Effects of environmental conditions on reproductive effort and nest success of Arctic-breeding shorebirds

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The Arctic is experiencing rapidly warming conditions, increasing predator abundance, and diminishing population cycles of keystone species such as lemmings. However, it is still not known how many Arctic animals will respond to a changing climate with altered trophic interactions. We studied clutch size, incubation duration and nest survival of 17 taxa of Arctic-breeding shorebirds at 16 field sites over 7 years. We predicted that physiological benefits of higher temperatures and earlier snowmelt would increase reproductive effort and nest survival, and we expected increasing predator abundance and

decreasing abundance of alternative prey (arvicoline rodents) to have a negative effect on reproduction. Although we observed wide ranges of conditions during our study, we found no effects of covariates on reproductive traits in 12 of 17 taxa. In the remaining taxa, most relationships agreed with our predictions. Earlier snowmelt increased the probability of laying a full clutch from 0.61 to 0.91 for Western Sandpipers, and shortened incubation by 1.42 days for *arcticola* Dunlin and 0.77 days for Red Phalaropes. Higher temperatures increased the probability of a full clutch from 0.60 to 0.93 for Western Sandpipers and from 0.76 to 0.97 for Red-necked Phalaropes, and increased daily nest survival rates from 0.9634 to 0.9890 for Semipalmated Sandpipers and 0.9546 to 0.9880 for Western Sandpipers. Higher abundance of predators (foxes) reduced daily nest survival rates only in Western Sandpipers (0.9821–0.9031). In contrast to our predictions, the probability of a full clutch was lowest (0.83) for Semipalmated Sandpipers at moderate abundance of alternative prey, rather than low abundance (0.90). Our findings suggest that in the short-term, climate warming may have neutral or positive effects on the nesting cycle of most Arctic-breeding shorebirds.

Anthropogenic changes in climate and ecosystems have been pronounced in the Arctic. Average temperatures are increasing by 0.25–1.1 °C per decade and the timing of spring snowmelt is advancing by 1–3 days per decade (Stone *et al.* 2002, ACIA 2004; Gauthier *et al.* 2013). Mean summer temperatures are expected to further increase by 1–4 °C by the end of the 21st century, and a combination of higher temperatures and declining snow accumulation will result in snowmelt occurring even earlier in the spring (IPCC 2013, RCP4.5 scenario).

Climatic variables are key drivers of phenology in Arctic ecosystems. Animals at lower trophic levels are strongly affected by weather, with timing of snowmelt driving the annual pulse of invertebrate emergence (Tulp & Schekkerman 2008). The abundance of invertebrate prey at high latitudes is a critical food resource to fuel reproduction and rapid growth of offspring for consumers at intermediate trophic levels (Schekkerman *et al.* 2003, Meltofte *et al.* 2007, Tulp & Schekkerman 2008). In years of early snowmelt, invertebrate prey become available earlier, allowing insectivorous birds to lay eggs soon after arrival on the breeding grounds (Klaassen *et al.* 2001, Meltofte *et al.* 2007, Sénéchal *et al.* 2011). In contrast, breeding is delayed in years with later snowmelt (Meltofte *et al.* 2008, Liebezeit *et al.* 2014), and

late-breeding birds have lower reproductive success, including smaller clutch sizes and lower nest survival (Weiser *et al.* 2017). As snowmelt advances, Arctic-breeding birds may therefore experience better conditions for egg-laying and incubation as a result of earlier food availability (Fig. 1).

Higher summer temperatures may also provide advantages for Arctic birds. Like early snowmelt, higher temperatures promote emergence and activity of invertebrate prey, increasing availability of food for birds (Meltofte *et al.* 2007, Bolduc *et al.* 2013). Higher temperatures can also reduce the duration and energetic cost of incubation, especially in species with uniparental care of the clutch (Piersma *et al.* 2003, Reneerkens *et al.* 2011), and have been shown to improve chick growth rates (McKinnon *et al.* 2013). A warming climate may therefore improve breeding performance for some Arctic-breeding birds, especially small-bodied species that rely on Arctic food sources to provision eggs (Fig. 1; Klaassen *et al.* 2001). However, chick survival is also linked to the timing of emergence and abundance of invertebrate prey, so reproductive output could be reduced for species that do not shift their breeding phenology to match changes in prey availability (Hill 2012, Senner *et al.* 2017). Any negative effects of climate change would probably exacerbate the impacts of ongoing loss of breeding habitat (Lin *et al.* 2012, Ballantyne & Nol 2015, Wauchope *et al.* 2017).

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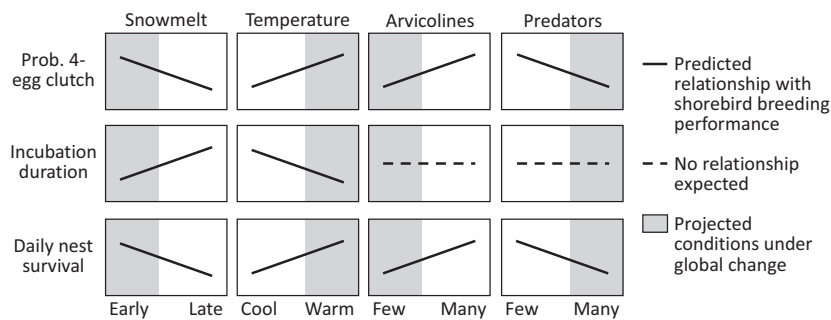
Figure 1. Predicted relationships between three components of the nesting cycle of Arctic-breeding shorebirds (rows) and four environmental and ecological covariates (columns). Predictions were based on physiological effects and trophic interactions (solid lines). A flat dashed line indicates no expected relationship.

