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Reduced Representation and Whole-Genome Sequencing Approaches Highlight Beluga Whale Populations Associated to Eastern Canada Summer Aggregations

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ABSTRACT

Effective conservation strategies inherently depend on preserving populations, which in turn requires accurate tools for their detection. Beluga whales (*Delphinapterus leucas*) inhabit the circumpolar Arctic and form discrete summer aggregations. Previous genetic studies using mitochondrial and microsatellite loci have delineated distinct populations associated to summer aggregations but the extent of dispersal and interbreeding among these populations remains largely unknown. Such information is essential for the conservation of populations in Canada as some are endangered and harvested for subsistence by Inuit communities. Here, we used reduced representation and whole-genome sequencing approaches to characterize population structure of beluga whales in eastern Canada and examine admixture between populations. A total of 905 beluga whales sampled between 1989 and 2021 were genotyped. Six main genomic clusters, with potential subclusters, were identified using multiple proxies for population structure. Most of the six main genomic clusters were consistent with previously identified populations, except in southeast Hudson Bay where two clusters were identified. Beluga summer aggregations may consequently be comprised of more than one distinct population. A low number of dispersers were identified between summer aggregations and limited interbreeding was detected between the six genomic clusters. Our work highlights the value of genomic approaches to improve our understanding of population structure and reproductive behavior in beluga whales, offering insights applicable to other cetacean species of conservation concern. An expansion of the geographical scope and increase in number of genotyped individuals will, however, be needed to improve the characterization of the finer scale structure and of the extent of admixture between populations.

1 | Introduction

Many cetaceans have experienced severe declines in abundance over the last two centuries due to anthropogenic disturbances such as harvest, fisheries bycatch, pollution, and habitat degradation. For cetaceans with wide distributions, the impact of these stressors varies spatially, resulting in differential consequences among aggregations. Some species have rebounded from low numbers while others have shown little sign of recovery since conservation strategies were implemented (Albouy

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et al. [2020](#page-14-0); Davidson et al. [2012](#page-15-0); Nelms et al. [2021;](#page-17-0) Schipper et al. [2008\)](#page-18-0). The extent of species distribution and spatial heterogeneity may partially explain the relative success of conservation strategies. In particular, characterizing spatial distribution of aggregations and the demographic links, that is, dispersal and interbreeding, between aggregations can inform, guide, and optimize conservation strategies.

Beluga whales (*Delphinapterus leucas*) are considered of Least Concern globally under the International Union for Conservation of Nature (IUCN) Red List of Threatened Species given their total abundance of approximately 200,000 animals (Lowry, Reeves, and Laidre [2017](#page-17-1)). However, this species is of particular interest for conservation efforts with a discontinuous circumpolar distribution and multiple populations considered at risk of extinction (Hobbs et al. [2019;](#page-16-0) Lowry, Reeves, and Laidre [2017](#page-17-1); Richard [2014\)](#page-18-1). A recent review identified a total of 21 management units based on non-overlapping summer ag-gregations and genetic analyses (Hobbs et al. [2019](#page-16-0)). Only seven have known abundance trends, with half of these declining (Hammill et al. [2023;](#page-16-1) Hobbs et al. [2019](#page-16-0)).

The Committee on the Status of Endangered Wildlife in Canada (COSEWIC) recognizes seven beluga units in eastern Canada: (1) Eastern High Arctic-Baffin Bay, (2) Cumberland Sound, (3) Ungava Bay, (4) Western Hudson Bay, (5) Eastern Hudson Bay, (6) James Bay, and (7) St. Lawrence Estuary (COSEWIC [2014,](#page-15-1) [2016](#page-15-2), [2020\)](#page-15-3). COSEWIC refers to these as designatable units (DUs) based on cultural or genetic distinctiveness, which each are units of biodiversity that would be irreplaceable in case of extinction or if extirpated from a jurisdiction (Green [2005](#page-16-2)). All seven eastern Canada DUs were depleted due to commercial harvesting that lasted until the mid-20th century (Heide-Jørgensen and Reeves [1996](#page-16-3); Reeves and Mitchell [1987](#page-18-2)). Four beluga DUs continue to have low abundance and have not shown signs of recovery, in spite of the implementation of management plans. They include Cumberland Sound (*N*=1200; Watt et al. [2021\)](#page-18-3), Ungava Bay (*N*=70; Sauvé et al. [2023](#page-18-4)), Eastern Hudson Bay (*N*=2900–3200; Hammill et al. [2023](#page-16-1)), and the St. Lawrence Estuary (*N*=1850; DFO [2023](#page-16-4)). These four DUs are either considered Endangered or Threatened by COSEWIC and, except for the St. Lawrence Estuary DU, are still harvested for subsistence by Inuit communities in their summer aggregations or during their seasonal migrations. The low abundance of these DUs contrasts with those from the Eastern High Arctic-Baffin Bay (*N*=12,000, Watt et al. [2023\)](#page-18-5), Western Hudson Bay (*N*=54,500, Matthews et al. [2017](#page-17-2)), and James Bay (*N*=19,200; DFO [2022\)](#page-16-5), which were either historically exploited to a lesser extent or are recovering in numbers.

Beluga whales undertake spring and fall migrations. Mating is believed to occur when whales reside in their wintering areas or during the spring migration when eastern Canada DUs may overlap (March to June; Citta et al. [2017](#page-15-4); Kelley et al. [2015](#page-16-6); Manitzas Hill et al. [2024](#page-17-3); Richard [2014\)](#page-18-1). Births occur between late spring and summer when beluga whales are either moving toward or already occupying their summer ranges. During summer, beluga whales are found in shallow coastal waters as well as in deep offshore waters. They also enter estuaries and sometimes move upstream into rivers (Richard [2014](#page-18-1)). Seasonal migrations can vary in extent. In eastern Canada, the Cumberland Sound,

James Bay, and St. Lawrence Estuary DUs move short seasonal distances on the scale of a few tens to hundreds of kilometers, whereas the Eastern High Arctic-Baffin Bay, Western Hudson Bay, and Eastern Hudson Bay DUs migrate seasonally over several hundreds or thousands of kilometers (Bailleul et al. [2012a;](#page-14-1) Lewis et al. [2009](#page-17-4); Luque and Ferguson [2010](#page-17-5); Richard [2014\)](#page-18-1). Recent evidence suggests beluga whales travel along the same seasonal migration routes each year, likely learned through strong mother-calf bonding (Colbeck et al. [2013;](#page-15-5) Krasnova et al. [2014;](#page-17-6) O'Corry-Crowe et al. [2018\)](#page-17-7).

Across their Canadian range, beluga whales were initially divided into DUs based on the strong philopatry to summering grounds. This strong intra- and inter-annual site fidelity displayed by individual whales is informed by lines of evidence based on studies of behavior (Caron and Smith [1990](#page-15-6)), telemetry (Bailleul et al. [2012a](#page-14-1)), isotopic and trace elements (Rioux et al. [2012](#page-18-6)), as well as genetics (Brown Gladden, Ferguson, and Clayton [1997](#page-15-7); Brown Gladden et al. [1999](#page-15-8); Colbeck et al. [2013](#page-15-5); De March and Postma [2003](#page-15-9); Parent et al. [2023](#page-17-8); Postma et al. [2012;](#page-18-7) Turgeon et al. [2012](#page-18-8)). Early studies using a short haplotype of the mitochondrial DNA (mtDNA) control region (ca. 234 nucleotides) identified that beluga whales of the Eastern High Arctic-Baffin Bay, Eastern Hudson Bay, Western Hudson Bay, and St. Lawrence Estuary DUs had distinct haplotype compositions (Brennin et al. [1997](#page-15-10); Brown Gladden, Ferguson, and Clayton [1997](#page-15-7); De March, Maiers, and Friesen [2002](#page-15-11); De March, Stern, and Innes [2004](#page-16-7); De March and Postma [2003;](#page-15-9) O'Corry-Crowe et al. [1997](#page-17-9)). Later studies with a longer haplotype (ca. 609 nucleotides) showed the genetic distinctiveness of additional summer aggregations from Cumberland Sound, James Bay, and Belcher Islands (Parent et al. [2023;](#page-17-8) Postma et al. [2012](#page-18-7); Turgeon et al. [2009\)](#page-18-9). Whole mitogenome clades also showed some geographic specificity in eastern Canada (Skovrind et al. [2021\)](#page-18-10).

