

#### RESEARCH ARTICLE

# Cetacean spatial trends from 2005 to 2019 in Svalbard, Norway

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## **Abstract**

This study uses cetacean sighting data, acquired via a citizen science programme, to update distributions and spatial trends of whales and dolphins in waters around the Svalbard Archipelago during the period 2005–2019. Distributions, based on kernel density estimates, from an early period (2005–2009) and a recent period (2015-19) were compared to identify potential shifts in distribution in this area, which is experiencing rapid warming and concomitant sea-ice losses. Among the three Arctic endemic cetaceans, white whales (Delphinapterus leucas, also known as beluga) had a stable, coastal distribution throughout the study, whereas narwhals (Monodon monoceros) and bowhead whales (Balaena mysticetus) were observed only north of the archipelago, but with increasing frequency during the recent period. White-beaked dolphins (Lagenorhynchus albirostris) had a stable distribution along the continental shelf break, west and south of Svalbard. Sperm whale observations shifted from west of Bjørnøya during the early period to being concentrated around the north end of Prins Karls Forland, west of Spitsbergen during the recent period. The four summer-resident baleen whales—blue whales (Balaenoptera musculus), fin whales (Balaenoptera physalus), humpback whales (Megaptera novaeangliae) and minke whales (Balaenoptera acutorostrata)—have shifted their distributions from the continental shelf break west of Spitsbergen during the early period into fjords and coastal areas during the recent period. These changes coincide with increased inflows of Atlantic Water into the fjords along the west coast of Spitsbergen and across the north of the archipelago.

To access the supplementary material, please visit the article landing page

#### Kevwords

Arctic; citizen science; climate change; distribution; dolphins; whales

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## **Abbreviations**

AW: Atlantic Water KDE: kernel density estimate MMSDB: Marine Mammals Sightings Database NPI: Norwegian Polar Institute NRC: Norwegian Research Council SD: standard deviation

# Introduction

The Svalbard Archipelago is one of the areas on the globe where climate change is occurring at the fastest rate (Core Writing Team et al. 2014; Portner et al. 2019). This High-Arctic archipelago is influenced by warm AW transported northward by the West Spitsbergen Current (Fig. 1), which brings nutrient and plankton-rich water to fjords and troughs around the islands (Menze et al. 2020). The West Spitsbergen Current has experienced a marked warming during the last two decades (Spielhagen et al. 2011; Tverberg et al. 2014; Lind et al. 2018). This has affected the marine ecosystem in the Svalbard area markedly, reducing sea-ice cover dramatically and increasing the number of Atlantic species in the marine ecosystem, posing an uncertain future for endemic Arctic species in the area (Kovacs et al. 2011; Fossheim et al.

2015; Descamps et al. 2017). The dramatic changes taking place in both the physical and biotic environment around Svalbard make it particularly valuable to document changes in species distributions at this time in order to provide management bodies and stakeholders with sufficient information for conservation planning where this is deemed necessary (Laidre et al. 2015).

The NPI manages a citizen science sightings database MMSDB (https://data.npolar.no/sighting/) that stores observations of marine mammals around Svalbard. Storrie et al. (2018) used the MMSDB to study the distribution and habitat characteristics of cetaceans around Svalbard during the period from 2002 to 2014. This produced important baseline data that showed the first signs of distributional change for some whale species, adding to the growing list of successful studies using citizen science to monitor marine mammal populations

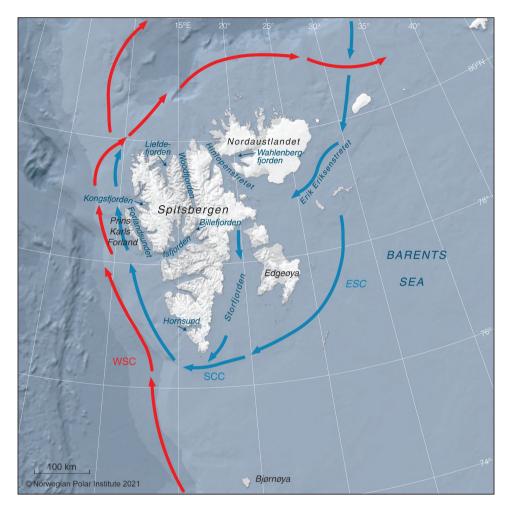


Fig. 1 Map depicting Svalbard, Norway, and surrounding Arctic (blue) and Atlantic Water (red) currents: West Spitsbergen Current (WSC); East Spitsbergen Current (ESC); South Cape Current (SCC).