Biological communities in the Arctic are also changing. Population cycles of arvicoline (formerly microtine) rodents, primarily lemmings and voles, drive many of the trophic interactions in Arctic ecosystems. The *alternative prey hypothesis* predicts that in years of high arvicoline abundance, alternative prey species such as birds benefit from lower predation pressure, resulting in higher reproductive success (Angelstam *et al.* 1984, Summers *et al.* 1998). Climate change is reducing the amplitude and periodicity of arvicoline population cycles at some Arctic sites (Kausrud *et al.* 2008, Gilg *et al.* 2009), so predation pressure on breeding birds is probably becoming more consistent, reducing the frequency of highly successful years that help to bolster the populations of Arctic birds. Evidence for the alternative prey hypothesis has primarily been drawn from the Palearctic, so it remains unclear whether the reproductive success of Nearctic birds may be affected by arvicoline abundance (McKinnon *et al.* 2014).

Predator communities are also changing across the Arctic as a result of increasing abundance and range expansion of generalist predators such as gulls and foxes that benefit from human activities (NAS 2003; Killengreen *et al.* 2011, Stehn *et al.* 2013, Stickney *et al.* 2014). Increasing abundance and diversity of generalist predators and possible declines in abundance of alternative prey could reduce nest success of Arctic-breeding birds that benefit from low predator densities at high latitudes (Fig. 1; Sovada *et al.* 2001, Liebezeit *et al.* 2009, McKinnon *et al.* 2010). A higher risk of nest predation may be associated not only with reduced nest success, but also with reduced clutch sizes if female shorebirds use a bet-hedging strategy to adjust reproductive effort based on the expected

probability of nest success (Fig. 1; Drent & Daan 1980, Lima 1987).

Arctic birds at intermediate trophic levels may therefore be particularly vulnerable to climate change, as they will be affected by environmental and ecological changes that have either top-down or bottom-up effects. Migratory shorebirds make up a high proportion of the vertebrate community in the Arctic and may be particularly susceptible to the effects of environmental and ecological changes due to their use of key sites in multiple geographical regions (Piersma & Lindström 2004, Thomas *et al.* 2006). Many species of shorebirds are experiencing population declines, in part because of habitat loss and degradation at important migratory stopover sites (Andres *et al.* 2012, Studds *et al.* 2017). It is unclear whether changes at breeding sites are also playing a role in the ongoing population declines, but some evidence indicates that changes may be affecting shorebird fecundity. Seasonal declines in reproductive performance have been widely observed, but it is unclear whether the seasonality is driven by temporal constraints or environmental conditions (Sandercock *et al.* 1999, Smith & Wilson 2010, Weiser *et al.* 2017). As in other Arctic birds, components of fecundity in shorebirds can be affected by temperature, timing of snowmelt, abundance of arvicoline rodents, and predator abundance or activity (Nol *et al.* 1997, Summers *et al.* 1998, Blomqvist *et al.* 2002, McKinnon *et al.* 2013, Jamieson *et al.* 2014, Kwon 2016). However, due to the logistical challenges of working at remote field sites, most previous studies have been limited to single study sites, which can produce estimates of fecundity or effects of covariates that are affected by local conditions and may not be representative of the entire

range of the species (McCaffery & Ruthrauff 2004, Senner *et al.* 2017). Estimates of effects of environmental and ecological covariates on shorebird breeding performance from a broad geographical scale are needed to evaluate how these vulnerable species may be affected by climate change.

The Arctic Shorebird Demographics Network (ASDN) implemented standardized field protocols to study shorebird ecology at a distributed network of sites in Arctic Alaska, Canada and Russia (Lanctot *et al.* 2015). Here, we tested for effects of environmental and ecological covariates that could affect clutch size, incubation duration and daily survival rate (DSR) of nests through physiological effects or trophic interactions (Fig. 1). First, we predicted that physiological effects of early snowmelt and higher temperatures would result in (1) larger clutch sizes, especially for smaller species of shorebirds that are primarily income breeders, and (2) shorter incubation periods and higher DSR, especially for species with uniparental care of the nest. Secondly, we expected that lower abundance of arvicoline rodents and higher abundance of predators would increase the risk of nest predation and thus be associated with smaller clutches and lower DSR for all shorebird species. Our study is the first to use nesting data from across the geographical distribution of 17 taxa of Arctic-breeding shorebirds, providing comprehensive estimates of the effects of environmental conditions on demographic rates of a vulnerable group of Arctic birds.

METHODS

We monitored breeding shorebirds, environmental covariates and ecological covariates for up to 7 years at 16 field sites in Arctic and subarctic North America (Fig. 2; Table S1). In 2010–2014, all sites implemented a common set of field protocols and data formats developed for the ASDN (Brown *et al.* 2014). At three sites (NOME, BARR, BYLO), additional data were collected with similar field methods in 2008 and 2009 (McKinnon & Bêty 2009, English *et al.* 2014, Saalfeld & Lanctot 2015). Fourteen species of shorebirds commonly nested at our study sites, with body masses ranging from 26 to 381 g and a mix of biparental and uniparental incubation strategies (Table 1). Four allopatric subspecies of Dunlin occurred in our study area: *sakhalina*, *pacifica*, *arcticola* and *hudsonia*, with no recognized subspecific variation in the other 13 species (Cramp &

Simmons 1983, Miller *et al.* 2015). We focused on three major components of reproductive output in our analysis: clutch size, incubation duration and daily nest survival.

