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ARTICLE

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# Two transects reveal remarkable variation in gene flow on opposite ends of a European toad hybrid zone

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Speciation entails a reduction in gene flow between lineages. The rates at which genomic regions become isolated varies across space and time. Barrier markers are linked to putative genes involved in (processes of) reproductive isolation, and, when observed over two transects, indicate species-wide processes. In contrast, transect-specific putative barrier markers suggest local processes. We studied two widely separated transects along the 900 km hybrid zone between *Bufo bufo* and *B. spinosus*, in northern and southern France, for ~1200 RADseq markers. We used genomic and geographic cline analyses to identify barrier markers based on their restricted introgression, and found that some markers are transect-specific, while others are shared between transects. Twenty-six barrier markers were shared across both transects, of which some are clustered in the same chromosomal region, suggesting that their associated genes are involved in reduced gene flow across the entire hybrid zone. Transect-specific barrier markers were twice as numerous in the southern than in the northern transect, suggesting that the overall barrier effect is weaker in northern France. We hypothesize that this is consistent with a longer period of secondary contact in southern France. The smaller number of introgressed genes in the northern transect shows considerably more gene flow towards the southern (*B. spinosus*) than the northern species (*B. bufo*). We hypothesize that hybrid zone movement in northern France and hybrid zone stability in southern France explain this pattern. The *Bufo* hybrid zone provides an excellent opportunity to separate a general barrier effect from localized gene flow-reducing conditions.

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#### INTRODUCTION

Hybrid zones provide windows into the processes driving the outcome of speciation (Hewitt 1988). As the genomic toolkit available to evolutionary biologists has grown, it has become increasingly clear that different genes do not flow at equal speed across a hybrid zone. Some genomic regions introgress freely, some gene variants cannot traverse a hybrid zone at all, and the direction of gene flow between taxa may vary at different points along the same hybrid zone (Baack and Rieseberg 2007; Rafajlović et al. 2016). As we continue to develop our understanding of the conditions under which genomic regions stop being exchanged between incipient species, studies involving multiple transects across hybrid zones with a standardized genome-wide dataset can provide insights into the dynamics of interspecific admixture and the final phases of the speciation process.

*Barrier genes* are directly involved in reproductive isolation. They underlie divergent ecological adaptation, differences in mate preference, and/or genetic incompatibilities, preventing the merging of parental populations (Abbott et al. 2013; Barton 2013; Ravinet et al. 2017). The resulting *barrier effect* is a reduction in the migration rate of genetic material between populations relative to the dispersal potential of the individuals that carry those genes (Ravinet et al. 2017). When gene frequency clines of multiple barrier genes become geographically coincident in a hybrid zone, the barrier effect is reinforced, a phenomenon known as *cline coupling* (Butlin and Smadja 2018).

Barrier genes contribute to genomic differentiation between species, because of the relatively strong genetic differentiation of the genes themselves as well as the linked genomic regions that surround them, allowing genetic differentiation to build up, and be retained in the face of gene flow. Their reduced introgression compared to the rest of the genome facilitates the identification of the genomic regions that harbor barrier genes (Gompert et al. 2012; Butlin and Smadja 2018). For the vast majority of natural systems, we lack the genomic resources to identify barrier genes as opposed to regions linked to them, and in these cases, we refer to markers with restricted introgression as *barrier markers* (following e.g. Ravinet et al. 2017). Identifying barrier markers is the first step in identifying the actual barrier genes that underlie reproductive isolation.

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When the same barrier markers are identified in geographically distant transects, the most reasonable explanation is that the barrier effect acting on (regions near) these markers is consistent along the hybrid zone (Teeter et al. 2009; Larson et al. 2013; Harrison and Larson 2014; Larson et al. 2014). For example, in field crickets (*Gryllus*), the same barrier markers act in two sections of the same hybrid zone, and have since been linked to intrinsic factors associated with prezygotic isolation (Larson et al. 2013; Larson et al. 2013; Larson et al. 2014).

Barrier markers may also differ between hybrid zone transects (see Harrison and Larson 2016 for an overiew), indicating that different genomic regions contribute to the barrier effect, depending on the local environment. Such heterogeneity among transects involving the same species pairs of *Catastomus* suckers in different rivers suggests that the underpinnings of reproductive isolation between these fish are influenced by interactions of multiple evolutionary and ecological factors (Mandeville et al. 2015), rather than a uniform genetic mechanism that evolved a single time and spread.

