

Climate-mediated hybrid zone movement revealed with genomics, museum collection, and simulation modeling

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Climate-mediated changes in hybridization will dramatically alter the genetic diversity, adaptive capacity, and evolutionary trajectory of interbreeding species. Our ability to predict the consequences of such changes will be key to future conservation and management decisions. Here we tested through simulations how recent warming (over the course of a 32-y period) is affecting the geographic extent of a climate-mediated developmental threshold implicated in maintaining a butterfly hybrid zone (*Papilio glaucus* and *Papilio canadensis*; Lepidoptera: Papilionidae). These simulations predict a 68-km shift of this hybrid zone. To empirically test this prediction, we assessed genetic and phenotypic changes using contemporary and museum collections and document a 40-km northward shift of this hybrid zone. Interactions between the two species appear relatively unchanged during hybrid zone movement. We found no change in the frequency of hybridization, and regions of the genome that experience little to no introgression moved largely in concert with the shifting hybrid zone. Model predictions based on climate scenarios predict this hybrid zone will continue to move northward, but with substantial spatial heterogeneity in the velocity (55–144 km/1 °C), shape, and contiguity of movement. Our findings suggest that the presence of nonclimatic barriers (e.g., genetic incompatibilities) and/or nonlinear responses to climatic gradients may preserve species boundaries as the species shift. Further, we show that variation in the geography of hybrid zone movement could result in evolutionary responses that differ for geographically distinct populations spanning hybrid zones, and thus have implications for the conservation and management of genetic diversity.

climate change | hybridization | diapause | genomic | cline

Evidence from the fossil record and contemporary studies demonstrate that changes in climate profoundly alter species' geographic distributions (1). Further, biotic interactions such as competition and predation influence how species' distributions track changes in climate (1, 2). One species interaction that has received a great deal of attention in evolutionary biology, but less in the context of species responses to climate change, is hybridization. Although hybrid zones are ubiquitous in nature (3), we know very little about how these contact zones influence the way organisms respond to climate change. In fact, it has only recently been appreciated (and documented) that hybrid zones are mobile and that observed movement of these zones could act as biological indicators of climate change (4).

Here we leverage an ecologically well studied and historically well sampled hybrid zone between eastern (*Papilio glaucus*) and Canadian (*Papilio canadensis*) tiger swallowtail butterflies to explore whether recent climatic warming has resulted in hybrid zone movement. Divergence between these two species is esti-

mated to have occurred 0.5–0.6 million years ago (5–7). Although there are a number of divergent physiological (8–10), behavioral (11–13), and morphological (14, 15) traits between these two species, the traits most strongly implicated in maintaining the location of this hybrid zone are those associated with seasonal adaptations, including diapause and growth (16). A climate-mediated developmental threshold (length of the growing season required for *P. glaucus* to complete two generations) is correlated with the northern boundary of *P. glaucus* and the southern range boundary of *P. canadensis*. Along this boundary, a narrow (<50 km) east–west hybrid zone forms, extending from Minnesota to New England (Fig. 1) (17). Geographic variation in climate (length of the growing season) appears to be a primary factor in maintaining the location of this hybrid zone by limiting the ability of genotypes with facultative diapause, a trait characteristic of the southerly species, *P. glaucus*, to complete a second generation. In multiple, independent portions of the hybrid zone (i.e., latitudinal transects from longitudinally distant

Significance

The biological consequences of climate change are determined by the responses of individual species and interactions among species. Hybridization, or interbreeding between related species, is an interaction that affects how species evolve in response to environmental change. Here we provide evidence that climatic warming has caused a geographic shift of a butterfly hybrid zone and that strong selection and/or genetic incompatibilities maintain species boundaries during this movement. Through simulations, we show that as climate change progresses, the rate and geographic configuration of future hybrid zone movement will vary across space and time. This geographic variation in future hybrid zone movement may lead to divergent ecological and evolutionary outcomes, and thus has implications for local conservation and management.

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Data deposition: Demultiplexed RADseq reads generated in this study are available through NCBI's Sequence Read Archive associated with Bioproject (PRJNA431486, SRA: SRP131962). All metadata and scripts associated with analyses in this study have been deposited on DRYAD (<https://doi.org/10.5061/dryad.5vn76>).

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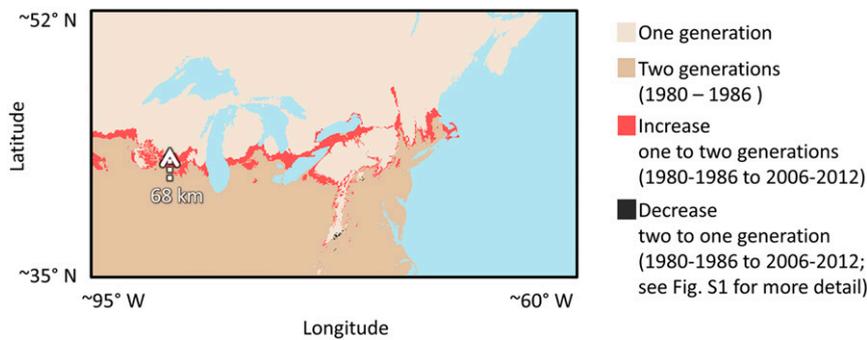


