	16	0.301	0.283	-0.084	0.9110
KSL	18	0.163	0.152	- 0.107	0.9883
RMB	16	0.154	0.146	- 0.076	0.9384
SGB	16	0.331	0.329	- 0.019	0.6334
NIB	19	0.194	0.176	- 0.143	0.9990
RAP	14	0.247	0.246	- 0.021	0.6041
ETR	15	0.140	0.146	0.022	0.2649
GOS	19	0.177	0.168	- 0.089	0.9599

(at P < 0.05), however after applying a table-wide sequential Bonferroni correction (Sokal & Rohlf, 1995), only four populations (JGB, SAB, KSL, NIB) remained statistically significant. Pairwise  $F_{\rm ST}$  values, measuring differentiation among populations, were lowest among populations from the Krumme Steyrling catchment (KSL, RMB, SGB;  $F_{\rm ST} = 0.004 - 0.060$ ), and among populations from the Rhine drainage (SDA, ISN, ROW;  $F_{ST} = 0.077 - 0.177$ ) (Supplementary Material S3). The highest  $F_{ST}$  values were found between Atlantic and Danubian-lineage populations, ranging from 0.666 (SDA vs. SAB) to 0.827 (ISN vs. GOS) reflecting the deep divergence between these major phylogeographic lineages. Within the Upper Danube drainage, the highest  $F_{ST}$ value was found between the northern Alpine SEE and GOS (0.721) populations;  $F_{ST}$  values among populations from the Kalkalpen National Park ranged from 0.004 (SGB vs. KSL) to 0.645 (SGB vs. SIB).

## Population structure

In the PCA, the first axis (34.4% of variance) clearly revealed differentiation between pure native Danubian populations (ETR, GOS, RAP) as well as some populations from the Kalkalpen National Park (NIB, SAB, STG, KSL, RMB, SGB) to Atlantic lineage reference populations (ISN, SZB, SDA, ROW) (Fig. 2a). Samples from the Upper Elbe grouped together with those from the Rhine. Other Danubian populations, including samples from hatcheries (HTL, AND, WES, THA), appeared to be admixed with strong Atlantic influence. The Danubian SEE population from the Bavarian Forest National Park grouped together with the Atlantic reference populations. Variability among Danubian-lineage populations was observed along PC2 (3.3% of variance) and PC3 (2.6% of variance), where samples from the Kalkalpen National Park were distinct from Danubian reference populations and displayed differentiation among distinct drainage systems at small geographic scales. Strong within population variation was not only observed for hatchery samples but was also present in wild (admixed and reference) populations; e.g., ETR, which appeared as a pure Danubian population, with exception of one individual (ETR120) which seemed to be of admixed origin, grouping with individuals of BRB, JGB, LOH.

The ADMIXTURE analysis revealed considerable complexity among the populations analyzed but showed that the most probable number of clusters was K=2 (strongest decrease of the cross-validation error, CV error=0.388) or K=17 (lowest cross validation error, CV error = 0.301), reflecting the distinction between Atlantic and Danubian lineages but also strong drainage specific sub-structure respectively (Fig. 2b; Supplementary Material S4, showing K=2 to K=17). Several populations in the Danube drainage north of the Alps, including the Kalkalpen National Park (SIB, JGB), appeared to be admixed. The hatchery samples were not homogenous with a distinction between AND/HTL and THA/WES at K=17. Samples from LOH, a population previously considered to be of pure Danubian origin (Schenekar et al., 2014), was clearly admixed with only one individual (LOH304) showing a high ancestry proportion with the Danubian lineage. To better evaluate the introgression of hatchery lineages into admixed populations, we re-ran ADMIXTURE without pure Danubian populations (Fig. 2b; Supplementary Material S5, showing K=2 to K=9). At K=2 (strongest decrease of the cross-validation error, CV error = 0.437) it was clear that hatchery populations appeared admixed compared to Atlantic reference populations, and at K=9 (lowest cross validation error, CV error = 0.388) the Atlantic reference population were distinct and most similar to the Danubian SEE population, but no direct association with these potential sources, as well as hatchery populations (excluding specific individuals) was seen in the admixed populations.