Finally, it is important to recognize that these two possibilities are not mutually exclusive. For example, the well-studied house mouse hybrid zone (*Mus*) shows distinct differences in gene flow among transects for some barrier markers (Teeter et al. 2009), while other barrier markers known to be linked to hybrid sterility consistently show narrow transitions across multiple *Mus* transects (Janoušek et al. 2012). Ultimately, independent analyses of replicate transects are required to disentangle species-wide barrier effects from ones that are geographically or ecologically more restricted.

We studied two transects at opposite ends of the ~900 km long hybrid zone between two European anuran species, the common toad (Bufo bufo) and the spined toad (B. spinosus). The zone runs diagonally across France, from the Atlantic coast in the north to the Mediterranean Sea in the south (Fig. 1; Arntzen et al. 2018; Arntzen et al. 2020; Dufresnes et al. 2020; Dufresnes et al. 2021). We characterized genome-wide patterns of interspecific gene flow based on ~1200 nuclear markers obtained by restriction-site associated DNA (RAD) sequencing, and used both genomic and geographical cline analyses to identify barrier markers that are either shared between transects or that are transect-specific (Gompert and Buerkle 2012; Stankowski et al. 2016). We mapped all loci against the recently sequenced genome of B. bufo (Streicher et al. 2021) to determine their proximity and identify physically nearby genes. We discuss the striking differences in gene flow across transects, the insights into the history of the hybrid zone that they provide, and more broadly, the insights that multiple transects can provide for the identification of potential barrier genes.

#### MATERIAL AND METHODS

#### **3RAD** sequencing

DNA from 387 individual toads (Arntzen et al. 2016, 2017, 2018, van Riemsdijk et al. 2019) were analyzed in this study. These included five reference localities each of pure B. bufo and B. spinosus (assumed to be unaffected by interspecific gene flow), 11 localities along a transect in northern France (northern transect), and 12 along a transect in southern France (southern transect; Supplementary Table S1; Fig. 1). We used the 3RAD protocol (Graham et al. 2015; Glenn et al. 2016; Hoffberg et al. 2016; Bayona-Vásquez et al. 2019) to produce reduced representation genomic libraries. Two restriction enzymes (Cla-I and Sbf-I) were used to cut 50 ng of genomic DNA, while a third enzyme (Msp-I) was added to cleave and eliminate phosphorylated adapter-adapter dimers. Internal barcodes were ligated to the resulting sticky ends and external Illumina iTru5 and iTru7 primers, differing by at least three base pairs, were added to the internal barcodes via an indexing PCR reaction (Glenn et al. 2016; Hoffberg et al. 2016; Bayona-Vásquez et al. 2019), followed by a bead-based clean-up. Libraries were combined to achieve equimolar concentrations in the final pool, size-selected for a 340-440 bp range using a Pippin Prep (Sage Science Inc. Beverly, MA, USA), quantified using intercalating dye on a VICTOR multilabel plate reader (PerkinElmer), and sequenced on two PE100 lanes on an Illumina HiSeq 4000. For three reference samples of each species (from sample locations 2.Bb and 19.Bs), libraries were prepared in triplicate to assess genotyping error rates.

#### Data clean-up and assembly

Cutadapt v.1.14 (Martin 2011) was used in three steps to remove 5' and 3' primers for each internal barcode combination, remove the Illumina sequencing adapters, and carry out a read quality control of 10 (default). We used ipyrad v.0.7.3 (Eaton 2014) for de novo assembly of our RAD loci and to call individual haplotypes and assign genotypes with the following settings: clustering threshold of 0.85, minimum read depth of six, maximum of eight heterozygous bases allowed per consensus sequence, and polymorphic sites in a locus shared across a maximum of 50% of the samples (for additional details, see supplemental material on Dryad). These settings were chosen based on stability of the number heterozygote calls (indicating absence of clusters of paralogs) after testing various settings and following recommendations from the ipyrad manual. In addition, with the unfiltered dataset, we obtained low SNP-calling error rates (see the Appendix, 1. Library triplicates). We generated two datasets, with either a 10% or a 50% maximum per-locus missingness rate across individuals (Supplementary Fig. S1).