Fig. 1. Simulated changes in the location of a climate-mediated developmental threshold and the *P. glaucus*-*P. canadensis* hybrid zone between historic (1980–1986) and contemporary (2006–2012) periods. Estimate of the spatial distribution of the ability of *P. glaucus* to complete two generations [implicated in maintaining the location of the hybrid zone (16, 21)], based on simulation modeling parameterized from growth chamber experiments. The highlighted arrow indicates the predicted 68-km northward expansion of this climate-mediated developmental threshold in Wisconsin between historic (1980–1986) and contemporary (2006–2012) periods.

regions of the hybrid zone), variation in genetic markers, physiological traits, and allozymes exhibit steep clines that coincide with this geographic gradient in climate (18–20), and not the distribution of other ecological factors, such as the distribution of differentially detoxified host plants or the Batesian model *Battus philenor* for which female *P. glaucus* are a mimic (16).

Recently observed changes (increase) in the frequency of a physiological trait (*Liriodendron tulipifera* detoxification ability) and an allozyme (*Pgd-100*) north of the hybrid zone (21) suggest this hybrid zone may be shifting. To evaluate the potential for climate-mediated hybrid zone movement, we set out to first test whether recent warming (22) resulted in the expansion of the climate-mediated developmental threshold implicated in maintaining the location of this hybrid zone. To evaluate spatiotemporal changes in the geography of this climate-mediated developmental threshold during a 32-y period of documented warming, we constructed a simulation model parameterized with developmental data (from *P. glaucus*) collected from a series of growth chamber experiments. Then, we empirically measured hybrid zone movement during this same 32-y period, using a combination of morphological and molecular markers.

Empirical examination of dynamically shifting hybrid zones provides a unique opportunity to explore the interplay between reproductive isolation and climatic variation (23). Unfortunately, such evaluations are lacking, largely because of inadequate historical sampling (23, 24). Museum and contemporary specimens sampled across a latitudinal gradient spanning the hybrid zone in Wisconsin provided us with a rare opportunity to test predictions of hybrid zone movement, using male butterflies collected over the course of a 32-y period (1980–2012), both for two species diagnostic molecular markers (e.g., a Z-linked SNP in the gene *Ldh* and a restriction fragment-length polymorphism within the mtDNA gene *COI*) and one morphological marker that has been previously shown to exhibit steep clinal variation across the hybrid zone, and for a genome-wide random subsampling of single-nucleotide polymorphisms (SNPs) derived from double-digest restriction-associated DNA sequencing (ddRADseq) (25). The last allows for a comprehensive assessment of how the genomes in these two species are changing through time and an evaluation of the potential for the breakdown or buildup of reproductive barriers as a result of hybrid zone movement. All marker types were used in a geographic cline analysis to measure temporal changes in the location of the hybrid zone.

Whether species boundaries break down or build up as a consequence of hybrid zone movement will have implications for conservation efforts and the management of natural resources, given that changes in gene flow can dramatically alter the genetic composition of interbreeding species (26–28). The presence of

exogenous barriers (ecologically mediated selection) or endogenous barriers (nonecologically mediated selection; e.g., genetic incompatibilities) should act to maintain species boundaries during hybrid zone movement. We evaluated the prediction that previously identified barriers, distributed across the genomes of *P. glaucus* and *P. canadensis* (16), should act to maintain the integrity of this hybrid zone during movement by comparing estimates of admixture between periods.

Finally, the geography (spatiotemporal variation) of climatic change is predicted to be a critical factor in species' responses to climate change (29). For example, because of topographic effects (e.g., mountainous vs. flat landscapes), the velocity of temperature change may vary markedly across geography, with species' survival dependent on their ability to keep pace; regions with higher velocities may be more vulnerable to climate change. To gain insight as to how this concept may be important to hybrid zones specifically, we simulated future hybrid zone movement by modeling the spatial distribution of the climate-mediated developmental threshold (as a surrogate for the location of the hybrid zone) under a range of plausible future warming conditions (30). Using this 30,000-ft view of (simulated) hybrid zone movement, we explore how spatiotemporal variation in climate alters the geography (velocity and shape) of hybrid zone movement and discuss how the geography of hybrid zone movement itself is dynamic and underappreciated.

Results and Discussion

Simulating Historical Hybrid Zone Movement. We reared and phenotyped 1,153 individuals, derived from 40 families, to fit seven models to the developmental data of each of life stage (egg, larva, and pupa). We compared model performance of each fitted model to predict the development of each life stage, using an independent dataset of growth data from 844 individuals derived from 22 families. From these data, we determined that the Briere (31), Taylor (32)/Beta (33), and Logan10 (34)/Taylor models performed best (lowest root mean squared error; RMSE) for egg (RMSE, 1.19), larva (first/second generation, respectively; RMSE, 3.47/4.67), and pupal (direct-developing/diapaused, respectively; RMSE, 6.10/4.33) development, respectively (*SI Appendix, Table S1*). Using these best performing models to simulate insect development of *P. glaucus*, we predicted that a climate-mediated developmental threshold-limiting bivoltinism (i.e., the ability to complete two generations) expanded geographically from 1980 to 2012 (Fig. 1). Specifically, this climate-mediated developmental threshold is expanding northward by an average of 10.6 ± 13.1 km/y. This trend toward a lengthening growing season allows *P. glaucus* to complete an additional generation in localities where it was previously not possible. This result is in line with other predictions