Shorebird data

Field methods for monitoring shorebirds are described in detail by Brown *et al.* (2014) and Weiser *et al.* (2017). In brief, we located shorebird nests by observing bird behaviour, systematically walking the tundra or rope-dragging, and estimated the age of each nest upon discovery using the flotation method (Liebezeit *et al.* 2007). We recorded the clutch size at discovery and on subsequent visits, and when the number of eggs did not increase for > 2 days while the nest was active (i.e. not failed), we considered that number to be the final clutch size. Only 8% of nests with a full four-egg clutch lost an egg during incubation, so the observed final clutch size should match the actual clutch size in nearly all cases (Weiser *et al.* 2017). We assumed that clutches with more than four eggs (0.3% of all nests) resulted from anomalous joint egg-laying by multiple females (Arnold 1999) and excluded those nests from all analyses.

We monitored each nest daily during egg-laying, every 2–5 days during incubation, and daily starting 4 days before the expected hatch date. We recorded the final nest fate as hatched, failed or unknown. We recorded a nest as hatched if at least one newly hatched chick was observed at the nest or if eggshell fragments indicative of hatching were found in the nest within 4 days of the expected hatch date (Mabee 1997, Brown *et al.* 2014). We considered nest failure to be due to predation when all eggs disappeared > 4 days before the predicted hatch date or when large fragments of eggshells were present in the nest. We considered a nest to have failed due to abandonment when eggs were left unattended by parents for three or more visits. Other infrequent causes of failure each affected <2% of nests and were pooled in our analysis. We captured and individually marked parents attending nests and recorded morphometrics for related studies.

For nests that were found during egg-laying and survived to hatch, we calculated the duration of incubation as the time from the day the last egg was laid until the day the first egg hatched. To evaluate daily nest survival, we generated an encounter history for each nest using the day the

Figure 2. Locations of 16 study sites in the Arctic Shorebird Demographics Network in Russia, Alaska and Canada, 2008–2014. Complete names and geographical coordinates of the field sites are provided in Table S1.

nest was found, the last day it was observed alive and the day it was observed to have failed. If there was a gap in monitoring between the last day the nest was observed alive and the first day it was observed to have failed, we used the midpoint between the two dates as the date of failure. We restricted each analysis to the subset of species with ≥30 nests for which we had complete data for all of our environmental and ecological covariates. We analysed each of the four subspecies of Dunlin separately, for a total of 17 taxa in the analysis (Table 1).

Environmental and ecological covariates

We recorded two environmental variables, the annual timing of snowmelt and hourly ambient temperature, and two ecological variables, the daily abundance of alternative prey and predators.

We used daily satellite data with a resolution of 4 km to estimate the ordinal date on which snowmelt was complete at each field site (i.e. all land and water was free of snow and ice; National Ice Center 2008), which served as an index for spring phenology. We recorded the timing of snowmelt at each site as the first date when the grid cell containing the field camp was categorized as 'land' based on a combination of visible imagery, spectrometry and microwave data (National Ice Center 2008). Estimates from satellite imagery were positively correlated with field observations for nine sites (1–4 years each) where field crews arrived before snowmelt was complete ($r > 0.65$).

We calculated daily mean temperatures from hourly data recorded by permanent weather stations near our study sites (Government of Canada 2015; National Centers for Environmental Information 2015; CEN 2016) or by automated portable weather stations at remote field camps (Onset

Table 1. Shorebird taxa included in our analyses of effects of environmental covariates on components of fecundity. Species are ordered by taxonomy following Clements *et al.* (2015), and subspecies of Dunlin are ordered by their breeding range (west to east).

Common name	Scientific name	Code	Incubation[a]	Mean body mass (g)[b]	Clutch size Mean ± sd (no. of eggs)	n	Incubation duration Median ± sd (days)	n	Apparent nest survival Prop. hatched	n
Grey Plover	*Pluvialis squatarola*	BBPL	MF	195	3.87 ± 0.37	94	–	–	0.49	53
American Golden Plover	*Pluvialis dominica*	AMGP	MF	147	3.92 ± 0.34	485	–	–	0.52	148
Semipalmated Plover	*Charadrius semipalmatus*	SEPL	MF	47	3.29 ± 1.15	59	–	–	0.62	36
Whimbrel	*Numenius phaeopus*	WHIM	MF	381	3.58 ± 0.82	138	–	–	0.47	80
Ruddy Turnstone	*Arenaria interpres*	RUTU	MF	106	3.76 ± 0.65	81	–	–	0.53	44
Dunlin[c]	*Calidris alpina sakhalina*	DUNLsak	MF	54	3.85 ± 0.43	68	–	–	–	–
	Calidris a. pacifica	DUNLpac	MF	55	3.85 ± 0.39	79	–	–	0.61	53
	Calidris a. arcticola	DUNLarc	MF	58	3.96 ± 0.22	480	21 ± 2.34	33	0.67	302
	Calidris a. hudsonia	DUNLhud	MF	57	3.86 ± 0.46	136	–	–	0.73	84
Baird's Sandpiper	*Calidris bairdii*	BASA	MF	42	3.97 ± 0.21	129	–	–	0.62	94
White-rumped Sandpiper	*Calidris fuscicollis*	WRSA	F	42	3.84 ± 0.44	96	–	–	0.46	69
Pectoral Sandpiper	*Calidris melanotos*	PESA	F	69	3.94 ± 0.30	912	22 ± 1.02	44	0.63	697
Semipalmated Sandpiper	*Calidris pusilla*	SESA	MF	26	3.86 ± 0.41	1678	19 ± 1.05	143	0.65	1210
Western Sandpiper	*Calidris mauri*	WESA	MF	28	3.67 ± 0.58	574	20 ± 0.97	70	0.46	399
Long-billed Dowitcher	*Limnodromus scolopaceus*	LBDO	MF	118	3.81 ± 0.54	171	–	–	0.48	99
Red-necked Phalarope	*Phalaropus lobatus*	RNPH	M	34	3.83 ± 0.45	843	20 ± 1.67	57	0.53	533
Red Phalarope	*Phalaropus fulicarius*	REPH	M	49	3.83 ± 0.45	1028	19 ± 2.10	77	0.70	859

