# The genetic composition of wild recruits in a recovering lake trout population in Lake Michigan 

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#### Abstract

Strain performance evaluations are vital for developing successful fishery management and restoration strategies. Here, we utilized genotypes from 36 microsatellites to investigate hatchery strain contribution to collections of naturally produced lake trout sampled across Lake Michigan. Strain composition varied by area, with recoveries of Seneca Lake strain exceeding expectations based on stocking records in northern Lake Michigan but performing similarly to other strains in southern Lake Michigan. Interstrain hybrids were present at moderate frequencies similar to expectations based on simulations suggesting that strains are interbreeding randomly. We hypothesize that the superior performance of the Seneca Lake strain in northern Lake Michigan is partially due to adaptive advantages that facilitate increased survival in areas with high mortality from sea lamprey predation such as northern Lake Michigan. However, when this selective pressures is lessened, the Seneca Lake strain performs similarly to other strains. Our study demonstrates that strain performance can vary across small spatial scales and illustrates the importance of conducting thorough strain evaluations to inform management and conservation.


## Introduction

Attempting to rebuild collapsed or extirpated fish populations through stocking of hatchery-reared individuals is a common practice, but the short- and long-term success of this approach is highly variable (George et al. 2009). Genetic analysis represents a powerful tool for monitoring the success of stocking programs and can provide important information to inform future propagation practices (Fraser 2008; Miller and Kapuscinski 2003). For example, genetic data can be used to assess strain contributions in systems where more than one strain was stocked (Miller et al. 2009), estimate introgression between wild and hatchery strains (Seamons et al. 2012), and understand potential fitness consequences when multiple strains are crossed (Huff et al. 2011). Genetic studies have provided important insights on the success of propagation programs; however, these types of analyses are still relatively rare compared to the massive inputs of propagated organisms released into the wild (Halverson 2008). Here, we utilize genetic tools to investigate strain-specific recruitment dynamics and introgression in lake trout from Lake Michigan, a heavily propagated species that has shown signs of population recovery.

Lake trout (Salvelinus namaycush) recovery efforts in the Laurentian Great Lakes are a prime example of the use of hatchery propagation to rebuild collapsed fisheries and represent one of the largest re-stocking efforts in the world. In Lake Michigan, as in most other Great Lakes, lake trout historically were the apex predator and supported large commercial and recreational fisheries (Holey et al. 1995; Wells and McLain 1973). Predation by invasive sea lamprey (Petromyzon marinus) and overfishing largely led to lake trout extirpation in Lake Michigan by the mid-1950s (Hansen 1999; Smith 1968; Wells and McLain 1973). In the late 1950s and 60s, management steps were taken to rebuild populations by the expansion of sea lamprey control, increased fishery regulation, and repopulation from stocking hatchery-reared fish (Heinrich et al.

2003; Holey et al. 1995; Wells and McLain 1973). Nine genetic strains of lake trout have been stocked into Lake Michigan since 1959 (Fig. 1). Most of these strains were derived from the lean (i.e. shallow water) form of lake trout and were captured in Lake Superior (Marquette, Apostle Islands, and Isle Royale) or Lake Huron (Parry/Big Sound). However, two strains (Green Lake and Lewis Lake) were derived from lean lake trout that were captured in Lake Michigan and stocked in smaller inland lakes (Jenny Lake/Lewis Lake, WY; Green Lake, WI) before lake trout were extirpated from Lake Michigan. Descendants of these fish were then captured from these smaller inland lakes to produce hatchery brood stock from remnant Lake Michigan genetic strains (Krueger et al. 1983; Page et al. 2004). Supplementation of the Green Lake broodstock in the 1980s also involved capturing feral fish uniquely fin-clipped from southern Lake Michigan as a gamete source (Kincaid et al. 1993). Additionally, the Seneca Lake strain was derived from lean lake trout native to Seneca Lake, NY, a finger lake in the Lake Ontario drainage, and the Klondike Reef strain was derived from the humper (i.e. deep water) ecomorphotype found in Lake Superior (see Muir et al. 2014 for context on lake trout ecomorphotypes). The strain composition of lake trout stocked into Lake Michigan has varied substantially over the last half century. From 1962-1990, most lake trout stocked in Lake Michigan were derived from the Marquette strain. Stocking in the 1990s and early 2000s consisted of primarily Lewis Lake and Apostle Islands strains. More recently, stocking has consisted primarily of Seneca Lake, Lewis Lake, Parry Sound, and Klondike strains (Kornis et al. 2019b) (Fig. 1).

Early stocking efforts were able to rebuild populations, as hatchery-reared fish survived well and aggregated for spawning, but there was little evidence of natural reproduction (Holey et al. 1995). In Lake Michigan this lack of successful natural reproduction was likely due to a number of factors acting simultaneously but mostly centered around insufficient numbers of
stocked fish and resulting spawning stock, inappropriate stocking locations, and poor survival of eggs and fry (Bronte et al. 2003; Hansen 1999). Modifications of stocking practices informed by these early efforts were made in the 1980s and included stocking fish on historically important offshore reefs instead of only nearshore sites, building up overall population densities, and introducing additional strains to promote genetic and ecological diversity (Bronte et al. 2008; Dexter et al. 2011; Holey et al. 1995). These modifications established spawning aggregations at some key sites (Bronte et al. 2007). However, natural reproduction of stocked fish remained rare, potentially due to predation on lake trout fry by invasive alewife (Alosa pseudoharengus) (Krueger et al. 2014; Krueger et al. 1995; Madenjian et al. 2008) and/or from thiamine deficiency attributed to alewife consumed by adult lake trout that results in poor survival of eggs and larvae (Brown et al. 2005). High mortality of adult lake trout from sea lamprey and/or fishing has also limited establishment of self-sustaining populations in some areas (Bronte et al. 2007; Kornis et al. 2019b). Since 2002, abundances of alewife in Lake Michigan have steadily decreased (Madenjian et al. 2018), and Hanson et al. (2013) reported that by 2005 stocked lake trout had begun to successfully reproduce in Lake Michigan, with wild lake trout comprising an average of $30 \%$ of the sport fishery by 2018 driven by wild recruitment in southern Lake Michigan (Kornis et al. 2019a), and similar proportions in fishery independent surveys (LMLTWG 2019).

Understanding the relative contributions of different genetic strains to emerging natural reproduction of lake trout in Lake Michigan is vital for shaping future management and restoration efforts. Fortunately, strains from Lake Superior, Lake Huron, Lake Michigan, and Seneca Lake are genetically distinct, making genetic assignment of wild fish of unknown genetic origin feasible (Page et al. 2004). There is also evidence of differential survival among strains,
which may be related to adaptive differences (McKee et al. 2004; Rogers et al. 2019; Scribner et al. 2018). For example, the Seneca Lake strain, which co-evolved with sea lamprey, appears to exhibit lower rates of sea lamprey-induced mortality compared to other strains (Bergstedt et al. 2003; Bronte et al. 2007; Schneider et al. 1996), while strains of Lake Michigan origin (Lewis Lake and Green Lake) appeared to have higher survival relative to Seneca Lake strain in southern Lake Michigan with low abundance of sea lamprey (Kornis et al. 2019b).

The overall goal of our study was to use genetic techniques to investigate the strain composition of wild lake trout produced in Lake Michigan. Our specific objectives were to: 1) identify a subset of microsatellite markers that reliably delineate strain of origin for the lake trout stocked into Lake Michigan; 2) determine if the genetic markers and reference data are capable of diagnosing the genetic heritage of interstrain crosses and wild caught lake trout; (3) analyze naturally reproduced lake trout of unknown origin captured in Lake Michigan to determine the relative contribution of different genetic strains; and (4) compare observed strain contributions with a composite estimate of expected strain compositions reconstructed from stocking records, age, survival, movement, and fecundity data to investigate differential reproductive success among strains and (5) determine if interstrain mating was random.

