# ORIGINAL ARTICLE

# Genome-wide diversity and habitat underlie fine-scale phenotypic differentiation in the rainbow darter (*Etheostoma caeruleum*)

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# Abstract

Adaptation to environmental change requires that populations harbor the necessary genetic variation to respond to selection. However, dispersal-limited species with fragmented populations and reduced genetic diversity may lack this variation and are at an increased risk of local extinction. In freshwater fish species, environmental change in the form of increased stream temperatures places many cold-water species at-risk. We present a study of rainbow darters (Etheostoma caeruleum) in which we evaluated the importance of genetic variation on adaptive potential and determined responses to extreme thermal stress. We compared fine-scale patterns of morphological and thermal tolerance differentiation across eight sites, including a unique lake habitat. We also inferred contemporary population structure using genomic data and characterized the relationship between individual genetic diversity and stress tolerance. We found site-specific variation in thermal tolerance that generally matched local conditions and morphological differences associated with lake-stream divergence. We detected patterns of population structure on a highly local spatial scale that could not be explained by isolation by distance or stream connectivity. Finally, we showed that individual thermal tolerance was positively correlated with genetic variation, suggesting that sites with increased genetic diversity may be better at tolerating novel stress. Our results highlight the importance of considering intraspecific variation in understanding population vulnerability and stress response.

#### KEYWORDS

adaptive potential, *Etheostoma caeruleum*, genetic diversity, morphology, RADseq, thermal tolerance

# 1 | INTRODUCTION

Contemporary extinctions surpass background rates by orders of magnitude, signaling an unprecedented global defaunation period (Dirzo et al., 2014; Young et al., 2016). Despite rapid and steep declines in biodiversity, many natural populations can persist through environmental change, whether it be through ecological mechanisms, evolution, or both (DeLong et al., 2016; Kinnison & Hairston, 2007; Lande & Shannon, 1996; Willi & Hoffmann, 2009). In the face of global change, there are three principal modes of population response to avoid extinction (Bell & Collins, 2008; Gienapp et al., 2008; Norberg et al., 2012). First, organisms can disperse to

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more suitable environments in other locations (Chen et al., 2011; Parmesan et al., 1999). Second, they can remain and alter their responses through phenotypic plasticity, without changing their genetic composition (Charmantier et al., 2008; Nussey et al., 2005). Third, populations can evolve novel adaptations to stressful conditions through evolutionary rescue, enabling persistence despite environmental change (Kitano et al., 2008; Phillips & Shine, 2006).

In dispersal-limited species, understanding the potential for plasticity and/or evolutionary rescue in facilitating population persistence is crucial (Reed et al., 2011). Plastic responses are capable of buffering against extinction within a range of environmental conditions when migration to more suitable conditions is not possible (Ghalambor et al., 2007: Reed et al., 2010: Sultan & Spencer, 2002). Similarly, when populations are dispersal-limited and lack phenotypic plasticity, evolutionary rescue, or adaptive change that prevents extinction due to maladaptation to novel conditions, can reduce population decline in the face of environmental change (Gomulkiewicz & Holt, 1995; Gonzalez et al., 2013; Thompson, 1998). The potential for evolutionary rescue relies largely on whether a population contains the necessary standing genetic variation to respond to selection (Barrett & Schluter, 2008; Gibson & Dworkin, 2004; Paaby & Rockman, 2014). Thus, one concern for many species is that they may lack the genetic variation necessary to adapt, thereby facing an increased extinction risk (Bohonak, 1999; Massot et al., 2008; Thomas et al., 2004).

Beyond innate dispersal capability, barriers to connectivity can also have a significant impact on population persistence. For instance, reduced connectivity due to habitat fragmentation or degradation may lead to higher genetic drift, which in turn reduces genetic diversity and increases the likelihood of local extinction (Dixo et al., 2009; Fahrig, 2003; Wilcox & Murphy, 1985). In many freshwater systems, connectivity relies on the hierarchical and dendritic topology of streams (Paz-Vinas & Blanchet, 2015; Carrara et al., 2014). Spatial and environmental heterogeneity in these systems facilitates local adaptation and biological diversification (Carrara et al., 2012). However, freshwater environments suffer disproportionately from habitat fragmentation compared with other landscape networks due to their unique hierarchical structure (Fagan, 2002), often resulting in reduced connectivity and demographic decline. Small and isolated populations, such as those found in headwaters or blocked stream sections, are vulnerable to genetic threats such as reduced adaptive potential and the deleterious effects of inbreeding (Gaggiotti, 2003; Willi et al., 2006). This is often illustrated in the heterozygosity-fitness relationship, by which populations with decreased heterozygosity (reduced genetic diversity) likewise suffer from a reduction in fitness or stress tolerance (Frankham, 1996, 2005; Reed & Frankham, 2003). The combined environmental, demographic, and genetic threats in isolated populations, especially those restricted to isolated stream sections, can result in a rapid decline in population size and eventual extinction, a process known as the extinction vortex (Blomqvist et al., 2010; Fagan & Holmes, 2006).

Evolutionary Applicatio

Freshwater fishes have the highest extinction rate among vertebrates in the twentieth century, largely attributed to habitat loss and modification (Mantyka-Pringle et al., 2014; Burkhead, 2012). In addition, climate change and increased temperatures pose other significant yet understudied threats (Comte et al., 2013; Daufresne & Boët, 2007). Cold-water habitats in the United States are predicted to decrease by nearly 50% given a simulated doubling of atmospheric carbon dioxide to 660 ppm (Boer et al., 1992; Eaton & Scheller, 1996), leading to a substantial projected decline of cold-water species (Comte et al., 2013). For species restricted to cold, headwater habitats, the capacity for movement to a more suitable location is likely limited. Therefore, characterizing contemporary variation in thermal tolerance and the potential to "adapt in place" is critical for determining the potential for population persistence given associated increases in stream temperatures.

North American darters in the family Percidae are a speciose clade (>200 species) consisting of mostly small fish that occupy fast-flowing and generally cool-water streams (Kuehne & Barbour, 1983; MacGuigan & Near, 2019; Near et al., 2011). Many species are sympatric, exhibiting reproductive isolation through sexually dimorphic characteristics (such as nuptial coloration) and assortative mating (Mendelson, 2003; Mendelson et al., 2007). Although the phylogenetic history of this clade has been well-studied, intraspecific eco-evolutionary dynamics, contemporary population structure, and population-level persistence have received less attention. Many darter species are microendemic to single streams, rendering them vulnerable to extinction (Meyer et al., 2007). In fact, 88 darter species are listed as threatened, vulnerable, or endangered, with the Maryland darter likely extinct (Jelks et al., 2008). Amidst these widespread declines, there is a lack of fundamental knowledge on the adaptive potential of darters and their responses to novel stressors such as temperature.

In this study, we use a common species of darter to address questions about intraspecific variation and vulnerability, providing insight for more threatened species. The rainbow darter (Etheostoma caeruleum) is a common darter species found throughout the Eastern and Central United States, primarily in the Upper Mississippi River Basin and Great Lake drainages. Although rainbow darters have a widespread distribution, studies of other darter species have shown that populations potentially suffer from decreased connectivity and reductions in habitat quality (Fitzpatrick et al., 2014; Fluker et al., 2010). Previous population genetic studies on the rainbow darter based on mitochondrial and microsatellite data found haplotype differentiation throughout the range (Ray et al., 2006), significant genetic differentiation between populations from the Lake Erie and Ohio River catchments (Haponski et al., 2009), and genetically diverse populations with relatively little structure across Iowa (Davis et al., 2015). However, the minimum spatial scale at which rainbow darters exhibit adaptive differentiation, and how genetic variation affects stress response, is not known.

The specific aims of this study were to first, characterize patterns of phenotypic and genetic variation in the rainbow darter on a local scale, and second, test what factors affect thermal stress olutionary Applications

tolerance. Whereas this species is typically restricted to stream environments, our study also included a unique site from a large glacial lake, only the second-ever documented lake occurrence of rainbow darters (Katula, 2013). We were interested in testing the hypothesis that adaptive potential varies among sites, evidenced by phenotypic and genetic differentiation associated with local environmental conditions. We addressed the following questions: (a) Do rainbow darters exhibit phenotypic differentiation associated with lake versus stream environments? (b) What are the patterns of within and among population genetic variation on a local scale? and (c) Does the environment and/or individual heterozygosity affect thermal tolerance? Our study contributes to understanding the scale of population differentiation in a common darter species, and the potential sensitivity of this cold-water species to environmental change.

# 2 | METHODS

### 2.1 | Study area and sampling

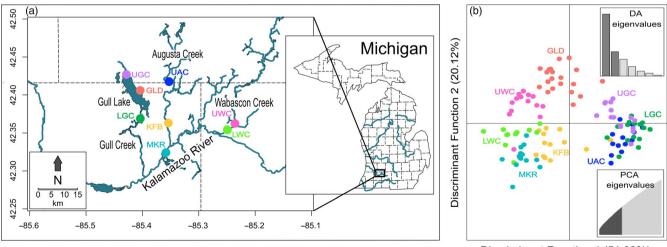
Sampling was conducted throughout June-August 2017 and 2018, across eight sample sites in Kalamazoo, Barry, and Calhoun Counties in Southwestern Michigan, USA (Figure 1a; Table 1). We chose paired upstream and downstream sites from three tributaries of the Kalamazoo River (Augusta Creek, Gull Creek, and Wabascon Creek). In addition, we included one mainstem site on the Kalamazoo River and one lake site (Gull Lake) that was situated between the paired stream sites in Gull Creek.

We collected rainbow darters (N = 12-26 per site) from each site using a combination of seine nets and hand nets for a total of 156 individuals. We included both males and females in our sampling, but avoided sampling juveniles, defined as individuals with standard length < 25mm. During sampling, individuals were held streamside in plastic buckets filled with site water until completion of sampling. We transported individuals from each site in Nalgene<sup>®</sup> containers filled with site water to the Experimental Pond Lab at W.K. Kellogg Biological Station in Hickory Corners, Michigan. We collected water temperature data from each site using a YSI Pro20 (YSI Inc.) on the date of sample collection. Additionally, we obtained the estimated average maximum air temperature for each site from June-August using daily values from the Daymet dataset, which extrapolates temperatures at a 1 km<sup>2</sup> scale using weather station data (Thornton et al., 2018).

Of the 156 individuals, 25 were collected from three sites that we sampled in 2017 (eight individuals from Kellogg Forest and Upper Augusta Creek each, and nine from Gull Lake) and then were resampled in 2018 to account for potential temporal variability in phenotypes. The only individuals from resampled sites in 2018 that were included in the genomic data collection were those from Gull Lake, to increase sample size at this site.