#### **Population structure**

We randomly selected one single nucleotide polymorphism (SNP) per RAD locus from the 10 and 50% maximum per-locus missingness rate datasets (the actual missingness rates were 2.3 and 47.5%). We performed principal component analysis (PCA) on each dataset separately to visualize genomic variation across both transects. We used adegenet v.2.1.1 in R (Jombart 2008; Jombart and Ahmed 2011), and based the PCA on allele frequencies, replacing missing data with the mean allele frequency per population. We also quantified population structure with Structure v.2.3.4 (Pritchard et al. 2000) for the two datasets for each transect separately. We used StrAuto (Chhatre and Emerson 2017) to conduct ten independent runs for two genetic clusters (K = 2) representing the two parental species, with a burn in of 10 000 MCMC steps followed by 25,000 MCMC steps under the admixture model. Convergence was confirmed by visual examination of the consistency of the log likelihood and admixture proportion stability (Benestan et al. 2016) and summarized with CLUMPAK (Kopelman et al. 2015). We visualized these results with the R package POPHELPER (Francis 2017). The 10 and 50% maximum per-locus missingness rate datasets yielded nearly identical estimates of population structure (see Results), and we only used the larger (50%) missingness dataset for filtering and downstream analyses.

#### Diagnostic SNP selection and Hardy-Weinberg equilibrium

We identified species-diagnostic alleles (i.e. where one allele is fixed in one species and the other allele fixed in the other species) based on the reference samples (Fig. 1; Supplementary Table S1, custom R script available in supplemental material on Dryad), and randomly chose one species-diagnostic SNP from each of the 1189 species-diagnostic alleles if more than one SNP was available. We tested for signals of non-random mating within each locality by calculating deviations from Hardy-Weinberg equilibrium across species-diagnostic SNPs within populations with the R package 'genepop', based on the program GENEPOP v.1.0.5 (Rousset 2008), correcting for multiple comparisons using the sequential Bonferroni within-marker approach ( $P_c$  for N = 1 189; Rice 1989; Narum 2006). Fourteen markers with a significant heterozygote deficit were excluded (Supplementary Table S2). This resulted in a dataset of 1 175 species-diagnostic SNP loci with 25.7% missing data that was used in downstream analyses.

#### Bayesian genomic cline analysis

To examine genome-wide variation of introgression among admixed individuals, we used the Bayesian genomic cline model as implemented in the software BGC (Gompert and Buerkle 2011, 2012; Gompert et al. 2012). This model is based on the probability that an individual with a certain hybrid index (HI) inherited a gene variant at a given locus from one species ( $\varphi$ ; in this case *B. bufo*) or the other (1 –  $\varphi$ ; *B. spinosus*). The cline parameter  $\beta$  measures the genomic cline rate based on ancestry for each locus, with a positive value indicating fewer heterozygotes at a locus than expected based on the HI of all loci, and a negative value indicating more



heterozygotes than expected (Gompert and Buerkle 2011; Parchman et al. 2013). Thus, positive  $\beta$  outliers can be regarded as barrier markers (Ravinet et al. 2017). In contrast, the cline parameter  $\alpha$  describes the probability of *B. bufo* ancestry based on a single locus relative to the expectation based on the overall genetic composition (represented by the HI), with a positive value indicating an increase in the *B. bufo* ancestry probability, and a

negative value a decrease. In summary, positive  $\beta$  outliers can identify potential barrier markers, while positive values of  $\alpha$  can identify markers that have retained *B. bufo* ancestry in the face of higher background levels of *B. spinosus* genomic composition for any given population.

The input files for parental genotypes included only reference individuals and the input file for admixed genotypes included individuals 18

**Fig. 1 Overview of the** *Bufo* **hybrid zone and genetic data presented in this study.** Maps with (**a**) the distribution of *Bufo bufo* and *B. spinosus* in Europe and North Africa, with small labeled squares indicating the locations of insert map (**b**) for the northern transect (sample locations 6.N-16.N), and insert map (**c**) for the southern transect (sample locations 6.S-17.S). The reference populations for *B. bufo* are 1-5.Bb, and for *B. spinosus* are 18-22.Bs. The base map for panels **b** and **c** was downloaded from mapsland. Bar graphs in panels **b** and **c** are the result of Structure with K = 2 on the full 50% missingness dataset, taking a random SNP from each of the 4869 assembled RAD markers. Blue indicates *B. bufo* are colored blue and of *B. spinosus* red. Transect populations are black (".N" = northern transect, ".S" = southern transect. Ellipses represent the 95% inertia (based on the percentile) of the corresponding group. The bar graph on the right shows the eigenvalues for the first 5 principle components.

with an average admixture proportion (Structure Q score) between 0.05 and 0.95 (Supplementary Fig. S2). A single MCMC chain was run for 75,000 steps and samples were taken from the posterior distribution every 5<sup>th</sup> step, following a burn-in of 25,000 steps. Convergence was assessed (Supplementary Fig. S3) and we tested for outlier loci using 'estpost' to summarize parameter posterior distributions (Gompert and Buerkle 2011). Outlier loci were conservatively identified based on 99.9% confidence intervals. As a test for significance of outlier distributions, we performed: (1) a Chi-square test comparing the number of  $\alpha$  outliers between the northern and southern transect to test if there is a significant difference in the number of outliers between the transects, and (2) a 2×2 contingency Chi-squared was conducted to test if the overlap between the transects of  $\alpha$  outliers could be a coincidence, or if such overlap is unlikely to have occurred under a model of random resampling.

