

# How Veeries vary: Whole genome sequencing resolves genetic structure in a long-distance migratory bird

Abigail A. Kimmitt,<sup>1</sup> Teresa M. Pegan,<sup>1</sup> Andrew W. Jones,<sup>2, #</sup> Kevin Winker,<sup>3</sup> and Benjamin M. Winger<sup>1, \*</sup>

<sup>1</sup>Department of Ecology and Evolutionary Biology and Museum of Zoology, University of Michigan, Ann Arbor, Michigan, USA

<sup>2</sup>Department of Ornithology, Cleveland Museum of Natural History, Cleveland, Ohio, USA

<sup>3</sup>University of Alaska Museum, Fairbanks Alaska, USA

\*Current Address: Spring Island Trust, Okatie, South Carolina, USA

\*Corresponding author: [wingerb@umich.edu](mailto:wingerb@umich.edu)

## ABSTRACT

In high-latitude species with high dispersal ability, such as long-distance migratory birds, populations are often assumed to exhibit little genetic structure due to high gene flow or recent postglacial expansion. We sequenced over 120 low-coverage whole genomes from across the breeding range of a long-distance migratory bird, the Veery (*Catharus fuscescens*), revealing strong evidence for isolation by distance. Additionally, we found distinct genetic structure between boreal, western montane U.S., and southern Appalachian sampling regions. We suggest that population genetic structure in this highly migratory species is detectable with the high resolution afforded by whole-genomic data because, similar to many migratory birds, the Veery exhibits high breeding-site fidelity, which likely limits gene flow. Resolution of isolation by distance across the breeding range was sufficient to assign likely breeding origins of individuals sampled in this species' poorly understood South American nonbreeding range, demonstrating the potential to assess migratory connectivity in this species using genomic data. As the Veery's breeding range extends across both historically glaciated and unglaciated regions in North America, we also evaluated whether contemporary patterns of structure and genetic diversity are consistent with historical population isolation in glacial refugia. We found that patterns of genetic diversity did not support southern montane regions (southern Appalachians or western U.S. mountains) as glacial refugia. Overall, our findings suggest that isolation by distance yields subtle associations between genetic structure and geography across the breeding range of this highly vagile species even in the absence of obvious historical vicariance or contemporary barriers to dispersal.

**Keywords:** genetic diversity, isolation by distance, migratory birds, phylogeography, population structure, site fidelity

## How to Cite

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## LAY SUMMARY

- Describing how populations in a species differ genetically is important for understanding that species' evolutionary history.
- Migratory birds have high dispersal abilities, potentially reducing genetic structure. However, many migratory birds return to the same breeding site year after year, which could reduce gene flow between populations.
- We sequenced >120 genomes to detect population genetic differentiation in a common songbird, the Veery (*Catharus fuscescens*).
- We found that genetic similarity between samples decreased with increasing geographic distance (i.e., isolation by distance) and that populations in southern Appalachia were distinct from samples in the rest of the breeding range.
- We did not detect differences in genetic diversity patterns between populations, contrary to predictions about putative glacial refugia.
- We assigned likely geographic breeding region to birds sampled in the poorly understood wintering range.
- Despite the Veery's long-distance migration and high dispersal ability, isolation by distance produces subtle but detectable population structure across its breeding range.

## Cómo varía *Catharus fuscescens*: la secuenciación completa del genoma resuelve la estructura genética en un ave migratoria de larga distancia

## RESUMEN

En especies de latitudes altas con elevada capacidad de dispersión, como las aves migratorias de larga distancia, a menudo se asume que las poblaciones exhiben poca estructura genética debido al alto flujo génico o a la reciente expansión post-glaciar. Secuenciamos

más de 120 genomas completos de baja cobertura en todo el rango de cría de un ave migratoria de larga distancia, *Catharus fuscescens*, revelando fuertes evidencias de aislamiento por distancia. Además, encontramos una estructura genética distintiva entre las regiones de muestreo boreales, las montañas del oeste de EEUU y los Montes Apalaches del sur. Sugerimos que la estructura genética poblacional en esta especie altamente migratoria es detectable por la alta resolución que proporcionan los datos genómicos completos porque, al igual que muchas aves migratorias, *C. fuscescens* muestra una alta fidelidad al sitio de cría, lo que probablemente limita el flujo génico. La resolución del aislamiento por distancia en todo el rango de cría fue suficiente para asignar los probables orígenes de cría de individuos muestreados en el rango no reproductivo –y poco conocido– de esta especie en Sudamérica, demostrando el potencial para evaluar la conectividad migratoria en esta especie utilizando datos genómicos. Dado que el rango de cría de *C. fuscescens* se extiende por regiones históricamente con y sin glaciares en América del Norte, también evaluamos si los patrones contemporáneos de estructura y diversidad genética son consistentes con el aislamiento poblacional histórico en refugios glaciares. Encontramos que los patrones de diversidad genética no respaldaban a las regiones montañosas del sur (Montes Apalaches del sur o montañas del oeste de EEUU) como refugios glaciares. En general, nuestros hallazgos sugieren que el aislamiento por distancia produce asociaciones sutiles entre la estructura genética y la geografía en todo el rango de cría de esta especie altamente móvil, incluso en ausencia de vicarianzas históricas obvias o de barreras contemporáneas para la dispersión.

**Palabras clave:** aislamiento por distancia, aves migratorias, diversidad genética, estructura poblacional, fidelidad al sitio, filogeografía

## INTRODUCTION

Resolving genetic population structure in wild populations is important for understanding a species' spatial and demographic evolutionary history as well as identifying microevolutionary processes underlying adaptation and population differentiation (Manel *et al.* 2003, Edwards *et al.* 2015, Lou *et al.* 2021). For species with high dispersal ability, however, resolving spatial genetic structure can be particularly challenging, as greater dispersal capabilities are associated with higher gene flow and minimal genetic structure (Slatkin 1987, Bohonak 1999, Claramunt *et al.* 2012, Medina *et al.* 2018). Seasonally migratory species, which often travel long distances between breeding and wintering grounds each year, are typically considered to have high dispersal, as their vagility should reduce the impact of geographic barriers on dispersal-related movements (Paradis *et al.* 1998, Medina *et al.* 2018, Everson *et al.* 2019, Claramunt 2021). Yet, in many bird species, long-distance seasonal migration is associated with limited dispersal between breeding sites, as adult migratory birds frequently exhibit high interannual fidelity to their breeding sites (Winger *et al.* 2019). Natal dispersal patterns, however, remain poorly understood in small-bodied migratory birds. Breeding site fidelity and natal philopatry have the potential to limit gene flow across the breeding range, such that long-distance migrants could still exhibit genetic structure or isolation by distance despite their long seasonal journeys and high dispersal potential. Here, we combine thorough range-wide geographic sampling with whole-genome sequencing to investigate whether genetic structure can be resolved in the Veery (*Catharus fuscescens*), a Nearctic–Neotropical long-distance migratory songbird.