# 2.2 | Phenotypic measurements

Immediately upon arrival to the laboratory, each fish was anesthetized in a dilute solution of tricaine mesylate (MS-222), weighed, measured (standard length), and photographed. We took photographs under fluorescent lighting of each individual spread laterally behind a measured background in water using a Canon EOS Rebel T3 digital camera (Canon U.S.A. Inc.). Rainbow darters from the same site were housed in 20-gallon group tanks with a maximum of 10 individuals per tank. We prepared these tanks identically, including filters, water circulation devices, aquarium gravel, and bricks and plastic plants for refugia. Water was dechlorinated, denitrified,



Discriminant Function 1 (51.03%)

**FIGURE 1** (a) Map showing eight sample sites across three tributaries (Gull, Augusta, and Wabascon Creek) of the Kalamazoo River. (b) Population structure results from the discriminant analysis of principal components (DAPC), with discriminant functions one and two represented on the x and y axes, respectively. Each point corresponds to an individual and colors reflect each sampling site. The top right inset displays eigenvalues for each discriminant function and the bottom right inset indicates the number of principal components retained in the analysis (43)

#### TABLE 1 Sample collection data

Sample site	Tributary	Year sampled	Habitat type	Number of individuals phenotyped	Number of individuals genotyped	Latitude	Longitude
Kellogg Forest (KFB)	Augusta	2017-2018	Stream	23	15	42.3633°	-85.3533°
Upper Augusta Creek (UAC)	Augusta	2017-2018	Stream	24	15	42.4176°	-85.3524°
Lower Gull Creek (LGC)	Gull	2017	Stream	19	15	42.3686°	-85.4037°
Upper Gull Creek (UGC)	Gull	2017	Stream	19	15	42.4268°	-85.4281°
Gull Lake (GLD)	Gull	2017-2018	Lake	25	24	42.4063°	-85.4041°
Upper Wabascon Creek (UWC)	Wabascon	2018	Stream	15	15	42.3623°	-85.2359°
Lower Wabascon Creek (LWC)	Wabascon	2018	Stream	12	12	42.3541°	-85.2492°
Kalamazoo River (MKR)	Kalamazoo	2018	Stream	16	16	42.3241°	-85.3584°

*Note:* Sample site and tributary correspond to Figure 1a, habitat type refers to either a lake or stream environment, number of individuals phenotyped refers to the number of fish per site included in morphological analyses, number of individuals genotyped refers to the number of fish per site included in the RADseq analyses.

treated for ammonia and heavy metals, and boosted with aquatic microbiota (Ecological Laboratories Inc.) before use in tanks. We fed fish daily, alternating between frozen brine shrimp and bloodworms with amounts based on the number of individuals per tank. The room was lit with natural light from windows, following daily light/dark cycles. All fish were acclimated to a similar ambient water temperature of 24.5  $\pm$  3°C.

After a minimum of 24 hr in the laboratory, we measured and defined individual thermal tolerance using the critical thermal maximum ( $CT_{max}$ ). We defined  $CT_{max}$  as the temperature threshold at which loss of equilibrium or organized locomotion occurs, signaling individuals have reached their physiological limit prior to death (Becker & Genoway, 1979). Specifically, this limit is characterized by rapid muscle and operculum spasms followed by keeling or a loss of an ability to remain an upright position. For ectotherms, the rate of temperature increase can have different biological implications depending on the size of the organism, particularly for fish species (Lutterschmidt, 1997). Due to the small size of rainbow darters, we chose a low rate relative to other studies to limit lag between temperature increase and physiological response. The rate of temperature increase was chosen as 0.33°C per minute and was calculated at a set transformer voltage of either 100 or 120 V depending upon the immersion heater used.

Prior to trials, individuals were starved for 24 hr. An insulated, rectangular (48 cm  $\times$  34 cm  $\times$  18 cm) Coleman<sup>®</sup> 31-quart cooler was filled with a constant volume (three gallons) of room temperature, dechlorinated, and denitrified water treated for ammonia and heavy metals. Two aeration devices were used to prevent a decline in dissolved oxygen content due to increasing temperatures. A 2.8 watt Rio<sup>®</sup> Plus 90 Aqua Pump (TAAM Inc.) generated a current to maintain temperature equilibrium throughout the cooler, while two immersion heaters connected to a voltage transformer (PHC Enterprise Inc.) were placed on opposite ends of the cooler to facilitate gradual temperature increase. Reusable coffee filter containers

covered with mesh netting were used to contain individuals during trials. Individuals were acclimated in the water for 10 min before beginning trials. We tested one fish per container, with a maximum of four individuals tested per trial. During trials, temperature increase was recorded using a YSI Pro20, and individuals were monitored for visual indications of reaching  $CT_{max}$ . Upon reaching  $CT_{max}$ , individuals were removed from the trial and given a recovery period to ensure survival. A single fish in our study failed to recover, likely due to surpassing its  $CT_{max}$ . This individual was not included in subsequent  $CT_{max}$  analyses. After each  $CT_{max}$  trial, we used sterile scissors to clip one anal fin from all recovered individuals. Tissues were stored within 1.5 ml tubes containing 100% ethanol for subsequent dividuals using a lethal dose of buffered MS-222.

## 2.3 | Morphometric analyses

To test for differences in morphology among sites and habitat, we conducted geometric morphometric analyses. We compiled JPEG images from 154 individuals into a TPS file using tpsUtil v1.76 (Rohlf, 2018). Each image was scaled and digitized with 15 anatomical landmarks in tpsDig v2.30 (Rohlf, 2017). We used a series of modified landmarks (Guill et al., 2003), with three landmarks serving to correct bend curvature bias (Figure 2). Landmarks used for correcting curvature in organisms were removed prior to downstream analysis due to not corresponding to actual homologous regions across individuals. Bend curvature was corrected using tpsUtil and subsequent analysis of body shape variation was carried out using the MorphoJ software (Klingenberg, 2011). Individuals were superimposed using a Procrustes fit to obtain Procrustes coordinates that accounted for variation associated with size and position of landmarks for each individual (Adams et al., 2004). Subsequently, we carried out a Procrustes ANOVA to evaluate support for site olutionary Applications

differences in overall body shape. We included site as a fixed effect and sex as a covariate. A canonical variate analysis (CVA) was then employed to identify the main axes of variation in body shape and calculate significant pairwise differences in shape among sites. This type of analysis is useful when seeking to explore shape variation for multiple groups with known a priori grouping. A permutation test for significance was conducted on pairwise Procrustes distances between sites with 10,000 iterations. To assess morphological divergence between habitat types, we conducted a discriminant function analysis (DFA) between the two habitats (stream (N = 130) versus lake (N = 24)). In order to determine the effect of sex, we also carried out a DFA between males (N = 70) and females (N = 84) for all sites. For each DFA, a permutation test with 10,000 iterations was used to assess significance between groups, while a cross-validation analysis determined likely individual group membership. Wireframe graphs were used for visualizing the direction of morphological change associated with each canonical variate and discriminant function axis.

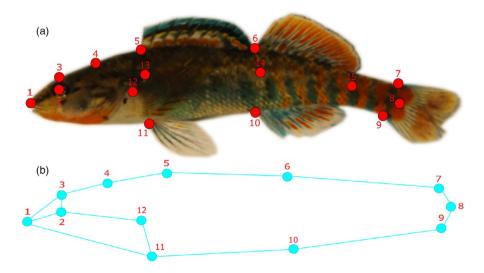
## 2.4 | Molecular methods

Total genomic DNA was extracted from fin clips using a DNeasy Blood and Tissue Kit, according to manufacturer protocols (QIAGEN). After extraction, individual DNA concentration was quantified using either a Qubit 3.0 fluorimeter dsDNA HS Assay kit (Thermo Fisher Scientific) or by Quant-iT<sup>™</sup> PicoGreen<sup>™</sup> assay (Thermo Fisher Scientific). Library preparation followed a modified restriction site-associated DNA sequencing (RADseq) protocol described by Ali et al. (2016). Briefly, samples were divided into two libraries, with individuals concentrated to a target DNA of 120 ng in 10 µl total volume. Samples were digested using the Sbfl restriction

enzyme and ligated with a unique, eight base pair length adapter sequence unique to each library. Samples were pooled by library and then sonicated to ~ 500 base pair fragments using a M220 Focused-ultrasonicator<sup>™</sup> (Covaris). Sonicated DNA was ligated to Dynabead<sup>®</sup> M-280 Streptavidin beads for a series of four washes, after which the DNA was liberated using the SbfI restriction enzyme. Preparation for sequencing followed the protocol outlined in the NEBNext Ultra DNA Library Prep Kit for Illumina with no modifications (New England Biolabs). Six base pair length adapter sequences were added to identify replicate individual adapter sequences between the two libraries. Agencourt<sup>®</sup> AMPure XP (Beckman Coulter) bead size selection was performed based on the DNA concentration obtained from a Oubit 3.0 fluorimeter. The final libraries were submitted to the RTSF Genomics Core at Michigan State University and were pooled for sequencing in one lane with paired-end 150 base pair reads on an Illumina HiSeg 4000.

# 2.5 | RADseq analyses

Forward and reverse sequence data were reoriented and reads without barcodes were removed using *Flip2BeRad* (https://github. com/tylerhether/Flip2BeRAD). We then used *stacks v2.0* (Catchen et al., 2011, 2013; Rochette et al., 2019) to filter, trim adapter sequences, demultiplex, and call genotypes (Table S2). First, the *clone\_filter* function was used to identify and remove PCR clones. We then ran the *process\_radtags* function to trim poor-quality adapter sequences and restriction site matches, allowing for a two base pair mismatch in rescuing barcode sequences. Reads were then demultiplexed and low-quality reads removed (Table S3). Forward and reverse reads were aligned to a draft of the orangethroat darter



**FIGURE 2** Fifteen landmarks used for the geometric morphometric analysis: (1) Anterior point on the head, (2) center of the eye, (3) landmark directly above the eye, (4) point at the supraoccipital notch, anterior junction of the (5) first and (6) second dorsal fins with the dorsal midline, (7) dorsal junction of caudal tail, (8) junction of lateral line and caudal tail, (9) ventral junction of the caudal tail, (10) anterior junction of the anal fin with the ventral midline, (11) anterior junction of the pelvic fin with the body, (12) dorsal junction of the pectoral fin with the body, (13-15) landmarks along the lateral line accounting for organismal bending. (a) Landmarks placed on an actual rainbow darter. (b) Wireframe graphic of landmarks produced in *MorphoJ*. Landmarks used to correct for bending (13–15) are not included

genome (Moran et al., 2019) using the default settings of *BWA-MEM* (Li, 2013) and a custom script (https://github.com/ryanpeek/radseq). Combining both libraries, the *ref\_map.pl* function in *stacks* was used to identify single nucleotide polymorphisms (SNPs), calling only the first SNP per RAD locus. We only kept SNPs that were found in all eight sites, were present in 75% of individuals within each site, and with a minimum minor allele frequency threshold of 0.05. We further filtered the data to remove individuals with more than 75% missing data, excluding eight individuals, using *VCFtools* v0.1.15 (Danecek et al., 2011). Downstream analyses were conducted on file formats outputted from *stacks* or converted using *PGDSpider* v2.1.1.5 (Lischer & Excoffier, 2012). In total, after filtering we identified 7,906 SNP loci.