#### Geographic cline analysis

Classic geographic equilibrium cline models were fitted using the R package 'HZAR' (Derryberry et al. 2014) for all diagnostic SNPs. For the northern transect, sample localities 6.N and 16.N were removed because they disrupted the geographic linearity of the transect. Linear transects were drawn starting in B. bufo populations in the east and north, and ending in B. spinosus in the west and south, for the North and South transects respectively. The direction of the transect crosses the hybrid zone perpendicular, approximately west to east in the North transect, and north to south in the South transect. To determine the distance between sample localities along these transects, a custom R script was used (see supplementary material on Dryad), and the directions of the transect axes followed earlier analyses (Arntzen et al. 2016, 2017). Outliers identified in the Bayesian genomic cline analysis should also be noticeable in the geographical cline analysis: positive  $\beta$ outliers are expected to show relatively narrow geographic clines, with their center aligned with that of the hybrid zone, while negative and positive a outliers are expected to have shifted geographical cline centers and/or asymmetrical tails. The shapes and positions of many individual clines can be summarized in an expected cline based on the HI (Polechová and Barton 2011; Fitzpatrick 2012). We used the HI for all "non-outlier loci" in the BGC analysis as a neutral cline expectation for comparison with outlier loci. Thirty maximum likelihood searches were performed with random starting parameters, followed by a trace analysis of 60,000 generations on all models with a delta Akaike information criterion corrected for small-sample-size (dAICc < 10). Fifteen model variants were based on all possible combinations of trait intervals (allele frequency at the ends of the transects; three types) and tail shape (five types; Supplementary Fig. S4). Convergence was visually assessed in trace plots (for additional details, see supplementary material on Dryad).

#### Effective selection

Average effective selection on a locus (s\*) is the selection pressure at the hybrid zone center due to both direct selection and indirect selection on linked loci. An estimate of s\* can be obtained using  $s^* = \left(\frac{2\sigma}{w}\right)^2$ , where  $\sigma$  is the dispersal weighted for juvenile and adult life stages, and w is the width of the HI cline (Barton and Gale 1993). We calculated s\* using scripts from van Riemsdijk et al. (2019) for each transect separately. We grouped those markers that were not indicated as outliers in BGC (832 for the northern transect and 652 loci for the southern transect; Table 1). We also excluded population 16.N, because it is isolated on the island of Jersey and could be inbred, which would violate model assumptions. We repeated the analysis for presumptive barrier markers identified as heterozygote deficiency outliers in BGC ( $\beta > 0$ ; 56 loci for the northern and 121 loci for the southern transect). To calculate  $\sigma$  we used a recombination rate of 0.4997, calculated following equation (6) from Macholán et al. (2007) and based on the number of chiasmata per bivalent for *B. bufo* (1.95; Wickbom 1945) and the

 
 Table 1. Bayesian genomic cline (BGC) results comparing significant outliers for the northern transect (N) and the southern transect (S), and the markers which were outliers in both transects (overlap), where significance of outliers is based on the 99.9% confidence interval (CI).

Outlier	<b>Biological interpretation</b>	N	S	Overlap
β<0	Heterozygote excess	50	105	11 <sup>d</sup>
β > 0	Heterozygote deficiency	56	123	26 <sup>c</sup>
α < 0	Directional introgression from <i>B. bufo</i> into <i>B.</i> spinosus	151 <sup>a</sup>	185 <sup>b</sup>	92 <sup>c</sup>
α > 0	Directional introgression from <i>B. spinosus</i> into <i>B.</i> bufo	110 <sup>a</sup>	174 <sup>b</sup>	49 <sup>c</sup>

The total number of markers analyzed was 1175.

<sup>a</sup>Significant Chi-squared with 6.4406, df = 1, P = 0.0112.

<sup>b</sup>Not significant Chi-squared with 0.3371, df = 1, P = 0.5615.

<sup>c</sup>Significant 2×2 contingency Chi-squared with 285.05, 91.629, 81.288,  $df = 1, P < 2.2e^{-16}$ .