## Materials and methods

## Sample collection

We obtained lake trout tissue samples from eight hatchery strains (hereafter referred to as reference strains) and from 847 naturally produced lake trout captured throughout Lake Michigan (Tables 1,2). Tissue samples were fin clips preserved in $>95 \%$ ethanol or dried in scale envelopes. Hatchery reference strain samples were collected by the U.S. Fish and Wildlife Service from 1999-2015 (Table 1). The genetic structure of seven of the eight reference strains
included in the current study was evaluated by Page et al. (2004); the only strain not analyzed in Page et al. (2004) was Klondike Reef humper, which was not stocked until 2010. No samples from the ninth strain stocked in Lake Michigan, Clearwater Lake, were obtained as this stock was used infrequently and only before 1980. Naturally produced lake trout (Table 2) were collected from surveys conducted by the U.S. Fish and Wildlife Service, Chippewa Ottawa Resource Authority, Little Traverse Bay Band of Odawa Indians, Grand Traverse Band of Ottawa and Chippewa Indians, and the Wisconsin, Michigan, Illinois, and Indiana Departments of Natural Resources. Additional specimens were collected from the sport fishery by the U.S. Fish and Wildlife Services' coded-wire tagging and recovery program (Bronte et al. 2012). Lake trout caught in these surveys were classified as naturally produced if they did not have a coded wire tag or visible fin clip, as all hatchery-reared lake trout were marked/tagged prior to stocking. This classification is supported by work showing that the vast majority of Lake Michigan lake trout that lack a fin clip or coded wire tag are indeed of wild origin, as opposed to erroneously unclipped hatchery fish or migrants from Lake Huron (Landsman et al. 2017). Metadata collected on naturally produced lake trout included date and location of capture, total length (mm), weight (g), sex, maturity status, and age as estimated from otolith cross sections as described by Campana et al. (2008). The vast majority of naturally produced fish had survived early juvenile life-stages and $>95 \%$ of fish longer than 300 mm .

Naturally produced fish included in this study were sampled from across Lake Michigan, with the most fish sampled in the north and southwest areas of the lake. We constructed seven geographic strata based on available samples to facilitate spatial estimates of strain contributions (Table 2). These strata were drawn based on management district boundaries, with the exception of the Southern Refuge stratum, which was included as its own stratum due to high sampling
effort in the area and evidence that this area may be the source for many of the naturally reproduced lake trout in Lake Michigan (Kornis et al. 2019b; Patterson et al. 2016). It is important to note that numbers of fish captured in each stratum are a function of sampling effort and do not necessarily correlate with lake trout abundances in these strata. We did not conduct temporal analyses across years or seasons as sample sizes were insufficient for these comparisons.

## Laboratory analysis and quality control

Microsatellite genotyping of lake trout was conducted using methods similar to Ruzich et al. (2019). DNA was extracted with the Promega Wizard $\circledR$ Genomic DNA purification kit (Promega Corp., Madison, Wisconsin), following a 96-well configuration. Purified genomic DNA was quantified using a Nanodrop ${ }^{\circledR}$ ND-100 spectrophotometer (Nanodrop Technologies, Wilmington, Delaware), and normalized to a final concentration of $20 \mathrm{ng} / \mu \mathrm{L}$. PCR amplification was conducted to amplify 49 microsatellite DNA loci developed for lake trout as well as other salmonids (see Table S1 for multiplex information). An ABI 3730 DNA Analyzer (Life Technologies, Carlsbad, California) was used to separate PCR amplicons and determine allele sizes. Allele sizes were visually verified using Genemapper® software V4 (Life Technologies, Carlsbad, California) and allele calls were collated into a collection of multi-locus data for each individual. Approximately $15 \%$ fish were double scored as a quality control check.

After genotyping, we removed loci with $>30 \%$ missing data, loci that produced peaks that were difficult to score due to stutter banding, loci that were monomorphic, and loci that deviated from Hardy-Weinberg or linkage disequilibrium in more than half of the eight reference strains. Deviations from Hardy-Weinberg or linkage disequilibrium were assessed with exact tests conducted in Genepop V4 (Rousset 2008) (alpha $=0.05$ ). We also removed individuals with
$>50 \%$ missing data and individuals that showed evidence of contamination ( $>2$ alleles at $>2$ loci).

## Statistical analysis of reference strains

We calculated basic summary statistics for the reference strain dataset to investigate variation in genetic diversity across loci and strains. Observed and expected heterozygosity ( $H_{\mathrm{O}}$, $H_{\mathrm{E}}$ ) were calculated in GenAlEx (Peakall and Smouse 2012), number of alleles $(A)$ and allelic richness $\left(A_{\mathrm{R}}\right)$ were calculated in FSTAT (Goudet 1995), and locus-specific $F_{\mathrm{ST}}$ and $F_{\text {IS }}$ (Weir and Cockerham 1984) were calculated in Genepop. We also used Genepop to calculate pairwise $F_{\text {ST }}$ values for each population pair. Finally, we constructed a neighbor-joining dendrogram based on Nei's $D_{\text {A }}$ distance (Nei et al. 1983) in POPTREE2 (Takezaki et al. 2010) to visualize genetic relationships among populations. Support for each node was assessed with 1,000 bootstrap replicates.

We used the Bayesian MCMC approach implemented in STRUCTURE 2.3.4 (Pritchard et al. 2000) to infer the number of major genetic clusters in our data. This program groups individuals into K genetic clusters by minimizing overall deviations from Hardy-Weinberg and linkage equilibrium within clusters. STRUCTURE was run on K-values from 1-10, ten runs were conducted for each K-value, and each run consisted of a burn-in period of 10,000 iterations followed by 100,000 iterations. We selected the "admixture model" and "use location as prior" options in STRUCTURE as suggested by Hubisz et al. (2009), who found that the "use location as prior" option facilitated detection of population structure at lower levels of divergence. The most likely value of K was evaluated based on likelihood values as well as with the $\Delta \mathrm{K}$ method (Evanno et al. 2005), and the results were summarized with Structure Harvester (Earl and
vonHoldt 2012). We also used the program CLUMPAK (Kopelman et al. 2015) to assess convergence among runs and generate consensus data for each K -value.

## Assignment of unknown individuals to strain of origin

A primary objective of the current study was to determine if our reference dataset had sufficient power for assigning individuals of unknown origin to their natal genetic strain and classifying individuals as either pure or interstrain crosses (i.e., hybrids). To assess our assignment power, we simulated 1,000 individuals from all possible pure and F1 crosses of our reference strains with the program HYBRIDLAB (Nielsen et al. 2006). For this analysis, we combined the Isle Royale, Apostle Islands, and Marquette collections into a single Lake Superior strain because they are genetically similar (see Results). We then assessed our ability to assign simulated individuals to their strain of origin by calculating posterior probabilities of assignment in STRUCTURE. STRUCTURE was run at $\mathrm{K}=6$ (see Results) with the reference strains classified as known individuals (POPFLAG=1) and the simulated individuals classified as unknowns (POPFLAG=0), and run parameters were the same as above. HYBRIDLAB does not simulate missing data, but $<3 \%$ of genotypes were missing from individuals on average indicating that simulated results should be comparable to results from empirical data.

After exploratory analysis using a range of cutoffs and comparing results to simulated (i.e. known proportion) samples, we determined that the highest assignment accuracies were achieved with a cutoff of 0.7 . That is, if an individual had an assignment probability (i.e. qvalue) $>0.7$ for a given strain, that individual was classified as pure, and if an individual had an assignment probability $<0.7$, it was classified as a hybrid. All individuals with assignment probabilities $<0.7$ were classified as F1 hybrids between the top two contributing strains. A probability cutoff of 0.7 was shown to produce high assignment accuracy for F 1 hybrids between
populations with similar $F_{\mathrm{ST}}$ values as those in our study and using a similar numbers of markers as we genotyped (Vaha and Primmer 2006) providing further evidence that our approach should be robust.

We then compared the mixture estimates for simulated crosses derived from STRUCTURE to mixture estimates derived from the program ONCOR (http://www.montana.edu/kalinowski/Software.htm). ONCOR outperformed STRUCTURE for pure crosses, but substantially underperformed STRUCTURE for hybrid crosses (see results). We proceeded with assignment using STRUCTURE since a high proportion of the fish in our study were classified as putative hybrids, and high error assigning hybrid crosses would lead to high error in our mixture estimates. This large discrepancy between STRUCTURE and ONCOR indicates that the mixture calculation algorithm employed in ONCOR and similar programs may not be well suited for estimating mixture proportions when hybrids are present. Unfortunately, the STRUCTURE approach does not facilitate the estimation of confidence intervals. However, we do discuss how strain-specific error rates may influence estimates in the results section.