The Veery is an ideal species to test for the presence of spatial genetic structure in migratory birds, given its long-distance migrations and high adult breeding site fidelity (Outlaw *et al.* 2003, Heckscher *et al.* 2011, Hobson and Kardynal 2015). The Veery breeds across wet forested habitats of the boreal and the temperate-boreal transition (“hemiboreal”) belt, coastal forests of the northeastern U.S. and Canada, the Appalachian Mountains, and riparian canyons in the mountains of western North America (Heckscher *et al.* 2020; Figure 1). Previous work has delineated five phenotypic subspecies based on subtle geographic breeding population differences in plumage coloration (Phillips 1991, Pyle 1997), but concordance between genetic data and subspecific designation has not been evaluated.

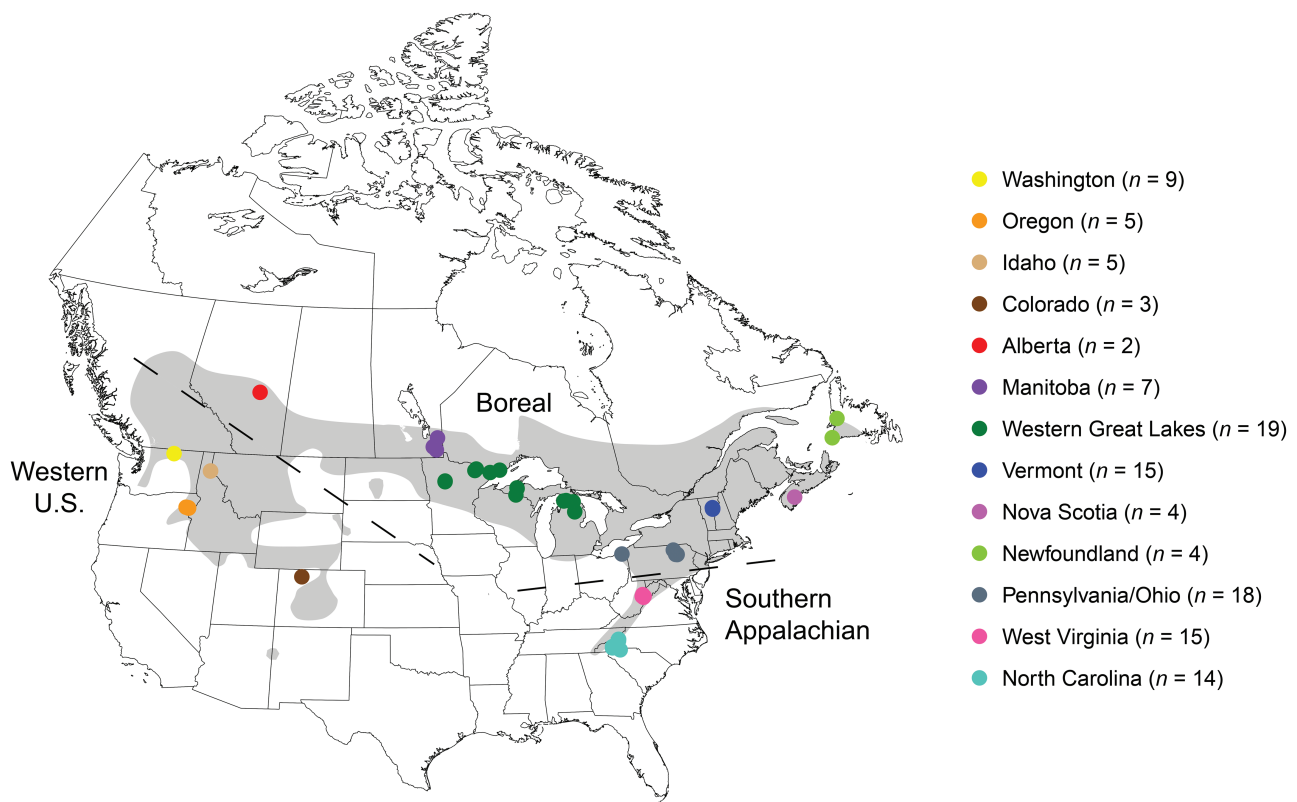
Contemporary breeding ranges of long-distance migratory birds, such as the Veery, are typically found at mid or high latitudes, such that Pleistocene glacial cycles presumably

forced populations into fragmented habitat when ice sheets advanced (Hewitt 2004, Svenning *et al.* 2015). Isolation of populations in putative glacial refugia is thought to have generated discrete population structure that is detectable in contemporary populations through measures of genetic diversity and heterozygosity (Bohonak 1999, Weir and Schluter 2004). Indeed, this pattern has been observed in several North American migratory bird species with molecularly distinct populations (e.g., Rugg and Smith 2002, Barrowclough *et al.* 2004, Milá *et al.* 2007, Spellman and Klicka 2007, Manthey *et al.* 2011, van Els *et al.* 2012, Winker *et al.* 2023). Molecular signatures in multiple North American bird species have supported several glacial refugia—which might also have been occupied by the Veery—including south of the glaciers to the east (e.g., southern Appalachian Mountains) and west (e.g., southern Rocky Mountains), and offshore of Newfoundland (e.g., Grand Banks) (Hewitt 2004, Soltis *et al.* 2006).

Here, we employ range-wide genomic sampling to test patterns of genetic differentiation and diversity across the species' range and evaluate the phylogeographic history of the species. The only previous phylogeographic work on this species evaluated mitochondrial differentiation between the eastern and western extremes of the breeding range (Newfoundland vs. Washington), identifying subtle but distinct genetic differentiation (Topp *et al.* 2013). In this study, we use range-wide sampling and low-coverage whole genome-sequencing (lcWGS) to investigate subtle patterns of spatial genetic differentiation and evaluate the concordance of phenotypic subspecies descriptions with patterns of genetic differentiation. The development of cost-effective lcWGS allows inference based on orders of magnitude more loci than reduced representation genome sequencing (Lou *et al.* 2021), which might facilitate detection of subtle genetic patterns not otherwise evident (Novembre *et al.* 2008).