<sup>d</sup>Significant 2 × 2 contingency Chi-squared with 10.331, df = 1, P = 0.001308.

number of diploid chromosomes for *B. bufo* (N = 22), a generation time (sexual maturity) of 2.5 years for *Bufo* at the latitude of the hybrid zone (mean of 3 years in females and 2 years in males; Hemelaar 1988) and secondary contact established 8000 years ago (Arntzen et al. 2016). Admixture linkage disequilibrium (D') at the center of the hybrid zone was based on the variance in HI. The width of the hybrid zone (*w*) was derived from a general sigmoid cline model following HZAR (Derryberry et al. 2014), fitted to the HI (Barton and Gale 1993). The mean and 95% confidence interval (Cl) were based on 1000 bootstrap replicates of the original genotype dataset sampled with replacement and maintaining the original sample sizes within sites.

#### **RAD** marker genome position

The recently published genome of B. bufo is assembled into 11 chromosome-level scaffolds spanning 5045 Mbp, with a scaffold N50 of 636 Mbp (Streicher et al. 2021). Within this genome, 30,286 genes were identified. We aligned 1184 (diagnostic) RAD markers allowing gaps between the flanking regions of fragments to the B. bufo genome with bwa v.0.7.17 (Li and Durbin 2009) using the BWA-MEM algorithm and default settings. A chromosome map identifying RAD marker putative positions was constructed with the R packages GenomicRanges (Lawrence et al. 2013) and karyoploteR (Gel and Serra 2017). We used a cut-off of 750 kbp distance between SNPs and gene boundaries to link SNPs to gene IDs, which appears to be optimal for finding SNPs linked to causative genes (Brodie et al. 2016). This resulted in "closest gene" identifications for 1141 markers. We used a go-term enrichment analysis to identify "selection on biological processes" of the genes closest to the 26 markers identified as  $\beta > 0$  outliers (selection against heterozygosity) in both transects, (PANTHER v.14; Mi et al. 2018), using Xenopus tropicalis and Homo sapience as references, with Fisher's exact test and Bonferroni correction for multiple testing. We further explored a 31 Mbp region on chromosome 3 to which seven out of 26 RAD markers identified as heterozygote deficient in the BGC analysis in both transects mapped. A STRING (Szklarczyk et al. 2021) analysis based on human genome annotation was used to identify the 33 genes in this region and infer function based on the human genome. Default settings were used, with medium confidence for a relation between genes to be reported (0.4). Higher confidence resulted in no links reported.



Fig. 2 Markers identified as  $\beta$  or  $\alpha$  outlier by Bayesian genomic cline (BGC) analysis, also stand out in their geographic cline when comparing the parameters 'center' and 'width' (HZAR). Heterozygote deficiency outliers ( $\beta > 0$ ) have steep geographic clines, both in the (a) northern transect and (b) southern transect. For markers showing directional introgression ( $\alpha$  outliers in BGC), the geographical cline has a shifted center for both the (c) northern transect and (d) southern transect.

#### RESULTS

#### Data quality and population structure

The average read count per sample was ~1.5 million paired-end reads (maximum 4.2 million reads, Supplementary Table S3). Five samples had low raw read quantities (near or below 0.5 million reads) and were excluded. Low error rates in genotype calls for samples sequenced in triplicate (0.5%, Appendix, 1. Library triplicates) and near-identical population structure based on different datasets (see below) give us confidence that our de novo assembly parameters strike a reasonable balance between read depth and missingness. The 10% maximum per-locus missingness rate across individuals included loci for at least 349 individuals genotyped for 986 loci (10,535 SNPs), while the 50% data set included loci for at least 194 individuals genotyped for 4869 loci (39,750 SNPs). Because the PCA plots (Supplementary Fig. S5) and Structure analyses for both datasets were nearly identical we describe only the results of the larger 50% missingness dataset, and continued with this dataset in downstream analyses. The first axis (PC1, 26.8%) of the PCA reflects the genetic difference between pure B. bufo in the north (lower PC1 values) and pure B. spinosus in the south (higher PC1 values), with hybrids at an intermediate position (Fig. 1d, Supplementary Fig. S5). The second axis (PC2, 2.8%) separates the two transects at the B. spinosus end. Structure plots for K = 2 reflect differentiation between the two species, with a smooth transition between the two parental species via genetically admixed genotypes. Additionally, to verify the choice of species-diagnostic SNPs we ran additional analysis (Supplementary Appendix 2. Reference populations), further strengthening our confidence in the quality of the data we selected.