(e.g., Lodi & Tardin 2018; LaRue et al. 2020; Stephenson et al. 2020; Bengtsson et al. 2021). Since the time of Storrie et al.'s (2018), study an increasing number of observations of summer-resident baleen whales have been recorded on the coastal shelves and in the fjords of western Spitsbergen, new studies have been published on the movement patterns of individual whale species in Svalbard (e.g., Hamilton et al. 2019; Kovacs et al. 2020; Lydersen et al. 2020), and detailed studies on temporal trends of water masses in western Spitsbergen fjords have become available (e.g., Tverberg et al. 2019; Skogseth et al. 2020). The purpose of this study is to: (1) update the cetacean distribution analyses performed by Storrie et al. (2018; which included data up to 2014) by including observations recorded in the MMSDB from 2015-19 and exploring the extended time series, comparing the early years to the most recent for both the Arctic endemic species (white whales, narwhal and

bowhead whales) that reside in the High Arctic yearround and the seasonally resident cetacean species; and (2) investigate potential correlations between AW inflows into the fjords on the west coast and the observations of the most common summer-resident baleen whales (blue whales, fin whales, minke whales and humpback whales) in the area.

## Methods

Observations of marine mammals in Svalbard and surrounding waters (74–84°N and 0–35°E; Fig. 1) have been recorded systematically since 2002 in the NPI's MMSDB, documenting contact information for the observer/observing vessel, date, coordinates and information about species encountered, group size and other parameters, such as body condition. The first few years (2002–04) had few records, so the start year in this study was set to

2005. The most important contributors to the MMSDB include marine cruise expeditions operators, many associated with the Association of Arctic Expedition Cruise Operators, the Norwegian Coast Guard, research institutes (e.g., the NPI and the Norwegian Institute of Marine Research) and the Governor of Svalbard's field inspectors and residents in Svalbard. Most reports come from expedition leaders and guide naturalists, who are experienced marine mammal spotters. All rare sightings are checked before being entered into the database, usually with photographic confirmation (see Storrie et al. 2018 for more details). This study provides an update to the study by Storrie et al. (2018), which covered the period 2005-2014, by including cetacean observations from 2015-19 and comparing these recent, novel data with data collected in a five-year period 10 years before (2005–09).

Species that did not have more than 10 observations in a given time period—sei whale [Balaenoptera borealis], long-finned pilot whale (Globicephala melas), northern bottlenose whale (Hyperoodon ampullatus) and killer whale (Orcinus orca)—were not analysed further in this study, but a map of where they have been observed is presented in Supplementary Fig. S1. For the species with more sightings, KDEs were calculated for each species with the ks-package in R version 4.0.2 (R Core Team 2020), using a plug-in bandwidth selector and a grid size of 1 km, displayed with 10 quantiles (Silverman 1986; Wand & Jones 1994; Chacón & Duong 2018). To visualize temporal changes in observation frequencies, KDEs for the period 2005-09 were subtracted from KDEs calculated for the most recent five years (2015–19). Since there is no discrimination between land and sea in the built-in kde-function in the ks-package, a land polygon of the Svalbard Archipelago (https://geodata.npolar.no/) was plotted on top of kernels for visual representation of KDEs.

Potential northward expansions of the different species were explored by calculating linear regressions of yearly mean latitude of observations. Level of significance was set at  $\alpha = 0.05$  for all analyses.

To investigate whether the amount of AW in Svalbard fjords influenced the number of sightings of summerresident baleen whales during a given year, correlation coefficients were calculated between the number of observations per year and the annual mean summer fraction of AW for west coast fjords for which these oceanographic data were available (Isfjorden and Kongsfjorden). The annual mean summer fractions of AW (also including transformed AW) compared to other water masses present (e.g., Arctic Water, Local Water and Intermediate Water) were acquired from Tverberg et al. (2019) and Skogseth et al. (2020). Water masses were determined on the basis of temperature and salinity in Kongsfjorden (1994-2016, Tverberg et al. 2019) and Isfjorden (1987-2017, Skogseth et al. 2020). Prior to analysis, the distribution of the data was tested for normality using Shapiro-Wilk's normality test. Depending on whether the data fulfilled the assumption of normality, either a Pearson correlation coefficient (t; normally distributed data) or a Kendall's rank correlation coefficient (z; non-normally distributed data) was calculated.

## Results and discussion

The MMSDB contains 7036 cetacean observation events during the study period (2005-2019), with a total of 32 297 animals observed (Table 1). The average number of cetacean observations recorded each year was 469 (SD = 269), with the lowest number of observations made during 2018 (207) and the greatest during 2012 (1000) (Supplementary Table S1). During the recent period (2015-19), 1298 observations were recorded (Table 1), which make up 18.4% of the total number of cetacean sightings in the MMSDB. Most of the observations in the recent period (72.3%) were made during summer (June-August), the period when marine activities reach their yearly peak in Svalbard. Only 155 (2.2%) observations were made during the polar night (November-February). The minke whale (Balaenoptera acutorostrata) was the species with the most observations (Table 1), comprising 29.6% of all observations. In terms of number of individuals, white whales (Delphinapterus leucas) and white-beaked dolphins (Lagenorhynchus albirostris) dominated, with 38.8% and 23.6% of the total number of individuals respectively (Table 1), which is unsurprising given their highly social lifestyles. These two species had the greatest median group sizes of the species within this study: 10 and 6, respectively (Table 1).