[a]Biparental (MF), female-only (F) or male-only (M) incubation of the nest (Rodewald 2015).   [b]For the incubating sex(es); this study. [c]Four subspecies of Dunlin occurred at our study sites: *sakhalina* (CHAU), *pacifica* (NOME, CAKR), *arcticola* (BARR, IKPI, COLV, PRBA, CARI) and *hudsonia* (CHUR, BURN, COAT, EABA, IGLO) (Cramp & Simmons 1983, Miller *et al.* 2015).

Hobo Weather Station, U30 Series; Pocasset, MA, USA). For two sites with both types of data, temperatures from permanent and portable weather stations were highly correlated ($r > 0.95$, slope ≈ 1.0). We used data from the permanent weather stations where available, as portable stations did not always collect data for the entire season. For the clutch size analysis, we averaged the daily temperatures during the estimated egg-laying period for each nest (1 day per egg) plus 1 week prior to nest initiation to include time needed for the uptake of nutrients for egg formation (Klaassen *et al.* 2001). For the analysis of incubation duration, we used the mean temperature during the incubation period. We used the mean temperature for each day in the analysis of daily survival rates of nests. Temperature was not correlated with timing of snowmelt ($r = 0.006$, $P = 0.212$; annual value of timing of snowmelt vs. mean daily temperature during the nest initiation period with site

and year as random effects) because snow depth, cloud cover and rainfall also affect the timing and rate of snowmelt (Zhang *et al.* 1996, Stone *et al.* 2002).

We recorded the numbers of arvicoline rodents and predators observed per person-hour of fieldwork over the course of each summer in 2010–2014 as an index of local abundance (Hochachka *et al.* 2000). We did not have similar data for 2008 and 2009. Observations were recorded either as part of dedicated surveys or incidentally over the course of fieldwork during each day of the shorebird breeding season. The type of survey varied among sites but was consistent among years within each site. Observations for the BYLO field site were collected as part of a concurrent study (G. Gauthier unpubl. data). We included all species of lemmings and voles in the arvicoline group, and the primary avian (gulls *Larus* spp. and skuas *Stercorarius* spp.) and mammalian (Red Fox *Vulpes vulpes* and Arctic Fox *Alopex lagopus*) predators of shorebird nests (Liebezeit & Zack 2008, McKinnon & Bêty 2009). For arvicolines, we used the annual mean count per person-hour to categorize years within each site into three levels of relative abundance: low, moderate or high relative to other years. For predators, we evaluated avian and mammalian predators separately, and averaged the daily counts per person-hour across a rolling 7-day window to reduce the variance associated with daily chance encounters with predators. For the clutch size analysis, the 7-day window included 4 days of egg-laying, based on the modal clutch size and laying schedule (Norton 1972, Sandercock 1998), and 3 days prior to the egg-laying period. For the DSR analysis, for each day of the season, the 7-day window included the focal day plus 3 days on either side. We did not test for effects of abundance of arvicolines or predators on incubation duration.

Statistical models

Model structure

We developed hierarchical models in a Bayesian framework to estimate effects of all covariates on each of the three reproductive traits after Weiser *et al.* (2017). In brief, we categorized clutch size as a binary variable: less than four eggs (0) or four eggs (1) because our study species have a modal clutch size of four eggs (Rodewald 2015). We expressed incubation duration as the per cent difference from the median value for each taxon. The DSR model evaluated the cause-specific risk of failure due to predation, abandonment by the attending parents or other causes.

We included a taxon-specific linear effect of day-of-season on each component of fecundity (Weiser *et al.* 2017) and expanded on the previous model by testing two environmental covariates and three ecological covariates. We tested for linear and quadratic effects of the site-specific annual timing of snowmelt, air temperature during the relevant time window for each nest, a categorical effect of site-specific annual arvicoline rodent abundance and linear effects of site-specific indices of predator abundance (for avian and mammalian predators separately). We first centred each continuous covariate to the site-specific mean to examine how local variation affected shorebirds, assuming that the geographical distribution of each taxon was dictated by environmental and ecological conditions, and thus change in a covariate relative to the local mean would be more important than the absolute value. Next, we standardized each centred covariate to the mean and two standard deviations across all sites and years so that effect sizes were comparable among binary and continuous covariates (Gelman & Hill 2007).

We estimated taxon-specific effects of covariates on the probability of laying the maximum clutch size of four eggs, duration of incubation and the daily probability of a nest surviving (DSR). Taxon-specific effect sizes were drawn from a single distribution per covariate with a varying-slopes model (Gelman & Hill 2007, Weiser *et al.* 2017), as we expected taxa to respond to covariates in the same direction. The varying-slopes model allowed both the magnitude and the direction of the effect size to vary across taxa based on the available data. Within the DSR model, we tested for an effect of each covariate on the probability of a nest failing to predation (p_{pred}) and the probability of a nest being abandoned (p_{aband}). Sample sizes for each cause of failure were small relative to the sample of all nests in the DSR analysis, which reduced statistical power, so we estimated a single effect of each covariate for all taxa pooled on p_{pred} and p_{aband}.