While the study of mtDNA allowed to identify geographic patterns in maternally inherited loci, the study of biparentally inherited nuclear DNA (nDNA) would also be useful to identify populations, defined here as distinct groups of individuals where mating can occur between members within each group (Waples and Gaggiotti [2006\)](#page-18-11). The genetic differentiation for Eastern High Arctic-Baffin Bay, Cumberland Sound, James Bay, and St. Lawrence Estuary populations using mtDNA was corroborated by nuclear microsatellite loci (De March, Maiers, and Friesen [2002;](#page-15-11) Postma et al. [2012](#page-18-7); Turgeon et al. [2012\)](#page-18-8). No nDNA genetic differentiation was detected between the beluga whales from Eastern Hudson Bay and Western Hudson Bay, which supported the hypothesis that matrilinear lineages from these summer aggregations interbreed (Brown Gladden et al. [1999;](#page-15-8) Turgeon et al. [2012\)](#page-18-8). However, these earlier genetic studies using about 10 microsatellite loci had limited power to characterize breeding populations compared to genomic approaches using thousands of single nucleotide polymorphisms (SNPs). The latter approaches using massive parallel sequencing generally enhance the detection of population structure, immigration and dispersal rates, interbreeding, and inbreeding (Allendorf et al. [2022;](#page-14-2) Funk et al. [2012](#page-16-8); Hohenlohe, Funk, and Rajora [2021;](#page-16-9) McMahon, Teeling, and Höglund [2014](#page-17-10); Shafer et al. [2015](#page-18-12)).

Two broad approaches are frequently used to characterize population genomic structure, namely, reduced representation and whole-genome sequencing. Reduced representation sequencing is widely adopted to genotype many individuals from non-model organisms, oftentimes without the aid of a reference genome (Andrews et al. [2016;](#page-14-3) Peterson et al. [2012](#page-17-11)), or for species with large genomes to reduce sequencing costs. This approach uses randomly selected short segments of the nuclear genome close to restriction sites, generally referred to as restriction-site associated DNA sequencing (Andrews et al. [2016\)](#page-14-3). Alternatively, whole genome sequencing is increasing in popularity due to the lowering cost of massive parallel sequencing and the much greater proportion of the genome covered, enabling an improved resolution of neutral and adaptive processes affecting the species (e.g., Fuentes-Pardo and Ruzzante [2017](#page-16-10); Lou et al. [2021](#page-17-12)). These two approaches have been successfully applied in multiple marine species of high conservation priority, such as pygmy blue whales *Balaenoptera musculus brevicauda* (Attard et al. [2018](#page-14-4)) and the vaquita *Phocoena sinus* (Morin et al. [2021\)](#page-17-13). A comparison of results and possible interpretation obtained using the two approaches has seldom been conducted and would be useful to guide future studies of population structure of marine mammals, as whole genome sequencing is still expensive for species with large genomes.

The main objective of this study was to characterize the population genomic structure of beluga whales in eastern Canada using both reduced representation and whole-genome sequencing approaches. Temporal and geographic information was coupled with the genomic datasets prepared for this study to (i) identify an association between summer location and populations, (ii) characterize populations' seasonal migratory routes, and (iii) estimate dispersal, interbreeding, and inbreeding for each population. We then discuss conservation implications in light of these results.

2 | Methods

2.1 | Data Collection, DNA Extraction, and Sequencing

Most whale tissue samples were provided by Inuit harvesters in the eastern Canadian Arctic as part of community-based sampling programs during subsistence harvest. Sample metadata included harvest location (GPS coordinates, local place name, or harvester's community) and date sampled. A small subset of samples was also collected through biopsies or necropsies (Table [S1\)](#page-19-0). In total, 1016 samples from 14 eastern Canadian regions were collected (Table [1](#page-2-0), Figure [1](#page-3-0)). When considering seasonal patterns, we used the following delineations, in accordance with beluga whale seasonal migratory behavior in the Arctic: winter (December–February), spring (March–June), summer (July–August), and fall (September–November; Lewis et al. [2009](#page-17-4)).

Skin, blubber, or muscle samples were preserved either frozen or in a saturated salt solution containing 20% dimethyl sulfoxide (DMSO) and 0.5 mol/L ethylene diamine tetraacetic acid (Seutin, White, and Boag [1991\)](#page-18-13). DNA was extracted using DNeasy Blood and Tissue kits (Qiagen, Toronto, Canada) with slight modifications from the manufacturer's protocols (see

TABLE 1 | Summary of eastern Canada samples genotyped with ddRADseq and lcWGS datasets. *N* and years indicate sample size and sampling period, respectively. N_{overlap} indicates the number of samples common to both datasets.

aOne beluga whale was not associated to any region and is not included in the table. The carcass was collected in the northeastern Gulf of St. Lawrence (see Figure [1\)](#page-3-0). bThe totals with the removed Gulf of St. Lawrence beluga whale are 638, 340, and 73 for ddRADseq, lcWGS, and shared individuals, respectively.

FIGURE 1 | Distribution of eastern Canada beluga whales (1989–2021) genotyped using ddRADseq (*N*=638) and lcWGS (*N*=340) approaches. The circular insert depicts the global range of beluga whales (adapted from Hobbs et al. [2019](#page-16-0)), and a dashed rectangle outlining the study area. Only lcWGS data was produced for Resolute Bay individuals (see Table [1](#page-2-0)). A single individual is plotted in the Gulf of St. Lawrence (black dot), which is not assigned to a region.

Supplementary Information). DNA quality was evaluated on a 2% agarose gel, and DNA concentration was quantified on a Synergy LX (BioTek, Santa Clara, USA) fluorescent plate reader using PicoGreen as a fluorescent marker. Sex was genetically determined through a qPCR-based method (Parent et al. [2024\)](#page-17-14).

For the reduced representation sequencing approach, libraries of double digest restriction site-associated DNA sequencing (ddRADseq) using *Pst*I and *Msp*I restriction enzymes were prepared by the Plateforme d'analyse génomique (IBIS, Université Laval). A total of 755 samples were indexed and pooled into ddRADseq libraries (Table [S1\)](#page-19-0). Ninety of these samples plus

another 261 samples (*N*=351) with high DNA quality (i.e., no signs of DNA degradation on agarose gel) were selected to prepare low-coverage whole-genome sequencing (lcWGS) libraries using Illumina DNA Prep and dual index by Génome Québec (Montréal, Canada, Table [S1\)](#page-19-0). Both ddRADseq and lcWGS libraries were sequenced on Illumina NovaSeq 6000 S4 PE 150 at Génome Québec with 10% PhiX.

2.2 | Read Processing, SNP Calling, and Filtering

For both ddRADseq and lcWGS libraries, the overall quality of reads and the presence of adapters were assessed using FastQC 0.11.9 (Andrews [2010\)](#page-14-5) and multiQC 1.10 (Ewels et al. [2016\)](#page-16-11). Read processing is detailed in the Supporting Information. Briefly, raw reads were trimmed and filtered using Trimmomatic 0.39 (Bolger, Lohse, and Usadel [2014\)](#page-15-12) to remove adapter sequences and low-quality reads. ddRADseq libraries were demultiplexed using the *process_radtags* module of Stacks 2.55 (Catchen et al. [2013;](#page-15-13) Rochette, Rivera-Colón, and Catchen [2019](#page-18-14)). Reads were mapped to a chromosomal scale reference genome for beluga whales (Bringloe and Parent [2023\)](#page-15-14) using either BWA-MEM (Li [2013](#page-17-15); Li and Durbin [2010](#page-17-16)) for ddRADseq or bowtie2 2.4.5 (Langmead and Salzberg [2012\)](#page-17-17) for lcWGS. Only samples with >96% mapped reads were retained (Table [2](#page-4-0)).