### 2.6 | Genetic diversity and population structure

The output from *populations* in the *ref\_map.pl* function of *stacks* was used to analyze among site differentiation in observed and expected heterozygosity, nucleotide diversity, and pairwise  $F_{ST}$ . Within site relatedness was calculated using identity by descent in *Plink* v1.9 (Chang et al., 2015).

Among site differentiation was determined using discriminant analysis of principal components (DAPC) in the R package adegenet (Jombart, 2008; Jombart & Ahmed, 2011; R Core Team, 2018). This method is useful for discovering patterns of genetic clustering, with the option of grouping individuals a priori. Since we were interested in maximizing the differentiation between sample sites rather than genetic clusters, we chose to use a cluster value of eight, assigning individuals according to sample site. To find the number of informative principal components to retain, we carried out a cross-validation analysis with 1,000 repetitions. Patterns of admixture were assessed using ADMIXTURE v1.3 (Alexander et al., 2009). The number of genetic clusters best fitting the data was calculated by performing a 10-fold cross-validation in ADMIXTURE, resulting in the highest support for two genetic clusters (k = 2). We carried out ten independent runs with two genetic clusters (k = 2). Results from these ten runs were visualized using the pophelper package in R (Francis, 2017) and consensus ancestry between the ten runs was calculated using CLUMPP (Jakobsson & Rosenberg, 2007) in pophelper.

In order to determine the effects of geography on genetic diversity and potential migration, we tested for signatures of isolation by distance (IBD). Geographic distances between sites were collected by following stream networks on Google Earth (Table S4). Pairwise  $F_{ST}$  between sites, calculated from *stacks*, was used as a metric of genetic distance. A Mantel test was carried out in the *ade4* package in R (Dray & Dufour, 2007) between geographic and genetic distance, with 10,000 permutations. To further test whether contemporary patterns of genetic differentiation are a product of stream connectivity between sites, we utilized *StreamTree* (Kalinowski et al., 2008). We assigned genetic distances for stream sections using pairwise  $F_{ST}$ , testing whether observed site genetic differentiation reflects expected genetic distance based on stream connections. Therefore, it

is possible to identify stream sections linked to higher than expected genetic differentiation, owing to reduced gene flow (due to known or unknown connectivity barriers). For both IBD and *StreamTree*, we visualized and tested for a significant correlation between distance metrics using the *JGR* package (Helbig et al. 2013) and a Spearman's rank correlation coefficient respectively in R.

# 2.7 | Thermal tolerance and genetic diversity

We assessed whether genetic diversity influences  $CT_{max}$  by testing for a correlation between individual observed heterozygosity and  $CT_{max}$  using a Spearman's rank correlation coefficient. In order to determine whether local environmental temperature at a given sample site or observed heterozygosity better explained individual variation in  $CT_{max}$ , we carried out a linear mixed-effects model (Bates et al., 2015). We defined the full model as:

 $CT_{max} = E + G + ExG + S + W + (1|C) + (1|B) + (1|Y)$ 

where  $CT_{max}$  is the response variable for an individual. The fixed effects were defined as E (sample site), G (heterozygosity), E x G (interaction between site and heterozygosity), S (sex), and W (weight). We also included C (container position within cooler), B (trial number), and Y (year) as random effects. All models included weight and sex as fixed effects and container position, trial number, and year as random effects. In total, we tested five models: the null (neither site nor heterozygosity), only site (E), only heterozygosity (G), both site and heterozygosity (E + G), and both effects plus their interaction  $(E + G + E \times G)$ . We fit each model using maximum likelihood and used a likelihood ratio test to determine significance between models with different fixed effect terms. Plots of residuals were used to determine whether assumptions of normality and homoscedasticity were met for all models. The Akaike information criterion (AIC) was used in model selection to determine the model with the greatest explanatory power (Burnham & Anderson, 2004). Fine-scale pairwise differences in  $CT_{max}$  among sites were further explored in the site only (E) model using the emmeans (Lenth et al., 2018) and MuMIn (Barton, 2018) packages in R. For resampled sites, we analyzed temporal variation in  $CT_{max}$  using a Student's t test. The correlation between site water temperature, average maximum air temperature, and  $\mathrm{CT}_{\mathrm{max}}$  was analyzed using a Spearman's rank correlation coefficient.

# 3 | RESULTS

# 3.1 | Morphological variation

The DFA between habitats revealed significant differences in body shape between lake and stream individuals (Figure 3; p < .001). Body shape differences between the two groups are characterized by greater body depth and a terminal mouth position in stream

individuals, while lake individuals display reduced body depth and a shift toward a superior mouth position. The cross-validation analysis assigned eight lake individuals with the stream group (~33%), and 16 stream individuals with the lake group (~12%). We also found significant differences in body shape between sexes. Generally, sex differences were associated with subtle differences in body depth, with males having greater body depth. The cross-validation analysis was less accurate, assigning 33 females as males (~39%) and 21 males as females (~30%). The Procrustes ANOVA for general differences in body shape found significant differences across sites (F(140, (2,900) = 4.28, p < .001), and between sexes (F(20, 2,900) = 3.19, p = .003). Despite significant differences indicated by the Procrustes ANOVA, the canonical variate analysis (CVA) between sites revealed a significant overlap in body shape among sites (Figure S1). The first two axes, canonical variate 1 (CV1) and canonical variate 2 (CV2), explained 69.83% of the total variance among sites. CV1, explaining 40.18% of the variance, was generally associated with posterior body depth and the pectoral fin. CV2, explaining 29.65% of the variance, reflected anterior differences in body depth and mouth position. Subsequent permutation tests revealed significant differences in body shape and morphological differences between many sites (Table S1). The two sites morphologically divergent from all others were Gull Lake (GLD) and Upper Augusta Creek (UAC).

#### 3.2 Genetic diversity and population structure

Observed heterozygosity was highest in the mainstem Kalamazoo (MKR, 0.34) and Lower and Upper Wabascon Creek sites (LWC, 0.34 and UWC, 0.34), and lowest in Upper Augusta Creek (UAC, 0.30) and Lower Gull Creek (Table 2; LGC, 0.30). Nucleotide diversity was less consistent, with UAC and LGC having the lowest diversity for this metric and GLD and LWC the highest. Interestingly, GLD harbored higher genetic variation compared with its respective inlet and outlet. Relatedness also varied by site and was highest in UAC and LGC (0.19 and 0.17, respectively), above the threshold designating thirddegree relationships (Table 2). GLD and Kellogg Forest (KFB) had the lowest relatedness (0.02 each).

Pairwise genetic distance between sites  $(F_{ST})$  was generally low, ranging from 0.02 (between UAC and LGC) to 0.07 (Table S4; between UAC and LWC). Counterintuitively,  $F_{ST}$  between UAC and the paired downstream KFB site (0.06) was higher than the genetic distance between KFB and all other sites. The discriminant analysis of principal components (DAPC) was primarily defined by the first linear discriminant differentiating sites (Figure 1b). Although individuals within sites largely clustered together, Upper Gull Creek (UGC), UAC, and LGC grouped together, and one individual from KFB clustered with these sites. The first discriminant axis primarily differentiated individuals from Gull Creek and UAC from the Wabascon Creek and MKR sites, while the second discriminant axis revealed no clear population differentiation. Analyses from ADMIXTURE indicated similar population structure results, with k = 2 being the supported number of genetic clusters (Figure 4). Individuals from Gull Creek and UAC sites formed a unique cluster, while the remainder of the sites formed another cluster. Interestingly, there is evidence for admixture between the clusters in KFB, GLD, and UGC, with select individuals within these sites showing a mixed ancestry from both genetic clusters.

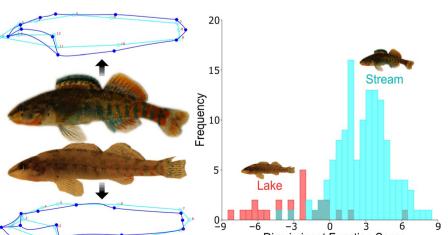
We found no evidence for isolation by distance (IBD), indicated by the nonsignificant correlation between genetic and geographic distance (Figure S2;  $r_s = 0.0328$ , p = .8684) and a nonsignificant Mantel test (p = .9911). Genetic divergence between sites was not explained by stream connectivity, with differentiation between sites being either greater or lower than expected based upon the genetic distance of each stream segment (Figure S3;  $r_s = 0.2637$ , p = .1752). Lack of support for the StreamTree model reinforced the absence of IBD, indicating a structuring of these sites not owing to stream connectivity (sites have either higher or lower observed genetic distance than is expected from cumulative stream genetic distance).

#### Thermal tolerance and genetic diversity 3.3

Heterozygosity showed a significant correlation with CT<sub>max</sub>. For both observed ( $r_s = 0.2617$ , p = .004) and expected ( $r_s = 0.4402$ , p < .001) heterozygosity, we found a positive trend, in which sites

15 Stream Frequency 01 5 Lake 04 3 6 ġ Ó **Discriminant Function Score** 

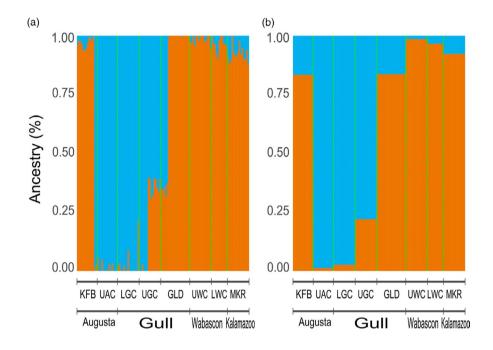
FIGURE 3 Scores produced from discriminant function analysis (DFA) conducted between the two different habitat types (lake versus stream). Stream individuals are represented by the images in the top left, while lake individuals are represented in the bottom left. Rainbow darter images are individuals from each extreme of the discriminant function, with the wireframe graphics magnified to highlight the direction of morphological differentiation



# **TABLE 2**Summary of genome-widediversity metrics for each sample site

Sample site	Observed heterozygosity (SD)	Expected heterozygosity (SD)	Nucleotide diversity (SD)	Relatedness (SD)
Kellogg Forest (KFB)	0.33 (0.20)	0.32 (0.15)	0.33 (0.15)	0.02 (0.03)
Upper Augusta Creek (UAC)	0.30 (0.22)	0.28 (0.17)	0.29 (0.18)	0.19 (0.05)
Lower Gull Creek (LGC)	0.30 (0.21)	0.28 (0.19)	0.29 (0.18)	0.17 (0.03)
Upper Gull Creek (UGC)	0.31 (0.20)	0.30 (0.16)	0.31 (0.16)	0.08 (0.05)
Gull Lake (GLD)	0.33 (0.18)	0.33 (0.14)	0.34 (0.15)	0.02 (0.03)
Upper Wabascon Creek (UWC)	0.34 (0.20)	0.32 (0.15)	0.33 (0.15)	0.03 (0.06)
Lower Wabascon Creek (LWC)	0.34 (0.21)	0.31 (0.15)	0.34 (0.16)	0.04 (0.13)
Kalamazoo River (MKR)	0.34 (0.20)	0.32 (0.15)	0.33 (0.15)	0.05 (0.06)

Note: SD, standard deviation.