that climatic warming will increase voltinism in many insect species (35–37) and supports studies already documenting a similar response in other Lepidoptera (38). The predicted geographic movement of this climate-mediated developmental threshold varied substantially across latitude and elevational gradients (*SI Appendix, Table S2*). In some regions, voltinism was not predicted to have changed during the last 32 y, and was even predicted to decrease in a few locations (e.g., in portions of the Appalachian Mountains; Fig. 1 and *SI Appendix, Fig. S1*). The slower rate of movement of this climate-mediated developmental threshold in areas of higher elevation fits with predictions that mountainous biomes will experience the slowest climate velocities (29), potentially providing a refuge for some species from climate change (39).

Empirically Evaluating Historic Hybrid Zone Movement. Although climate-mediated changes in voltinism could facilitate range expansion and contraction in many insects, this outcome has only been documented in a handful of species (40, 41). In Wisconsin, our simulation model predicts that the climate-mediated developmental threshold for a bivoltine life history has shifted ~68 km northward from 1980 to 2012 (Fig. 1). If climate is a strong selective agent maintaining the location of this hybrid zone, as has been proposed (16), we would predict that the hybrid zone should be tracking the northward movement of this climate-mediated developmental threshold. From both museum and contemporary specimens collected from across a latitudinal transect in Wisconsin, we were able to develop 1,196 SNPs to test this hypothesis (1,194 ddRADseq SNPs and a SNP in *Ldh* and *COI*). Of these 56 SNPs distributed across 15 autosomes, the mitochondrial genome and the Z-chromosome appear to be playing a disproportionate role in maintaining divergence between these species (7, 16) and exhibited steep clinal variation (*Methods*). Comparing the median cline center and width of these markers between periods, we document a

significant northward shift of the hybrid zone by 40 ± 4 km (Wilcoxon signed-rank test, $P < 0.0001$; Fig. 2). This northward shift also holds when looking at a subset of species diagnostic genetic markers (Z-linked *Ldh* and mtDNA *COI*) and a morphological trait (width of the anal band on the hindwing), for which we have larger sample sizes ($n = 385, 564,$ and $1,110$ respectively). We found these markers shifted significantly northward by 50, 60, and 30 km, respectively (Fig. 2 and *SI Appendix, Table S3*).

Using the median cline estimates for all 56 clinal genetic markers, and assuming a constant rate of movement, the center of the *P. glaucus*–*P. canadensis* hybrid zone is advancing northward at a rate of ~1.25 km/y. This rate of hybrid zone movement is slower than our estimated rate of expansion in the climate-mediated developmental threshold of 2.11 km/y, but falls within the range of documented movement of other hybrids zones spanning a broad range of taxa (~0.2–5.8 km/y). For the majority of these hybrid zones, however, the reason for movement was either unknown or a result of assortative mating, not climate (4). The only two other butterfly hybrid zones with documented movement, *Heliconius erato hydrara*–*Heliconius erato petiverana* and *Anartia fatima*–*Anartia amathea*, had rates estimated at 2.76 and 2.5 km/y, respectively (42, 43), which are nearly twice the rate we observed. In these cases, the movement was best explained by competitive interactions and dispersal, not climate.

Given that the hybrid zone is formed at the range boundaries of these two species, the movement of the zone could be considered a parallel range shift of the two species. From this perspective, the observed range expansion of *P. glaucus* of ~1.25 km/y would be moving slower than the average range shift documented in other butterflies of ~1.4–1.8 km/y (44).

Whether this apparent lag in the shift of the hybrid zone relative to the expanding climate-mediated developmental threshold is a result of hybridization or other ecological factors is difficult to determine. It could be that as *P. glaucus* expands northward, the overlap between *P. glaucus* and *P. canadensis* increases, resulting in a higher incidence of hybridization. Given the apparent lower fitness of hybrids (16, 45), a rise in the rate of hybridization could result in a short-term population sink that diminishes as *P. canadensis* is displaced. Alternatively, given the large amount of interannual variation in the geographic position of this climate-mediated developmental threshold during the last 32 y, it is possible that movement slowly advances northward in warmer years, but shifts back in cold years, such as waves advancing further inland during a rising tide. Similar to this scenario would be a ratcheting of movement northward (46), with northward expansion in warm years and persistence achieved in cooler years through diapause (i.e., individuals do not attempt a second generation). Evidence of oscillating hybrid zones has only been documented in a single case (47). Unfortunately, as is true with most historical datasets, we lack the fine-scale temporal resolution to test these alternative hypotheses.