Aligned read information was then compiled, and variant positions were called using Stack for the ddRADseq dataset (Table [2\)](#page-4-0) and a combination of SAMtools 1.12 and BCFtools 1.16 (Danecek et al. [2021\)](#page-15-15) for the lcWGS (Table [2\)](#page-4-0). Descriptions of SNP calling and filtration steps are detailed in Supporting Information. Briefly, for the ddRADseq, the population module of Stacks was used to first select SNPs found in at least 75% of individuals and with a minor allele frequency (MAF) of

TABLE 2 | Filtration steps of ddRADseq and lcWGS datasets for sample and single nucleotide polymorphisms (SNPs). Each row is a filtration step targeting either samples or SNPs for selection or removal, and provides retention counts combining a given step and filtering steps in preceding rows. For the lcWGS dataset, prior to pruning for linked sites, mean SNP depth was 4.45×, while site missingness was 2.6% (Figure [S12\)](#page-19-1).

a The Y chromosome was not compiled into the original VCF file and sites on the X chromosome were removed. ^bOne individual was removed from the final dataset due to conflicting genetic signal in replicate samples.

≥0.01 (Table [2\)](#page-4-0). For the lcWGS, only biallelic SNPs (no indels) and sites located greater than 5 bp from indels were retained (Table [2\)](#page-4-0). In both ddRADseq and lcWGS datasets, sites with high missingness (> 5% and > 10% for ddRADseq and lcWGS datasets, respectively), > 60% heterozygosity, identified on the sex chromosome or located within previously identified repeat elements (Bringloe and Parent [2023\)](#page-15-14) were discarded (Table [2](#page-4-0)). Individuals with high missingness ($>$ 30% and $>$ 15% for ddRADseq and lcWGS datasets, respectively) and with a kinship coefficient \geq 0.25 (i.e., first-degree relationships and putative duplicate samples; Manichaikul et al. [2010](#page-17-18)) were excluded (Table [2\)](#page-4-0). For the ddRADseq dataset, SNPs were further screened to identify potential sequencing plate effects and only one SNP per locus was kept (Table [2](#page-4-0)). Finally, for the lcWGS dataset, linked sites were identified and removed with Plink 1.90 (Purcell et al. [2007](#page-18-15)), using a 50 kbp sliding window and an r^2 threshold of 0.25 (correlation coefficient of 0.5; Table [2](#page-4-0)). Final datasets for both ddRADseq and lcWGS retained SNPs with a MAF > 0.05 (Table [2](#page-4-0); $N_{ddRADseq} = 638$, $N_{l cWGS} = 340$ individuals). Outlier loci were also identified in the ddRADseq dataset using PCAdapt 4.3.3 (Privé et al. [2020\)](#page-18-16), an individual-based genome-scan approach that identifies SNPs significantly associated with genetic structure underlying principal components (PCs) using Mahalanobis distance. The number of PCs used was $K = 4$ based on a visual inspection of the scree plot. SNPs with a *q*-value < 0.05 were identified as outliers $(N=1310)$. All population genomic analyses described below were run with ddRADseq SNPs including or excluding outlier loci. For the lcWGS dataset, another separate VCF file was also compiled with invariant positions included, to be used for genomic differentiation (F_{ST}) estimates (see Supporting Information for details).

Mitochondrial genomes were assembled from the lcWGS datasets using NOVOPlasty 4.2 (Dierckxsens, Mardulyn, and Smits [2016](#page-16-12)) and cytochrome c oxidase I as a seed sequence. Mitogenomes were aligned with currently published mitogenomes (e.g., Skovrind et al. [2021](#page-18-10)) using MAUVE alignment (Darling et al. [2004\)](#page-15-16) in Geneious Prime 2023 (Kearse et al. [2012\)](#page-16-13).

2.3 | Population Genomic Analyses

Samples from all seasons and regions were included in clustering analyses to identify any genomic clusters present across the study area. We evaluated the number of genetic clusters (i.e., ancestral lineages) by estimating the genetic ancestry of each individual through the model-based ancestry estimation approach of ADMIXTURE 1.3.0 (Alexander, Novembre, and Lange [2009\)](#page-14-6). The ancestry proportion (*Q*) to each K-group (1–10 groups) was obtained for each individual for both ddRADseq and lcWGS datasets. By inspecting ADMIXTURE output, a *Q* value threshold of 0.5 was determined as a suitable threshold for assigning individuals to genomic clusters. Identifying the optimal K in admixture modeling has long been recognized as a challenging issue for model-based ancestry estimators (Janes et al. [2017;](#page-16-14) Liu et al. [2020\)](#page-17-19). The visual inspection of ADMIXTURE results was used to determine K of each dataset (Alexander, Novembre, and Lange [2009\)](#page-14-6). Furthermore, the comparison of results between ADMIXTURE and the Principal Components Analysis (PCA; described below) was also used to provide insights and

confirmation regarding population structure (Liu et al. [2020\)](#page-17-19). For the ddRADseq dataset, PCAs were performed using the *glPca* function of the package adegenet 2.1.10 (alleles centered, missing values replaced by mean genotype across individuals; Jombart [2008;](#page-16-15) Jombart and Ahmed [2011\)](#page-16-16) in R (R Core Team [2024\)](#page-18-17). For the lcWGS dataset, PCAs were performed using Plink using the *–pca* flag. A PCA using adegenet was also performed on mitochondrial genomes.

 F_{ST} estimates were used to assess the magnitude of differentiation among genomic clusters identified by the consensus of ADMIXTURE and PCA analyses. For the ddRADseq dataset, pairwise F_{ST} and associated 95% confidence intervals were computed from 999 bootstraps using the function *gl.fst.pop* of the R package dartR 1.0.2 (Gruber et al. [2018\)](#page-16-17). For the lcWGS dataset, Pixy 1.2.7 (Korunes and Samuk [2021\)](#page-17-20) was used to account for invariant positions and missing genotypes in F_{ST} calculations. F_{ST} was estimated at 50 kbp intervals, and windows with less than 15 SNPs were discarded $\left($ < 0.75% of estimates, the average number of SNPs/window was 109). The F_{ST} obtained with ddRADseq and lcWGS datasets were compared using Spearman's rank correlation.

Inbreeding coefficients (*F*) were estimated on a per-individual basis from individual heterozygosity measures for both ddRADseq and lcWGS datasets using the *–het* function in VCFtools (Danecek et al. [2011\)](#page-15-17). *F* was then estimated per genomic cluster as the median *F* estimates of its constituent individuals (i.e., those with *Q*≥0.5 for that cluster). The Mann–Whitney *U* test was adopted to compare the distributions of *F* values among genomic clusters.

3 | Results

A total of 905 beluga whales were included in the final SNP datasets ($N_{ddRADseq}$ =638 whales, N_{lcWGS} =340 whales), with 73 specimens common to both datasets (Table [1](#page-2-0)). After SNP filtering, individuals were genotyped with 26,019 and 24,709 SNPs with ddRADseq datasets including or excluding outlier loci, respectively. Because results obtained from the two ddRADseq datasets were highly similar, results from the ddRADseq dataset including outlier loci are presented solely in the Supporting Information. A total of 845,731 SNPs were retained after filtering for beluga whale samples with the lcWGS dataset. Genotyped loci represented about 1.2% of the initial number of loci or SNPs for both datasets (Table [2](#page-4-0)). A total of 337 novel mitochondrial genomes were assembled from the lcWGS data, which were integrated with the global distribution of mitogenomes published by Skovrind et al. [\(2021](#page-18-10)) (Table [S1,](#page-19-0) Figure [S1\)](#page-19-1). Sex was genetically determined for most whales (873/905, or 96.5%).

3.1 | Main Beluga Whale Genomic Clusters in Eastern Canada

ADMIXTURE results identified several main genomic clusters of beluga whales which were consistent between the ddRADseq and lcWGS datasets (Figure [2A,B\)](#page-6-0). The visual inspection of ADMIXTURE results suggested at least five clusters in common between the ddRADseq and lcWGS datasets (Figures [S2–S4\)](#page-19-1).