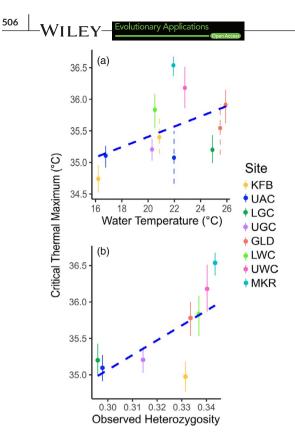
**FIGURE 4** Population structure inferred from *ADMIXTURE* for (a) each individual and (b) the population mean for the two genetic clusters (k = 2). An individual is represented by a single vertical column, with the green dotted lines demarking sites

with higher heterozygosity also had higher  $CT_{max}$  (Figure 5b). The top two supported models were the model including the additive effects for both site and observed heterozygosity (E + G) and the model including only site (E) ( $\Delta$ AIC = 0.92,  $X^2(1, N = 119)=2.92, p = .087$ ); both models explained a significant proportion of variability in  $CT_{max}$ (Table S3; conditional  $R^2 = 0.7337$  and 0.8144, respectively).

In the site only model (*E*), we found significant pairwise differences in critical thermal maximum ( $CT_{max}$ ), generally among tributaries, but also found within-tributary differences in Gull Creek (Table S1). There were no significant differences in thermal tolerance between Augusta Creek and Gull Creek, excluding Gull Lake. Gull Lake was significantly different in  $CT_{max}$  compared with upstream and downstream sites in Gull Creek and all sites in Augusta Creek. Interestingly, we did not find significant differences in  $CT_{max}$  between headwater and downstream locales in the same tributary, except for Gull Lake (Figure S4). We found a significant, positive correlation between water temperature and  $CT_{max}$  (Figure 5a;  $r_s = 0.3664$ , p < .001) and between average maximum air temperature and  $CT_{max}$  (Figure S5;  $r_s = 0.4397$ , p < .001). Cooler tributaries such as Augusta Creek displayed lower CT<sub>max</sub>, while warmer tributaries such as Wabascon Creek had higher  $CT_{max}$ . We also found a significant, positive correlation between water temperature and average maximum air temperature for each site (Figure S6;  $r_s = 0.4075$ , p < .001). Although we did not detect any variance in our model associated with year as a random effect, we resampled a subset of 2017 sites to determine whether yearly variation in  $\mathrm{CT}_{\mathrm{max}}$  existed. KFB was the only site to display significant differences in  $CT_{max}$  between years (t(21) = -3.4052, p = .003). Excluding resamples, a positive correlation still existed between site water temperature ( $r_s = 0.4297, p < .001$ ) and  $CT_{max}$ , and average maximum air temperature ( $r_s = 0.5684, p < .001$ ) and CT<sub>max</sub>.

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**FIGURE 5** (a) Correlation between site water temperature and critical thermal maximum ( $CT_{max}$ ). Error bars indicate 95% confidence intervals with dashed error bars representing sites in which resampling was conducted in 2018. (b) Correlation between site observed heterozygosity from *stacks* and  $CT_{max}$ . Error bars indicate 95% confidence intervals

# 4 | DISCUSSION

In the face of anthropogenic change and novel stress, populations may persist if they have high plasticity and/or the necessary genetic variation to facilitate evolutionary rescue (Gonzalez et al., 2013; Hoffmann & Sgrò, 2011). In this study, we showed a strong correlation between genome-wide diversity (heterozygosity) and  $CT_{max}$ , whereby sites with the highest observed heterozygosity also tended to have the highest  $CT_{max}$ . We also found support for putative adaptive differentiation in the sense that  $CT_{max}$  and morphology tended to diverge as expected based on variation in stream temperature and habitat, respectively. Overall, our findings of fine-scale differentiation owing to both extrinsic (environmental conditions) and intrinsic (genetic diversity) factors point to the importance of characterizing intraspecific variation and suggest population-level differences in vulnerability in a common, yet sensitive species.

Variation in biotic and abiotic conditions between lakes and streams often generates intraspecific phenotypic divergence. Our results, indicating that Gull Lake (GLD) individuals have reduced body depth and superior mouth positions compared to stream darters, are consistent with other examples of intraspecific ecotypic divergences. For example, threespine stickleback (*Gasterosteus aculeatus*) occupying both lakes and streams show

marked differences in body size, life-history traits, and other morphological characteristics (Hendry et al., 2002; Moore & Hendry, 2005; Moser et al., 2012). Individuals from lake populations display slender or streamlined bodies, with relatively shallower caudal peduncle depth, compared to their stream counterparts (Moore & Hendry, 2005; Ravinet et al., 2013; Sharpe et al., 2008). Although streamlined body shapes are often adaptive in high flow stream environments due to reduced drag (Cureton & Broughton, 2014; Franssen et al., 2013; Langerhans, 2008), other studies, including a study of different lake-occupying Etheostoma species (Krabbenhoft et al., 2009), have found more streamlined body shapes in lake populations (McGuigan et al., 2003; Meyers & Belk. 2014). Our results match these latter studies, with more streamlined body shapes in Gull Lake individuals. This highlights how selective pressures other than flow, such as predation, behavior, or foraging ecology, may drive the morphological differences we observed (Collin & Fumagalli, 2011; Landy & Travis, 2015; Saint-Laurent et al., 2003). The Gull Lake site in our study, and Lake Phalen in Minnesota (Katula, 2013), represent unique opportunities to study the generality of lake versus stream adaptation in rainbow darters. Making use of these lake occurrences of rainbow darters in future studies characterizing additional adaptive phenotypes and outlier loci would be of interest.

Our finding of environment-associated differentiation in CT<sub>max</sub> could be due to adaptive evolution or variation in phenotypic plasticity. Heterogeneous local conditions within and across tributaries potentially drove this fine-scale phenotypic divergence in  $CT_{max}$  to optimally match individuals to their environmental thermal regimes. The positive correlations we documented between water temperature, genetic diversity, and  $CT_{max}$  provide some evidence for adaptive differentiation associated with environmental differences. The observed heterogeneity in local thermal conditions may drive this differentiation on the molecular level. Specifically, CT<sub>max</sub> variability is dependent on the upregulation of heat shock proteins (HSP) that occurs when individuals are faced with acute high temperature stress (Basu et al., 2002; Feder & Hofmann, 1999; Iwama et al., 1998). Intraspecific variability in expression of HSP and subsequently CT<sub>max</sub> may correspond to locally divergent ecological conditions (Narum & Campbell, 2015; Oksala et al., 2014). Our finding of environmentally associated differentiation for CT<sub>max</sub> across sites elude to the possibility that HSP expression may be selected according to fine-scale variation in local thermal regimes. On the other hand, site variation in CT<sub>max</sub> can also reflect phenotypic plasticity in expression of HSP across different thermal regimes (Healy & Schulte, 2012; Schaefer & Ryan, 2006). Although we found a positive trend between site CT<sub>max</sub> and water temperature, we were unable to obtain water temperature averaged over multiple time points and caution against over-interpretation of this result. However, we did find a significant positive trend between our single point estimates of water temperature and maximum air temperature at each site, averaged throughout the summer. This suggests our single point estimates do reflect biologically meaningful differences in water temperature across

sites, although longer-term, in-situ water temperature monitoring would be ideal. Whether rainbow darter populations are locally adapted versus able to acclimate to different temperatures through phenotypic plasticity is an exciting future question.

We also found evidence for a positive effect of genetic variation on CT<sub>max</sub>, supporting the classic heterozygosity-fitness correlation (Frankham, 1996; Miller et al., 2014; Reed & Frankham, 2003). Similarly, our results are consistent with theory positing that populations with lower genetic diversity have reduced adaptive potential or decreased stress tolerance (Frankham, 2005). These heterozygosity-fitness correlations (HFC) have generally relied on microsatellite markers and found weak signals, but genome-wide estimates of heterozygosity using SNPs can be strong predictors for individual fitness across phenotypes in natural populations (Lemopoulos et al., 2019; Hoffman et al., 2014; Miller et al., 2014; but see Yates et al., 2019). Specifically, our finding that sites with increased genetic diversity have a higher  $CT_{max}$  suggests that individuals with higher genetic variation may be better at withstanding abrupt increases in water temperatures in the wild. Similar relationships have been documented in several other fish species, suggesting some generality in this pattern. In eastern mosquitofish (Gambusia holbrooki), a population found in a nuclear reactor effluent pond with near-lethal temperatures had higher heterozygosity than surrounding natural populations (Meffe et al., 1995). Populations of Trinidadian guppies (Poecilia reticulata) with recent histories of gene flow had higher CT<sub>max</sub> compared with neighboring populations with strong genetic drift and no gene flow (Fitzpatrick & Reid, 2019). Finally, in the least killifish (Heterandria formosa), experimentally bottlenecked populations having undergone declines in genetic diversity were less likely to evolve an adaptive response (increased CT<sub>max</sub>) when compared to nonbottlenecked populations (Klerks et al., 2019). Our study highlights the potential role of intraspecific genetic diversity in shaping variation in CT<sub>max</sub>. In particular, isolated populations with increased relatedness and reduced adaptive potential owing to increased genetic drift and inbreeding may be especially vulnerable to thermal stress (Bijlsma and Loeschcke 2012). Given recent work illustrating  $CT_{max}$  and thermal adaptation as a highly polygenic trait, our finding of a correlation between heterozygosity and  $CT_{max}$  underscores the importance of considering genome-wide diversity for understanding stress tolerance (Bay & Palumbi, 2014; Dayan et al., 2019; Rose et al., 2018).

When comparing models that incorporated effects of both local thermal regime and heterozygosity on  $CT_{max}$ , we were unable to distinguish between only site or the additive effects of site and heterozygosity as the best-supported model. Thus, a combination of environmental (extrinsic) and genetic (intrinsic) factors likely explains the described variation in  $CT_{max}$  with some degree of phenotypic expression likely due to plasticity. We found evidence for plastic responses in one site (Kellogg Forest, KFB), where individuals sampled in 2018 had significantly higher  $CT_{max}$  than the previous year. Conversely, UAC, in the same tributary, did not display a plastic  $CT_{max}$  response across years despite temperature variability. This site also had the lowest genetic diversity and highest relatedness, suggesting

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a possible constraint on plastic responses. Although no study has directly tested the interplay between  $CT_{max}$ , genetic diversity, and plasticity in darters, seasonal variation in  $CT_{max}$  has been shown in darters across temporal ranges (Hlohowskyj & Wissing, 1985). Interestingly, despite phenotypic plasticity being traditionally considered inversely related to heterozygosity (Pigliucci, 2005; Scheiner, 1993), there is some evidence in Drosophilia that heterozygous individuals have higher plasticity (Rocha & Klaczko, 2016). In our system, it is likely that variation in CT<sub>max</sub> is to some extent plastic within a range of temperatures to which individuals are locally conditioned, but the adaptive potential for increased  $CT_{max}$  could be constrained by a lack of genetic diversity (such as UAC displaying nonsignificant temporal variation). Importantly, plastic mechanisms can also promote evolutionary change as well, through the accommodation or assimilation of traits in response to selection pressures (Kelly, 2019; Pigliucci et al., 2006, Pigliucci 2005). In order to disentangle the difference between plasticity and local adaptation, future studies are needed focusing on rearing rainbow darters from different thermal regimes for multiple generations in a common garden, as well as identifying loci associated with variation in CT<sub>max</sub>.