Understanding whether and how isolating barriers within the genomes of hybridizing species are altered as a consequence of changes in climate is critical to predicting how hybridization will affect genetic diversity in the context of climate change (26). In the case of *P. glaucus* and *P. canadensis*, we find little evidence of any substantial breakdown in species boundaries. As the hybrid zone shifted, broadly distributed genomic regions exhibiting steep clines maintained strong overlap in both their center (coincidence: 84% in historic, 74% in contemporary) and width (concordance: 84% in historic and contemporary) between periods (Fig. 2A). In other words, we found little discordance in the movement among divergent regions within these genomes. These genomic regions are shifting largely in concert with one another and with a morphological trait.

The hybrid zone has become slightly wider, by 31 ± 8 km, during this period of hybrid zone movement (Wilcoxon signed-rank test, $P < 0.0001$; Fig. 2A). A widening hybrid zone could result from

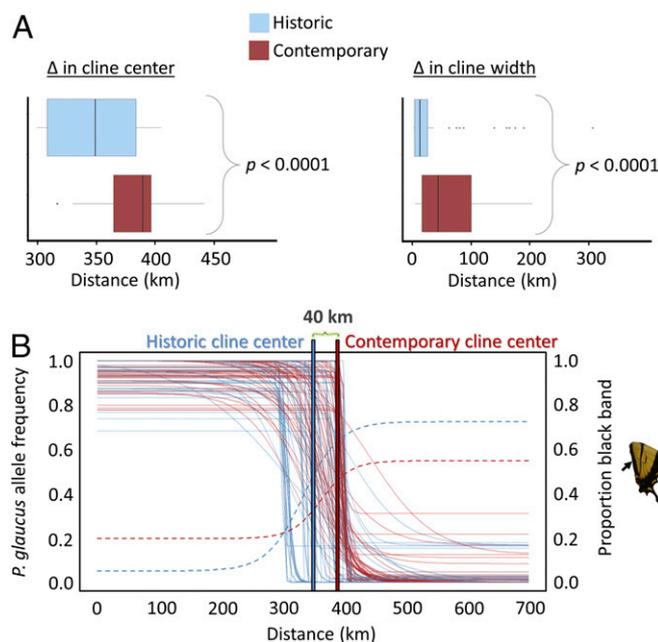


Fig. 2. Empirical evaluation of hybrid zone movement. (A) Estimate of median cline center and width (for 56 clinal genetic markers; ddRADseq, *COI* and *Ldh* markers) between historic and contemporary periods (Wilcoxon signed-rank test; $\alpha = 0.05$; $n = 56$). The scaling of the x-axis reflects a latitudinal transect spanning from ~40°N (0 km) to 46°N (600 km). (B) Maximum likelihood cline for 56 clinal genetic markers (historic: solid blue and contemporary: solid red) and a morphological wing trait (historic: dashed blue and contemporary: dashed red).

to as the geography of climate change. We explored the geography of hybrid zone movement in *P. glaucus* and *P. canadensis* by modeling the spatial distribution of a climate-mediated developmental threshold (as a proxy for the location of the hybrid zone) under a range of warming conditions (future climate scenarios). These forecasts provide a two-dimensional view of how the hybrid zone might shift under continued warming and suggest there will be substantial variation in the rate and direction of continued hybrid zone movement (varying from 55–144 km/1 °C across the range), with the velocity of this change ranging from 0.4 to 9 km·y⁻¹, depending on the rate of climatic warming (with warming ranging from +0.5 to 5 °C during an 80-y period; Fig. 3A). Similar to climate envelope modeling, these predictions assume that this climatic feature (length of the growing season) is the primary factor determining the location of this hybrid zone. Although our documenting of historical hybrid zone movement provides some evidence that this is a reasonable assumption in Wisconsin, it is less clear whether this assumption holds true across the entire hybrid zone.

Spatial variation in the velocity of climate change has the potential to influence hybrid zone dynamics that feed back to influence further hybrid zone movement. Although at this point it is largely conjectural, we find it useful to highlight four possible nuances to climate-mediated range shifts when hybridization occurs. First, variation in the velocity of climate change could influence the spatial extent to which interbreeding species overlap. The concordance of parallel range shifts is of particular consequence in hybrid zones, because an increase or decrease in range overlap can result in altered rates of hybridization (conceptual example Fig. 4A). In the Wisconsin portion of the *P. glaucus*–*P. canadensis* hybrid zone, we find no change in overlap (Fig. 4A, scenario 2); however, given the predicted much faster rate of movement in the westernmost portion of the hybrid zone (Minnesota), it is reasonable to think one or both species may have difficulty keeping pace, which could result in an increase or decrease in overlap. In this system, increased overlap would likely result in a population sink, given that selection against hybrids is very strong (16). However, in other systems (or possibly other portions of this hybrid zone), where selection is weak or hybrids more fit, high velocities of hybrid zone movement could result in expanding hybrid zones (i.e., create conditions for a hybrid swarm) (48). Second, variation in the geographic movement of hybrid zones that increases the surface area or contact zone of interaction may increase biases in introgression, favoring the species for which the opportunity for dispersal into the contact zone is greater (Fig. 4B). Such biases could alter the evolution of the interbreeding populations as well as influence further movement of the hybrid zone, as asymmetry in introgression alone can lead to hybrid zone movement (49). Third, as hybrid zones shift, portions that were once isolated by physical barriers can come into contact, bringing together potentially locally adapted populations of both species (conceptual example in Fig. 4C). For example, with >3 °C of warming, portions of this hybrid zone (near latitudinal bands at 90 and 85° W) that have been physically isolated for potentially thousands of years will merge and form a contiguous boundary; this may already be occurring near latitudinal band 80° W (Fig. 3B). Fourth, our model predicts that local variation in the rate of warming will create “univoltinism islands” that allow isolated populations of *P. canadensis* to persist within the expanding range of *P. glaucus* (Figs. 3B and 4B). Although the effects of such changes in the spatial continuity of hybrid zones are not yet clear, they are likely to have both short- and long-term evolutionary consequences. These varying outcomes illustrate the importance of modeling the relationship between climate and the geography of hybrid zone movement in other systems to identify regions along a hybrid zone predicted to vary substantially in their movement. These populations can then be the primary focus for long-term monitoring and sampling efforts.