## Phylogenetic structure

Reference samples of the Atlantic and Danubian lineages were recovered as distinct groups (Fig. 2c) with strong support in ML analysis (bootstrap values, bs 99 and 95, respectively). Samples from the Danubian SEE population formed a well-supported (bs 99) sister group to samples from the Vltava River system (SZB). The placement of admixed individuals/populations was only weakly supported but they appeared more associated with the Atlantic lineage, including the hatcheries. Samples from the Kalkalpen National Park were not homogenous. Most of them grouped with Danubian reference populations (KSL, RMB, SGB, NIB, STG, SAB),



Fig. 2 Population structure and phylogenetic relationships of the 24 analyzed brown trout populations. **a** Principal component analysis (PC1 vs. PC2) and (PC1 vs. PC3). Each circle represents one individual and circles are color coded for population origin. **b** ADMIXTURE analysis showing clustering of

forming well-supported subgroups (bs 95–100) reflecting their origin from distinct drainage systems. Populations JGB and SIB grouped with

individuals based on shared ancestry, each bar represents one individual. Optimal number of clusters based on the cross-validation error K=2 or K=17 (entire dataset); and K=2 or K=9 (partial dataset). **c** Maximum likelihood tree representing phylogenetic relationships

samples of predominantly Atlantic-lineage background, similar to the Lower Austrian LOH population where one sample (LOH304) was associated with individuals from the Krumme Steyrling (KSL, RMB, SGB).

# Discussion

This study provides the first insights into the genetic structure of brown trout in the Upper Danube drainage using genome-wide SNP markers. The results 1) support significant genetic differentiation among native Danubian-lineage populations in Austria, 2) highlight the discovery of the densest cluster of pure native Danubian-lineage brown trout populations thus far found in the region (Kalkalpen National Park), and 3) support previous studies suggesting a complex evolutionary history of brown trout in the Upper Danube likely the result of both natural and anthropogenic processes. Collectively, these results present a challenge to both conservation policy and communication with stake holders responsible for fisheries management.

Previous studies have inferred an extensive contact zone of the Atlantic & Danubian lineages of brown trout in the Upper Danube drainage of Germany and Austria with a downstream gradient of increasing proportion of Danubian ancestry (Weiss et al., 2001; Lerceteau-Köhler et al., 2013). While pure Danubianlineage brown trout in Germany have not yet been found, a few such populations have been described in Austria north of the Alps, primarily restricted to isolated headwater reaches of streams in proximity to late Pleistocene glacial margins (Baric et al., 2010; Lerceteau-Köhler et al., 2013). The significant genetic differentiation found among these native Danubian populations (Fig. 2) likely reflects high levels of genetic drift acting on such small populations with low effective population sizes (Frankham, 2005; Whitely et al., 2018) promoting isolation-by-distance (Toczydlowski & Waller, 2018), or specifically, isolation-by-resistance (sensu McRae, 2006) as dispersal is restricted. Alternatively, post-glacial expansion of brown trout in this region may have originated from multiple local glacial refugia, reflecting complex biogeographic patterns in other cold-stenothermic aquatic taxa (Malicky, 2006; Graf et al., 2014). For brown trout and other rheophilic fish species, it may thus be plausible that naturally isolated headwater populations exist along the entire Alpine range (see Fumagilli et al., 2002; Gil et al., 2016; Polgar et al., 2022) where headwater isolation of such relict populations was enhanced by erosional processes creating barriers (i.e., waterfalls) to upstream fish migration.

One such example may be found in the Kalkalpen National Park (Upper Austria). This area is located in the eastern-most extension of the Upper Austrian Prealps, which was situated just outside of the main Alpine glacial sheet during Last Glacial Maximum (van Husen, 1971, 1975). The brown trout populations in the Kalkalpen National Park are unique as they represent the densest cluster of pure Danubianlineage brown trout found north of the Alps so far (compare to Lerceteau-Köhler et al., 2013), while showing clear genetic differentiation across small spatial scales (Fig. 2, Table 2). Most of these populations inhabit headwater creeks at 750-1090 m above sea level, in an area less than 200km<sup>2</sup>, and most of them are separated from downstream reaches by cascades. Despite the unique genetic structure observed among populations in the Kalkalpen National Park, there were clear signs of admixture in some populations (e.g., SIB, JGB, SAB) with the presence of non-Danubian alleles possibly stemming from stocking of hatchery-reared strains. Both the JGB and the SIB populations revealed Atlantic-lineage mtDNA or a high frequency of the LDH-90 allele (Weiss et al., 2017), which is common among Atlantic-lineage hatchery stocks in the region (Lerceteau-Köhler et al., 2013) and used as a diagnostic marker for Atlanticlineage populations across central and northern Europe (Hamilton et al., 1989; Riffel et al., 1995). While such admixture apparently affects populations in the downstream reaches (JGB, SIB) more than those in the headwaters, it may still pose a potential threat toward sustaining the genetic integrity of native brown trout populations in the region. Conservation efforts of the Kalkalpen National Park have already targeted the protection of these populations, especially in the more isolated headwaters, where, for example, introduced rainbow trout (Oncorhynchus mykiss (Walbaum, 1792)) has been eliminated after an intensive ten-year-long removal campaign (Weiss & Schenekar, 2021).