Contemporary population structure can impact the spread of adaptive genetic variation through evolutionary processes such as gene flow or genetic drift (Lande, 1976; Slatkin, 1987; Tigano & Friesen, 2016; Willi et al., 2006). Despite the fine-scale scope of our study, we did find some evidence of population structure, which contrasts to similar darter studies that found no discernable genetic structure (Davis et al., 2015; Washburn et al., 2020). The two genetic clusters identified did not correspond to geographic stream distance. We suggest three possible explanations for the observed patterns. Altered stream connectivity through culverts or dams between sample sites may have led to reduced gene flow between proximate sites on a contemporary timescale. Alternatively, observed population genetic structure could be due to selection against migrants due to isolation by environment (Sexton et al., 2014; Wang & Bradburd, 2014). Given that a previous phylogenetic study indicated that rainbow darter populations in the Great Lakes basin originated from a common glacial refugium (Ray et al., 2006), and the lack of isolation by distance found in other drainages (Haponski et al., 2009), a final explanation is that restricted migration and genetic drift during postglacial colonization are potential forces shaping structure at the scale explored here.

Taken together, results from our study highlight the importance of understanding how ecological and evolutionary processes interact to affect intraspecific variation, adaptive potential, and vulnerability to environmental stress. Most darter species, including rainbow darters, are comprised of locally patchy populations with limited dispersal (Craig, 2008; Hicks & Servos, 2017). Fine-scale population structure has been documented in several darter species (Blanton et al., 2019; Camak & Piller, 2018; Fitzpatrick et al., 2014) including isolation by distance in rainbow darters (Davis et al., 2015). Limited connectivity and "small population problems" associated with genetic drift likely contribute to the threatened conservation status of many darter species. However, the extent of local volutionary Applications

phenotypic variation and the effects of genetic variation on adaptive potential and stress tolerance have generally not been explored in this hyper-diverse group of fishes. Our study points to interesting potential interactions among gene flow, selection, and the environment occurring on a highly spatial scale. For example, we found morphological differentiation between lake and stream habitats and environment-associated patterns of  $CT_{max}$  suggestive of adaptive differentiation. At the same time, sites with lower genetic variation and increased relatedness appear to be more vulnerable to abrupt stress, suggesting that maintaining high genetic variation, possibly through gene flow, could be an important buffer against environmental change. Therefore, variation in dispersal capacity and gene flow could impact the spread of adaptive phenotypic and genetic variation that is critical for buffering against stress and enabling population persistence in this system.

Our study adds to the body of literature highlighting the link between genome-wide diversity and stress tolerance. Furthermore, this is to our knowledge the only study in a darter species to specifically link individual genome-wide diversity to  $CT_{max}$ . Broadly, adaptive potential is consequential for populations to withstand novel stressors resulting from anthropogenic defaunation (Frankham, 2005; Hansen et al., 2012; Hoffmann & Sgrò, 2011). Characterizing intraspecific adaptive potential and stress tolerance is a critical step to identifying at-risk populations before their decline. In the context of the ongoing defaunation period, the concern is shifting toward conservation efforts that include populations of widespread and common species (Gaston & Fuller, 2008; Hobbs & Mooney, 1998; McCallum, 2015). Local extinctions of common species are rapidly occurring or predicted to happen during the current period of "biological annihilation," but remain largely undocumented until urgent conservation action is needed (Ceballos et al., 2017). Given the expected water temperature increases in the Mississippi and Great Lake drainages of ~2°C by the end of the century (van Vliet et al., 2012, 2013), our study illustrates a species of cool-water fish that is potentially sensitive to future warming events and environmental change, and highlights the variability in population extinction risk. Future studies will require an integration of functional genetic diversity to phenotypic correlations, genome-wide scans for adaptive outlier loci, transcriptomics, and common garden assays to determine the adaptive potential of populations across a species range. Combining this knowledge with contemporary population structure can yield a powerful framework for forecasting how populations will persist under increasingly stressful conditions.

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### DATA AVAILABILITY STATEMENT

Data for this study are available at https://doi.org/10.5061/ dryad.4b8gtht9v. Sequence data are available at NCBI SRA under BioProject number PRJNA661476.

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#### REFERENCES

- Adams, D. C., Rohlf, J. F., & Slice, D. E. (2004). Geometric morphometrics: Ten years of progress following the 'revolution'. *Italian Journal* of Zoology, 71, 5–16. https://doi.org/10.1080/11250000409356545
- Alexander, D. H., Novembre, J., & Lange, K. (2009). Fast model-based estimation of ancestry in unrelated individuals. *Genome Research*, 19, 1655–1664. https://doi.org/10.1101/gr.094052.109
- Ali, O. A., O'Rourke, S. M., Amish, S. J., Meek, M. H., Gordan, L., Jeffres, C., & Miller, M. R. (2016). RAD Capture (Rapture): Flexible and Efficient Sequence-Based Genotyping. *Genetics*, 202, 389–400. https://doi. org/10.1534/genetics.115.183665
- Barrett, R. D. H., & Schluter, D. (2008). Adaptation from standing genetic variation. *Trends in Ecology & Evolution*, 23, 38–44. https://doi. org/10.1016/j.tree.2007.09.008
- Barton, K. (2018). Package "MuMIn (Version 1.42.1): Multi-Model Inference. Retrieved from https://CRAN.R-project.org/package=MuMIn.
- Basu, N., Todgham, A. E., Ackerman, P. A., Bibeau, M. R., Nakano, K., Schulte, P. M., & Iwama, G. K. (2002). Heat shock protein genes and their functional significance in fish. *Gene*, 295, 173–183. https://doi. org/10.1016/S0378-1119(02)00687-X
- Bates, D., Mächler, M., Bolker, B. M., & Walker, S. C. (2015). Fitting Linear Mixed-Effects Models Using Ime4. *Journal of Statistical Software*, 67, 1–48. https://doi.org/10.18637/jss.v067.i01.
- Bay, R. A., & Palumbi, S. R. (2014). Multilocus Adaptation Associated with Heat Resistance in Reef-Building Corals. *Current Biology*, 24, 2952– 2956. https://doi.org/10.1016/j.cub.2014.10.044
- Becker, D. C., & Genoway, R. G. (1979). Evaluation of the critical thermal maximum for determining thermal tolerance of freshwater fish. *Environmental Biology of Fishes*, 4, 245–256. https://doi.org/10.1007/ BF00005481
- Bell, G., & Collins, S. (2008). Adaptation, extinction and global change. Evolutionary Applications, 1(1), 3–16. https://doi.org/10.1111/j. 1752-4571.2007.00011.x
- Bijlsma, R., & Loeschcke, V. (2012). Genetic erosion impedes adaptive responses to stressful environments. Evolutionary Applications, 5(2), 117–129. https://doi.org/10.1111/j.1752-4571.2011.00214.x
- Blanton, R. E., Cashner, M. F., Thomas, M. R., Brandt, S. L., & Floyd, M. A. (2019). Increased habitat fragmentation leads to isolation among and low genetic diversity within populations of the imperiled Kentucky Arrow Darter (Etheostoma sagitta spilotum). *Conservation Genetics*, 20, 1009–1022. https://doi.org/10.1007/ s10592-019-01188-y
- Blomqvist, D., Pauliny, A., Larsson, M., & Flodin, L.-Å. (2010). Trapped in the extinction vortex? Strong genetic effects in a declining

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vertebrate population. BMC Evolutionary Biology, 10, 33. https://doi. org/10.1186/1471-2148-10-33

- Boer, G. J., McFarlane, N. A., & Lazare, M. (1992). Greenhouse Gas-induced Climate Change Simulated with the CCC Second-Generation General Circulation Model. *Journal of Climate*, 5, 1045-1077. https://doi.org/10.1175/1520-0442(1992)005<1045:GGCCS W>2.0.CO;2
- Bohonak, A. J. (1999). Dispersal, Gene Flow, and Population Structure. The Quarterly Review of Biology, 74, 21–45. https://doi. org/10.1086/392950
- Burkhead, N. M. (2012). Extinction Rates in North American Freshwater Fishes, 1900–2010. *BioScience*, 62, 798–808. https://doi. org/10.1525/bio.2012.62.9.5
- Burnham, K. P., & Anderson, D. R. (2004). Multimodel Inference: Understanding AIC and BIC in Model Selection. *Sociological Methods* & *Research*, 33, 261–304. https://doi.org/10.1177/0049124104 268644
- Camak, D. T., & Piller, K. R. (2018). Going with the Flow: Testing the Role of Habitat Isolation among Three Ecologically Divergent Darter Species. *Copeia*, 106, 375–387. https://doi.org/10.1643/CG-17-623
- Carrara, F., Altermatt, F., Rodriguez-Iturbe, I., & Rinaldo, A. (2012). Dendritic connectivity controls biodiversity patterns in experimental metacommunities. *Proceedings of the National Academy of Sciences*, 109, 5761–5766. https://doi.org/10.1073/pnas.1119651109
- Carrara, F., Rinaldo, A., Giometto, A., & Altermatt, F. (2014). Complex Interaction of Dendritic Connectivity and Hierarchical Patch Size on Biodiversity in River-Like Landscapes. *The American Naturalist*, 183, 13–25. https://doi.org/10.1086/674009
- Catchen, J. M., Amores, A., Hohenlohe, P. A., Cresko, W. A., & Postlethwait, J. H. (2011). Stacks: Building and Genotyping Loci De Novo From Short-Read Sequences. G3: Genes, Genomes, Genetics, 1, 171–182. https://doi.org/10.1534/g3.111.000240
- Catchen, J. M., Hohenlohe, P. A., Bassham, S., Amores, A., & Cresko, W. A. (2013). Stacks: An analysis tool set for population genomics. *Molecular Ecology*, 22, 3124–3140. https://doi.org/10.1111/ mec.12354
- Ceballos, G., Ehrlich, P. R., & Dirzo, R. (2017). Biological annihilation via the ongoing sixth mass extinction signaled by vertebrate population losses and declines. *Proceedings of the National Academy of Sciences*, 114, E6089–E6096. https://doi.org/10.1073/pnas.1704949114
- Chang, C. C., Chow, C. C., Tellier, L. C., Vattikuti, S., Purcell, S. M., & Lee, J. J. (2015). Second-generation PLINK: Rising to the challenge of larger and richer datasets. *GigaScience*, 4, 7. https://doi.org/10.1186/ s13742-015-0047-8
- Charmantier, A., McCleery, R. H., Cole, L. R., Perrins, C., Kruuk, L. E. B., & Sheldon, B. C. (2008). Adaptive Phenotypic Plasticity in Response to Climate Change in a Wild Bird Population. *Science*, *320*, 800–803. https://doi.org/10.1126/science.1157174
- Chen, I.-C., Hill, J. K., Ohlemüller, R., Roy, D. B., & Thomas, C. D. (2011). Rapid Range Shifts of Species Associated with High Levels of Climate Warming. *Science*, 333, 1024–1026. https://doi.org/10.1126/scien ce.1206432
- Collin, H., & Fumagalli, L. (2011). Evidence for morphological and adaptive genetic divergence between lake and stream habitats in European minnows (Phoxinus phoxinus, Cyprinidae). *Molecular Ecology*, 20, 4490–4502. https://doi.org/10.1111/j.1365-294X.2011.05284.x
- Comte, L., Buisson, L., Daufresne, M., & Grenouillet, G. (2013). Climateinduced changes in the distribution of freshwater fish: Observed and predicted trends. *Freshwater Biology*, 58, 625–639. https://doi. org/10.1111/fwb.12081
- Craig, J. F. (2008). Percid fishes: Systematics, ecology and exploitation. John Wiley & Sons.
- Cureton, J. C., & Broughton, R. E. (2014). Rapid morphological divergence of a stream fish in response to changes in water flow. *Biology Letters*, 10, 20140352. https://doi.org/10.1098/rsbl.2014.0352