We also assessed contemporary genetic structure across the breeding range in light of historic processes associated with geographic isolation in different refugia versus population expansion from a single glacial refugium (Le Corre and Kremer 1998, Mimura and Aitken 2007, Meirmans 2012, Westram *et al.* 2013, Wahlsteen *et al.* 2023). If southern Appalachia and the western regions were historic glacial refugia for the Veery, we predict higher nucleotide diversity and heterozygosity in these populations given their likely long-term population stability as source populations for an expansion into post-glacial higher latitude habitat.

Given that we produced the first detailed phylogeographic study of this species, an additional goal of our study was to use samples from the winter range to identify nonbreeding birds' breeding population of origin. The nonbreeding distribution



**FIGURE 1.** Map of sampling locations for the Veery (*Catharus fuscescens*) in North America. The approximate breeding range is highlighted in light gray (BirdLife International). Each point represents an individual, but in some cases, multiple individuals were collected from the same location, such that points are overlapping. Dotted lines indicate approximate boundaries of the western U.S., boreal, and southern Appalachian populations identified by clustering analyses (Figure 2). Four individuals sampled on their wintering grounds are not included in the map but were sampled in the Amazon Basin in Bolivia and Paraguay in October–November.

of this species, which occurs entirely within South America, is poorly understood (Remsen Jr 2001, Heckscher *et al.* 2020). Veeries are known to exhibit intra-tropical movements during the overwintering period, as observed from geolocation data from populations breeding in Delaware (Heckscher *et al.* 2011) and British Columbia (Hobson and Kardynal 2015). Individuals spend the early portion of the northern winter in the Amazon basin south of the Amazon River in November–December, before moving northwest to a second wintering site likely in response to seasonal flooding patterns (Heckscher *et al.* 2011, 2015, Hobson and Kardynal 2015). With limited tracking data available, assessing migratory connectivity between breeding and nonbreeding ranges remains a challenge but is critical for identifying the ecological and conservation links between stages in the annual cycle (Webster *et al.* 2002, Ambrosini *et al.* 2019). Therefore, we used our data to determine whether breeding origin can be identified for wintering samples given genetic differentiation across the breeding range. Through this analysis, we tested the utility of our breeding grounds dataset for use in future research centered around migratory connectivity in this species and its poorly understood nonbreeding distributions.

## METHODS

### Study System and Sampling

We used 121 frozen or ethanol-preserved *C. fuscescens* tissue samples from our institutions' museum collections

or provided by other museum collections (Figure 1; Supplementary Material Table S1). We also included 3 blood samples from Newfoundland provided by the New York State Museum (Figure 1; Supplementary Material Table S1). Fieldwork by the authors was approved by our Institutional Animal Care and Use Committees and all relevant permitting authorities (see Acknowledgments). All samples were collected during the breeding season, except for 4 individuals that were collected on their wintering grounds in South America in October–November (Bolivia:  $n = 3$ , Paraguay:  $n = 1$ ; hereafter, “nonbreeding birds”) that we included to assess migratory connectivity. Our sample size for nonbreeding birds is small but includes most nonbreeding tissue samples available in North American museum collections. Specifically, these samples represent four out of only six available tissue samples from the overwintering period that are published in a compendium of museum collections ([www.vertnet.org](http://www.vertnet.org)). Given the sampling dates and locations, the four nonbreeding birds were likely collected on their first wintering site (Heckscher *et al.* 2011, 2015, Hobson and Kardynal 2015).

We extracted DNA using DNeasy Blood and Tissue Kits (Qiagen Sciences, Germantown, MD, USA) and prepared libraries for low-coverage whole genome sequencing using a modified Illumina Nextera protocol (Therkildsen and Palumbi 2017, Schweizer *et al.* 2021). All libraries were sequenced on NovaSeq (200 samples per lane) using services provided by the University of Michigan Advanced Genomics Core.



## Data Processing

We trimmed remaining adaptors and low-quality bases from demultiplexed data with AdapterRemoval v2.3.1 using the *-trimms* and *-trimqualities* options (Schubert et al. 2016). We also removed low-quality read ends using *fastp* v0.23.2 (Chen et al. 2018b) with the *-cut\_right* option to mitigate the potential for batch effects arising from differences between sequencing runs (Lou and Therkildsen 2022). Following trimming steps, samples had a mean of 4.8x coverage of the genome (range: 2.59–28.38 billion bases; 2.3x–25.1x coverage).

All samples were confirmed to be tissues from *C. fuscescens* using BLAST in Geneious (v. 2021.2.2) on at least one mitochondrial gene from each individual as described in a previous study (Kimmitt et al. 2023a). As a chromosome-assembled genome of *C. fuscescens* was not available, we aligned all samples to a reference genome of a close relative, *C. ustulatus* (GenBank assembly accession number GCA\_009819885.2bCatUst1.pri.v2, coverage = 60.58x) using bwa mem (Li and Durbin 2010) and Samtools (Li et al. 2009). We removed overlapping reads using clipOverlap in bamUtil (Jun et al. 2015), marked duplicate reads with MarkDuplicates, and assigned all reads to a new read group with AddOrReplaceReadGroups using picard (<http://broadinstitute.github.io/picard/>). All bam files were then indexed using Samtools (Li et al. 2009). The mean mapping rate across all samples used in analyses was 97.43% (range: 93.98–98.43%). We then used GATK v3.7 (Van der Auwera et al. 2013) to re-align samples around indels by applying RealignerTargetCreator to the entire dataset and using IndelRealigner for each sample.

Genotype likelihoods from low-coverage sequencing data were calculated using the GATK model in ANGSD v0.9.40 (Korneliussen et al. 2014). Given the genotype uncertainty associated with low-coverage sequencing, all results were analyzed in a genotype likelihood framework, as this method uses probability-based inference to account for sequencing error (Korneliussen et al. 2014, Lou et al. 2021). Parameters used for each ANGSD analysis are described further below or detailed in Supplementary Material Table S2.