Besides the detection of pure native Danubianlineage populations, the newly obtained genome wide SNP data offer a more detailed view on formally identified pure Danubian-lineage populations. Schenekar et al. (2014) reported such a population outside the Alpine reach, located in a small and isolated tributary creek (2-3 m wide) of the Kamp River drainage (Lohnbach, LOH). The SNP-based analysis, however, clearly demonstrated that this population is of admixed origin, despite the fixation of both Danubian-lineage mtDNA and the ancestral LDH-100 allele (Hamilton et al., 1989; Schenekar et al., 2014), which until now was only found to be fixed in pure Danubian populations (Lerceteau-Köhler et al., 2013). The fixation of Danubian mtDNA or the LDH-100 allele could perhaps occur in such a small population through genetic drift (Raeymaekers et al., 2008; Carrara et al., 2014). While the population is clearly admixed, the fact that a typical hatcheryreared genetic profile (i.e., Atlantic-lineage mtDNA or the LDH-90 allele) is missing, may support that this admixture is more ancient and potentially natural. A natural cause of admixture in LOH seems only plausible via the Upper Danube drainage, since a direct connection from the Kamp River drainage to the Atlantic basin (Elbe headwaters) seems unlikely since the Pleistocene (Fischer, 1979). Such natural admixture is concordant with the original hypothesis of Weiss et al. (2001), reiterated with a larger data set, and analyses in Lerceteau-Köhler et al. (2013). However, the origin (natural or anthropogenic) of the admixture in the LOH population remains conjectural at this point, but Casanova et al. (2022) point out that genomic SNP markers are better suited in detecting introgression of Atlantic-lineage fish, because the biallelic LDH-C locus can reveal high percentages of an LDH-100 homozygote, even in F2 generation crosses, between local native and hatchery-reared strains. More broadly, it is noteworthy that admixed populations do not show a general pattern of association with either the Atlantic reference populations used in this study, nor the Atlantic lineage hatchery populations, beyond the potential recognition of a few individual fish, which likely reflect either hatchery fish, or recently introgressed fish (Fig. 2b). In our view, this is most easily explained by more ancient (i.e., natural) admixture with unknown source populations. While additional approaches have been applied for attempting to better differentiate between more ancient and recent introgression in Salmo sp. using SNPs, these studies are in different geographic regions where the Atlantic lineage of brown trout is exotic with no chance of natural occurrence, and either apply much more dense arrays of markers or a pre-screened set of markers tested for diagnostic power (Sušnik Bajec et al., 2015; Leitwein et al., 2018; Saint-Pé et al., 2019). Our lack of information on hatchery brood stocks, which are not kept isolated from wild supplementation, our limited number of markers, and most of all clear understanding that the Atlantic-lineage of brown trout is also natural in the region limits our ability to better address this question with the given set of SNPs.

Overall, the post-glacial colonization routes of freshwater fishes in the Upper Danube region are poorly understood and for brown trout it remains a mystery how the upper Danubian drainage (i.e., in Bavaria) became overwhelmingly dominated by the Atlantic lineage (Schliewen et al., 2001; Lerceteau-Köhler et al., 2013). Noteworthy in this respect, is the Atlantic lineage SEE population in the Bavarian Forest National Park. Another important point is that typical hatchery material in this region does not genetically group closely with alleged natural Atlantic lineage populations, whether found in the Rhine, Elbe, or upper Danube River drainages (Fig. 2b, but see also Lerceteau-Köhler et al., 2013). This likely stems from the fact that many Atlantic-lineage hatchery strains share a common ancestry, supported by commercial networking and stock exchange (Pinter et al., 2017), which is not locally restricted, but largely similar throughout much of Central- and Western Europe (Sanz et al., 2020; Berrebi et al., 2021; Casanova et al., 2022). Thus, as shown by Casanova et al. (2022), it is both possible and desirable to distinguish between natural and anthropogenic introgression for conservation management goals.