- Danecek, P., Auton, A., Abecasis, G., Albers, C. A., Banks, E., DePristo, M. A., Handsaker, R. E., Lunter, G., Marth, G. T., Sherry, S. T., McVean, G., & Durbin, R. (2011). The variant call format and VCFtools. *Bioinformatics*, 27, 2156–2158. https://doi.org/10.1093/bioinformatics/btr330
- Daufresne, M., & Boët, P. (2007). Climate change impacts on structure and diversity of fish communities in rivers. *Global Change Biology*, 13, 2467–2478. https://doi.org/10.1111/j.1365-2486.2007.01449.x
- Davis, D. J., Wieman, A. C., & Berendzen, P. B. (2015). The influence of historical and contemporary landscape variables on the spatial genetic structure of the rainbow darter (Etheostoma caeruleum) in tributaries of the upper Mississippi River. *Conservation Genetics*, 16, 167–179. https://doi.org/10.1007/s10592-014-0649-1
- Dayan, D. I., Du, X., Baris, T. Z., Wagner, D. N., Crawford, D. L., & Oleksiak, M. F. (2019). Population genomics of rapid evolution in natural populations: Polygenic selection in response to power station thermal effluents. *BMC Evolutionary Biology*, 19, 61. https://doi.org/10.1186/ s12862-019-1392-5
- DeLong, J. P., Forbes, V. E., Galic, N., Gibert, J. P., Laport, R. G., Phillips, J. S., & Vavra, J. M. (2016). How fast is fast? Eco-evolutionary dynamics and rates of change in populations and phenotypes. *Ecology and Evolution*, 6, 573–581. https://doi.org/10.1002/ece3.1899
- Dirzo, R., Young, H. S., Galetti, M., Ceballos, G., Isaac, N. J. B., & Collen, B. (2014). Defaunation in the Anthropocene. *Science*, 345, 401–406. https://doi.org/10.1126/science.1251817
- Dixo, M., Metzger, J. P., Morgante, J. S., & Zamudio, K. R. (2009). Habitat fragmentation reduces genetic diversity and connectivity among toad populations in the Brazilian Atlantic Coastal Forest. *Biological Conservation*, 142, 1560–1569. https://doi.org/10.1016/j. biocon.2008.11.016
- Dray, S., & Dufour, A.-B. (2007). The ade4 Package: Implementing the Duality Diagram for Ecologists. *Journal of Statistical Software*, 22, 1–20. https://doi.org/10.18637/jss.v022.i04.
- Eaton, J. G., & Scheller, R. M. (1996). Effects of climate warming on fish thermal habitat in streams of the United States. *Limnology* and Oceanography, 41, 1109–1115. https://doi.org/10.4319/ lo.1996.41.5.1109
- Fagan, W. F. (2002). Connectivity, Fragmentation, and Extinction Risk in Dendritic Metapopulations. *Ecology*, 83, 3243–3249. https://doi. org/10.1890/0012-9658(2002)083[3243:CFAERI]2.0.CO;2
- Fagan, W. F., & Holmes, E. E. (2006). Quantifying the extinction vortex. *Ecology Letters*, 9, 51-60. https://doi. org/10.1111/j.1461-0248.2005.00845.x
- Fahrig, L. (2003). Effects of Habitat Fragmentation on Biodiversity. Annual Review of Ecology, Evolution, and Systematics, 34, 487-515. https://doi.org/10.1146/annurev.ecolsys.34.011802.132419
- Feder, M. E., & Hofmann, G. E. (1999). Heat-shock proteins, molecular chaperones, and the stress response: Evolutionary and Ecological Physiology. Annual Review of Physiology, 61, 243–282. https://doi. org/10.1146/annurev.physiol.61.1.243
- Fitzpatrick, S. W., Crockett, H., & Funk, W. C. (2014). Water availability strongly impacts population genetic patterns of an imperiled Great Plains endemic fish. *Conservation Genetics*, 15, 771–788. https://doi. org/10.1007/s10592-014-0577-0
- Fitzpatrick, S. W., & Reid, B. N. (2019). Does gene flow aggravate or alleviate maladaptation to environmental stress in small populations? *Evolutionary Applications*, 12(7), 1402–1416. https://doi.org/10.1111/ eva.12768
- Fluker, B. L., Kuhajda, B. R., Lang, N. J., & Harris, P. M. (2010). Low genetic diversity and small long-term population sizes in the spring endemic watercress darter, Etheostoma nuchale. *Conservation Genetics*, 11, 2267–2279. https://doi.org/10.1007/s1059 2-010-0111-y
- Francis, R. M. (2017). pophelper: An R package and web app to analyse and visualize population structure. *Molecular Ecology Resources*, 17, 27–32. https://doi.org/10.1111/1755-0998.12509

ILEY Evolutionary Applications

- Frankham, R. (1996). Relationship of Genetic Variation to Population Size in Wildlife. *Conservation Biology*, 10, 1500–1508. https://doi.org/10. 1046/j.1523-1739.1996.10061500.x
- Frankham, R. (2005). Stress and adaptation in conservation genetics. Journal of Evolutionary Biology, 18, 750–755. https://doi. org/10.1111/j.1420-9101.2005.00885.x
- Franssen, N. R., Stewart, L. K., & Schaefer, J. F. (2013). Morphological divergence and flow-induced phenotypic plasticity in a native fish from anthropogenically altered stream habitats. *Ecology and Evolution*, *3*, 4648–4657. https://doi.org/10.1002/ece3.842
- Gaggiotti, O. E. (2003). Genetic threats to population persistence. Annales Zoologici Fennici, 40, 155–168.
- Gaston, K. J., & Fuller, R. A. (2008). Commonness, population depletion and conservation biology. *Trends in Ecology & Evolution*, 23, 14–19. https://doi.org/10.1016/j.tree.2007.11.001
- Ghalambor, C. K., McKay, J. K., Carroll, S. P., & Reznick, D. N. (2007). Adaptive versus non-adaptive phenotypic plasticity and the potential for contemporary adaptation in new environments. *Functional Ecology*, 21, 394–407. https://doi.org/10.1111/j.1365-2435.2007.01283.x
- Gibson, G., & Dworkin, I. (2004). Uncovering cryptic genetic variation. Nature Reviews Genetics, 5, 681–690. https://doi.org/10.1038/ nrg1426
- Gienapp, P., Teplitsky, C., Alho, J. S., Mills, J. A., & Merilä, J. (2008). Climate change and evolution: Disentangling environmental and genetic responses. *Molecular Ecology*, 17, 167–178. https://doi. org/10.1111/j.1365-294X.2007.03413.x
- Gomulkiewicz, R., & Holt, R. D. (1995). When Does Evolution by Natural Selection Prevent Extinction? Evolution, 49, 201–207. https://doi. org/10.1111/j.1558-5646.1995.tb05971.x
- Gonzalez, A., Ronce, O., Ferriere, R., & Hochberg, M. E. (2013). Evolutionary rescue: An emerging focus at the intersection between ecology and evolution. *Philosophical Transactions of the Royal Society B: Biological Sciences*, 368, 20120404. https://doi.org/10.1098/ rstb.2012.0404
- Guill, M. J., Hood, C. S., & Heins, D. C. (2003). Body shape variation within and among three species of darters (Perciformes: Percidae). *Ecology of Freshwater Fish*, 12, 134–140. https://doi. org/10.1034/j.1600-0633.2003.00008.x
- Hansen, M. M., Olivieri, I., Waller, D. M., & Nielsen, E. E. (2012). Monitoring adaptive genetic responses to environmental change. *Molecular Ecology*, 21, 1311–1329. https://doi. org/10.1111/j.1365-294X.2011.05463.x
- Haponski, A. E., Bollin, T. L., Jedlicka, M. A., & Stepien, C. A. (2009). Landscape genetic patterns of the rainbow darter Etheostoma caeruleum: A catchment analysis of mitochondrial DNA sequences and nuclear microsatellites. *Journal of Fish Biology*, 75, 2244–2268. https://doi.org/10.1111/j.1095-8649.2009.02414.x
- Healy, T. M., & Schulte, P. M. (2012). Factors affecting plasticity in whole-organism thermal tolerance in common killifish (Fundulus heteroclitus). *Journal of Comparative Physiology B*, 182, 49–62. https:// doi.org/10.1007/s00360-011-0595-x
- Helbib, M., Urbaek, S., & SFellows, I.. (2013). Package "JGR" (Version 1.7): Java GUI for R. Retrieved from https://CRAN.R-project.org/package=JGR.
- Hendry, A. P., Taylor, E. B., & McPhail, J. D. (2002). Adaptive Divergence and the Balance Between Selection and Gene Flow: Lake and Stream Stickleback in the Misty System. *Evolution*, *56*, 1199–1216. https:// doi.org/10.1111/j.0014-3820.2002.tb01432.x
- Hicks, K. A., & Servos, M. R. (2017). Site fidelity and movement of a small-bodied fish species, the rainbow darter (Etheostoma caeruleum): Implications for environmental effects assessment. *River Research and Applications*, 33, 1016–1025. https://doi.org/10.1002/ rra.3161
- Hlohowskyj, I., & Wissing, T. E. (1985). Seasonal changes in the critical thermal maxima of fantail (Etheostoma flabellare), greenside (Etheostoma blennioides), and rainbow (Etheostoma caeruleum)

darters. Canadian Journal of Zoology, 63, 1629-1633. https://doi. org/10.1139/z85-241