## Population Structure

We calculated genotype likelihoods for all sites with a SNP *p*-value < 0.05 across the entire genome using ANGSD (Supplementary Material Table S1). We then filtered mis-mapped or paralogous SNPs out of the dataset using ngsParalog v1.3.2 (<https://github.com/tplinderoth/ngsParalog>; Linderoth 2018). ngsParalog is designed for low-coverage sequencing data and implements a likelihood method to find mapping problems.

We used PCAngsd v1.10 (Meisner and Albrechtsen 2018) to conduct principal component analyses (PCA) to visually assess spatial genetic structure. As PCA can be sensitive to genomic inversions that could obscure geographic structure (Novembre et al. 2008, Tian et al. 2008, Novembre and Peter 2016), we first ran PCAngsd separately for each chromosome using all 124 samples to identify possible inversions. At least 6 chromosomes exhibited evidence of clustering associated with putative inversions, so we analyzed each chromosome further for inversions using lostruc (Li and Ralph 2019) as implemented using PCAngsd with scripts available from [https://github.com/alxsimon/local\\_pcanbsd](https://github.com/alxsimon/local_pcanbsd). All microchromosomes with evidence of inversions (*n* = 8) as well as all sex chromosomes were

removed from the dataset. For the remaining chromosomes, we then ran PCAngsd with the *-admixture* option to estimate admixture proportions using a non-negative matrix factorization algorithm so that we could produce genome-wide PCAs and admixture plots. Two individuals sampled from Nova Scotia had an aberrantly high PCA covariance (>0.2) such that they were visual outliers on the PCA (see Supplementary Material Figure S1); therefore, we excluded one of these individuals from the final PCAs to better facilitate visual assessment of range-wide structure patterns.

We implemented the *find.clusters* function from the R package *adeigenet* (Jombart et al. 2010) using the covariance matrix produced by PCAngsd; *find.clusters* runs successive *K*-means with an increasing number of clusters (*K*) and then performs a goodness of fit analysis (BIC) to identify the optimal *K*. We also used a Mantel test in the *ade4* package v. 1.7–19 (Thioulouse and Dray 2007), with 1,000 permutations, to determine whether genetic distance (using the proxy 1 – PCA covariance; Novembre et al. 2008) varied significantly with geographic distance between samples. As a continuous population genetic analysis, Mantel tests do not rely on pre-assigned population clusters, such that we could investigate both discrete and continuous population structure.

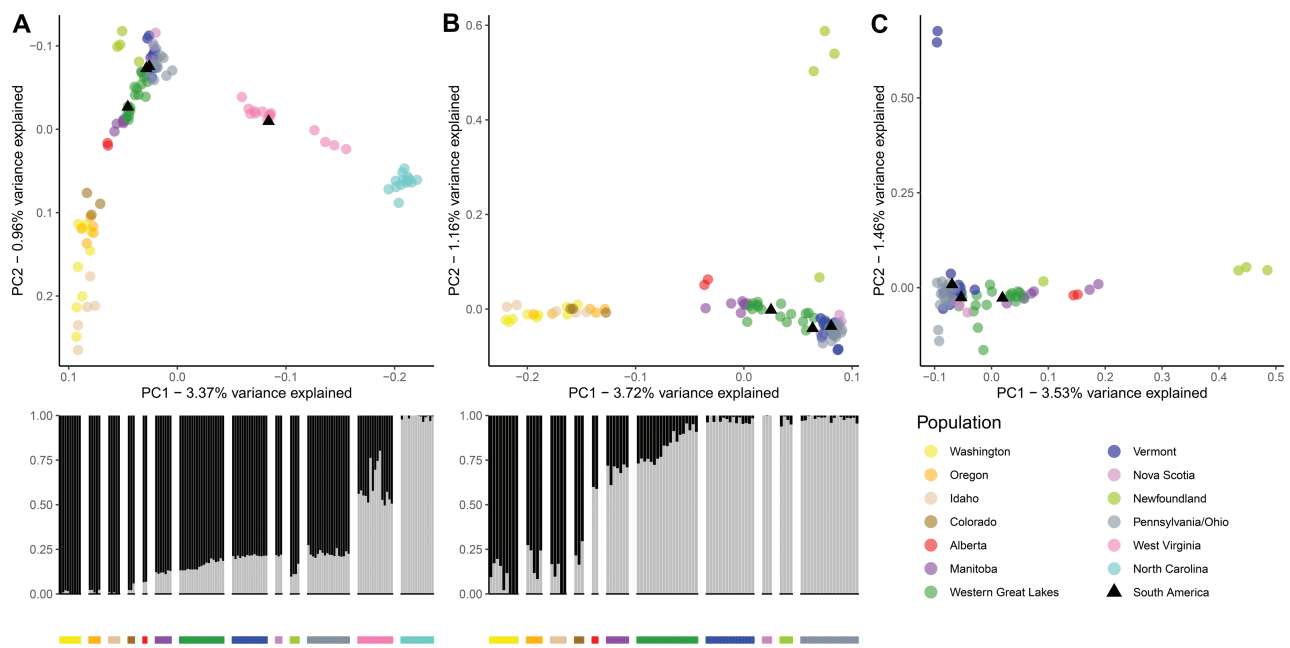
We calculated pairwise fixation index ( $F_{ST}$ ) between 3 distinct populations that were revealed by the PCA-based clustering methods mentioned above (see also Results and Figures 1–2): (1) “western” (i.e., western United States including Washington, Oregon, Idaho, and Colorado; *n* = 22), (2) “southern Appalachian” (i.e., West Virginia and North Carolina, *n* = 29), and (3) “boreal” (i.e., Canada from Alberta to Newfoundland, Western Great Lake states and Northeastern United States; *n* = 69) (Figure 1). To make our  $F_{ST}$  calculations computationally tractable, we randomly downsampled the reference genome, including SNPs and invariant sites, to create a set of loci that consisted of stretches of 2 kb loci at least 10 kb apart (yielding approximately 12% of the whole genome). We used scripts modified from [https://github.com/markravinet/genome\\_sampler](https://github.com/markravinet/genome_sampler) and excluded loci from regions flagged by the inversion filters. Sites flagged by ngsParalog were also removed from the subsampled dataset and stored the loci in a BED file. We generated a site allele frequency (SAF) file in ANGSD with the *-doSaf* parameter and *-sites* filter to include only subsampled loci. We used winsfs (Rasmussen et al. 2022) to create 2-dimensional (2D) site frequency spectra (SFS) between each population pair. We then used the  $F_{ST}$  index and stats function with the option *-whichFst* 1 (i.e., Bhatia estimator) in ANGSD to calculate pairwise  $F_{ST}$  between unbalanced sample sizes.