#### Bayesian genomic cline outlier detection

The BGC analysis, based on 1175 species-diagnostic SNPs, shows little bias in the distribution of observed hybrid indices for admixed individuals across both transects (Supplementary Fig. S6). The number of markers identified as heterozygote deficient or heterozygote excess outliers in the northern transect (deficient:  $\beta > 0$ , n = 56; excess:  $\beta < 0$ , n = 42) is less than half that observed in the southern transect ( $\beta > 0$ , n = 123;  $\beta < 0$ , n = 105). Considerably more markers were identified as outlier in either transect than would be expected by chance (last column, Table 1). Both transects shared a set of 26 heterozygote deficient markers indicating reduced introgression, a result that is extremely unlikely purely by chance (2×2 contingency Chisquared, df = 1,  $P < 2.2e^{-16}$ ; Table 1). The southern transect has a nearly equal number of markers with an increased or decreased probability of *B. bufo* ancestry ( $\alpha > 0$ , n = 174;  $\alpha < 0$ , n = 185;  $\chi^2$ test P = 0.5615). In contrast, the northern transect had fewer  $\alpha$ outliers overall, and significantly more markers with a reduced than an increased probability of B. bufo ancestry relative to the overall HI (reduced  $\alpha < 0$ , n = 151; increased  $\alpha > 0$ , n = 110;  $\chi^2$ test P = 0.0112; Table 1). In other words, more genes are flowing from B. bufo into B. spinosus in the northern than the southern transect.

#### Geographic cline outlier detection

The same 1175 species-diagnostic SNPs were subjected to geographical cline analysis in HZAR. We verified that BGC outlier markers also stood out in the shape and/or position of their geographic cline by comparing them to the geographic cline



Fig. 3 Geographic cline graphs coloured by Bayesian Genomic Cline (BGC) analysis outlier identification. Geographic clines for barrier markers ( $\beta > 0$ , green) for the (a) northern transect and (b) southern transect; markers showing introgression into *B. spinosus* ( $\alpha < 0$ , orange) for the (c) northern transect and (d) southern transect; and markers showing introgression into *B. bufo* ( $\alpha > 0$ , blue) for the (e) northern transect, and (f) southern transect. In all panels, frequency of the *B. spinosus* allele on the y-axis and distance along the transect on the x-axis. The gray clines are all other markers (including all outliers of other types). Inward ticks on the top of each graph and notation near inward ticks on the top of the graph (panels a and b only) refers to locations in Fig. 1.

parameters 'center' and 'width' as determined with HZAR (Fig. 2, full analysis in online data repository). Heterozygote deficiency outliers according to BGC ( $\beta > 0$ ) have steep geographic clines, and this was the case in both transects (green in Fig. 3, Supplementary Figs. S7 and S8). These are considered barrier markers because they show reduced introgression compared to background introgression (gray lines in Fig. 3). For  $\alpha$  outliers in BGC ( $\alpha < 0$  [dark orange] and  $\alpha > 0$  [blue]), the geographical cline has a shifted center and/or shape (e.g., width), when compared to the genomic average, represented by the geographical cline of the HI based on all neutral markers (Fig. 3, Supplementary Fig. S9, Supplementary Table S4).

#### **Effective selection**

We observed lower estimates of effective selection against hybrids (s\*) in the northern transect than in the southern transect. For the northern transect, s\* based on markers that were not identified as outliers in the BGC analysis was 0.0022 (95% CI 0.0012–0.0034), while s\* in the southern transect was almost an order of magnitude greater, at 0.0195 (95% CI 0.0143–0.0252; Supplementary Table S5, Supplementary Fig. S10). The s\* based on barrier markers for the northern transect (0.0101; 95% CI 0.0054–0.0152) was also lower than the southern transect (0.0344; 95% CI 0.0220–0.0470), although the difference between transects was smaller. Notably, the confidence intervals for estimates of s\* for

neutral and for barrier markers do not overlap between the two transects.

#### **RAD marker genome position**

A total of 1140 RAD fragments were aligned to the B. bufo genome (Supplementary Table S6). Markers identified as genomic outliers by BGA were mapped on the chromosomes separately for each transect, showing clusters of especially beta outliers, and, sometimes, alpha outliers (Fig. 4). The go-term enrichment analysis of the genes closest to the 26 markers identified as heterozygote deficient ( $\beta > 0$  in BGC, i.e. potential barrier markers) in both transects, gave no significant overrepresentation of any biological function (Supplementary Tables S7 and S8). Seven of these 26 markers were mapped in a region of ~ 31 Mbp on chromosome 3 (see Supplementary Fig. S11) and therefore we explored this region further. The SNPs in this region of the chromosome behave as a linkage block; if individuals are homozygote for one SNP, they are also homozygote for the neighboring SNPs, if they are heterozygote for one SNP, they are also heterozygote for the neighboring SNPs, etc., indicating there is a relatively low recombination rate in this region (Supplementary Fig. S12). In this region, 33 well-annotated genes are located (Supplementary Table S9). When we analyzed these 33 genes with STRING, we found these genes are reported (in domestic pigs, Sus scrofa domesticus) to be enriched for limb and ear growth (Supplementary Table S10; Ren et al. 2011; Zhang et al. 2014).