- Hobbs, R. J., & Mooney, H. A. (1998). Broadening the Extinction Debate: Population Deletions and Additions in California and Western Australia. *Conservation Biology*, 12, 271–283. https://doi. org/10.1111/j.1523-1739.1998.96233.x
- Hoffman, J. I., Simpson, F., David, P., Rijks, J. M., Kuiken, T., Thorne, M. A. S., Lacy, R. C., & Dasmahapatra, K. K. (2014). High-throughput sequencing reveals inbreeding depression in a natural population. *Proceedings of the National Academy of Sciences*, 111(10), 3775–3780. https://doi.org/10.1073/pnas.1318945111
- Hoffmann, A. A., & Sgrò, C. M. (2011). Climate change and evolutionary adaptation. Nature, 470, 479–485. https://doi.org/10.1038/nature09670
- Iwama, G. K., Thomas, P. T., Forsyth, R. B., & Vijayan, M. M. (1998). Heat shock protein expression in fish. *Reviews in Fish Biology and Fisheries*, 8, 35–56. https://doi.org/10.1023/A:1008812500650
- Jakobsson, M., & Rosenberg, N. A. (2007). CLUMPP: A cluster matching and permutation program for dealing with label switching and multimodality in analysis of population structure. *Bioinformatics*, 23, 1801–1806. https://doi.org/10.1093/bioinformatics/btm233
- Jelks, H. L., Walsh, S. J., Burkhead, N. M., Contreras-Balderas, S., Diaz-Pardo, E., Hendrickson, D. A., Lyons, J., Mandrak, N. E., McCormick, F., Nelson, J. S., Platania, S. P., Porter, B. A., Renaud, C. B., Schmitter-Soto, J. J., Taylor, E. B., & Warren, M. L. Jr. (2008). Conservation Status of Imperiled North American Freshwater and Diadromous Fishes. *Fisheries*, 33, 372–407. https://doi. org/10.1577/1548-8446-33.8.372
- Jombart, T. (2008). adegenet: A R package for the multivariate analysis of genetic markers. *Bioinformatics*, 24, 1403–1405. https://doi. org/10.1093/bioinformatics/btn129
- Jombart, T., & Ahmed, I. (2011). adegenet 1.3-1: New tools for the analysis of genome-wide SNP data. *Bioinformatics*, 27, 3070–3071. https:// doi.org/10.1093/bioinformatics/btr521
- Kalinowski, S. T., Meeuwig, M. H., Narum, S. R., & Taper, M. L. (2008). Stream trees: A statistical method for mapping genetic differences between populations of freshwater organisms to the sections of streams that connect them. *Canadian Journal of Fisheries and Aquatic Sciences*, 65, 2752–2760. https://doi.org/10.1139/F08-171
- Katula, R. (2013). The Phalen Enigma: Rainbow Darters in a Lake? American Currents, 38, 18–21.
- Kelly, M. (2019). Adaptation to climate change through genetic accommodation and assimilation of plastic phenotypes. *Philosophical Transactions of the Royal Society B: Biological Sciences*, 374, 20180176. https://doi.org/10.1098/rstb.2018.0176
- Kinnison, M. T., & Hairston, N. G. (2007). Eco-evolutionary conservation biology: Contemporary evolution and the dynamics of persistence. *Functional Ecology*, 21, 444–454. https://doi. org/10.1111/j.1365-2435.2007.01278.x
- Kitano, J., Bolnick, D. I., Beauchamp, D. A., Mazur, M. M., Mori, S., Nakano, T., & Peichel, C. L. (2008). Reverse Evolution of Armor Plates in the Threespine Stickleback. *Current Biology*, 18, 769–774. https:// doi.org/10.1016/j.cub.2008.04.027
- Klerks, P. L., Athrey, G. N., & Leberg, P. L. (2019). Response to Selection for Increased Heat Tolerance in a Small Fish Species, With the Response Decreased by a Population Bottleneck. *Frontiers in Ecology and Evolution*, 7, 10. https://doi.org/10.3389/ fevo.2019.00270
- Klingenberg, C. P. (2011). MorphoJ: An integrated software package for geometric morphometrics. *Molecular Ecology Resources*, 11, 353–357. https://doi.org/10.1111/j.1755-0998.2010.02924.x
- Krabbenhoft, T. J., Collyer, M. L., & Quattro, J. M. (2009). Differing evolutionary patterns underlie convergence on elongate morphology in endemic fishes of Lake Waccamaw, North Carolina. *Biological Journal of the Linnean Society*, *98*, 636–645. https://doi. org/10.1111/j.1095-8312.2009.01305.x

- Kuehne, R. A., & Barbour, R. W. (1983). The American darters. University Press of Kentucky.
- Lande, R. (1976). Natural Selection and Random Genetic Drift in Phenotypic Evolution. Evolution, 30, 314–334. https://doi. org/10.1111/j.1558-5646.1976.tb00911.x
- Lande, R., & Shannon, S. (1996). The Role of Genetic Variation in Adaptation and Population Persistence in a Changing Environment. *Evolution*, 50, 434–437. https://doi.org/10.1111/j.1558-5646.1996. tb04504.x
- Landy, J. A., & Travis, J. (2015). Shape variation in the least killifish: Ecological associations of phenotypic variation and the effects of a common garden. *Ecology and Evolution*, 5, 5616–5631. https://doi. org/10.1002/ece3.1780
- Langerhans, R. B. (2008). Predictability of phenotypic differentiation across flow regimes in fishes. *Integrative and Comparative Biology*, 48, 750–768. https://doi.org/10.1093/icb/icn092
- Lemopoulos, A., Prokkola, J. M., Uusi-Heikkilä, S., Vasemägi, A., Huusko, A., Hyvärinen, P., Koljonen, M.-L., Koskiniemi, J., & Vainikka, A. (2019). Comparing RADseq and microsatellites for estimating genetic diversity and relatedness–Implications for brown trout conservation. *Ecology and Evolution*, *9*, 2106–2120. https://doi.org/10.1002/ ece3.4905
- Lenth, R., Singmann, H., Love, J., Buerknerazur, P., & Herve, M. (2018). Package "emmeans" (Version 1.3.1): Estimated Marginal Means, aka Least-Square Means. Retrieved from https://CRAN.R-project.org/ package=emmeans.
- Li, H. (2013). Aligning sequence reads, clone sequences and assembly contigs with BWA-MEM. arXiv preprint. arXiv:1303.3997.
- Lischer, H. E. L., & Excoffier, L. (2012). PGDSpider: An automated data conversion tool for connecting population genetics and genomics programs. *Bioinformatics*, 28, 298–299. https://doi.org/10.1093/ bioinformatics/btr642
- Lutterschmidt, W. I., & Hutchison, V. H. (1997). The critical thermal maximum: History and critique. *Canadian Journal of Zoology*, 75, 1561– 1574. https://doi.org/10.1139/z97-783
- MacGuigan, D. J., & Near, T. J. (2019). Phylogenomic Signatures of Ancient Introgression in a Rogue Lineage of Darters (Teleostei: Percidae). Systematic Biology, 68, 329–346. https://doi.org/10.1093/ sysbio/syy074
- Mantyka-Pringle, C. S., Martin, T. G., Moffatt, D. B., Linke, S., & Rhodes, J. R. (2014). Understanding and predicting the combined effects of climate change and land-use change on freshwater macroinvertebrates and fish. *Journal of Applied Ecology*, *51*, 572–581. https://doi. org/10.1111/1365-2664.12236
- Massot, M., Clobert, J., & Ferrière, R. (2008). Climate warming, dispersal inhibition and extinction risk. *Global Change Biology*, 14, 461–469. https://doi.org/10.1111/j.1365-2486.2007.01514.x
- McCallum, M. L. (2015). Vertebrate biodiversity losses point to a sixth mass extinction. *Biodiversity and Conservation*, 24, 2497–2519. https://doi.org/10.1007/s10531-015-0940-6
- McGuigan, K., Franklin, C. E., Moritz, C., & Blows, M. W. (2003).
  Adaptation of Rainbow Fish to Lake and Stream Habitats. *Evolution*, 57, 104–118. https://doi.org/10.1111/j.0014-3820.2003.tb002 19.x
- Meffe, G. K., Weeks, S. C., Mulvey, M., & Kandl, K. L. (1995). Genetic differences in thermal tolerance of eastern mosqyitofish (Gambusia holbrooki; Poeciliidae) from ambient and thermal ponds. *Canadian Journal of Fisheries and Aquatic Sciences*, 52, 2704–2711. https://doi. org/10.1139/f95-259
- Mendelson, T. C. (2003). Sexual Isolation Evolves Faster Than Hybrid Inviability in a Diverse and Sexually Dimorphic Genus of Fish (percidae: Etheostoma). Evolution, 57, 317–327. https://doi. org/10.1111/j.0014-3820.2003.tb00266.x
- Mendelson, T. C., Imhoff, V. E., & Venditti, J. J. (2007). The Accumulation of Reproductive Barriers During Speciation: Postmating

Barriers in Two Behaviorally Isolated Species of Darters (percidae: Etheostoma). *Evolution*, *61*, 2596–2606. https://doi. org/10.1111/j.1558-5646.2007.00220.x