FIGURE 2 | Ancestral proportions obtained with ADMIXTURE for beluga whales from eastern Canada, 1989–2021. Panels A and B represent ADMIXTURE membership probabilities for the ddRADseq (without outlier loci) and the lcWGS datasets, respectively. Colors in panels A and B represent the clusters detected. For full results at K=2–10 sorted by geographic location, see Figures [S2–S4.](#page-19-1) Panel C characterizes temporal and regional variation in the proportion of individuals from each cluster identified by ADMIXTURE, combining results from both SNP datasets (the *Population genomic analyses* section in Methods describes how individuals with mixed ancestry were classified into clusters). Sample sizes are presented below each pie chart for each region and season. Since all winter samples (*N*=8) were harvested in the Belcher Islands region, winter results are not shown in Panel C, but seven beluga whales were associated to the JB cluster and one to the HBSC cluster. Acronyms correspond to the following genomic clusters: CS=Cumberland Sound; HBSC=Hudson Bay-Strait Complex; JB=James Bay; LGR=Little and Great Whale Rivers; RB=Resolute Bay; SLE=St. Lawrence Estuary.

The lcWGS ADMIXTURE results presented an additional cluster owing to the additional inclusion of samples from Resolute Bay, which were not included in the ddRADseq dataset (Figure [2A,B;](#page-6-0) Figure [S2\)](#page-19-1).

During summer, four of the five clusters identified by both datasets were strongly associated with unique summering areas, and were therefore named after these areas: the St. Lawrence Estuary (SLE), the James Bay (JB), the Little and Great Whale Rivers (LGR), and the Cumberland Sound (CS) clusters (Figure [2C\)](#page-6-0). The fifth group of individuals common to both datasets had mixed ancestry proportions and was named the Hudson Bay-Strait Complex (HBSC) cluster (Figure [2A,B\)](#page-6-0). Animals in this cluster comprised the majority of the samples collected (78.5%) and were found in most regions during summer (Figure [2C\)](#page-6-0). A sixth cluster, named Resolute Bay (RB), was identified only with the lcWGS dataset given none of these individuals were genotyped with ddRADseq (Figure [2B](#page-6-0)).

PCA results obtained with both datasets were in agreement with the ADMIXTURE results (Figure [3,](#page-7-0) Figure [S5](#page-19-1)). The proportion of total variance explained by PCs decreased steeply from PC1 to PC3 with both datasets and slightly from PC4 to PC8 and from PC4 to PC5 with ddRADseq and lcWGS datasets, respectively (Figure [S6](#page-19-1)). With both approaches, PCs1 and 2 showed a clear distinction between SLE and JB clusters from other beluga whales (Figure [3A,D\)](#page-7-0), whereas PCs 3 and 4 revealed an additional separation of the LGR and CS clusters from other beluga clusters (Figure [3B,E\)](#page-7-0). The RB cluster was separated and intermediate to the CS and the rest of the beluga whales cluster on PC3 with the lcWGS dataset (Figure [3E](#page-7-0)). Missing data and heterozygosity were not associated with clustering patterns (Figures [S7](#page-19-1) and [S8](#page-19-1)).

The F_{ST} between the six genomic clusters supported in the ADMIXTURE and PCA analyses varied between 0.012 and 0.083 for the ddRADseq and 0.010 and 0.103 for the lcWGS

FIGURE 3 | Results from the Principal Component Analyses (PCA) of eastern Canada beluga whales using ddRADseq (without outlier loci; A, B, C) and lcWGS (D, E, F) datasets. Depicted are PC axes 1–2 (panels A, D), 3–4 (panels B, E), and 5–6 (panels C, F). Figure [S6](#page-19-1) presents percent variation explained by other PC axes. See Figure [S5](#page-19-1) for the comparison of ddRADseq PCA results with outlier loci. Colors represent sampling regions (Table [1](#page-2-0)), and acronyms correspond to the following genomic clusters: CS=Cumberland Sound; JB=James Bay; LGR=Little and Great Whale Rivers; RB=Resolute Bay; SLE=St. Lawrence Estuary.

datasets (Figure [4A\)](#page-8-0). With both datasets, the SLE and the JB clusters were the first and second most differentiated (Figure [4A,](#page-8-0) Figure [S9\)](#page-19-1). All F_{ST} comparisons were statistically significant for the ddRADseq dataset. The correlation between F_{ST} values estimated with ddRADseq and lcWGS datasets was high (rho=0.988, *p*<0.001; Figure [4B\)](#page-8-0).

Samples associated with the JB and the HSBC clusters showed potential signs of substructure. PCA results seem to suggest two subclusters within the JB cluster as well, with samples collected in James Bay during summer or Belcher Islands during winter not completely overlapping along the PC2 axis with the ddRADseq dataset (Figure [3A](#page-7-0)). Similarly, ancestry proportions within the HBSC cluster pointed to geographically distinct patterns. Geographic variation in ancestry proportions was present at $K \ge 6$ for the ddRADseq and $K \ge 7$ for the lcWGS datasets (Figures [S2](#page-19-1) and [S3\)](#page-19-1). Results from both ddRADseq and lcWGS presented a change in ancestral composition between the

Belcher Islands and Southeast Hudson Bay Arc (Figures [S2](#page-19-1), [S3,](#page-19-1) [S11\)](#page-19-1). With the PCA, samples from some regions such as North Hudson Strait, South Hudson Strait, and Ungava Bay did not completely overlap with those from Western Hudson Bay or Southeast Hudson Bay Arc along PCs 5 and 6 with both datasets (Figure [3C,F\)](#page-7-0).

3.2 | Seasonal Migratory Patterns of Main Genomic Clusters in Eastern Canada

Both sequencing approaches showed that during summer JB, RB, and SLE individuals were not found in regions other than those corresponding to their summer aggregation areas. Moreover, the RB and SLE clusters were not detected outside the Resolute Bay or the St. Lawrence Estuary, respectively, in other seasons. In contrast, JB beluga whales were harvested in spring outside of James Bay (*N*=35), indicating a small-scale migration.

FIGURE 4 | Population statistics for beluga whale genomic clusters in eastern Canada. (A) Heatmap of average F_{ST} measurements for ddRADseq (without outlier loci) and lcWGS datasets. (B) Correlation of F_{ST} estimates for genomic clusters identified with the ddRADseq (without outlier loci) and the lcWGS datasets. (C) Inbreeding coefficient (*F*) estimated with the ddRADseq (without outlier loci) and lcWGS datasets. Horizontal lines within violin distributions represent the median. Acronyms correspond to the following genomic clusters: CS=Cumberland Sound; HBSC=Hudson Bay-Strait Complex; JB=James Bay; LGR=Little and Great Whale Rivers; RB=Resolute Bay; SLE=St. Lawrence Estuary. RB individuals were not genotyped with ddRADseq.

In spring, most JB beluga were harvested in the Belcher Islands (i.e., 33/35 or 92.3% of JB whales, F:M ratio of 4:28—one animal with sex unknown) and a few in Southeast Hudson Bay Arc (i.e., 2/35 whales, 0:2F:M ratio; Figures [2C](#page-6-0) and [5\)](#page-9-0). The JB cluster was also harvested outside of James Bay in the fall in Long Island (1/7 JB whales) and the Southeast Hudson Bay Arc (6/7 JB whales, 3:3F:M ratio). All seven JB beluga samples collected in winter originated from the Belcher Islands (F:M ratio of 2:5, Figures [2C](#page-6-0) and [5](#page-9-0)).