# Arctic endemic species

Observations of white whales, both in terms of number of observations and number of animals, were high in the fjords and close to shore, especially along the west coast of Spitsbergen (Fig. 2; Supplementary Fig. S2). This is unsurprising given their tight affiliation to the coastline and glacier fronts (Lydersen et al. 2001; Lydersen et al. 2014; Vacquié-Garcia et al. 2018; Vacquié-Garcia et al. 2020). The high observation frequency on the west coast in this study is in keeping with the known seasonal distribution of white whales, which favour the west coast of Spitsbergen during summer (Vacquié-Garcia et al. 2018). The patterns were similar during the early and the recent periods of the study and there was no significant trend in mean latitude of the observations for this species (Fig. 3). Tracking studies of white whales have shown that they

**Table 1** Number of observations (proportion of total observations in a given time period) and median group size (rounded) by species for cetaceans observed around Svalbard, Norway, during three time periods: 2005–09 (early), 2014–19 (recent) and all years in the period 2005–2019.

| Species                 | Number of observations |             |                        | Number of individuals |              |                        | Median     |
|-------------------------|------------------------|-------------|------------------------|-----------------------|--------------|------------------------|------------|
|                         | 2005–09                | 2015–19     | All years<br>2005–2019 | 2005–09               | 2015–19      | All years<br>2005–2019 | group size |
| White whale             | 97 (3.5%)              | 231 (17.8%) | 513 (7.3%)             | 1729 (17.9%)          | 6852 (69.5%) | 12 542 (38.8%)         | 10         |
| Narwhal                 | 11 (0.4%)              | 15 (1.2%)   | 30 (0.4%)              | 47 (0.5%)             | 110 (1.1%)   | 162 (0.5%)             | 1          |
| Bowhead whale           | 22 (0.8%)              | 28 (2.2%)   | 57 (0.8%)              | 47 (0.5%)             | 81 (0.8%)    | 142 (0.4%)             | 1          |
| White-beaked dolphin    | 344 (12.5%)            | 67 (5.2%)   | 689 (9.8%)             | 3301 (34.2%)          | 1087 (11.0%) | 7622 (23.6%)           | 6          |
| Sperm whale             | 61 (2.2%)              | 14 (1.1%)   | 117 (1.7%)             | 76 (0.8%)             | 14 (0.1%)    | 137 (0.4%)             | 1          |
| Blue whale              | 40 (1.5%)              | 283 (21.8%) | 505 (7.2%)             | 60 (0.6%)             | 473 (4.8%)   | 820 (2.5%)             | 1          |
| Fin whale               | 713 (25.9%)            | 192 (14.8%) | 1583 (22.5%)           | 1811 (18.8%)          | 387 (3.9%)   | 3670 (11.4%)           | 1          |
| Humpback whale          | 311 (11.3%)            | 121 (9.3%)  | 833 (11.8%)            | 680 (7.0%)            | 319 (3.2%)   | 2657 (8.2%)            | 1          |
| Minke whale             | 883 (32.1%)            | 321 (24.7%) | 2081 (29.6%)           | 1359 (14.1%)          | 474 (4.8%)   | 3126 (9.7%)            | 1          |
| Sei whale               | 16 (0.6%)              | 2 (0.2%)    | 33 (0.5%)              | 45 (0.5%)             | 7 (<0.1%)    | 86 (0.3%)              | 2          |
| Long-finned pilot whale | 3 (0.1%)               | 0           | 4 (<0.1%)              | 13 (0.1%)             | 0            | 14 (<0.1%)             | 3          |
| Northern bottlenose     | 15 (0.5%)              | 3 (0.2%)    | 38 (0.5%)              | 43 (0.4%)             | 7 (<0.1%)    | 100 (0.3%)             | 2          |
| Killer whale            | 21 (0.8%)              | 5 (0.4%)    | 42 (0.6%)              | 114 (1.2%)            | 13 (0.1%)    | 178 (0.6%)             | 3          |
| Unidentified            | 215 (7.8%)             | 16 (1.2%)   | 511 (7.3%)             | 331 (3.4%)            | 33 (0.3%)    | 1041 (3.2%)            | -          |
| Total                   | 2752                   | 1298        | 7036                   | 9656                  | 9857         | 32 297                 | -          |

spend somewhat less time immediately adjacent to glacier fronts and more time in fjords in recent years compared to two decades ago (Vacquié-Garcia et al. 2018; Hamilton et al. 2019). However, the largest relative increase in observation frequency in this study was seen deep in Billefjorden, an area with a retracting tidewater glacier (Fig. 2). This is almost certainly the consequence of increased tourism in the Isfjorden area, with day-trip excursions to Billefjorden occurring virtually daily throughout the summer.