Fig. 4 Alignment of RAD markers to the B. bufo genome for each transect. Gray lines represent markers which were not identified as outlier by BGC analysis. Above the line are heterozygosity ( $\beta$ ) outliers, below the line are directional gene flow outliers ( $\alpha$ ). Outlier identity is explained in the legend below the figure. Red arrows point to RAD markers which were heterozygote deficiency outliers in both transects.

#### DISCUSSION

#### A shared barrier to gene flow characterizes the Bufo hybrid zone

Although 900 km apart, our two transects share 26 barrier markers that all demonstrate a heterozygous deficit when compared to genome-wide expectations. It is highly unlikely that this pattern would be shared across these loci due to chance alone  $(2 \times 2)$ contingency Chi-squared test, df = 1,  $P < 2.2e^{-16}$ ; Table 1). Rather, we interpret this finding as indicating that a set of general genomic incompatibilities is consistently present between these two Bufo species and that these markers indicate a mechanism maintaining both species. Individual loci with restricted introgression ( $\beta < 0$  in BGC) could imply local adaptation to e.g. hybridization, and therefore could be a response to existing barriers to gene flow, but they could also be evidence of other biological phenomena, such as heterozygote disadvantage. The corresponding general barrier effect is strong enough to have prevented collapse of the species boundary, despite initiation of secondary contact millennia ago (Arntzen et al. 2016; Arntzen 2019). Whilst there seems no enrichment of any biological function for these 26 barrier markers (Supplementary Tables S7 and S8), seven of them map to a 31 Mbp region of B. bufo chromosome 3 that contains 33 protein coding genes. Two RAD loci in this same region were 1) only found to be a barrier marker in the northern transect, and 2) found to be neutral or to have heterozygous excess. This suggests not all markers in this chromosomal region share an identical evolutionary history, and therefore, the following interpretation of the results is cautious.

The protein coding genes in the 31 Mbp region are enriched for limb and ear growth in domestic pigs (Ren et al. 2011; Zhang et al. 2014). It is possible this genomic region may control developmental pathways that are responsible for morphological or physiological differences between these two toad species. However, homology of this function in amphibians has not yet been confirmed (also not in the anuran model Xenopus) and it would require gene editing experiments to verify function. Although our reduced genome sequencing cannot pinpoint the specific causal variant(s), our finding suggests that one or more genes in this region are associated with reproductive isolation between these two Bufo species. Further exploration of this genomic region may help elucidate what causes reproductive isolation in this system.

An overlapping set of barrier markers identified in multiple transects across a sunflower (Helianthus) hybrid zone similarly indicated a common set of barrier genes; subsequently, genes in these regions were linked to pollen sterility and chromosomal rearrangements, and were thought to be responsible for the maintenance of lineage isolation (Feulner and De-Kayne 2017; Rieseberg et al. 1999; Buerkle and Rieseberg 2001). The Helianthus barrier genes were also found to restrict gene flow under laboratory conditions, excluding the possibility that environmental factors shared across all transects were playing a significant role (Buerkle and Rieseberg 2001). Future experimental studies and genomic analysis could test the hypothesis of such a functional barrier to gene flow across the Bufo hybrid zone. An alternative hypothesis, in which structural variation between the genomes of B. bufo and B. spinosus is responsible for reduced recombination between genomic regions, could be tested when a B. spinosus genome becomes available.

Spatial variation in barrier effect along the Bufo hybrid zone The number of barrier markers identified in the genomic cline analysis is approximately twice as large in the southern transect (n = 123) than in the northern transect (n = 56). These barrier markers also act as expected under reduced introgression in the geographical cline analysis; their geographical clines are narrow and with centers confined to the midpoint of the hybrid zone. The estimated strength of selection against hybrids is significantly higher in the south ( $s^* = 0.0195$ ) than in the north ( $s^* = 0.0022$ ).