During summer, the CS, LGR, and HBSC whales were harvested in multiple regions (Figures [2C](#page-6-0), [5\)](#page-9-0). CS whales were almost exclusively collected in Cumberland Sound (37/38 or 97.3% of CS whales; 16:21 F:M ratio), except for a single male harvested in Western Hudson Bay (2.5% or 1/38 whales; Figures [2C](#page-6-0) and [5](#page-9-0)). In spring, the only CS animal sampled was a female detected in Frobisher Bay. No CS whales were harvested during the fall. In summer, most of the LGR whales (34/39; 89.7%; 15:18 F:M ratio—one animal with sex unknown) were sampled in the Southeast Hudson Bay Arc region, mainly in and around the Little and Great Whale Rivers (30/34 whales, or 76.9%). Additionally, three LGR males (or 7.7%) were detected around the Belcher Islands as well as one male in the South Hudson Strait (2.5%) and one female in North Hudson Strait (2.5%, Figures [2C](#page-6-0) and [5](#page-9-0)). In spring, two of the seven LGR whales (28.6%; 2:0 F:M ratio) were harvested in the Southeast Hudson Bay and five in the Belcher Islands (71.4%; 1:4 F:M ratio). In fall, LGR whales were not sampled in the Southeast Hudson Bay Arc region, but mostly along the northern coast of Nunavik (Northeast Hudson Bay, South Hudson Strait; Figures [2C](#page-6-0) and [5\)](#page-9-0). In early fall (September), one LGR male was harvested around the Belcher Islands, and another one in Northwestern Hudson Bay. Later in the season (October–November), 26 LGR whales were harvested, of which 10 (or 38.5%; 6:4 F:M ratio) were harvested in Northeast Hudson Bay and 14 (or 53.9%, 10:1 F:M ratio—one animal with sex unknown) in South Hudson Strait (Figures [2C](#page-6-0) and [5\)](#page-9-0). The winter harvest from the Belcher Islands did not include any LGR whale, although the sample size was small. HBSC whales were sampled in almost every region during summer except Resolute Bay, James Bay, and the St. Lawrence Estuary. Nine of the 362 HBSC whales (2.5%) were sampled in Cumberland Sound during summer and the majority were males (1:8 F:M ratio; Figures [2C](#page-6-0) and [5\)](#page-9-0). In spring, HBSC whales were harvested in Ungava Bay, South and North Hudson Strait, and Eastern Hudson Bay (Northeast Hudson Bay, Southeast Hudson Bay Arc, Belcher Islands). Spring samples from Western Hudson Bay (Southwest Hudson Bay, Northwest Hudson Bay, North Hudson Bay) were not available for this study. HBSC fall samples originated from individuals

FIGURE 5 | Seasonal distributions of four out of six beluga whale genomic clusters (Hudson Bay-Strait Complex—HBSC, Little and Great Whale Rivers—LGR, James Bay—JB, and Cumberland Sound—CS) identified with ddRADseq and lcWGS ADMIXTURE analyses in eastern Canada, 1989–2021. The color palette provides a finer temporal resolution of sampling day within seasons across the study area. The RB and SLE clusters are not presented since these beluga whales were not detected migrating outside their summering regions. Location of winter samples (*N*=8) is also not displayed, but all originated from the Belcher Islands.

harvested from almost all Hudson Bay and Strait regions (except Southwest Hudson Bay), including northern James Bay (Figures [2C](#page-6-0) and [5\)](#page-9-0). Similar to the LGR cluster, the temporal distribution of HBSC whales during fall suggests a seasonal movement toward the Hudson Strait at that time of year (September to November; Figures [2C](#page-6-0) and [5](#page-9-0)). HBSC whales were harvested in the Hudson Bay in early fall (September) and later in the Hudson Strait (October–November; Figure [5\)](#page-9-0).

3.3 | Inbreeding, Dispersal, and Admixture of Beluga Whale Genomic Clusters

On average, the inbreeding coefficients (*F*) were close to 0 for all clusters except for SLE, which had a median value \pm SD of 0.255 ± 0.036 with the ddRADseq and 0.131 ± 0.053 with the lcWGS datasets (Figure [4C,](#page-8-0) Table [S2\)](#page-19-1). Statistically different *F* estimates were detected between all clusters with the ddRADseq dataset, except for the LGR vs. HSBC and JB vs. CS clusters (Table [S2\)](#page-19-1). In contrast, statistically different *F* estimates were detected only for the SLE cluster versus the JB, LGR, CS, and HSBC clusters with the lcWGS dataset (Table [S2](#page-19-1)). Observed vs. expected site heterozygosity notably departed from 1:1 for lcWGS, with observed heterozygosity being underestimated at higher values of expected heterozygosity (Figure [S10](#page-19-1)).

The strong association between summering areas and genomic clusters presented in the previous sections provides insight as to whether temporary or permanent dispersal is common among summering aggregations of beluga whales in eastern Canada. Individuals detected in a summering area used prominently by whales of a different cluster were identified as dispersing whales (Table [S1,](#page-19-0) Figures [2C](#page-6-0) and [5\)](#page-9-0). For the St. Lawrence Estuary and Resolute Bay regions, all seasons were considered when identifying dispersing whales due to the spatial disjunction with other regions. Seventeen dispersing whales were identified out of 500 animals (3.2%) using both ddRADseq and lcWGS datasets (Figures [2C](#page-6-0) and [5](#page-9-0)). Dispersing beluga whales belonged to the HBSC (*N* = 11 out of 363 whales, or 3.0%), CS (*N* = 1 out of 38 whales, or 2.6%), and LGR (*N* = 5 out of 39 whales, or 12.8%) clusters (Figure [2C\)](#page-6-0). More than half of these dispersers were identified in Cumberland Sound (*N* = 9 HBSC whales), while the rest were detected in South and North Hudson Strait (*N* = 2 LGR whales), Belcher Islands (*N* = 3 LGR whales), Northwest Hudson Bay (*N* = 1 CS whale), and the St. Lawrence Estuary (*N* = 1 HBSC whale sampled inside the summer range of SLE whales; Figures [2C](#page-6-0) and [5\)](#page-9-0). An additional HBSC female carcass was sampled in the eastern Gulf of St. Lawrence, that is, outside the summer range of SLE whales, indicating the possible path from the northern populations to the isolated SLE population (Figure [1\)](#page-3-0). The sex ratio of the 17 dispersers was male-biased (13 males, 4 females; Table [S1](#page-19-0)).

Interbreeding between genomic clusters was identified by inspecting the individual ancestry proportions obtained with ADMIXTURE. Only the lcWGS dataset was used given the higher resolution (i.e., precision) and greater number of clusters detected. Detecting interbreeding within the HBSC cluster was impractical because of its mixed ancestry, thus interbreeding was estimated solely for beluga whales from the SLE, JB, LGR, CS, and RB clusters (*N* = 118). A total of 27 out of 118 beluga whales (23%) had mixed ancestry proportions, suggesting successful interbreeding between genomic clusters (Figure [2B](#page-6-0)). Two admixed SLE individuals with ancestry proportions close to half of the other clusters (Ancestry Proportion to Other Clusters or APOC: 0.41 and 0.43) were observed and represented about 10% (2/19 whales) of the SLE individuals (Figure [2B\)](#page-6-0). Evidence of past interbreeding between clusters was present in almost half of CS whales (13/29 samples, APOC: 0.131–0.325), 35% of JB whales (14/40 samples, APOC: 0.012–0.276), and 14% for LGR whales (3/21 samples, APOC: 0.280–0.336; Figure [2B](#page-6-0)). The profile of ancestry proportions differed between the admixed beluga whales from SLE, CS, and other clusters. The two admixed SLE whales had no ancestry proportion from the RB cluster, whereas all admixed CS whales had a larger ancestry proportion of the RB cluster compared to all other admixed beluga whales (Figure [2B\)](#page-6-0). Most admixed beluga whales from JB and LGR had ancestry proportions from all 4 other clusters, that is, SLE, CS, RB, HBSC (Figure [2B](#page-6-0)).

3.4 | Association Between Mitogenome Clades and Genomic nDNA Clusters

The association between mitogenome clades and nDNA clusters was incomplete (Table [S1\)](#page-19-0). While geographical patterns were present, all three clades were identified in multiple regions during summer (Figure [S1\)](#page-19-1). The most frequent mitogenome clade was D, with 68% of whales (220/324) possessing clade D haplotypes, while 18% and 14% of whales had haplotypes from clades A and C, respectively, in our lcWGS dataset (Table [S1\)](#page-19-0). Clade D haplotypes were identified in all clusters but were strongly associated with the HBSC (185/216 or 86% whales), CS (19/25 or 76% whales), and RB (7/9 or 78% whales) clusters. Clade A haplotypes were most frequent in beluga whales of the SLE (15/19 or 79%) and LGR (16/21 or 76%) clusters. They also represented a minor proportion of the JB (9/34 or 27%) and HBSC (19/216 or 9%) clusters. Clade C haplotypes dominated among JB cluster whales (22/34 or 65% whales) but were also identified in the SLE, CS, RB, and HBSC clusters (Figure [S1](#page-19-1); Table [S1\)](#page-19-0).