Finally, to assess the direction of gene flow between the 3 populations, we calculated a directionality index ( $\psi$ ) from the 2D SFS with a custom script from (Adams et al. 2023) using Equation 1b from Peter and Slatkin (2013). Balanced sample sizes are necessary to calculate  $\psi$  (Peter and Slatkin 2013), such that we randomly selected 22 individuals three times from both the southern Appalachian and the boreal populations to created new SAF and 2D SFS files between each population pair for a total of 15 SFS files.

## Genetic Diversity and Heterozygosity

Genetic diversity measure, pairwise  $\theta_{\pi}$ , requires pre-assigned populations for analysis. Therefore, for each of the 3 populations identified by the clustering analysis above (western,





**FIGURE 2.** Principal component analysis (PCA) (top) and admixture plots ( $K = 2$ ) (bottom) for (A) all samples and (B) all samples excluding the southern Appalachian samples (i.e., excluding West Virginia and North Carolina). (C) PCA of boreal and northern Appalachian samples only. Since we did not identify distinct populations within the boreal group ( $K = 1$ ), no admixture plot is included for panel (C). Nonbreeding birds collected in the South America are displayed as black triangles to identify potential population of origin. The x-axis and y-axis in panel (A) is reversed so that points are displayed to reflect the geographic origins. The U-shaped curve shown in panel (A), the nested genetic structure in panels (B) and (C), and the level of admixture across the geographic range suggests isolation by distance across the species' range. The southern Appalachian (West Virginia and North Carolina) were supported as a distinct population from all other samples (A), and the western samples (Washington, Oregon, Idaho and Colorado) were supported as a distinct population when southern Appalachian samples were removed (B). By contrast, all boreal samples were identified as a single population but with evidence of isolation by distance.

boreal, and southern Appalachian), we estimated population-level summary statistics for genetic diversity from the subsampled loci using ANGSD and winsfs. Because the sample size of the more geographically expansive boreal population was much larger than the other 2 populations, we randomly selected 30 individuals from the boreal population for population-level genetic diversity analyses. We generated a SAF using only subsampled loci in ANGSD that excluded flagged sites by ngsParalog and microchromosomes with detected putative inversions. We used winsfs to produce and fold a population-level 1-dimensional (1D) SFS. Pairwise  $\theta_\pi$  was calculated for each chromosome separately using the saf2theta and thetaStat functions in ANGSD. We compared  $\theta_\pi$  by chromosome among populations using a one-way analysis of variance (ANOVA). For each population we also calculated the total pairwise  $\pi$ /total number of sites across all chromosomes.

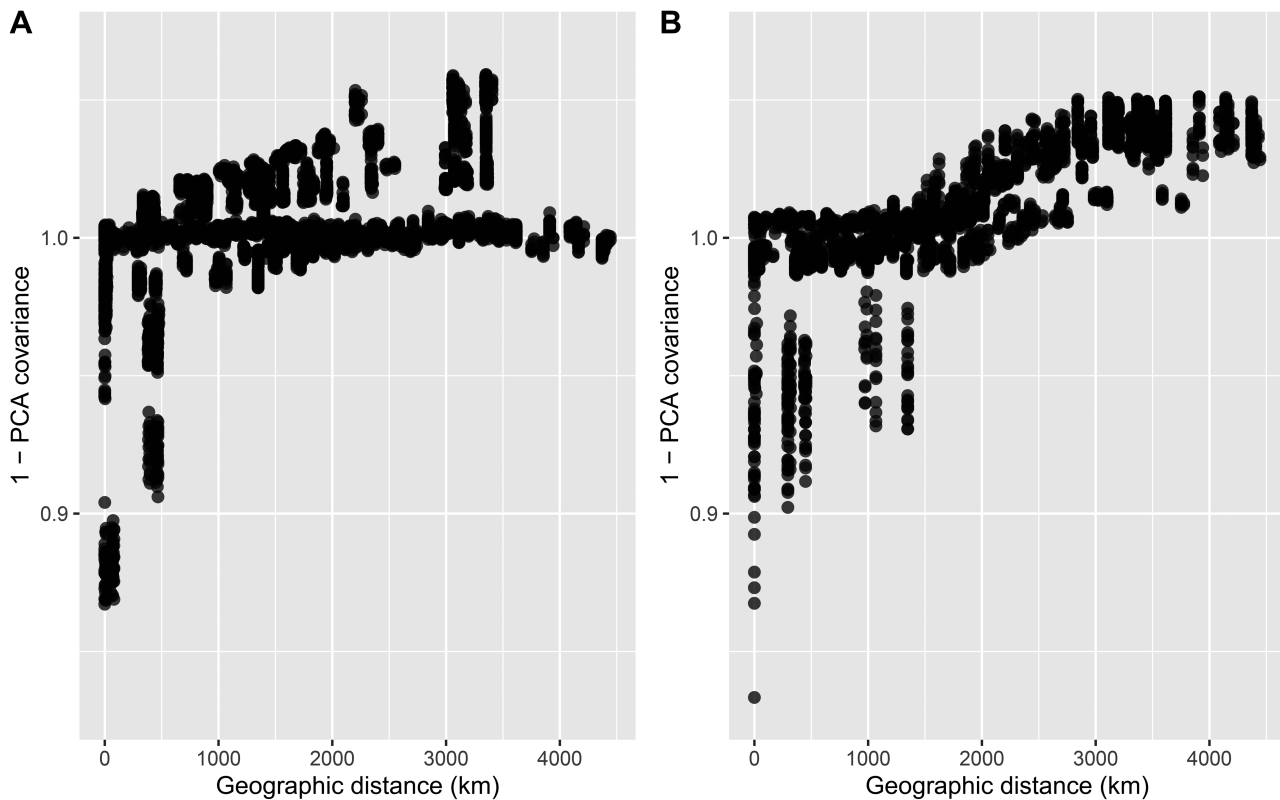
Individual-level heterozygosity was also estimated by creating individual-level SAF files with the same subsampled loci used in genetic diversity estimates. We then used these SAF files with winsfs to generate individual 1D SFS. Individual heterozygosity was calculated as the number of polymorphic sites divided by the total sites in each individual's 1D SFS (Kersten *et al.* 2021). Exploratory analyses suggested that samples with very low (<4x) genomic coverage exhibited low individual-level heterozygosity relative to samples above 4x coverage. Therefore, we filtered all samples with <4x coverage ( $n = 35$ ) out of the dataset for this analysis (retaining samples sizes of  $n = 15$  for western U.S.,  $n = 56$  for boreal, and  $n = 14$  for Southern Appalachian regions). We then compared population differences in individual heterozygosity using ANOVA

and Tukey multiple pairwise comparisons. Because the 3 populations span large geographic ranges, we also tested for the presence of gradients of heterozygosity across latitude or longitude using linear models: (1) a western gradient across latitude including samples from Alberta and the western population, (2) a boreal gradient across longitude, and (3) an eastern gradient across latitude including samples from the southern Appalachian population as well as PA, OH, VT, Nova Scotia, and Newfoundland (Figure 1).