After conducting assignment tests and choosing an approach for mixture analysis, we assigned naturally produced individuals to their strain of origin using the same methods. It is important to note that since natural reproduction of lake trout has likely been occurring for $<1$ generation in Lake Michigan (Hanson et al. 2013), we assumed all hybrids in the population are F1 hybrids for this analysis. If advanced generation hybrids were present, they may be assigned as pure, but we believe this is highly unlikely as there were only four fish in our dataset over the age of 20 and these could have represented individuals where fin clips to denote hatchery origin had regrown. To determine the observed proportional contribution for each strain among the samples collected, we needed to account for both pure and hybrid contributions. We therefore
assigned hybrids $50 \%$ of the weight of pure individuals. For example, for a mixture containing 30 pure Seneca Lake fish, 20 Seneca Lake x Lewis Lake hybrids, and 10 pure Lewis Lake fish, the proportion of Seneca ancestry is calculated as $\left(30+\left(0.5^{*} 20\right)\right) / 60=66 \%$.

We derived $95 \%$ confidence intervals for proportional estimates using the prop.test function in R and the estimated assignment accuracy for each strain derived from simulated individuals. The prop.test function produces a confidence interval that incorporates sample size but does not take into account assignment accuracy for each strain. Therefore, we expanded these confidence intervals based on assignment accuracy. For example, if the original confidence interval calculated with prop.test was 0.5-0.6 and the assignment accuracy to a given strain was 0.9 , the adjusted confidence interval would be $0.45-0.66$. This approach is conservative and takes into account both sampling error and assignment accuracy. For estimates that included both pure and hybrid crosses, assignment accuracy was the average assignment accuracy of all crosses included in the estimate.

## Calculating expected strain and cross contributions

Deriving the expected strain proportions based on stocking levels is vital for investigating strain-specific differences in survival and reproductive success. We sought to compare expected proportions with empirical observations to determine strain contributions to natural reproduction relative to stocking levels. Our general approach for deriving strata-specific expected strain proportions was to use a composite method to reconstruct the strain proportions of the spawners that produced the lake trout that we sampled. This analysis required data on stocking rates, age composition, fecundity, and movement patterns. In general, the expected proportions of each strain were relatively similar to the stocking rates of that strain during the brood year the parents of most naturally produced fish were produced (generally the early 2000s). However, other
factors such as movement and age-specific fecundity make it inappropriate to simply use the stocking and age data alone. It is also important to note that these expected proportions do not incorporate any direct measures of survival of stocked strains or recruitment across strains or strata, as data on these metrics is sparse. As such, they do not reflect the actual strain composition of spawners, but rather our best estimate of what the strain composition should have been given stocking records and other metrics. Differences in survival or recruitment among strains and strata are not incorporated into these estimates thus any differences in observed and expected strain proportions of naturally produced fish may be a result of these two metrics, among others (see discussion).

To calculate estimates of expected strain proportions, we first derived the cohort (i.e., year class) of all naturally produced lake trout in our study using the year of capture minus the otolith age, and then calculated cohort proportions for each stratum. We then used spawner survey data collected according to Schneeberger et al. (1998) to calculate the age composition of spawners for each cohort and stratum. Only ages 6-20 were included in this analysis because six is the age when most lake trout reach sexual maturity in Lake Michigan (Madenjian et al. 1998) and very few spawners were older than 20 . Spawner age compositions were corrected with a fecundity multiplier (Table S2) because older fish (at least up to 20 years old) are expected to produce more offspring than younger fish (e.g., Peck 1988). Fecundity multipliers were calculated from predicted mean total length of lake trout at each age in each strata using the relationship between fecundity and total length presented by Fitzsimons and O'Gorman (1996) for lake trout from Lake Ontario. Predicted mean lengths-at-age were determined from von Bertalanffy growth models fit to age/length data from spawner surveys, and fecundity multipliers were expressed relative to expected fecundity at the minimum age of maturity (age 8 for

Southern Refuge, age 6 for all other locations) (See Supplementary File 1 for additional details). Next, we obtained stocking proportions by year and stratum from available stocking data (USFWS and GLFC 2017). We then weighted these stocking proportions based on the cohort composition of the naturally produced fish and the age composition and estimated relative fecundity of spawners in each stratum to obtain a stratum-specific expected stocking proportion. Finally, we corrected for movement of lake trout spawners among strata by multiplying stocking proportions by a movement matrix (Table S3). Movement data were derived from coded-wire tagged lake trout, which provided data on both stocking and recovery location (M. Kornis and C. Bronte, unpublished data). Movement was expressed as the percentage of lake trout spawners recovered in each stratum that were expected to originate from other strata. See Supplementary File 2 for details.

We also calculated the expected proportion of each cross type (i.e. pure versus hybrids) under random mating to investigate whether hybrids or certain cross types were over or underrepresented in samples of naturally produced fish. Expected proportions of each cross type in each strata were calculated using either observed strain proportions based on genetic data or expected strain proportions based on stocking data. The hypothetical spawning population used to estimate these proportions was assumed to contain only pure strain individuals, a reasonable assumption given that meaningful natural reproduction of lake trout in Lake Michigan is a relatively recent development. Proportions were calculated as follows: the proportion of pure strain individuals was calculated as the strain of those individuals in the current generation squared and the proportion of interstrain hybrids was calculated as two times the proportion of strain one times the proportion of strain two. For example, if the proportion of the Seneca strain in a given strata was 0.7 and the proportion of the Green Lake strain was 0.3 the expected
proportion of pure Seneca strain fish is $0.7^{2}=0.49$ and the proportion of Seneca $x$ Green Lake hybrids is $2 * 0.7 * 0.3=0.42$.

## Results

## Laboratory analysis and quality control

We attempted to genotype 49 microsatellite DNA loci and retained 36 that produced high quality data (Table S4). Of the 49 original loci, we removed four that were monomorphic in our dataset, three that had $>30 \%$ missing data, two that were difficult to score (i.e. produced ambiguous allele peaks), two that were out of Hardy-Weinberg equilibrium, and two that were in linkage disequilibrium with another locus (Table S4). The loci that we retained had an average of 13 alleles in our dataset (range: 2 to 38 ), an average $H_{\mathrm{O}}$ of 0.56 (range 0.00 to 0.93 ), and an average $F_{\text {ST }}$ of 0.04 across strain comparisons (range 0.00 to 0.18 ). We genotyped 1,485 individuals at the 36 loci that we retained and removed 34 individuals with $>50 \%$ missing data, 42 putatively contaminated individuals, and one individual that was likely a migrant from Lake Huron (see below), resulting in a final dataset of 1,409 individuals (genotype data in Table S5).

## Reference strain analysis

Genetic structure among reference strains was relatively high, with pairwise $F_{\text {ST }}$ values averaging 0.04 (Table 3). In general, population structure was partitioned by lake of origin, with the largest differentiation in the dataset observed between Seneca Lake and all other populations (Fig. 2, Table 3). Three of the four populations in Lake Superior (Marquette, Apostle Islands, Isle Royale) were genetically similar ( $F_{\mathrm{ST}}<0.01$ ), and the Klondike Reef strain also grouped with these populations according to the neighbor-joining dendrogram but was more divergent (Fig. 2). Green Lake and Lewis Lake, which were both derived from Lake Michigan, displayed an $F_{\text {ST }}$ of 0.04 , indicating that they are diverged even though they are derived from a similar
geographic area. Genetic diversity was relatively similar among strains, with $H_{\mathrm{O}}$ ranging from 0.55 to 0.57 . However, the three lean populations from Lake Superior did contain slightly more alleles (average $A=9.79$ and effective $A=5.29$ for Superior leans, 7.61 and 4.27 respectively for the rest of the dataset).

Results from STRUCTURE analysis were largely congruent with patterns of population structure suggested by $F_{\mathrm{ST}}$ values and the neighbor-joining dendrogram (Fig. 3). However, we were able to observe some potential population admixture that was not apparent with the other analyses. Analysis of multiple $K$-values revealed that the largest $\Delta K$ occurred at $K=2$ followed by $\mathrm{K}=4$ and $\mathrm{K}=6$ (Table S 6 ). However, the likelihood of each K increased substantially until $\mathrm{K}=6$, where it began to plateau (Table S6). $\mathrm{K}=6$ displayed low variance among runs and was also the first K where the Parry Sound population formed its own cluster. For these reasons, we chose to visualize our data at $\mathrm{K}=6$ and use this K for assignment of unknown individuals (see below). The genetic clusters at $\mathrm{K}=6$ generally correspond to Seneca Lake, Parry Sound, Lewis Lake, Green Lake, Klondike Reef and Lake Superior lean (includes Marquette, Apostle Islands, and Isle Royale) (Fig. 2). The Seneca Lake, Parry Sound, Lewis Lake, Green Lake, Apostle Islands and Isle Royale reference strains displayed little admixture, with the vast majority of individuals in each strain appearing pure. However, we did observe substantial admixture in the Klondike Reef strain, where $\sim 20 \%$ of individuals were genetically similar to the Lake Superior lean cluster and $80 \%$ formed a genetically distinct cluster. We also observed apparent admixture from the Lewis Lake strain in the Marquette sample, which suggests that these strains may have introgressed in the hatchery at some point.