There were only a few observations of narwhals (Monodon monceros) in recent years (Table 1), with the majority being seen in the north-eastern parts of Svalbard (Supplementary Fig. S3), similar to the majority of earlier observations of this species within the archipelago (see Gjertz 1991; Lydersen et al. 2007). However, the frequency of sightings in the past was highest in Wahlenbergfjorden, in western Nordaustlandet (Supplementary Fig. S3), while during the last five years the frequency of sightings was highest north of Svalbard, at around 81°N (Supplementary Fig. S3). During a recent survey, narwhals were observed deep into the marginal ice zone north of Svalbard (Vacquié-Garcia et al. 2017). This association with heavy pack ice probably explains why so few narwhals are observed close to Svalbard in the recent period, given the northward retreat of the edge (Walsh et al. 2017; Lebedev et al. 2019).

The Spitsbergen bowhead whale (*Balaena mysticetus*) stock is tightly associated with sea ice, feeding at the marginal ice zone during summer and moving deep into the pack ice during winter (Vacquié-Garcia et al. 2017;

Kovacs et al. 2020). It is therefore not surprising that the few bowhead whale observations in the recent period have occurred north of the archipelago, between 80°N and 82°N (Supplementary Fig. S4). During the period 2005–09, bowhead whales were seen mostly west of 10°E (Supplementary Fig. S4) because designated bowhead expeditions took place to the sea-ice edge during several springs during that period (see Wiig et al. 2010). However, observation frequencies in the Svalbard area were highest between 10°E and 20°E in the recent period (Supplementary Fig. S4). The increased observation rates north of the archipelago, and decreased rates west of and around Spitsbergen, resemble the pattern seen for narwhals, and are likely similarly due to the northward retreat of the marginal ice zone.

# **Summer-resident species**

Sightings of white-beaked dolphins are relatively common around Svalbard, mainly in groups: the median group size in this study was 6, though 13.6% of all white-beaked dolphin observations were of groups consisting of 20–200 animals. Most sightings of this species occurred along the continental shelf break, west of the archipelago, from 74°N to 80°N, during both the early and recent periods (Fig. 4). In terms of number of animals, the pattern through time was similar, although recently observations have been concentrated just west of the northern tip of Prins Karls Forland (Supplementary Fig. S5). Although this dolphin species is numerous in the Barents Sea region, few studies

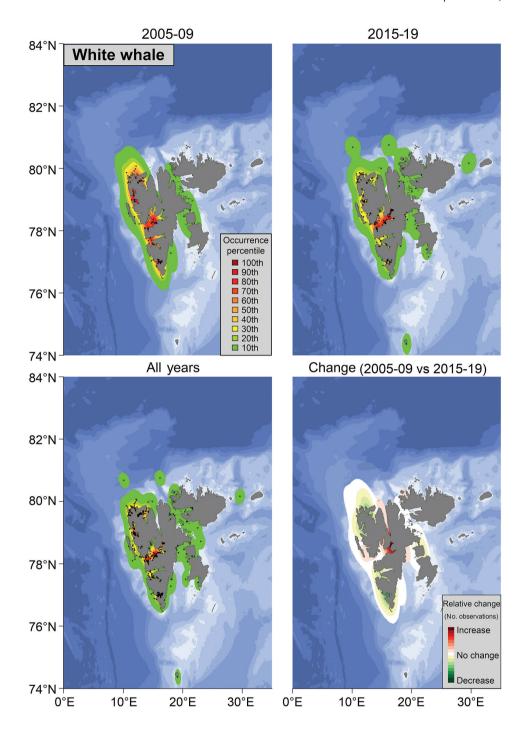
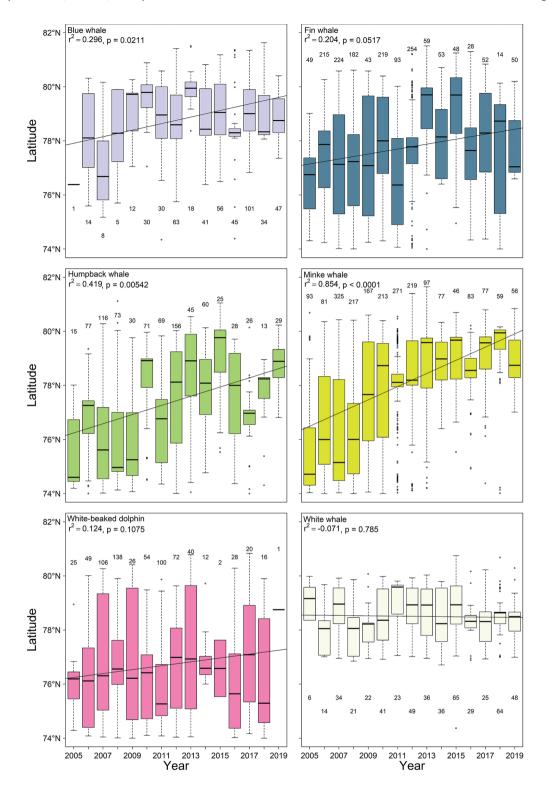