- Meyer, J. L., Strayer, D. L., Wallace, J. B., Eggert, S. L., Helfman, G. S., & Leonard, N. E. (2007). The Contribution of Headwater Streams to Biodiversity in River Networks. *Journal of the American Water Resources Association*, 43, 86–103. https://doi.org/10.1111/j.1752-1688.2007.00008.x
- Meyers, P. J., & Belk, M. C. (2014). Shape variation in a benthic stream fish across flow regimes. *Hydrobiologia*, 738, 147–154. https://doi. org/10.1007/s10750-014-1926-1
- Miller, J. M., Malenfant, R. M., David, P., Davis, C. S., Poissant, J., Hogg, J. T., Festa-Bianchet, M., & Coltman, D. W. (2014). Estimating genome-wide heterozygosity: Effects of demographic history and marker type. *Heredity*, 112, 240–247. https://doi.org/10.1038/hdy.2013.99
- Moore, J. S., & Hendry, A. P. (2005). Both selection and gene flow are necessary to explain adaptive divergence: Evidence from clinal variation in stream stickleback. *Evolutionary Ecology Research*, 7, 871–886.
- Moran, R. L., Catchen, J. M., & Fuller, R. C. (2019). Genomic resources for darters (Percidae: Etheostominae) provide insight into postzygotic barriers implicated in speciation. *Molecular Biology and Evolution*, 37, 711–729. https://doi.org/10.1093/molbev/msz260
- Moser, D., Roesti, M., & Berner, D. (2012). Repeated Lake-Stream Divergence in Stickleback Life History within a Central European Lake Basin. *PLoS One*, 7, e50620. https://doi.org/10.1371/journ al.pone.0050620
- Narum, S. R., & Campbell, N. R. (2015). Transcriptomic response to heat stress among ecologically divergent populations of redband trout. BMC Genomics, 16, 103. https://doi.org/10.1186/s12864-015-1246-5
- Near, T. J., Bossu, C. M., Bradburd, G. S., Carlson, R. L., Harrington, R. C., Hollingsworth, P. R., Keck, B. P., & Etnier, D. A. (2011). Phylogeny and Temporal Diversification of Darters (Percidae: Etheostomatinae). *Systematic Biology*, 60, 565–595. https://doi.org/10.1093/sysbio/ syr052
- Norberg, J., Urban, M. C., Vellend, M., Klausmeier, C. A., & Loeuille, N. (2012). Eco-evolutionary responses of biodiversity to climate change. *Nature Climate Change*, 2, 747–751. https://doi.org/10.1038/ nclimate1588
- Nussey, D. H., Postma, E., Gienapp, P., & Visser, M. E. (2005). Selection on Heritable Phenotypic Plasticity in a Wild Bird Population. *Science*, 310, 304–306. https://doi.org/10.1126/science.1117004
- Oksala, N. K. J., Ekmekçi, F. G., Özsoy, E., Kirankaya, Ş., Kokkola, T., Emecen, G., Lappalainen, J., Kaarniranta, K., & Atalay, M. (2014). Natural thermal adaptation increases heat shock protein levels and decreases oxidative stress. *Redox Biology*, *3*, 25–28. https://doi. org/10.1016/j.redox.2014.10.003
- Paaby, A. B., & Rockman, M. V. (2014). Cryptic genetic variation: Evolution's hidden substrate. *Nature Reviews Genetics*, 15, 247–258. https://doi.org/10.1038/nrg3688
- Parmesan, C., Ryrholm, N., Stefanescu, C., Hill, J. K., Thomas, C. D., Descimon, H., Huntley, B., Kaila, L., Kullberg, J., Tammaru, T., Tennent, W. J., Thomas, J. A., & Warren, M. (1999). Poleward shifts in geographical ranges of butterfly species associated with regional warming. *Nature*, 399, 579–583. https://doi.org/10.1038/21181
- Paz-Vinas, I., & Blanchet, S. (2015). Dendritic connectivity shapes spatial patterns of genetic diversity: A simulation-based study. *Journal* of Evolutionary Biology, 28, 986–994. https://doi.org/10.1111/ jeb.12626
- Phillips, B. L., & Shine, R. (2006). An invasive species induces rapid adaptive change in a native predator: Cane toads and black snakes in Australia. Proceedings of the Royal Society B: Biological Sciences, 273, 1545–1550. https://doi.org/10.1098/rspb.2006.3479
- Pigliucci, M. (2005). Evolution of phenotypic plasticity: Where are we going now? Trends in Ecology & Evolution, 20, 481–486. https://doi. org/10.1016/j.tree.2005.06.001

-WILEY-Evolutionary Ap

- Pigliucci, M., Murren, C. J., & Schlichting, C. D. (2006). Phenotypic plasticity and evolution by genetic assimilation. *Journal of Experimental Biology*, 209, 2362–2367. https://doi.org/10.1242/jeb.02070
- R Core Team (2018). R: A language and environment for statistical computing. R Foundation for Statistical Computing. Vienna, Austria. https:// www.R-project.org/.
- Ravinet, M., Prodöhl, P. A., & Harrod, C. (2013). Parallel and nonparallel ecological, morphological and genetic divergence in lake-stream stickleback from a single catchment. *Journal of Evolutionary Biology*, 26, 186–204. https://doi.org/10.1111/jeb.12049
- Ray, J. M., Wood, R. M., & Simons, A. M. (2006). Phylogeography and post-glacial colonization patterns of the rainbow darter, Etheostoma caeruleum (Teleostei: Percidae). *Journal of Biogeography*, 33, 1550– 1558. https://doi.org/10.1111/j.1365-2699.2006.01540.x
- Reed, D. H., & Frankham, R. (2003). Correlation between Fitness and Genetic Diversity. *Conservation Biology*, 17, 230–237. https://doi. org/10.1046/j.1523-1739.2003.01236.x
- Reed, T. E., Schindler, D. E., & Waples, R. S. (2011). Interacting Effects of Phenotypic Plasticity and Evolution on Population Persistence in a Changing Climate. *Conservation Biology*, 25, 56–63. https://doi. org/10.1111/j.1523-1739.2010.01552.x
- Reed, T. E., Waples, R. S., Schindler, D. E., Hard, J. J., & Kinnison, M. T. (2010). Phenotypic plasticity and population viability: The importance of environmental predictability. *Proceedings of the Royal Society B: Biological Sciences*, 277, 3391–3400. https://doi.org/10.1098/ rspb.2010.0771
- Rocha, F. B., & Klaczko, L. B. (2016). Untangling the Components of Phenotypic Plasticity in Nonlinear Reaction Norms of Drosophila Mediopunctata Pigmentation. *BioRxiv*, 070599.https://doi. org/10.1101/070599
- Rochette, N. C., Rivera-Colón, A. G., & Catchen, J. M. (2019). Stacks 2: Analytical methods for paired-end sequencing improve RADseqbased population genomics. *Molecular Ecology*, 28, 4737–4754. https://doi.org/10.1111/mec.15253
- Rohlf, J. F. (2017). TpsDig2 (Version 2.3). Retrieved from https://life.bio. sunysb.edu/morph/soft-dataacq.html.
- Rohlf, J. F. (2018). *TpsUtil (Version 1.76)*. Retrieved from https://life.bio. sunysb.edu/morph/soft-utility.html.
- Rose, N. H., Bay, R. A., Morikawa, M. K., & Palumbi, S. R. (2018). Polygenic evolution drives species divergence and climate adaptation in corals. *Evolution*, 72, 82–94. https://doi.org/10.1111/evo.13385
- Saint-Laurent, R., Legault, M., & Bernatchez, L. (2003). Divergent selection maintains adaptive differentiation despite high gene flow between sympatric rainbow smelt ecotypes (Osmerus mordax Mitchill). *Molecular Ecology*, 12, 315-330. https://doi. org/10.1046/j.1365-294X.2003.01735.x
- Schaefer, J., & Ryan, A. (2006). Developmental plasticity in the thermal tolerance of zebrafish Danio rerio. *Journal of Fish Biology*, 69, 722– 734. https://doi.org/10.1111/j.1095-8649.2006.01145.x
- Scheiner, S. M. (1993). Genetics and Evolution of Phenotypic Plasticity. Annual Review of Ecology and Systematics, 24, 35–68. https://doi. org/10.1146/annurev.es.24.110193.000343
- Sexton, J. P., Hangartner, S. B., & Hoffmann, A. A. (2014). Genetic isolation by environment or distance: which pattern of gene flow is most common? Evolution, 68, 1–15. https://doi.org/10.1111/evo.12258
- Sharpe, D. M. T., Räsänen, K., Berner, D., & Hendry, A. P. (2008). Genetic and environmental contributions to the morphology of lake and stream stickleback: Implications for gene flow and reproductive isolation. Evolutionary Ecology Research, 10, 849–866.
- Slatkin, M. (1987). Gene flow and the geographic structure of natural populations. *Science*, 236, 787–792. https://doi.org/10.1126/scien ce.3576198
- Sultan, S. E., & Spencer, H. G. (2002). Metapopulation Structure Favors Plasticity over Local Adaptation. *The American Naturalist*, 160, 271– 283. https://doi.org/10.1086/341015

- Thomas, C. D., Cameron, A., Green, R. E., Bakkenes, M., Beaumont, L. J., Collingham, Y. C., Erasmus, B. F. N., de Siqueira, M. F., Grainger, A., Hannah, L., Hughes, L., Huntley, B., van Jaarsveld, A. S., Midgley, G. F., Miles, L., Ortega-Huerta, M. A., Peterson, A. T., Phillips, O. L., & Williams, S. E. (2004). Extinction risk from climate change. *Nature*, 427, 145–148. https://doi.org/10.1038/nature02121
- Thompson, J. N. (1998). Rapid evolution as an ecological process. Trends in Ecology & Evolution, 13, 329–332. https://doi.org/10.1016/S0169 -5347(98)01378-0
- Thornton, P. E., Thornton, M. M., Mayer, B. W., Wei, Y., Devarakonda, R., Vose, R. S., & Cook, R. B. (2018). Daymet: Daily Surface Weather Data on a 1-km Grid for North America, Version 3. ORNL DAAC, Oak Ridge, Tennessee, United States. https://doi.org/10.3334/ORNLDAAC/1328
- Tigano, A., & Friesen, V. L. (2016). Genomics of local adaptation with gene flow. *Molecular Ecology*, 25, 2144–2164. https://doi.org/10.1111/ mec.13606
- van Vliet, M. T. H., Franssen, W. H. P., Yearsley, J. R., Ludwig, F., Haddeland, I., Lettenmaier, D. P., & Kabat, P. (2013). Global river discharge and water temperature under climate change. *Global Environmental Change*, 23, 450–464. https://doi.org/10.1016/j.gloen vcha.2012.11.002
- van Vliet, M. T. H., Yearsley, J. R., Ludwig, F., Vögele, S., Lettenmaier, D. P., & Kabat, P. (2012). Vulnerability of US and European electricity supply to climate change. *Nature Climate Change*, *2*, 676–681. https:// doi.org/10.1038/nclimate1546
- Wang, I. J., & Bradburd, G. S. (2014). Isolation by environment. *Molecular Ecology*, 23, 5649–5662. https://doi.org/10.1111/mec.12938
- Washburn, B. A., Cashner, M. F., & Blanton, R. E. (2020). Small fish, large river: Surprisingly minimal genetic structure in a dispersal-limited, habitat specialist fish. *Ecology and Evolution*, 10, 2253–2268. https:// doi.org/10.1002/ece3.6064
- Wilcox, B. A., & Murphy, D. D. (1985). Conservation Strategy: The Effects of Fragmentation on Extinction. *The American Naturalist*, 125, 879– 887. https://doi.org/10.1086/284386
- Willi, Y., & Hoffmann, A. A. (2009). Demographic factors and genetic variation influence population persistence under environmental change. *Journal of Evolutionary Biology*, 22, 124–133. https://doi. org/10.1111/j.1420-9101.2008.01631.x
- Willi, Y., Van Buskirk, J., & Hoffmann, A. A. (2006). Limits to the Adaptive Potential of Small Populations. Annual Review of Ecology, Evolution, and Systematics, 37, 433–458. https://doi.org/10.1146/annurev.ecols ys.37.091305.110145
- Yates, M. C., Bowles, E., & Fraser, D. J. (2019). Small population size and low genomic diversity have no effect on fitness in experimental translocations of a wild fish. Proceedings of the Royal Society B: Biological Sciences, 286, 20191989. https://doi.org/10.1098/rspb.2019.1989
- Young, H. S., McCauley, D. J., Galetti, M., & Dirzo, R. (2016). Patterns, Causes, and Consequences of Anthropocene Defaunation. Annual Review of Ecology, Evolution, and Systematics, 47, 333–358. https:// doi.org/10.1146/annurev-ecolsys-112414-054142

#### SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section.

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