#### Conservation and management implications

For the Upper Danube region, a more systematic survey of populations with genome-wide markers, such as those presented here, coupled with a diagnostic approach (e.g., Casanova et al., 2022), will be necessary to provide a better overall picture of the distribution and distinction of allegedly naturally vs. anthropogenically induced admixed populations with respect to the Danubian and Atlantic lineages. Such knowledge may contribute to more general or regional recommendations of how to best manage populations of brown trout in the Upper Danube River drainage as well as adjacent catchments. For the time being it has become clear that the drainage-bearing epithets "Danubian" and "Atlantic" lineage, presented

in peer-reviewed literature for over 30 years, are not suitable to identify native gene pools of brown trout in the region, nor do they necessarily help in assigning a conservation status to specific populations.

Nonetheless, pure Danubian-lineage populations thus far identified are exceedingly rare, and as such should be assigned a high conservation status in the region. In recent years, a small market demand has arisen for native Danubian trout, although very few such stocks exist, and thus availability is limited. The results of this study underscore that among the few available populations of pure native Danubian lineage brown trout, significant genetic variation exists even across small geographic distances. Using any such population as a source of brood fish for widespread stocking runs counter to conservation genetic principles that support the assumption that each sub-population may contain local adaptations or co-adapted gene complexes that might benefit populations in their native habitat but not necessarily anywhere else (Allendorf et al., 2001; Hansen et al., 2009; Prunier et al., 2022).

Another concern is that as fishery managers become increasingly familiar with the fact that most populations in the region are admixed, inhibition to stocking rivers with foreign strains of trout might be eroded. Here it is important to communicate the clear difference between naturally vs. anthropogenically induced admixture. Allendorf et al. (2001) recognized six categories of hybridization and introgression in a conservation context, concluding that three of these categories encompass natural hybridization and introgression (whether inter- or intraspecific) and are a normal part of the evolutionary process and thus do not pose a conservation concern. On the other hand, anthropogenically induced hybridization and introgression, especially involving hatchery-reared individuals is considered problematic because it promotes the spread of mal-adaptive genetic variation (Bolstad et al., 2017, 2021; Besnier et al., 2022). For naturally admixed populations, especially stemming from contact events or past hybridization dating back to several thousand years ago, natural selection can steer adaptation and fitness most likely at a pace amenable to the biological and environmental limitations of the system. For reared salmonid fishes, however, artificial selection within the hatcheries almost invariably results in lower survival and fitness decline, a process that can already begin after a single generation in captivity (Araki et al., 2007; Fraser et al., 2019). Thus, hatchery-rearing and stocking cannot be endorsed independent of whether or not the genetic background of the fish belongs to a major lineage that may be perceived as native in a particular drainage. Furthermore, populations with natural patterns of ancient admixture should be provided the same conservation status as non-admixed populations (Allendorf et al., 2001), although some priorities may be established for rare populations, for example, for pure Danubian-lineage brown trout vs. the more widespread occurrence of admixed populations.

In light of the market-driven forces underlying most fishery management plans and decisions in the region, the value of protected areas, such as the Kalkalpen National Park in Austria, or the Bavarian Forest National Park in Germany where no such market pressure is present, cannot be overstated. River systems in these areas may be among the very last in the Upper Danube catchment, where conservation has explicit legislative support and thus evolutionary processes can proceed in a natural way, without disruption from the introduction of nonnative or hatchery-reared strains of fish.

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Author contributions Conceived and coordinated the study: GKE, LAL, and SJW. Laboratory work: LAL. Data analyses and methodology: GKE, LAL. Literature review and back-ground information: GKE, LAL, UKS, ThS, TS, and SJW. Wrote the first draft of the paper: GKE. All authors contributed to the improvement of the manuscript.

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**Data availability** Raw ddRADseq reads were deposited at NCBI's Sequence Read Archive (BioProject: PRJNA1050776) under accession numbers SAMN38751275–SAMN38751651 (Supplementary Material S1).

#### Declarations

**Conflict of interest** The authors declare no conflict of interest.

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