Fig. 2 KDE plots showing observation frequencies of white whales around Svalbard, Norway, during 2005-09, 2015-19 and 2005-2019 as well as the changes in observation frequency between 2005–09 and 2015–19. Black dots indicate observation locations.

have been conducted on them. They appear to have a strong affinity to the Polar Front (Fall & Skern-Mauritzen 2014), where suitable small fish prey densities are thought to be high (Johannesen et al. 2012; Bergstad et al. 2018; Menze et al. 2020). They are therefore concentrated along the continental shelf edges because of frontal areas created by Atlantic and Arctic water masses meeting along the shelf west and south of Svalbard (Parsons et al. 1996). During 2015-19, the observation frequency of whitebeaked dolphins increased east of Bjørnøya at around 22°E



**Fig. 3** Mean annual latitude of observations of blue, fin, humpback, minke and white whales, as well as and white-beaked dolphins over the period 2005–2019 in Svalbard, Norway. Boxes contain values between the 25th and the 75th percentiles, divided by a line showing the median. Vertical lines outside the boxes extend to the maximum and the minimum values up to 1.5 times higher or lower than the upper and lower quartile. Circles represent outliers, more than 1.5 times higher or lower than the upper and lower quartile. Linear regression of the means for each year are displayed as a black line together with the  $r^2$  value for the regression (in the top left corner). Numbers above or below error bars show sample sizes.

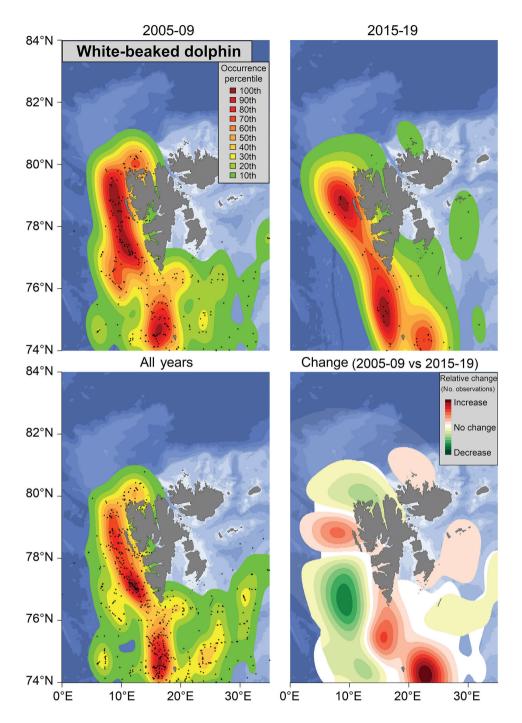


Fig. 4 KDE plots showing observation frequencies of white-beaked dolphins around Svalbard, Norway, during 2005–09, 2015–19 and 2005–2019 as well as the changes in observation frequency between 2005–09 and 2015–19. Black dots indicate observation locations.

and in the area between Bjørnøya and the southern part of Spitsbergen, compared to 2005-09 when more sightings occurred west of Hornsund (Fig. 4). Observation frequency also increased moderately west of the north tip of Prins Karls Forland, while it decreased along the

continental shelf break south of 78°N (Fig. 4). Despite these changes, observation frequencies remained high in Polar Front areas and the mean latitude of white-beaked dolphin observations did not change significantly with time (Fig. 3).

Observations of sperm whales (Physeter macrocephalus) are relatively rare in the MMSDB (Table 1), which is most likely because they feed in deep waters, off the Svalbard shelf where boats (observers) travel less frequently (e.g., Teloni et al. 2008). Sighting biases are also very likely because sperm whales spend long periods (up to hours) underwater and are very cryptic when at the surface because little of their body shows and their blows are low and diffuse. Carcasses of male sperm whales are washed ashore on the west and north coasts of Svalbard with some regularity (e.g., Derocher et al. 2002; NozoMojo 2018), indicating a regular presence of this species in Svalbard's waters. Sperm whales were observed with high frequency east of Bjørnøya, at around 74.5°N and 15°E in 2005-09 (Supplementary Fig. S6), but recently they are more often seen in the northern parts of Forlandsundet (Supplementary Fig. S6). The relative increase in observation frequency in north-western Spitsbergen is based on few observations and should be interpreted with caution.