Assignment of accuracy of simulated individuals

We constructed five reporting groups for assignment based on STRUCTURE analysis and preliminary assignment tests: Seneca Lake, Parry Sound, Lewis Lake, Green Lake, and Superior (Table 1). We originally included a separate reporting group for Klondike Reef, but low assignment accuracy ( $63 \%$ correct for pure simulations) prompted us to combine Klondike Reef with the rest of the Lake Superior populations to form a single reporting group. Correct assignment of pure crosses was $91 \%$ on average and correct assignment of F1 interstrain hybrids was $83 \%$ on average (Table 4). Misclassification of cross type (i.e. pure or hybrid) was rare, with zero simulated pure individuals identified as putative hybrids, and $<5 \%$ of simulated hybrid individuals identified as pure. Pure and hybrid crosses from Seneca Lake and Parry Sound had the highest assignment accuracies ( $>95 \%$ for pure crosses, $91 \%$ for Seneca x Parry Sound hybrid cross), while strains from Lake Superior had lower accuracy ( $75 \%$ for pure cross, $\sim 80 \%$ for hybrid crosses between Superior and other strains). The lower assignment accuracy for the Lake Superior strain was largely caused by misassignment of simulated individuals to the Lewis Lake reporting group, an expected result given the admixture observed in the STRUCTURE analysis. Fortunately, most naturally reproduced lake trout with Lake Superior ancestry found in Lake Michigan are likely to be derived from the genetically pure Apostle Island strain, as the Marquette strain was not stocked at high numbers after 1990. This means that our realized assignment accuracy for Lake Superior strains is likely higher than the $75 \%$ derived with simulations.

Assignment accuracy of mixture proportions was higher for pure strains using ONCOR but much higher for hybrid crosses with STRUCTURE (Table 4). ONCOR performed poorly for all hybrid crosses except Seneca x Parry, with substantial mis-assignment to the Superior group across many different crosses. Accuracy of mixture proportions was generally high with

STRUCTURE, with the lowest accuracy to the Superior pure strain (87\%). The lowest accuracy to hybrid classes with STRUCTURE was $44 \%$ (expected 50\%) for the Green Lake strain in two crosses. Although we were unable to construct confidence intervals from the STRUCTURE analysis, data from mixtures of simulated individuals does provide information on potential sources of error. Superior strain fish are misclassified most frequently, with pure Superior individuals being classified as Lewis Lake 7\% of the time and Green Lake 3\%. Mis-assignment in the hybrid crosses often consisted of individuals from Green Lake or Lewis Lake strains being assigned to Lake Superior. These results indicate that estimates for the Lake Superior strain could be slightly higher or lower than reported depending on the number of hybrids found in the mixture. However, we are highly confident that our estimates are within a few percent of the correct proportions given the relatively low error rates in general with the STRUCTURE analysis.

## Strain composition of naturally produced lake trout

All but one of the 848 naturally produced lake trout that we analyzed were assigned to a strain that has been stocked into Lake Michigan. The single exception was a five-year-old fish which assigned as a Parry Sound x Superior hybrid and was likely a migrant from Lake Huron based on stocking history of the Parry Sound strain in Lake Huron. We subsequently removed this sample from the dataset. Metadata for all naturally produced lake trout is in Table S7.

The Seneca Lake strain was the most frequent genetic origin of wild fish captured in Lake Michigan and was found at proportions $>50 \%$ for six of seven spatial strata (Fig 4, Table 5). The sole exception was the Grand Traverse Bay stratum, where the Seneca Lake strain was encountered at $26 \%$ compared to $52 \%$ for the Lewis Lake strain. Although there were few clear spatial differences in strain composition in strata outside of Grand Traverse Bay, the proportion
of the Green Lake strain did appear to increase from North to South. Additionally, the proportion of the Superior strain appeared to be higher on the west side of the lake. The proportion of pure and hybrid crosses was extremely similar on average ( $52 \%$ pure, $48 \%$ hybrid), with six of seven strata displaying proportions of pure crosses between $39 \%$ and $60 \%$ (Table S8). Interestingly, the north stratum displayed the highest percentage of pure crosses $(75 \%)$, with most of these ( $60 \%$ of total sample) represented by the Seneca Lake strain.

## Comparison between observed and expected strain contributions

The expected stocking proportions that we derived largely reflected stocking proportions in the early 2000s, as this is the period when the fish that produced the natural recruits we sampled were likely stocked. In this time period, the four major genetic strains that we investigated (Seneca Lake, Lewis Lake, Green Lake, and Lake Superior), were stocked at similar rates ranging from $19 \%$ overall for Seneca Lake to $32 \%$ overall for Lake Superior (Table 5). However, these proportions varied among spatial strata, with Lewis Lake and Superior stocked at higher numbers in the northern part of Lake Michigan and Green Lake and Seneca Lake stocked more in the South.

Comparisons of strain proportions derived from genetic data to expected proportions calculated using the composite method described above revealed that the Seneca Lake strain was found at higher proportions than expected, but that this pattern varied among strata (Fig. 5, Table 5). Seneca Lake outperformed expectations based on stocking for all strata and was overrepresented by $38 \%$ on average (range $12 \%$ to $66 \%$, Table 5). Contrastingly, the Superior and Green Lake strains performed the poorest on average, and underperformed expectations by $\sim 15 \%$ (range underperform by $46 \%$ to overperform by $6 \%$ ). The Lewis Lake strain was
intermediate, underperforming expectations by $9 \%$ on average (range underperform by $21 \%$ to overperform by 3\%.)

Strain performance was highly variable by area, with the largest differences in performance among strains observed in the North stratum and the smallest differences observed in the Southern Refuge and Grand Traverse Bay strata (Fig. 5, Table 5). For example, in the North stratum, the only highly successful strain appeared to be Seneca Lake, whereas in the Southern Refuge and Grand Traverse Bay strata, most strains performed similarly to expectations based on stocking. This spatial variation is well illustrated by the Lake Superior strain, which performed poorly in the North stratum but exceeded expectations by $5 \%$ on average in the Southwest and Southern Refuge strata. Of the four strains, only Green Lake failed to exceed stocking expectations in two or more strata, indicating that this strain may perform poorly regardless of where it is stocked.

When composite estimate of expected strain compositions reconstructed from stocking records (i.e. expected proportions in Table 5) were used to estimate the proportion of each cross type that should be observed based on random mating, these estimates differed substantially from what we observed in our genetic data (Fig. 6, Table S8). However, when random mating simulations were conducted based on observed genetic proportions (i.e. observed proportions in Table 5), differences in the frequency of each cross type between observed and expected data were minimal. The large differences between stocking proportions and observed genetic proportions for each cross type (Fig. 6a) is likely a result of differential survival among strains. However, the fact that there are few differences between observed and expected proportions of each cross type based on genetic data (Fig. 6b) suggests that there is no substantial fitness
difference between pure and hybrid cross types, that is, there is no strong evidence of either hybrid inferiority or hybrid vigor.

## Discussion

## Genetic differentiation of reference strains and accuracy of strain assignment

The patterns of genetic differentiation among strains that we documented were similar to those observed in past studies using allozymes and microsatellites (Marsden et al. 1989; Page et al. 2004; Page et al. 2003). For example, Page et al. (2004) genotyped seven of the eight strains that were analyzed in the current study with a panel of nine microsatellites and also found that Seneca Lake and Parry Sound strains were highly diverged, with less divergence among strains derived from Lake Superior and remnant Lake Michigan populations. Additionally, our results and those of Page et al. (2004) indicated that Lewis Lake and Green Lake broodstock, which were both derived from Lake Michigan lake trout, have diverged substantially during captivity and release into other systems. It is possible that some of this differentiation may be due to genetic drift caused by moderate population bottlenecks as postulated by Page et al. (2004). However, the complex histories of these strains make it difficult to determine why they are differentiated from each other. While genetic diversity of the strains analyzed here appears to be adequate, with no major differences in genetic diversity among strains, some of these strains appear to have been substantially modified through domestication and hatchery practices, highlighting the importance of propagation strategies that maintain genetic integrity (e.g. Waters et al. 2015).