Variable selection

We aimed to identify and make inference from only the covariates that affected nesting performance, while eliminating variables with no

measurable effect. Model selection in a Bayesian framework is an emerging field, and the most widely used metric of fit for Bayesian models, the deviance information criterion (DIC), is not necessarily appropriate for complex models (Hooten & Hobbs 2015). Other metrics of fit such as stochastic search variable selection are not appropriate for a varying-slopes model. We therefore examined the 95% Bayesian credible interval (BCI) for each taxon-specific effect and concluded that a covariate was informative for a given taxon if the 95% BCI did not include zero. For the models of clutch size and DSR, we first ran the full model including all covariates, then dropped covariates where the 95% BCI overlapped zero for all taxa and re-ran the model including only informative covariates. If necessary, we repeated the variable elimination process until all remaining covariates had an effect different from zero for at least one taxon, which we took as our final model for each component of the nesting cycle. The full model was restricted to years when ecological covariates were recorded (2010–2014), but if inclusion of ecological covariates was not supported, we used the entire dataset for our final model (2008–2014).

Model fitting

To build the Bayesian models, we used a logit link for the models of clutch size and DSR (where possible values ranged from 0 to 1), and modelled incubation duration on the natural scale as the per cent difference from the median. We specified an uninformative uniform prior for the intercept in the interval −5 to 5; for models that used a logit link, this corresponded to the interval 0 to 1 on the natural scale. Each model included random effects of taxon, site and year nested within site on the intercept. We used uninformative normal priors with a zero mean and sd = 100 for all random effects on the intercept. We used an uninformative prior distribution with a mean of zero and a standard deviation in the interval 0 to 7 for the effect of each temporal, environmental or ecological covariate.

We executed the Bayesian models in JAGS v. 4.0 (Plummer 2003) through the package 'runjags' (Denwood 2016) in R v. 3.3.1 (R Core Team 2017). We discarded estimates from an adaptation period (500 iterations for clutch size; 1000 for DSR) and a burn-in period (1000 iterations for clutch size; 2000 for DSR) to produce good mixing across four chains. We then ran each model

for a further 3000 iterations and saved the output from every third iteration to avoid autocorrelation, resulting in 1000 saved iterations used to generate posterior distributions of parameters. For each model run, we checked that convergence was achieved as indicated by Gelman–Rubin statistics <1.10 for all estimates of model parameters (Brooks & Gelman 2012).

Parameter estimates

We used the final model to generate estimates for the mean value of the response and the effect of each covariate, as well as the 95% BCI from the posterior distribution for each estimate. In the DSR model, we also estimated nest survival to the end of the incubation period, calculated as DSR raised to the power of the exposure period (median number of days of incubation plus the egg-laying period) for each taxon, and recorded the mean and 95% BCI from the posterior distribution. We predicted each response value across the observed range of each environmental or ecological covariate that had an effect on a given taxon to evaluate the magnitude and biological relevance of the effect.

RESULTS

Our dataset included 7418 nests of 17 taxa of shorebirds at 16 field sites (Table 1, Table S2; Fig. 2). Across all taxa, 88% of nests had a final clutch size of four eggs, 10% had three eggs, 2% had two and <1% had one. Median incubation duration ranged from 19 days in Semipalmated Sandpipers and Red Phalaropes to 28 days in Grey Plovers. In total, 61% of nests hatched, 30% failed and 9% had an unknown fate, with an overall mean DSR of 0.9772 (sd = 0.0064). For nests that failed, the modelled probability of failing to each cause was 0.94 for predation, 0.04 for abandonment and 0.01 for other causes of failure.

Environmental and ecological covariates showed wide ranges of variation both within and among our study sites (Figs S1–S4). Timing of snowmelt ranged from 3 May to 20 July across sites and years (mean = 10 June; within-site sd = 2–11 days; Fig. S1). Daily mean temperature ranged from −3.1 to 24.1 °C (mean = 7.0 °C; within-site among-year sd = 3.1–5.7 °C) and tended to increase as the nesting season progressed (Fig. S2). Of 47 site–year combinations with data for abundance of arvicoline rodents, 63% were

categorized as low abundance, 12% as moderate and 24% as high within each site. Sites at higher latitudes (> 70°N; Table S1) tended to have larger fluctuations in arvicoline abundance from year to year than did sites at lower latitudes (Fig. S3). Avian predators (mean weekly value = 5.59 observations per person-hour, within-site among-year sd = 0.14–84.52) were observed more frequently than mammalian predators (mean = 0.03, within-site among-year sd = 0.002–0.102; Fig. S4).

We found linear effects of three covariates on reproductive traits, with no evidence for quadratic effects (Tables S3 and S5; Fig. 3). Early snowmelt increased the probability of a four-egg clutch from 0.61 (latest snowmelt; 95% BCI = 0.37, 0.82) to 0.91 (earliest snowmelt; 95% BCI = 0.79, 0.88) for Western Sandpipers (Figs 3a and 4a). The earliest value for snowmelt shortened the duration of incubation for *arcticola* Dunlin by 1 day