This study, along with a few other documented cases of climate-mediated hybrid zone movement, provides support to the idea that

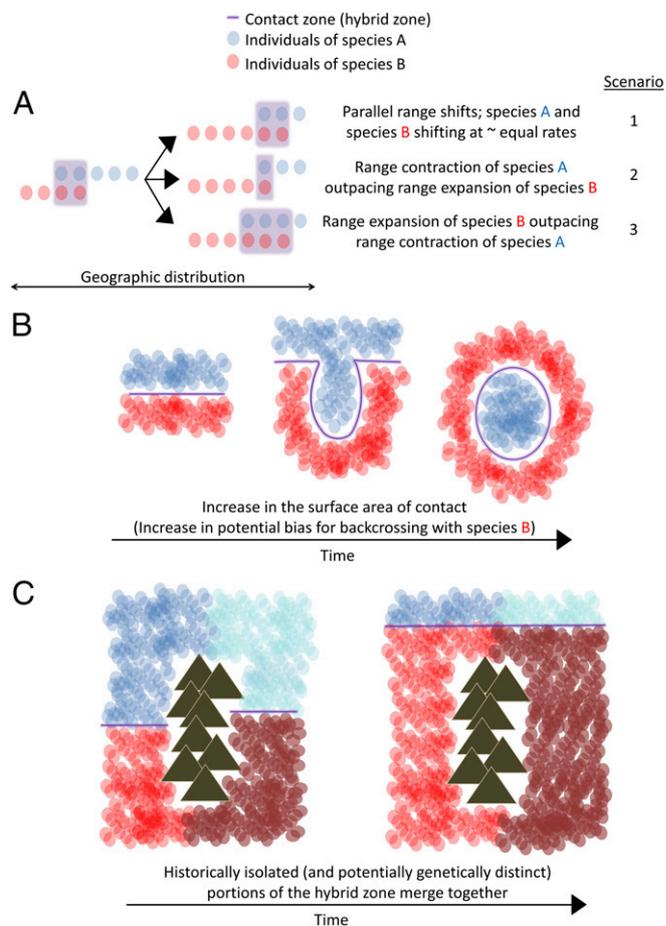


Fig. 4. Conceptual illustrations of how variation in the geography of hybrid zone movement results in different hybrid zone dynamics. (A) Example of how differences in the rate of range expansion/shift and contraction between the species forming the hybrid zone can result in variation in the amount of overlap (and potential hybridization) between said species. (B) Example of how changes in the shape of the hybrid zone, viewed from left to right, can result in greater “surface area of contact” for one species that results in asymmetries in the contribution of parental species to the hybrid zone (favoring greater backcrossing of hybrids to species B in this example). (C) Example of how historically isolated (and potentially genetically distinct) portions of the hybrid zone merge together, forming a more contiguous hybrid zone as a result of range shifts of one or both species.

hybrid zone movement may be a common response to climate change (23). Hybrid zone movement was associated with a shift in a voltinism transition zone, which is a climate-mediated phenomenon ubiquitous among insects, suggesting that movement in insect hybrid zones may be a common response to climate change. Our findings also suggest that climate-mediated hybrid zone movement may result in displacement, rather than blending of species boundaries. In the case of this hybrid zone, a steep exogenous selection gradient (length of growing season required to complete two generations), endogenous selection (previously identified potential genetic incompatibilities throughout the genome), or a combination of these two forces appears to be preserving the integrity of this hybrid zone as it shifts. However, our prediction that hybrid zone movement could vary substantially geographically underscores the importance of considering different regions of a hybrid zone. Given that many hybrid zones span large geographic areas that contain a diverse mix of ecological and topological gradients, the geography of hybrid zone movement in these other hybrid zones is also likely to be quite variable. From a conservation and resource/pest

management perspective, it will be necessary to consider how features in the geographic landscape, as well as selection within the genomic landscape (exogenous and endogenous barriers), drive disparate evolutionary outcomes for different hybrid zones, and even different populations across a hybrid zone.