4 | Discussion

Six genomic clusters were identified by applying reduced representation (ddRADseq) and low-coverage whole genome sequencing (lcWGS) to genotype 905 beluga whales from eastern Canada. While dispersal and interbreeding were observed between summer aggregations, these phenomena seemed relatively rare and insufficient to weaken the integrity of the genomic clusters. Moreover, both genotyping approaches were consistent in indicating potential subclusters within the HBSC and JB clusters. In the following sections, we first compare our results on population structure with those obtained in other studies and put these in the perspective of metrics available from the literature for other species including cetaceans. In the last two sections, we discuss the implications of our results for the conservation of beluga whales' diversity both in Canada and worldwide.

4.1 | Beluga Whales Summer Aggregations Represent at Least Six Distinct Populations in Eastern Canada

Previous studies have reported isolated populations that match beluga whale summer aggregations based on mtDNA and microsatellite loci, suggesting maternal fidelity and natal philopatry toward summering areas (Brown Gladden, Ferguson, and Clayton [1997](#page-15-7); De March, Maiers, and Friesen [2002;](#page-15-11) O'Corry-Crowe et al. [1997,](#page-17-9) [2018;](#page-17-7) Postma et al. [2012](#page-18-7); Turgeon et al. [2012\)](#page-18-8). Philopatry to summer aggregations has been reported by behavioral studies (Bonnell et al. [2022](#page-15-18); Caron and Smith [1990](#page-15-6)) and is confirmed again here with complete mitochondrial genomes (Figure [S1](#page-19-1)). Natal philopatry, however, was weakly associated to reproductive isolation investigated in past studies using nDNA. The weak differentiation described using microsatellite loci for the Eastern High Arctic-Baffin Bay, Cumberland Sound, James Bay, and St. Lawrence Estuary summer aggregations suggested the presence of reproductively isolated populations, while not distinguishing the summer aggregations in Southeast Hudson Bay Arc and Western Hudson Bay (De March, Maiers, and Friesen [2002](#page-15-11); Postma et al. [2012](#page-18-7); Turgeon et al. [2012\)](#page-18-8). Our study clearly provided support for the reproductive isolation of these four genomic clusters and also revealed a newly identified, highly geographically restricted genomic cluster of whales summering in two rivers of the Southeast Hudson Bay Arc region, that is, LGR.

To a certain extent, our results are not surprising considering that nuclear genomic datasets offer insights into fine-scale population structure missed by lower-resolution nuclear loci (Allendorf et al. [2022;](#page-14-2) Hohenlohe, Funk, and Rajora [2021\)](#page-16-9). The increased number of nuclear loci used to genotype beluga whales provided clear-cut differences between clusters and clearly improved our understanding of reproductive isolation between summer aggregations. Similarly, upscaling resolution from microsatellites to reduced representation SNP datasets identified a greater number of populations among Arctic charr *Salvelinus alpius* (Layton et al. [2020\)](#page-17-21), pike *Exos lucius* (Sunde et al. [2020\)](#page-18-18), brown trout *Salmo trutta* (Lemopoulos et al. [2019\)](#page-17-22), and harbor porpoise *Phocoena phocoena* (Lah et al. [2016\)](#page-17-23). Our results were surprising in the detection of a genomic cluster, that is, LGR, inhabiting mainly two estuaries and migrating long distance seasonally to possibly overwinter in a common area with other groups. Such a finding suggests that population genomic studies of polar marine mammals should maximize the spread of samples throughout the entire summer distribution to identify geographically highly restricted populations. Processes underlying genomic divergence among small groups of cetaceans have been identified in other whales (Whitehead, [2017](#page-18-19)). In killer whales, for example, the colonization of novel habitats was facilitated by behavioral adaptation to various ecological niches (Foote et al. [2016](#page-16-18)). Such a hypothesis is less applicable to beluga whales, which are considered opportunistic feeders and thus less specialized. Still, there could be other behavioral processes promoting genome-culture evolution and genomics divergence patterns among beluga whales in eastern Canada.

The levels of genomic differentiation observed among the six beluga whale clusters were similar to those that have been reported for relatively isolated terrestrial mammalian populations (Jensen et al. [2020;](#page-16-19) Schweizer et al. [2016](#page-18-20); Yang et al. [2016\)](#page-19-2). While the nearly ubiquitous HBSC cluster was the least differentiated, estimates of F_{ST} for other clusters ranged from 0.016 between LGR and CS to 0.103 between SLE and JB, highlighting the distinctiveness of five out of six clusters and their potential reproductive isolation. Recent studies on cetaceans using genome-wide SNPs showed intraspecific population structure in two beaked whale species with F_{ST} ranging between ca. 0.020 and 0.200 (Onoufriou et al. [2022\)](#page-17-24). In common dolphin *Delphinus delphis*, a complex hierarchical metapopulation structure was identified in Australia, Tasmania, and New Zealand, with isolation by distance driving genomic distances among subpopulations and F_{ST} ranging between ca 0.010 and 0.200 (Barceló et al. [2021](#page-15-19)). In bottlenose dolphins *Tursiops truncatus*, ecotypic differentiation drives mid-range F_{ST} values of ca. 0.050–0.150 (Ansmann et al. [2012;](#page-14-7) Louis et al. [2014](#page-17-25)). Similarly, human populations feature F_{ST} of 0.010 within continents and 0.120 at the inter-continental level (Elhaik [2012](#page-16-20)). These findings indicate that the level of differentiation observed among eastern Canadian beluga clusters justifies classifying them as populations. Consequently, we regard beluga whale populations and clusters as synonymous from this point onward. We believe that this terminology is reasonable and does not underestimate the level of differentiation between beluga genomic clusters. The highest level of genomic differentiation observed between beluga populations in our study is much lower than that observed between animal species (e.g., F_{ST} ddRADseq = 0.61 for *Sebastes* spp., Benestan et al. [2021\)](#page-15-20). A relevant example with marine mammals would be killer whale ecotypes, that is, "resident" and Bigg's, which were recently recognized as distinct species. These species also exhibited genomic differentiation (F_{ST} genome=0.32, Morin et al. [2024](#page-17-26)) higher than that of beluga whale populations.

Only a few dispersing beluga whales originating from three populations were detected $(N=17)$, showing little mixing of populations during summer. These results concur with those from previous studies where limited dispersal between populations was observed in highly mobile marine species (Hoelzel [1998;](#page-16-21) Morin et al. [2021](#page-17-27)), emphasizing the strong philopatry and summer site fidelity of beluga whale populations (Brown Gladden, Ferguson, and Clayton [1997;](#page-15-7) Caron and Smith [1990;](#page-15-6) O'Corry-Crowe et al. [1997](#page-17-9)). The sex ratio of dispersing beluga whales in our study was highly male-biased (F:M ratio=4:13 or 0.31), as observed in most mammals where males often disperse more frequently and further away than females (Dobson [1982;](#page-16-22) Pusey [1987](#page-18-21)). It is unlikely that this biased sex ratio among dispersers represents an artifact of male-biased harvest (and therefore sampling) since both the sex ratio associated with the complete dataset in this study (F:M=353:488 or 0.72) and the sex ratio of the Nunavik harvest between 1993 and 2008 (0.86; Lesage et al. [2009\)](#page-17-28) are much closer to parity than the sex ratio of dispersing beluga whales described here. A similar male bias was also observed among dispersers in beluga whales from the North Pacific Ocean (74% of dispersers were adult males; O'Corry-Crowe et al. [2018](#page-17-7)) and other cetaceans (Alexander et al. [2016](#page-14-8); Engelhaupt et al. [2009](#page-16-23); but see Baker et al. [2013;](#page-15-21) Kershaw et al. [2017\)](#page-16-24).