The only strain that we analyzed that was not analyzed by Page et al. (2004) was the Klondike Reef strain; we found that approximately $20 \%$ of fish in this strain were genetically similar to Lake Superior lean collections and $80 \%$ represented a distinct genetic cluster, probably
composed of Klondike Reef humpers. This pattern was also observed by Salvesen (2015), who conducted assignment tests and found approximately $20 \%$ misassignment of this strain to Lake Superior lean populations. It is possible that the Klondike Reef broodstock may contain approximately $20 \%$ lean lake trout and $80 \%$ humper lake trout, but genetic data are not diagnostic for ecotype (Perreault-Payette et al. 2017). Finally, we documented a small amount of potential admixture between the Marquette and Lewis Lake strains, which was also observed using assignment tests by Page et al. (2003). This admixture is likely the result of complex genetic history, as the Marquette strain is the oldest lake trout broodstock used in the Great Lakes, was derived from several sources in Lake Superior, and has intermittently been mixed with others (Page et al. 2004). For example, in the 1960s lake trout from the Apostle Islands and Green Lake hatchery strain were added to the Marquette broodstock (Krueger et al. 1983).

We were able to assign fish of unknown origin to reference strains with relatively high accuracy despite the small amounts of genetic admixture described above. Strain assignment of lake trout in the Great Lakes has been conducted for over 30 years, first with allozymes (Marsden et al. 1989) and more recently with panels of 4 to 15 microsatellites (DeKoning et al. 2006; Page et al. 2003; Roseman et al. 2009; Scribner et al. 2018). These previous studies have generally been able to assign individuals to pure crosses with relatively high accuracy, but assignment of interstrain crosses has been difficult. Recently, Scribner et al. (2018) used genotypes from 15 microsatellites and a modification of the Rannala and Mountain (1997) assignment algorithm developed by Gaggiotti et al. (2004) to estimate assortative mating probabilities among strains. While this approach provides important information on assortative mating, it is still not possible to calculate the frequency of a given cross type to determine if certain cross types are found more or less frequently than expected. Fortunately, the increase in
assignment power facilitated by genotyping 36 microsatellites compared to 15 allowed us to assign individuals to cross type with relatively high accuracy, representing a significant advance for studies of lake trout strain composition. However, assignment accuracy for certain crosses was still somewhat low ( $<80 \%$ for three comparisons), and accurate assignment past F1 crosses is likely impossible with the current methods; these assignment accuracies could be increased using genomic tools (Allendorf et al. 2010), which are currently being developed by K. Scribner at Michigan State University.

## Relative performance of reference strains

Strain assignment of naturally produced lake trout captured throughout Lake Michigan indicated that the Seneca Lake strain was overrepresented in most geographic strata, whereas the other strains were underrepresented on average with some variation among strata. Here, we focus on the Seneca strain as it was most consistently overrepresented (see below), but it is also important to note that the Green Lake strain performed poorly in every strata where it was stocked in at least moderate numbers. It is possible that the long history of domestication in this strain led to inbreeding depression or domestication selection, making it maladapted to the wild compared to other strains (reviewed in Christie et al. 2014). Performance of the Lewis Lake and Lake Superior strains was more variable, with the Lewis Lake strain performing similar to or exceeding expectations in the Traverse Bay and Southern Refuge strata and the Superior strain performing similar to or exceeding expectations in the Southwest and Southern Refuge strata. This spatial variation in strain performance provides important information for managers that can potentially be used to inform stocking with the goal of maximizing post-release survival and increase the probability of producing wild recruits.

Although we generally interpreted our results based on point estimates for stock compositions, understanding and interpreting uncertainty in our data is also important. The two major sources of uncertainty in our data are uncertainty due to finite and sometimes relatively small sample sizes (e.g. as low as 77 fish in the East strata) and uncertainty due to variation in assignment accuracy across strains (as low as $75 \%$ accuracy for the pure Superior strain). Our approach for constructing confidence intervals integrated both of these sources of uncertainty, and uncertainty due to sample sizes was much more influential than uncertainty due to assignment accuracy. Specifically, weighting for assignment accuracy increased the size of confidence intervals by a maximum of about 0.15 , while variation in sample sizes changed the size of confidence intervals much more substantially. Fortunately, differences between observed and expected strain proportions are generally very large across our dataset, making our inferences highly robust despite relatively wide confidence intervals.

The Seneca Lake strain was overrepresented based on expectations from stocking in the northern and, to a lesser degree, southern areas of the lake, but the proportional contribution of the Seneca Lake strain was similar to expectations in the Southern Refuge and Grand Traverse Bay. Previous analyses using genetic assignment to estimate strain composition of naturally produced lake trout in Lakes Ontario, Huron, and Michigan have generally found that the observed contributions of the Seneca Lake strain are higher than expected (DeKoning et al. 2006; Marsden et al. 1989; Page et al. 2003; Roseman et al. 2009; Scribner et al. 2018). In Lake Michigan, both Page et al. (2003), who conducted genetic analysis on young-of-the-year samples from Little Traverse Bay (northeastern Lake Michigan), and DeKoning et al. (2006), who analyzed fry and egg samples from southern Lake Michigan, also documented higher than expected proportions of Seneca Lake individuals among naturally produced recruits. However,
relative survival results based on coded wire tag (CWT) recoveries of adults in Lake Michigan do not necessarily reflect the same trends (Bronte et al. 2007; Kornis et al. 2019b; McKee et al. 2004). Earlier CWT studies in Lake Michigan (Bronte et al. 2007) and Lake Huron (Eshenroder et al. 1995) found greater survival of Seneca Lake strain compared to Lewis Lake strain. By contrast, a more recent analysis of CWT returns from 1993-2003 year-classes found that the Seneca Lake strain had lower relative survival compared to Lewis Lake and Green Lake strains when stocked in southern Lake Michigan (Kornis et al. 2019b). Findings from our study appear more similar to recent results from CWT data than from genetic analysis of eggs and fry. However, it is difficult to decipher whether differences between studies are the result of samples being collected in different time periods or at different life stages. Nevertheless, our study illustrates the importance of conducting spatially representative sampling when evaluating strain performance, as our results suggest that dynamics that lead to differences in strain representation are multifaceted and spatially variable (see discussion of Seneca strain dynamics below).

Overrepresentation of Seneca Lake strain may stem from a combination of movement of wild fish after recruitment and characteristics of the strain that facilitate survival in challenging environments. The Seneca Lake strain was most overrepresented in northern Lake Michigan, where lake trout experience high mortality from predation by sea lamprey as well as exploitation by commercial and, to a lesser extent, recreational fisheries (Kornis et al. 2019b). These sources of mortality have resulted in a truncated age distribution in northern Lake Michigan, with fewer sexually mature fish compared to other areas (Bronte et al. 2007; Kornis et al. 2019b) and, as a result, little evidence of natural reproduction has been observed (Kornis et al. 2019a; LMLTWG 2019). In contrast, lake trout in southern Lake Michigan, in particular the Southern Refuge, are not as exposed to sea lamprey predation or fishing mortality and hence have higher densities of
older, mature fish that substantially contribute to natural reproduction in Lake Michigan (Bronte et al. 2007; Kornis et al. 2019b). The Seneca Lake strain is stocked heavily in southern Lake Michigan and especially on the Southern Refuge, therefore, many of the sexually mature fish in this area are Seneca Lake strain. We hypothesize that a partial explanation for the high proportion of naturally produced Seneca Lake strain fish in many parts of Lake Michigan, especially the north, is that these fish were produced in southern Lake Michigan and then migrated to other parts of the lake.