Blue whales (*Balaenoptera musculus*) were sighted most often in Isfjorden, Forlandsundet and in Woodfjorden (Fig. 5). During 2005–09, observation frequencies were high in the northern part of Spitsbergen around Woodfjorden and blue whales were seen with moderate frequency along the continental shelf break west of Spitsbergen. During 2015–19 observation frequencies were highest in Isfjorden and Forlandsundet (Fig. 5). Blue whales are seen more frequently within west coast fjords now compared to a decade ago, with decreased numbers of observations at the continental shelf break. The mean latitude of blue whale observations increased significantly across the study period (1.2° over a decade; p = 0.02, df = 13; Fig. 3).

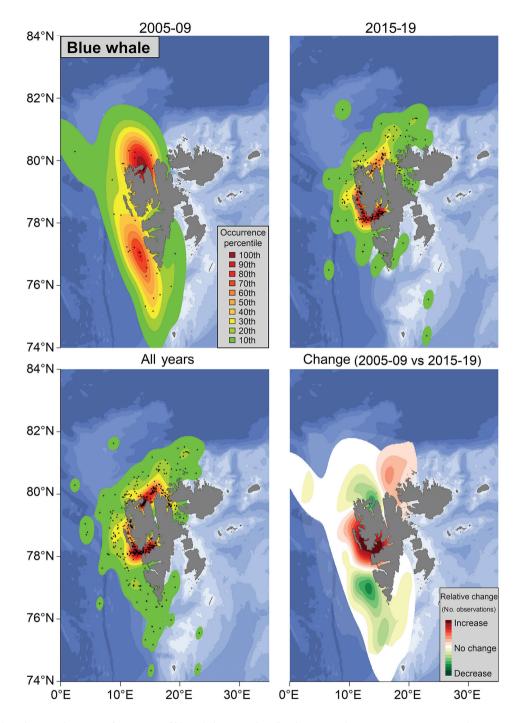
Fin whales (*Balaenoptera physalus*) were observed most often along the shelf break west of Spitsbergen and at the mouth of Isfjorden and in Hinlopenstretet in the northeast of the archipelago (Fig. 6). The continental shelf break was a focal point for their distribution in 2005–09, but recently observation frequencies were highest in Isfjorden and north-west and south-west of Spitsbergen (Fig. 6). Observations increased in frequency in Isfjorden, Woodfjorden and north-west of Nordaustlandet, while they have decreased the shelf break south-west of Prins Karls Forland when comparing 2005–09 to 2015–19 (Fig. 6). The mean latitude of fin whale observations has not changed significantly over the study period (Fig. 3).

Humpback whales (*Megaptera novaeangliae*) were observed most often close to Bjørnøya at around 74°N–75°N and 18°E–22°E (Fig. 7). They were also observed quite commonly in Hornsund, Forlandsundet, Kongsfjorden, Hinlopenstretet and in the Erik Eriksenstretet (Fig. 7). In the early period from 2005–09, most humpback whale

observations occurred north-east of Bjørnøya (ca 75°N and 22°E) and east of the archipelago at around 77°N and 26°E (Fig. 7). In the recent period from 2014–19, most sightings occurred in Hornsund and in Kongsfjorden (Fig. 7). Comparing the periods, humpback whales were more common in fjords along the west coast of Spitsbergen especially in Isfjorden and around the north-western part of Spitsbergen and were less common east of the archipelago and around Bjørnøya (Fig. 7). The mean latitude of humpback whale observations increased significantly with time (0.17° per year; p = 0.01, df = 13; Fig. 3).

Minke whales are commonly seen in Woodfjorden/Liefdefjorden, in Kongsfjorden and at the mouth of Isfjorden (Fig. 8). During 2005–09, the continental shelf break at around 74.5°N and 7°E was a hotspot for this species and they were also commonly seen around Bjørnøya and in the north-western part of Spitsbergen (Fig. 8). From 2014–19, minke whales were most often seen in Kongsfjorden and Woodfjorden, as well as in Isfjorden (Fig. 8). Observations increased in frequency in the north-western part of Spitsbergen and in Isfjorden during 2014–19 compared to 2005–09, while they decreased somewhat south of 78°N (Fig. 8). The mean latitude of minke whale observations increased significantly throughout the study (0.24° per year; p = 5.30 \*  $10^{-7}$ , df = 13; Fig. 3).