(4.40%; 95% BCI = –6.83%, –1.90%) and for Red Phalaropes by 0.39 days (2.38%; 95% BCI = –4.35%, –0.35%; Figs 3d and 4d) relative to the latest snowmelt. Relative to the lowest temperatures that we observed, the highest temperatures during the egg-laying period increased the probability of a four-egg clutch from 0.60 (95% BCI = 0.33, 0.82) to 0.93 (95% BCI = 0.79, 0.99) for Western Sandpipers and from 0.76 (95% BCI = 0.58, 0.90) to 0.97 (95% BCI = 0.91, 0.99) for Red-necked Phalaropes, with positive trends for 12 of the 15 other taxa (Figs 3b and 4b). The highest daily temperatures also increased DSR from 0.9640 (95% BCI = 0.9352, 0.9819) to 0.9890 (95% BCI = 0.9789, 0.9950) for Semipalmated Sandpipers and from 0.9546 (95% BCI = 0.9132, 0.9791) to 0.9880 (95% BCI = 0.9745, 0.9954) for Western Sandpipers (Figs 3e and 4e). Semipalmated Sandpipers were
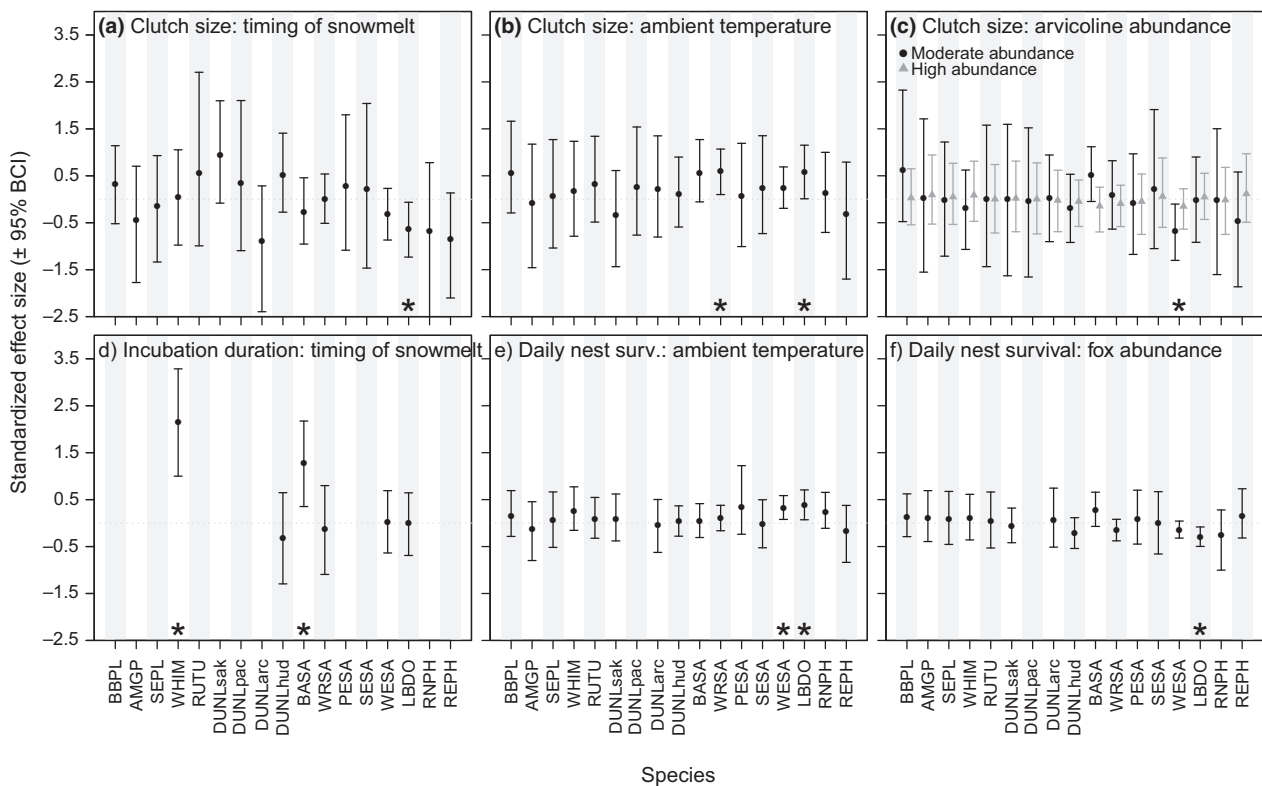
Figure 3. Standardized estimates of the taxon-specific effects of supported covariates on three reproductive traits for 17 taxa of shorebirds. Not all taxa were included in the analyses of incubation duration or daily nest survival rate. A positive value indicates larger clutch, longer incubation or higher DSR with later snowmelt than average (a,d), higher temperatures (b,e), the indicated abundance of arvicoline rodents relative to years with low abundance (c), or higher fox abundance (f). Quadratic effects were tested but were not supported. Error bars indicate 95% Bayesian credible intervals (BCIs) and asterisks indicate estimates where 95% BCIs did not overlap zero. Species codes are defined in Table 1.
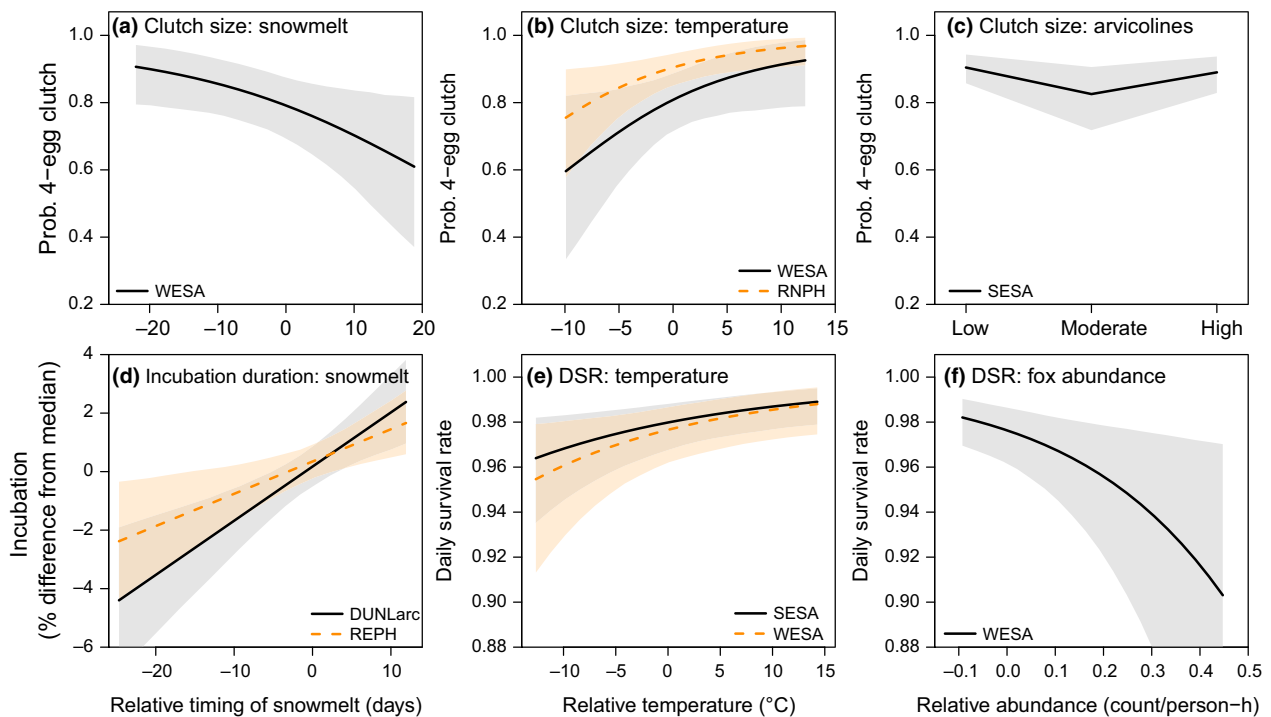
Figure 4. Relationships between reproductive traits and environmental covariates for each shorebird taxon where the 95% Bayesian credible interval (BCI) for the covariate effect size did not overlap zero. Values on the horizontal axis are displayed on the natural scale (snowmelt: days; temperature: degrees Celsius; arvicoline abundance: low, moderate or high; fox abundance: number of individuals observed per person-hour) and centred to the population mean; a negative value indicates that timing of snowmelt was earlier (a,d), temperature was lower (b,e) or fox abundance was lower (f) than the local average. Shaded bands indicate 95% BCIs for the modelled relationships. [Colour figure can be viewed at http://onlinelibrary.wiley.com/journal/10.1111/(ISSN)1474-919X]