## RESULTS

### Population Structure

The PCA pattern indicated isolation by distance, as the shape of the PCA reflects a sinusoidal curve typical of continuous structure (Novembre and Stephens 2008; Figure 2A). The Mantel test confirmed isolation by distance, as genetic distance ( $1 - \text{PCA covariance}$ ) was positively associated with geographic distance (Pearson's correlation coefficient,  $r = 0.38$ ,  $p = 0.001$ ) using samples across the full breeding range (Figure 3A). We also visually inferred two distinct population clusters in the range-wide dataset of breeding individuals ( $n = 120$ ) in the PCA analysis, such that individuals from the southern Appalachian sampling regions (North Carolina and West Virginia) clustered separately from all other individuals, demonstrating a genetic break between the southern Appalachian samples and the northern Appalachian samples (i.e., Pennsylvania, Ohio, and Vermont; Figure 2A). We confirmed that two clusters were the best fit for the data using the *find.clusters* tool. The admixture plot ( $K = 2$ ) showed a



**FIGURE 3.** Genetic distance (as measured by 1 – PCA covariance) between pairs of individuals is significantly positively correlated with geographic distance (**A**) using the range-wide dataset (corresponding to panel **A**) in Figure 2) and (**B**) the boreal, northern Appalachian, and western U.S. sampling location data (corresponding to panel **B**) in Figure 2). The correlation recovered from the Mantel test is stronger in the subset of data in panel (**B**) (Pearson's correlation coefficient,  $r = 0.78$ ) compared to the range-wide data (Pearson's correlation coefficient,  $r = 0.38$ ) because of distinct population structure associated with the southern Appalachian population.

gradual shift in population ancestry across the geographic range.

We next removed southern Appalachian samples from the dataset to determine if we could detect finer-scale genetic structure in the more genetically similar samples from western and boreal sampling regions. In the boreal and western populations dataset, the relationship between genetic distance and geographic distance was stronger than in the range-wide dataset ( $r = 0.78$ ,  $p = 0.001$ ; Figure 3B). Without the southern Appalachian samples included, we also found that the western population was distinct from a boreal population, which also includes the northern Appalachian samples (Figure 2B) and confirmed that two clusters was the best fit for this subset of the data using *find.clusters*. Finally, we ran a PCA on the boreal genetic population, which includes northern Appalachian samples, to determine if subpopulations would be detectable on a further reduced geographic scale. We visually noted that 3 out of 4 of the samples from Newfoundland sorted separately on the PCA, suggesting that this isolated population could be distinct from other boreal populations. However, *find.clusters* did not assign distinct clusters associated with geography within the boreal population samples, consistent with the observed overlap among sampling regions within the PCA (Figure 2). Finally, the relationship between genetic distance and geographic distance was weakest in the boreal population samples only ( $r = 0.22$ ,  $p = 0.001$ ).

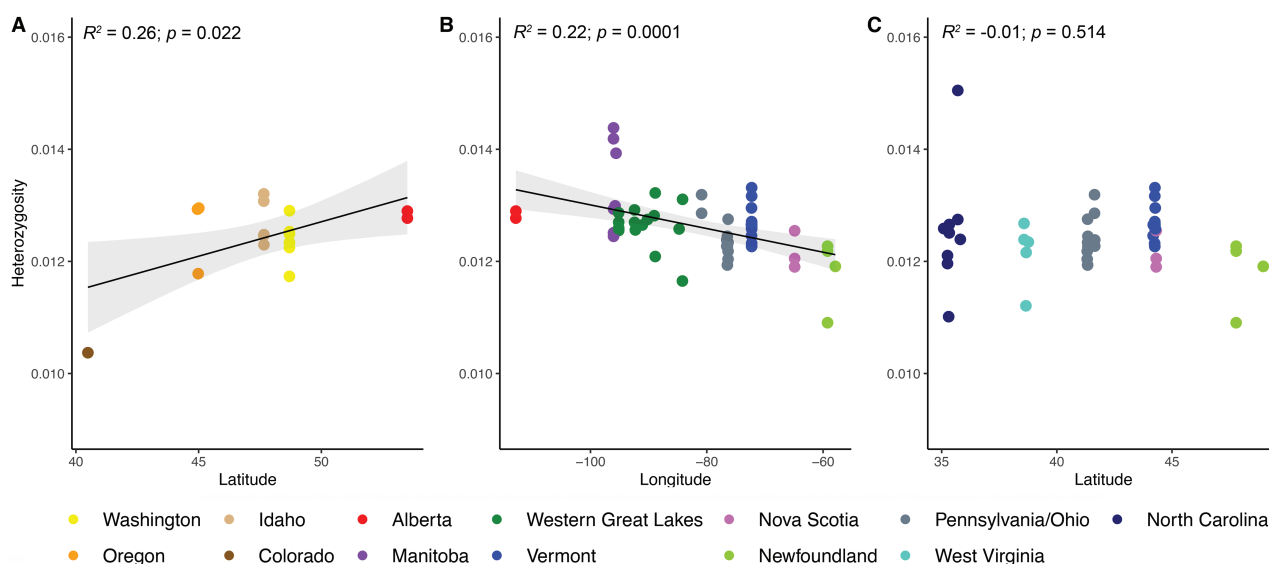
Based on the PCA and clustering results, we conducted analyses of population differentiation and genetic diversity

(next section) using 3 identified populations across the sampling regions (Figure 1): southern Appalachian (i.e., WV, NC), western US (i.e., WA, OR, ID, and CO; hereafter the ‘western’ population), and the boreal belt (Alberta to Newfoundland) including the northern Appalachians (i.e., PA, OH, VT), hereafter the “boreal” population. Pairwise  $F_{ST}$  values were  $< 0.02$  between all three populations, indicating low levels of population differentiation. Weighted pairwise population-level  $F_{ST}$  was 0.008 between the boreal and southern Appalachian population and 0.006 between the boreal and western populations.  $F_{ST}$  was highest between the southern Appalachian and western populations (0.014).