Our estimates of expected proportions accounted for movement of spawners (stocked fish) among strata but were not weighted for potential reproductive output. That is, estimated proportions assumed of equal potential for reproduction in all strata. Although wild reproduction has been observed on other reefs in Illinois (Patterson et al. 2016) and is likely occurring at several locations around the lake, it is likely there are recruitment hotspots given the habitat requirements for lake trout reproduction (e.g., Marsden et al. 1995) and the fact that wild lake trout reproduction in Lake Michigan is a relatively recent development. Our results, although not conclusive, are consistent with what would be expected if disproportionately high levels of recruitment occurred on the Southern Refuge with dispersal to other strata thereafter. The Southern Refuge is rich in spawning habitat, protected from exploitation, has a robust age structure of parental stock, and a high abundance of spawners (Dawson et al. 1997; Kornis et al. 2019b). The same can be said for Julian's Reef and other reefs in Illinois (Patterson et al. 2016), but spawner populations are likely largest on the Southern Refuge due to more habitat, higher stocking levels, and lower total mortality. Movement of stocked fish from the Southern Refuge to all strata was high, with the exception of northern Lake Michigan and Grand Traverse Bay (Supplementary File 2). However, even a low rate of immigration of wild fish from southern

Lake Michigan to the north could still explain overrepresentation of Seneca strain in this area as most stocked fish recovered in the north stratum originated there, and recruitment in this area is likely near zero as suggested by survey data (Kornis et al. 2019b).

Another possible explanation for the higher frequency of the Seneca Lake strain in northern Lake Michigan is unique and heritable characteristics that may make them more successful in the northern part of the lake (Bronte et al. 2007). The Seneca Lake strain appears to occupy cooler and deeper water than other strains, likely reducing their encounter rate with sea lamprey (Schneider et al. 1996). Others have noted that Seneca Lake strain have a relatively fast growth rate compared to other strains and linked this to bathythermal distribution, a heritable trait (Elrod et al. 1996; Royce 1951), although this did not appear to translate into differences of age-at-maturity (Elrod et al. 1996). We hypothesize that the high frequency of the Seneca Lake strain in northern Lake Michigan is likely a result of both the movement patterns described above as well as the life history characteristics of this strain that facilitate increased survival.

Our results suggest that strain performance can vary substantially across relatively small spatial scales potentially due to heritable genetic differences among strains. Heritable genetic differences in traits such as run timing (Prince et al. 2017), temperature tolerance (Philipp and Whitt 1991), and spawning habitat preferences (Jennings et al. 1996) have been frequently documented in fish. Additionally, management agencies often stock multiple genetic strains of fish with the goal of providing robust fisheries and increased fishing opportunities (Bartron et al. 2004; Miller et al. 2009). However, while strain evaluations often find substantial differences in behavior or survival among strains (Van Offelen et al. 1993), these studies are relatively rare and are often isolated to small geographic areas. Our study illustrates the importance of conducting thorough strain evaluations to gain a more complete picture of strain performance; we suggest
that management agencies undertake these types of studies more frequently to improve stocking efficiency and promote robust fisheries.

## Frequency of interstrain hybrids

The expected proportions of each cross type based on stocking data were substantially different than observed proportions but observed and expected proportions were generally similar when expected proportions were calculated based on genetic data. We hypothesize that the large differences in expected cross type frequencies calculated from stocking data are largely a function of differences in strain survival and movement patterns (discussed above). Additionally, we hypothesize that the relatively small differences between observed and expected proportions based on genetic data indicate that the strains are generally breeding randomly, and that there is no substantial fitness advantage or disadvantage for F1 hybrids. It is notable that the frequency of crosses including Seneca Lake are also similar to expectations, especially in the southern area of the lake. Seneca Lake fish likely occupy different depths (see above), yet this does not seem to facilitate any reproductive isolation from the other strains, which suggests similar spawning habitat and behavior.

Our results differ slightly from those of Scribner et al. (2018), who documented departures from random mating in early generations of lake trout natural reproduction in Lake Huron and hypothesized that F1 crosses could have lower fitness. However, in Scribner et al. (2018) mating appeared to become more random in subsequent generations suggesting that interstrain crosses are common and relatively fit in Lake Huron. Both our study and Scribner et al. (2018) indicate that interstrain hybridization is common in lake trout inhabiting the Great Lakes; if random mating in these populations continues, the populations will likely resemble a
hybrid swarm (i.e. a population composed mostly of hybrid individuals and multi-generation backcrosses) in only a few generations.

Although the term hybrid swarm often has a negative connotation, the fitness impacts of hybridization are still unclear. For example, Johansen-Morris and Latta (2006) examined the fitness consequences of hybridization in a plant species and found evidence of both hybrid vigor (improved fitness of hybrids due to dominance effects) and hybrid breakdown (disruption of coadapted gene complexes causing reductions in fitness). Hybridization can reverse adaptive differentiation by facilitating gene flow between locally adapted populations (Abbott et al. 2013; Baillie et al. 2016), for example locally adapted Seneca Lake and remnant Lake Michigan strains. However, hybridization can also create unique genetic combinations that are more fit for their current environment than either of the two parental populations (Comeault and Matute 2018). It is important to note that all hybrids in this study are assumed to be F1 hybrids, but many F2+ generation hybrids will likely be present in the future. The fitness of advanced generation backcrosses has been shown to decrease quickly when fish of different species hybridize (e.g., Muhlfeld et al. 2009), but the fitness consequences for moderately diverged populations such as the lake trout strains in our study are less clear. This uncertainty highlights the importance of conducting future monitoring to ensure that interstrain hybrids (especially advanced-generation backcrosses) are not leading to a reduction in population viability of lake trout in Lake Michigan.

## Management implications and conclusions

We suggest that future stocking efforts for lean lake trout in Lake Michigan primarily utilize the Seneca Lake and Lewis Lake strains. Mortality from sea lamprey predation is relatively high in the northern part of Lake Michigan, and the Seneca Lake strain appears to
possess unique characteristics that allow it to be more successful than other strains in this environment. However, the Seneca Lake strain's performance was similar to other strains in areas where sea lamprey predation is lower, which suggests that the performance advantage of the Seneca Lake strain is decreased in the absence of sea lamprey. Movement of wild fish postrecruitment may also contribute to the high amount of wild fish with Seneca Lake heritage, especially if the Southern Refuge is a nexus for recruitment, in which case the observed differences in performance may not be solely related to fitness. The Lewis Lake strain is the last available strain derived from remnant Lake Michigan lake trout (the Green Lake strain has been discontinued) and likely still contains locally adapted alleles despite its history of feralization in Lewis Lake, WY and domestication in the hatchery system. Additionally, the Lewis Lake strain generally performed well outside of the northern area of Lake Michigan including the Southern Refuge, where it performed similarly to expectations based on stocking. Our stocking suggestions, which promote genetic diversity without requiring the expensive maintenance of many potentially redundant hatchery strains, are generally consistent with other recent recommendations (e.g., Kornis et al. 2019b) and with current management plans (Dexter et al. 2011).

There is also discussion about continuing to stock the Klondike Reef humper strain in Lake Michigan and introducing it into Lake Ontario (S. Lapan, N.Y. Department of Environmental Conservation, personal communication). This strain was introduced to the Lake Michigan propagation program in 2011 and is now being recruited into assessment fisheries and will potentially be recruiting into the parental stock soon. Thus, we were not able to evaluate its potential to contribute to natural lake trout recruitment. Humper lake trout naturally occur in Lake Superior where they are typically restricted to deep offshore shoals or reefs (e.g., "humps";

Rahrer 1965), which suggests they may have restricted movement relative to lean morphs. Humpers also consume more Mysis, benthic fish (Peck 1975; Rogers et al. 2019; Sierszen et al. 2014; Vinson et al. in press; Zimmerman et al. 2007) and terrestrial invertebrates (Sitar et al. 2020) than lean lake trout. Changes in the Great Lakes food web, such as the decline in the pelagic alewife (Alosa pseudoharengus) and the increase in the benthic round goby (Neogobius melanostomus) (Madenjian et al. 2018), are already reflected in diets of lake trout (e.g., Happel et al. 2017; Kornis et al. 2020; Luo et al. 2019) and some other salmonines (Leonhardt et al. 2020), and may further support the Klondike Reef strain as an appropriate choice for restoration efforts. However, it will be important to assess the ultimate risk of Klondike Reef humpers interbreeding with lean lake trout, which could have fitness consequences if hybrid offspring are maladapted to both shallow and deepwater environments. We speculate that the genetic risks of stocking the Klondike strain are relatively low given evidence that lake trout ecotypes often naturally coexist in other systems. We suggest routine genetic monitoring confirming the genetic purity of humper strain broodstock and continued genetic monitoring of natural recruits to confirm that humper-lean hybrids are rare.