Methods

Model Fitting. To predict the spatial extent of the climate-mediated developmental threshold to complete two generations by *P. glaucus* (Fig. 1 and *SI Appendix*, Fig. S1), we parameterized and evaluated a number of developmental models for each stage of development. Specifically, we measured growth rates from 1,153 offspring produced from 40 families created from wild-caught *P. glaucus* females collected from central Illinois and Indiana in 2012–2015 (*SI Appendix*, Fig. S3); for validation (see *Model Evaluation/Selection*), 22 wild-caught *P. glaucus* females were also collected from Illinois and Pennsylvania. Males were provided with a nutrient rich honey solution before mating to increase fertility. Females were placed in $\sim 15 \times 15$ cm cylindrical mesh cages containing tulip tree (*Liriodendron tulipifera*) leaves and kept in a temperature-controlled chamber cycling between 18 and 30 °C and 16:8 light:dark cycle. Females were fed a 10% honey water solution twice daily, and eggs were collected each morning and evening.

Freezers were modified into growth chambers by adjustments to the thermostat and the addition of heating blankets, and lights were controlled using a custom Matlab script that made regular adjustments to light (day length) and temperature (to stay within half a degree Celsius of the set point). Lighting was set to long-day conditions (16:8 light:dark cycle) to keep individuals from diapausing. Eggs from each female were evenly and randomly split among temperature treatments: 8, 12, 18, 24, 30, 36, and 40 °C. The 18, 24, and 30 °C treatments were kept constant. For the 8, 12, 36, and 40 °C treatments, we used a temperature transfer approach, as done in ref. 54, where individuals were moved to these temperatures for only a subset of their development (*SI Appendix*, Fig. S4). This approach reduces treatment-induced mortality (particularly near the upper threshold), and the potential for excessively long trials (particularly near the lower threshold) that can induce stress and, in the case of larvae, substantial changes in host plant quality over the course of the treatment. All individuals that died while in the “transfer treatments” (8, 12, 36, and 40 °C) were given a growth rate of 0, as these individuals were likely to have growth rates near 0 (54); to account for nontreatment mortality, the proportion of individuals that died in the 24 °C treatment (assumed rate of background mortality) were removed from each transfer treatment.

Eggs were kept in small ventilated plastic cups until hatching. Larvae were transferred to 15 cm diameter vented Petri dishes (1–2 per dish) and fed leaves of black cherry (*Prunus serotina*) in water piques that were changed every other day. Once larvae entered the “wandering” stage just before pupation (turned purple), they were placed in 24 °C and given 4 d to pupate before placing them in individual mesh cages for eclosion and moved to their pupal treatment. The treatment for each new developmental stage was chosen at random.

Developmental data from the growth chamber experiments (above) were fit to seven different commonly used models for insect development: Régnière (54), Taylor (32), Beta (33), Lactin (55), Logan-10 (34), Brière-1 (31), and Schoolfield (56) (*SI Appendix*, Figs. S5 and S6). Model fitting was performed using the general purpose optimization function `optim` from the stats package in the R environment (R 3.0.2). Each fit was checked for convergence and inspected visually by plotting each fit. This was done for each stage of development. For pupal development (time to eclosion), models were fit for only females (females develop slower than males and would be the limiting factor for completion of two generations). To account for the effect that change in host plant quality has on larval growth rate throughout the season, second-generation larvae were fit separately from first-generation larvae.

Model Evaluation/Selection. The model for each stage was selected on the basis of its ability to predict developmental milestones from the independent growth chamber experiment. This evaluation step determines the degree to which our model accurately reflects development in more natural temperature conditions. In 2011, wild-caught males were collected from central Illinois (*P. glaucus*) and mated to field reared virgin females from southeastern Pennsylvania (*P. glaucus*; *SI Appendix*, Fig. S3). Matings from these pairings, along with eggs collected from wild-caught females in central Illinois, resulted in 844 individuals from 22 families. Eggs were collected from ovipositing females laying on tulip tree leaves (see *Model Fitting*) and were placed into one of four treatments that simulated temperature conditions representing northern (Vilas County), central (Marathon County), and southern (Rock County) Wisconsin and central Illinois (Peoria County), reflecting a broad natural range of climatic