Finally, the directionality index was low ( $\psi < 0.05$ ) for all pairwise population comparisons (Supplementary Material Table S3). Because  $\psi$  is positive, this might indicate that the boreal population has been a source population for expansion; however, these values were not significantly different from zero, supporting an isolation by distance model or a population expansion model in which populations are equidistant from the origin of expansion and are exhibiting comparable levels of gene flow between populations (Peter and Slatkin 2013, Adams *et al.* 2023).

### Genetic Diversity and Heterozygosity

Neither nucleotide diversity (pairwise  $\theta_\pi$ ) estimated per chromosome nor individual-level heterozygosity differed significantly between populations (Table 1; Supplementary Material Figure S2A:  $F_{2,87} = 0.02$ ,  $p = 0.982$ ; Supplementary Material Figure S2B:  $F_{2,81} = 1.09$ ,  $p = 0.341$ ). Across a latitudinal gradient in



**FIGURE 4.** Gradients of heterozygosity across (A) the western montane region by latitude, (B) the boreal forest belt by longitude, and (C) the eastern montane region (southern Appalachians northeast to Newfoundland) by latitude. Heterozygosity scales positively with latitude across the western montane region. Heterozygosity is also significantly higher in the west than the east across the boreal forest belt. There is no significant relationship between heterozygosity and latitude across the eastern montane region. Points are colored according to their sampling region.

**TABLE 1.** Nucleotide diversity (pairwise  $\theta_{\pi}$ ) estimated per chromosome and individual-level heterozygosity estimated as the number of polymorphic sites divided by the total sites in each individual's 1D site frequency spectrum.

Population	Pairwise $\theta_{\pi}$	Individual heterozygosity (mean $\pm$ SE)
Western U.S.	0.013	$0.012 \pm 1.82 \times 10^{-4}$
Boreal	0.013	$0.013 \pm 7.48 \times 10^{-5}$
Southern Appalachian	0.013	$0.012 \pm 2.46 \times 10^{-4}$

the montane west, heterozygosity scaled positively with latitude (Figure 4A). Across a longitudinal gradient in the boreal belt, western samples had significantly higher heterozygosity than eastern samples (Figure 4B). Finally, there were no significant latitudinal differences across the eastern latitudinal gradient from North Carolina to Newfoundland (Supplementary Material Table S2; Figure 4C).

### Breeding Population Assignment for Nonbreeding Samples

We leveraged our thorough sampling of the breeding range to assess the likely breeding populations for the 4 nonbreeding samples from South America based on their location in a PCA of all individuals. One nonbreeding bird (collected in Bolivia in November) clustered with the Appalachian breeding samples from West Virginia, and the remaining three individuals (collected in Bolivia in November or Paraguay in October) clustered with boreal breeding samples (Figure 2A). A PCA containing only the boreal individuals (Figure 2C) suggested that one nonbreeding sample likely originated from either Manitoba or the Western Great Lakes, whereas the other two samples associate with the Western Great Lakes or the northern Appalachians (i.e., VT, PA, or OH). However,

without distinct clusters in the boreal-only analysis, we refrain from confidently assigning these nonbreeding samples to breeding populations more specific than the broader boreal population.

## DISCUSSION

We found evidence of isolation by distance across the breeding range of the Veery, a long-distance migratory songbird, as well as population clustering of the western, boreal, and southern Appalachian sampling regions. PCA revealed geographically nested patterns of genetic clustering (Figure 2) and a pattern of genetic covariance between individual samples that decayed with geographic distance (Figure 3). Our results suggest that breeding site fidelity, which acts to temper natal and breeding dispersal distances, appears to be sufficiently strong to yield spatial genetic structure in the absence of extrinsic barriers to dispersal.

Previous phenotypic assessments of the Veery described 5 subspecies based on plumage color variation associated with the following regions: (1) Newfoundland and central Quebec (*C. f. fuliginosus*), (2) the eastern United States and Canada (including all Appalachian populations; *C. f. fuscescens*), (3) Great Plains of Canada and western Great Lakes (*C. f. levyi*), (4) British Columbia and the Rocky Mountains (*C. f. salicicolus*), and the (5) western United States east of the Cascade Mountains (*C. f. subpallidus*) (Heckscher *et al.* 2020). Identification of phenotypic subspecies, however, has been disputed, as geographic variation in plumage is obscured by individual variation (Pyle 1997). Alternate phenotypic subspecific delineation includes a southern Appalachian subspecies from Georgia to West Virginia (*C. f. pulichorum*) and excludes *C. f. subpallidus* (Pyle 1997). Our genetic results are not fully consistent with the boundaries of these phenotypically described subspecies, as we found only 3 differentiated populations across the range of the Veery, with the southern Appalachian population the most distinct. The



boreal and northern Appalachian PCA (Figure 2c) revealed that 3 of our 4 samples from Newfoundland clustered together separately from the other boreal samples, suggesting a subtle genetic difference in that sampling region. Although our quantitative analysis of population clustering did not support Newfoundland samples as a discrete population, it is possible that increased sampling from the Maritime Provinces of Canada would bolster detection of a distinct genetic cluster associated with the subspecies described from this region. Additionally, we note that low sampling density in western Canada could potentially produce the pattern of discrete phylogeographic clustering between the boreal and western U.S. populations, rather than a continuous pattern of genetic structure between western and boreal populations, if admixed individuals occur between our sampling in central Alberta and the northwest U.S. Nevertheless, we conclude that the genetic structure detected in our study does not align with the phenotypically described subspecies, such that phenotypic differences are unlikely driven by historical population isolation and differentiation (Zamudio *et al.* 2016). Instead, subtle plumage differences across the range could reflect local selection on a small number of plumage genes without genome-wide divergence (e.g., McCormack *et al.* 2012, Toews *et al.* 2016) or phenotypic plasticity in response to environmental conditions (e.g., Mason and Taylor 2015, López-Rull *et al.* 2023).