In conclusion, we found that strain performance of lake trout varied substantially across Lake Michigan and hypothesize that these differences are largely due to adaptive differences among strains and post-recruitment movement. Additionally, we found no evidence for reproductive isolation among strains and no evidence for lower or higher fitness of interstrain crosses, which suggests that mating among lake trout strains stocked into Lake Michigan is essentially random. Our study provided a more nuanced understanding of strain performance across the whole lake and suggested adequate performance of several strains, compared to previous genetic studies in Lake Michigan, which focused on smaller geographic scales and
suggested that the Seneca Lake strain was superior to all other strains. Additionally, the increased power of our genetic marker panel compared to panels used in previous genetic studies improved strain assignment accuracy and facilitated assignment of interstrain crosses for the first time in this system. Our study demonstrates the utility of thorough strain evaluations for informing conservation and management and provides a roadmap for future researchers conducting strain evaluations in other taxa.

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## Figure legends

Figure 1. Stocking history of lake trout strains in Lake Michigan. The Apostle Island, Isle Royale, and Marquette strains are derived from the Lake Superior lean (i.e. shallow water) ecomorphotype, the Klondike strain is derived from the Lake Superior humper (i.e. deeper water) ecomorphotype and is the only strain not derived from the lean ecomorphotype, Clearwater Lake is derived from Clearwater Lake, Manitoba, Canada (Latitude: 54.0438, Longitude: -101.1262), Green Lake and Lewis Lake are derived from remnant Lake Michigan lake trout, Parry Sound is derived from Lake Huron, and Seneca Lake is derived from Seneca Lake, NY. Lake trout stocked at different sizes were standardized to yearling equivalents (i.e. the size of average yearling lake trout) to facilitate comparisons see (Elrod et al. 1988). Data were available from (USFWS and GLFC 2017).

Figure 2. Neighbor-joining dendrogram of reference strains based on Nei's $D_{\mathrm{A}}$ genetic distance. Bootstrap support for each node is shown. See Table 1 for collection information.

Figure 3. Results from STRUCTURE clustering analysis of reference strains and unknown (i.e. mixed-origin) samples at $K=6$. Reference strains were used to assign unknown individuals to their strain of origin. Black vertical lines denote reference strains and geographic sampling strata for unknown samples (see Tables 1,4). Strain abbreviations are Seneca (SN), Parry Sound (PR), Lewis Lake (LW), Green Lake (GN), Klondike Reef (KN), Marquette (MR), Apostle Island (AP), Isle Royale (IR). Strata abbreviations for mixed-origin samples are North (NO), Traverse Bay (TR), Northwest (NW), East (EA), Southwest (SW), Southern Refuge (SR), and Illinois/Indiana (II).

Figure 4. Estimates of contributions of reporting groups (Table 1) for hatchery strains to naturally produced lake trout for seven geographic strata in Lake Michigan. Sample sizes are below each pie. Colors represent reference strains. See Table 5 for proportion data and confidence intervals. See the Methods section for information on the composition of each reporting group. Statistical districts used to form strata are visualized in Fig. 1 of Kornis et al. (2019b).

Figure 5. Heatmap of observed versus expected strain proportions for seven geographic strata in Lake Michigan (see Fig. 4 for map of strata). Observed proportions were calculated from genetic data and expected proportions were calculated from stocking data (see Table 5). Positive values indicate a given strain is overrepresented in the genetic data.

Figure 6. Heatmaps of observed versus expected proportions of pure and hybrid crosses assuming random mating for seven geographic strata in Lake Michigan. Observed proportions for both panels (a) and (b) were the proportions of each cross type observed in the genetic data. See Table S8 for proportions and confidence intervals. Expected proportions for panel (a) were calculated based on stocking data (i.e. composite estimate of expected strain compositions reconstructed from stocking records) and expected proportions for panel (b) were calculated based on overall genetic proportions observed in each stratum (see Table 5). Positive values indicate a given cross type is overrepresented in the genetic data. See Table S6 for proportion data.

Figure S1. Age composition of naturally produced lake trout analyzed. Ages were estimated with otoliths.

Fig. S2. Year classes of naturally produced lake trout analyzed.

## Tables

Table 1. Information on eight lake trout reference strains. Seneca Lake is a finger lake that drains into Lake Ontario through the Oswego River, and Lewis Lake and Green Lake contain lake trout that are descended from wild fish captured from Lake Michigan before lake trout were extirpated from this system. The other strains were all collected from within the Great Lakes (either lakes Huron or Superior. Reporting groups were determined using STRUCTURE analysis (Fig. 2) and assignment tests with simulated individuals (Table 3). N is the number of individuals successfully genotyped. Other abbreviations are observed heterozygosity $\left(H_{\mathrm{O}}\right)$, expected heterozygosity $\left(H_{\mathrm{E}}\right)$, number of alleles $(A)$, and allelic richness $\left(A_{\mathrm{R}}\right)$. Latitude and longitude represent the source of each strain.

| Strain | Lake/Drainage | Reporting Group | Latitude | Longitude | N | $H_{\mathrm{O}}$ | $H_{\mathrm{E}}$ | $A$ | $A_{\mathrm{R}}$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Seneca Lake | Ontario | Seneca Lake | 42.680223 | -76.915079 | 81 | 0.57 | 0.57 | 7.44 | 6.62 |
| Parry Sound | Huron | Parry Sound | 45.350004 | -80.055935 | 41 | 0.55 | 0.54 | 6.94 | 6.86 |
| Lewis Lake | Michigan | Lewis Lake | 44.304252 | -110.63071 | 97 | 0.56 | 0.56 | 8.03 | 7.16 |
| Green Lake | Michigan | Green Lake | 43.830280 | -88.966445 | 71 | 0.56 | 0.56 | 7.72 | 7.05 |
| Klondike Reef | Superior | Superior | 47.340482 | -85.801163 | 61 | 0.55 | 0.56 | 7.94 | 7.33 |
| Marquette | Superior | Superior | 46.747705 | -87.226454 | 72 | 0.55 | 0.58 | 9.83 | 8.74 |
| Apostle Islands | Superior | Superior | 46.898999 | -90.663642 | 77 | 0.56 | 0.57 | 10.36 | 8.79 |
| Isle Royale | Superior | Superior | 47.821319 | -89.162644 | 62 | 0.57 | 0.59 | 9.19 | 8.34 |

Table 2. Sample information for naturally produced lake trout genotyped in this study. Districts are statistical harvest districts for Lake Michigan and are visualized in Fig. 1 of Kornis et al. (2019b). See Fig. 4 for a map of strata and Table S7 for metadata on each fish including date and location of capture, length, age, weight (when available), and sex (when available). The single fish assigned to a strain not stocked in Lake Michigan (Parry Sound x Superior hybrid) is not included in this table (see Results). Traverse Bay refers Grand Traverse Bay.

| Strata | Districts included | N total | $2009-2011$ | 2012 | 2013 | 2014 | 2015 |
| :--- | :--- | ---: | ---: | ---: | ---: | ---: | ---: |
| North | MM-1, MM-2, MM-3 | 216 | 9 | 20 | 66 | 54 | 67 |
| Traverse Bay | MM-4 | 85 | 0 | 46 | 37 | 2 | 0 |
| Northwest | WM-3, WM-4 | 102 | 0 | 27 | 14 | 32 | 29 |
| East | MM-5, MM-6, MM-7, MM-8 | 77 | 0 | 0 | 2 | 0 | 75 |
| Southwest | WM-5, WM-6 | 91 | 0 | 5 | 9 | 21 | 56 |
| Southern Refuge | WM-5, MM-6, MM-7 | 116 | 0 | 0 | 0 | 0 | 116 |
| Illinois/Indiana | ILL, IND | 160 | 0 | 0 | 0 | 0 | 160 |
| Total | 847 | 9 | 98 | 94 | 109 | 503 |  |

Table 3. Pairwise $F_{\text {ST }}$ values for reference strains calculated using 36 microsatellites. Bold values are significantly different from zero $(\mathrm{P}<0.01)$.