less likely to lay a four-egg clutch when arvicoline abundance was moderate ($P = 0.83$, 95% BCI = 0.72, 0.91) than when abundance was high ($P = 0.89$, 95% BCI = 0.83, 0.94) or low ($P = 0.90$, 95% BCI = 0.86, 0.94; Figs 3c and 4c). Higher fox abundance reduced DSR from 0.9821 (95% BCI = 0.9695, 0.9903) when fox abundance was lowest, to 0.9031 (95% BCI = 0.7830, 0.9702) when fox abundance was highest for Western Sandpipers (Figs 3f and 4f). We found no support for effects of environmental or ecological covariates on rates of cause-specific nest failure.

DISCUSSION

Using a spatially distributed network of 16 Arctic field sites and controlling for previously demonstrated seasonal patterns (Weiser *et al.* 2017), we tested for effects of environmental and ecological covariates on three reproductive traits of 17 taxa of shorebirds. For 12 taxa, we found no effects of covariates on any reproductive trait. For the remaining five taxa, we found evidence that climate warming may increase reproductive effort and nest survival. We also found limited evidence for effects of predation risk on reproductive traits, where the abundance of alternative prey affected clutch size and high abundance of foxes negatively affected nest survival in one species.

Environmental conditions expected to occur under a regime of climate warming improved reproductive effort and nest success for five of the smallest taxa in our study (body mass = 26–58 g). Western Sandpipers and Red-necked Phalaropes were more likely to lay the maximum clutch size of four eggs when snowmelt occurred early or when temperatures were high, relative to years with later snowmelt or lower temperatures. Incubation duration of two taxa, *arcticola* Dunlin and Red Phalaropes, was shorter when snowmelt occurred earlier than average. Nest survival rates of two species, Semipalmated and Western Sandpipers, also increased when temperatures were higher than average. Few nests in our dataset failed due to

weather events, so the effect of temperature on nest survival may have been indirect and mediated by some other condition. In contrast to the smallest taxa, environmental effects on reproductive effort and nest survival were not evident in the larger species in our study. Bergmann's rule predicts that a warming environment will favour smaller-bodied species or individuals (Sheridan & Bickford 2011), so larger species may not receive the same benefit as smaller species under changing conditions. Alternatively, smaller species may be more sensitive to environmental variation because they cannot use endogenous reserves to provision eggs and experience proportionally higher energetic demands of thermoregulation and incubation than larger birds (Mayfield 1979, McNab 1983, Schamel & Tracy 1987, Piersma *et al.* 2003, Morrison & Hobson 2004). However, it should be noted that our sample sizes were typically largest for the smallest species that we considered; larger species had larger territories and were thus more sparsely distributed in our study plots.