The simplest explanation for these results is a difference in timing of secondary contact establishment along the Bufo hybrid zone. During postglacial expansion, secondary contact between B. bufo and B. spinosus would have first been established in the south-east of France, where the geographic distance between refugia is smaller, and progressed over time towards the northwest, where the geographic distance between refugia is larger. Timing of this zipper-like establishment of secondary contact is well characterized using mtDNA data (Garcia-Porta et al. 2012; Recuero et al. 2012; Arntzen et al. 2017), and would have progressed relatively slow, as the effective dispersal in Bufo toads

is estimated at about max. 4.5 km per generation (Supplementary Table S.5). As a consequence of the longer secondary contact in the south compared to the north, there has been more opportunity for additional barrier genes to be recruited and converge geographically towards the hybrid zone -a process also known as "cline coupling" (Barton 1983; Barton and Gale 1993; Bierne et al. 2011; Harrison and Larson 2016; Vines et al. 2016; Butlin and Smadja 2018; Dagilis et al. 2019).

#### Differences in introgression along the Bufo hybrid zone

Another distinct difference between the two transects is that the direction of gene flow is symmetrical in the southern transect, but involves a greater number of *B. bufo* alleles flowing into *B. spinosus* than in the opposite direction in the northern transect (Table 1). Markers showing significant introgression are randomly distributed across the genome, and are consistent with the interpretation of hybrid zone movement, with random asymmetric introgression from the receding into the expanding species, reflecting a 'genomic footprint' of hybrid zone movement (Barton and Hewitt 1985; Buggs 2007; Currat et al. 2008; Wielstra 2019). Despite a longer history of introgression, the hybrid zone appears to be stable in the south, whereas the hybrid zone appears more mobile in the relatively recently established northern transect.

Reasons why the hybrid zone is more mobile in northern France remain uncertain. Barrier genes may become coupled in a steep gradient of locally adapted genes (Bierne et al. 2011). In such a situation the hybrid zone can become 'trapped' at an ecotone (Bierne et al. 2011). A suite of environmental variables was previously found to be associated with the position of the Bufo hybrid zone based on niche modeling and genetic data: B. spinosus prefers higher altitude, higher temperatures, and sandier soils than B. bufo (Arntzen et al. 2020). While the geography around the northern transect is relatively homogeneous, this is not the case for the southern transect, particularly with respect to elevational relief (Fig. 1). We propose that the hybrid zone has stabilized at an environmental gradient in southern, but not (yet) in northern France, perhaps reflecting the younger age of the northern transect. Previous studies provided evidence for both hybrid zone stability and movement in other systems (e.g. Visser et al. 2017; Sequeira et al. 2022), and further research could focus on time series to record further movement of the northern section of the hybrid zone and attempt to link genes to environmental or ecological processes.

#### CONCLUSIONS

Hybrid zones provide the unique opportunity to quantify the completeness (or lack thereof) of the speciation process. It is now clear that some alleles fare poorly in admixed populations, whereas others flow freely between species across a broad range of taxa. What is less well documented, is that these genomic incompatibilities may vary spatially across the same hybrid zone. Here, we show striking differences in interspecific gene flow between two replicate hybrid zone transects, presumably reflecting variation in secondary contact establishment and landscape features along the hybrid zone. We document a set of barrier markers shared between transects, reflecting genomic incompatibilities that characterize the two Bufo species as a whole and maintain the discreteness of the hybrid zone throughout its length. This tension zone apparently consists of species-level genomic regions maintaining the integrity of both species, and variable local landscapes interacting with additional barrier genes to define the placement and stability of the hybrid zone in different environments. Such complex patterns can only be documented by applying genomic hybrid zone analyses at multiple transect locations. The Bufo hybrid zone thus provides a system allowing us to separate general barriers to gene flow from those derived from localized environmental variation interacting, potentially, with specific genes.

#### DATA AVAILABILITY

Supplementary figures, tables, and text can be downloaded from the online article version. Raw data used in this study are available on GenBank under NCBI BioProject PRJNA954537. Data assembly, validation, and analysis code and input files can be found on Dryad: https://doi.org/10.5061/dryad.qv9s4mwkg.

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#### **AUTHOR CONTRIBUTIONS**

IVR, JWA, BS, and BW designed the study. IVR and JWA collected samples. IVR performed the laboratory work and data assembly with contributions from GB, EMM, PS, and ET. IVR analyzed and interpreted the data with contributions from BS, BW, JWA, MR, and PS. IVR, BW, and BS wrote the manuscript with input from all authors.

#### Compliance with ethical standards

#### **COMPETING INTERESTS**

The authors declare no competing interest.

#### ADDITIONAL INFORMATION

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