| Population | Seneca Lake | Parry Sound | Lewis Lake | Green Lake | Klondike Reef | Marquette | Apostle Islands |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Parry Sound | $\mathbf{0 . 0 5 5}$ |  |  |  |  |  |  |
| Lewis Lake | $\mathbf{0 . 0 5 8}$ | $\mathbf{0 . 0 4 6}$ |  |  |  |  |  |
| Green Lake | $\mathbf{0 . 0 5 9}$ | $\mathbf{0 . 0 5 8}$ | $\mathbf{0 . 0 4 0}$ |  |  |  |  |
| Klondike Reef | $\mathbf{0 . 0 7 5}$ | $\mathbf{0 . 0 8 3}$ | $\mathbf{0 . 0 4 9}$ | $\mathbf{0 . 0 6 3}$ |  |  |  |
| Marquette | $\mathbf{0 . 0 4 8}$ | $\mathbf{0 . 0 4 3}$ | $\mathbf{0 . 0 1 8}$ | $\mathbf{0 . 0 2 6}$ | $\mathbf{0 . 0 3 3}$ |  |  |
| Apostle Islands | $\mathbf{0 . 0 6 4}$ | $\mathbf{0 . 0 5 5}$ | $\mathbf{0 . 0 2 9}$ | $\mathbf{0 . 0 3 5}$ | $\mathbf{0 . 0 3 4}$ | 0.006 |  |
| Isle Royale | $\mathbf{0 . 0 5 9}$ | $\mathbf{0 . 0 5 0}$ | $\mathbf{0 . 0 2 8}$ | $\mathbf{0 . 0 3 3}$ | $\mathbf{0 . 0 3 8}$ | $\mathbf{0 . 0 0 8}$ | $\mathbf{0 . 0 0 9}$ |

Table 4. Assignment accuracy for five pure and ten hybrid cross types representing all possible combinations among reporting groups. For each cross type, 1,000 individuals were simulated and assigned to reference strains using STRUCTURE (see methods). N correct is the number of individuals correctly assigned out of 1,000 . Classified pure is the number of individuals classified as a pure cross (i.e., not a hybrid) out of 1,000 . Values in bold are cross types with correct assignment $<0.8$. We also calculated mixture proportions ("mixture" columns) using STRUCTURE with the approach outlined in the methods section and ONCOR. The expected values are $100 \%$ for pure cross types and $50 \%$ for each strain in hybrid cross types. The Klondike strain was removed from this analysis because it produced low assignment accuracy ( $63 \%$ correct with STRUCTURE analysis), with high misassignment to the Superior reporting group. The Klondike strain was combined with other Superior strains for the analysis of unknown individuals. See Table 1 for information on strains.

| Cross type | N correct | $\%$ correct | Classified pure | Mixture STRUCTURE | Mixture ONCOR |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Pure |  |  |  |  |  |
| Seneca | 977 | $98 \%$ | 977 | $99 \%$ | $100 \%$ |
| Parry | 969 | $97 \%$ | 969 | $98 \%$ | $100 \%$ |
| Lewis | 942 | $94 \%$ | 942 | $97 \%$ | $100 \%$ |
| Green | 912 | $91 \%$ | 912 | $96 \%$ | $100 \%$ |
| Superior | 749 | $\mathbf{7 5 \%}$ | 749 | $87 \%$ | $100 \%$ |
| Hybrid |  |  |  |  |  |
| Seneca x Parry | 912 | $91 \%$ | 30 | $49 \%, 48 \%$ | $49 \%, 48 \%$ |
| Seneca x Lewis | 882 | $88 \%$ | 26 | $49 \%, 47 \%$ | $44 \%, 41 \%$ |
| Seneca x Green | 854 | $85 \%$ | 29 | $49 \%, 45 \%$ | $48 \%, 31 \%$ |
| Seneca x Superior | 833 | $83 \%$ | 31 | $48 \%, 45 \%$ | $29 \%, 71 \%$ |
| Parry x Lewis | 834 | $83 \%$ | 38 | $47 \%, 46 \%$ | $38 \%, 51 \%$ |
| Parry x Green | 806 | $81 \%$ | 14 | $46 \%, 44 \%$ | $40 \%, 29 \%$ |
| Parry x Superior | 803 | $80 \%$ | 43 | $46 \%, 45 \%$ | $32 \%, 68 \%$ |
| Lewis x Green | 779 | $\mathbf{7 8 \%}$ | 36 | $46 \%, 44 \%$ | $38 \%, 35 \%$ |
| Lewis x Superior | 790 | $\mathbf{7 9 \%}$ | 143 | $50 \%, 46 \%$ | $24 \%, 76 \%$ |
| Green x Superior | 808 | $81 \%$ | 78 | $45 \%, 49 \%$ | $28 \%, 72 \%$ |

1128 Table 5. Observed (obs) and expected (exp) proportions of four genetic strains in seven geographic strata across Lake Michigan. Observed proportions are the genetic proportions of each stock calculated from STRUCTURE analysis and expected proportions were calculated from stocking data. $95 \%$ confidence intervals for genetic (i.e. observed) estimates are below point estimates. See Table 2 and Fig. 3 for more information on strata and Table 1 for more information on strains.

| Strata | Seneca obs | Seneca exp | Lewis obs | Lewis exp | Green obs | Green $\exp$ | Superior obs | Superior exp |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| North | 0.69 | 0.03 | 0.14 | 0.34 | 0.01 | 0.01 | 0.16 | 0.62 |
|  | 0.55-0.83 |  | 0.08-0.22 |  | 0.00-0.04 |  | 0.09-0.26 |  |
|  | 0.26 | 0.14 | 0.52 | 0.51 | 0.04 | 0.02 | 0.18 | 0.33 |
| Traverse Bay | 0.15-0.41 |  | 0.35-0.72 |  | 0.01-0.12 |  | 0.08-0.33 |  |
|  | 0.53 | 0.19 | 0.19 | 0.22 | 0.04 | 0.22 | 0.24 | 0.38 |
| Northwest | 0.38-0.70 |  | 0.10-0.32 |  | 0.01-0.12 |  | 0.13-0.4 |  |
|  | 0.69 | 0.20 | 0.12 | 0.23 | 0.06 | 0.20 | 0.13 | 0.36 |
| East | 0.51-0.87 |  | 0.05-0.25 |  | 0.02-0.18 |  | 0.05-0.28 |  |
|  | 0.55 | 0.26 | 0.07 | 0.17 | 0.10 | 0.36 | 0.27 | 0.21 |
| Southwest | 0.39-0.72 |  | 0.02-0.16 |  | 0.04-0.21 |  | 0.15-0.46 |  |
|  | 0.58 | 0.37 | 0.09 | 0.06 | 0.16 | 0.43 | 0.17 | 0.14 |
| Southern Refuge | 0.43-0.74 |  | 0.04-0.18 |  | 0.09-0.29 |  | 0.09-0.31 |  |
|  | $\begin{gathered} 0.72 \\ 057-087 \end{gathered}$ | 0.17 | $\begin{gathered} 0.06 \\ 003-013 \end{gathered}$ | 0.27 | $\begin{gathered} 0.12 \\ 006-021 \end{gathered}$ | 0.35 | $\begin{gathered} 0.10 \\ 005-019 \end{gathered}$ | 0.20 |
| Illinois/Indiana | 0.57-0.87 | 0.1 | 0.03-0.13 | 0.27 | $0.06-0.21$ | 0.35 | 0.05-0.19 | 0.20 |

Table S1. Multiplexing and primer information for microsatellite loci genotyped in this study. for all others).

Table S3. Movement matrix used in expected strain proportion calculations.

Table S4. Summary statistics for microsatellite loci genotyped in this study.

Table S5. Genotype data from all individuals in the study in GenAlEx format. Individuals denoted with "UNK" were naturally reproduced fish of unknown origin. Metadata for these fish are found in Table S4.

Table S6. Structure Harvester results. The K used for all analyses ( $\mathrm{K}=6$ ) is highlighted.

Table S7. Metadata for each naturally reproduced fish analyzed in the study. Fish with two strains separated with an "_" are putative hybrids. Year class is catch year - otolith age.

Table S8. Observed and expected proportions of cross types (i.e. pure and hybrid crosses) for seven geographic strata in Lake Michigan. Observed genetic data is the proportion of each type inferred directly from the genetic data, expected stocking is the proportion of each cross type expected under random mating given the stocking proportions calculated in Table 5, and expected is the proportion of each cross type expected under random mating given the genetic proportions calculated in Table 5. 95\% confidences intervals are included in parentheses for observed genetic data.