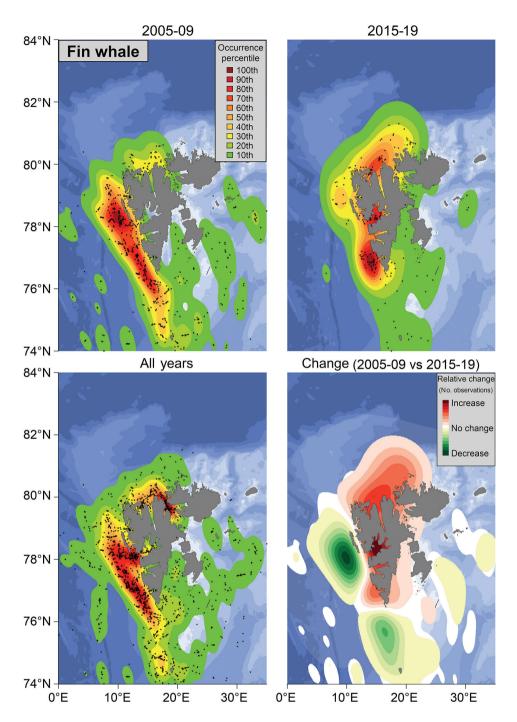
Blue, fin, humpback and minke whales all share a similar distributional shift, to varying degrees, with a northward expansion of their ranges and movement onto the continental shelf and into fjords and coastal areas. This tendency was observed by Storrie et al. (2018), but the trends are further accentuated with the additional data from five more years. The pattern seen for these four baleen whale species coincides with the increased inflow of AW into the fjords of western Spitsbergen during the last two decades (e.g., Tverberg et al. 2019; Skogseth et al. 2020) and is probably based on the changing distribution patterns of key prey species. More krill and different boreal and Subarctic fish species are now present in west coast fjords of Spitsbergen, concomitant with the changing water mass regime (Buchholz et al. 2010; Fossheim et al. 2015; Brand & Fischer 2016; Dalpadado et al. 2016; Bergstad et al. 2018). Blue whales are still reduced in population number and are poorly studied in the North-east Atlantic/Barents Sea, but it is known that they feed almost exclusively on krill in other parts of their range (e.g., Kawamura 1980; Gavrilchuk et al. 2014) and their distribution is tightly linked to this primary prey type (Lesage et al. 2018). Fin, humpback and minke whales are all more generalist feeders, with varying preference for krill, but all of these whales also feed on various fish species (Laidre et al. 2010; Skern-Mauritzen et al. 2011; Ressler et al. 2015). Levels of stable isotopes



**Fig. 5** KDE plots showing observation frequencies of blue whales around Svalbard, Norway, during 2005–09, 2015–19 and 2005–2019 as well as the changes in observation frequency between 2005–09 and 2015–19. Black dots indicate observation locations.

and persistent organic pollutants of fin and blue whales sampled around Svalbard confirm that blue whales feed on a lower trophic level than fin whales (Tartu et al. 2020). A recent tracking study of fin whales in Svalbard showed that this species occupied areas identified herein

as key sites for them, for example, the shelf break west of the archipelago (Lydersen et al. 2020). Lydersen et al. (2020) also showed that fin whales occupied areas at the shelf break, north of Svalbard, which did not have a high observation frequency in this study, while other areas



**Fig. 6** KDE plots showing observation frequencies of fin whales around Svalbard, Norway, during 2005–09, 2015–19 and 2005–2019 as well as the changes in observation frequency between 2005–09 and 2015–19. Black dots indicate observation locations.

with high observation frequencies in this study, such as Isfjorden and Hinlopenstretet, were only briefly (if at all) visited by the tagged whales. However, it is important to note that the tracking study was conducted in late September, outside the peak summer tourist season, so

these two studies should be seen as complementary seasonal snap-shots, rather than being contradictory.

The overall number of observations of seasonally resident baleen whales per year did not have a significant correlation with the fraction of AW in Isfjorden,