The population structure results using the ddRADseq and lcWGS approaches were remarkably consistent, showing the

robustness of the results (Figures [2A,B](#page-6-0) and [4B\)](#page-8-0). In other studies, a gain in population structure resolution was observed from ddRADseq to lcWGS approaches for Greenland halibut *Reinhardtius hippoglossoides* (Carrier et al. [2020;](#page-15-22) Ferchaud et al. [2022;](#page-16-25) Roy et al. [2014](#page-18-22)), and Atlantic salmon *Salmo salar* (Bertolotti et al. [2020](#page-15-23); Bradbury et al. [2015](#page-15-24)). In our study, the advantages of increased resolution to detect population structure were not obvious with the comparison of ddRADseq and lcWGS results (Figure [2A,B\)](#page-6-0), possibly because ddRADseq offered sufficient resolution or that the lcWGS dataset was too small. Using ddRADseq for the study of genomic population structure in beluga whales or marine mammals with a widespread and heterogeneous distribution may be the preferred approach to efficiently allocate financial resources. Using lcWGS for species with large genomes such as beluga whales (3.3Gb) comes at a much greater cost than that of reduced representation approaches. By allocating sequencing effort across more individuals, the reduced representation approach may be more powerful at identifying small and geographically restricted populations, such as LGR. In eastern Canada, increasing the number of samples could prove critical to better describe the potential substructure suggested here for the HBSC (Figure [S11](#page-19-1))and JB populations (Figure [3A\)](#page-7-0). Similarly, this approach would be valuable for all cetaceans globally, which could present locally restricted small populations presently overlooked if the genotyping costs did not allow to sample all relevant distribution areas.

4.2 | Migratory Behavior of Beluga Whale Populations

Previous studies focused on recognized beluga whale designatable units (DUs) and used either satellite-tagging or genetic markers (mtDNA) to describe migratory movements. The James Bay and Cumberland Sound DUs migrate only short distances within their respective regions according to these data (Bailleul et al. [2012a;](#page-14-1) Jonkel [1969](#page-16-26); Postma et al. [2012;](#page-18-7) Turgeon et al. [2012](#page-18-8)). In contrast, the Eastern Hudson Bay and Western Hudson Bay DUs undertake long seasonal migrations between their summering areas in Hudson Bay and wintering areas in Hudson Strait and adjacent areas (Bailleul et al. [2012a,](#page-14-1) [2012b;](#page-15-25) Lewis et al. [2009;](#page-17-4) Smith [2007;](#page-18-23) Turgeon et al. [2012](#page-18-8)). Our results broadly confirmed the different migratory behaviors of these DUs and contributed some additional refinements.

For the James Bay DU, an earlier study deployed satellite transmitters on 14 beluga whales (3F:11M) and all animals remained within James Bay throughout the fall and winter until transmissions ceased (Bailleul et al. [2012a\)](#page-14-1). This contrasts with the current study, where 41 out of 42 JB samples collected in spring and fall (7F:33M, 1 of unknown sex) were harvested by hunters from the Belcher Islands and from the Southeast Hudson Bay Arc, suggesting these whales do migrate into surrounding regions seasonally (Figure [5](#page-9-0)). Additionally, all JB whales harvested in winter were harvested in the Belcher Islands region (2F:14M). Differences between the two studies may reflect the limited sample size of satellite-tagging studies relative to the large JB population, the incomplete seasonal coverage of tracking data (deployment dates in late July–August, tag failure between 5 November and 10 February; Bailleul et al. [2012a](#page-14-1)), or a possible bias introduced by tracking whales tagged in eastern James Bay, while most whales are observed in western James Bay during summer (Gosselin et al. [2002](#page-16-27); Gosselin, Hammill, and Mosnier [2017;](#page-16-28) Kingsley [2000](#page-16-29); Smith and Hammill [1986\)](#page-18-24). Alternatively, sexual segregation might explain the strong male-biased migratory behavior identified in our study (Loseto et al. [2006;](#page-17-29) Smith, Hammill, and Martin [1994](#page-18-25)), which could not have been captured by the tracking study since tagged animals from James Bay in Bailleul et al. [\(2012a\)](#page-14-1) were either females or young males.

For the Cumberland Sound DU, a total of 18 whales have been equipped with satellite tags, and six provided information into the winter season indicating all animals remained at the mouth or just outside of Cumberland Sound (Richard and Stewart [2008;](#page-18-26) Watt, Orr, and Ferguson [2016](#page-18-27)). The restricted sample size from the Cumberland Sound and nearby regions in our study limits conclusions about migratory behaviors of the CS population, but the fact that only one CS whale was detected outside of Cumberland Sound (i.e., Frobisher Bay), in spring suggests this DU performs short seasonal migrations, remaining in the vicinity of its summer aggregation habitat.

The HSBC and the LGR populations were both harvested in the Hudson Bay and Strait during fall (Figure [5\)](#page-9-0). Both populations summer in Hudson Bay and undertake long-distance migrations to overwinter in the Hudson Strait, northern Ungava Bay, or possibly in the Labrador Sea (Bailleul et al. [2012a;](#page-14-1) Breton-Honeyman et al. [2016](#page-15-26); Lewis et al. [2009;](#page-17-4) Little et al. [2023\)](#page-17-30). Satellite-tracking studies on beluga whales summering in the western regions of Hudson Bay followed at least three different fall migratory routes. They either (i) moved up the west coast of the Hudson Bay and crossed the North Hudson Bay heading east to the Hudson Strait, or (ii) passed close to the Belcher Islands prior to reaching the northeastern coast of the Hudson Bay, or (iii) crossed the center of Hudson Bay to reach the northern Nunavik coast prior to moving toward Ungava Bay (Smith [2007\)](#page-18-23). In contrast, satellite-tagged beluga whales summering in Southeast Hudson Bay Arc have been tracked migrating along the Northeast Hudson Bay coast, often remaining within 15 ± 12 km of shore (i.e., closer to the coast than observed for whales tagged in the western regions of the Hudson Bay), to overwinter in Hudson Strait or in the Labrador Sea (Lewis et al. [2009](#page-17-4); Bailleul et al. [2012a](#page-14-1)). Harvest location data for HBSC and LGR whales in the fall agree with findings obtained by satellite-tagging studies, although direct migratory corridors from western regions of Hudson Bay to South Hudson Strait could not be inferred, possibly because HBSC whales have a lower risk of being harvested since they migrate farther offshore relative to whales summering in Southeast Hudson Bay Arc (Smith [2007\)](#page-18-23). In spring, different migration phenologies were observed for the HBSC and LGR populations moving toward their summer aggregations in Hudson Bay. Only animals from the HSBC population were harvested in Hudson Strait and in the Northeast Hudson Bay areas, whereas the LGR population was harvested from the Southeast Hudson Bay Arc or Belcher Islands. These results suggest that LGR whales move offshore and return earlier to Hudson Bay compared to animals from the other populations.

4.3 | Improved Understanding of Reproductive Isolation and Inbreeding Status of Eastern Canada Conservation Units

The populations identified in our study correspond to a large extent to Canadian conservation units, that is, DUs (COSEWIC [2016](#page-15-2)). The St. Lawrence Estuary, James Bay, Cumberland Sound, and Eastern High Arctic-Baffin Bay DUs (COSEWIC [2014,](#page-15-1) [2020\)](#page-15-3) correspond respectively to the SLE, JB, CS, and RB populations identified in this study. The correspondence is incomplete between genomics populations and the Eastern Hudson Bay, Western Hudson Bay, and Ungava Bay DUs, for different reasons.

The Eastern Hudson Bay DU is composed of at least two populations, that is, LGR and HBSC, based on our results. The Southeast Hudson Bay Arc and the Belcher Islands are considered the regions hosting the Eastern Hudson Bay DU, which has a Threatened status according to COSEWIC (COSEWIC [2020\)](#page-15-3). The LGR is a population mainly associated with beluga whales summering in and around the Little and Great Whale Rivers, that move between the coast and the offshore Belcher Islands (Bailleul et al. [2012a](#page-14-1); Figure [2C](#page-6-0)). The Great and Little Whale Rivers suffered from some of the most intensive whale harvests (Reeves and Mitchell [1987](#page-18-2)). It is noteworthy that the Little Whale River is nowadays the only summer aggregation area in the Southeast Hudson Bay Arc region that still hosts significant numbers of beluga whales (Sauvé et al. [2024](#page-18-28)). In contrast, the HBSC population is found in most regions of the Hudson Bay and Strait during summer and may host genomic subclusters (Figures [S2](#page-19-1) and [S3\)](#page-19-1). Substructure within the HBSC population and in the Eastern Hudson Bay DU was weak but apparent with both datasets (Figure [2A,B,](#page-6-0) Figures [S2,](#page-19-1) [S3, S11](#page-19-1)). No population specific to the Belcher Islands was identified but a change in genomic composition was observed between the animals from the Belcher Islands and Southeast Hudson Bay Arc (Figures [S2,](#page-19-1) [S3,](#page-19-1) [S11](#page-19-1)). These results support those from Parent et al. ([2023\)](#page-17-8), which identified that the mtDNA lineages of beluga whales from the Belcher Islands differed from those of the Southeast Hudson Bay Arc and adjacent areas. Thus, the mtDNA and nDNA genomic information both suggests the presence of two additional populations other than LGR in the Eastern Hudson Bay DU. However, we believe that our current nDNA datasets lack the scope to provide a confident interpretation of the two subclusters. Further genotyping in this area is needed to increase certainty in identification of populations with lower genomic differentiation, a well-known problem in population genomics analyses (Janes et al. [2017;](#page-16-14) Kalinowski, [2011;](#page-16-30) Toyama et al. [2020](#page-18-29); Wang [2017](#page-18-30)).