Our data also allowed us to determine the general breeding origins of the very few wintering site genetic samples available. Understanding migratory connectivity—the geographic links between wintering, stopover, and breeding sites—is critical (Webster and Marra 2005, Marra *et al.* 2006, Somveille *et al.* 2021), as conditions on the wintering grounds can have carry-over effects on breeding season fitness (Norris and Taylor 2006, Harrison *et al.* 2011, Ambrosini *et al.* 2019). Individual tracking can reveal movement patterns across the annual cycle (Stutchbury *et al.* 2009, Fraser *et al.* 2012, Barbayar *et al.* 2021, Rushing *et al.* 2021), but is both time intensive and accompanied by several challenges associated with sample size and data recovery (Ruegg *et al.* 2017). The Veery's complex movements between two wintering regions in the tropics (Heckscher *et al.* 2011, Heckscher *et al.* 2015, Hobson and Kardynal 2015) add another challenge to using tracking information to identify the breeding population of an individual. Genetic data from whole-genome sequencing has been used previously to identify an individual's population of origin (e.g., Manel *et al.* 2002, Nielsen *et al.* 2009, Hess *et al.* 2011, Ruegg *et al.* 2014) and might be a robust alternative method to tracking methods, as it is cost effective at a large scale and can be used to detect subtle breakpoints in continuous population structure (Turbek *et al.* 2023). Using PCA to identify putative population of origin of nonbreeding samples, we identified one individual from the southern Appalachian population and three individuals from the boreal population (Figure 2). This clustering of nonbreeding samples with breeding samples allowed putative regional breeding assignment despite absence of distinct genetic clusters within the boreal population. Population assignment is typically conducted using a panel of genetic markers or loci that consistently differ between distinct populations (Veale *et al.* 2012, Chen *et al.* 2018a, Sylvester *et al.* 2018); however, these techniques are ineffectual across wide ranges without pronounced population structure, such as the boreal forest belt for the Veery. By combining lcWGS with range-wide

sampling, PCAs can detect finer structure, such that regional breeding area assignment might be possible in regions with high gene flow.

We also evaluated geographic patterns of genetic diversity to test whether contemporary genetic patterns reflect historic isolation of populations in glacial refugia. Phylogeographic hypotheses have suggested that populations geographically closer to putative refugia (i.e., source populations) should harbor higher levels of genetic diversity due to founder effects and greater geographic isolation (i.e., “southern richness and northern purity” hypothesis) (Hewitt 1999, Excoffier 2004, Eckert *et al.* 2008, Provan and Bennett 2008, Excoffier *et al.* 2009). We therefore hypothesized that if the southern Rockies and southern Appalachia were glacial refugia for the Veery, we would detect lower genetic diversity in the boreal population in comparison.

Using cluster-based analyses, we first found that the western, boreal, and Appalachian populations did not differ in any measures of genetic diversity (Table 1, Supplementary Material Figure S2), inconsistent with this hypothesis (Hewitt 2004, Provan and Bennett 2008, Ralston *et al.* 2021). Geographic gradients in genetic diversity, however, might further show signatures of range expansion dynamics (Provan and Bennett 2008, Peter and Slatkin 2015, Adams *et al.* 2023). We found that individual heterozygosity was positively correlated with latitude across the western montane region and negatively with longitude across the boreal forest belt (Figure 4). These patterns also do not align with expected patterns of higher genetic diversity in the south associated with northward postglacial expansion (Miller *et al.* 2020, Adams *et al.* 2023). However, comparable or higher genetic diversity has also been observed at the leading expansion front (Vandepitte *et al.* 2017, Wang *et al.* 2017, Bors *et al.* 2019) likely due to continued high gene flow with the source population (Miller *et al.* 2020, Adams *et al.* 2023). Expansions that occur at a rapid pace are also likely to retain higher heterozygosity at the expansion front (Goodsman *et al.* 2014). Therefore, our heterozygosity results may alternatively provide weak support for rapid expansions out of western and northeastern refugia. The directionality index, however, was close to zero between all pairwise comparison ( $\psi < 0.05$ ), suggesting that the data might better fit an isolation by distance rather than expansion model (Peter and Slatkin 2013, Adams *et al.* 2023). Ultimately, our results do not provide compelling evidence for a glacial refugium in Newfoundland or the southern Rockies, because the subtle patterns found are also consistent with continuous processes of gene flow between populations across the range.

In conclusion, we were able to resolve detailed spatial genetic structure in the Veery despite the high dispersal potential in this species, and we observed evidence for both continuous and discontinuous structure across the range. Given the resolution that we achieved through low-coverage, whole-genome sequencing and range-wide sampling, we were also able to assign regions of origin to individuals collected on their wintering grounds, which has important implications for assessing migratory connectivity at a larger scale than enabled by traditional tracking methods. Finally, based on the patterns of population differentiation and genetic diversity in this species, we conclude that gene flow, isolation by distance, and site fidelity likely play a more important role in shaping current population genetic structure and diversity in this species than historic isolation.

## Supplementary material

Supplementary material is available at *Ornithology* online.

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## Ethics statement

For permits to collect specimens in the field, we thank the United States Fish and Wildlife Service, United States Forest Service, Michigan Department of Natural Resources, Minnesota Department of Natural Resources, Colorado Department of Natural Resources, Idaho Department of Fish and Game, North Carolina Wildlife Resources Commission, Ohio Division of Wildlife, Oregon Department of Fish and Wildlife, Pennsylvania Game Commission, Vermont Fish and Wildlife Department, Vermont Agency of Natural Resources, West Virginia Department of Natural Resources, Canadian Wildlife Service of Environment and Climate Change Canada, and Manitoba Fish and Wildlife. Field sampling was approved by the University of Michigan Animal Care and Use Committee (# PRO00010608).

## Author contributions

AWJ, AAK, TMP, and BMW conceived the idea of the study. AAK, TMP, and BMW developed methodology. AAK and BMW analyzed the data. AAK and BMW wrote the original draft of the manuscript. TMP, AWJ and KW reviewed and

edited the manuscript. AWJ, KW, and BMW contributed substantial materials or funding for the study.

## Conflict of interest statement

The authors declare no conflicts of interest.

## Data Availability

Raw genetic data generated from this study is available on the Sequence Read Archive (Accession #: PRJNA1043688). Code used for analysis is available from [Kimmitt et al. \(2023b\)](#).

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