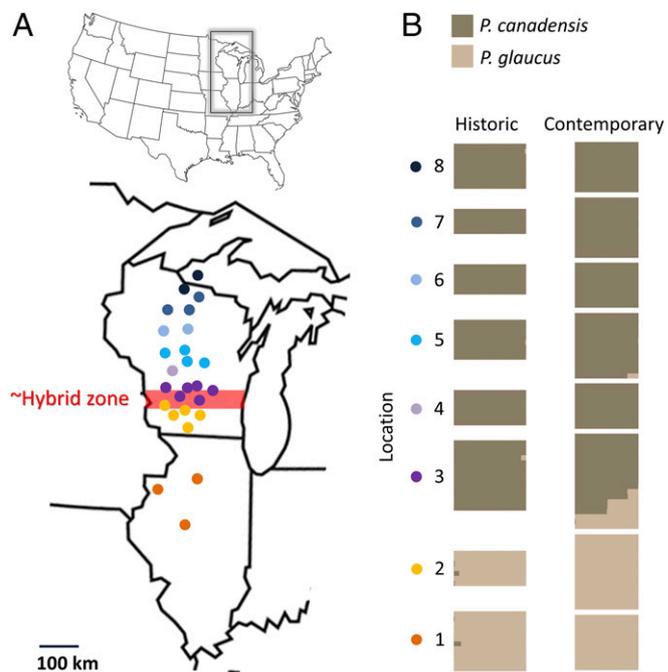


Fig. 5. Assessing genetic structure and frequency of hybridization in the *P. glaucus*–*P. canadensis* hybrid zone for historic (1980–1984) and contemporary (2007–2012) periods. (A) Sampling locations for each population used for analyses of genetic structure; points with the same color were pooled for analysis. (B) Bayesian clustering of ancestry proportion to $K = 2$ populations (see *SI Appendix*, Fig. S2 for $K = 1$ –5) based on 1,192 SNPs. Comparison of the proportion of hybrids (Q -value < 0.95 for either species’ cluster) based on Fisher’s exact test (two-tailed, $\alpha = 0.05$).

variation in the hybrid zone (*SI Appendix*, Fig. S3). Temperature profiles were created by averaging T_{\min} and T_{\max} for the years 1998–2008 (National Oceanic and Atmospheric Administration daily climate summaries) for each of the four sites. T_{\min} and T_{\max} were converted to hourly temperature profiles using the method of (57), where $T_h = T_{\text{avg}} + [(T_{\max} - T_{\min})/2] \times (\cos[0.2618 \times (h - d)])$, with T_h being the temperature at a given hour of the day, T_{\max} and T_{\min} the daily minimum and maximum temperature, and d the hour of day when the temperature is highest (T_{\max}); d was set to 15 for all locations. Therefore, these profiles included natural daily and seasonal variation. The temperatures were changed every other day (using the average temperature between the 2 d). Photoperiod was set as Coloma Wisconsin (putative hybrid zone) and was changed every other day (using the average photoperiod between the 2 d). Other rearing conditions were similar to those described in *Model Fitting*.

Parameter estimates for each of the seven fitted models were used to predict developmental milestones (completion of a developmental stage), using this independent dataset. Temperature data from each treatment were used as input in the model. The predicted days to completion of each developmental stage were then compared with the observed (known) number of days it took to complete a given stage of development. We calculated the RMSE for each developmental stage, and the model with the lowest RMSE was selected (*SI Appendix*, Fig. S7). Direct-developing and diapaused pupae were also evaluated separately because of differences in development between the two pupal conditions. All model validation was done in the R environment (R 3.0.2).

Simulations: Applying the Model to Climate Data.

Predicting historical changes 1980–2006. For each period (historic, 1980–1986; contemporary, 2006–2012), using the selected models, we predicted whether *P. glaucus* was able to complete two generations [i.e., successfully develop from a diapausing pupae to eclosion, to egg, to larva, to pupae, to eclosion as a direct-developing pupae, to egg, to larva, to pupae for each location (binary, yes/no); Fig. 1 and *SI Appendix*, Fig. S1]. This was done using daily minimum and maximum temperatures acquired from the Daymet 1×1 km gridded climatological dataset (58), resampled to 4×4 km spatial resolution, and averaged for each period as input. The latitudinal extent of this developmental threshold was then determined for each year as the highest latitude at which *P. glaucus* was able to

complete two generations from within 1° wide (longitudinally; centered on 75, 80, 85, and 90° W) transects running north–south.

Predicting future changes (climate scenarios). Using the same model fits and climate data used to predict changes in the climate-mediated development threshold (as described in *Model Fitting and Model Evaluation/Selection*), we calculated the highest latitude at which *P. glaucus* could complete two generations for a series of latitudinal transects (centered at 75, 80, 85, 90, 95° W; 1° wide) under a series of climate warming scenarios (by adding 0, 0.5, 1, 1.5, 2, and 2.5 °C to the average temperature of 2010–2015; Fig. 4). A linear regression was fit to these data (highest latitude to complete two generations × climate scenario for each latitudinal transect) to get an estimate of the rate of movement for every 1 °C warming (slope of each regression).

Assessing Historic Hybrid Zone Movement.

Specimens. Specimens of wild-caught males used for genetic and morphological analyses were collected between historic (1979–1987) and contemporary (2007–2013) periods from a latitudinal transect that spans the *P. glaucus*–*P. canadensis* hybrid zone in Wisconsin (Figs. 2 and 5 and *SI Appendix, Table S5*); historic specimens were pinned, dried, and kept in a museum collection before use (these specimens are now maintained in the Scriber collection at the McGuire Center at the University of Florida, Gainesville, FL).

Genetic and morphological markers. We measured 1,111 specimens for the species diagnostic morphological marker (59) (measured twice and the average value used), the width of the anal band in proportion to the width of the anal cell, and scaled to values between 0 and 1 [(value – minimum)/(maximum – minimum)]. We then genotyped 564 individuals for species diagnostic mtDNA (*COI*) haplotypes (60) and 385 individuals for a species diagnostic SNP in the lactate dehydrogenase (*Ldh*) gene. Additional, geographically clinal loci (allele frequencies changing from >0.8 to <0.2 across the hybrid zone) were identified from 200 (148 after filtering; see below) individuals from a reduced representation (ddRADseq) genome-wide set of SNPs; all contemporary samples were previously genotyped/sequenced (16).