If the relationship between weather and reproductive output in small shorebirds is mediated by energetic demands, food availability is likely to play a role. Late snowmelt or lower temperatures reduce availability of invertebrate prey (Meltofte *et al.* 2007), and small shorebirds are primarily income breeders that rely on locally available food to produce eggs (Klaassen *et al.* 2001). Thus, higher availability of food during the egg-laying period could result in a higher probability of laying a full four-egg clutch. Arctic shorebirds also rely on local food sources to fuel incubation (Piersma *et al.* 2003), so incubation constancy may be improved in years of earlier snowmelt when more food is available. Similarly, male Red-necked Phalaropes show higher incubation constancy with higher ambient temperatures (English 2014), although there is no effect of temperature on bout length in species with biparental incubation (Bulla *et al.* 2016). More constant incubation reduces the number of days required for eggs fully to develop, thereby reducing the exposure period of the nest (Schamel & Tracy 1987, Conway & Martin 2000, Reneerkens *et al.* 2011). Higher incubation constancy also reduces movements of parents to and from the nest, thus improving nest success by reducing the chance of detection by a predator (Smith *et al.* 2012). The effect of temperature on DSR that we found in a few cases thus could have been mediated by parental behaviour that was in turn driven by physiological benefits from increased availability of food and lower thermoregulatory costs.

We found only one line of evidence for effects of alternative prey (arvicoline rodents) on reproductive traits: Semipalmated Sandpipers were less likely to lay a full clutch in years of moderate arvicoline abundance than in years with high or low abundance. The finding did not follow our prediction that clutch size would be smallest in years of low arvicoline abundance and largest in years of high abundance, which would be expected if birds adjusted clutch size based on abundance of alternative prey that would mitigate predation pressure. However, the estimated effect size was small. We also expected, but did not find, effects of arvicoline rodent abundance on survival rates of shorebird nests. Our results are thus consistent with previous studies of Arctic waterfowl that suggest that climatic conditions are more important than rodent abundance in driving reproductive performance (Juillet *et al.* 2012). However, the duration of our study (5–7 years per site) was short relative to the 3- to 5-year cycle of arvicoline populations. Our study therefore could have missed any other effects of alternative prey on reproductive traits of Arctic shorebirds, especially if lag effects would more accurately describe any relationships with arvicoline abundance.

Similarly, we unexpectedly found only one effect of predator abundance on nesting, such that nest survival of Western Sandpipers was reduced when fox abundance was high. We had expected more widespread effects of predators, as prior studies have shown that predation (or the risk of predation) causes a large proportion of nest failure in Arctic shorebirds (Liebezeit *et al.* 2009, Smith & Wilson 2010, Smith *et al.* 2012). Predation was the main cause of nest failure in our study system, but our observational index of predator abundance may not accurately represent predation pressure (Liebezeit & Zack 2008). In particular, any functional response of predators to prey availability may not be captured by counts of predators. Development of an improved index of predation risk that accounts for functional responses of predators, including changes in searching behaviour or demand for food associated with the predators' reproductive cycle (Wilson & Bromley 2001), would be helpful for future studies of Arctic birds.

While we found positive effects of environmental covariates and negative effects of

ecological covariates for a few shorebird species (five of 17 taxa), reproductive traits showed no relationship with any covariate for most taxa (12 of 17). Previous studies at individual sites in our network have reported relationships between breeding performance and environmental variables for additional species (Nol *et al.* 1997, Kwon *et al.* 2017), which could indicate regional variation in the effects of climate on Arctic shorebirds. It is also possible that as changes continue, effects of changing conditions may become more apparent for species that are adapted to historical conditions in the Arctic. In particular, predictions for the expected changes in abundance of predators and alternative prey should be quantified, and effects of those changes on shorebirds should be studied further, as predation is thought to play a large role in limiting fecundity of Arctic shorebirds. Studies of behavioural and phenological plasticity or genetic adaptation to changing conditions would also be useful to determine whether shorebirds can continue to withstand further changes even if there is currently little to no negative effect of changing variables. In addition, factors that we did not examine could have stronger long-term effects on Arctic-breeding shorebirds compared with the covariates in our study. For example, continuing changes in timing of emergence of invertebrate prey could reduce survival of shorebird chicks, depending on conditions that may vary geographically (Senner *et al.* 2017), and potentially offset the net effect of the improvements in the reproductive traits we measured. However, such phenological mismatch could be offset by thermal benefits of a warming environment (McKinnon *et al.* 2013). Moreover, climate change is expected dramatically to reduce the breeding range available to most Arctic shorebirds (up to 96% loss; Wauchope *et al.* 2017), unless shorebirds are able to adapt or are more flexible in their choice of breeding conditions than currently recognized.

Together, our results suggest that climate warming may have neutral or positive effects on some stages of reproduction for most species of Arctic-breeding shorebirds. However, long-term threats on the breeding grounds could become important in the future and outweigh any short-term positive effects. Understanding and conserving these highly migratory species will require continuing work to understand the responses of shorebirds to the changing climate and ecosystem.

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SUPPORTING INFORMATION

Additional Supporting Information may be found in the online version of this article:

Table S1. Study sites in the Arctic Shorebird Demographics Network, ordered from west to east.

Table S2. Number of shorebird nests included in the final models for each taxon and site.

Table S3. Effect sizes and BCIs for covariates from the full model, which included all covariates, for each reproductive trait.

Table S4. Intercepts and estimates of standard deviations of random effects from the full model for each reproductive trait, estimated across all taxa.

Table S5. Effect sizes and BCIs for covariates included in the final model, including only informative covariates, for each reproductive trait.

Table S6. Intercepts and estimates of standard deviations of random effects from the final model for each reproductive trait, estimated across all taxa.

Figure S1. First snow-free day for each year at each study site.

Figure S2. Mean daily temperatures (°C) over the shorebird breeding season at 14 field sites in the Arctic Shorebird Demographics Network, 2008–2014.

Figure S3. Observations of arvicoline rodents per person-hour at each field site in the Arctic Shorebird Demographics Network.

Figure S4. Daily observations of avian predators (gulls and jaegers; dotted line) and foxes (solid line) at each field site in the Arctic Shorebird Demographics Network.