The Western Hudson Bay and Ungava Bay DUs consisted only of beluga of the HBSC population. Both DUs have been identified because of their ecological disjunction from other conservation units (COSEWIC [2020;](#page-15-3) Finley et al. [1982](#page-16-31)). Our results also suggest that the genomic composition differed between beluga whales from Western Hudson Bay and Hudson Strait (Figures [S2](#page-19-1), [S3,](#page-19-1) [S11\)](#page-19-1). Again, genotyping more animals from these two areas, especially from key areas such as Marralik River in Ungava Bay, Nelson, Churchill, and Seal Rivers in Western Hudson Bay, is necessary to clarify the substructure within the HBSC population.

Our results for inbreeding varied greatly between Threatened and Endangered DUs associated with a genomic population, that is, Eastern Hudson Bay (LGR), Cumberland Sound (CS), and St. Lawrence Estuary (SLE). Beluga whale abundances in Eastern Hudson Bay and Cumberland Sound have declined markedly due to commercial whaling. Their abundances are estimated at 2900–3200 and 1100 beluga whales, respectively, and are still declining (Hammill et al. [2023](#page-16-1); Watt et al. [2021\)](#page-18-3). Despite low population abundance, neither the LGR nor the CS populations show signs of high inbreeding coefficients (but note that 2/3 of LGR whales, and all CS whales used in this study were sampled prior to 2010; Table [S1\)](#page-19-0).

For the CS population, recent admixture may account for its comparable inbreeding coefficient to other large populations. Dispersers and "admixed" beluga whales were more frequent in Cumberland Sound compared to other regions, suggesting effective immigration in this area. Half of dispersing beluga whales and almost half of the admixed whales identified in this study were harvested in Cumberland Sound. Satellite tracking data of summering Cumberland Sound beluga whales suggests that these whales overwinter isolated from other populations in a persistent polynya located on the southeast side of the Sound (Richard and Stewart [2008](#page-18-26); Watt, Orr, and Ferguson [2016](#page-18-27)). In the past, immigrants to Cumberland Sound likely overwintered and reproduced with the CS beluga whale population based on our results. Alternatively, the presence of admixed individuals, especially those with a "high" ancestral proportion belonging to the RB population, could be the outcome of interbreeding during the late winter breeding period when both populations occur in Baffin Bay (Heide-Jørgensen et al. [2003](#page-16-32)). Despite some level of gene flow, the integrity of the CS population appears to be maintained.

In contrast, there is little evidence for extensive admixing between the LGR and the HBSC populations, discounting recent and extensive admixture as an explanation for the low inbreeding detected among LGR whales. The rare admixing events between LGR and HBSC whales are inconsistent with previous hypotheses that beluga whales from different summer aggregations in the Hudson Bay have ample opportunities to interbreed either by congregating in common wintering grounds or when migrating back to their summer areas using the same migration routes (Brown Gladden, Ferguson, and Clayton [1997;](#page-15-7) Brown Gladden et al. [1999;](#page-15-8) De March and Postma [2003](#page-15-9)). The few admixing events detected in this study support the rarity individual dispersal and admixing between populations. From a management perspective, this translates to reduced opportunities for genetic rescue of small and inbred summering aggregations, and because of the strong site fidelity highlighted in beluga whales, repopulation of summering areas due to immigration from whales of other populations is unlikely. This statement is in agreement with the Inuit Qaujimajatuqangit that report limited observations in rivers or estuaries where beluga whales used to summer (e.g., Inukjuak River, Puvirnituq Bay; Archéotec Inc. [1990\)](#page-14-9).

For the St. Lawrence Estuary DU, results showed strong evidence of inbreeding despite some evidence of immigration and gene flow from eastern Arctic beluga whales. The detection of one immigrant HBSC whale in the St. Lawrence Estuary and the presence of admixed SLExHBSC individuals indicate that

dispersal from the north has occurred in the past. Beluga whales were formerly much more abundant along the Labrador coast and approximately 100 years ago, an influx of beluga whales thought to be of Arctic origin was observed in the St. Lawrence Estuary, possibly in response to a change in water temperatures (Brice-Bennett [1978](#page-15-27); Vladykov [1944\)](#page-18-31). Although beluga whale numbers in Ungava Bay and along the Labrador coast have declined, northern vagrants identified from their contaminant loads and trace element levels are still reported in the eastern Gulf of St. Lawrence and Newfoundland waters (V. Lesage, unpublished data). However, the high inbreeding coefficient observed among SLE whales indicates that these vagrants, if they venture into the SLE whales' distribution range, may not contribute in noticeable ways to the genetic diversity of this DU. Our most parsimonious hypothesis to explain the difference in inbreeding coefficients between SLE, LGR, and CS is that the SLE population underwent a strong founder effect or bottleneck prior to recent hunting and bounty programs from the 16th to the mid-20th centuries. Demographic models using genomic data would, however, be essential to shed light on the evolution of the genetic diversity of this specific population.

4.4 | Conclusion

The analyses in this study leveraged two methods for sampling genomic loci, demonstrating a high degree of congruency between reduced representation (ddRADseq) and whole genome (lcWGS) sequencing approaches. By analyzing a large number of individuals (>900) and loci (ca. 24,000–846,000 SNPs), we were able to improve on the scale of genomic analyses of cetaceans, which typically feature 10-100s of individuals and 100-1000s SNPs. We conclude that reproductively isolated units among beluga whales are consistent but not entirely synonymous with summer aggregations in eastern Canada, which currently serve as the basis for conservation management (DUs for COSEWIC; COSEWIC [2016](#page-15-2), [2020](#page-15-3)). Mitochondrial DNA is currently used to estimate harvesting-induced mortality across management areas (DFO [2022](#page-16-5); Hammill et al. [2023;](#page-16-1) Parent et al. [2023\)](#page-17-8). Our work, however, showed an incomplete association between clade structure identified with mtDNA and populations identified with nDNA; the impact of these results for management warrant further investigation. Also, the development of new genomic tools using SNPs to discriminate genomic clusters (e.g., GTseq; Campbell, Harmon, and Narum [2015\)](#page-15-28), which are more cost- and time-effective than ddRADseq and lcWGS in a monitoring program, should be a priority to quantify harvestinginduced yearly mortality of beluga whale populations in eastern Canada. Our findings also suggest the existence of a more complex genetic structure within the HBSC population. We suspect that additional genomic clusters remain unresolved in our analysis, justifying the need to increase the scope of sampling in future analyses.

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Ethics Statement

Ethical approval was not required since tissues have been collected by hunters as part of the Nunavik and Nunavut tissue sampling program of Fisheries and Oceans Canada.

Conflicts of Interest

The authors declare no conflicts of interests.

Data Availability Statement

All raw read data were deposited with NCBI's short read archive under the BioProjectID PRJNA984210. New mitochondrial genomes are published under accessions OQ553962–OQ554323. Workflow details and scripts for compiling the lcWGS datasets are available via Github: <https://github.com/tbringloe/WGS-NOVAC>. Workflow details and scripts for compiling the ddRADseq datasets and performing analyses are available at: [https://doi.org/10.5281/zenodo.14004391.](https://doi.org/10.5281/zenodo.14004391)

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Supporting Information

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