Genomic DNA was isolated from leg tissue using a phenol:chloroform protocol (16); extractions of historic specimens were performed in a PCR-free room separately from contemporary samples. Reduced-complexity libraries were generated using a variation of the restriction site-associated DNA fragment (RAD) procedure, following that used in ref. 16, involving a double digest (ddRADseq) (25). Briefly, ~400–600 ng genomic DNA was digested using the restriction enzymes *EcoRI* and *MseI*. Individuals were barcoded using an *EcoRI* adapter containing a unique 8- to 10-base pair (bp) index. PCR product was pooled, purified with QIAquick Purification Kit (Qiagen), and size-selected (400–600 bp range) on a BluePippin System (Sage Science), and six individuals and a negative control (sample processed through all steps, but with no tissue added during DNA extraction step) were sequenced on an Illumina MiSeq and 96 individuals on a HiSeq 2000 (BGI, University of California, Davis), using 150- and 100-bp paired-end sequencing, respectively.

Raw reads were demultiplexed using a custom Perl script. Reads were trimmed and cleaned with the program TRIMMOMATIC (v.0.32, ref. 61), using default settings and clipping the first 20 bp from all reads (to remove barcodes and cutsite) and keeping only reads >30 bp in length. Forward unpaired reads were of lower quality and were further trimmed to 80 and 60 bp for MiSeq and HiSeq reads, respectively. Cleaned reads were then aligned to the *P. glaucus* genome (*glaucus_assembly_V1.1.fa*; prodata.swmed.edu/LepDB/), using BWA aln (with default parameters; version: 0.7.8) (62). Aligned reads were then cleaned with Picard (ver 1.33) and realigned with GATK's realigner (v3.4) (63, 64). SNPs were called using GATK's HaplotypeCaller v3.4, and indels and multiallelic sites were removed. The following filters were then applied to historic and contemporary biallelic SNP datasets separately. A minimum of 0.05 and a maximum of 0.95 was applied as the allele frequency filter, using

VCFtools v0.1.12b (65), followed by removal of individuals with a large amount of missing data (>95% and >90% for historic and contemporary samples, respectively). Sites not passing GATK's hard filtering (quality by depth < 2, Fisher strand > 60, rms mapping quality < 40, mapping quality rank sum test < –12.5, and read position rank sum test < –8) and genotypes with a genotype quality <20 were removed. Only SNPs with minimum of 6× coverage in 75% of individuals and present in both historic and contemporary libraries were retained, resulting in 1,192 SNPs. The chromosomal location of each ddRADseq SNP was based on the putative assignment previously determined using the mapping of *P. glaucus* peptide sequences to the *Bombyx mori* genome (16). We also tested for the presence of DNA damage in historic samples, using the program mapDamage ver 2.0.5–1 and by using a non-parametric Kruskal-Wallis Rank Sum Test to compare the frequency of all C > T and G > T substitutions between periods. There was no evidence of significant DNA damage in historic samples; the significant differences observed were biologically irrelevant (<1%) and in the opposite direction predicted: there were slightly fewer C > T and G > T substitutions in DNA from historic specimens (*SI Appendix, Fig. S8*).

Cline analysis. Clines were fit to 56 SNPs: 54 clinal (allele frequencies going from >0.8 to <0.2 across the transect in either period) RADseq SNPs found to be in Hardy-Weinberg equilibrium and the Z-linked (*Ldh*) and mtDNA (*COI*) markers. Cline fitting was done using a Metropolis-Hasting algorithm implemented in the HZAR package v2.5 in R (66) that fits a combination of equations (15 models) that describe the sigmoidal shape at the center of each cline and two exponential decay curves. The model with the lowest Akaike Information Criterion (67) was chosen for each SNP. We assessed whether the hybrid zone had significantly shifted or was widening/narrowing, using a Wilcoxon signed-rank test to compare the historic and contemporary distribution of cline center estimates for all genetic (ddRADseq, *Ldh*, *COI*) markers (Fig. 2). Loci were considered coincident or concordant if their high and low bound estimates for cline center or width (based on a 2-log-likelihood unit; comparable to 95% confidence intervals) overlapped with the average estimate (based on all 56 clinal genetic markers) for cline center or width, respectively.

Structure/admixture analysis. Temporal changes in admixture/genetic structure between the two periods (Fig. 5 and *SI Appendix, Fig. S2*) was assessed with a Bayesian clustering method implemented in STRUCTURE v2.3.4 (68, 69), using 1,192 SNPs (6× in 75% of individuals and pruned 1 SNP per 1 kb) with default settings: a 100,000 burn-in, 500,000 iterations, and K values from one through eight. These analyses were permuted 10 times.

To assess whether hybridization has changed over time, a Fisher's exact test (two-tailed) was used to compare the frequency of putative hybrids, using three different datasets: using Q-values (from STRUCTURE) to infer hybrids (Q-value <95% assignment to either cluster), putative F1s (individuals heterozygous for *Ldh*), and putative backcrosses (individuals *P. glaucus*-like for *COI* and *P. canadensis*-like for *Ldh*, or the inverse).

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