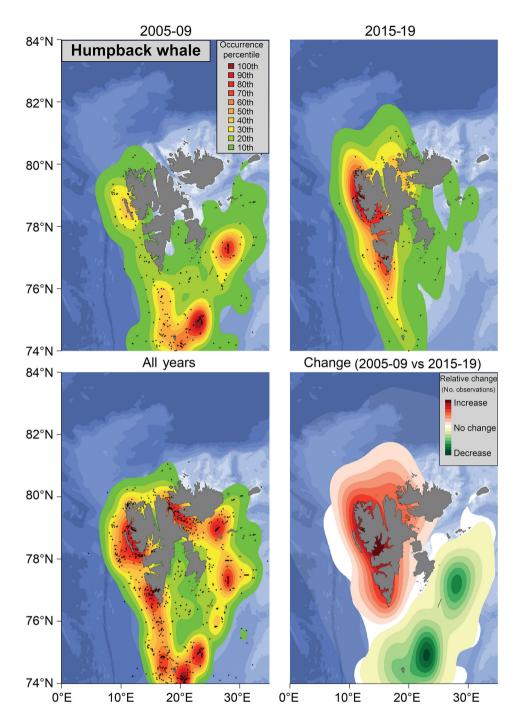
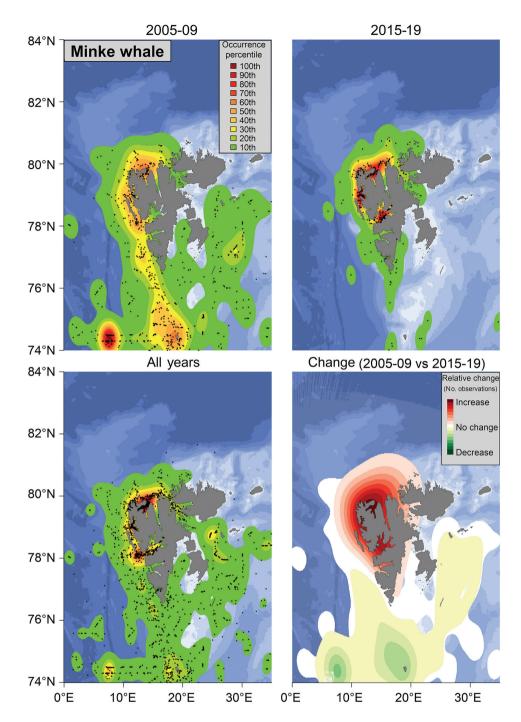


Fig. 7 KDE plots showing observation frequencies of humpback whales around Svalbard, Norway, during 2005–09, 2015–19 and 2005–2019 as well as the changes in observation frequency between 2005–09 and 2015–19. Black dots indicate observation locations.

but this correlation was positive in Kongsfjorden (z = 3.38, R = 0.76, p = 0.00072; Supplementary Fig. S7). When considering the individual species, there was a significant correlation between number of observations per year and fraction of AW for blue whales in Isfjorden (z = 2.66, R = 0.58, p = 0.0079; Supplementary Fig. S8) and for minke whales in Kongsfjorden (z = 2.01, R = 0.46, p = 0.044; Supplementary Fig. S8). Small sample sizes probably limit the detect potential of such relationships and in addition, the water mass analyses are not very high resolution.



**Fig. 8** KDE plots showing observation frequencies of minke whales around Svalbard, Norway, during 2005–09, 2015–19 and 2005–2019 as well as the changes in observation frequency between 2005–09 and 2015–19. Black dots indicate observation locations.

Citizen science is a cost-effective way to acquire data on species that are otherwise challenging and expensive to study, and it is a good way to raise public interest in wildlife and science (e.g., Vann-Sander et al. 2016). However, data collected through citizen science does come with some inherent biases. Most observations recorded in the MMSDB are derived from cruises that circumnavigate Spitsbergen, the main island of the archipelago, during the summer. Such excursions focus a lot of their time on glacier fronts, walrus haul-outs and

historical, cultural sites. Additionally, specific animals (e.g., large whales and polar bears) are often actively sought out and exact routes of cruises are not recorded; sampling effort undoubtedly varies somewhat between years, but it cannot be calculated precisely (Supplementary Table S1). Analyses of data like those housed in the MMSDB should therefore be focused on simple assessments of general distribution and trends over time and not be used for estimating abundance or for fine-scaled assessment of distribution patterns. (See Storrie et al. [2018] for a more thorough discussion of biases in the MMSDB.)

The observation frequency of two of the three Arctic endemic species—bowhead whales and narwhals—has increased north of Svalbard and decreased in coastal areas and fjords of the archipelago. This is concomitant with a retreating sea-ice edge, with which they are associated. White whales have, however, maintained their tightly coastal distribution. Similar to white whales, white-beaked dolphins showed no signs of a northward distribution shift. However, all other seasonally resident species showed signs of shifting from the shelf break to coastal areas and fjords in Svalbard, and most had clear northward trends in their distribution patterns. This is most likely a consequence of more boreal prey species, associated with the increased inflow of AW to west coast fjords within the archipelago, although the correlation between the number of observations per year and the fraction of AW in the fjords was only significant in some cases. This highlights the need for continued research, for example, through satellite tracking, for a deeper understanding of habitat use by cetaceans in Svalbard, while citizen science serves as a good complement and a cost-efficient way to detect large scale distributional changes.

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The authors report no conflict of interest.

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